



IDEAS
INNOVATION
COMPUTER
INTERPRETATION

10e

GERALD
KELLER

Statistics

for Management and Economics

A GUIDE TO STATISTICAL TECHNIQUES

Problem Objectives

DATA TYPES	INTERVAL	NOMINAL	ORDINAL	
Describe a Population	Compare Two Populations	Compare Two or More Populations	Analyze Relationship between Two Variables	Analyze Relationship among Two or More Variables
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AMERICAN NATIONAL ELECTION SURVEY AND GENERAL SOCIAL SURVEY EXERCISES

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for Management and Economics

10e

GERALD KELLER

Professor Emeritus, Wilfrid Laurier University



Australia • Brazil • Japan • Korea • Mexico • Singapore • Spain • United Kingdom • United States

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PREFACE

Businesses are increasingly using statistical techniques to convert data into information. For students preparing for the business world, it is not enough merely to focus on mastering a diverse set of statistical techniques and calculations. A course and its attendant textbook must provide a complete picture of statistical concepts and their applications to the real world. *Statistics for Management and Economics* is designed to demonstrate that statistics methods are vital tools for today's managers and economists.

Fulfilling this objective requires the several features that I have built into this book. First, I have included data-driven examples, exercises, and cases that demonstrate statistical applications that are and can be used by marketing managers, financial analysts, accountants, economists, operations managers, and others. Many are accompanied by large and either genuine or realistic data sets. Second, I reinforce the applied nature of the discipline by teaching students how to choose the correct statistical technique. Third, I teach students the concepts that are essential to interpreting the statistical results.

Why I Wrote This Book

Business is complex and requires effective management to succeed. Managing complexity requires many skills. There are more competitors, more places to sell products, and more places to locate workers. As a consequence, effective decision making is more crucial than ever before. On the other hand, managers have more access to larger and more detailed data that are potential sources of information. However, to achieve this potential requires that managers know how to convert data into information. This knowledge extends well beyond the arithmetic of calculating statistics. Unfortunately, this is what most textbooks offer—a series of unconnected techniques illustrated mostly with manual calculations. This continues a pattern that goes back many years. What is required is a complete approach to applying statistical techniques.

When I started teaching statistics in 1971, books demonstrated how to calculate statistics and, in some cases, how various formulas were derived. One reason for doing so was the belief that by doing calculations by hand, students would be able to understand the techniques and concepts. When the first edition of this book was published in 1988, an important goal was to teach students to identify the correct technique. Through the next nine editions, I refined my approach to emphasize interpretation and decision making equally. I now divide the solution of statistical problems into three stages and include them in every appropriate example: (1) *identify* the technique, (2) *compute* the statistics, and (3) *interpret* the results. The compute stage can be completed in any or all of three ways: manually (with the aid of a calculator), using Excel, and using Minitab. For those courses that wish to use the computer extensively, manual calculations can be played down or omitted completely. Conversely, those that wish to emphasize manual calculations may easily do so, and the computer solutions can be selectively introduced or skipped entirely. This approach is designed to provide maximum flexibility, and it leaves to the instructor the decision of if and when to introduce the computer.

I believe that my approach offers several advantages:

- An emphasis on identification and interpretation provides students with practical skills they can apply to real problems they will face regardless of whether a course uses manual or computer calculations.
- Students learn that statistics is a method of converting data into information. With 967 data files and corresponding problems that ask students to interpret statistical results, students are given ample opportunities to practice data analysis and decision making.
- The optional use of the computer allows for larger and more realistic exercises and examples.

Placing calculations in the context of a larger problem allows instructors to focus on more important aspects of the decision problem. For example, more attention needs to be devoted to interpreting statistical results. Proper interpretation of statistical results requires an understanding of the probability and statistical concepts that underlie the techniques and an understanding of the context of the problems. An essential aspect of my approach is teaching students the concepts. I do so by providing instructions about how to create Excel worksheets that allow students to perform “what-if” analyses. Students can easily see the effect of changing the components of a statistical technique, such as the effect of increasing the sample size.

Efforts to teach statistics as a valuable and necessary tool in business and economics are made more difficult by the positioning of the statistics course in most curricula. The required statistics course in most undergraduate programs appears in the first or second year. In many graduate programs, the statistics course is offered in the first semester of a three-semester program and the first year of a two-year program. Accounting, economics, finance, human resource management, marketing, and operations management are usually taught after the statistics course. Consequently, most students will not be able to understand the general context of the statistical application. This deficiency is addressed in this book by “Applications in ...” sections, subsections, and boxes. Illustrations of statistical applications in business that students are unfamiliar with are preceded by an explanation of the background material.

- For example, to illustrate graphical techniques, we use an example that compares the histograms of the returns on two different investments. To explain what financial analysts look for in the histograms requires an understanding that risk is measured by the amount of variation in the returns. The example is preceded by an “Applications in Finance” box that discusses how return on investment is computed and used.
- Later when I present the normal distribution, I feature another “Applications in Finance” box to show why the standard deviation of the returns measures the risk of that investment.
- Thirty-six application boxes are scattered throughout the book.

Some applications are so large that I devote an entire section or subsection to the topic. For example, in the chapter that introduces the confidence interval estimator of a proportion, I also present market segmentation. In that section, I show how the confidence interval estimate of a population proportion can yield estimates of the sizes of market segments. In other chapters, I illustrate various statistical techniques by showing how marketing managers can apply these techniques to determine the differences that exist between market segments. There are six such sections and one subsection in this book.

The “Applications in ...” segments provide great motivation to the student who asks, “How will I ever use this technique?”

New in This Edition

Eight large real data sets are the sources of 369 new exercises. Students will have the opportunity to convert real data into information. Instructors can use the data sets for hundreds of additional examples and exercises.

Many of the examples, exercises, and cases using real data in the ninth edition have been updated. These include the data on wins, payrolls, and attendance in baseball, basketball, football, and hockey; returns on stocks listed on the New York Stock Exchange, NASDAQ, and Toronto Stock Exchange; and global warming.

I've created many new examples and exercises. Here are the numbers for the tenth edition: 145 solved examples, 2148 exercises, 27 cases, 967 data sets, 35 appendixes containing 37 solved examples, 98 exercises, and 25 data sets, for a grand total of 182 worked examples, 2246 exercises, 27 cases, and 992 data sets.

Data Driven: The Big Picture

Solving statistical problems begins with a problem and data. The ability to select the right method by problem objective and data type is a **valuable tool for business**. Because business decisions are driven by data, students will leave this course equipped with the tools they need to make effective, informed decisions in all areas of the business world.



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Identify the Correct Technique

Examples introduce the first crucial step in this three-step (*identify–compute–interpret*) approach. Every example's solution begins by examining the data type and problem objective and then identifying the right technique to solve the problem.

EXAMPLE 13.1*

DATA
Xm13-01

Direct and Broker-Purchased Mutual Funds

Millions of investors buy mutual funds (see page 178 for a description of mutual funds), choosing from thousands of possibilities. Some funds can be purchased directly from banks or other financial institutions whereas others must be purchased through brokers, who charge a fee for this service. This raises the question, Can investors do better by buying mutual funds directly than by purchasing mutual funds through brokers? To help answer this question, a group of researchers randomly sampled the annual returns from mutual funds that can be acquired directly and mutual funds that are bought through brokers and recorded the net annual returns, which are the returns on investment after deducting all relevant fees. These are listed next.

Direct	Broker
9.33	4.68
6.94	3.09
16.17	7.26
16.97	2.05
5.94	13.07
12.61	0.59
3.33	13.57
16.13	0.35
11.2	2.69
1.14	18.45
4.23	10.29
-2.97	3.24
10.37	3.71
-2.06	16.4
7.66	4.36
10.83	9.43
0.15	8.71
14.48	-11.07
2.77	6.39
18.22	8.31
13.12	-11.07
-6.54	9.24
-5.75	-3.99
-0.8	-4.44
0.75	-2.67
0.85	-4.44
10.92	8.63
2.59	8.97
-1.06	7.06
2.59	1.57
4.8	0.19
12.39	1.87
-0.8	1.57
5.6	-1.53
6.54	-8.44
5.23	5.23
6.87	-5.72
-2.15	8.63
1.14	6.95

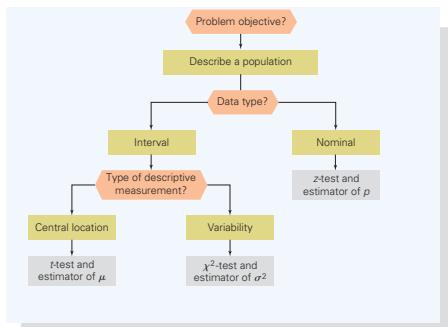
Can we conclude at the 5% significance level that directly purchased mutual funds outperform mutual funds bought through brokers?

SOLUTION:

IDENTIFY

To answer the question, we need to compare the population of returns from direct and the returns from broker-bought mutual funds. The data are obviously interval (we've recorded real numbers). This problem objective-data type combination tells us that the parameter to be tested is the difference between two means, $\mu_1 - \mu_2$. The hypothesis

*Source: D. Bergstresser, J. Chalmers, and P. Tufano, "Assessing the Costs and Benefits of Brokers in the Mutual Fund Industry."



Appendices 13, 14, 15, 16, 17, and 19 reinforce this problem-solving approach and allow students to hone their skills.

Flowcharts, found within the appendixes, help students develop the logical process for choosing the correct technique, reinforce the learning process, and provide easy review material for students.

APPENDIX 14 / REVIEW OF CHAPTERS 12 TO 14

The number of techniques introduced in Chapters 12 to 14 is up to 20. As we did in Appendix 13, we provide a table of the techniques with formulas and required conditions, a flowchart to help you identify the correct technique, and 25 exercises to give you practice in how to choose the appropriate method. The table and the flowchart have been amended to include the three analysis of variance techniques introduced in this chapter and the three multiple comparison methods.

TABLE A14.1 Summary of Statistical Techniques in Chapters 12 to 14

t-test of μ
Estimator of μ (including estimator of $N\mu$)
χ^2 test of σ^2
Estimator of σ^2
z-test of p
Estimator of p (including estimator of Np)
Equal-variances t-test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances t-test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
t-test of μ_D
Estimator of μ_D
F-test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
z-test of $p_1 - p_2$ (Case 1)
z-test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$
One-way analysis of variance (including multiple comparisons)
Two-way (randomized blocks) analysis of variance
Two-factor analysis of variance

Factors That Identify the Independent Samples Two-Factor Analysis of Variance

- 1. Problem objective:** Compare two or more populations (populations are defined as the combinations of the levels of two factors)
- 2. Data type:** Interval
- 3. Experimental design:** Independent samples

Factors That Identify ... boxes are found in each chapter after a technique or concept has been introduced. These boxes allow students to see a technique's essential requirements and give them a way to easily review their understanding. These essential requirements are revisited in the review chapters, where they are coupled with other concepts illustrated in flowcharts.

A Guide to Statistical Techniques, found on the inside front cover of the text, pulls everything together into one useful table that helps students identify which technique to perform based on the problem objective and data type.

A GUIDE TO STATISTICAL TECHNIQUES			
Problem Objectives			
	Describe a Population	Compare Two Populations	Compare Two or More Populations
DATA TYPES	Interval	<p>Histogram Section 3-1</p> <p>Ogive Section 3-1</p> <p>Stem-and-leaf Section 3-1</p> <p>Line chart Section 3-2</p> <p>Mean, median, and mode Section 4-1</p> <p>Range, variance, and standard deviation Section 4-2</p> <p>Percentiles and quartiles Section 4-3</p> <p>Box plot Section 4-3</p> <p><i>t</i>-test and estimator of a mean Section 12-1</p> <p>Chi-squared test and estimator of a variance Section 12-2</p>	<p>Equal-variances <i>t</i>-test and estimator of the difference between two means: independent samples Section 13-1</p> <p>Unequal-variances <i>t</i>-test and estimator of the difference between two means: independent samples Section 13-1</p> <p><i>t</i>-test and estimator of mean difference Section 13-3</p> <p><i>F</i>-test and estimator of ratio of two variances Section 13-4</p> <p>Wilcoxon rank sum test Section 19-1</p> <p>Wilcoxon signed rank sum test Section 19-2</p>
	Nominal	<p>Frequency distribution Section 2-2</p> <p>Bar chart Section 2-2</p> <p>Pie chart Section 2-2</p> <p><i>z</i>-test and estimator of a proportion Section 12-3</p> <p>Chi-squared goodness-of-fit test Section 15-1</p>	<p><i>z</i>-test and estimator of the difference between two proportions Section 13-5</p> <p>Chi-squared test of a contingency table Section 15-2</p>
	Ordinal	<p>Median Section 4-1</p> <p>Percentiles and quartiles Section 4-3</p> <p>Box plot Section 4-3</p>	<p>Wilcoxon rank sum test Section 19-1</p> <p>Sign test Section 19-2</p>
			<p>Kruskal-Wallis test Section 19-3</p> <p>Friedman test Section 19-3</p>

More Data Sets

DATA
Xm13-02

A total of 967 data sets available to be downloaded provide ample practice. These data sets often contain real data, are typically large, and are formatted for Excel, Minitab, SPSS, SAS, JMP IN, and ASCII.

Prevalent use of data in examples, exercises, and cases is highlighted by the accompanying data icon, which alerts students to go to Keller's website.

<p>bought their newspapers from a street vendor and people who had the newspaper delivered to their homes. Each was asked how many minutes they spent reading their newspapers. Can we infer that the amount of time reading differs between the two groups?</p> <p>13.190 Xm13-190 In recent years, a number of state governments have passed mandatory seat-belt laws. Although the use of seat belts is known to save lives and reduce serious injuries, compliance with seat-belt laws is not universal. In an effort to increase the use of seat belts, a government agency sponsored a 2-year study. Among its objectives was to determine whether there was enough evidence to infer that seat-belt usage increased between last year and this year. To test this belief, random samples of drivers last year and this year were asked whether they always use their seat belt (2 = Wear seat belt; 1 = Do not wear seat belt). Can we infer that seat belt usage has increased over the last year?</p> <p>13.191 Xm13-191 An important component of the cost of living is the amount of money spent on housing. Housing costs include rent (for tenants), mortgage payments and property tax (for home owners), heating, electricity, and water. An economist undertook a 5-year study to determine how housing costs have changed. Five years ago, he took a random sample of 200 households and recorded the percentage of total income spent on housing. This year, he took another sample of 200 households.</p> <ul style="list-style-type: none"> a. Conduct a test (with $\alpha = .10$) to determine whether the economist can infer that housing cost as a percentage of total income has increased over the last 5 years. b. Use whatever statistical method you deem appropriate to check the required condition of the test used in part (a). <p>13.192 Xm13-192 In designing advertising campaigns to sell magazines, it is important to know how much time each of a number of demographic groups spend reading magazines. In a preliminary study, 40 people were randomly selected. Each was asked how much time per week he or she spends reading magazine; additionally, each was categorized by gender and h</p>	<p>b. Is there sufficient evidence at the 10% significance level to conclude that high-income individuals devote more time to low-income people?</p> <p>13.193 Xm13-193 In a study to determine salary offers for graduates, 25 pairs of students were selected, consisting of a female and a male matched according to their grade, courses taken, ages, and previous highest salary offered. The highest salary offered in each graduate was recorded.</p> <ul style="list-style-type: none"> a. Is there enough evidence at the 1% significance level to infer that gender matters? b. Discuss why the experimenter chose the way it was. c. Is the required condition for inference satisfied? <p>13.194 Xm13-194 Have North Americans grown to distrust television and newspaper journalists? A study was conducted this year to compare what Americans currently think of the press versus what they said 3 years ago. The survey asked respondents whether they agreed that the press tends to favor one side when reporting on political and social issues. A random sample of people was asked to participate in this year's survey. The results of a survey of another random sample taken 3 years ago are also available. The responses are 2 = Agree and 1 = Disagree. Can we conclude at the 10% significance level that Americans have become more distrustful of television and newspaper reporting this year than they were 3 years ago?</p>	<p>EXAMPLE 13.9</p> <p>DATA Xm13-09</p> <p>Test Marketing of Package Designs, Part 1</p> <p>The General Products Company produces and sells a variety of household products. Because of stiff competition, one of its products, a bath soap, is not selling well. Hoping to improve sales, General Products decided to introduce more attractive packaging. The company's advertising agency developed two new designs. The first design features several bright colors to distinguish it from other brands. The second design is light green in color with just the company's logo on it. As a test to determine which design is better, the marketing manager selected two supermarkets. In one supermarket, the soap was packaged in a box using the first design; in the second supermarket, the second design was used. The product scanner at each supermarket tracked every buyer of soap over a 1-week period. The supermarkets recorded the last four digits of the scanner code for each of the five brands of soap the supermarket sold. The code for the General Products brand of soap is 9077 (the other codes are 4255, 3745, 7118, and 8855). After the trial period, the manager wants to know if the new design is better.</p>
<p>CASE 14.1</p> <p>DATA C14-01</p> <p>Comparing Three Methods of Treating Childhood Ear Infections*</p> <p>Acute otitis media, an infection of the middle ear, is a common childhood illness. There are various ways to treat the problem. To help determine the best way, researchers conducted an experiment. One hundred and eighty children between 10 months and 2 years with recurrent acute otitis media were divided into three equal groups. Group 1 was treated by surgically removing the adenoids (adenoidectomy), the second was treated with the drug Sulfafurazole, and the third with a placebo.</p> <p>Each child was tracked for 2 years, during which time all symptoms and episodes of acute otitis media were recorded. The data were recorded in the following way:</p> <ul style="list-style-type: none"> Column 1: ID number Column 2: Group number Column 3: Number of episodes of the illness Column 4: Number of visits to a physician because of any infection Column 5: Number of prescriptions Column 6: Number of days with symptoms of respiratory infection <p>*This case is adapted from the <i>British Medical Journal</i>, February 2004.</p>	 <p>Stephen Chang/Wolstock</p> <p>a. Are there differences between the three groups with respect to the number of episodes, number of physician visits, number of prescriptions, and number of days with symptoms of respiratory infection?</p> <p>b. Assume that you are working for the company that makes the drug Sulfafurazole. Write a report to the company's executives discussing your results.</p>	

Flexible to Use

Although many texts today incorporate the use of the computer, *Statistics for Management and Economics* is designed for maximum flexibility and ease of use for both instructors and students. To this end, parallel illustration of both manual and computer printouts is provided throughout the text. This approach allows you to choose which, if any, computer program to use. Regardless of the method or software you choose, the output and instructions that you need are provided!

Compute the Statistics

Once the correct technique has been identified, examples take students to the next level within the solution by asking them to compute the statistics.

COMPUTE

MANUALLY:

From the data, we calculated the following statistics:

$$\bar{x}_1^2 = 37.49 \quad \text{and} \quad \bar{x}_2^2 = 43.34$$

Test statistic: $F = \bar{x}_1^2/\bar{x}_2^2 = 37.49/43.34 = 0.86$

Rejection region: $F > F_{\alpha/2, v_1, v_2} = F_{.025, 49, 49} \approx F_{.025, 50, 50} = 1.75$

or

$$F < F_{1-\alpha/2, v_1, v_2} = F_{.975, 49, 49} = 1/F_{.025, 49, 49} \approx 1/F_{.025, 50, 50} = 1/1.75 = .57$$

Because $F = .86$ is not greater than 1.75 or smaller than $.57$, we cannot reject the null hypothesis.

EXCEL

A	B	C
1 F-Test: Two-Sample for Variances		
2		
3	Direct	Broker
4 Mean	6.63	3.72
5 Variance	37.49	43.34
6 Observations	50	50
7 df	49	49
8 F	0.860	
9 P(F<=f) one-tail	0.0368	
10 F Critical one-tail	0.6222	

The value of the test statistic is $F = .8650$. Excel outputs the one-tail p -value. Because we're conducting a two-tail test, we double that value. Thus, the p -value of the test we're conducting is $2 \times .0368 = .6136$.

INSTRUCTIONS

- Type or import the data into two columns. ([Open Xm13-01](#).)
- Click Data, Data Analysis, and F-test Two-Sample for Variances.
- Specify the Variable 1 Range (A1:A51) and the Variable 2 Range (B1:B51). Type a value for α (.05).

MINITAB

Test for Equal Variances: Direct, Broker
F-Test (Normal Distribution)
Test statistic = 0.86, p-value = 0.614

INSTRUCTIONS

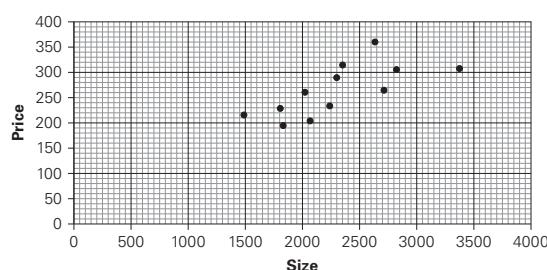
(Note: Some of the printout has been omitted.)

- Type or import the data into two columns. ([Open Xm13-01](#).)
- Click Stat, Basic Statistics, and 2 Variances ...
- In the Samples in different columns box, select the First (Direct) and Second (Broker) variables.

Appendix A provides summary statistics that allow students to solve applied exercises with data files by hand. Offering unparalleled flexibility, this feature allows virtually *all* exercises to be solved by hand!

Manual calculation of the problem is presented first in each “Compute” section of the examples.

Step-by-step instructions in the use of Excel and Minitab immediately follow the manual presentation. Instruction appears in the book with the printouts—there's no need to incur the extra expense of separate software manuals.



APPENDIX A			
DATA FILE SAMPLE STATISTICS			
Chapter 10			
10.30 $\bar{x} = 252.38$	12.108 $n(1) = 153, n(2) = 24$	13.27 Chitchat: $\bar{x}_1 = .654, s_1 = .048,$	
10.31 $\bar{x} = 1,860.16$	12.109 $n(1) = 92, n(2) = 28$	$n_1 = 95;$	
10.32 $\bar{x} = 1,860.10$	12.110 $n(1) = 93, n(2) = 95$	Postscript: $\bar{x}_2 = .662, s_2 = .045,$	
10.33 $\bar{x} = 36.21$	12.111 $n(1) = 92, n(2) = 334$	$n_2 = 95;$	
10.34 $\bar{x} = .510$	12.112 $n(1) = 57, n(2) = 35, n(3) = 4,$	Planner: $\bar{x}_1 = 6.18, s_1 = 1.59,$	
	$n(4) = 4$	$n_1 = 64;$	

Ample use of graphics provides students many opportunities to see statistics in all its forms. In addition to manually presented figures throughout the text, Excel and Minitab graphic outputs are given for students to compare to their own results.

Interpret the Results

INTERPRET

In the real world, it is not enough to know *how* to generate the statistics. To be truly effective, a business person must also know how to **interpret and articulate** the results. Furthermore, students need a framework to understand and apply statistics **within a realistic setting** by using realistic data in exercises, examples, and case studies.

Examples round out the final component of the identify–compute–interpret approach by asking students to interpret the results in the context of a business-related decision. This final step motivates and shows how statistics is used in everyday business situations.

An Applied Approach

With **Applications in ...** sections and boxes, *Statistics for Management and Economics* now includes 45 **applications** (in finance, marketing, operations management, human resources, economics, and accounting) highlighting how statistics is used in those professions. For example, “Applications in Finance: Portfolio Diversification and Asset Allocation” shows how probability is used to help select stocks to minimize risk. A new optional section, “Applications in Professional Sports: Baseball” contains a subsection on the success of the Oakland Athletics.

In addition to sections and boxes, **Applications in ... exercises** can be found within the exercise sections to further reinforce the big picture.

APPLICATIONS in OPERATIONS MANAGEMENT

Quality

A critical aspect of production is quality. The quality of a final product is a function of the quality of the product's components. If the components don't fit, the product will not function as planned and likely cease functioning before its customers expect it to. For example, if a car door is not made to its specifications, it will not fit. As a result, the door will leak both water and air.

Operations managers attempt to maintain and improve the quality of products by ensuring that all components are made so that there is as little variation as possible. As you have already seen, statisticians measure variation by computing the variance.

Incidentally, an entire chapter (Chapter 21) is devoted to the topic of quality.

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Nielsen Ratings

DATA

Xm12-00* Statistical techniques play a vital role in helping advertisers determine how many viewers watch the shows that they sponsor. Although several companies sample television viewers to determine what shows they watch, the best known is the A. C. Nielsen firm. The Nielsen ratings are based on a random sample of approximately 5,000 of the 115 million households in the United States with at least one television (in 2013). A meter attached to the televisions in the selected households keeps track of when the televisions are turned on and what channels they are tuned to. The data are sent to the Nielsen's computer every night from which Nielsen computes the rating and sponsors can determine the number of viewers and the potential value of any commercials. Of particular interest to advertisers are 18- to 49-year-olds, who are considered the most likely to buy advertised products. In 2013 there were 126.54 million Americans who were between 18 and 49 years old.



On page 415, we provide a solution to this problem.

Chapter-opening examples and solutions present compelling discussions of how the techniques and concepts introduced in that chapter are applied to real-world problems. These examples are then revisited with a solution as each chapter unfolds, applying the methodologies introduced in the chapter.

Nielsen Ratings: Solution**IDENTIFY**

The problem objective is to describe the population of television shows watched by viewers across the country. The data are nominal. The combination of problem objective and data type make the parameter to be estimated the proportion of the entire population of 18- to 49-year-olds that watched *Big Bang Theory* (code = 2). The confidence interval estimator of the proportion is:

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}$$

COMPUTE**MANUALLY:**

To solve manually, we count the number of 2's in the file. We find this value to be 275. Thus,

$$\hat{p} = \frac{x}{n} = \frac{275}{5,000} = .0550$$

The confidence level is $1 - \alpha = .95$. It follows that $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$. The 95% confidence interval estimate of p is:

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} = .0550 \pm 1.96 \sqrt{\frac{(0.0550)(1 - 0.0550)}{5,000}} = .0550 \pm .0063$$

$$\text{LCL} = .0487 \quad \text{UCL} = .0613$$

EXCEL

A	B
1 z-Estimate_Proportion	IV_Program
2	
3 Sample Proportion	0.0550
4 Observations	5000
5 LCL	0.0487
6 UCL	0.0613

INSTRUCTIONS

- Type or import the data into one column*. (Open Xm12-00.)
- Click Add-Ins, Data Analysis Plus, and Z-Estimate: Proportion.
- Specify the Input Range (B1:B5001), the Code for Success (2), and the value of α (.05).

MINITAB

Minitab requires that the data set contain only two values, the larger of which would be considered a success. In this example there are five values. If there are more than two codes or if the code for success is smaller than that for failure, we must recode.

Test and CI for One Proportion: Show					
Event = 4					
Variable	X	N	Sample p	95% CI	
Programs	1319	5000	0.263800	(0.251585, 0.276015)	
Using the normal approximation.					

*If the column contains a blank (representing missing data) the row will be deleted.

CASE 12.5**Bias in Roulette Betting**

The game of roulette consists of a wheel with 38 colored and numbered slots. The numbers are 1 to 36, 0 and 00. Half of the slots numbered 1 to 36 are red and the other half are black. The two "zeros" are green. The wheel is spun and an iron ball is rolled, which eventually comes to rest in one of the slots. Gamblers can make several different kinds of bets. Most players bet on one or more numbers or on a color (black or red). Here is the layout of the roulette betting table:

0	3	6	9	12	15	18	21	24	27	30	33	36
00	2	5	8	11	14	17	20	23	26	29	32	35
1	4	7	10	13	16	19	22	25	28	31	34	

Two statisticians recorded the bets on 904 spins. There were 21,731 bets.

Researchers wanted to use these data to examine *middle bias*, which is the tendency for guessers in multiple-choice exams to select the middle answers. For example, if there are five choices a, b, c, d, and e, guessers will tend to select answer c.

Most players stand on both sides of the betting table so that the middle numbers are 2, 5, 8, 11, 14, 17, 20, 23, 26, 29, 32, and 35.

- If there is no middle bias, what proportion of the bets

will be on 1 of the 12 middle numbers?

- Conduct a test at the 5% significance level to determine whether middle bias exists.
- The middle of the middle are the numbers 17 and 20. If there is no middle bias, what proportion of the bets will be either 17 or 20?
- Test with a 5% significance level to determine whether middle of the middle bias exists.

Source: Maya Bar-Hillel and Ro'i Zultan, "We Sing the Praise of Good Displays: How Gamblers Bet in Casino Roulette," *Chance*, Volume 25, No. 2, 2012.

DATA
C12-05

Many of the examples, exercises, and cases are based on actual studies performed by statisticians and published in journals, newspapers, and magazines, or presented at conferences. Many data files were recreated to produce the original results.

A total of 2,148 exercises, many of them new or updated, offer ample practice for students to use statistics in an applied context.

CHAPTER SUMMARY

This chapter introduced three statistical techniques. The first is the chi-squared goodness-of-fit test, which is applied when the problem objective is to describe a single population of nominal data with two or more categories. The second is

the chi-squared test of a contingency table. This test has two objectives: to analyze the relationship between two nominal variables and to compare two or more populations of nominal data. The last procedure is designed to test for normality.

IMPORTANT TERMS:

Multinomial experiment	592
Chi-squared goodness-of-fit test	593
Expected frequency	593
Observed frequencies	594

Cross-classification table	599
Chi-squared test of a contingency table	599
Contingency table	602

SYMBOLS:

Symbol	Pronounced	Represents
f_i	f sub i	Frequency of the i th category
e_i	e sub i	Expected value of the i th category
χ^2	Chi squared	Test statistic

FORMULA:

Test statistic for all procedures

$$\chi^2 = \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Chi-squared goodness-of-fit test	595	596
Chi-squared test of a contingency table (raw data)	604	604
Chi-squared test of a contingency table	604	604
Chi-squared test of normality	615	616

Instructor Resources

To access the instructor and student textbook resources, go to www.cengage.com/login, log in with your faculty account username and password, and use ISBN 9781285425450 to search for and to add instructor resources to your account.

Student Learning Resources

To access student textbook resources, go to www.cengagebrain.com and use ISBN 9781285425450 to access the **Data Analysis Plus** add-in, 992 data sets, optional topics, and 35 appendixes.

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WHAT IS STATISTICS?

- 1-1 *Key Statistical Concepts*
 - 1-2 *Statistical Applications in Business*
 - 1-3 *Large Real Data Sets*
 - 1-4 *Statistics and the Computer*
- Appendix 1 Instructions for Keller's website*

INTRODUCTION

Statistics is a way to get information from data. That's it! Most of this textbook is devoted to describing how, when, and why managers and statistics practitioners* conduct statistical procedures. You may ask, "If that's all there is to statistics, why is this book (and most other statistics books) so large?" The answer is that students of applied statistics will be exposed to different kinds of information and data. We demonstrate some of these with a case and two examples that are featured later in this book.

The first may be of particular interest to you.

*The term *statistician* is used to describe so many different kinds of occupations that it has ceased to have any meaning. It is used, for example, to describe a person who calculates baseball statistics as well as an individual educated in statistical principles. We will describe the former as a *statistics practitioner* and the

(continued)

EXAMPLE 3.3

Business Statistics Marks (See Chapter 3)

A student enrolled in a business program is attending his first class of the required statistics course. The student is somewhat apprehensive because he believes the myth that the course is difficult. To alleviate his anxiety, the student asks the professor about last year's marks. Because this professor is friendly and helpful, like all other statistics professors, he obliges the student and provides a list of the final marks, which are composed of term work plus the final exam. What information can the student obtain from the list?

This is a typical statistics problem. The student has the data (marks) and needs to apply statistical techniques to get the information he requires. This is a function of **descriptive statistics**.

Descriptive Statistics

Descriptive statistics deals with methods of organizing, summarizing, and presenting data in a convenient and informative way. One form of descriptive statistics uses graphical techniques that allow statistics practitioners to present data in ways that make it easy for the reader to extract useful information. In Chapters 2 and 3 we will present a variety of graphical methods.

Another form of descriptive statistics uses numerical techniques to summarize data. One such method that you have already used frequently calculates the average or mean. In the same way that you calculate the average age of the employees of a company, we can compute the mean mark of last year's statistics course. Chapter 4 introduces several numerical statistical measures that describe different features of the data.

The actual technique we use depends on what specific information we would like to extract. In this example, we can see at least three important pieces of information. The first is the "typical" mark. We call this a *measure of central location*. The average is one such measure. In Chapter 4, we will introduce another useful measure of central location, the median. Suppose the student was told that the average mark last year was 67. Is this enough information to reduce his anxiety? The student would likely respond "No" because he would like to know whether most of the marks were close to 67 or were scattered far below and above the average. He needs a *measure of variability*. The simplest such measure is the *range*, which is calculated by subtracting the smallest number from the largest. Suppose the largest mark is 96 and the smallest is 24. Unfortunately, this provides little information since it is based on only two marks. We need other measures—these will be introduced in Chapter 4. Moreover, the student must determine more about the marks. In particular, he needs to know how the marks are distributed between 24 and 96. The best way to do this is to use a graphical technique, the histogram, which will be introduced in Chapter 3.

latter as a *statistician*. A statistics practitioner is a person who uses statistical techniques properly. Examples of statistics practitioners include the following:

1. a financial analyst who develops stock portfolios based on historical rates of return;
2. an economist who uses statistical models to help explain and predict variables such as inflation rate, unemployment rate, and changes in the gross domestic product; and
3. a market researcher who surveys consumers and converts the responses into useful information.

Our goal in this book is to convert you into one such capable individual.

The term *statistician* refers to an individual who works with the mathematics of statistics. His or her work involves research that develops techniques and concepts that in the future may help the statistics practitioner. Statisticians are also statistics practitioners, frequently conducting empirical research and consulting. If you're taking a statistics course, your instructor is probably a statistician.

Case 12.1 Pepsi's Exclusivity Agreement with a University (see Chapter 12) In the last few years, colleges and universities have signed exclusivity agreements with a variety of private companies. These agreements bind the university to sell these companies' products exclusively on the campus. Many of the agreements involve food and beverage firms.

A large university with a total enrollment of about 50,000 students has offered Pepsi-Cola an exclusivity agreement that would give Pepsi exclusive rights to sell its products at all university facilities for the next year with an option for future years. In return, the university would receive 35% of the on-campus revenues and an additional lump sum of \$200,000 per year. Pepsi has been given 2 weeks to respond.

The management at Pepsi quickly reviews what it knows. The market for soft drinks is measured in terms of 12-ounce cans. Pepsi currently sells an average of 22,000 cans per week over the 40 weeks of the year that the university operates. The cans sell for an average of one dollar each. The costs, including labor, total 30 cents per can. Pepsi is unsure of its market share but suspects it is considerably less than 50%. A quick analysis reveals that if its current market share were 25%, then, with an exclusivity agreement, Pepsi would sell 88,000 (22,000 is 25% of 88,000) cans per week or 3,520,000 cans per year. The gross revenue would be computed as follows[†]:

$$\text{Gross revenue} = 3,520,000 \times \$1.00/\text{can} = \$3,520,000$$

This figure must be multiplied by 65% because the university would rake in 35% of the gross. Thus,

$$\begin{aligned}\text{Gross revenue after deducting 35\% university take} \\ &= 65\% \times \$3,520,000 = \$2,288,000\end{aligned}$$

The total cost of 30 cents per can (or \$1,056,000) and the annual payment to the university of \$200,000 are subtracted to obtain the net profit:

$$\text{Net profit} = \$2,288,000 - \$1,056,000 - \$200,000 = \$1,032,000$$

Pepsi's current annual profit is

$$40 \text{ weeks} \times 22,000 \text{ cans/week} \times \$0.70 = \$616,000$$

If the current market share is 25%, the potential gain from the agreement is
 $\$1,032,000 - \$616,000 = \$416,000$

The only problem with this analysis is that Pepsi does not know how many soft drinks are sold weekly at the university. Coke is not likely to supply Pepsi with information about its sales, which together with Pepsi's line of products constitute virtually the entire market.

Pepsi assigned a recent university graduate to survey the university's students to supply the missing information. Accordingly, she organizes a survey that asks 500 students to keep track of the number of soft drinks they purchase in the next 7 days. The responses are stored in a file C12-01 available to be downloaded. See Appendix 1 for instructions.

Inferential Statistics

The information we would like to acquire in Case 12.1 is an estimate of annual profits from the exclusivity agreement. The data are the numbers of cans of soft drinks consumed in 7 days by the 500 students in the sample. We can use descriptive techniques to

[†]We have created an Excel spreadsheet that does the calculations for this case. See Appendix 1 for instructions on how to download this spreadsheet from Keller's website plus hundreds of data sets and much more.

learn more about the data. In this case, however, we are not so much interested in what the 500 students are reporting as in knowing the mean number of soft drinks consumed by all 50,000 students on campus. To accomplish this goal we need another branch of statistics: **inferential statistics**.

Inferential statistics is a body of methods used to draw conclusions or inferences about characteristics of populations based on sample data. The population in question in this case is the university's 50,000 students. The characteristic of interest is the soft drink consumption of this population. The cost of interviewing each student in the population would be prohibitive and extremely time consuming. Statistical techniques make such endeavors unnecessary. Instead, we can sample a much smaller number of students (the sample size is 500) and infer from the data the number of soft drinks consumed by all 50,000 students. We can then estimate annual profits for Pepsi.

EXAMPLE 12.5

Exit Polls (See Chapter 12)

When an election for political office takes place, the television networks cancel regular programming to provide election coverage. After the ballots are counted, the results are reported. However, for important offices such as president or senator in large states, the networks actively compete to see which one will be the first to predict a winner. This is done through **exit polls** in which a random sample of voters who exit the polling booth are asked for whom they voted. From the data, the sample proportion of voters supporting the candidates is computed. A statistical technique is applied to determine whether there is enough evidence to infer that the leading candidate will garner enough votes to win. Suppose that the exit poll results from the state of Florida during the year 2000 elections were recorded. Although several candidates were running for president, the exit pollsters recorded only the votes of the two candidates who had any chance of winning: Republican George W. Bush and Democrat Albert Gore. The results (765 people who voted for either Bush or Gore) were stored in file Xm12-05. The network analysts would like to know whether they can conclude that George W. Bush will win the state of Florida.

Example 12.5 describes a common application of statistical inference. The population the television networks wanted to make inferences about is the approximately 5 million Floridians who voted for Bush or Gore for president. The sample consisted of the 765 people randomly selected by the polling company who voted for either of the two main candidates. The characteristic of the population that we would like to know is the proportion of the Florida total electorate that voted for Bush. Specifically, we would like to know whether more than 50% of the electorate voted for Bush (counting only those who voted for either the Republican or Democratic candidate). It must be made clear that we cannot predict the outcome with 100% certainty because we will not ask all 5 million actual voters for whom they voted. This is a fact that statistics practitioners and even students of statistics must understand. A sample that is only a small fraction of the size of the population can lead to correct inferences only a certain percentage of the time. You will find that statistics practitioners can control that fraction and usually set it between 90% and 99%.

Incidentally, on the night of the United States election in November 2000, the networks goofed badly. Using exit polls as well as the results of previous elections, all four networks concluded at about 8 p.m. that Al Gore would win Florida. Shortly after 10 p.m., with a large percentage of the actual vote having been counted, the networks reversed course and declared that George W. Bush would win the state. By 2 a.m., another verdict was declared: The result was too close to call. Since then, this experience has likely been used by statistics instructors when teaching how *not* to use statistics.

Notice that, contrary to what you probably believed, data are not necessarily numbers. The marks in Example 3.3 and the number of soft drinks consumed in a week in Case 12.1, of course, are numbers; however, the votes in Example 12.5 are not. In Chapter 2, we will discuss the different types of data you will encounter in statistical applications and how to deal with them.

1-1 / KEY STATISTICAL CONCEPTS

Statistical inference problems involve three key concepts: the population, the sample, and the statistical inference. We now discuss each of these concepts in more detail.

1-1a Population

A **population** is the group of all items of interest to a statistics practitioner. It is frequently very large and may, in fact, be infinitely large. In the language of statistics, *population* does not necessarily refer to a group of people. It may, for example, refer to the population of ball bearings produced at a large plant. In Case 12.1, the population of interest consists of the 50,000 students on campus. In Example 12.5, the population consists of the Floridians who voted for Bush or Gore.

A descriptive measure of a population is called a **parameter**. The parameter of interest in Case 12.1 is the mean number of soft drinks consumed by all the students at the university. The parameter in Example 12.5 is the proportion of the 5 million Florida voters who voted for Bush. In most applications of inferential statistics the parameter represents the information we need.

1-1b Sample

A **sample** is a set of data drawn from the studied population. A descriptive measure of a sample is called a **statistic**. We use statistics to make inferences about parameters. In Case 12.1, the statistic we would compute is the mean number of soft drinks consumed in the last week by the 500 students in the sample. We would then use the sample mean to infer the value of the population mean, which is the parameter of interest in this problem. In Example 12.5, we compute the proportion of the sample of 765 Floridians who voted for Bush. The sample statistic is then used to make inferences about the population of all 5 million votes—that is, we predict the election results even before the actual count.

1-1c Statistical Inference

Statistical inference is the process of making an estimate, prediction, or decision about a population based on sample data. Because populations are almost always very large, investigating each member of the population would be impractical and expensive. It is far easier and cheaper to take a sample from the population of interest and draw conclusions or make estimates about the population on the basis of information provided by the sample. However, such conclusions and estimates are not always going to be correct. For this reason, we build into the statistical inference a measure of reliability. There are two such measures: the **confidence level** and the **significance level**. The *confidence level* is the proportion of times that an estimating procedure will be correct. For example, in Case 12.1, we will produce an estimate of the average number of soft drinks to be consumed by all 50,000 students that has a confidence level of 95%. In other words,

estimates based on this form of statistical inference will be correct 95% of the time. When the purpose of the statistical inference is to draw a conclusion about a population, the *significance level* measures how frequently the conclusion will be wrong. For example, suppose that, as a result of the analysis in Example 12.5, we conclude that more than 50% of the electorate will vote for George W. Bush, and thus he will win the state of Florida. A 5% significance level means that samples that lead us to conclude that Bush wins the election will be wrong 5% of the time.

1-2 STATISTICAL APPLICATIONS IN BUSINESS

An important function of statistics courses in business and economics programs is to demonstrate that statistical analysis plays an important role in virtually all aspects of business and economics. We intend to do so through examples, exercises, and cases. However, we assume that most students taking their first statistics course have not taken courses in most of the other subjects in management programs. To understand fully how statistics is used in these and other subjects, it is necessary to know something about them. To provide sufficient background to understand the statistical application we introduce applications in accounting, economics, finance, human resources management, marketing, and operations management. We will provide readers with some background to these applications by describing their functions in two ways.

1-2a Application Sections and Subsections

We feature five sections that describe statistical applications in the functional areas of business. For example, in Section 7-3 we show an application in finance that describes a financial analyst's use of probability and statistics to construct portfolios that decrease risk.

One section and one subsection demonstrate the uses of probability and statistics in specific industries. Section 4-5 introduces an interesting application of statistics in professional baseball. A subsection in Section 6-4 presents an application in medical testing (useful in the medical insurance industry).

1-2b Application Boxes

For other topics that require less detailed description, we provide application boxes with a relatively brief description of the background followed by examples or exercises. These boxes are scattered throughout the book. For example, in Chapter 3 we discuss a job a marketing manager may need to undertake to determine the appropriate price for a product. To understand the context, we need to provide a description of marketing management. The statistical application will follow.

1-3 LARGE REAL DATA SETS

The authors believe that you learn statistics by doing statistics. For their lives after college and university, we expect our students to have access to large amounts of real data that must be summarized to acquire the information needed to make decisions. To provide practice in this vital skill we have created eight large real data sets, available to be downloaded from Keller's website. Their sources are the General Social Survey (GSS) and the American National Election Survey (ANES).

1-3a General Social Survey

Since 1972, the GSS has been tracking American attitudes on a wide variety of topics. With the exception of the U.S. Census, the GSS is the most frequently used source of information about American society. The surveys now conducted every second year measure hundreds of variables and thousands of observations. We have included the results of the last six surveys (years 2002, 2004, 2006, 2008, 2010, and 2012), stored as GSS2002, GSS2004, GSS2006, GSS2008, GSS2010, and GSS2012, respectively. The survey sizes are 2,765, 2,812, 4,510, 2,023, 2,044, and 1,974, respectively. We have reduced the number of variables to about 60 and have deleted the responses that are known as missing data (don't know, refused, etc.).

We have included some demographic variables, such as age, gender, race, income, and education. Other variables measure political views, support for various government activities, and work. The full lists of variables for each year are stored on our website in Appendixes GSS2002, GSS2004, GSS2006, GSS2008, GSS2010, and GSS2012.

We have scattered examples and exercises from these data sets throughout this book.

1-3b American National Election Survey

The goal of the American National Election Survey is to provide data about why Americans vote as they do. The surveys are conducted in presidential election years. We have included data from the 2004 and 2008 surveys. Like the GSS, the ANES includes demographic variables. It also deals with interest in the presidential election as well as variables describing political beliefs and affiliations. Online Appendixes ANES2004 and ANES2008 contain the names and definitions of the variables.

The 2008 surveys overly sampled African American and Hispanic voters. We have "adjusted" these data by randomly deleting responses from these two racial groups.

As is the case with the GSSs, we have removed missing data.

1-4 / STATISTICS AND THE COMPUTER

In virtually all applications of statistics, the statistics practitioner must deal with large amounts of data. For example, Case 12.1 (Pepsi-Cola) involves 500 observations. To estimate annual profits, the statistics practitioner would have to perform computations on the data. Although the calculations do not require any great mathematical skill, the sheer amount of arithmetic makes this aspect of the statistical method time-consuming and tedious.

Fortunately, numerous commercially prepared computer programs are available to perform the arithmetic. We have chosen to use Microsoft Excel, which is a spreadsheet program, and Minitab, which is a statistical software package. (We use the latest versions of both software: Office 2013 and Minitab 16.) We chose Excel because we believe that it is and will continue to be the most popular spreadsheet package. One of its drawbacks is that it does not offer a complete set of the statistical techniques we introduce in this book. Consequently, we created add-ins that can be loaded onto your computer to enable you to use Excel for all statistical procedures introduced in this book. The add-ins can be downloaded and, when installed, will appear as *Data Analysis Plus*© on Excel's Add-Ins menu. Also available are introductions to Excel and Minitab, and detailed instructions for both software packages.

Appendix 1 describes the material that can be downloaded and provides instructions on how to acquire the various components.

A large proportion of the examples, exercises, and cases feature large data sets. These are denoted with the file name next to the exercise number. We demonstrate the solution to the statistical examples in three ways: manually, by employing Excel, and by using Minitab. Moreover, we will provide detailed instructions for all techniques.

The files contain the data needed to produce the solution. However, in many real applications of statistics, additional data are collected. For instance, in Example 12.5, the pollster often records the voter's gender and asks for other information including race, religion, education, and income. Many other data sets are similarly constructed. In later chapters, we will return to these files and require other statistical techniques to extract the needed information. (Files that contain additional data are denoted by an asterisk on the file name.)

The approach we prefer to take is to minimize the time spent on manual computations and to focus instead on selecting the appropriate method for dealing with a problem and on interpreting the output after the computer has performed the necessary computations. In this way, we hope to demonstrate that statistics can be as interesting and as practical as any other subject in your curriculum.

1-4a Excel Spreadsheets

Books written for statistics courses taken by mathematics or statistics majors are considerably different from this one. It is not surprising that such courses feature mathematical proofs of theorems and derivations of most procedures. When the material is covered in this way, the underlying concepts that support statistical inference are exposed and relatively easy to see. However, this book was created for an applied course in business and economics statistics. Consequently, we do not address directly the mathematical principles of statistics. However, as we pointed out previously, one of the most important functions of statistics practitioners is to properly interpret statistical results, whether produced manually or by computer. And, to correctly interpret statistics, students require an understanding of the principles of statistics.

To help students understand the basic foundation, we will teach readers how to create Excel spreadsheets that allow for *what-if* analyses. By changing some of the input value, students can see for themselves how statistics works. (The term is derived from *what* happens to the statistics *if* I change this value?) These spreadsheets can also be used to calculate many of the same statistics that we introduce later in this book.

CHAPTER SUMMARY

IMPORTANT TERMS:

Descriptive statistics 2

Inferential statistics 4

Exit polls 4

Population 5

Parameter 5

Sample 5

Statistic 5

Statistical inference 5

Confidence level 5

Significance level 5

CHAPTER EXERCISES

- 1.1** In your own words, define and give an example of each of the following statistical terms.
- population
 - sample
 - parameter
 - statistic
 - statistical inference
- 1.2** Briefly describe the difference between descriptive statistics and inferential statistics.
- 1.3** A politician who is running for the office of mayor of a city with 25,000 registered voters commissions a survey. In the survey, 48% of the 200 registered voters interviewed say they plan to vote for her.
- What is the population of interest?
 - What is the sample?
 - Is the value 48% a parameter or a statistic? Explain.
- 1.4** A manufacturer of computer chips claims that less than 10% of its products are defective. When 1,000 chips were drawn from a large production, 7.5% were found to be defective.
- What is the population of interest?
 - What is the sample?
 - What is the parameter?
 - What is the statistic?
 - Does the value 10% refer to the parameter or to the statistic?
 - Is the value 7.5% a parameter or a statistic?
 - Explain briefly how the statistic can be used to make inferences about the parameter to test the claim.
- 1.5** Suppose you believe that, in general, graduates who have majored in *your* subject are offered higher salaries upon graduating than are graduates of other programs. Describe a statistical experiment that could help test your belief.
- 1.6** You are shown a coin that its owner says is fair in the sense that it will produce the same number of heads and tails when flipped a very large number of times.
- Describe an experiment to test this claim.
 - What is the population in your experiment?
 - What is the sample?
 - What is the parameter?
 - What is the statistic?
 - Describe briefly how statistical inference can be used to test the claim.
- 1.7** Suppose that in Exercise 1.6 you decide to flip the coin 100 times.
- What conclusion would you be likely to draw if you observed 95 heads?
 - What conclusion would you be likely to draw if you observed 55 heads?
 - Do you believe that, if you flip a perfectly fair coin 100 times, you will always observe exactly 50 heads? If you answered “no,” then what numbers do you think are possible? If you answered “yes,” how many heads would you observe if you flipped the coin twice? Try flipping a coin twice and repeating this experiment 10 times and report the results.
- 1.8** **Xr01-08** The owner of a large fleet of taxis is trying to estimate his costs for next year’s operations. One major cost is fuel purchases. To estimate fuel purchases, the owner needs to know the total distance his taxis will travel next year, the cost of a gallon of fuel, and the fuel mileage of his taxis. The owner has been provided with the first two figures (distance estimate and cost of a gallon of fuel). However, because of the high cost of gasoline, the owner has recently converted his taxis to operate on propane. He has measured and recorded the propane mileage (in miles per gallon) for 50 taxis.
- What is the population of interest?
 - What is the parameter the owner needs?
 - What is the sample?
 - What is the statistic?
 - Describe briefly how the statistic will produce the kind of information the owner wants.

APPENDIX 1 / INSTRUCTIONS FOR KELLER'S WEBSITE

The Keller website that accompanies this book contains the following features:

Data Analysis Plus 9.0 in VBA, which works with new and earlier versions of Excel (Office 1997, 2000, XP, 2003, 2007, and 2010 Office for Mac 2004)

A help file for Data Analysis Plus 9.0 in VBA

Data files in the following formats: ASCII, Excel, JMP, Minitab, SAS, and SPSS

Excel workbooks

Appendices (40 additional topics that are not covered in the book)

Formula card listing every formula in the book

Keller Website Instructions

“Data Analysis Plus 9.0 in VBA” can be found on the Keller website. It will be installed into the XLSTART folder of the most recent version of Excel on your computer. If properly installed Data Analysis Plus will be a menu item in Excel. The help file for Data Analysis Plus will be stored directly in your computer’s My Documents folder. It will appear when you click the Help button or when you make a mistake when using Data Analysis Plus.

The Data Sets are also accessible on the Keller website.

The Excel workbooks and Appendixes will be accessed from the Keller website. Alternatively, you can store the Excel workbooks and Appendixes to your hard drive.

Students: Access the *Statistics for Management and Economics* (10th Edition) companion site and online student resources by visiting www.cengagebrain.com, searching for ISBN 9781285425450, and clicking the “Access Now” tab to go to the student companion site.

Instructors: Access the *Statistics for Management and Economics* (10th Edition) companion site and instructor resources by going to www.cengage.com/login, logging in with your faculty account username and password, and using ISBN 9781285425450 to reach the site through your account.

For technical support, please visit www.cengage.com/support for contact options.

2



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GRAPHICAL DESCRIPTIVE TECHNIQUES I

- 2-1 *Types of Data and Information*
- 2-2 *Describing a Set of Nominal Data*
- 2-3 *Describing the Relationship between Two Nominal Variables and Comparing Two or More Nominal Data Sets*

Do Male and Female American Voters Differ in Their Party Affiliation?

DATA
ANES2008*

In Chapter 1, we introduced the American National Election Survey (ANES), which is conducted every 4 years with the objective of developing information about how Americans vote. One question in the 2008 survey was "Do you think of yourself as Democrat, Republican, Independent, or what?"

Responses were

1. Democrat
2. Republican
3. Independent



Daniel Soffer/Photos.com

On page 37, we will provide our answer.

4. Other party
5. No preference

Respondents were also identified by gender: 1 = male, and 2 = female. The responses are stored in file ANES2008* on our Keller's website. The asterisk indicates that there are variables that are not needed for this example but which will be used later in this book. For Excel users, GENDER AND PARTY are in columns B and BD, respectively. For Minitab users, GENDER AND PARTY are in columns 2 and 56, respectively. Some of the data are listed here.

ID	GENDER	PARTY
1	1	3
2	2	1
3	2	2
:	:	:
1795	1	1
1796	1	2
1797	1	1

Determine whether American female and male voters differ in their political affiliations.

INTRODUCTION

In Chapter 1, we pointed out that statistics is divided into two basic areas: descriptive statistics and inferential statistics. The purpose of this chapter, together with the next, is to present the principal methods that fall under the heading of descriptive statistics. In this chapter, we introduce graphical and tabular statistical methods that allow managers to summarize data visually to produce useful information that is often used in decision making. Another class of descriptive techniques, numerical methods, is introduced in Chapter 4.

Managers frequently have access to large masses of potentially useful data. But before the data can be used to support a decision, they must be organized and summarized. Consider, for example, the problems faced by managers who have access to the databases created by the use of debit cards. The database consists of the personal information supplied by the customer when he or she applied for the debit card. This information includes age, gender, residence, and the cardholder's income. In addition, each time the card is used the database grows to include a history of the timing, price, and brand of each product purchased. Using the appropriate statistical technique, managers can determine which segments of the market are buying their company's brands. Specialized marketing campaigns, including telemarketing, can be developed. Both descriptive and inferential statistics would likely be employed in the analysis.

Descriptive statistics involves arranging, summarizing, and presenting a set of data in such a way that useful information is produced. Its methods make use of graphical techniques and numerical descriptive measures (such as averages) to summarize and present the data, allowing managers to make decisions based on the information generated. Although descriptive statistical methods are quite straightforward, their importance should not be underestimated. Most management, business, and economics students will encounter numerous opportunities to make valuable use of graphical

and numerical descriptive techniques when preparing reports and presentations in the workplace. According to a Wharton Business School study, top managers reach a consensus 25% more quickly when responding to a presentation in which graphics are used.

In Chapter 1, we introduced the distinction between a population and a sample. Recall that a population is the entire set of observations under study, whereas a sample is a subset of a population. The descriptive methods presented in this chapter and in Chapters 3 and 4 apply to both a set of data constituting a population and a set of data constituting a sample.

In both the preface and Chapter 1, we pointed out that a critical part of your education as statistics practitioners includes an understanding of not only *how* to draw graphs and calculate statistics (manually or by computer) but also *when* to use each technique that we cover. The two most important factors that determine the appropriate method to use are (1) the type of data and (2) the information that is needed. Both are discussed next.

2-1 / TYPES OF DATA AND INFORMATION

The objective of statistics is to extract information from data. There are different types of data and information. To help explain this important principle, we need to define some terms.

A **variable** is some characteristic of a population or sample. For example, the mark on a statistics exam is a characteristic of statistics exams that is certainly of interest to readers of this book. Not all students achieve the same mark. The marks will vary from student to student, thus the name *variable*. The price of a stock is another variable. The prices of most stocks vary daily. We usually represent the name of the variable using uppercase letters such as X , Y , and Z .

The **values** of the variable are the possible observations of the variable. The values of statistics exam marks are the integers between 0 and 100 (assuming the exam is marked out of 100). The values of a stock price are real numbers that are usually measured in dollars and cents (sometimes in fractions of a cent). The values range from 0 to hundreds of dollars.

Data* are the observed values of a variable. For example, suppose that we observe the following midterm test marks of 10 students:

67 74 71 83 93 55 48 82 68 62

These are the data from which we will extract the information we seek. Incidentally, *data* is plural for **datum**. The mark of one student is a datum.

When most people think of data, they think of sets of numbers. However, there are three types of data: interval, nominal, and ordinal.[†]

*Unfortunately, the term *data*, like the term *statistician*, has taken on several different meanings. For example, dictionaries define data as facts, information, or statistics. In the language of computers, data may refer to any piece of information such as this textbook or an essay you have written. Such definitions make it difficult for us to present *statistics* as a method of converting data into *information*. In this book, we carefully distinguish among the three terms.

[†]There are actually four types of data, the fourth being *ratio* data. However, for statistical purposes there is no difference between ratio and interval data. Consequently, we combine the two types.

Interval data are real numbers, such as heights, weights, incomes, and distances. We also refer to this type of data as **quantitative or numerical**.

The values of **nominal** data are categories. For example, responses to questions about marital status produce nominal data. The values of this variable are single, married, divorced, and widowed. Notice that the values are not numbers but instead are words that describe the categories. We often record nominal data by arbitrarily assigning a number to each category. For example, we could record marital status using the following codes:

$$\text{single} = 1, \quad \text{married} = 2, \quad \text{divorced} = 3, \quad \text{widowed} = 4$$

However, any other numbering system is valid provided that each category has a different number assigned to it. Here is another coding system that is just as valid as the previous one.

$$\text{Single} = 7, \quad \text{married} = 4, \quad \text{divorced} = 13, \quad \text{widowed} = 1$$

Nominal data are also called **qualitative or categorical**.

The third type of data is ordinal. **Ordinal** data appear to be nominal, but the difference is that the order of their values has meaning. For example, at the completion of most college and university courses, students are asked to evaluate the course. The variables are the ratings of various aspects of the course, including the professor. Suppose that in a particular college the values are

poor, fair, good, very good, and excellent

The difference between nominal and ordinal types of data is that the order of the values of the latter indicate a higher rating. Consequently, when assigning codes to the values, we should maintain the order of the values. For example, we can record the students' evaluations as

$$\text{Poor} = 1, \quad \text{Fair} = 2, \quad \text{Good} = 3, \quad \text{Very good} = 4, \quad \text{Excellent} = 5$$

Because the only constraint that we impose on our choice of codes is that the order must be maintained, we can use any set of codes that are in order. For example, we can also assign the following codes:

$$\text{Poor} = 6, \quad \text{Fair} = 18, \quad \text{Good} = 23, \quad \text{Very good} = 45, \quad \text{Excellent} = 88$$

As we discuss in Chapter 19, which introduces statistical inference techniques for ordinal data, the use of any code that preserves the order of the data will produce exactly the same result. Thus, it's not the magnitude of the values that is important, it's their order.

Students often have difficulty distinguishing between ordinal and interval data. The critical difference between them is that the intervals or differences between values of interval data are consistent and meaningful (which is why this type of data is called *interval*). For example, the difference between marks of 85 and 80 is the same five-mark difference that exists between 75 and 70—that is, we can calculate the difference and interpret the results.

Because the codes representing ordinal data are arbitrarily assigned except for the order, we cannot calculate and interpret differences. For example, using a 1-2-3-4-5 coding system to represent poor, fair, good, very good, and excellent, we note that the difference between excellent and very good is identical to the difference between good and fair. With a 6-18-23-45-88 coding, the difference between excellent and very good is 43, and the difference between good and fair is 5. Because both coding systems are valid, we cannot use either system to compute and interpret differences.

Here is another example. Suppose that you are given the following list of the most active stocks traded on the NASDAQ in descending order of magnitude:

Order	Most Active Stocks
1	Microsoft
2	Cisco Systems
3	Dell Computer
4	Sun Microsystems
5	JDS Uniphase

Does this information allow you to conclude that the difference between the number of stocks traded in Microsoft and Cisco Systems is the same as the difference in the number of stocks traded between Dell Computer and Sun Microsystems? The answer is “no” because we have information only about the order of the numbers of trades, which are ordinal, and not the numbers of trades themselves, which are interval. In other words, the difference between 1 and 2 is not necessarily the same as the difference between 3 and 4.

2-1a Calculations for Types of Data

Interval Data All calculations are permitted on interval data. We often describe a set of interval data by calculating the average. For example, the average of the 10 marks listed on page 13 is 70.3. As you will discover, there are several other important statistics that we will introduce.

Nominal Data Because the codes of nominal data are completely arbitrary, we cannot perform any calculations on these codes. To understand why, consider a survey that asks people to report their marital status. Suppose that the first 10 people surveyed gave the following responses:

Single, Married, Married, Married, Widowed,
Single, Married, Married, Single, Divorced

Using the codes

Single = 1, Married = 2, Divorced = 3, Widowed = 4

we would record these responses as

1 2 2 2 4 1 2 2 1 3

The average of these numerical codes is 2.0. Does this mean that the average person is married? Now suppose four more persons were interviewed, of whom three are widowed and one is divorced. The data are given here:

1 2 2 2 4 1 2 2 1 3 4 4 4 3

The average of these 14 codes is 2.5. Does this mean that the average person is married—but halfway to getting divorced? The answer to both questions is an emphatic “no.” This example illustrates a fundamental truth about nominal data: Calculations based on the codes used to store this type of data are meaningless. All that we are permitted to do with nominal data is count or compute the percentages of the occurrences of each category. Thus, we would describe the 14 observations by counting the number of each marital status category and reporting the frequency as shown in the following table.

Category	Code	Frequency
Single	1	3
Married	2	5
Divorced	3	2
Widowed	4	4

The remainder of this chapter deals with nominal data only. In Chapter 3, we introduce graphical techniques that are used to describe interval data.

Ordinal Data The most important aspect of ordinal data is the order of the values. As a result, the only permissible calculations are those involving a ranking process. For example, we can place all the data in order and select the code that lies in the middle. As we discuss in Chapter 4, this descriptive measurement is called the *median*.

2-1b Hierarchy of Data

The data types can be placed in order of the permissible calculations. At the top of the list, we place the interval data type because virtually *all* computations are allowed. The nominal data type is at the bottom because *no* calculations other than determining frequencies are permitted. (We are permitted to perform calculations using the frequencies of codes, but this differs from performing calculations on the codes themselves.) In between interval and nominal data lies the ordinal data type. Permissible calculations are ones that rank the data.

Higher-level data types may be treated as lower-level ones. For example, in universities and colleges, we convert the marks in a course, which are interval, to letter grades, which are ordinal. Some graduate courses feature only a pass or fail designation. In this case, the interval data are converted to nominal. It is important to point out that when we convert higher-level data as lower-level we lose information. For example, a mark of 89 on an accounting course exam gives far more information about the performance of that student than does a letter grade of B, which might be the letter grade for marks between 80 and 90. As a result, we do not convert data unless it is necessary to do so. We will discuss this later.

It is also important to note that we cannot treat lower-level data types as higher-level types.

The definitions and hierarchy are summarized in the following box.

Types of Data

Interval

Values are real numbers.

All calculations are valid.

Data may be treated as ordinal or nominal.

Ordinal

Values must represent the ranked order of the data.

Calculations based on an ordering process are valid.

Data may be treated as nominal but not as interval.

Nominal

Values are the arbitrary numbers that represent categories.
Only calculations based on the frequencies or percentages of occurrence are valid.
Data may not be treated as ordinal or interval.

2-1c Interval, Ordinal, and Nominal Variables

The variables whose observations constitute our data will be given the same name as the type of data. Thus, for example, interval data are the observations of an interval variable.

2-1d Problem Objectives and Information

In presenting the different types of data, we introduced a critical factor in deciding which statistical procedure to use. A second factor is the type of information we need to produce from our data. We discuss the different types of information in greater detail in Section 11-4 when we introduce *problem objectives*. However, in this part of the book (Chapters 2–5), we will use statistical techniques to describe a set of data, compare two or more sets of data, and describe the relationship between two variables. In Section 2-2, we introduce graphical and tabular techniques employed to describe a set of nominal data. Section 2-3 shows how to describe the relationship between two nominal variables and compare two or more sets of nominal data.



EXERCISES

- 2.1 Provide two examples each of nominal, ordinal, and interval data.
- 2.2 For each of the following examples of data, determine the type.
 - a. The number of miles joggers run per week
 - b. The starting salaries of graduates of MBA programs
 - c. The months in which a firm's employees choose to take their vacations
 - d. The final letter grades received by students in a statistics course
- 2.3 For each of the following examples of data, determine the type.
 - a. The weekly closing price of the stock of Amazon.com
 - b. The month of highest vacancy rate at a La Quinta motel
 - c. The size of soft drink (small, medium, or large) ordered by a sample of McDonald's customers
- 2.4 The placement office at a university regularly surveys the graduates 1 year after graduation and asks for the following information. For each, determine the type of data.
 - a. What is your occupation?
 - b. What is your income?
 - c. What degree did you obtain?
 - d. What is the amount of your student loan?
 - e. How would you rate the quality of instruction? (excellent, very good, good, fair, poor)
- 2.5 Residents of condominiums were recently surveyed and asked a series of questions. Identify the type of data for each question.
 - a. What is your age?
 - b. On what floor is your condominium?

- c. Do you own or rent?
 d. How large is your condominium (in square feet)?
 e. Does your condominium have a pool?
- 2.6** A sample of shoppers at a mall was asked the following questions. Identify the type of data each question would produce.
- What is your age?
 - How much did you spend?
 - What is your marital status?
 - Rate the availability of parking: excellent, good, fair, or poor
 - How many stores did you enter?
- 2.7** Information about a magazine's readers is of interest to both the publisher and the magazine's advertisers. A survey of readers asked respondents to complete the following:
- Age
 - Gender
 - Marital status
 - Number of magazine subscriptions
 - Annual income
 - Rate the quality of our magazine: excellent, good, fair, or poor
- For each item identify the resulting data type.
- 2.8** Baseball fans are regularly asked to offer their opinions about various aspects of the sport. A survey asked the following questions. Identify the type of data.
- How many games do you attend annually?
 - How would you rate the quality of entertainment? (excellent, very good, good, fair, poor)
 - Do you have season tickets?
 - How would you rate the quality of the food? (edible, barely edible, horrible)
- 2.9** A survey of golfers asked the following questions. Identify the type of data each question produces.
- How many rounds of golf do you play annually?
 - Are you a member of a private club?
 - What brand of clubs do you own?
- 2.10** At the end of the term, university and college students often complete questionnaires about their courses. Suppose that in one university, students were asked the following.
- Rate the course (highly relevant, relevant, irrelevant)
 - Rate the professor (very effective, effective, not too effective, not at all effective)
 - What was your midterm grade (A, B, C, D, F)?
- Determine the type of data each question produces.

2-2 / DESCRIBING A SET OF NOMINAL DATA

As we discussed in Section 2-1, the only allowable calculation on nominal data is to count the frequency or compute the percentage that each value of the variable represents. We can summarize the data in a table, which presents the categories and their counts, called a **frequency distribution**. A **relative frequency distribution** lists the categories and the proportion with which each occurs. We can use graphical techniques to present a picture of the data. There are two graphical methods we can use: the bar chart and the pie chart.

EXAMPLE 2.1

DATA
GSS2012*

Work Status in the GSS 2012 Survey

In Chapter 1, we briefly introduced the General Social Survey. In the 2012 survey respondents were asked the following.

"Last week were you working full-time, part-time, going to school, keeping house, or what?" The responses were

1. Working full-time
2. Working part-time
3. Temporarily not working
4. Unemployed, laid off
5. Retired
6. School

7. Keeping house
8. Other

The responses were recorded using the codes 1, 2, 3, 4, 5, 6, 7, and 8, respectively. The first 150 observations are listed here. The name of the variable is WRKSTAT, and the data are stored in the 25th column (column Y in Excel, column 25 in Minitab).

Construct a frequency and relative frequency distribution for these data and graphically summarize the data by producing a bar chart and a pie chart.

2	8	4	5	1	1	5	1	5	8	5	1	5	4	2
2	2	1	1	5	1	5	5	1	1	5	1	1	1	2
1	7	1	5	1	7	1	1	1	2	7	1	1	5	5
8	8	1	1	1	1	1	1	1	4	1	2	1	1	2
5	2	5	1	1	1	7	1	1	7	4	1	4	1	5
8	1	1	1	7	6	6	5	1	2	1	1	1	1	5
7	1	1	1	7	1	1	1	7	1	2	7	1	4	7
7	1	7	1	1	5	1	7	1	6	4	1	1	5	1
7	1	5	2	5	5	1	1	5	1	4	5	1	1	1
1	6	2	1	5	2	1	2	1	2	1	5	2	1	1

SOLUTION:

Scan the data. Have you learned anything about the responses of these 150 Americans? Unless you have special skills you have probably learned little about the numbers. If we had listed all 1,973 observations you would be even less likely to discover anything useful about the data. To extract useful information requires the application of a statistical or graphical technique. To choose the appropriate technique we must first identify the type of data. In this example the data are nominal because the numbers represent categories. The only calculation permitted on nominal data is to count the number of occurrences of each category. Hence, we count the number of 1s, 2s, 3s, 4s, 5s, 6s, 7s, and 8s. The list of the categories and their counts constitute the frequency distribution. The relative frequency distribution is produced by converting the frequencies into proportions. The frequency and relative frequency distributions are combined in Table 2.1.

TABLE 2.1 Frequency and Relative Frequency Distributions for Example 2.1

WORK STATUS	CODE	FREQUENCY	RELATIVE FREQUENCY (%)
Working full-time	1	912	46.2
Working part-time	2	226	11.5
Temporarily not working	3	40	2.0
Unemployed, laid off	4	104	5.3
Retired	5	357	18.1
School	6	70	3.5
Keeping house	7	210	10.6
Other	8	54	2.7
Total		1973	100

There was one individual who refused to answer hence the number of observations is the sample size 1,974 minus 1, which equals 1,973.

As we promised in Chapter 1 (and the preface), we demonstrate the solution of all examples in this book using three approaches (where feasible): manually, using Excel, and using Minitab. For Excel and Minitab, we provide not only the printout but also instructions to produce them.

EXCEL

INSTRUCTIONS

(Specific commands for this example are highlighted.)

1. Type or import the data into one or more columns. (Open GSS2012.)
2. Activate any empty cell and type

=COUNTIF ([Input range], [Criteria])

Input range are the cells containing the data. In this example, the range is Y1:Y1975. The criteria are the codes you want to count: (1) (2) (3) (4) (5) (6) (7) (8). To count the number of 1s (“Working full-time”), type

=COUNTIF (Y1:Y1975, 1)

and the frequency will appear in the dialog box. Change the criteria to produce the frequency of the other categories.

MINITAB

WRKSTAT	Count	Percent
1	912	46.22
2	226	11.45
3	40	2.03
4	104	5.27
5	357	18.09
6	70	3.55
7	210	10.64
8	54	2.74

N = 1973

* = 1

INSTRUCTIONS

(Specific commands for this example are highlighted.)

1. Type or import the data into one column. (Open GSS2012.)
2. Click **Stat**, **Tables**, and **Tally Individual Variables**.
3. Type or use the **Select** button to specify the name of the variable or the column where the data are stored in the **Variables** box (WRKSTAT). Under **Display**, click **Counts** and **Percents**.

INTERPRET

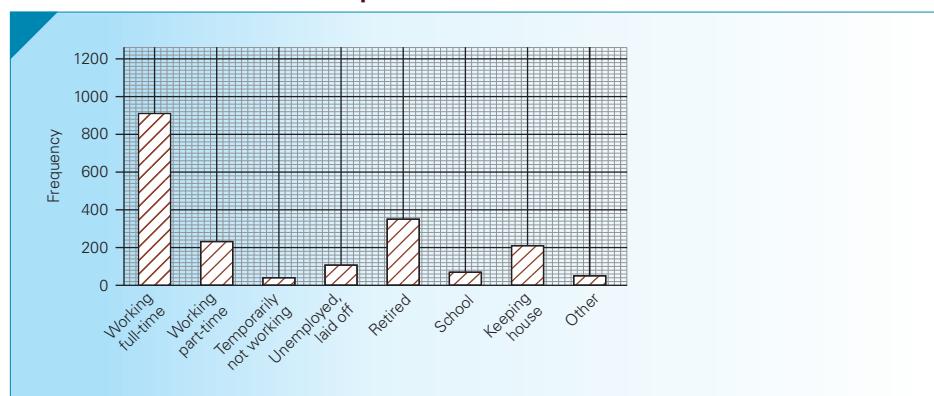
Only 46.2% of respondents are working full-time, 18.1% are retired, 10.6% are keeping house, 11.5% are working part-time, and the remaining 13.6% are divided almost equally among the other four categories.

Bar and Pie Charts

The information contained in the data is summarized well in the table. However, graphical techniques generally catch a reader's eye more quickly than does a table of numbers. Two graphical techniques can be used to display the results shown in the table. A **bar chart** is often used to display frequencies; a **pie chart** graphically shows relative frequencies.

The bar chart is created by drawing a rectangle representing each category. The height of the rectangle represents the frequency. The base is arbitrary. Figure 2.1 depicts the manually drawn bar chart for Example 2.1.

FIGURE 2.1 Bar Chart for Example 2.1



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If we wish to emphasize the relative frequencies instead of drawing the bar chart, we draw a pie chart. A pie chart is simply a circle subdivided into slices that represent the categories. It is drawn so that the size of each slice is proportional to the percentage corresponding to that category. For example, because the entire circle is composed of 360 degrees, a category that contains 25% of the observations is represented by a slice of the pie that contains 25% of 360 degrees, which is equal to 90 degrees. The number of degrees for each category in Example 2.1 is shown in Table 2.2.

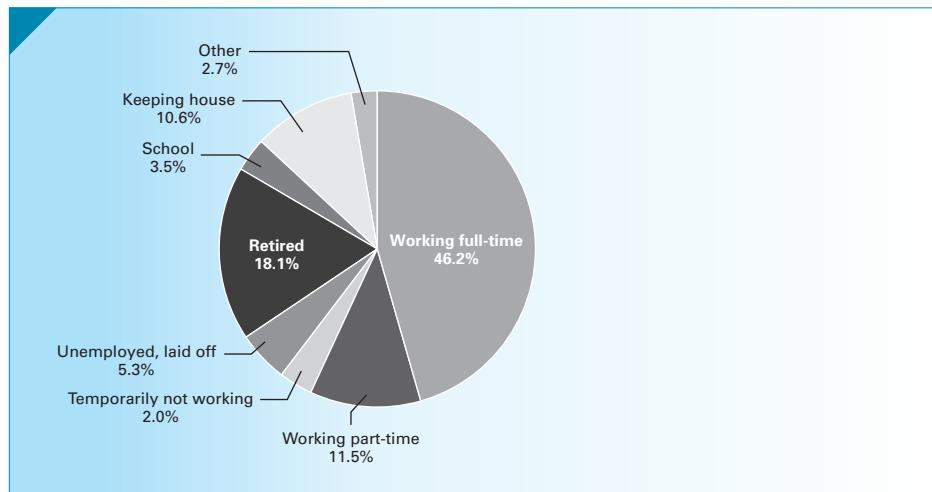
TABLE 2.2 Proportion in Each Category in Example 2.1

WORK STATUS	RELATIVE FREQUENCY (%)	SLICE OF THE PIE (°)
Working full-time	46.2	166.4
Working part-time	11.5	41.2
Temporarily not working	2.0	7.3
Unemployed, laid off	5.3	19.0
Retired	18.1	65.1
School	3.5	12.8
Keeping house	10.6	38.3
Other	2.7	9.9
Total	100.0	360

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Figure 2.2 was drawn from these results.

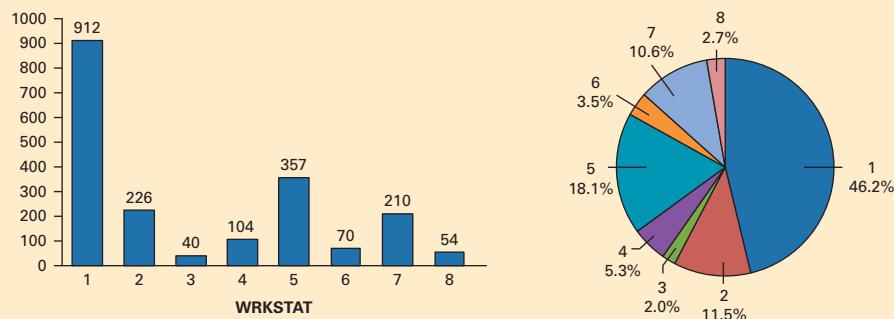
FIGURE 2.2 Pie Chart for Example 2.1



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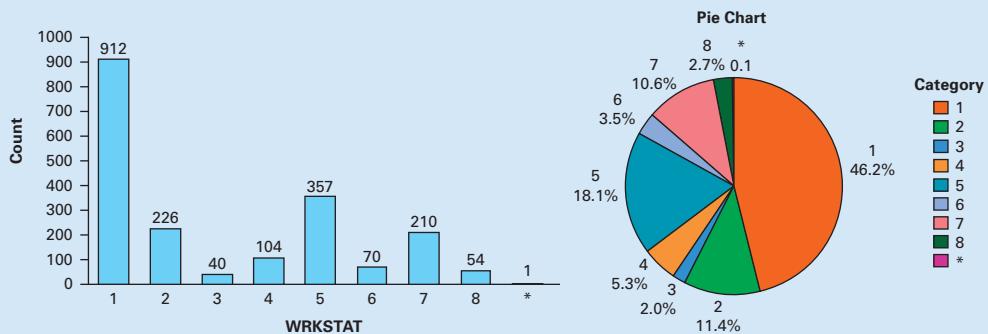
EXCEL

Here are Excel's bar and pie charts.



INSTRUCTIONS

1. After creating the frequency distribution, highlight the column of frequencies.
2. For a bar chart, click **Insert**, **Column**, and the first **2-D Column**.
3. Click **Chart Tools** (if it does not appear, click inside the box containing the bar chart) and **Layout**. This will allow you to make changes to the chart. We removed the **Gridlines**, the **Legend**, and clicked the **Data Labels** to create the titles.
4. For a pie chart, click **Pie** and **Chart Tools** to edit the graph.

MINITAB**INSTRUCTIONS**

1. Type or import the data into one column. (Open GSS2012.)

For a bar chart:

2. Click **Graph** and **Bar Chart**.
3. In the **Bars represent** box, click **Counts of unique values** and select **Simple**.
4. Type or use the **Select** button to specify the variable in the **Variables** box (**WRKSTAT**). We clicked **Labels** and added the title and clicked **Data Labels** and **Use y-value labels** to display the frequencies at the top of the columns.

For a pie chart:

2. Click **Graph** and **Pie Chart**.
3. Click **Chart**, **Counts of unique values**, and in the **Categorical variables** box type or use the **Select** button to specify the variable (**WRKSTAT**).

We clicked **Labels** and added the title. We clicked **Slice Labels** and clicked **Category name** and **Percent**.

INTERPRET

The bar chart focuses on the frequencies and the pie chart focuses on the proportions.

2-2a Other Applications of Pie Charts and Bar Charts

Pie and bar charts are used widely in newspapers, magazines, and business and government reports. One reason for this appeal is that they are eye-catching and can attract the reader's interest whereas a table of numbers might not. Perhaps no one understands this better than the newspaper *USA Today*, which typically has a colored graph on the front page and others inside. Pie and bar charts are frequently used to simply present numbers associated with categories. The only reason to use a bar or pie chart in such a situation would be to enhance the reader's ability to grasp the substance of the data. It might, for example, allow the reader to more quickly recognize the relative sizes of the categories, as in the breakdown of a budget. Similarly, treasurers might use pie charts to show the breakdown of a firm's revenues by department, or university students might

use pie charts to show the amount of time devoted to daily activities (e.g., eat 10%, sleep 30%, and study statistics 60%).

APPLICATIONS in ECONOMICS

Macroeconomics

Macroeconomics is a major branch of economics that deals with the behavior of the economy as a whole. Macroeconomists develop mathematical models that predict variables such as gross domestic product, unemployment rates, and inflation. These are used by governments and corporations to help develop strategies. For example, central banks attempt to control inflation by lowering or raising interest rates. To do this requires that economists determine the effect of a variety of variables, including the supply and demand for energy.

APPLICATIONS in ECONOMICS

Energy Economics

One variable that has had a large influence on the economies of virtually every country is energy. The 1973 oil crisis in which the price of oil quadrupled over a short period of time is generally considered to be one of the largest financial shocks to our economy. In fact, economists often refer to two different economies: before the 1973 oil crisis and after.

Unfortunately, the world will be facing more shocks to our economy because of energy for two primary reasons. The first is the depletion of nonrenewable sources of energy and the resulting price increases. The second is the possibility that burning fossil fuels and the creation of carbon dioxide may be the cause of global warming. One economist predicted that the cost of global warming will be calculated in the trillions of dollars. Statistics can play an important role by determining whether Earth's temperature has been increasing and, if so, whether carbon dioxide is the cause. (See Case 3.1.)

In this chapter, you will encounter other examples and exercises that involve the issue of energy.

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EXAMPLE 2.2

DATA
Xm02-02

Energy Consumption in the United States in 2012

Table 2.3 lists the total energy consumption of the United States from all sources in 2012 (latest data available at publication). To make it easier to see the details, the table measures the energy in quadrillions of British thermal units (BTUs). Use an appropriate graphical technique to depict these figures.

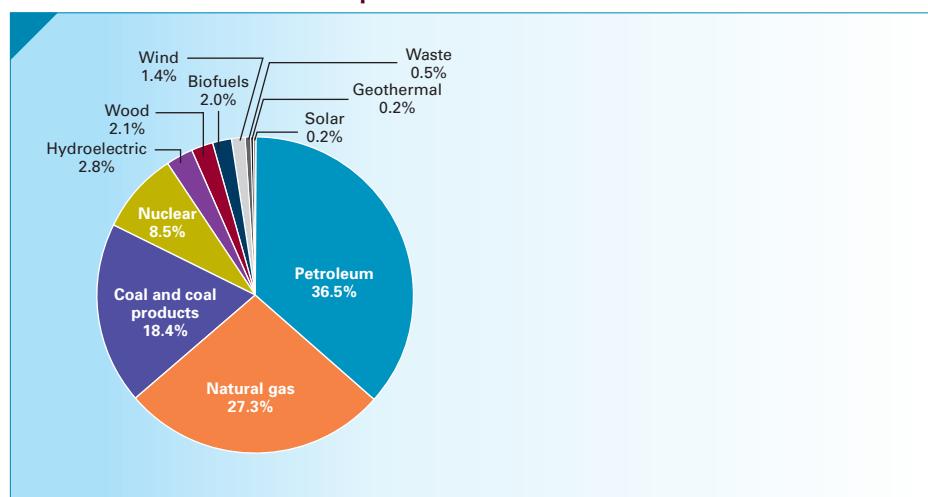
TABLE 2.3 Energy Consumption in the United States by Source, 2012

ENERGY SOURCES	QUADRILLIONS OF BTUs
Nonrenewable	
Petroleum	34.688
Natural gas	25.954
Coal and coal products	17.434
Nuclear	8.050
Renewable Energy Sources	
Hydroelectric	2.687
Wood derived fuels	1.985
Biofuels	1.909
Waste	0.471
Geothermal	0.227
Wind	1.361
Solar/photovoltaic	0.212
Total	94.978

Source: U.S. Energy Administration.

SOLUTION:

We're interested in describing the proportion of total energy consumption for each source. Thus, the appropriate technique is the pie chart. The next step is to determine the proportions and sizes of the pie slices from which the pie chart is drawn. The following pie chart was created by Excel. Minitab's would be similar.

FIGURE 2.3 Pie Chart for Example 2.2

INTERPRET

The United States depends heavily on petroleum, coal, and natural gas. More than 80% of national energy use is based on these sources. The renewable energy sources amount to less than 9%, of which about a third is hydroelectric and probably cannot be expanded much further. Wind and solar barely appear in the chart.

See Exercises 2.11 to 2.15 for more information on the subject.

EXAMPLE 2.3**DATA****Xm02-03****Per Capita Beer Consumption (10 Selected Countries)**

Table 2.4 lists the per capita beer consumption for each of 20 countries around the world. Graphically present these numbers.

TABLE 2.4 Per Capita Beer Consumption, 2012

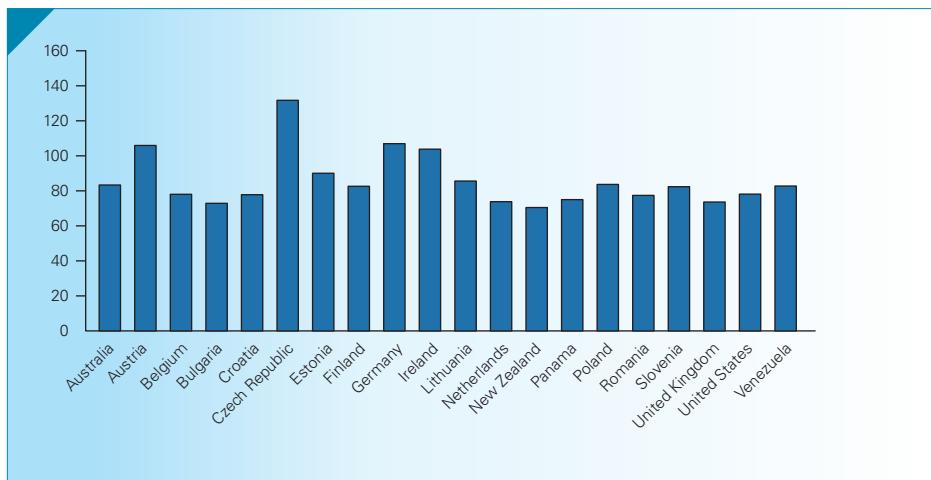
COUNTRY	BEER CONSUMPTION (L/YR)
Australia	83.4
Austria	105.8
Belgium	78.0
Bulgaria	72.8
Croatia	77.8
Czech Republic	131.7
Estonia	90.6
Finland	82.7
Germany	106.8
Ireland	103.7
Lithuania	85.7
Netherlands	73.9
New Zealand	70.5
Panama	75.0
Poland	83.6
Romania	77.4
Slovenia	82.7
United Kingdom	73.7
United States	78.2
Venezuela	83.0

Source: www.beerinfo.com.

SOLUTION:

In this example, we're primarily interested in the numbers. There is no use in presenting proportions here.

The following is Excel's bar chart.

FIGURE 2.4 EXCEL Bar Chart for Example 2.3

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INTERPRET

Germany, the Czech Republic, Ireland, Australia, and Austria head the list. Both the United States and United Kingdom rank far lower. Surprised?

2-2b Describing Ordinal Data

There are no specific graphical techniques for ordinal data. Consequently, when we wish to describe a set of ordinal data, we will treat the data as if they were nominal and use the techniques described in this section. The only criterion is that the bars in bar charts should be arranged in ascending (or descending) ordinal values; in pie charts, the wedges are typically arranged clockwise in ascending or descending order.

We complete this section by describing when bar and pie charts are used to summarize and present data.

Factors That Identify When to Use Frequency and Relative Frequency Tables, Bar and Pie Charts

1. **Objective:** Describe a single set of data.
2. **Data type:** Nominal or ordinal

**EXERCISES**

- 2.11 Xr02-11** When will the world run out of oil? One way to judge is to determine the oil reserves of the countries around the world. The next table displays the known oil reserves of the top 15 countries. Graphically describe the figures.

Country	Oil Reserves
Brazil	12,860,000,000
Canada	175,200,000,000
China	14,800,000,000
Iran	137,000,000,000

(Continued)

Country	Oil Reserves
Iraq	115,000,000,000
Kazakhstan	30,000,000,000
Kuwait	104,000,000,000
Libya	46,420,000,000
Nigeria	37,200,000,000
Qatar	25,380,000,000
Russia	60,000,000,000
Saudi Arabia	262,600,000,000
United Arab Emirates	97,800,000,000
United States	20,680,000,000
Venezuela	211,200,000,000

Source: CIA World Factbook 2012.

- 2.12 Refer to Exercise 2.11. The total reserves in the world are 1,481,526,000,000 barrels. The total reserves of the top 15 countries are 1,350,140,000,000 barrels. Use a graphical technique that emphasizes the percentage breakdown of the top 15 countries plus others.
- 2.13 **Xr02-13** The following table lists the average oil consumption per day for the top 15 oil-consuming countries. Use a graphical technique to present these figures.

Country	Consumption (barrels per day)
Brazil	2,029,000
Canada	2,209,000
China	9,400,000
France	1,861,000
Germany	2,495,000
India	3,182,000
Iran	1,845,000
Italy	1,528,000
Japan	4,452,000
Mexico	2,073,000
Russia	2,199,000
Saudi Arabia	2,643,000
South Korea	2,195,000
United Kingdom	1,622,000
United States	19,150,000

Source: CIA World Factbook 2012.

- 2.14 **Xr02-14** There are 42 gallons in a barrel of oil. The number of products produced and the proportion of the total are listed in the following table. Draw a graph to depict these numbers.

Product	Percent of Total
Gasoline	51.4
Distillate fuel oil	15.3
Jet fuel	12.6

Still gas	5.4
Marketable coke	5.0
Residual fuel oil	3.3
Liquefied refinery gas	2.8
Asphalt and road oil	1.9
Lubricants	0.9
Other	1.5

Source: California Energy Commission, based on 2004 data.

- 2.15 **Xr02-15*** The following table displays the energy consumption pattern of Australia. The figures measure the heat content in metric tons (1,000 kilograms) of oil equivalent. Draw a graph that depicts these numbers.

Energy Sources	Heat Content
Nonrenewable	
Coal and coal products	55,385
Oil	33,185
Natural gas	20,350
Nuclear	0
Renewable	
Hydroelectric	1,388
Solid biomass	4,741
Other (liquid biomass, geothermal, solar, wind, and tide, wave, and ocean)	347
Total	115,396

Source: International Energy Association.

- 2.16 **Xr02-16** The planet may be threatened by global warming, possibly caused by burning fossil fuels (petroleum, natural gas, and coal) that produces carbon dioxide (CO_2). The following table lists the top 15 producers of CO_2 and the annual amounts (million of metric tons) from fossil fuels. Graphically depict these figures.

Country	CO_2
Australia	417.7
Canada	541.0
China	7706.8
Germany	765.6
India	1591.1
Iran	528.6
Italy	407.9
Japan	1098.0
Korea, South	528.1
Mexico	443.6
Russia	1556.7
Saudi Arabia	438.2
South Africa	451.2
United Kingdom	519.9
United States	5424.5

Source: Statistical Abstract of the United States, 2012, Table 1389.

- 2.17 Xr02-17** The production of steel has often been used as a measure of the economic strength of a country. The following table lists the steel production in the 20 largest steel-producing nations in 2011. The units are millions of metric tons. Use a graphical technique to display these figures.

Country	Steel Production	Country	Steel Production
Australia	6.4	Mexico	18.1
Austria	7.5	Netherlands	6.9
Belgium	8.1	Poland	8.8
Brazil	35.2	Russia	68.7
Canada	13.1	South Africa	6.7
China	683.3	South Korea	68.5
Egypt	6.5	Spain	15.6
France	15.8	Taiwan	22.7
Germany	44.3	Turkey	34.1
India	72.2	Ukraine	35.3
Iran	13	United Kingdom	9.5
Italy	28.7	United States	86.2

Source: World Steel Association, 2011.

- 2.18 Xr02-18** In 2009 (latest figures available), the United States generated 243.0 million tons of garbage. The following table lists the amounts by source. Use one or more graphical techniques to present these figures.

Source	Amount (millions of tons)
Paper and paperboard	68.4
Glass	11.8
Metals	20.9
Plastics	29.8
Food scraps	34.3
Yard trimmings	33.2
Other	44.6

Source: Statistical Abstract of the United States, 2012, Table 378.

- 2.19 Xr02-19** In the past five years, the city of Toronto has intensified its efforts to reduce the amount of garbage that is taken to landfill sites. (Currently, the Greater Toronto Area (GTA) disposes of its garbage in a dump site in Michigan.) An analysis of current GTA reveals that 36% of waste collected in the GTA is taken from residences and 64% from businesses and public institutions (hospitals, schools, universities, etc.) A further breakdown is listed here.

- Draw a pie chart for residential waste including both recycled and disposed waste.
- Repeat Part a for nonresidential waste.

Residential

Recycled	Pct	Disposed	Pct
Recycled Plastic	1%	Plastic	7%
Recycled Glass	3%	Paper	12%
Recycled Paper	14%	Metal	2%
Recycled Metal	1%	Organic	23%
Recycled Organic/Food	7%	Other	17%
Recycled Organic/Yard	10%		
Recycled Other	4%		

Non-Residential

Recycled	Pct	Disposed	Pct
Recycled Glass	1%	Plastic	10%
Recycled Paper	11%	Glass	3%
Recycled Metal	3%	Paper	31%
Recycled Organic	1%	Metal	8%
Recycled Construction/ Demolition		Organic	18%
Recycled Other	1%	Construction/ Demolition	7%
		Other	6%

Source: Toronto City Summit Alliance.

- 2.20 Xr02-20** The following table lists the top 10 countries and amounts of oil (millions of barrels annually) they exported to the United States in 2010.

Country	Oil Imports (millions of barrels annually)
Algeria	119
Angola	139
Canada	720
Colombia	124
Iraq	151
Kuwait	71
Mexico	416
Nigeria	360
Saudi Arabia	394
Venezuela	333

Source: Statistical Abstract of the United States, 2012, Table 937.

- Draw a bar chart
 - Draw a pie chart.
 - What information is conveyed by each chart?
- 2.21** The following table lists the percentage of males and females in five age groups that did not have health insurance in the United States in September 2008. Use a graphical technique to present these figures.

Age Group	Male	Female
Under 18	8.5	8.5
18–24	32.3	24.9
25–34	30.4	21.4
35–44	21.3	17.1
45–64	13.5	13.0

Source: National Health Interview Survey.

- 2.22** The following table lists the average costs for a family of four to watch a game at an National Football League (NFL) stadium compared to a Canadian Football League (CFL) stadium. Use a graphical technique that allows the reader to compare each of the components of the total cost.

	NFL	CFL
Four tickets	274.12	171.16
Parking	19.75	10.85
Two ball caps	31.12	44.26
Two beers	11.9	11.24
Two drinks	7.04	7.28
Four hot dogs	15	16.12

Source: Team Market Report, Matthew Coutts.

- 2.23** **Xr02-23** Productivity growth is critical to the economic well-being of companies and countries. In the following table, we list the average annual growth rate (percentage) in productivity for the Organization for Economic Co-Operation and Development (OECD) countries. Use a graphical technique to present these figures.

Country	Productivity Growth	Country	Productivity Growth
Australia	1.6	Japan	2.775
Austria	1.5	Korea	5.55
Belgium	1.975	Luxembourg	2.6
Canada	1.25	Mexico	1.2
Czech Republic	3.3	Netherlands	2
Denmark	2.175	New Zealand	1.5
Finland	2.775	Norway	2.575
France	2.35	Portugal	2.8
Germany	2.3	Slovak Republic	4.8
Greece	1.6	Spain	2
Hungary	3.6	Sweden	1.775
Iceland	0.775	Switzerland	1.033
Ireland	3.775	United Kingdom	2.2
Italy	1.525	United States	1.525

Source: OECD Labor Productivity Database, July 2007.

The following exercises require a computer and software.

- 2.24** **Xr02-24** In an attempt to stimulate the economy in 2008, the U.S. government issued rebate checks totaling \$107 billion. A survey conducted by the

National Retail Federation (NRF) asked recipients what they intended to do with their rebates. The choices include:

1. Buy something
2. Pay down debt
3. Invest
4. Pay medical bills
5. Save
6. Other

Use graphical technique to summarize and present these data.

- 2.25** **Xr02-25** Refer to Exercise 2.24. Those who responded that they planned to buy something were asked what they intended to buy. Here is a list of their responses:

1. Home improvement project
2. Purchase appliances
3. Purchase automobiles
4. Purchase clothing
5. Purchase electronics
6. Purchase furniture
7. Purchase gas
8. Spa or salon time
9. Purchase groceries
10. Purchase vacation
11. Impulse purchase
12. Down payment on house

Graphically summarize these data.

- 2.26** **Xr02-26** What are the most important characteristics of colleges and universities? This question was asked of a sample of college-bound high school seniors. The responses included:

1. Location
2. Majors
3. Academic reputation
4. Career focus
5. Community
6. Number of students.

The results are stored using the codes. Use a graphical technique to summarize and present the data.

- 2.27** **Xr02-27** Where do consumers get information about cars? A sample of recent car buyers was asked to identify the most useful source of information about the cars they purchased. The responses include:

1. Consumer guide
2. Dealership
3. Word of mouth
4. Internet

The responses were stored using the codes. Graphically depict the responses.

Source: Automotive Retailing Today, The Gallup Organization.

- 2.28 **Xr02-28** A survey asked 392 homeowners which area of the home they would most like to renovate. The responses and frequencies are shown here. Use a graphical technique to present these results. Briefly summarize your findings.

Area	Code
Basement	1
Bathroom	2
Bedroom	3
Kitchen	4
Living/dining room	5

- 2.29 **Xr02-29** Subway train riders frequently pass the time by reading a newspaper. New York City has a subway and four newspapers. A sample of 360 subway riders who regularly read a newspaper were asked to identify that newspaper. The responses included:

1. *New York Daily News*
2. *New York Post*
3. *New York Times*
4. *Wall Street Journal*

The responses were recorded using the numerical codes shown.

- a. Produce a frequency distribution and a relative frequency distribution
- b. Draw an appropriate graph to summarize the data. What does the graph tell you?

- 2.30 **Xr02-30** Who applies to MBA programs? To help determine the background of the applicants, a sample of 230 applicants to a university's business school were asked to report their undergraduate degree. The degrees were recorded using the following codes:

1. BA
2. BBA
3. BEng
4. BSc
5. Other

- a. Determine the frequency distribution
- b. Draw a bar chart
- c. Draw a pie chart
- d. What do the charts tell you about the sample of MBA applicants?

- 2.31 **Xr02-31** Many business and economics courses require the use of computer, so students often must

buy their own computers. A survey asks students to identify which computer brand they have purchased. The responses include:

1. IBM
 2. Compaq
 3. Dell
 4. Other
- a. Use a graphical technique that depicts the frequencies
 - b. Graphically depict the proportions
 - c. What do the charts tell you about the brands of computers used by the students?

- 2.32 **Xr02-32** An increasing number of statistics courses use a computer and software rather than manual calculations. A survey of statistics instructors asked each to report the software his or her course uses. The responses included:

1. Excel
 2. Minitab
 3. SAS
 4. SPSS
 5. Other
- a. Produce a frequency distribution
 - b. Graphically summarize the data so that the proportions are depicted
 - c. What do the charts tell you about the software choices?

- 2.33 **Xr02-33*** The total light beer sales in the United States is approximately three million gallons annually. With this large a market, breweries often need to know more about who is buying their product. The marketing manager of a major brewery wanted to analyze the light beer sales among college and university students who do drink light beer. A random sample of 285 graduating students was asked to report which of the following was their favorite light beer:

1. Bud Light
2. Busch Light
3. Coors Light
4. Michelob Light
5. Miller Lite
6. Natural Light
7. Other brands

The responses were recorded using the codes 1, 2, 3, 4, 5, 6, and 7, respectively. Use a graphical to summarize these data. What can you conclude from the chart?



GENERAL SOCIAL SURVEY EXERCISES

See page 7 in Chapter 1 for a description of the General Social Survey. Exercises 2.34 to 2.37 are based on the General Social Survey conducted in 2012.

- 2.34 **GSS2012*** What race do you consider yourself (RACE)?

1. White
2. Black
3. Other

Summarize the results using an appropriate graphical technique and interpret your findings.

- 2.35 **GSS2012*** Indicate your highest degree completed (DEGREE).

0. Left high school
1. Completed high school
2. Completed junior college
3. Completed bachelor's degree
4. Completed graduate degree

Use a graphical technique to summarize the data. Describe what the graph tells you.

- 2.35 **GSS2012*** What is your marital status (MARITAL)?

1. Married
2. Widowed
3. Divorced
4. Separated
5. Never Married

- a. Create a frequency distribution

- b. Use a method to present these data and briefly explain what the graph reveals.

- 2.37 **GSS2012*** To which class do you belong (CLASS)?

1. Lower class
2. Working class
3. Middle class
4. Upper class

Summarize the data using a graphical method and describe your findings.

Exercises 2.38 and 2.39 are based on the General Social Survey of 2010

- 2.38 **GSS2010*** What race do you consider yourself (RACE)?

1. White
2. Black
3. Other

Summarize the results using an appropriate graphical technique and interpret your findings.

- 2.39 **GSS2010*** Indicate your highest degree completed (DEGREE).

0. Left high school
1. Completed high school
2. Completed junior college
3. Completed bachelor's degree
4. Completed graduate degree

Use a graphical technique to summarize the data. Describe what the graph tells you.

2-3 / DESCRIBING THE RELATIONSHIP BETWEEN TWO NOMINAL VARIABLES AND COMPARING TWO OR MORE NOMINAL DATA SETS

In Section 2-2, we presented graphical and tabular techniques used to summarize a set of nominal data. Techniques applied to single sets of data are called **univariate**. There are many situations where we wish to depict the relationship between variables; in such cases, **bivariate** methods are required. A **cross-classification table** (also called a **cross-tabulation table**) is used to describe the relationship between two nominal variables. A variation of the bar chart introduced in Section 2-2 is employed to graphically describe the relationship. The same technique is used to compare two or more sets of nominal data.

2-3a Tabular Method of Describing the Relationship between Two Nominal Variables

To describe the relationship between two nominal variables, we must remember that we are permitted only to determine the frequency of the values. As a first step, we need to produce a cross-classification table that lists the frequency of each combination of the values of the two variables.

EXAMPLE 2.4

DATA
Xm02-04

Newspaper Readership Survey

A major North American city has four competing newspapers: the *Globe and Mail* (*G&M*), *Post*, *Star*, and *Sun*. To help design advertising campaigns, the advertising managers of the newspapers need to know which segments of the newspaper market are reading their papers. A survey was conducted to analyze the relationship between newspapers read and occupation. A sample of newspaper readers was asked to report which newspaper they read—*Globe and Mail* (1), *Post* (2), *Star* (3), *Sun* (4)—and indicate whether they were blue-collar workers (1), white-collar workers (2), or professionals (3). Some of the data are listed here.

Reader	Occupation	Newspaper
1	2	2
2	1	4
3	2	1
:	:	:
352	3	2
353	1	3
354	2	3

Determine whether the two nominal variables are related.

SOLUTION:

By counting the number of times each of the 12 combinations occurs, we produced the Table 2.5.

TABLE 2.5 Cross-Classification Table of Frequencies for Example 2.4

OCCUPATION	NEWSPAPER				
	G&M	POST	STAR	SUN	TOTAL
Blue collar	27	18	38	37	120
White collar	29	43	21	15	108
Professional	33	51	22	20	126
Total	89	112	81	72	354

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If occupation and newspaper are related, there will be differences in the newspapers read among the occupations. An easy way to see this is to convert the frequencies in each row (or column) to relative frequencies in each row (or column). That is, compute the row (or column) totals and divide each frequency by its row (or column) total, as shown in Table 2.6. Totals may not equal 1 because of rounding.

TABLE 2.6 Row Relative Frequencies for Example 2.4

OCCUPATION	NEWSPAPER				TOTAL
	G&M	POST	STAR	SUN	
Blue collar	.23	.15	.32	.31	1.00
White collar	.27	.40	.19	.14	1.00
Professional	.26	.40	.17	.16	1.00
Total	.25	.32	.23	.20	1.00

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EXCEL

Excel can produce the cross-classification table using several methods. We will use and describe the PivotTable in two ways: (1) to create the cross-classification table featuring the counts and (2) to produce a table showing the row relative frequencies.

Count of Reader	Newspaper				
Occupation	G&M	Post	Star	Sun	Grand Total
Blue collar	27	18	38	37	120
White collar	29	43	21	15	108
Professional	33	51	22	20	126
Grand Total	89	112	81	72	354

Count of Reader	Newspaper				
Occupation	G&M	Post	Star	Sun	Grand Total
Blue collar	0.23	0.15	0.32	0.31	1.00
White collar	0.27	0.40	0.19	0.14	1.00
Professional	0.26	0.40	0.17	0.16	1.00
Grand Total	0.25	0.32	0.23	0.20	1.00

INSTRUCTIONS

The data must be stored in (at least) three columns as we have done in Xm02-04. Put the cursor somewhere in the data range.

1. Click **Insert** and **PivotTable**.
2. Make sure that the Table/Range is correct.
3. Drag the Occupation button to the **ROW** section of the box. Drag the Newspaper button to the **COLUMN** section. Drag the Reader button to the **DATA** field. Right-click any number in the table, click **Summarize Data By**, and check **Count**. To convert to row percentages, right-click any number, click **Summarize Data By**, **More options . . .**, and **Show values as**. Scroll down and click **% of rows**. (We then formatted the data into decimals.) To improve both tables, we substituted the names of the occupations and newspapers.

MINITAB

Tabulated statistics: Occupation, Newspaper

		Columns: Newspaper				
		1	2	3	4	All
1		27	18	38	37	120
		22.50	15.00	31.67	30.83	100.00
2		29	43	21	15	108
		26.85	39.81	19.44	13.89	100.00
3		33	51	22	20	126
		26.19	40.48	17.46	15.87	100.00
All		89	112	81	72	354
		25.14	31.64	22.88	20.34	100.00

Cell Contents: Count
% of Row

INSTRUCTIONS

1. Type or import the data into two columns. (Open [xM02-04](#))
2. Click **Stat**, **Tables**, and **Cross Tabulation and Chi-square**.
3. Type or use the **Select** button to specify the **Categorical variables: For rows** (**Occupation**) and **For columns** (**Newspaper**)
4. Under **Display**, click **Counts** and **Row percents** (or any you wish)

INTERPRET

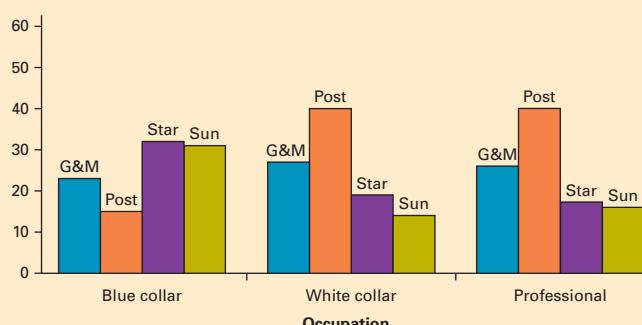
Notice that the relative frequencies in the second and third rows are similar and that there are large differences between row 1 and rows 2 and 3. This tells us that blue-collar workers tend to read different newspapers from both white-collar workers and professionals and that white-collar workers and professionals are quite similar in their newspaper choices.

Graphing the Relationship between Two Nominal Variables

We have chosen to draw three bar charts, one for each occupation depicting the four newspapers. We'll use Excel and Minitab for this purpose. The manually drawn charts are identical.

EXCEL

There are several ways to graphically display the relationship between two nominal variables. We have chosen two dimensional bar charts for each of the three occupations. The charts can be created from the output of the PivotTable (either counts as we have done) or row proportions.

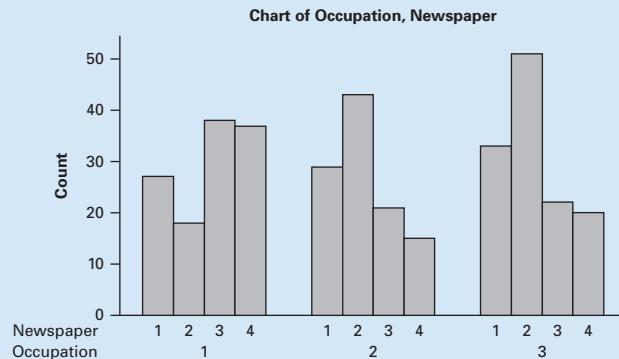


INSTRUCTIONS

From the cross-classification table, click **Insert** and **Column**. You can do the same from any completed cross-classification table.

MINITAB

Minitab can draw bar charts from the raw data.

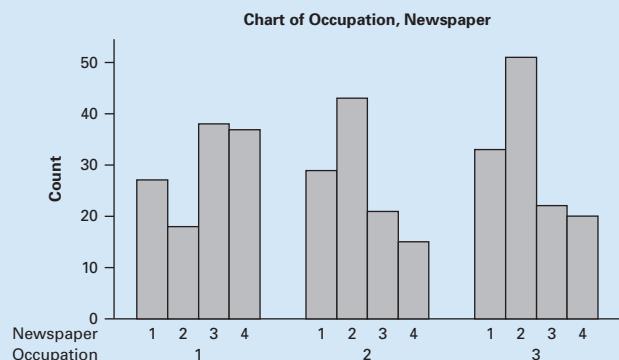
**INSTRUCTIONS**

1. Click **Graph** and **Bar Chart**.
2. In the **Bars represent** box, specify **Counts of unique values**. Select **Cluster**.
3. In the **Categorical variables** box, type or select the two variables (**Newspaper Occupation**).

If you or someone else has created the cross-classification table, Minitab can draw bar charts directly from the table.

INSTRUCTIONS

1. Start with a completed cross-classification table such as Table 2.9.
2. Click **Graph** and **Bar Chart**
3. In the **Bars represent** box click **Values from a table**. Choose **Two-way table Cluster**.
4. In the **Graph variables** box, **Select** the columns of numbers in the table. In the **Row labels** box, **Select** the column with the categories.



INTERPRET

If the two variables are unrelated, then the patterns exhibited in the bar charts should be approximately the same. If some relationship exists, then some bar charts will differ from others.

The graphs tell us the same story as did the table. The shapes of the bar charts for occupations 2 and 3 (white collar and professional) are very similar. Both differ considerably from the bar chart for occupation 1 (blue collar).

2-3b Comparing Two or More Sets of Nominal Data

We can interpret the results of the cross-classification table of the bar charts in a different way. In Example 2.4, we can consider the three occupations as defining three different populations. If differences exist between the columns of the frequency distributions (or between the bar charts), then we can conclude that differences exist among the three populations. Alternatively, we can consider the readership of the four newspapers as four different populations. If differences exist among the frequencies or the bar charts, then we conclude that there are differences between the four populations.

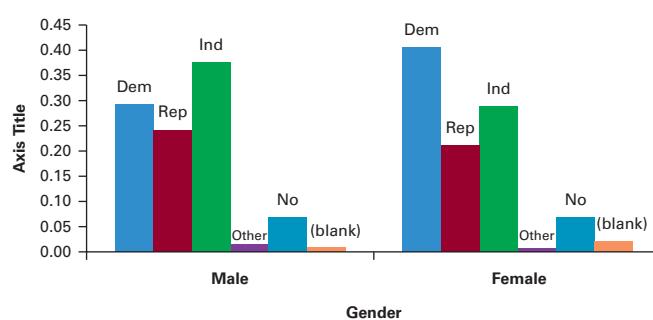
Do Male and Female American Voters Differ in Their Party Affiliation?

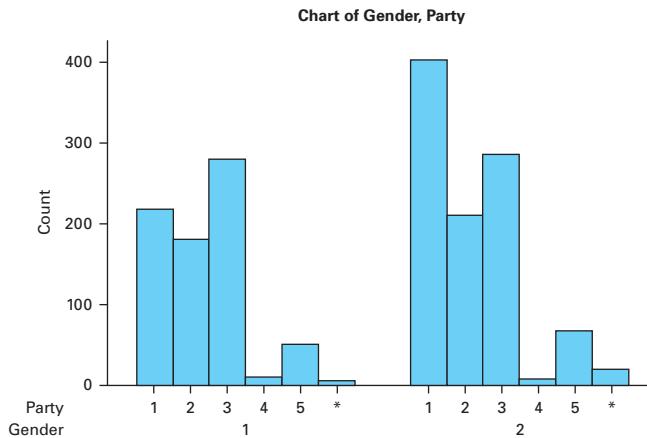
Data
ANES2008*

Using the technique introduced above, we produced the following bar charts.



Daniel Sofer / Photos.com

EXCEL

MINITAB**INTERPRET**

As you can see, there are substantial differences between the bar charts for men and women. We can conclude that gender and party affiliation are related. However, we can also conclude that differences in party affiliation exist between American male and female voters: Specifically, men tend to identify themselves as independents, whereas women support the Democratic party.

Historically, women tend to be Democrats, and men lean toward the Republican party. However, in this survey, both genders support the Democrats over the Republicans, which explains the results of the 2008 election.

2-3c Data Formats

There are several ways to store the data to be used in this section to produce a table or a bar or pie chart.

- 1.** The data are in two columns. The first column represents the categories of the first nominal variable, and the second column stores the categories for the second variable. Each row represents one observation of the two variables. The number of observations in each column must be the same. Excel and Minitab can produce a cross-classification table from these data. (To use Excel's PivotTable, there also must be a third variable representing the observation number.) This is the way the data for Example 2.4 were stored.
- 2.** The data are stored in two or more columns, with each column representing the same variable in a different sample or population. For example, the variable may be the type of undergraduate degree of applicants to an MBA program, and there may be five universities we wish to compare. To produce a cross-classification table, we would have to count the number of observations of each category (undergraduate degree) in each column.
- 3.** The table representing counts in a cross-classification table may have already been created.

We complete this section with the factors that identify the use of the techniques introduced here.

Factors That Identify When to Use a Cross-Classification Table

1. **Objective:** Describe the relationship between two variables and compare two or more sets of data.
2. **Data type:** Nominal



EXERCISES

- 2.40** **Xr02-40** Has the educational level of adults changed over the past two decades? To help answer this question, the Bureau of Labor Statistics compiled the following table, which lists the number (1,000) of adults 25 years of age and older who are employed. Use a graphical technique to present these figures. Briefly describe what the chart tells you.

	1995	2000	2005	2010
Less than high school	12,021	12,483	12,679	11,880
High school	36,746	37,750	38,196	38,236
Some college	30,908	33,198	34,974	36,840
College graduate	31,176	36,630	41,180	45,998

Source: *Statistical Abstract of the United States*, 2012, Table 593.

- 2.41** **Xr02-41** How do governments spend the tax dollars they collect, and has this changed over the past decade? The following table displays state and local government expenditures for public works in years 1995, 2000, 2005, and 2008 (latest year available) in millions of dollars. Use a graphical technique to present these figures. Have the ways state and local governments spend money changed over the decade?

	1995	2000	2005	2008
Highways	77,109	101,336	124,602	153,515
Air transportation	8,397	13,160	17,962	21,264
Port facilities	2,309	3,141	3,896	4,940
Sewerage	23,583	28,052	36,599	46,679
Waste management	14,990	17,208	21,469	23,757
Water supply	28,041	35,789	45,799	55,215
Mass transit	25,719	31,883	44,310	50,944

Source: *Statistical Abstract of the United States*, 2012, Table 438.

- 2.42** **Xr02-15*** The following table displays the energy consumption patterns of Australia and New Zealand. The figures measure the heat content in metric tons (1,000 kilograms) of oil equivalent. Use a graphical technique to display the differences between the sources of energy for the two countries.

Energy Sources	Australia	New Zealand
Nonrenewable		
Coal and coal products	55,385	1,281
Oil	33,185	6,275
Natural gas	20,350	5,324
Nuclear	0	0
Renewable		
Hydroelectric	1,388	1,848
Solid biomass	4,741	805
Other (liquid biomass, geothermal, solar, wind, and tide, wave, and ocean)	347	2,761
Total	115,396	18,294

Source: International Energy Association.

The following exercises require a computer and software.

- 2.43** **Xr02-43** The average loss from robbery in the United States in 2009 was \$1,246. (Source U.S. Federal Bureau of Investigation). Suppose that government agency wanted to know whether the type of robbery differs in the years 1995, 2000, 2005, and 2009. A random sample of robbery reports was taken from each of these years and the types recorded using the codes that follow. Determine whether there are differences in the types of robbery over the 16-year span.

1. Street or highway
2. Commercial house

3. Gas station
4. Convenience store
5. Residence
6. Bank
7. Other

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 321.

2.44 **Xr02-44** The associate dean of a business school was looking for ways to improve the quality of the applicants to its MBA program. In particular, she wanted to know whether the undergraduate degree of applicants differed among her school and the three nearby universities with MBA programs. She sampled 100 applicants to her program and an equal number from each of the other universities. She recorded their undergraduate degree (1 = BA, 2 = BEng, 3 = BBA, 4 = Other) as well the university (codes 1,2,3, and 4). Use a tabular technique to determine whether the undergraduate degree and the university each person applied to appear to be related.

2.45 **Xr02-45** Is there brand loyalty among car owners in their purchases of gasoline? To help answer the question, car owners were asked to record the brand of gasoline in their last two purchases (1 = Exxon, 2 = Amoco, 3 = Texaco, 4 = Other). Use a tabular technique to formulate your answer.

2.46 **Xr02-46** The costs of smoking for individuals, companies for whom they work, and society in general are in the many billions of dollars. In an effort to reduce smoking various government and nongovernment organizations have undertaken information campaigns about the dangers of smoking. Most of these have been directed at young people. This raises the question: Are you more likely to smoke if your parents smoke? To shed light on the issue, 20- to 40-year-old people were asked whether they smoked and whether their parents smoked. The results are stored as follows:

Column 1: 1 = Do not smoke, 2 = Smoke
 Column 2: 1 = Neither parent smoked,
 2 = Father smoked, 3 = Mother smoked,
 4 = Both parents smoked

Use a tabular technique to produce the information you need.

2.47 **Xr02-47** In 2009, 8,626,000 men and 6,199,000 women were unemployed at some time during the year. (*Source:* U.S. Bureau of Labor Statistics.) A statistics practitioner wanted to investigate the reason for that unemployment status and whether the reasons differed by gender. A random sample of people 16 years of age and older was drawn. The reasons given for their status included:

1. Lost job
2. Left job
3. Reentrants
4. New entrants

Determine whether there are differences between unemployed men and women in terms of the reasons for unemployment.

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 624.

2.48 **Xr02-48** In 2010, the total number of prescriptions sold in the United States was 3,676,000. (*Source:* National Association of Drug Store Chains.) The sales manager of a chain of drug stores wanted to determine whether changes in where the prescriptions were filled had changed. A survey of prescriptions was undertaken in 1995, 2000, 2005, and 2010. The year and type of each prescription were recorded using the codes that follow. Determine whether there are differences among the years.

1. Traditional chain store
2. Independent drug store
3. Mass merchant
4. Supermarket
5. Mail order

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 159.

2.49 **Xr02-33*** Refer to Exercise 2.33. Also recorded was the gender (1 = Male, 2 = Female) of the respondents. Use a graphical technique to determine whether the choice of light beers differs between genders.

CHAPTER SUMMARY

Descriptive statistical methods are used to summarize data sets so that we can extract the relevant information. In this chapter, we presented graphical techniques for nominal data.

Bar charts, pie charts, and frequency distributions are employed to summarize single sets of nominal data. Because

of the restrictions applied to this type of data, all that we can show is the frequency and proportion of each category.

To describe the relationship between two nominal variables, we produce cross-classification tables and bar charts.

IMPORTANT TERMS:

Variable 13
 Values 13
 Data 13
 Datum 13
 Interval 14
 Quantitative 14
 Numerical 14
 Nominal 14
 Qualitative 14

Categorical 14
 Ordinal 14
 Frequency distribution 18
 Relative frequency distribution 18
 Bar chart 21
 Pie chart 21
 Univariate 32
 Bivariate 32
 Cross-classification (cross-tabulation) table 32

COMPUTER OUTPUT AND INSTRUCTIONS:

Graphical Technique	Excel	Minitab
Bar chart	22	23
Pie chart	22	23

CHAPTER EXERCISES

The following exercises require a computer and software.

- 2.50** **Xr02-50** At Yankee Stadium, 200 people who had purchased food were asked to rate the quality of the food. The responses included:

1. Poor
2. Fair
3. Good
4. Very good
5. Excellent

Draw a graph that describes the data. What does the graph tell you?

- 2.51** **Xr02-51** There are several ways to teach applied statistics. The most popular approaches include:

1. Emphasize manual calculations
2. Use a computer combined with manual calculations
3. Use a computer exclusively with no manual calculations

A survey of 100 statistics instructors asked each to report his or her approach. Use a graphical method to extract the most useful information about the teaching approaches.

- 2.52** **Xr02-52** Which Internet search engines are the most popular? A survey undertaken by the *Financial Post* asked random samples of Americans and Canadians that question. The responses included:

1. Google
2. Microsoft (MSN)

3. Yahoo
4. Other

Use a graphical technique that compares the proportions of Americans' and Canadians' use of search engines.

- 2.53** **Xr02-53** The Wilfrid Laurier University bookstore conducts annual surveys of its customers. One question asks respondents to rate the prices of textbooks. The wording is, "The bookstore's prices of textbooks are reasonable." The responses include:

1. Strongly disagree
2. Disagree
3. Neither agree nor disagree
4. Agree
5. Strongly agree

The responses for a group of 115 students were recorded. Graphically summarize these data and report your findings.

- 2.54** **Xr02-54** The Red Lobster restaurant chain conducts regular surveys of its customers to monitor the performance of individual restaurants. One of the questions asks customers to rate the overall quality of their last visit. The listed responses are Poor (1), Fair (2), Good (3), Very good (4), and Excellent (5). The survey also asks respondents whether their children accompanied them (1 = Yes, 2 = No) to the restaurant. Graphically depict these data and describe your findings.

- 2.55** **Xr02-55** Many countries are lowering taxes on corporations in an effort to be more attractive for

investment. In the next table, we list the marginal effective corporate tax rates among Organization for Economic Co-Operation and Development (OECD) countries. Develop a graph that depicts these figures. Briefly describe your results.

Country	Manufacturers	Services	Aggregate
Australia	27.7	26.6	26.7
Austria	21.6	19.5	19.9
Belgium	-6.0	-4.1	-0.5
Canada	20.0	29.2	25.2
Czech Republic	1.0	7.8	8.4
Denmark	16.5	12.7	13.4
Finland	22.4	22.9	22.8
France	33.0	31.7	31.9
Germany	30.8	29.4	29.7
Greece	18.0	13.2	13.8
Hungary	12.9	12.0	12.2
Iceland	19.5	17.6	17.9
Ireland	12.7	11.7	12.0
Italy	24.6	28.6	27.8
Japan	35.2	30.4	31.3
Korea	32.8	31.0	31.5
Luxembourg	24.1	20.3	20.6
Mexico	17.1	12.1	13.1
Netherlands	18.3	15.0	15.5
New Zealand	27.1	25.4	25.7
Norway	25.8	23.2	23.5
Poland	14.4	15.0	14.9
Portugal	14.8	16.1	15.9
Slovak	13.3	11.7	12.0
Spain	27.2	25.2	25.5
Sweden	19.3	17.5	17.8
Switzerland	14.8	15.0	14.9
Turkey	22.7	20.2	20.8
United Kingdom	22.7	27.8	26.9
United States	32.7	39.9	36.9

- 2.56** **Xr02-56** At the end of fiscal year 2012 (September 30, 2012), the U.S. government owed \$16.2 trillion.

Who owns that debt? The following table lists the amounts owed as of September 30, 2012. Use a graphical technique to describe these figures.

Owed To	Amount
U.S. Individuals and Institutions	4,872,208,000,000
U.S. Social Security Trust Fund	2,676,509,000,000
U.S. Federal Reserve	1,730,916,000,000
U.S. Civil Service Retirement Fund	897,512,000,000
U.S. Military Retirement Fund	384,648,000,000
China (including Hong Kong)	1,298,187,000,000
Japan	1,121,890,000,000
Oil Exporters	272,459,000,000
Brazil	256,432,000,000
United Kingdom	144,243,000,000
All Other Countries	2,404,050,000,000

- 2.57** **Xr02-57*** A survey of the business school graduates undertaken by a university placement office asked, among other questions, in which area each person was employed. The areas of employment included:

1. Accounting
2. Finance
3. General management
4. Marketing/Sales
5. Other

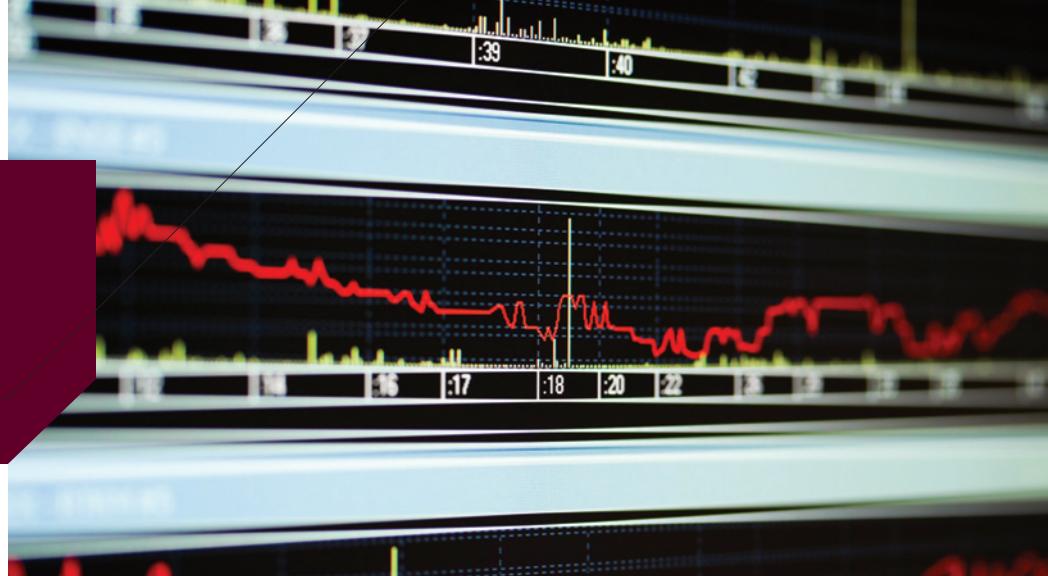
Additional questions were asked, and the responses were recorded in the following way:

Column	Variable
1	Identification number
2	Area
3	Gender (1 = Female, 2 = Male)
4	Job satisfaction (4 = Very, 3 = Quite, 2 = Little, 1 = None)

The placement office wants to know the following:

- a. Do female and male graduates differ in their areas of employment? If so, how?
- b. Are area of employment and job satisfaction related?

3



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GRAPHICAL DESCRIPTIVE TECHNIQUES II

- 3-1 Graphical Techniques to Describe a Set of Interval Data
- 3-2 Describing Time-Series Data
- 3-3 Describing the Relationship between Two Interval Variables
- 3-4 Art and Science of Graphical Presentations

Were Oil Companies Gouging Customers 2000–2012?

DATA
Xm03-00

The price of oil has been increasing for several reasons. First, oil is a finite resource; the world will eventually run out. In 2012, the world was consuming more than 100 million barrels per day—more than 36 billion barrels per year. The total proven world reserves of oil are 1,481.5 billion barrels. At today's consumption levels, the proven reserves will be exhausted in 37 years. (It should be noted, however, that in 2009, the proven reserves of oil amounted to 1,349.4 billion barrels, indicating that new oil discoveries are offsetting increasing usage.) Second, China's and India's industries



Corbis Images/Getty Images

On page 77, you will find our answer.

are rapidly increasing and require ever-increasing amounts of oil. Third, over the last 10 years, hurricanes have threatened the oil rigs in the Gulf of Mexico.

The result of the price increases in oil is reflected in the price of gasoline. In January 2000, the average retail price of gasoline in the United States was \$1.301 per U.S. gallon (one U.S. gallon equals 3.79 liters) and the price of oil (West Texas intermediate crude) was \$27.18 per barrel (one barrel equals 42 U.S. gallons). Over the next 10 years, the price of both oil and gasoline substantially increased. Many drivers complained that the oil companies were guilty of price gouging; that is, they believed that when the price of oil increased, the price of gas also increased, but when the price of oil decreased, the decrease in the price of gasoline seemed to lag behind. To determine whether this perception is accurate, we determined the monthly figures for both commodities. Were oil and gas prices related?

Source: U.S Department of Energy.

INTRODUCTION

Chapter 2 introduced graphical techniques used to summarize and present nominal data. In this chapter, we do the same for interval data. Section 3-1 presents techniques to describe a set of interval data, Section 3-2 introduces time series and the method used to present time-series data, and Section 3-3 describes the technique we use to describe the relationship between two interval variables. We complete this chapter with a discussion of how to properly use graphical methods in Section 3-4.

3-1 GRAPHICAL TECHNIQUES TO DESCRIBE A SET OF INTERVAL DATA

In this section, we introduce several graphical methods that are used when the data are interval. The most important of these graphical methods is the histogram. As you will see, the histogram not only is a powerful graphical technique used to summarize interval data but also is used to help explain an important aspect of probability (see Chapter 8).

APPLICATIONS in MARKETING

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Pricing

Traditionally, marketing has been defined in terms of the four P's: product, price, promotion, and place. *Marketing management* is the functional area of business that focuses on the development of a product, together with its pricing, promotion, and distribution. Decisions are made in these four areas with a view to satisfying the wants and needs of consumers while also satisfying the firm's objective.

The pricing decision must be addressed both for a new product, and, from time to time, for an existing product. Anyone buying a product such as a personal computer has been confronted with a wide variety of prices, accompanied by a correspondingly wide variety of features. From a vendor's standpoint, establishing the appropriate price and corresponding set of attributes for a product is complicated and must be done in the context of the overall marketing plan for the product.

EXAMPLE 3.1

DATA
Xm03-01

Analysis of Long-Distance Telephone Bills

Following deregulation of telephone service, several new companies were created to compete in the business of providing long-distance telephone service. In almost all cases, these companies competed on price because the service each offered is similar. Pricing a service or product in the face of stiff competition is very difficult. Factors to be considered include supply, demand, price elasticity, and the actions of competitors. Long-distance packages may employ per minute charges, a flat monthly rate, or some combination of the two. Determining the appropriate rate structure is facilitated by acquiring information about the behaviors of customers, especially the size of monthly long-distance bills.

As part of a larger study, a long-distance company wanted to acquire information about the monthly bills of new subscribers in the first month after signing with the company. The company's marketing manager conducted a survey of 200 new residential subscribers and recorded the first month's bills. These data are listed here. The general manager planned to present his findings to senior executives. What information can be extracted from these data?

Long-Distance Telephone Bills

42.19	39.21	75.71	8.37	1.62	28.77	35.32	13.9	114.67	15.3
38.45	48.54	88.62	7.18	91.1	9.12	117.69	9.22	27.57	75.49
29.23	93.31	99.5	11.07	10.88	118.75	106.84	109.94	64.78	68.69
89.35	104.88	85	1.47	30.62	0	8.4	10.7	45.81	35
118.04	30.61	0	26.4	100.05	13.95	90.04	0	56.04	9.12
110.46	22.57	8.41	13.26	26.97	14.34	3.85	11.27	20.39	18.49
0	63.7	70.48	21.13	15.43	79.52	91.56	72.02	31.77	84.12
72.88	104.84	92.88	95.03	29.25	2.72	10.13	7.74	94.67	13.68
83.05	6.45	3.2	29.04	1.88	9.63	5.72	5.04	44.32	20.84
95.73	16.47	115.5	5.42	16.44	21.34	33.69	33.4	3.69	100.04
103.15	89.5	2.42	77.21	109.08	104.4	115.78	6.95	19.34	112.94
94.52	13.36	1.08	72.47	2.45	2.88	0.98	6.48	13.54	20.12
26.84	44.16	76.69	0	21.97	65.9	19.45	11.64	18.89	53.21
93.93	92.97	13.62	5.64	17.12	20.55	0	83.26	1.57	15.3
90.26	99.56	88.51	6.48	19.7	3.43	27.21	15.42	0	49.24
72.78	92.62	55.99	6.95	6.93	10.44	89.27	24.49	5.2	9.44
101.36	78.89	12.24	19.6	10.05	21.36	14.49	89.13	2.8	2.67
104.8	87.71	119.63	8.11	99.03	24.42	92.17	111.14	5.1	4.69
74.01	93.57	23.31	9.01	29.24	95.52	21	92.64	3.03	41.38
56.01	0	11.05	84.77	15.21	6.72	106.59	53.9	9.16	45.77

SOLUTION:

Little information can be developed just by casually reading through the 200 observations. The manager can probably see that most of the bills are under \$100, but that is likely to be the extent of the information garnered from browsing through the data. If he examines the data more carefully, he may discover that the smallest bill is \$0 and the largest is \$119.63. He has now developed some information. However, his presentation to senior executives will be most unimpressive if no other information is produced. For example, someone is likely to ask how the numbers are distributed between 0 and 119.63. Are there many small bills and few large bills? What is the "typical" bill? Are the bills somewhat similar or do they vary considerably?

To help answer these questions and others like them, the marketing manager can construct a frequency distribution from which a histogram can be drawn. In the

In the previous section a frequency distribution was created by counting the number of times each category of the nominal variable occurred. We create a frequency distribution for interval data by counting the number of observations that fall into each of a series of intervals, called **classes**, that cover the complete range of observations. We discuss how to decide the number of classes and the upper and lower limits of the intervals later. We have chosen eight classes defined in such a way that each observation falls into one and only one class. These classes are defined as follows:

Classes

- Amounts that are less than or equal to 15
- Amounts that are more than 15 but less than or equal to 30
- Amounts that are more than 30 but less than or equal to 45
- Amounts that are more than 45 but less than or equal to 60
- Amounts that are more than 60 but less than or equal to 75
- Amounts that are more than 75 but less than or equal to 90
- Amounts that are more than 90 but less than or equal to 105
- Amounts that are more than 105 but less than or equal to 120

Notice that the intervals do not overlap, so there is no uncertainty about which interval to assign to any observation. Moreover, because the smallest number is 0 and the largest is 119.63, every observation will be assigned to a class. Finally, the intervals are equally wide. Although this is not essential, it makes the task of reading and interpreting the graph easier.

To create the frequency distribution manually, we count the number of observations that fall into each interval. Table 3.1 presents the frequency distribution.

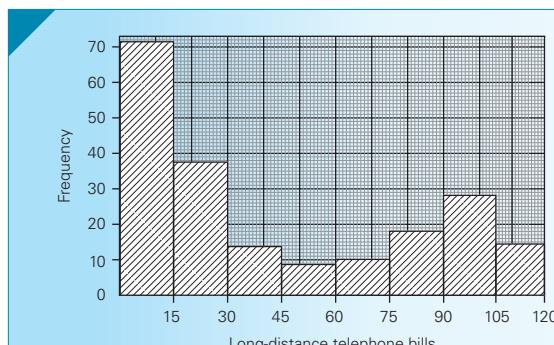
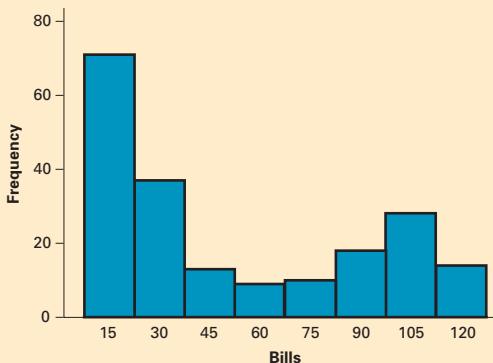
TABLE 3.1 Frequency Distribution of the Long-Distance Bills in Example 3.1

CLASS LIMITS	FREQUENCY
0 to 15*	71
15 to 30	37
30 to 45	13
45 to 60	9
60 to 75	10
75 to 90	18
90 to 105	28
105 to 120	14
Total	200

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*Classes contain observations greater than their lower limits (except for the first class) and less than or equal to their upper limits.

Although the frequency distribution provides information about how the numbers are distributed, the information is more easily understood and imparted by drawing a picture or graph. The graph is called a **histogram**. A histogram is created by drawing rectangles whose bases are the intervals and whose heights are the frequencies. Figure 3.1 exhibits the histogram that was drawn by hand.

FIGURE 3.1 Histogram for Example 3.1**EXCEL****INSTRUCTIONS**

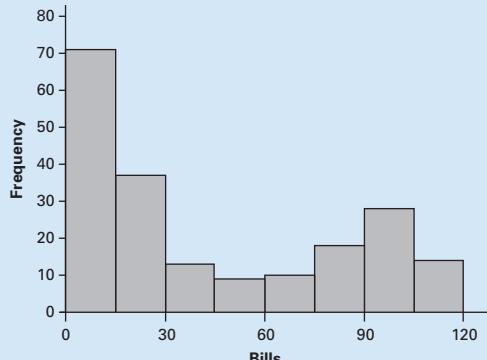
1. Type or import the data into one column. (Open Xm03-01.) In another column, type the upper limits of the class intervals. Excel calls them *bins*. (You can put any name in the first row; we typed “Bills.”)
2. Click **Data, Data Analysis, and Histogram**. If Data Analysis does not appear in the menu box, see our Keller’s website, Appendix A1.
3. Specify the **Input Range** (A1:A201) and the **Bin Range** (B1:B9). Click **Chart Output**. Click **Labels** if the first row contains names.
4. To remove the gaps, place the cursor over one of the rectangles and click the right button of the mouse. Click (with the left button) **Format Data Series . . .** move the pointer to **Gap Width** and use the slider to change the number from 150 to 0.

Except for the first class, Excel counts the number of observations in each class that are greater than the lower limit and less than or equal to the upper limit.

Note that the numbers along the horizontal axis represent the upper limits of each class although they appear to be placed in the centers. If you wish, you can replace these numbers with the actual midpoints by making changes to the frequency distribution in cells A1:B14 (change 15 to 7.5, 30 to 22.5, . . . , and 120 to 112.5).

You can also convert the histogram to list relative frequencies instead of frequencies. To do so, change the frequencies to relative frequencies by dividing each frequency by 200; that is, replace 71 by .355, 37 by .185, . . . , and 14 by .07.

If you have difficulty with this technique, turn to the website Appendix A2 or A3, which provides step-by-step instructions for Excel and provides troubleshooting tips.

MINITAB

Note that Minitab counts the number of observations in each class that are strictly less than their upper limits.

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm03-01](#).)
2. Click **Graph**, **Histogram . . .**, and **Simple**.
3. Type or use the **Select** button to specify the name of the variable in the **Graph Variables** box (**Bills**). Click **Data View**.
4. Click **Data Display** and **Bars**. Minitab will create a histogram using its own choices of class intervals.
5. To choose your own classes, double-click the horizontal axis. Click **Binning**.
6. Under **IntervalType**, choose **Cutpoint**. Under **IntervalDefinition**, choose **Midpoint/Cutpoint positions** and type in your choices (**0 15 30 45 60 75 90 105 120**) to produce the histogram shown here.

INTERPRET

The histogram gives us a clear view of the way the bills are distributed. About half the monthly bills are small (\$0 to \$30), a few bills are in the middle range (\$30 to \$75), and a relatively large number of long-distance bills are at the high end of the range. It would appear from this sample of first-month long-distance bills that the company's customers are split unevenly between light and heavy users of long-distance telephone service. If the company assumes that this pattern will continue, it must address a number of pricing issues. For example, customers who incurred large monthly bills may be targets of competitors who offer flat rates for 15-minute or 30-minute calls. The company needs to know more about these customers. With the additional information, the marketing manager may suggest altering the company's pricing.

3-1a Determining the Number of Class Intervals

The number of class intervals we select depends entirely on the number of observations in the data set. The more observations we have, the larger the number of class intervals we need to use to draw a useful histogram. Table 3.2 provides guidelines on choosing

the number of classes. In Example 3.1, we had 200 observations. The table tells us to use 7, 8, 9, or 10 classes.

TABLE 3.2 Approximate Number of Classes in Histograms

NUMBER OF OBSERVATIONS	NUMBER OF CLASSES
Less than 50	5–7
50–200	7–9
200–500	9–10
500–1,000	10–11
1,000–5,000	11–13
5,000–50,000	13–17
More than 50,000	17–20

An alternative to the guidelines listed in Table 3.2 is to use Sturges's formula, which recommends that the number of class intervals be determined by the following:

$$\text{Number of class intervals} = 1 + 3.3 \log(n)$$

For example, if $n = 50$ Sturges's formula becomes

$$\text{Number of class intervals} = 1 + 3.3 \log(50) = 1 + 3.3(1.7) = 6.6$$

which we round to 7.

Class Interval Widths We determine the approximate width of the classes by subtracting the smallest observation from the largest and dividing the difference by the number of classes. Thus,

$$\text{Class width} = \frac{\text{Largest Observation} - \text{Smallest Observation}}{\text{Number of Classes}}$$

In Example 3.1, we calculated

$$\text{Class width} = \frac{119.63 - 0}{8} = 14.95$$

We often round the result to some convenient value. We then define our class limits by selecting a lower limit for the first class from which all other limits are determined. The only condition we apply is that the first class interval must contain the smallest observation. In Example 3.1, we rounded the class width to 15 and set the lower limit of the first class to 0. Thus, the first class is defined as "Amounts that are greater than or equal to 0 but less than or equal to 15." (Minitab users should remember that the classes are defined as the number of observations that are *strictly less* than their upper limits.)

Table 3.2 and Sturges's formula are guidelines only. It is more important to choose classes that are easy to interpret. For example, suppose that we have recorded the marks on an exam of the 100 students registered in the course where the highest mark is 94 and the lowest is 48. Table 3.2 suggests that we use 7, 8, or 9 classes, and Sturges's formula computes the approximate number of classes as:

$$\text{Number of class intervals} = 1 + 3.3 \log(100) = 1 + 3.3(2) = 7.6$$

which we round to 8. Thus,

$$\text{Class width} = \frac{94 - 48}{8} = 5.75$$

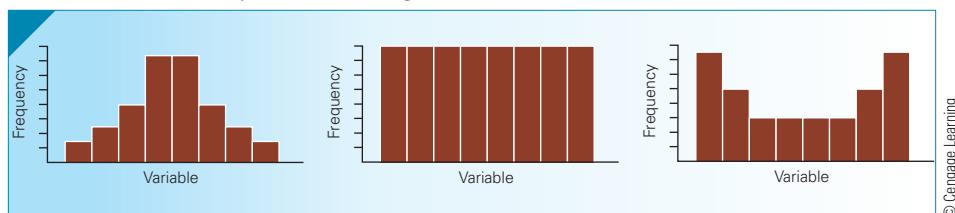
which we would round to 6. We could then produce a histogram whose upper limits of the class intervals are 50, 56, 62, . . . , 98. Because of the rounding and the way in which we defined the class limits, the number of classes is 9. However, a histogram that is easier to interpret would be produced using classes whose widths are 5; that is, the upper limits would be 50, 55, 60, . . . , 95. The number of classes in this case would be 10.

3-1b Shapes of Histograms

The purpose of drawing histograms, like that of all other statistical techniques, is to acquire information. Once we have the information, we frequently need to describe what we've learned to others. We describe the shape of histograms on the basis of the following characteristics.

Symmetry A histogram is said to be **symmetric** if, when we draw a vertical line down the center of the histogram, the two sides are identical in shape and size. Figure 3.2 depicts three symmetric histograms.

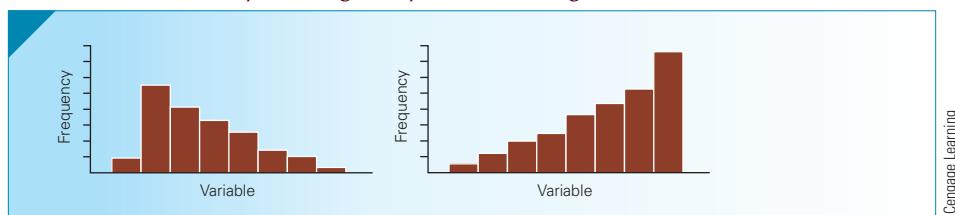
FIGURE 3.2 Three Symmetric Histograms



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Skewness A skewed histogram is one with a long tail extending to either the right or the left. The former is called **positively skewed**, and the latter is called **negatively skewed**. Figure 3.3 shows examples of both. Incomes of employees in large firms tend to be positively skewed because there is a large number of relatively low-paid workers and a small number of well-paid executives. The time taken by students to write exams is frequently negatively skewed because few students hand in their exams early; most prefer to reread their papers and hand them in near the end of the scheduled test period.

FIGURE 3.3 Positively and Negatively Skewed Histograms

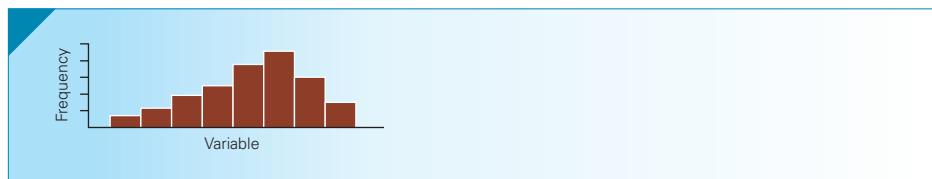


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Number of Modal Classes As we discuss in Chapter 4, a *mode* is the observation that occurs with the greatest frequency. A **modal class** is the class with the largest number of observations. A **unimodal histogram** is one with a single peak. The histogram

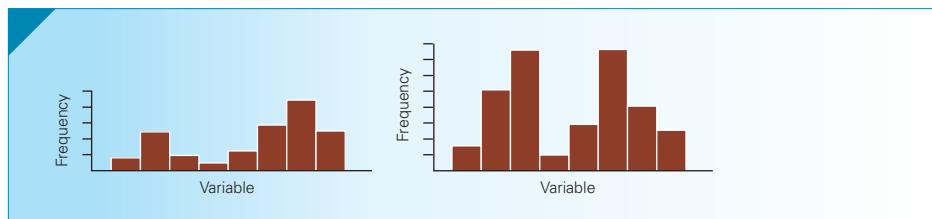
in Figure 3.4 is unimodal. A **bimodal histogram** is one with two peaks, not necessarily equal in height. Bimodal histograms often indicate that two different distributions are present. (See Example 3.4.) Figure 3.5 depicts bimodal histograms.

FIGURE 3.4 A Unimodal Histogram



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FIGURE 3.5 Bimodal Histograms



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Bell Shape A special type of symmetric unimodal histogram is one that is bell shaped. In Chapter 8, we will explain why this type of histogram is important. Figure 3.6 exhibits a bell-shaped histogram.

FIGURE 3.6 Bell-Shaped Histogram



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Now that we know what to look for, let's examine some examples of histograms and see what we can discover.

APPLICATIONS in FINANCE

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Stock and Bond Valuation

A basic understanding of how financial assets, such as stocks and bonds, are valued is critical to good financial management. Understanding the basics of valuation is necessary for capital budgeting and capital structure decisions. Moreover, understanding the basics of valuing investments such as stocks and bonds is at the heart of the huge and growing discipline known as *investment management*.

(Continued)

A financial manager must be familiar with the main characteristics of the capital markets where long-term financial assets such as stocks and bonds trade. A well-functioning capital market provides managers with useful information concerning the appropriate prices and rates of return that are required for a variety of financial securities with differing levels of risk. Statistical methods can be used to analyze capital markets and summarize their characteristics, such as the shape of the distribution of stock or bond returns.

APPLICATIONS in FINANCE

Klaus Vedfelt/The Image Bank/
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Return on Investment

The return on an investment is calculated by dividing the gain (or loss) by the value of the investment. For example, a \$100 investment that is worth \$106 after 1 year has a 6% rate of return. A \$100 investment that loses \$20 has a -20% rate of return. For many investments, including individual stocks and stock portfolios (combinations of various stocks), the rate of return is a variable. In other words, the investor does not know in advance what the rate of return will be. It could be a positive number, in which case the investor makes money—or negative, and the investor loses money.

Investors are torn between two goals. The first is to maximize the rate of return on investment. The second goal is to reduce risk. If we draw a histogram of the returns for a certain investment, the location of the center of the histogram gives us some information about the return one might expect from that investment. The spread or variation of the histogram provides us with guidance about the risk. If there is little variation, an investor can be quite confident in predicting what his or her rate of return will be. If there is a great deal of variation, the return becomes much less predictable and thus riskier. Minimizing the risk becomes an important goal for investors and financial analysts.

EXAMPLE 3.2

DATA

Xm03-02

Comparing Returns on Two Investments

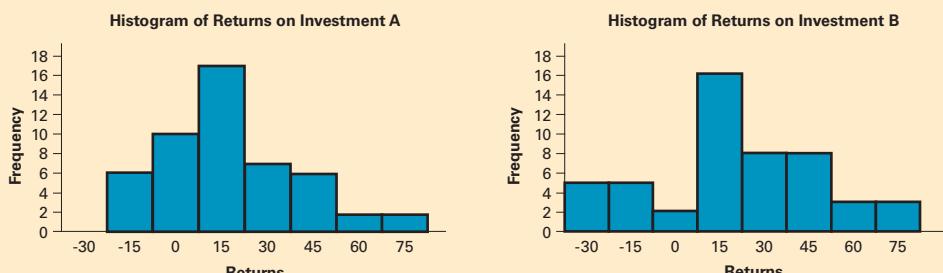
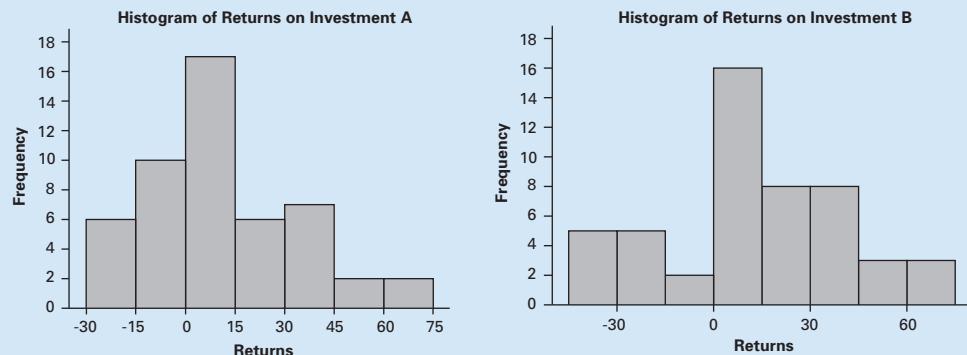
Suppose that you are facing a decision about where to invest that small fortune that remains after you have deducted the anticipated expenses for the next year from the earnings from your summer job. A friend has suggested two types of investment, and to help make the decision you acquire some rates of return from each type. You would like to know what you can expect by way of the return on your investment, as well as other types of information, such as whether the rates are spread out over a wide range (making the investment risky) or are grouped tightly together (indicating relatively low risk). Do the data indicate that it is possible that you can do extremely well with little likelihood of a large loss? Is it likely that you could lose money (negative rate of return)?

The returns for the two types of investments are listed here. Draw histograms for each set of returns and report on your findings. Which investment would you choose and why?

Returns on Investment A				Returns on Investment B			
30.00	6.93	13.77	-8.55	30.33	-34.75	30.31	24.3
-2.13	-13.24	22.42	-5.29	-30.37	54.19	6.06	-10.01
4.30	-18.95	34.40	-7.04	-5.61	44.00	14.73	35.24
25.00	9.43	49.87	-12.11	29.00	-20.23	36.13	40.7
12.89	1.21	22.92	12.89	-26.01	4.16	1.53	22.18
-20.24	31.76	20.95	63.00	0.46	10.03	17.61	3.24
1.20	11.07	43.71	-19.27	2.07	10.51	1.2	25.1
-2.59	8.47	-12.83	-9.22	29.44	39.04	9.94	-24.24
33.00	36.08	0.52	-17.00	11	24.76	-33.39	-38.47
14.26	-21.95	61.00	17.30	-25.93	15.28	58.67	13.44
-15.83	10.33	-11.96	52.00	8.29	34.21	0.25	68.00
0.63	12.68	1.94		61.00	52.00	5.23	
38.00	13.09	28.45		-20.44	-32.17	66	

SOLUTION:

We draw the histograms of the returns on the two investments. We'll use Excel and Minitab to do the work.

EXCEL**MINITAB**

INTERPRET

Comparing the two histograms, we can extract the following information:

1. The center of the histogram of the returns of investment A is slightly lower than that for investment B.
2. The spread of returns for investment A is considerably less than that for investment B.
3. Both histograms are slightly positively skewed.

These findings suggest that investment A is superior. Although the returns for A are slightly less than those for B, the wider spread for B makes it unappealing to most investors. Both investments allow for the possibility of a relatively large return.

The interpretation of the histograms is somewhat subjective. Other viewers may not concur with our conclusion. In such cases, numerical techniques provide the detail and precision lacking in most graphs. We will redo this example in Chapter 4 to illustrate how numerical techniques compare to graphical ones.

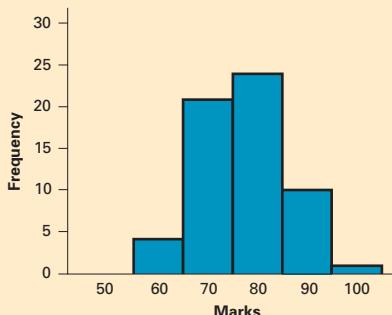
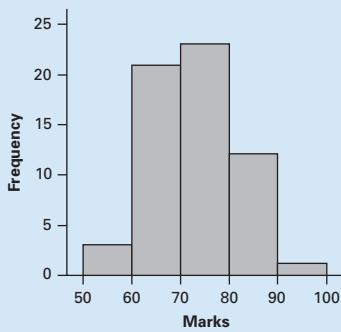
EXAMPLE 3.3**DATA**

Xm03-03*

Business Statistics Marks

A student enrolled in a business program is attending the first class of the required statistics course. The student is somewhat apprehensive because he believes the myth that the course is difficult. To alleviate his anxiety, the student asks the professor about last year's marks. The professor obliges and provides a list of the final marks, which is composed of term work plus the final exam. Draw a histogram and describe the result, based on the following marks:

65	81	72	59
71	53	85	66
66	70	72	71
79	76	77	68
65	73	64	72
82	73	77	75
80	85	89	74
86	83	87	77
67	80	78	69
64	67	79	60
62	78	59	92
74	68	63	69
67	67	84	69
72	62	74	73
68	83	74	65

SOLUTION:**EXCEL****MINITAB****INTERPRET**

The histogram is unimodal and approximately symmetric. There are no marks below 50, with the great majority of marks between 60 and 90. The modal class is 70 to 80, and the center of the distribution is approximately 75.

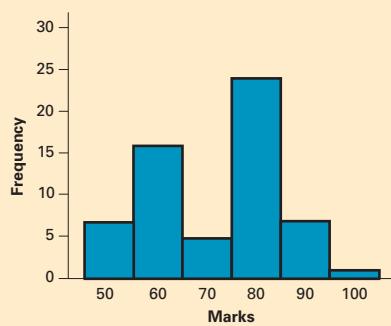
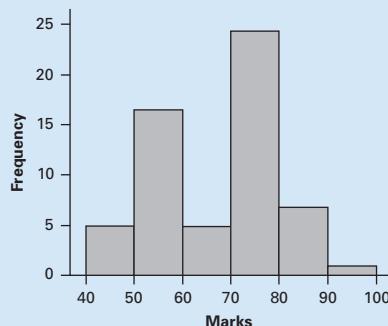
EXAMPLE 3.4

DATA
Xm03-04*

Mathematical Statistics Marks

Suppose the student in Example 3.3 obtained a list of last year's marks in a mathematical statistics course. This course emphasizes derivations and proofs of theorems. Use the accompanying data to draw a histogram and compare it to the one produced in Example 3.3. What does this histogram tell you?

77	67	53	54
74	82	75	44
75	55	76	54
75	73	59	60
67	92	82	50
72	75	82	52
81	75	70	47
76	52	71	46
79	72	75	50
73	78	74	51
59	83	53	44
83	81	49	52
77	73	56	53
74	72	61	56
78	71	61	53

SOLUTION:**EXCEL****MINITAB**

INTERPRET

The histogram is bimodal. The larger modal class is composed of the marks in the 70s. The smaller modal class includes the marks that are in the 50s. There appear to be few marks in the 60s. This histogram suggests that there are two groups of students. Because of the emphasis on mathematics in the course, one may conclude that those who performed poorly in the course are weaker mathematically than those who performed well. The histograms in this example and in Example 3.3 suggest that the courses are quite different from one another and have a completely different distribution of marks.

3-1c Stem-and-Leaf Display

One of the drawbacks of the histogram is that we lose potentially useful information by classifying the observations. In Example 3.1, we learned that there are 71 observations that fall between 0 and 15. By classifying the observations we did acquire useful information. However, the histogram focuses our attention on the frequency of each class and by doing so sacrifices whatever information was contained in the actual observations. A statistician named John Tukey introduced the **stem-and-leaf display**, which is a method that to some extent overcomes this loss.

The first step in developing a stem-and-leaf display is to split each observation into two parts, a stem and a leaf. There are several different ways of doing this. For example, the number 12.3 can be split so that the stem is 12 and the leaf is 3. In this definition, the stem consists of the digits to the left of the decimal and the leaf is the digit to the right of the decimal. Another method can define the stem as 1 and the leaf as 2 (ignoring the 3). In this definition the stem is the number of tens and the leaf is the number of ones. We'll use this definition to create a stem-and-leaf display for Example 3.1.

The first observation is 42.19. Thus, the stem is 4 and the leaf is 2. The second observation is 38.45, which has a stem of 3 and a leaf of 8. We continue converting each number in this way. The stem-and-leaf display consists of listing the stems 0, 1, 2, . . . , 11. After each stem, we list that stem's leaves, usually in ascending order. Figure 3.7 depicts the manually created stem-and-leaf display.

FIGURE 3.7 Stem-and-Leaf Display for Example 3.1

Stem	Leaf
0	000000000111122222333334555555666666778888999999
1	0000011123333334455555667889999
2	000111123446667789999
3	001335589
4	124445589
5	33566
6	3458
7	022224556789
8	334457889999
9	0011222233344555999
10	001344446699
11	0124557889

As you can see the stem-and-leaf display is similar to a histogram turned on its side. The length of each line represents the frequency in the class interval defined by the stems. The advantage of the stem-and-leaf display over the histogram is that we can see the actual observations.

EXCEL

	A	B	C	D	E	F	G
1	Stem & Leaf Display						
2							
3	Stems Leaves						
4	0 ->00000000011112222233334555555666666778888999999						
5	1 ->0000011123333334455555667889999						
6	2 ->0000111123446667789999						
7	3 ->01335589						
8	4 ->12445589						
9	5 ->3566						
10	6 ->3458						
11	7 ->022224556789						
12	8 ->334457889999						
13	9 ->0012222233344555999						
14	10 ->001344446699						
15	11 ->0124557889						
16							
17							

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm03-01.](#))
2. Click **Add-ins**, **Data Analysis Plus**, and **Stem-and-Leaf Display**.
3. Specify the **Input Range** ([A1:A201](#)). Click one of the values of **Increment** (the increment is the difference between stems) ([10](#)).

MINITAB

```
Stem-and-Leaf Display: Bills

Stem-and-leaf of Bills N = 200
Leaf Unit = 1.0

52 0 0000000011112222233334555555666666778888999999
85 1 0000011123333334455555667889999
(23) 2 0000111123446667789999
92 3 001335589
83 4 12445589
75 5 3566
70 6 3458
66 7 022224556789
54 8 334457889999
42 9 0012222233344555999
22 10 001344446699
10 11 0124557889
```

The numbers in the left column are called **depths**. Each depth counts the number of observations that are on its line or beyond. For example, the second depth is 85, which means that there are 85 observations that are less than 20. The third depth is displayed in parentheses, which indicates that the third interval contains the observation that falls in the middle of all the observations, a statistic we call the *median* (to be presented in Chapter 4). For this interval, the depth tells us the frequency of the interval; that is, 23 observations are greater than or equal to 20 but less than 30. The fourth depth is 92, which tells us that 92 observations are greater than or equal to 30. Notice that for classes

below the median, the depth reports the number of observations that are less than the upper limit of that class. For classes that are above the median, the depth reports the number of observations that are greater than or equal to the lower limit of that class.

INSTRUCTIONS

1. Type or import the data into one column. (Open Xm03-01.)
2. Click **Graph** and **Stem-and-Leaf**. . . .
3. Type or use the **Select** button to specify the variable in the **Variables** box (**Bills**). Type the increment in the **Increment** box (**10**).

3-1d Ogive

The frequency distribution lists the number of observations that fall into each class interval. We can also create a **relative frequency distribution** by dividing the frequencies by the number of observations. Table 3.3 displays the relative frequency distribution for Example 3.1.

TABLE 3.3 Relative Frequency Distribution for Example 3.1

CLASS LIMITS	RELATIVE FREQUENCY
0 to 15	$71/200 = .355$
15 to 30	$37/200 = .185$
30 to 45	$13/200 = .065$
45 to 60	$9/200 = .045$
60 to 75	$10/200 = .050$
75 to 90	$18/200 = .090$
90 to 105	$28/200 = .140$
105 to 120	$14/200 = .070$
Total	$200/200 = 1.0$

As you can see, the relative frequency distribution highlights the proportion of the observations that fall into each class. In some situations, we may wish to highlight the proportion of observations that lie below each of the class limits. In such cases, we create the **cumulative relative frequency distribution**. Table 3.4 displays this type of distribution for Example 3.1.

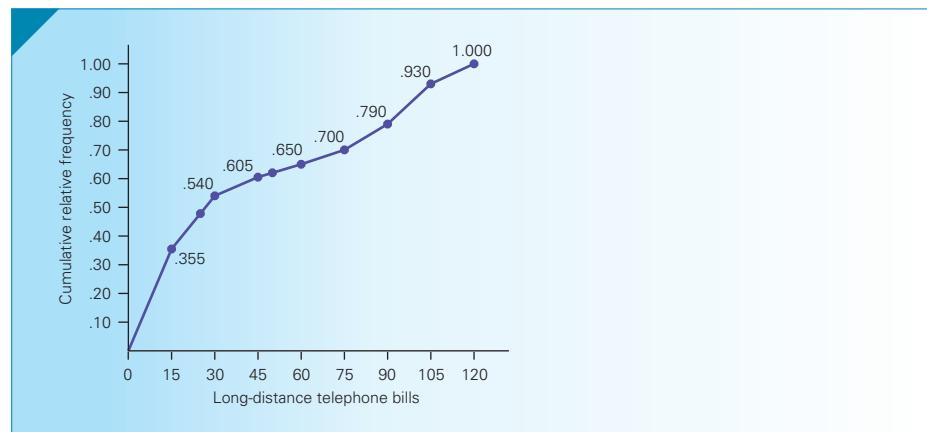
From Table 3.4, you can see that, for example, 54% of the bills were less than or equal to \$30 and that 79% of the bills were less than or equal to \$90.

Another way of presenting this information is the **ogive**, which is a graphical representation of the cumulative relative frequencies. Figure 3.8 is the manually drawn ogive for Example 3.1.

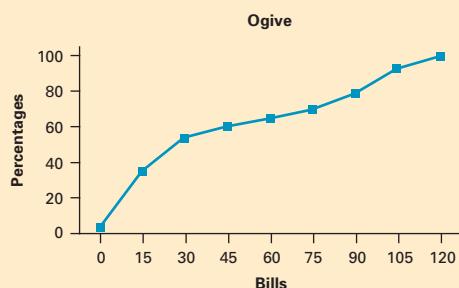
TABLE 3.4 Cumulative Relative Frequency Distribution for Example 3.1

CLASS LIMITS	RELATIVE FREQUENCY	CUMULATIVE RELATIVE FREQUENCY
0 to 15	$71/200 = .355$	$71/200 = .355$
15 to 30	$37/200 = .185$	$108/200 = .540$
30 to 45	$13/200 = .065$	$121/200 = .605$
45 to 60	$9/200 = .045$	$130/200 = .650$
60 to 75	$10/200 = .05$	$140/200 = .700$
75 to 90	$18/200 = .09$	$158/200 = .790$
90 to 105	$28/200 = .14$	$186/200 = .930$
105 to 120	$14/200 = .07$	$200/200 = 1.00$

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FIGURE 3.8 Ogive for Example 3.1

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EXCEL**INSTRUCTIONS**

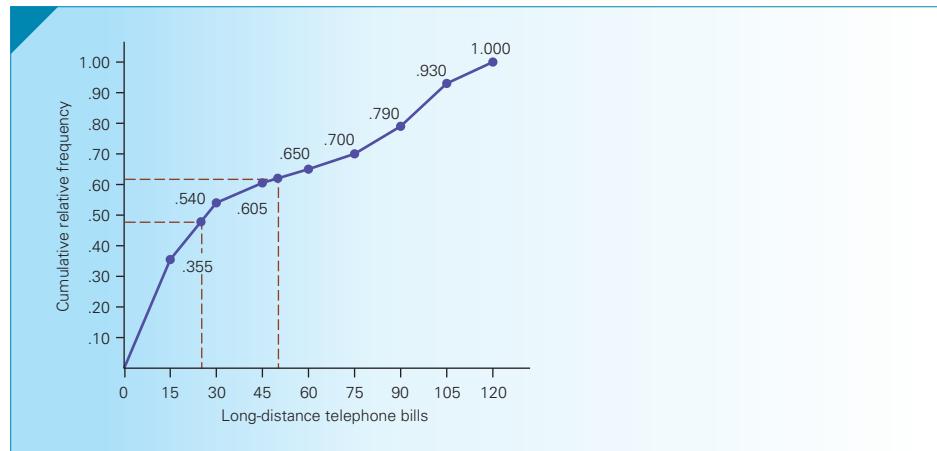
Follow instructions to create a histogram. Make the first bin's upper limit a number that is slightly smaller than the smallest number in the data set. Move the cursor to **Chart Output** and click. Do the same for **Cumulative Percentage**. Remove the "More" category. Click on any of the rectangles and click Delete. Change the **Scale**, if necessary. (Right-click the vertical or horizontal axis, click **Format Axis...**, and change the **Maximum** value of Y equal to 1.0.)

MINITAB

Minitab does not draw ogives.

We can use the ogive to estimate the cumulative relative frequencies of other values. For example, we estimate that about 62% of the bills lie below \$50 and that about 48% lie below \$25. (See Figure 3.9.)

FIGURE 3.9 Ogive with Estimated Relative Frequencies for Example 3.1



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Here is a summary of this section's techniques.

Factors That Identify When to Use a Histogram, Ogive, or Stem-and-Leaf Display

1. Objective: Describe a single set of data
2. Data type: Interval



EXERCISES

- 3.1 How many classes should a histogram contain if the number of observations is 250?
 - 3.2 Determine the number of classes of a histogram for 700 observations.
 - 3.3 A data set consists of 125 observations that range between 37 and 188.
 - a. What is an appropriate number of classes to have in the histogram?
 - b. What class intervals would you suggest?
 - 3.4 A statistics practitioner would like to draw a histogram of 62 observations that range from 5.2 to 6.1.
 - a. Construct a histogram.
 - b. Construct an ogive.
 - c. Describe the shape of the histogram.
- a. What is an appropriate number of class intervals?
 b. Define the upper limits of the classes you would use.
- 3.5 **X03-05** The number of items rejected daily by a manufacturer because of defects was recorded for the past 30 days. The results are as follows.
- | | | | | | | | | | | |
|---|----|----|----|----|----|----|----|----|----|---|
| 4 | 9 | 13 | 7 | 5 | 8 | 12 | 15 | 5 | 7 | 3 |
| 8 | 15 | 17 | 19 | 6 | 4 | 10 | 8 | 22 | 16 | 9 |
| 5 | 3 | 9 | 19 | 14 | 13 | 18 | 7 | | | |

- 3.6 Xr03-06** The final exam in a third-year organizational behavior course requires students to write several essay-style answers. The numbers of pages for a sample of 25 exams were recorded. These data are shown here.

5	8	9	3	12	8	5	7	3	8	9	5	2
7	12	9	6	3	8	7	10	9	12	7	3	

- Draw a histogram.
- Draw an ogive.
- Describe what you've learned from the answers to parts (a) and (b).

- 3.7 Xr03-07** A large investment firm on Wall Street wants to review the distribution of ages of its stock-brokers. The firm believes that this information can be useful in developing plans to recruit new brokers. The ages of a sample of 40 brokers are shown here.

46	28	51	34	29	40	38	33	41	52
53	40	50	33	36	41	25	38	37	41
36	50	46	33	61	48	32	28	30	49
41	37	26	39	35	39	46	26	31	35

- Draw a stem-and-leaf display.
- Draw a histogram.
- Draw an ogive.
- Describe what you have learned.

- 3.8 Xr03-08** The numbers of weekly sales calls by a sample of 30 telemarketers are listed here. Draw a histogram of these data and describe it.

14	8	6	12	21	4	9	3	25	17
9	5	8	18	16	3	17	19	10	15
5	20	17	14	19	7	10	15	10	8

- 3.9 Xr03-09** The amount of time (in seconds) needed to complete a critical task on an assembly line was measured for a sample of 50 assemblies. These data are as follows:

30.3	34.5	31.1	30.9	33.7
31.9	33.1	31.1	30.0	32.7
34.4	30.1	34.6	31.6	32.4
32.8	31.0	30.2	30.2	32.8
31.1	30.7	33.1	34.4	31.0
32.2	30.9	32.1	34.2	30.7
30.7	30.7	30.6	30.2	33.4
36.8	30.2	31.5	30.1	35.7
30.5	30.6	30.2	31.4	30.7
30.6	37.9	30.3	34.1	30.4

- Draw a stem-and-leaf display.
- Draw a histogram.
- Describe the histogram.

- 3.10 Xr03-10** A survey of individuals in a mall asked 60 people how many stores they will enter during this visit to the mall. The responses are listed here.

3	2	4	3	3	9
2	4	3	6	2	2
8	7	6	4	5	1
5	2	3	1	1	7
3	4	1	1	4	8
0	2	5	4	4	4
6	2	2	5	3	8
4	3	1	6	9	1
4	4	1	0	4	6
5	5	5	1	4	3

- Draw a histogram.
- Draw an ogive.
- Describe your findings.

- 3.11 Xr03-11** A survey asked 50 baseball fans to report the number of games they attended last year. The results are listed here. Use an appropriate graphical technique to present these data and describe what you have learned.

5	15	14	7	8
16	26	6	15	23
11	15	6	4	7
8	19	16	9	9
8	7	10	5	8
8	6	6	21	10
5	24	5	28	9
11	20	24	5	13
14	9	25	10	24
10	18	22	12	17

- 3.12 Xr03-12** To help determine the need for more golf courses, a survey was undertaken. A sample of 75 self-declared golfers was asked how many rounds of golf they played last year. These data are as follows:

18	26	16	35	30
15	18	15	18	29
25	30	35	14	20
18	24	21	25	18
29	23	15	19	27
28	9	17	28	25
23	20	24	28	36
20	30	26	12	31
13	26	22	30	29
26	17	32	36	24
29	18	38	31	36
24	30	20	13	23
3	28	5	14	24
13	18	10	14	16
28	19	10	42	22

- Draw a histogram.
- Draw a stem-and-leaf display.
- Draw an ogive.
- Describe what you have learned.

The following exercises require a computer and statistical software.

- 3.13 Xr03-13** The annual incomes for a sample of 200 first-year accountants were recorded. Summarize these data using a graphical method. Describe your results.
- 3.14 Xr03-14** The real estate board in a suburb of Los Angeles wanted to investigate the distribution of the prices (in \$ thousands) of homes sold during the past year.
- Draw a histogram.
 - Draw an ogive.
 - Draw a stem-and-leaf display (if your software allows it).
 - Describe what you have learned.
- 3.15 Xr03-15** The number of customers entering a bank in the first hour of operation for each of the last 200 days was recorded. Use a graphical technique to extract information. Describe your findings.
- 3.16 Xr03-16** The lengths of time (in minutes) to serve 420 customers at a local restaurant were recorded.
- How many bins should a histogram of these data contain?
 - Draw a histogram using the number of bins specified in part (a).
 - Is the histogram symmetric or skewed?
 - Is the histogram bell shaped?
- 3.17 Xr03-17** The marks of 320 students on an economics midterm test were recorded. Use a graphical technique to summarize these data. What does the graph tell you?
- 3.18 Xr03-18** The lengths (in inches) of 150 newborn babies were recorded. Use whichever graphical technique you judge suitable to describe these data. What have you learned from the graph?
- 3.19 Xr03-19** The number of copies made by an office copier was recorded for each of the past 75 days. Graph the data using a suitable technique. Describe what the graph tells you.
- 3.20 Xr03-20** Each of a sample of 240 tomatoes grown with a new type of fertilizer was weighed (in ounces) and recorded. Draw a histogram and describe your findings.
- 3.21 Xr03-21** The volume of water used by each of a sample of 350 households was measured (in gallons) and recorded. Use a suitable graphical statistical method to summarize the data. What does the graph tell you?
- 3.22 Xr03-22** The number of books shipped out daily by Amazon.com was recorded for 100 days. Draw a histogram and describe your findings.



GENERAL SOCIAL SURVEY EXERCISES 2012

- 3.23 GSS2012*** The GSS asked respondents to specify their highest year of school completed (EDUC).
- Is this type of data interval, ordinal, or nominal?
 - Use a graphical technique to present these data for the 2012 survey.
 - Briefly describe your results.
- 3.24 GSS2012*** Graphically display the results of the GSS 2012 question: On average days how many hours

do you spend watching television (TVHOURS)? Briefly describe what you have discovered.

- 3.25 GSS2012*** Employ a graphical technique to present the ages (AGE) of the respondents in the 2012 survey. Describe your results.
- 3.26 GSS2012*** If working, full or part time, how many hours did you work last week at all jobs (HRS1)? Summarize these data with a graphical technique.



GENERAL SOCIAL SURVEY EXERCISES 2010

- 3.27 GSS2010*** Graphically display the results of the GSS 2010 question, On average days how many hours do you spend watching television (TVHOURS)? Briefly describe what you have discovered.

- 3.28 GSS2010*** Employ a graphical technique to present the ages (AGE) of the respondents in the 2010 survey. Describe your results.

3-2 / DESCRIBING TIME-SERIES DATA

Besides classifying data by type, we can also classify them according to whether the observations are measured at the same time or whether they represent measurements at successive points in time. The former are called **cross-sectional data** and the latter **time-series data**.

The techniques described in Section 3-1 are applied to cross-sectional data. All the data, for Example 3.1, were probably determined within the same day. We can probably say the same thing for Examples 3.2 to 3.4.

To give another example, consider a real estate consultant who feels that the selling price of a house is a function of its size, age, and lot size. To estimate the specific form of the function, she samples say, 100 homes recently sold and records the price, size, age, and lot size for each home. These data are cross-sectional in that they all are observations at the same point in time. The real estate consultant is also working on a separate project to forecast the monthly housing starts in the northeastern United States over the next year. To do so, she collects the monthly housing starts in this region for each of the past 5 years. These 60 values (housing starts) represent time-series data, because they are observations taken over time.

Note that the original data may be interval or nominal. All of these illustrations deal with interval data. A time series can also list the frequencies and relative frequencies of a nominal variable over a number of time periods. For example, a brand-preference survey asks consumers to identify their favorite brand. These data are nominal. If we repeat the survey once a month for several years, the proportion of consumers who prefer a certain company's product each month would constitute a time series.

3-2a Line Chart

Time-series data are often graphically depicted on a **line chart**, which is a plot of the variable over time. It is created by plotting the value of the variable on the vertical axis and the time periods on the horizontal axis.

The chapter-opening example addresses the issue of the relationship between the price of gasoline and the price of oil. We will introduce the technique we need to answer the question in Section 3-3. Another question that arises is, is the recent price of gasoline high compared to the past prices?

EXAMPLE 3.5

DATA
Xm03-05

Price of Gasoline

We recorded the monthly average retail price of gasoline (in cents per gallon) since January 1976. The first 12 months and the last 12 months are displayed below. Draw a line chart to describe these data and briefly describe the results.

Year	Month	Price per Gallon (Cents)
1976	1	60.5
1976	2	60.0
1976	3	59.4
1976	4	59.2
1976	5	60.0
1976	6	61.6
1976	7	62.3

Year	Month	Price per Gallon (Cents)
1976	8	62.8
1976	9	63.0
1976	10	62.9
1976	11	62.9
1976	12	62.6
2012	1	339.9
2012	2	357.2
2012	3	386.8
2012	4	392.7
2012	5	379.2
2012	6	355.2
2012	7	345.1
2012	8	370.7
2012	9	385.6
2012	10	378.6
2012	11	348.8
2012	12	350.0

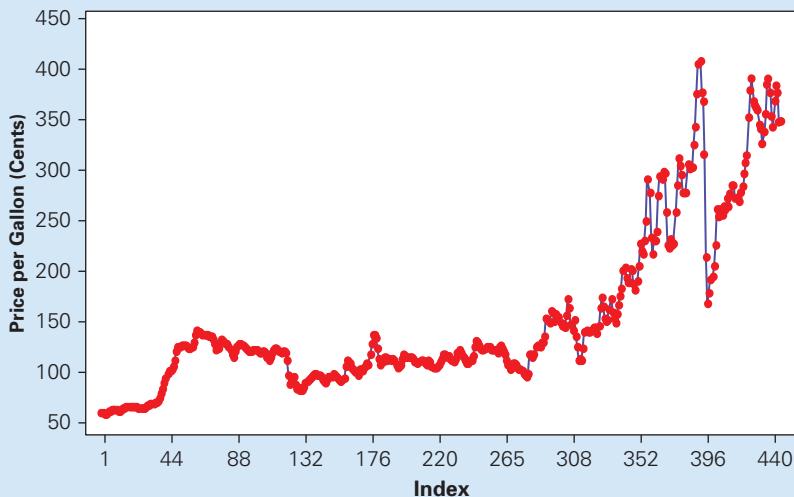
SOLUTION:

Here are the line charts produced by Excel and Minitab.

EXCEL**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm03-05](#).)
2. Highlight the column of data. Click **Insert**, **Line**, and the first **2-D Line**. Click **Chart Tools** and **Layout** to make whatever changes you wish.

You can draw two or more line charts (for two or more variables) by highlighting all columns of data you wish to graph.

MINITAB**Time-Series Plot of Price per Gallon (Cents)****INSTRUCTIONS**

1. Type or import the data into one column. (Open Xm03-05.)
2. Click **Graph** and **Time-Series Plot...** Click **Simple**.
3. In the **series** box type or use the **Select** button to specify the variable (**Price**). Click **Time/Scale**.
4. Click the **Time** tab and under **Time Scale** click **Index**.

INTERPRET

The price of gasoline rose from about \$.60 to over \$1.00 in the late 1970s (months 1 to 49), fluctuated between \$.90 and \$1.50 until 2000 (months 49 to 313), then rose rapidly to month 396, before dropping sharply. It started to rise again until the last month listed.

APPLICATIONS in ECONOMICS**Measuring Inflation: Consumer Price Index***

Inflation is the increase in the prices for goods and services. In most countries, inflation is measured using the Consumer Price Index (CPI). The Consumer Price Index works with a basket of some 300 goods and services in the United States (and a similar number in other countries), including such diverse items as food, housing, clothing, transportation, health, and recreation. The basket is defined for the “typical”

*Keller's website Appendix Index Numbers, located at www.cengage.com/bstatistics/keller, describes index numbers and how they are calculated.

or “average” middle-income family, and the set of items and their weights are revised periodically (every 10 years in the United States and every 7 years in Canada).

Prices for each item in this basket are computed on a monthly basis and the CPI is computed from these prices. Here is how it works. We start by setting a period of time as the base. In the United States the base is the years 1982–1984. Suppose that the basket of goods and services cost \$1,000 during this period. Thus, the base is \$1,000, and the CPI is set at 100. Suppose that in the next month (January 1985) the price increases to \$1,010. The CPI for January 1985 is calculated in the following way:

$$\text{CPI(January 1985)} = \frac{1,010}{1,000} \times 100 = 101$$

If the price increases to \$1,050 in the next month, the CPI is

$$\text{CPI(February 1985)} = \frac{1,050}{1,000} \times 100 = 105$$

The CPI, despite never really being intended to serve as the official measure of inflation, has come to be interpreted in this way by the general public. Pension-plan payments, old-age Social Security, and some labor contracts are automatically linked to the CPI and automatically indexed (so it is claimed) to the level of inflation. Despite its flaws, the CPI is used in numerous applications. One application involves adjusting prices by removing the effect of inflation, making it possible to track the “real” changes in a time series of prices.

In Example 3.5, the figures shown are the actual prices measured in what are called *current* dollars. To remove the effect of inflation, we divide the monthly prices by the CPI for that month and multiply by 100. These prices are then measured in *constant* 1982–1984 dollars. This makes it easier to see what has happened to the prices of the goods and services of interest.

We created two data sets to help you calculate prices in constant 1982–1984 dollars. File Ch03:\\CPI-Annual and Ch03:\\CPI-Monthly list the values of the CPI where 1982–1984 is set at 100 for annual values and monthly values, respectively.

EXAMPLE 3.6

DATA
Xm03-06

Price of Gasoline in 1982–1984 Constant Dollars

Remove the effect of inflation in Example 3.5 to determine whether gasoline prices are higher than they have been in the past.

SOLUTION:

Here are the 1976 to 2012 average monthly prices of gasoline, the CPI, and the adjusted prices.

The adjusted figures for all months were used in the line chart produced by Excel. Minitab’s chart is similar.

Year	Month	Price per Gallon (Cents)	CPI	Adjusted Price
1976	1	60.5	55.8	108.4
1976	2	60.0	55.9	107.3
1976	3	59.4	56.0	106.1
1976	4	59.2	56.1	105.5
1976	5	60.0	56.4	106.4
1976	6	61.6	56.7	108.6
1976	7	62.3	57.0	109.3
1976	8	62.8	57.3	109.6
1976	9	63.0	57.6	109.4
1976	10	62.9	57.9	108.6
1976	11	62.9	58.1	108.3
1976	12	62.6	58.4	107.2
2012	1	339.9	227.6	149.3
2012	2	357.2	228.3	156.5
2012	3	386.8	229.0	168.9
2012	4	392.7	229.0	171.5
2012	5	379.2	228.7	165.8
2012	6	355.2	228.9	155.2
2012	7	345.1	228.8	150.8
2012	8	370.7	230.0	161.2
2012	9	385.6	231.2	166.8
2012	10	378.6	231.6	163.5
2012	11	348.8	231.1	150.9
2012	12	350.0	231.1	151.4

EXCEL**INTERPRET**

Using constant 1982–1984 dollars, we can see that the average price of a gallon of gasoline hit its peak in the middle of 2008 (month 385). From there, it dropped rapidly and then rose more or less steadily until the end of 2012. At that point, the adjusted price was about the same as the adjusted price in 1978 (month 49).

There are two more factors to consider in judging whether the price of gasoline is high. The first is distance traveled and the second is fuel consumption. Exercise 3.41 deals with this issue.



EXERCISES

- 3.29 Xr03-29** The fees television broadcasters pay to cover the summer Olympic Games has become the largest source of revenue for the host country. Below we list the year, city, and revenue in millions of U.S. dollars paid by television broadcasters around the world. Draw a chart to describe these prices paid by the networks.

Year	City	Broadcast Revenue
1960	Rome	1.2
1964	Tokyo	1.6
1968	Mexico City	9.8
1972	Munich	17.8
1976	Montreal	34.9
1980	Moscow	88.0
1984	Los Angeles	266.9
1988	Seoul	402.6
1992	Barcelona	636.1
1996	Atlanta	898.3
2000	Sydney	1331.6
2004	Athens	1494.0
2008	Beijing	1737.0
2012	London	2642.7

- 3.30** The number of females enlisted in the U.S. army from 1971 to 2010 (in thousands) is listed here. Draw a line chart and describe what the chart tells you.

Year	Females Enlisted	Year	Females Enlisted
1971	11.8	1984	67.1
1972	12.3	1985	68.4
1973	16.5	1986	69.7
1974	26.3	1987	71.6
1975	37.7	1988	72.0
1976	43.8	1989	74.3
1977	46.1	1990	71.2
1978	50.5	1991	67.8
1979	55.2	1992	61.7
1980	61.7	1993	60.2
1981	65.3	1994	59.0
1982	64.1	1995	57.3
1983	66.5	1996	59.0

(Continued)

Year	Females Enlisted	Year	Females Enlisted
1997	62.4	2004	61.0
1998	61.4	2005	57.9
1999	61.5	2006	58.5
2000	62.9	2007	58.8
2001	63.4	2008	59.7
2002	63.2	2009	59.4
2003	63.5	2010	60.3

Source: *Statistical Abstract of the United States, 2012*, Table 510.

- 3.31 Xr03-31** The United States spends more money on health care than any other country. To gauge how fast costs are increasing the following table was produced, which lists the total health care expenditures in the United States annually for 1981 to 2009 (expenditures are in \$billions).

- Graphically present these data.
- Use the data in CPI-Annual to remove the effect of inflation. Graph the results and describe your findings.

Year	Health expenditures	Year	Health expenditures
1981	294	1996	1069
1982	331	1997	1125
1983	365	1998	1191
1984	402	1999	1265
1985	440	2000	1353
1986	472	2001	1470
1987	513	2002	1603
1988	574	2003	1732
1989	639	2004	1895
1990	714	2005	2021
1991	782	2006	2152
1992	849	2007	2284
1993	913	2008	2391
1994	962	2009	2486
1995	1017		

Source: *Statistical Abstract of the United States, 2012*, Table 135.

- 3.32 Xr03-32** The number of earned degrees (thousands) for males and females is listed below for the years 1987 to 2003. Graph both sets of data. What do the graphs tell you?

Year	Female	Male
1987	941	882
1988	954	881

Year	Female	Male
1989	986	887
1990	1035	905
1991	1097	928
1992	1147	961
1993	1182	985
1994	1211	995
1995	1223	995
1996	1255	993
1997	1290	998
1998	1304	994
1999	1330	993
2000	1369	1016
2001	1391	1025
2002	1441	1053
2003	1517	1104
2004	1603	1152
2005	1666	1185
2006	1725	1211
2007	1769	1238
2008	1819	1274
2009	1882	1323

Source: U.S. National Center for Education Statistics and *Statistical Abstract of the United States*, 2012, Table 299.

- 3.33 Xr03-33** The number of property crimes (burglary, larceny, theft, car theft) (in thousands) for the years 1992 to 2009 are listed next. Draw a line chart and interpret the results.

Year	Property Crimes	Year	Property Crimes
1992	12506	2001	10437
1993	12219	2002	10455
1994	12132	2003	10443
1995	12064	2004	10319
1996	11805	2005	10175
1997	11558	2006	10031
1998	10952	2007	9873
1999	10208	2008	9775
2000	10183	2009	9321

Source: U.S. Federal Bureau of Investigation and *Statistical Abstract of the United States*, 2012, Table 306.

- 3.34 Xr03-34** Refer to Exercise 3.33. Another way of measuring the number of property crimes is to calculate the number of crimes per 100,000 of population. This allows us to remove the effect of the

increasing population. Graph these data and interpret your findings.

Year	Property Crimes per 100,000	Year	Property Crimes per 100,000
1992	4868	2001	3658
1993	4740	2002	3631
1994	4660	2003	3591
1995	4591	2004	3514
1996	4451	2005	3432
1997	4316	2006	3358
1998	4053	2007	3277
1999	3744	2008	3212
2000	3618	2009	3036

Source: U.S. Federal Bureau of Investigation and *Statistical Abstract of the United States*, 2012, Table 306.

- 3.35 Xr03-35** The gross national product (GNP) is the sum total of the economic output of the citizens (nationals) of a country. It is an important measure of the wealth of a country. The following table lists the year and the GNP in billions of current dollars for the United States.

- Graph the GNP. What have you learned?
- Use the data in CPI-Annual to compute the per capita GNP in constant 1982–1984 dollars. Graph the results and describe your findings.

Year	GNP	Year	GNP
1980	2822	1996	7870
1981	3160	1997	8356
1982	3290	1998	8811
1983	3572	1999	9381
1984	3967	2000	9989
1985	4244	2001	10338
1986	4478	2002	10691
1987	4754	2003	11211
1988	5124	2004	11959
1989	5508	2005	12736
1990	5835	2006	13471
1991	6022	2007	14193
1992	6371	2008	14583
1993	6699	2009	14117
1994	7109	2010	14708
1995	7444	2011	15328

Source: U.S. Bureau of Economic Activity.

- 3.36 Xr03-36** The average daily U.S. oil consumption and production (thousands of barrels) is shown for the years 1973 to 2011. Use a graphical technique to describe these figures. What does the graph tell you?

Year	1973	1974	1975	1976	1977	1978	1979	1980	1981	1982
Consumption	17,318	16,655	16,323	17,460	18,443	18,857	18,527	17,060	16,061	15,301
Production	9209	8776	8376	8132	8245	8706	8551	8597	8572	8649
Year	1983	1984	1985	1986	1987	1988	1989	1990	1991	1992
Consumption	15,228	15,722	15,726	16,277	16,666	17,284	17,327	16,988	16,710	17,031
Production	8689	8879	8972	8683	8349	8140	7615	7356	7418	7172
Year	1993	1994	1995	1996	1997	1998	1999	2000	2001	2002
Consumption	17,328	17,721	17,730	18,308	18,618	18,913	19,515	19,699	19,647	19,758
Production	6847	6662	6561	6465	6452	6253	5882	5822	5801	5746
Year	2003	2004	2005	2006	2007	2008	2009	2010	2011	
Consumption	20,034	20,731	20,799	20,686	20,684	19,496	18,771	19,178	18,949	
Production	5645	5435	5147	5088	5077	4999	5352	5479	5656	

Source: U.S. Department of Energy: Monthly Energy Review.

- 3.37** *Xr03-37* The table below lists the value (\$millions) of new residential construction in the United States between 1981 and 2010. Graph these data and describe what you have learned.

Year	Value of New Residential Construction
1981	99,241
1982	84,676
1983	125,833
1984	155,015
1985	160,520
1986	190,677
1987	199,652
1988	204,496
1989	204,255
1990	191,103
1991	166,251
1992	199,393
1993	225,067
1994	258,561
1995	247,351
1996	281,115
1997	289,014
1998	314,607

Value of New Residential Construction

1999	350,562
2000	374,457
2001	388,324
2002	396,696
2003	446,035
2004	532,900
2005	611,899
2006	613,731
2007	493,246
2008	350,257
2009	245,621
2010	241,690

Source: *Statistical Abstract of the United States, 2012*, Table 963.

- 3.38** *Xr03-38* How has the size of government changed? To help answer this question we recorded the U.S. federal budget receipts and outlays (billions of current dollars) for the years 1980 to 2011.

- Use a graphical technique to describe the receipts and outlays of the annual U.S. federal government budgets since 1980.
- Calculate the difference between receipts and outlays. If the difference is positive the result is a surplus; if the difference is negative the results is a deficit. Graph the surplus/deficit variable and describe the results.

Year	1980	1981	1982	1983	1984	1985	1986	1987	1988	1989	1990
Receipts	517.1	599.3	617.8	600.6	666.5	734.1	769.2	854.4	909.3	991.2	1032.0
Outlays	590.9	678.2	745.7	808.4	851.9	946.4	990.4	1004.1	1064.5	1143.6	1253.2
Year	1991	1992	1993	1994	1995	1996	1997	1998	1999	2000	2001
Receipts	1055.0	1091.3	1154.4	1258.6	1351.8	1453.1	1579.3	1721.8	1827.5	2052.2	1991.2
Outlays	1324.4	1381.7	1409.5	1461.9	1515.8	1560.5	1601.3	1652.6	1701.9	1789.1	1863.9
Year	2002	2003	2004	2005	2006	2007	2008	2009	2010	2011	
Receipts	1853.2	1782.3	1880.1	2153.6	2406.9	2568.0	2524.0	2105.0	2162.7	2173.7	
Outlays	2011.0	2159.9	2292.8	2472.0	2655.0	2728.7	2982.5	3517.7	3456.2	3818.8	

Source: *Statistical Abstract of the United States, 2012*, Table 469.

3.39 Refer to Exercise 3.38. Another way of judging the size of budget surplus/deficits is to calculate the deficit as a percentage of GNP. Use the data in Exercises 3.35 and 3.38 to calculate this variable and use a graphical technique to display the results.

3.40 Repeat Exercise 3.39 using the CPI-Annual file to convert all amounts to constant 1982–1984 dollars. Draw a line chart to show these data.

3.41 **Xr03-41** Refer to Example 3.5. The following table lists the average gasoline consumption in miles per gallon (MPG) and the average distance (thousands of miles) driven by cars in each of the years 1980 to 2009. (The file contains the average price of gasoline for each year, the annual CPI (stored in CPI-Annual.xlsx), fuel consumption and distance (thousands.) For each year, calculate the inflation-adjusted cost per year of driving. Use a graphical technique to present the results.

Year	1980	1981	1982	1983	1984	1985	1986	1987	1988	1989
MPG	13.3	13.6	14.1	14.2	14.5	14.6	14.7	15.1	15.6	15.9
Distance	9.5	9.5	9.6	9.8	10.0	10.0	10.1	10.5	10.7	10.9
Year	1990	1991	1992	1993	1994	1995	1996	1997	1998	1999
MPG	16.4	16.9	16.9	16.7	16.7	16.8	16.9	17.0	16.9	17.7
Distance	11.1	11.3	11.6	11.6	11.7	11.8	11.8	12.1	12.2	12.2
Year	2000	2001	2002	2003	2004	2005	2006	2007	2008	2009
MPG	16.9	17.1	16.9	17.0	17.1	17.2	17.2	17.2	17.4	17.7
Distance	12.2	11.9	12.2	12.2	12.2	12.1	12.0	11.9	11.6	11.6

Source: *Statistical Abstract of the United States, 2012*, Tables 1101 and 1102.

The following exercises require a computer and software.

3.42 **Xr03-42** The monthly value of U.S. exports to Canada (in \$millions) and imports from Canada from 1985 to 2012 were recorded.

- Draw a line chart of U.S. exports to Canada.
- Draw a line chart of U.S. imports from Canada.
- Calculate the trade balance and draw a line chart.
- What do all the charts reveal?

Source: Federal Reserve Economic Data.

3.43 **Xr03-43** The monthly value of U.S. exports to Japan (in \$millions) and imports from Japan from 1974 to 2012 were recorded.

- Draw a line chart of U.S. exports to Japan.
- Draw a line chart of U.S. imports from Japan.
- Calculate the trade balance and draw a line chart.
- What do all the charts reveal?

Source: Federal Reserve Economic Data.

3.44 **Xr03-44** The value of the Canadian dollar in U.S. dollars was recorded monthly for the period 1971 to 2012. Draw a graph of these figures and interpret your findings.

3.45 **Xr03-45** The value of the Japanese yen in U.S. dollars was recorded monthly for the period 1971 to 2012. Draw a graph of these figures and interpret your findings.

- 3.46 Xr03-46** The Dow Jones Industrial Average was recorded monthly for the years 1950 to 2012. Use a graph to describe these numbers.

Source: The Wall Street Journal.

- 3.47** Refer to Exercise 3.46. Use the CPI-monthly file to measure the Dow Jones Industrial Average in 1982–1984 constant dollars. What have you learned?

3-3 / DESCRIBING THE RELATIONSHIP BETWEEN TWO INTERVAL VARIABLES

Statistics practitioners frequently need to know how two interval variables are related. For example, financial analysts need to understand how the returns of individual stocks are related to the returns of the entire market. Marketing managers need to understand the relationship between sales and advertising. Economists develop statistical techniques to describe the relationship between such variables as unemployment rates and inflation. The technique is called a **scatter diagram**.

To draw a scatter diagram, we need data for two variables. In applications where one variable depends to some degree on the other variable, we label the dependent variable Y and the other, called the *independent variable*, X . For example, an individual's income depends somewhat on the number of years of education. Accordingly, we identify income as the dependent variable and label it Y , and we identify years of education as the independent variable and label it X . In other cases where no dependency is evident, we label the variables arbitrarily.

EXAMPLE 3.7

DATA
Xm03-07

Analyzing the Relationship between Price and Size of House

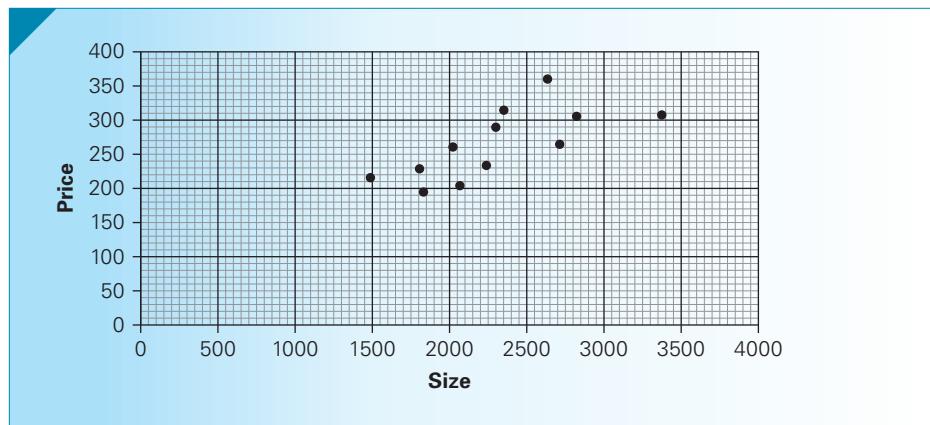
A real estate agent wanted to know to what extent the selling price of a home is related to its size. To acquire this information, he took a sample of 12 homes that had recently sold, recording the price in thousands of dollars and the size in square feet. These data are listed in the accompanying table. Use a graphical technique to describe the relationship between size and price.

Size (ft ²)	Price (\$1,000)
2,354	315
1,807	229
2,637	355
2,024	261
2,241	234
1,489	216
3,377	308
2,825	306
2,302	289
2,068	204
2,715	265
1,833	195

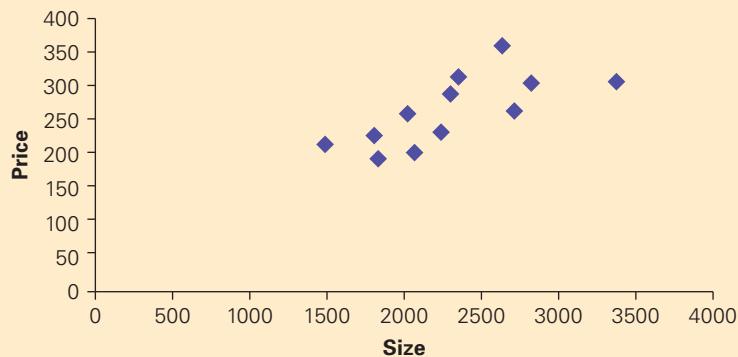
SOLUTION:

Using the guideline just stated, we label the price of the house Y (dependent variable) and the size X (independent variable). Figure 3.10 depicts the scatter diagram.

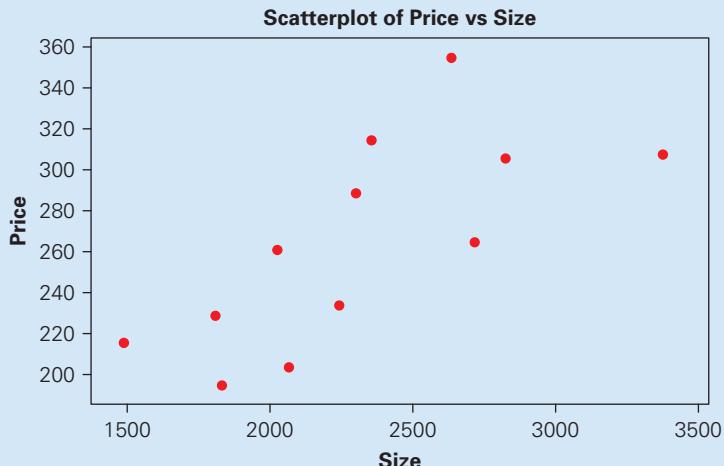
FIGURE 3.10 Scatter Diagram for Example 3.7



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EXCEL**INSTRUCTIONS**

1. Type or import the data into two adjacent columns. Store variable X in the first column and variable Y in the next column. ([Open Xm03-07](#).)
2. Click **Insert** and **Scatter**.
3. To make cosmetic changes, click **Chart Tools** and **Layout**. (We chose to add titles and remove the gridlines.) If you wish to change the scale, click **Axes**, **Primary Horizontal Axis** or **Primary Vertical Axis**, **More Primary Horizontal or Vertical Axis Options . . .**, and make the changes you want.

MINITAB**INSTRUCTIONS**

1. Type or import the data into two columns. ([Open Xm03-07.](#))
2. Click **Graph** and **Scatterplot . . .**
3. Click Simple.
4. Type or use the **Select** button to specify the variable to appear on the *Y*-axis (**Price**) and the *X*-axis (**Size**).

INTERPRET

The scatter diagram reveals that, in general, the greater the size of the house, the greater the price. However, there are other variables that determine price. Further analysis may reveal what these other variables are.

3-3a Patterns of Scatter Diagrams

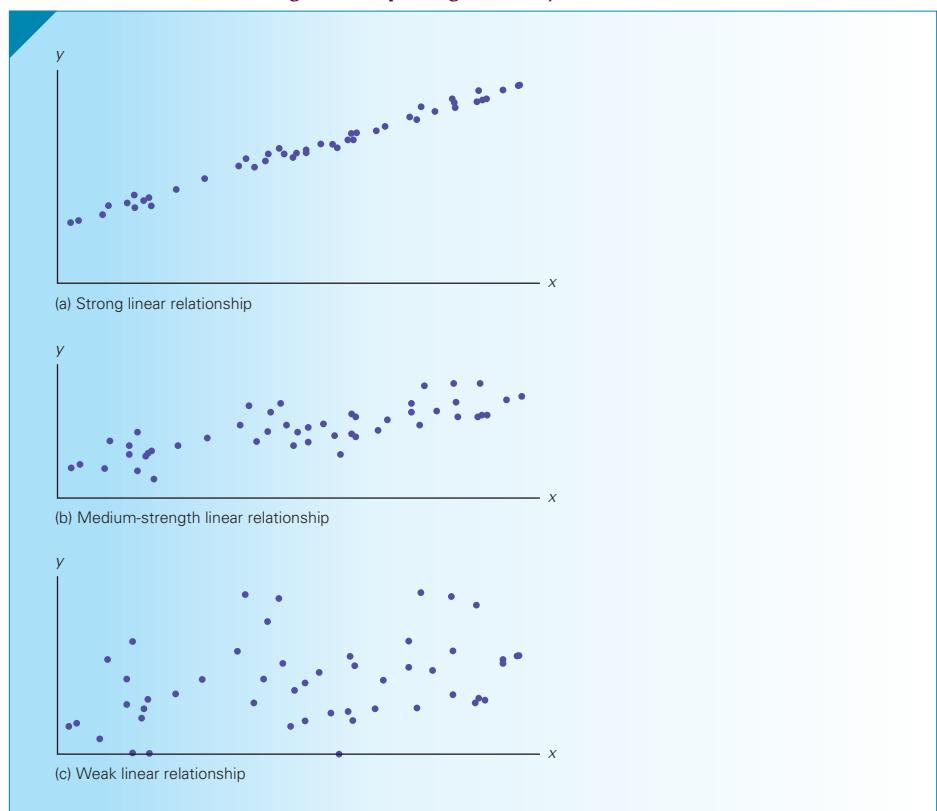
As was the case with histograms, we frequently need to describe verbally how two variables are related. The two most important characteristics are the strength and direction of the linear relationship.

3-3b Linearity

To determine the strength of the linear relationship, we draw a straight line through the points in such a way that the line represents the relationship. If most of the points fall close to the line, we say that there is a **linear relationship**. If most of the points appear to be scattered randomly with only a semblance of a straight line, there is no, or at best, a weak linear relationship. Figure 3.11 depicts several scatter diagrams that exhibit various levels of linearity.

In drawing the line freehand, we would attempt to draw it so that it passes through the middle of the data. Unfortunately, different people drawing a straight line through the same set of data will produce somewhat different lines. Fortunately, statisticians have produced an objective way to draw the straight line. The method is called the *least squares method*, and it will be presented in Chapter 4 and employed in Chapters 16, 17, and 18.

FIGURE 3.11 Scatter Diagrams Depicting Linearity



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Note that there may well be some other type of relationship, such as a quadratic or exponential one.

3-3c Direction

In general, if one variable increases when the other does, we say that there is a **positive linear relationship**. When the two variables tend to move in opposite directions, we describe the nature of their association as a **negative linear relationship**. (The terms *positive* and *negative* will be explained in Chapter 4.) See Figure 3.12 for examples of scatter diagrams depicting a positive linear relationship, a negative linear relationship, no relationship, and a nonlinear relationship.

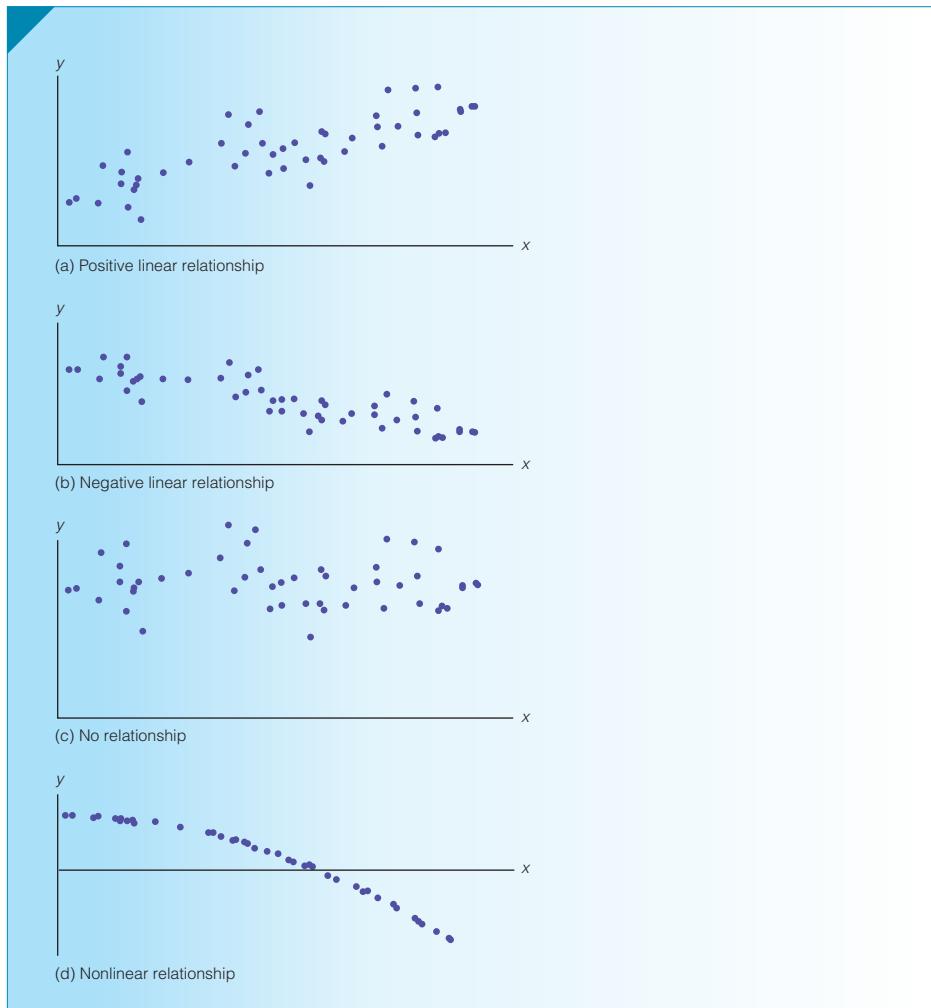
3-3d Interpreting a Strong Linear Relationship

In interpreting the results of a scatter diagram it is important to understand that if two variables are linearly related it does not mean that one is causing the other. In fact, we can never conclude that one variable causes another variable. We can express this more eloquently as

Correlation is not causation.

Now that we know what to look for, we can answer the chapter-opening example.

FIGURE 3.12 Scatter Diagrams Describing Direction



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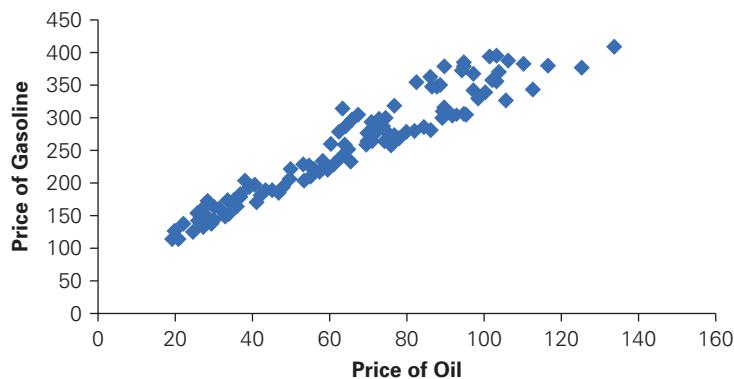
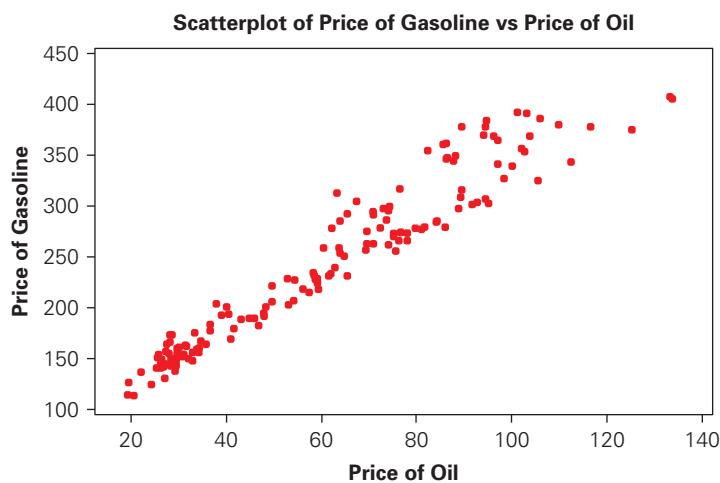
Were Oil Companies Gouging Customers 2000–2012: Solution

To determine whether drivers' perceptions that oil companies were gouging consumers we need to determine whether and to what extent the two variables are related. The appropriate statistical technique is the scatter diagram.

We label the price of gasoline Y and the price of oil X .



Comstock Images/Getty Images

EXCEL**MINITAB****INTERPRET**

The scatter diagram reveals that the two prices are strongly related linearly. When the price of oil was below \$60, the relationship between the two was stronger than when the price of oil exceeded \$60.

We close this section by reviewing the factors that identify the use of the scatter diagram.

Factors that Identify When to Use a Scatter Diagram

1. **Objective:** Describe the relationship between two variables
2. **Data type:** Interval



EXERCISES

- 3.48 Xr03-48** Black Friday in the United States is the day after Thanksgiving. Many retailers offer door-crasher specials to induce customers to shop at their stores. The number of door-crasher specials is limited. However, the sale price is so low that people who want to buy that item often line up outside the store to wait for it to open. A random sample of Black Friday shoppers was asked how long they waited outside for the store to open (hours) and the amount they expected to save by buying the door-crasher special. Graph the data and describe what you have learned from the graph.

Time	3.0	2.5	1.5	5.0	3.0	4.5	7.0	0.5	6.5	6.0
Savings	325	250	275	150	225	350	375	100	400	350

- 3.49 Xr03-49** Because inflation reduces the purchasing power of the dollar, investors seek investments that will provide higher returns when inflation is higher. It is frequently stated that common stocks provide just such a hedge against inflation. The annual percentage rates of return on common stock and annual inflation rates for a recent 10-year period are listed here.

Year	1	2	3	4	5	6	7	8	9	10
Returns	25	8	6	11	21	-15	12	-1	33	0
Inflation	4.4	4.2	4.1	4.0	5.2	5.0	3.8	2.1	1.7	0.2

- Use a graphical technique to depict the relationship between the two variables.
- Does it appear that the returns on common stocks and inflation are linearly related?

- 3.50 Xr03-50** In a university where calculus is a prerequisite for the statistics course, a sample of 15 students was drawn. The marks for calculus and statistics were recorded for each student. The data are as follows:

Calculus	65	58	93	68	74	81	58	85
Statistics	74	72	84	71	68	85	63	73
Calculus	88	75	63	79	80	54	72	
Statistics	79	65	62	71	74	68	73	

- Draw a scatter diagram of the data.
- What does the graph tell you about the relationship between the marks in calculus and statistics?

- 3.51 Xr03-51** The cost of repairing cars involved in accidents is one reason that insurance premiums are so

high. In an experiment, 10 cars were driven into a wall. The speeds were varied between 2 and 20 mph. The costs of repair were estimated and are listed here. Draw an appropriate graph to analyze the relationship between the two variables. What does the graph tell you?

Speed	2	4	6	8	10	12
Cost of Repair (\$)	88	124	358	519	699	816
Speed	14	16	18	20		
Cost of Repair (\$)	905	1,521	1,888	2,201		

- 3.52 Xr03-52** The growing interest in and use of the Internet have forced many companies into considering ways to sell their products on the Web. Therefore, it is of interest to these companies to determine who is using the Web. A statistics practitioner undertook a study to determine how education and Internet use are connected. She took a random sample of 15 adults (20 years of age and older) and asked each to report the years of education they had completed and the number of hours of Internet use in the previous week. These data follow.

- Employ a suitable graph to depict the data.
- Does it appear that there is a linear relationship between the two variables? If so, describe it.

Education	11	11	8	13	17	11	11	11
Internet use	10	5	0	14	24	0	15	12
Education	19	13	15	9	15	15	11	
Internet use	20	10	5	8	12	15	0	

- 3.53 Xr03-53** A statistics professor formed the opinion that students who handed in quiz and exams early outperformed students who handed in their papers later. To develop data to decide whether her opinion is valid, she recorded the amount of time (in minutes) taken by students to submit their midterm tests (time limit 90 minutes) and the subsequent mark for a sample of 12 students.

Time	90	73	86	85	80	87	90	78	84	71	72	88
Mark	68	65	58	94	76	91	62	81	75	83	85	74

The following exercises require a computer and software.

- 3.54 Xr03-54** In an attempt to determine the factors that affect the amount of energy used, 200 households were analyzed. The number of occupants and the amount of electricity used were measured for each household.

- Draw a graph of the data.
- What have you learned from the graph?

3.55 Xr03-55 Many downhill skiers eagerly look forward to the winter months and fresh snowfalls. However, winter also entails cold days. How does the temperature affect skiers' desire? To answer this question, a local ski resort recorded the temperature for 50 randomly selected days and the number of lift tickets they sold. Use a graphical technique to describe the data and interpret your results.

3.56 Xr03-56 One general belief held by observers of the business world is that taller men earn more money than shorter men. In a University of Pittsburgh study, 250 MBA graduates, all about 30 years old, were polled and asked to report their height (in inches) and their annual income (to the nearest \$1,000).

- Draw a scatter diagram of the data.
- What have you learned from the scatter diagram?

3.57 Xr03-57 Do chief executive officers (CEOs) of publicly traded companies earn their compensation? Every year the *National Post's Business* magazine attempts to answer the question by reporting the CEO's annual compensation (\$1,000), the profit (or loss) (\$1,000), and the three-year share return (%) for the top 50 Canadian companies. Use a graphical technique to answer the question.

3.58 Xr03-58 Are younger workers less likely to stay with their jobs? To help answer this question, a random sample of workers was selected. All were asked to report their ages and how many months they had been employed with their current employers. Use a graphical technique to summarize these data.

Source: Adapted from *Statistical Abstract of the United States, 2012*, Table 612.

3.59 Xr03-59 A very large contribution to profits for a movie theater is the sales of popcorn, soft drinks, and candy. A movie theater manager speculated that the longer the time between showings of a movie, the greater the sales of concession items. To acquire more information, the manager conducted an experiment. For a month he varied the amount of time between movie showings and calculated the sales. Use a graphical technique to help the manager determine whether longer time gaps produces higher concession stand sales.

3.60 Xr03-60 An analyst employed at a commodities trading firm wanted to explore the relationship between prices of grains and livestock. Theoretically, the prices should move in the same direction because, as the price of livestock increases, more livestock are bred, resulting in a greater demand for grains to feed them. The analyst recorded the monthly grains and livestock subindexes for 1971 to 2008. (Subindexes are based on the prices of several similar commodities. For example, the livestock subindex represents the prices of cattle and hogs.) Using a graphical technique, describe the relationship between the two subindexes and report your findings.

Source: Bridge Commodity Research Bureau.

3.61 Xr03-61 It is generally believed that higher interest rates result in less employment because companies are more reluctant to borrow to expand their business. To determine whether there is a relationship between bank prime rate and unemployment, an economist collected the monthly prime bank rate and the monthly unemployment rate for the years 1950 to 2012. Use a graphical technique to supply your answer.

Source: Federal Reserve Economic Data: St. Louis Fed.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

3.62 ANES2004* Do younger people have more education (EDUC) than older people (AGE)? Use the American National Election Survey from 2004 and a graphical technique to help answer the question.

In the 2008 survey, American adults were asked to report the amount of time (in minutes) that each person spent in an average day watching, reading, or listening about news in four different media. They are

Internet (TIME1)

Television (TIME2)

Printed newspaper (TIME3)
Radio (TIME4)

3.63 ANES2008* Use a graphical technique to determine whether people who spend more time reading news on the Internet also devote more time to watching news on television.

3.64 ANES2008* Analyze the relationship between the amount of time reading news on the Internet and reading news in a printed newspaper. Does it appear that they are linearly related?

- 3.65 ANES2008*** Refer to Exercise 3.64. Study the scatter diagram. Does it appear that something is wrong with the data? If so, how do you correct the problem and determine whether a linear relationship exists?
- 3.66 ANES2008*** Graphically describe the relationship between the amount of time watching news on

television and listening to news on the radio. Are the two linearly related?

- 3.67 ANES2008*** Do younger people spend more time reading news on the Internet than older people? Use a graphical technique to help answer the question.



GENERAL SOCIAL SURVEY EXERCISES

- 3.68 GSS2012*** Do more educated people tend to marry people with more education? Draw a scatter diagram of EDUC and SPEDUC to answer the question.
- 3.69 GSS2012*** Do the children of more educated men (PAEDUC) have more education (EDUC)? Produce a graph that helps answer the question.

- 3.70 GSS2012*** Is there a positive linear relationship between the amount of education of mothers (MAEDUC) and their children (EDUC)? Draw a scatter diagram to answer the question.

- 3.71 GSS2012*** If one member of a married couple works more hours (HRS) does his or her spouse work less hours (SPHRS)? Draw a graph to produce the information you need.

3-4 ART AND SCIENCE OF GRAPHICAL PRESENTATIONS

In this chapter and in Chapter 2, we introduced a number of graphical techniques. The emphasis was on how to construct each one manually and how to command the computer to draw them. In this section, we discuss how to use graphical techniques effectively. We introduce the concept of **graphical excellence**, which is a term we apply to techniques that are informative and concise and that impart information clearly to their viewers. Additionally, we discuss an equally important concept: graphical integrity and its enemy **graphical deception**.

3-4a Graphical Excellence

Graphical excellence is achieved when the following characteristics apply.

- 1. The graph presents large data sets concisely and coherently.** Graphical techniques were created to summarize and describe large data sets. Small data sets are easily summarized with a table. One or two numbers can best be presented in a sentence.
- 2. The ideas and concepts the statistician wants to deliver are clearly understood by the viewer.** The chart is designed to describe what would otherwise be described in words. An excellent chart is one that can replace thousand words and still be clearly comprehended by its readers.
- 3. The graph encourages the viewer to compare two or more variables.** Graphs displaying only one variable provide very little information. Graphs are often best used to depict relationships between two or more variables or to explain how and why the observed results occurred.
- 4. The display induces the viewer to address the substance of the data and not the form of the graph.** The form of the graph is supposed to help present

the substance. If the form replaces the substance, the chart is not performing its function.

- 5.** **There is no distortion of what the data reveal.** You cannot make statistical techniques say whatever you like. A knowledgeable reader will easily see through distortions and deception. We will endeavor to make you a knowledgeable reader by describing graphical deception later in this section.

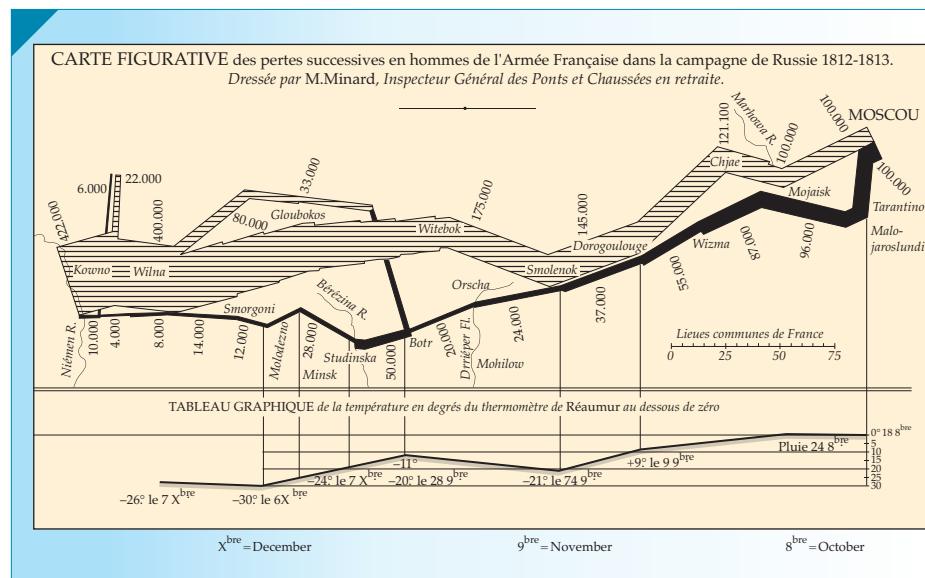
Edward Tufte, professor of statistics at Yale University, summarized graphical excellence this way:

1. Graphical excellence is the well-designed presentation of interesting data—a matter of substance, of statistics, and of design.
2. Graphical excellence is that which gives the viewer the greatest number of ideas in the shortest time with the least ink in the smallest space.
3. Graphical excellence is nearly always multivariate.
4. Graphical excellence requires telling the truth about the data.

Now let's examine the chart that has been acclaimed the best chart ever drawn.

Figure 3.13 depicts Minard's graph. The striped band is a time series depicting the size of the army at various places on the map, which is also part of the chart.

FIGURE 3.13 Chart Depicting Napoleon's Invasion and Retreat from Russia in 1812



Source: Edward Tufte, *The Visual Display of Quantitative Information* (Cheshire, CT: Graphics Press, 1983), p. 41.

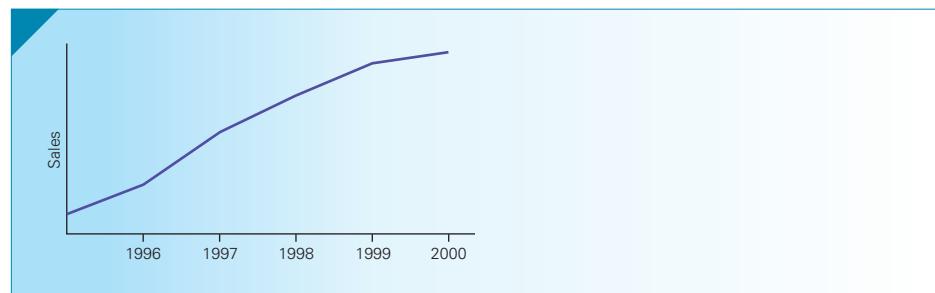
When Napoleon invaded Russia by crossing the Niemen River on June 21, 1812, there were 422,000 soldiers. By the time the army reached Moscow, the number had dwindled to 100,000. At that point, the army started its retreat. The black band represents the army in retreat. At the bottom of the chart, we see the dates starting with October 1813. Just above the dates, Minard drew another time series, this one showing the temperature. It was bitterly cold during the fall, and many soldiers died of exposure. As you can see, the temperature dipped to -30° on December 6. The chart is effective because it depicts five variables clearly and succinctly.

3-4b Graphical Deception

The use of graphs and charts is pervasive in newspapers, magazines, business and economic reports, and seminars, in large part because of the increasing availability of computers and software that allow the storage, retrieval, manipulation, and summary of large masses of raw data. It is therefore more important than ever to be able to evaluate critically the information presented by means of graphical techniques. In the final analysis, graphical techniques merely create a visual impression, which is easy to distort. In fact, distortion is so easy and commonplace that in 1992, the Canadian Institute of Chartered Accountants found it necessary to begin setting guidelines for financial graphics, after a study of hundreds of the annual reports of major corporations found that 8% contained at least one misleading graph that covered up bad results. Although the heading for this section mentions deception, it is quite possible for an inexperienced person inadvertently to create distorted impressions with graphs. In any event, you should be aware of possible methods of graphical deception. This section illustrates a few of them.

The first thing to watch for is a graph without a scale on one axis. The line chart of a firm's sales in Figure 3.14 might represent a growth rate of 100% or 1% over the 5 years depicted, depending on the vertical scale. It is best simply to ignore such graphs.

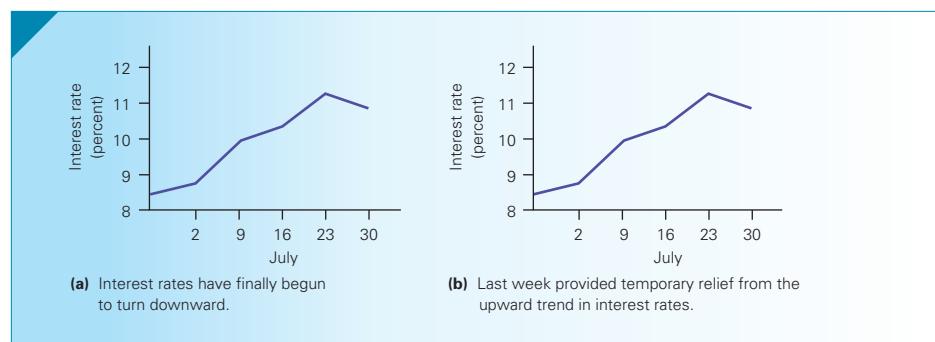
FIGURE 3.14 Graph without Scale



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A second trap to avoid is being influenced by a graph's caption. Your impression of the trend in interest rates might be different, depending on whether you read a newspaper carrying caption (a) or caption (b) in Figure 3.15.

FIGURE 3.15 Graphs with Different Captions

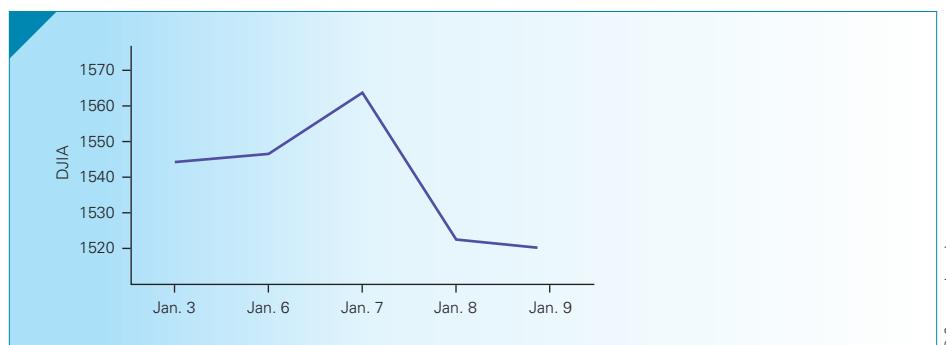


© Cengage Learning

Perspective is often distorted if only absolute changes in value, rather than percentage changes, are reported. A \$1 drop in the price of your \$2 stock is relatively

more distressing than a \$1 drop in the price of your \$100 stock. On January 9, 1986, newspapers throughout North America displayed graphs similar to the one shown in Figure 3.16 and reported that the stock market, as measured by the Dow Jones Industrial Average (DJIA), had suffered its worst 1-day loss ever on the previous day. The loss was 39 points, exceeding even the loss of Black Tuesday: October 28, 1929. While the loss was indeed a large one, many news reports failed to mention that the 1986 level of the DJIA was much higher than the 1929 level. A better perspective on the situation could be gained by noticing that the loss on January 8, 1986, represented a 2.5% decline, whereas the decline in 1929 was 12.8%. As a point of interest, we note that the stock market was 12% higher within 2 months of this historic drop and 40% higher 1 year later. The largest one-day percentage drop in the DJIA is 24.4% (December 12, 1914).

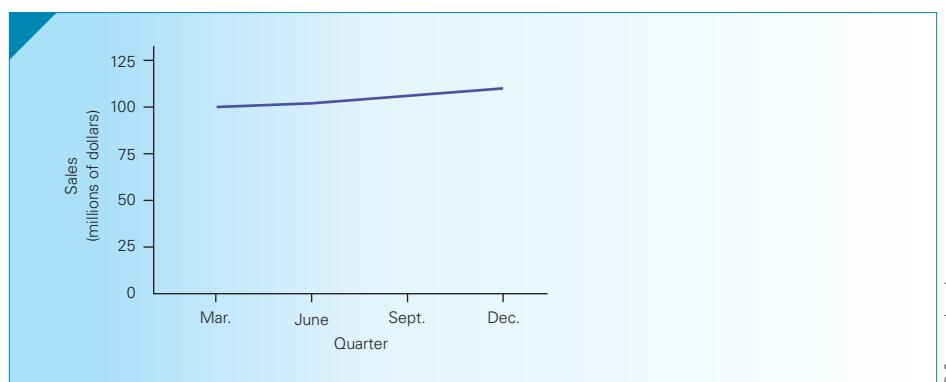
FIGURE 3.16 Graph Showing Drop in the DJIA



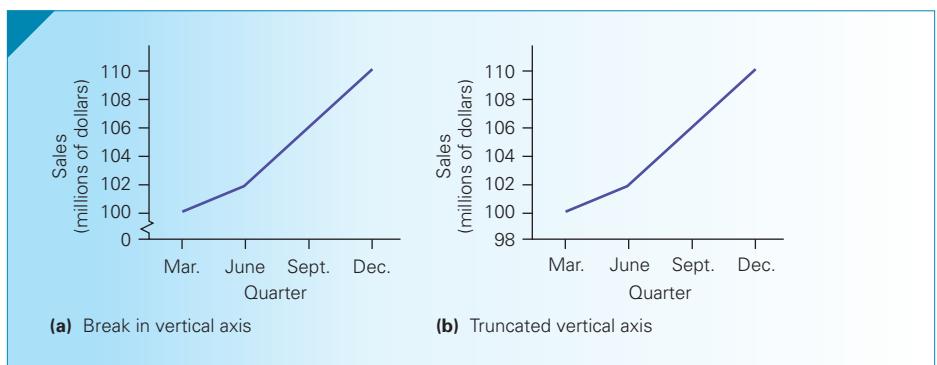
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We now turn to some rather subtle methods of creating distorted impressions with graphs. Consider the graph in Figure 3.17, which depicts the growth in a firm's quarterly sales during the past year, from \$100 million to \$110 million. This 10% growth in quarterly sales can be made to appear more dramatic by stretching the vertical axis—a technique that involves changing the scale on the vertical axis so that a given dollar amount is represented by a greater height than before. As a result, the rise in sales appears to be greater because the slope of the graph is visually (but not numerically) steeper. The expanded scale is usually accommodated by employing a break in the vertical axis, as in Figure 3.18(a), or by truncating the vertical axis, as in Figure 3.18(b), so that the vertical scale begins at a point greater than zero. The effect of making slopes

FIGURE 3.17 Graph Showing Growth in Quarterly Sales 1



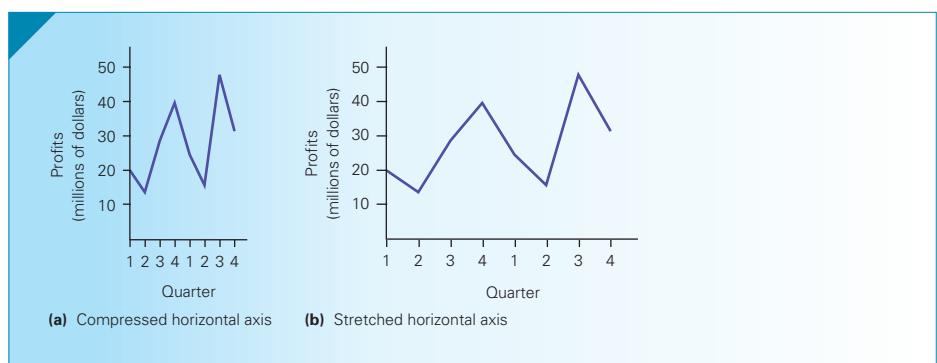
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FIGURE 3.18 Graph Showing Growth in Quarterly Sales 2

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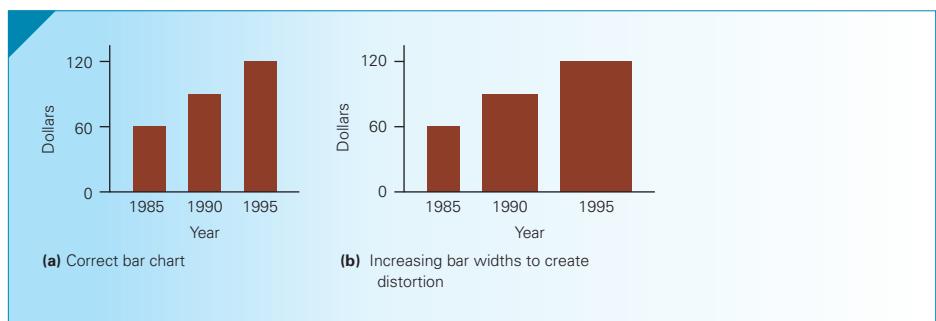
appear steeper can also be created by shrinking the horizontal axis, in which case points on the horizontal axis are moved closer together.

Just the opposite effect is obtained by stretching the horizontal axis; that is, spreading out the points on the horizontal axis to increase the distance between them so that slopes and trends will appear to be less steep. The graph of a firm's profits presented in Figure 3.19(a) shows considerable swings, both upward and downward in the profits from one quarter to the next. However, the firm could convey the impression of reasonable stability in profits from quarter to quarter by stretching the horizontal axis, as shown in Figure 3.19(b).

FIGURE 3.19 Graph Showing Considerable Swings or Relative Stability

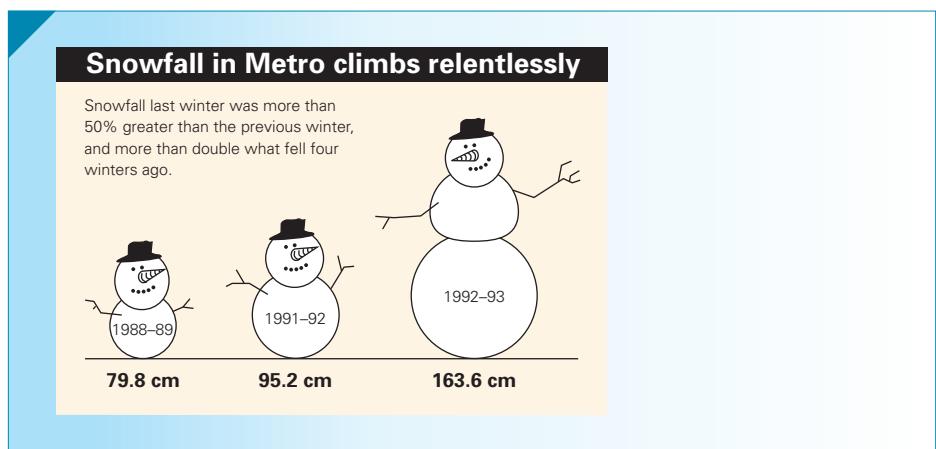
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Similar illusions can be created with bar charts by stretching or shrinking the vertical or horizontal axis. Another popular method of creating distorted impressions with bar charts is to construct the bars so that their widths are proportional to their heights. The bar chart in Figure 3.20(a) correctly depicts the average weekly amount spent on food by Canadian families during three particular years. This chart correctly uses bars of equal width so that both the height and the area of each bar are proportional to the expenditures they represent. The growth in food expenditures is exaggerated in Figure 3.20(b), in which the widths of the bars increase with their heights. A quick glance at this bar chart might leave the viewer with the mistaken impression that food expenditures increased fourfold over the decade, because the 1995 bar is four times the size of the 1985 bar.

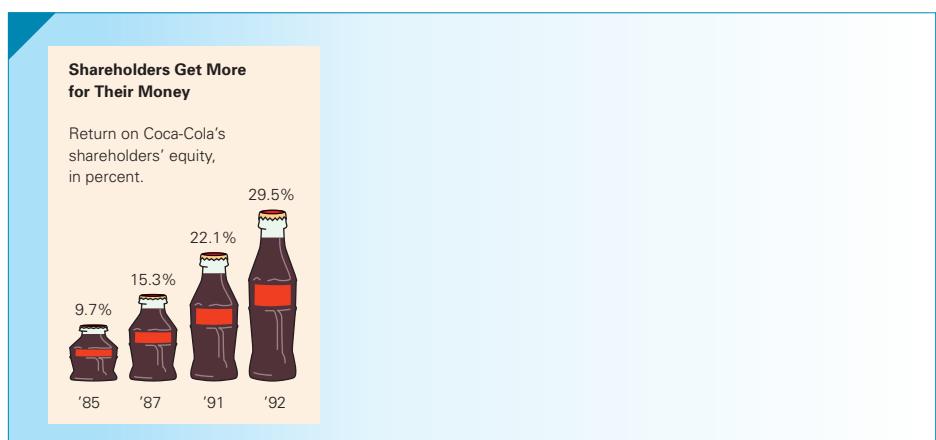
FIGURE 3.20 Correct and Distorted Bar Charts

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You should be on the lookout for size distortions, particularly in pictograms, which replace the bars with pictures of objects (such as bags of money, people, or animals) to enhance the visual appeal. Figure 3.21 displays the misuse of a pictogram—the snowman grows in width as well as height. The proper use of a pictogram is shown in Figure 3.22, which effectively uses pictures of Coca-Cola bottles.

FIGURE 3.21 Misuse of Pictogram

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FIGURE 3.22 Correct Pictogram

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The preceding examples of creating a distorted impression using graphs are not exhaustive, but they include some of the more popular methods. They should also serve to make the point that graphical techniques are used to create a visual impression, and the impression you obtain may be a distorted one unless you examine the graph with care. You are less likely to be misled if you focus your attention on the numerical values that the graph represents. Begin by carefully noting the scales on both axes; graphs with unmarked axes should be ignored completely.



EXERCISES

- 3.72** [Xr03-72](#) A computer company has diversified its operations into financial services, construction, manufacturing, and hotels. In a recent annual report, the following tables were provided. Create charts to present these data so that the differences between last year and the previous year are clear. (*Note:* It may be necessary to draw the charts manually.)

Sales (Millions of Dollars) by Region		
Region	Last Year	Previous Year
United States	67.3	40.4
Canada	20.9	18.9
Europe	37.9	35.5
Australasia	26.2	10.3
Total	152.2	105.1

Sales (Millions of Dollars) by Division		
Division	Last Year	Previous Year
Customer service	54.6	43.8
Library systems	49.3	30.5
Construction/property management	17.5	7.7
Manufacturing and distribution	15.4	8.9
Financial systems	9.4	10.9
Hotels and clubs	5.9	3.4

- 3.73** [Xr03-73](#) The following table lists the number (in thousands) of violent crimes and property crimes committed annually in 1985 to 2006 (the last year data were available).

- Draw a chart that displays both sets of data.
- Does it appear that crime rates are decreasing? Explain.
- Is there another variable that should be included to show the trends in crime rates?

Year	Violent crimes	Property crimes
1985	1,328	11,103
1986	1,489	11,723
1987	1,484	12,025
1988	1,566	12,357
1989	1,646	12,605
1990	1,820	12,655
1991	1,912	12,961
1992	1,932	12,506
1993	1,926	12,219
1994	1,858	12,132
1995	1,799	12,064
1996	1,689	11,805
1997	1,636	11,558
1998	1,534	10,952
1999	1,426	10,208
2000	1,425	10,183
2001	1,439	10,437
2002	1,424	10,455
2003	1,384	10,443
2004	1,360	10,319
2005	1,391	10,175
2006	1,418	9,984

Source: *Statistical Abstract of the United States*, 2006, Table 293; and 2009, Table 293.

- 3.74** [Xr03-74](#) Refer to Exercise 3.73. We've added the United States population.

- Incorporate this variable into your charts to show crime rate trends.
- Summarize your findings.
- Can you think of another demographic variable that may explain crime rate trends?

- 3.75** [Xr03-75](#) Refer to Exercises 3.73 and 3.74. We've included the number of Americans aged 15 to 24.

- What is the significance of adding the populations aged 15 to 24?

- b. Include these data in your analysis. What have you discovered?

3.76 **Xr03-76** To determine premiums for automobile insurance, companies must have an understanding of the variables that affect whether a driver will have an accident. The age of the driver may top the list of variables. The following table lists the number of drivers in the United States, the number of fatal accidents, and the number of total accidents in each age group in 2002.

- Calculate the accident rate (per driver) and the fatal accident rate (per 1,000 drivers) for each age group.
- Graphically depict the relationship between the ages of drivers, their accident rates, and their fatal accident rates (per 1,000 drivers).
- Briefly describe what you have learned.

Age Group	Number of Drivers (1,000s)	Number of Accidents (1,000s)	Number of Fatal Accidents
Under 20	9,508	3,543	6,118
20–24	16,768	2,901	5,907
25–34	33,734	7,061	10,288
35–44	41,040	6,665	10,309
45–54	38,711	5,136	8,274
55–64	25,609	2,775	5,322
65–74	15,812	1,498	2,793
Over 74	12,118	1,121	3,689
Total	193,300	30,700	52,700

Source: National Safety Council.

3.77 **Xr03-77** During 2002 in the state of Florida, a total of 365,474 drivers were involved in car accidents.

The accompanying table breaks down this number by the age group of the driver and whether the driver was injured or killed. (There were actually 371,877 accidents, but the driver's age was not recorded in 6,413 of these.)

- Calculate the injury rate (per 100 accidents) and the death rate (per accident) for each age group.
- Graphically depict the relationship between the ages of drivers, their injury rate (per 100 accidents), and their death rate.
- Briefly describe what you have learned from these graphs.
- What is the difference between the information extracted from Exercise 3.9 and this one?

Age Group	Number of Accidents	Drivers Injured	Drivers Killed
20 or less	52,313	21,762	217
21–24	38,449	16,016	185
25–34	78,703	31,503	324
35–44	76,152	30,542	389
45–54	54,699	22,638	260
55–64	31,985	13,210	167
65–74	18,896	7,892	133
75–84	11,526	5,106	138
85 or more	2,751	1,223	65
Total	365,474	149,892	1,878

Source: Florida Department of Highway Safety and Motor Vehicles.

3.78 **Xr03-78** The accompanying table lists the average test scores in the Scholastic Assessment Test (SAT) for the years 1967, 1970, 1975, 1980, 1985, 1990, 1995, and 1997 to 2007.

Year	Verbal All	Verbal Male	Verbal Female	Math All	Math Male	Math Female
1967	543	540	545	516	535	595
1970	537	536	538	512	531	493
1975	512	515	509	498	518	479
1980	502	506	498	492	515	473
1985	509	514	503	500	522	480
1990	500	505	496	501	521	483
1995	504	505	502	506	525	490
1997	505	507	503	511	530	494
1998	505	509	502	512	531	496
1999	505	509	502	511	531	495
2000	505	507	504	514	533	498
2001	506	509	502	514	533	498

Year	Verbal All	Verbal Male	Verbal Female	Math All	Math Male	Math Female
2002	504	507	502	516	534	500
2003	507	512	503	519	537	503
2004	508	512	504	518	537	501
2005	508	513	505	520	538	504
2006	503	505	502	518	536	502
2007	502	504	502	515	533	499
2008	502	504	500	515	533	500
2009	501	503	498	515	534	499

Source: *Statistical Abstract of the United States*, 2012, Table 267.

Draw a chart for each of the following.

- a. You wish to show that both verbal and mathematics test scores for all students have not changed much over the years.
- b. The exact opposite of part (a).
- c. You want to claim that there are no differences between genders.
- d. You want to “prove” that differences between genders exist.

- 3.79 **Xr03-79** The monthly unemployment rate in one state for the past 12 months is listed here.

- a. Draw a bar chart of these data with 6.0% as the lowest point on the vertical axis.
- b. Draw a bar chart of these data with 0.0% as the lowest point on the vertical axis.
- c. Discuss the impression given by the two charts.
- d. Which chart would you use? Explain.

Month	1	2	3	4	5	6	7	8	9	10	11	12
Rate	7.5	7.6	7.5	7.3	7.2	7.1	7.0	6.7	6.4	6.5	6.3	6.0

CHAPTER SUMMARY

Histograms are used to describe a single set of interval data. Statistics practitioners examine several aspects of the shapes of histograms. These are symmetry, number of modes, and its resemblance to a bell shape.

We described the difference between time-series data and cross-sectional data. Time series are graphed by line charts.

IMPORTANT TERMS :

- Classes 46
- Histogram 46
- Symmetry 50
- Positively skewed 50
- Negatively skewed 50
- Modal class 50
- Unimodal histogram 50
- Bimodal histogram 51
- Stem-and-leaf display 57
- Depths 58
- Relative frequency distribution 59

To analyze the relationship between two interval variables, we draw a scatter diagram. We look for the direction and strength of the linear relationship.

- Cumulative relative frequency distribution 59
- Ogive 59
- Cross-sectional data 64
- Time-series data 64
- Line chart 64
- Scatter diagram 73
- Linear relationship 75
- Positive linear relationship 76
- Negative linear relationship 76
- Graphical excellence 81
- Graphical deception 81

COMPUTER OUTPUT AND INSTRUCTIONS:

Graphical Technique	Excel	Minitab
Histogram	47	48
Stem-and-leaf display	58	58
Ogive	60	61
Line chart	65	66
Scatter diagram	74	75

CHAPTER EXERCISES

The following exercises require a computer and software.

- 3.80 *Xr03-80*** Gold and other precious metals have traditionally been considered a hedge against inflation. If this is true, we would expect that a fund made up of precious metals (gold, silver, platinum, and others) would have a strong positive relationship with the inflation rate. To see whether this is true, a statistics practitioner collected the monthly CPI and the monthly precious metals subindex, which is based on the prices of gold, silver, platinum, etc., for the years 1975 to 2008. These figures were used to calculate the monthly inflation rate and the monthly return on the precious metals subindex. Use a graphical technique to determine the nature of the relationship between the inflation rate and the return on the subindex. What does the graph tell you?

Source: U.S. Treasury and Bridge Commodity Research Bureau.

- 3.81 *Xr03-81*** The monthly values of one Australian dollar measured in American dollars since 1971 were recorded. Draw a graph that shows how the exchange rate has varied over the 38-year period.

Source: Federal Reserve Economic Data.

- 3.82 *Xr03-82*** Studies of twins may reveal more about the “nature or nurture” debate. The issue being debated is whether nature or the environment has more of an effect on individual traits such as intelligence. Suppose that a sample of identical twins was selected and their IQs measured. Use a suitable graphical technique to depict the data, and describe what it tells you about the relationship between the IQs of identical twins.

- 3.83 *Xr03-83*** An economist wanted to determine whether a relationship existed between interest rates and currencies (measured in U.S. dollars). He recorded the monthly interest rate and the currency indexes for the years 1982 to 2008. Graph the data and describe the results.

Source: Bridge Commodity Research Bureau.

- 3.84 *Xr03-84*** One hundred students who had reported that they use their computers for at least 20 hours per week were asked to keep track of the number of crashes their computers incurred during a 12-week period. Using an appropriate statistical method, summarize the data. Describe your findings.

- 3.85 *Xr03-85*** In Chapters 16, 17, and 18, we introduce regression analysis, which addresses the relationships among variables. One of the first applications of regression analysis was to analyze the relationship between the heights of fathers and sons. Suppose that a sample of 80 fathers and sons was drawn. The heights of the fathers and of the adult sons were measured.
- Draw a scatter diagram of the data. Draw a straight line that describes the relationship.
 - What is the direction of the line?
 - Does it appear that there is a linear relationship between the two variables?

- 3.86 *Xr03-86*** When the Dow Jones Industrial Averages index increases, it usually means that the economy is growing, which in turn usually means that the unemployment rate is low. A statistics professor pointed out that in numerous periods (including when this edition was being written), the stock market had been booming while the rest of the economy was performing poorly. To learn more about the issue, the monthly closing DJIA and the monthly unemployment rates were recorded for the years 1950 to 2012. Draw a graph of the data and report your results.

Source: Federal Reserve Economic Data and the *Wall Street Journal*.

- 3.87 *Xr03-87*** The monthly values of one British pound measured in American dollars since 1987 were recorded. Produce a graph that shows how the exchange rate has varied over the past 23 years.

Source: Federal Reserve Economic Data.

- 3.88 *Xr03-88*** Do better golfers play faster than poorer ones? To determine whether a relationship exists, a

sample of 125 foursomes was selected. Their total scores and the amount of time taken to complete the 18 holes were recorded. Graphically depict the data, and describe what they tell you about the relationship between score and time.

- 3.89 Xr03-89** The value of monthly U.S. exports to Mexico and imports from Mexico (in \$ millions) since 1985 were recorded.
- Draw a chart that depicts exports.
 - Draw a chart that exhibits imports.
 - Compute the trade balance and graph these data.
 - What do these charts tell you?

Source: Federal Reserve Economic Data.

- 3.90 Xr03-90** An increasing number of consumers prefer to use debit cards in place of cash or credit cards. To analyze the relationship between the amounts of purchases made with debit and credit cards, 240 people were interviewed and asked to report the amount of money spent on purchases using debit cards and the amount spent using credit cards during the last month. Draw a graph of the data and summarize your findings.
- 3.91 Xr03-91** Most publicly traded companies have boards of directors. The rate of pay varies considerably. A survey was undertaken by the *Globe and Mail* (February 19, 2001) wherein 100 companies were surveyed and asked to report how much their directors were paid annually. Use a graphical technique to present these data.

- 3.92 Xr03-92** Refer to Exercise 3.91. In addition to reporting the annual payment per director, the survey recorded the number of meetings last year. Use a graphical technique to summarize and present these data.

- 3.93 Xr03-93** Is airline travel becoming safer? To help answer this question, a student recorded the number of fatal accidents and the number of deaths that occurred in the years 1986 to 2008 for scheduled airlines. Use a graphical method to answer the question.

Source: *Statistical Abstract of the United States, 2009*, Table 1036.

- 3.94 Xr03-94** Most car-rental companies keep their cars for about a year and then sell them to used car dealerships. Suppose one company decided to sell the used cars themselves. Because most used car buyers make their decision on what to buy and how much to spend based on the car's odometer reading, this would be an important issue for the car-rental company. To develop information about the mileage shown on the company's rental cars, the general manager took a random sample of 658 customers

and recorded the average number of miles driven per day. Use a graphical technique to display these data.

- 3.95 Xr03-95** Several years ago, the Barnes Exhibit toured major cities all over the world, with millions of people flocking to see it. Because of the size and value of the collection, it was predicted (correctly) that in each city a large number of people would come to view the paintings. Because space was limited, most galleries had to sell tickets that were valid at one time (much like a play). In this way, they were able to control the number of visitors at any one time. To judge how many people to let in at any time, it was necessary to know the length of time people would spend at the exhibit; longer times would dictate smaller audiences; shorter times would allow for the sale of more tickets. The manager of a gallery that will host the exhibit realized her facility can comfortably and safely hold about 250 people at any one time. Although the demand will vary throughout the day and from weekday to weekend, she believes that the demand will not drop below 500 at any time. To help make a decision about how many tickets to sell, she acquired the amount of time a sample of 400 people spent at the exhibit from another city. What ticket procedure should the museum management institute?

The following exercises are based on data sets that include additional data referenced in previously presented examples and exercises.

- 3.96 Xm03-03* XM03-04*** Examples 3.3 and 3.4 listed the final marks in the business statistics course and the mathematical statistics course. The professor also provided the final marks in the first-year required calculus course. Graphically describe the relationship between calculus and statistics marks. What information were you able to extract?

- 3.97 Xm03-03* XM03-04*** In addition to the previously discussed data in Examples 3.3 and 3.4, the professor listed the midterm mark. Conduct an analysis of the relationship between final exam mark and midterm mark in each course. What does this analysis tell you?

- 3.98 Xr02-57*** Two other questions were asked in Exercise 2.57:

Number of weeks job searching?
Salary (\$ thousands)?

The placement office wants the following:

- Graphically describe salary.
- Is salary related to the number of weeks needed to land the job?

CASE 3.1**The Question of Global Warming**

In the last part of the 20th century, scientists developed the theory that the planet was warming and the primary cause was the increasing amounts of carbon dioxide (CO_2), which is the product of burning oil, natural gas, and coal (fossil fuels). Although many climatologists believe in the so-called greenhouse effect, there are many others who do not subscribe to this theory. There are three critical questions that need to be answered in order to resolve the issue.

1. Is the earth actually warming?

To answer this question, we need accurate temperature measurements over a large number of years. But how do we measure the temperature before the invention of accurate thermometers? Moreover, how do we go about measuring the earth's temperature even with accurate thermometers?

2. If the planet is warming, is there a manmade cause or is it natural fluctuation? The temperature of earth has increased and decreased many times in its long history. We've had higher temperatures and we've had lower temperatures, including various ice ages. In fact, a period called the "little ice age" ended around the middle to the end of the 19th century. Then the temperature rose until about 1940, at which

point it decreased until 1975. An April 28, 1975, *Newsweek* article discussed the possibility of global cooling, which seemed to be the consensus among scientists.

3. If the planet is warming, is CO_2 the cause? There are greenhouse gases in the atmosphere without which the earth would be considerably colder. These gases include methane, water vapor, and carbon dioxide. All occur naturally in nature. Carbon dioxide is vital to our life on earth because it is necessary for growing plants. The amount of CO_2 produced by fossil fuels is relatively a small proportion of all the CO_2 in the atmosphere.

The generally accepted procedure is to record monthly temperature anomalies. To do so, we calculate the average for each month over many years. We then calculate any deviations between the latest month's temperature reading and its average. A positive anomaly would represent a month's temperature that is above the average. A negative anomaly indicates a month in which the temperature is less than the average. One key question is how we measure the temperature.

Although there are many different sources of data, we have chosen to

provide you with one, the National Climatic Data Center (NCDC), which is affiliated with the National Oceanic and Atmospheric Administration (NOAA). (Other sources tend to agree with the NCDC's data.) C03-01a stores the monthly temperature anomalies from 1880 to 2012.

The best measures of CO_2 levels in the atmosphere come from the Mauna Loa Observatory in Hawaii, which started measuring this variable in December 1958 and continues to do so. However, attempts to estimate CO_2 levels prior to 1958 are as controversial as the methods used to estimate temperatures. These techniques include taking ice-core samples from the arctic and measuring the amount of CO_2 trapped in the ice from which estimates of atmospheric CO_2 are produced. To avoid this controversy, we will use the Mauna Loa Observatory numbers only. These data are stored in file C03-01b. (Note that some of the original data are missing and were replaced by interpolated values.)

- a. Use whichever techniques you wish to determine whether there is global warming.
- b. Use a graphical technique to determine whether there is a relationship between temperature anomalies and CO_2 levels.

DATA
C03-01a
C03-01b

CASE 3.2**Economic Freedom and Prosperity****DATA
C03-02**

Adam Smith published *The Wealth of Nations* in 1776. In it, he argued that when institutions protect the liberty of individuals, greater prosperity results for all. Since 1995, the *Wall Street Journal* and the Heritage Foundation, a think tank in Washington, D.C., have produced the Index of Economic Freedom for

all countries in the world. The index is based on a subjective score for 10 freedoms. These are business freedom, trade freedom, fiscal freedom, government size, monetary freedom, investment freedom, financial freedom, property rights, freedom from corruption, and labor freedom. We downloaded the scores for 2013. From the *CIA Factbook*,

we determined the per capita gross domestic product (GDP), measured in terms of purchasing power parity (PPP), which makes it possible to compare the GDP for all countries. The per capita GDP PPP figures for 2012 were used. Both sets of data are stored in C03-02. Use a graphical technique to see how freedom and prosperity are related.

4



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NUMERICAL DESCRIPTIVE TECHNIQUES

- 4-1 *Measures of Central Location*
 - 4-2 *Measures of Variability*
 - 4-3 *Measures of Relative Standing and Box Plots*
 - 4-4 *Measures of Linear Relationship*
 - 4-5 *(Optional) Applications in Professional Sports: Baseball*
 - 4-6 *(Optional) Applications in Finance: Market Model*
 - 4-7 *Comparing Graphical and Numerical Techniques*
 - 4-8 *General Guidelines for Exploring Data*
- Appendix 4 *Review of Descriptive Techniques*

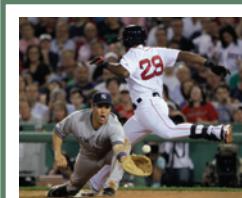
The Cost of One More Win in Major League Baseball

DATA

Xm04-00

In the era of free agency, professional sports teams must compete for the services of the best players. It is generally believed that only teams whose salaries place them in the top quarter have a chance of winning the championship. Efforts have been made to provide balance by establishing salary caps or some form of equalization. To examine the problem, we gathered data from the 2012 baseball season. For each team in major league baseball, we recorded the number of wins and the team payroll.

To make informed decisions, we need to know how the number of wins and the team payroll are related. After the statistical technique is presented, we return to this problem and solve it.



AP Photo/Charles Krupa

INTRODUCTION

In Chapters 2 and 3, we presented several graphical techniques that describe data. In this chapter, we introduce numerical descriptive techniques that allow the statistics practitioner to be more precise in describing various characteristics of a sample or population. These techniques are critical to the development of statistical inference.

As we pointed out in Chapter 2, arithmetic calculations can be applied to interval data only. Consequently, most of the techniques introduced here may be used only to numerically describe interval data. However, some of the techniques can be used for ordinal data, and one of the techniques can be employed for nominal data.

When we introduced the histogram, we commented that there are several bits of information that we look for. The first is the location of the center of the data. In Section 4-1, we will present **measures of central location**. Another important characteristic that we seek from a histogram is the spread of the data. The spread will be measured more precisely by measures of variability, which we present in Section 4-2. Section 4-3 introduces measures of relative standing and another graphical technique, the box plot.

In Section 3-3, we introduced the scatter diagram, which is a graphical method that we use to analyze the relationship between two interval variables. The numerical counterparts to the scatter diagram are called *measures of linear relationship*, and they are presented in Section 4-4.

Sections 4-5 and 4-6 feature statistical applications in baseball and finance, respectively. In Section 4-7, we compare the information provided by graphical and numerical techniques. Finally, we complete this chapter by providing guidelines on how to explore data and retrieve information.

SAMPLE STATISTIC OR POPULATION PARAMETER

Recall the terms introduced in Chapter 1: population, sample, parameter, and statistic. A parameter is a descriptive measurement about a population, and a statistic is a descriptive measurement about a sample. In this chapter, we introduce a dozen descriptive measurements. For each one, we describe how to calculate both the population parameter and the sample statistic. However, in most realistic applications, populations are very large—in fact, virtually infinite. The formulas describing the calculation of parameters are not practical and are seldom used. They are provided here primarily to teach the concept and the notation. In Chapter 7, we introduce probability distributions, which describe populations. At that time we show how parameters are calculated from probability distributions. In general, small data sets of the type we feature in this book are samples.

4-1 MEASURES OF CENTRAL LOCATION

4-1a Arithmetic Mean

There are three different measures that we use to describe the center of a set of data. The first is the best known, the *arithmetic mean*, which we'll refer to simply as the **mean**. Students may be more familiar with its other name, the *average*. The mean is computed by summing the observations and dividing by the number of observations. We label the

observations in a sample x_1, x_2, \dots, x_n , where x_1 is the first observation, x_2 is the second, and so on until x_n , where n is the sample size. As a result, the sample mean is denoted \bar{x} . In a population, the number of observations is labeled N and the population mean is denoted by μ (Greek letter *mu*).

Mean

$$\text{Population mean: } \mu = \frac{\sum_{i=1}^N x_i}{N}$$

$$\text{Sample mean: } \bar{x} = \frac{\sum_{i=1}^n x_i}{n}$$

EXAMPLE 4.1

Mean Time Spent on the Internet

A sample of 10 adults was asked to report the number of hours they spent on the Internet the previous month. The results are listed here. Manually calculate the sample mean.

0 7 12 5 33 14 8 0 9 22

SOLUTION:

Using our notation, we have $x_1 = 0, x_2 = 7, \dots, x_{10} = 22$, and $n = 10$. The sample mean is

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n} = \frac{0 + 7 + 12 + 5 + 33 + 14 + 8 + 0 + 9 + 22}{10} = \frac{110}{10} = 11.0$$

EXAMPLE 4.2

DATA

Xm03-01

Mean Long-Distance Telephone Bill

Refer to Example 3.1. Find the mean long-distance telephone bill.

SOLUTION:

To calculate the mean, we add the observations and divide the sum by the size of the sample. Thus,

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n} = \frac{42.19 + 38.45 + \dots + 45.77}{200} = \frac{8717.52}{200} = 43.59$$

Using the Computer

There are several ways to command Excel and Minitab to compute the mean. If we simply want to compute the mean and no other statistics, we can proceed as follows.

EXCEL

INSTRUCTIONS

Type or import the data into one or more columns. (Open Xm03-01.) Type into any empty cell

$$= \text{AVERAGE}([\text{Input Range}])$$

For Example 4.2, we would type into any cell

$$= \text{AVERAGE}(A1:A201)$$

The active cell would store the mean as 43.5876.

MINITAB

INSTRUCTIONS

1. Type or import the data into one column. (Open Xm03-01.)
2. Click **Calc** and **Column Statistics . . .**. Specify **Mean** in the **Statistic** box. Type or use the **Select** button to specify the **Input variable** and click **OK**. The sample mean is outputted in the session window as 43.5876.

4-1b Median

The second most popular measure of central location is the *median*.

Median

The **median** is calculated by placing all the observations in order (ascending or descending). The observation that falls in the middle is the median. The sample and population medians are computed in the same way.

When there is an even number of observations, the median is determined by averaging the two observations in the middle.

EXAMPLE 4.3

Median Time Spent on Internet

Find the median for the data in Example 4.1.

SOLUTION:

When placed in ascending order, the data appear as follows:

0	0	5	7	8	9	12	14	22	33
---	---	---	---	---	---	----	----	----	----

The median is the average of the fifth and sixth observations (the middle two), which are 8 and 9, respectively. Thus, the median is 8.5.

EXAMPLE 4.4

DATA

Xm03-01

Median Long-Distance Telephone Bill

Find the median of the 200 observations in Example 3.1.

SOLUTION:

All the observations were placed in order. We observed that the 100th and 101st observations are 26.84 and 26.97, respectively. Thus, the median is the average of these two numbers:

$$\text{Median} = \frac{26.84 + 26.97}{2} = 26.905$$

EXCEL

INSTRUCTIONS

To calculate the median, substitute **MEDIAN** in place of **AVERAGE** in the instructions for the mean (page 97). The median is reported as 26.905.

MINITAB

INSTRUCTIONS

Follow the instructions for the mean to compute the mean except click **Median** instead of **Mean**. The median is outputted as 26.905 in the session window.

INTERPRET

Half the observations are below 26.905, and half the observations are above 26.905.

4-1c Mode

The third and last measure of central location that we present here is the *mode*.

Mode

The **mode** is defined as the observation (or observations) that occurs with the greatest frequency. Both the statistic and parameter are computed in the same way.

For populations and large samples, it is preferable to report the **modal class**, which we defined in Chapter 2.

There are several problems with using the mode as a measure of central location. First, in a small sample it may not be a very good measure. Second, it may not be unique.

EXAMPLE 4.5

Mode Time Spent on Internet

Find the mode for the data in Example 4.1.

SOLUTION:

All observations except 0 occur once. There are two 0s. Thus, the mode is 0. As you can see, this is a poor measure of central location. It is nowhere near the center of the data. Compare this with the mean 11.0 and median 8.5 and you can appreciate that in this example the mean and median are superior measures.

EXAMPLE 4.6

DATA

Xm03-01

Mode of Long-Distance Bill

Determine the mode for Example 3.1.

SOLUTION:

An examination of the 200 observations reveals that, except for 0, it appears that each number is unique. However, there are 8 zeroes, which indicates that the mode is 0.

EXCEL

INSTRUCTIONS

To compute the mode, substitute **MODE** in place of **AVERAGE** in the previous instructions. Note that if there is more than one mode, Excel prints only the smallest one, without indicating whether there are other modes. In this example, Excel reports that the mode is 0.

MINITAB

Follow the instructions to compute the mean except click **Mode** instead of **Mean**. The mode is outputted as 0 in the session window. (See page 20.)

Excel and Minitab: Printing All the Measures of Central Location plus Other Statistics Both Excel and Minitab can produce the measures of central location plus a variety of others that we will introduce in later sections.

EXCEL

Excel Output for Examples 4.2, 4.4, and 4.6

	A	B
1		<i>Bills</i>
2		
3	Mean	43.59
4	Standard Error	2.76
5	Median	26.91
6	Mode	0
7	Standard Deviation	38.97
8	Sample Variance	1518.64
9	Kurtosis	-1.29
10	Skewness	0.54
11	Range	119.63
12	Minimum	0
13	Maximum	119.63
14	Sum	8717.5
15	Count	200

Excel reports the mean, median, and mode as the same values we obtained previously. Most of the other statistics will be discussed later.

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm03-01](#).)
2. Click **Data**, **Data Analysis**, and **Descriptive Statistics**.
3. Specify the **Input Range** ([A1:A201](#)) and click **Summary statistics**.

MINITAB

Minitab Output for Examples 4.2, 4.4, and 4.6

Descriptive Statistics: Bills				
Variable	Mean	Median	Mode	N for Mode
Bills	43.59	26.91	0	8

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm03-01](#).)
2. Click **Stat**, **Basic Statistics**, and **Display Descriptive Statistics**
3. Type or use **Select** to identify the name of the variable or column ([Bills](#)). Click **Statistics . . .** to add or delete particular statistics.

4-1d Mean, Median, Mode: Which Is Best?

With three measures from which to choose, which one should we use? There are several factors to consider when making our choice of measure of central location. The mean is generally our first selection. However, there are several circumstances when the median is better. The mode is seldom the best measure of central location. One advantage the median holds is that it is not as sensitive to extreme values as is the mean. To illustrate, consider the data in Example 4.1. The mean was 11.0, and the median was 8.5. Now

suppose that the respondent who reported 33 hours actually reported 133 hours (obviously an Internet addict). The mean becomes

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n} = \frac{0 + 7 + 12 + 5 + 133 + 14 + 8 + 0 + 22}{10} = \frac{210}{10} = 21.0$$

This value is exceeded by only 2 of the 10 observations in the sample, making this statistic a poor measure of *central* location. The median stays the same. When there is a relatively small number of extreme observations (either very small or very large, but not both), the median usually produces a better measure of the center of the data.

To see another advantage of the median over the mean, suppose you and your classmates have written a statistics test and the instructor is returning the graded tests. What piece of information is most important to you? The answer, of course, is *your* mark. What is the next important bit of information? The answer is how well you performed relative to the class. Most students ask their instructor for the class mean. This is the wrong statistic to request. You want the *median* because it divides the class into two halves. This information allows you to identify which half of the class your mark falls into. The median provides this information; the mean does not. Nevertheless, the mean can also be useful in this scenario. If there are several sections of the course, the section means can be compared to determine whose class performed best (or worst).

4-1e Measures of Central Location for Ordinal and Nominal Data

When the data are interval, we can use any of the three measures of central location. However, for ordinal and nominal data, the calculation of the mean is not valid. Because the calculation of the median begins by placing the data in order, this statistic is appropriate for ordinal data. The mode, which is determined by counting the frequency of each observation, is appropriate for nominal data. However, nominal data do not have a “center,” so we cannot interpret the mode of nominal data in that way. It is generally pointless to compute the mode of nominal data.

APPLICATIONS in FINANCE

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Geometric Mean

The arithmetic mean is the single most popular and useful measure of central location. We noted certain situations, where the median is a better measure of central location. However, there is another circumstance where neither the mean nor the median is the best measure. When the variable is a growth rate or rate of change, such as the value of an investment over periods of time, we need another measure. This will become apparent from the following illustration.

Suppose you make a 2-year investment of \$1,000, and it grows by 100% to \$2,000 during the first year. During the second year, however, the investment suffers a 50% loss, from \$2,000 back to \$1,000. The rates of return for years 1 and 2 are $R_1 = 100\%$ and $R_2 = -50\%$, respectively. The arithmetic mean (and the median) is computed as

(Continued)

$$\bar{R} = \frac{R_1 + R_2}{2} = \frac{100 + (-50)}{2} = 25\%$$

But this figure is misleading. Because there was no change in the value of the investment from the beginning to the end of the 2-year period, the “average” compounded rate of return is 0%. As you will see, this is the value of the *geometric mean*.

Let R_i denote the rate of return (in decimal form) in period $i(i = 1, 2, \dots, n)$. The **geometric mean** R_g of the returns R_1, R_2, \dots, R_n is defined such that

$$(1 + R_g)^n = (1 + R_1)(1 + R_2) \cdots (1 + R_n)$$

Solving for R_g , we produce the following formula:

$$R_g = \sqrt[n]{(1 + R_1)(1 + R_2) \cdots (1 + R_n)} - 1$$

The geometric mean of our investment illustration is

$$R_g = \sqrt[2]{(1 + R_1)(1 + R_2)} - 1 = \sqrt[2]{(1 + 1)(1 + [-.50])} - 1 = 1 - 1 = 0$$

The geometric mean is therefore 0%. This is the single “average” return that allows us to compute the value of the investment at the end of the investment period from the beginning value. Thus, using the formula for compound interest with the rate = 0%, we find

$$\text{Value at the end of the investment period} = 1,000(1 + R_g)^2 = 1,000(1 + 0)^2 = 1,000$$

The geometric mean is used whenever we wish to find the “average” growth rate, or rate of change, in a variable over time. However, the arithmetic mean of n returns (or growth rates) is the appropriate mean to calculate if you wish to estimate the mean rate of return (or growth rate) for any single period in the future; that is, in the illustration above if we wanted to estimate the rate of return in year 3, we would use the arithmetic mean of the two annual rates of return, which we found to be 25%.

EXCEL

INSTRUCTIONS

1. Type or import the values of $1 + R_i$ into a column.
2. Follow the instructions to produce the mean (page 97) except substitute **GEOMEAN** in place of **AVERAGE**.
3. To determine the geometric mean, subtract 1 from the number produced.

MINITAB

Minitab does not compute the geometric mean.

Here is a summary of the numerical techniques introduced in this section and when to use them.

Factors That Identify When to Compute the Mean

1. **Objective:** Describe a single set of data
2. **Type of data:** Interval
3. **Descriptive measurement:** Central location

Factors That Identify When to Compute the Median

1. **Objective:** Describe a single set of data
2. **Type of data:** Ordinal or interval (with extreme observations)
3. **Descriptive measurement:** Central location

Factors That Identify When to Compute the Mode

1. **Objective:** Describe a single set of data
2. **Type of data:** Nominal, ordinal, interval

Factors That Identify When to Compute the Geometric Mean

1. **Objective:** Describe a single set of data
2. **Type of data:** Interval; growth rates

**EXERCISES**

- 4.1** A sample of 12 people was asked how much change they had in their pockets and wallets. The responses (in cents) are

52	25	15	0	104	44
60	30	33	81	40	5

Determine the mean, median, and mode for these data.

- 4.2** The number of sick days due to colds and flu last year was recorded by a sample of 15 adults. The data are

5	7	0	3	15	6	5	9
3	8	10	5	2	0	12	

Compute the mean, median, and mode.

- 4.3** A random sample of 12 joggers was asked to keep track and report the number of miles they ran last week. The responses are

5.5	7.2	1.6	22.0	8.7	2.8
5.3	3.4	12.5	18.6	8.3	6.6

- a. Compute the three statistics that measure central location.
- b. Briefly describe what each statistic tells you.

- 4.4** The midterm test for a statistics course has a time limit of 1 hour. However, like most statistics exams this one was quite easy. To assess how easy, the professor recorded the amount of time taken by a sample of nine students to hand in their test papers. The times (rounded to the nearest minute) are

33	29	45	60	42	19	52	38	36
----	----	----	----	----	----	----	----	----

- a. Compute the mean, median, and mode.
- b. What have you learned from the three statistics calculated in part (a)?

- 4.5** The professors at Wilfrid Laurier University are required to submit their final exams to the

registrar's office 10 days before the end of the semester. The exam coordinator sampled 20 professors and recorded the number of days before the final exam that each submitted his or her exam. The results are

14	8	3	2	6	4	9	13	10	12
7	4	9	13	15	8	11	12	4	0

- a. Compute the mean, median, and mode.
- b. Briefly describe what each statistic tells you.

- 4.6 Compute the geometric mean of the following rates of return.

$$.25 \quad -.10 \quad .50$$

- 4.7 What is the geometric mean of the following rates of return?

$$.50 \quad .30 \quad -.50 \quad -.25$$

- 4.8 The following returns were realized on an investment over a 5-year period.

Year	1	2	3	4	5
Rate of Return	.10	.22	.06	-.05	.20

- a. Compute the mean and median of the returns.
- b. Compute the geometric mean.
- c. Which one of the three statistics computed in parts (a) and (b) best describes the return over the 5-year period? Explain.

- 4.9 An investment you made 5 years ago has realized the following rates of return.

Year	1	2	3	4	5
Rate of Return	-.15	-.20	.15	-.08	.50

- a. Compute the mean and median of the rates of return.
- b. Compute the geometric mean.
- c. Which one of the three statistics computed in parts (a) and (b) best describes the return over the 5-year period? Explain.

- 4.10 An investment of \$1,000 you made 4 years ago was worth \$1,200 after the first year, \$1,200 after the second year, \$1,500 after the third year, and \$2,000 today.

- a. Compute the annual rates of return.
- b. Compute the mean and median of the rates of return.
- c. Compute the geometric mean.
- d. Discuss whether the mean, median, or geometric mean is the best measure of the performance of the investment.

- 4.11 Suppose that you bought a stock 6 years ago at \$12. The stock's price at the end of each year is shown here.

Year	1	2	3	4	5	6
Price	10	14	15	22	30	25

- a. Compute the rate of return for each year.
- b. Compute the mean and median of the rates of return.
- c. Compute the geometric mean of the rates of return.
- d. Explain why the best statistic to use to describe what happened to the price of the stock over the 6-year period is the geometric mean.

The following exercises require the use of a computer and software.

- 4.12 **Xr04-12** The starting salaries of a sample of 125 recent MBA graduates are recorded.

- a. Determine the mean and median of these data.
- b. What do these two statistics tell you about the starting salaries of MBA graduates?

- 4.13 **Xr04-13** To determine whether changing the color of its invoices would improve the speed of payment, a company selected 200 customers at random and sent their invoices on blue paper. The number of days until the bills were paid was recorded. Calculate the mean and median of these data. Report what you have discovered.

- 4.14 **Xr04-14** A survey undertaken by the U.S. Bureau of Labor Statistics, Annual Consumer Expenditure, asks American adults to report the amount of money spent on reading material in 2009.

- a. Compute the mean and median of the sample.
- b. What do the statistics computed in part (a) tell you about the reading materials expenditures?

Source: Adapted from, *Statistical Abstract of the United States*, 2012, Table 684.

- 4.15 **Xr04-15** A survey of 350 workers in California and 300 workers in New York state asked each to report the average amount of time spent commuting to work.

- a. Compute the mean and median of the commuting times for workers in California.
- b. Repeat part (a) for New York workers.
- c. Summarize your findings.

Source: Adapted from, *Statistical Abstract of the United States*, 2012, Table 1100.

- 4.16 **Xr04-16** In the United States, banks and financial institutions often require buyers of houses to pay fees in order to arrange mortgages. In a survey conducted by the U.S. Federal Housing Finance Board, 400 buyers of new houses who received a mortgage from a bank were asked to report the amount of fees (fees include commissions, discounts, and points) they paid as a percentage of the whole mortgage.

- a. Compute the mean and median.
- b. Interpret the statistics you computed.

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 1193.

- 4.17 **Xr04-17** In an effort to slow drivers, traffic engineers painted a solid line 3 feet from the curb over

the entire length of a road and filled the space with diagonal lines. The lines made the road look narrower. A sample of car speeds was taken after the lines were drawn.

- Compute the mean, median, and mode of these data.
- Briefly describe the information that you acquired from each statistic calculated in part (a).

- 4.18 Xr04-18** How much do Americans spend on various food groups? Three hundred American families were surveyed and asked to report the amount of money spent annually on fruits and vegetables. Compute the mean and median of these data and interpret the results.

Source: Adapted from, *Statistical Abstract of the United States 2012*, Table 684.

4-2 MEASURES OF VARIABILITY

The statistics introduced in Section 4-1 serve to provide information about the central location of the data. However, as we have already discussed in Chapter 2, there are other characteristics of data that are of interest to practitioners of statistics. One such characteristic is the spread or variability of the data. In this section, we introduce four **measures of variability**. We begin with the simplest.

4-2a Range

Range

Range = Largest observation – Smallest observation

The advantage of the **range** is its simplicity. The disadvantage is also its simplicity. Because the range is calculated from only two observations, it tells us nothing about the other observations. Consider the following two sets of data.

Set 1: 4 4 4 4 4 50
 Set 2: 4 8 15 24 39 50

The range of both sets is 46. The two sets of data are completely different, yet their ranges are the same. To measure variability, we need other statistics that incorporate all the data and not just two observations.

4-2b Variance

The **variance** and its related measure, the **standard deviation**, are arguably the most important statistics. They are used to measure variability, but, as you will discover, they play a vital role in almost all statistical inference procedures.

Variance

$$\text{Population variance: } \sigma^2 = \frac{\sum_{i=1}^N (x_i - \mu)^2}{N}$$

$$\text{Sample variance: } s^2 = \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1}$$

The population variance is represented by σ^2 (Greek letter *sigma* squared).

Examine the formula for the sample variance s^2 . It may appear to be illogical that in calculating s^2 we divide by $n - 1$ rather than by n .^f However, we do so for the following reason. Population parameters in practical settings are seldom known. One objective of statistical inference is to estimate the parameter from the statistic. For example, we estimate the population mean μ from the sample mean \bar{x} . Although it is not obviously logical, the statistic created by dividing $\sum(x_i - \bar{x})^2$ by $n - 1$ is a better estimator than the one created by dividing by n . We will discuss this issue in greater detail in Section 10-1.

To compute the sample variance s^2 , we begin by calculating the sample mean \bar{x} . Next we compute the difference (also call the **deviation**) between each observation and the mean. We square the deviations and sum. Finally, we divide the sum of squared deviations by $n - 1$.

We'll illustrate with a simple example. Suppose that we have the following observations of the numbers of hours five students spent studying statistics last week:

8 4 9 11 3

The mean is

$$\bar{x} = \frac{8 + 4 + 9 + 11 + 3}{5} = \frac{35}{5} = 7$$

For each observation, we determine its deviation from the mean. The deviation is squared, and the sum of squares is determined as shown in Table 4.1.

TABLE 4.1 Calculation of Sample Variance

x_i	$(x_i - \bar{x})$	$(x_i - \bar{x})^2$
8	$(8 - 7) = 1$	$(1)^2 = 1$
4	$(4 - 7) = -3$	$(-3)^2 = 9$
9	$(9 - 7) = 2$	$(2)^2 = 4$
11	$(11 - 7) = 4$	$(4)^2 = 16$
3	$(3 - 7) = -4$	$(-4)^2 = 16$
$\sum_{i=1}^5 (x_i - \bar{x}) = 0$		$\sum_{i=1}^5 (x_i - \bar{x})^2 = 46$

© Cengage Learning

The sample variance is

$$s^2 = \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1} = \frac{46}{5 - 1} = 11.5$$

The calculation of this statistic raises several questions. Why do we square the deviations before averaging? If you examine the deviations, you will see that some of the

^fTechnically, the variance of the sample is calculated by dividing the sum of squared deviations by n . The statistic computed by dividing the sum of squared deviations by $n - 1$ is called the *sample variance corrected for the mean*. Because this statistic is used extensively, we will shorten its name to *sample variance*.

deviations are positive and some are negative. When you add them together, the sum is 0. This will always be the case because the sum of the positive deviations will always equal the sum of the negative deviations. Consequently, we square the deviations to avoid the “canceling effect.”

Is it possible to avoid the canceling effect without squaring? We could average the *absolute* value of the deviations. In fact, such a statistic has already been invented. It is called the **mean absolute deviation** or MAD. However, this statistic has limited utility and is seldom calculated.

What is the unit of measurement of the variance? Because we squared the deviations, we also squared the units. In this illustration the units were hours (of study). Thus, the sample variance is 11.5 hours².

EXAMPLE 4.7

Summer Jobs

The following are the number of summer jobs a sample of six students applied for. Find the mean and variance of these data.

17 15 23 7 9 13

SOLUTION:

The mean of the six observations is

$$\bar{x} = \frac{17 + 15 + 23 + 7 + 9 + 13}{6} = \frac{84}{6} = 14 \text{ jobs}$$

The sample variance is

$$\begin{aligned}s^2 &= \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n-1} \\&= \frac{(17-14)^2 + (15-14)^2 + (23-14)^2 + (7-14)^2 + (9-14)^2 + (13-14)^2}{6-1} \\&= \frac{9+1+81+49+25+1}{5} = \frac{166}{5} = 33.2 \text{ jobs}^2\end{aligned}$$

(Optional) Shortcut Method for Variance The calculations for larger data sets are quite time-consuming. The following shortcut for the sample variance may help lighten the load.

Shortcut for Sample Variance

$$s^2 = \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right]$$

To illustrate, we'll do Example 4.7 again.

$$\sum_{i=1}^n x_i^2 = 17^2 + 15^2 + 23^2 + 7^2 + 9^2 + 13^2 = 1,342$$

$$\sum_{i=1}^n x_i = 17 + 15 + 23 + 7 + 9 + 13 = 84$$

$$\left(\sum_{i=1}^n x_i \right)^2 = 84^2 = 7,056$$

$$s^2 = \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right] = \frac{1}{6-1} \left[1342 - \frac{7056}{6} \right] = 33.2 \text{ jobs}^2$$

Notice that we produced the same exact answer.

EXCEL

INSTRUCTIONS

Follow the instructions to compute the mean (page 97) except type VAR instead of AVERAGE.

MINITAB

1. Type or import data into one column.
2. Click **Stat**, **Basic Statistics**, **Display Descriptive Statistics . . .**, and select the variable.
3. Click **Statistics** and **Variance**.

4-2c Interpreting the Variance

We calculated the variance in Example 4.7 to be 33.2 jobs². What does this statistic tell us? Unfortunately, the variance provides us with only a rough idea about the amount of variation in the data. However, this statistic is useful when comparing two or more sets of data of the same type of variable. If the variance of one data set is larger than that of a second data set, we interpret that to mean that the observations in the first set display more variation than the observations in the second set.

The problem of interpretation is caused by the way the variance is computed. Because we squared the deviations from the mean, the unit attached to the variance is the square of the unit attached to the original observations. In other words, in Example 4.7 the unit of the data is jobs; the unit of the variance is jobs squared. This contributes to

the problem of interpretation. We resolve this difficulty by calculating another related measure of variability.

4-2d Standard Deviation

Standard Deviation

$$\text{Population standard deviation: } \sigma = \sqrt{\sigma^2}$$

$$\text{Sample standard deviation: } s = \sqrt{s^2}$$

The standard deviation is simply the positive square root of the variance. Thus, in Example 4.7, the sample standard deviation is

$$s = \sqrt{s^2} = \sqrt{33.2} = 5.76 \text{ jobs}$$

Notice that the unit associated with the standard deviation is the unit of the original data set.

EXAMPLE 4.8

DATA

Xm04-08

Comparing the Consistency of Two Types of Golf Clubs

Consistency is the hallmark of a good golfer. Golf equipment manufacturers are constantly seeking ways to improve their products. Suppose that a recent innovation is designed to improve the consistency of its users. As a test, a golfer was asked to hit 150 shots using a 7 iron, 75 of which were hit with his current club and 75 with the new innovative 7 iron. The distances were measured and recorded. Which 7 iron is more consistent?

SOLUTION:

To gauge the consistency, we must determine the standard deviations. (We could also compute the variances, but as we just pointed out, the standard deviation is easier to interpret.) We can get Excel and Minitab to print the sample standard deviations. Alternatively, we can calculate all the descriptive statistics, a course of action we recommend because we often need several statistics. The printouts for both 7 irons are shown here.

EXCEL

	A	B	C	D	E
1	<i>Current</i>		<i>Innovation</i>		
2					
3	Mean	150.55	Mean	150.15	
4	Standard Error	0.67	Standard Error	0.36	
5	Median	151	Median	150	
6	Mode	150	Mode	149	
7	Standard Deviation	5.79	Standard Deviation	3.09	
8	Sample Variance	33.55	Sample Variance	9.56	
9	Kurtosis	0.13	Kurtosis	-0.89	
10	Skewness	-0.43	Skewness	0.18	
11	Range	28	Range	12	
12	Minimum	134	Minimum	144	
13	Maximum	162	Maximum	156	
14	Sum	11291	Sum	11261	
15	Count	75	Count	75	

MINITAB**Descriptive Statistics: Current, Innovation**

Variable	N	N*	Mean	StDev	Variance	Minimum	Q1	Median	Q3
Current	75	0	150.55	5.79	33.55	134.00	148.00	151.00	155.00
Innovation	75	0	150.15	3.09	9.56	144.00	148.00	150.00	152.00

Variable	Maximum
Current	162.00
Innovation	156.00

INTERPRET

The standard deviation of the distances of the current 7 iron is 5.79 yards whereas that of the innovative 7 iron is 3.09 yards. Based on this sample, the innovative club is more consistent. Because the mean distances are similar it would appear that the new club is indeed superior.

Interpreting the Standard Deviation Knowing the mean and standard deviation allows the statistics practitioner to extract useful bits of information. The information depends on the shape of the histogram. If the histogram is bell shaped, we can use the **Empirical Rule**.

Empirical Rule

1. Approximately 68% of all observations fall within one standard deviation of the mean.
2. Approximately 95% of all observations fall within two standard deviations of the mean.
3. Approximately 99.7% of all observations fall within three standard deviations of the mean.

EXAMPLE 4.9**Using the Empirical Rule to Interpret Standard Deviation**

After an analysis of the returns on an investment, a statistics practitioner discovered that the histogram is bell shaped and that the mean and standard deviation are 10% and 8%, respectively. What can you say about the way the returns are distributed?

SOLUTION:

Because the histogram is bell shaped, we can apply the Empirical Rule:

1. Approximately 68% of the returns lie between 2% (the mean minus one standard deviation = $10 - 8$) and 18% (the mean plus one standard deviation = $10 + 8$).

2. Approximately 95% of the returns lie between -6% [the mean minus two standard deviations = $10 - 2(8)$] and 26% [the mean plus two standard deviations = $10 + 2(8)$].
3. Approximately 99.7% of the returns lie between -14% [the mean minus three standard deviations = $10 - 3(8)$] and 34% [the mean plus three standard deviations = $10 + 3(8)$].

A more general interpretation of the standard deviation is derived from *Chebyshev's Theorem*, which applies to all shapes of histograms.

Chebyshev's Theorem

The proportion of observations in any sample or population that lie within k standard deviations of the mean is at least

$$1 - \frac{1}{k^2} \text{ for } k > 1$$

When $k = 2$, **Chebyshev's Theorem** states that at least three-quarters (75%) of all observations lie within two standard deviations of the mean. With $k = 3$, Chebyshev's Theorem states that at least eight-ninths (88.9%) of all observations lie within three standard deviations of the mean.

Note that the Empirical Rule provides approximate proportions, whereas Chebyshev's Theorem provides lower bounds on the proportions contained in the intervals.

EXAMPLE 4.10

Using Chebyshev's Theorem to Interpret Standard Deviation

The annual salaries of the employees of a chain of computer stores produced a positively **skewed** histogram. The mean and standard deviation are \$28,000 and \$3,000, respectively. What can you say about the salaries at this chain?

SOLUTION:

Because the histogram is not bell shaped, we cannot use the Empirical Rule. We must employ Chebyshev's Theorem instead.

The intervals created by adding and subtracting two and three standard deviations to and from the mean are as follows:

1. At least 75% of the salaries lie between \$22,000 [the mean minus two standard deviations = $28,000 - 2(3,000)$] and \$34,000 [the mean plus two standard deviations = $28,000 + 2(3,000)$].
2. At least 88.9% of the salaries lie between \$19,000 [the mean minus three standard deviations = $28,000 - 3(3,000)$] and \$37,000 [the mean plus three standard deviations = $28,000 + 3(3,000)$].

4-2e Coefficient of Variation

Is a standard deviation of 10 a large number indicating great variability or a small number indicating little variability? The answer depends somewhat on the magnitude of the observations in the data set. If the observations are in the millions, then a standard deviation of 10 will probably be considered a small number. On the other hand, if the observations are less than 50, then the standard deviation of 10 would be seen as a large number. This logic lies behind yet another measure of variability, the *coefficient of variation*.

Coefficient of Variation

The **coefficient of variation** of a set of observations is the standard deviation of the observations divided by their mean:

$$\text{Population coefficient of variation: } CV = \frac{\sigma}{\mu}$$

$$\text{Sample coefficient of variation: } cv = \frac{s}{\bar{x}}$$

4-2f Measures of Variability for Ordinal and Nominal Data

The measures of variability introduced in this section can be used only for interval data. The next section will feature a measure that can be used to describe the variability of ordinal data. There are no measures of variability for nominal data.

4-2g Approximating the Mean and Variance from Grouped Data

The statistical methods presented in this chapter are used to compute descriptive statistics from data. However, in some circumstances, the statistician does not have the raw data but instead has a frequency distribution. This is often the case when data are supplied by government organizations. In Appendix Approximating Means and Variances for Grouped Data on Keller's website we provide the formulas used to approximate the sample mean and variance.

We complete this section by reviewing the factors that identify the use of measures of variability.

Factors That Identify When to Compute the Range, Variance, Standard Deviation, and Coefficient of Variation

1. **Objective:** Describe a single set of data
2. **Type of Data:** Interval
3. **Descriptive measurement:** Variability



EXERCISES

- 4.19** Calculate the variance of the following data.

9 3 7 4 1 7 5 4

- 4.20** Calculate the variance of the following data.

4 5 3 6 5 6 5 6

- 4.21** Determine the variance and standard deviation of the following sample.

12 6 22 31 23 13 15 17 21

- 4.22** Find the variance and standard deviation of the following sample.

0 -5 -3 6 4 -4 1 -5 0 3

- 4.23** Examine the three samples listed here. Without performing any calculations, indicate which sample has the largest amount of variation and which sample has the smallest amount of variation. Explain how you produced your answer.

- a. 17 29 12 16 11
- b. 22 18 23 20 17
- c. 24 37 6 39 29

- 4.24** Refer to Exercise 4.23. Calculate the variance for each part. Was your answer in Exercise 4.23 correct?

- 4.25** A friend calculates a variance and reports that it is -25.0 . How do you know that he has made a serious calculation error?

- 4.26** Create a sample of five numbers whose mean is 6 and whose standard deviation is 0.

- 4.27** A set of data whose histogram is bell shaped yields a mean and standard deviation of 50 and 4, respectively. Approximately what proportion of observations

- a. are between 46 and 54?
- b. are between 42 and 58?
- c. are between 38 and 62?

- 4.28** Refer to Exercise 4.27. Approximately what proportion of observations

- a. are less than 46?
- b. are less than 58?
- c. are greater than 54?

- 4.29** A set of data whose histogram is extremely skewed yields a mean and standard deviation of 70 and 12, respectively. What is the minimum proportion of observations that

- a. are between 46 and 94?
- b. are between 34 and 106?

- 4.30** A statistics practitioner determined that the mean and standard deviation of a data set were 120 and 30,

respectively. What can you say about the proportions of observations that lie between each of the following intervals?

- a. 90 and 150
- b. 60 and 180
- c. 30 and 210

The following exercises require a computer and software.

- 4.31** **Xr04-31** There has been much media coverage of the high cost of medicinal drugs in the United States. One concern is the large variation from pharmacy to pharmacy. To investigate, a consumer advocacy group took a random sample of 100 pharmacies around the country and recorded the price (in dollars per 100 pills) of Prozac. Compute the range, variance, and standard deviation of the prices. Discuss what these statistics tell you.

- 4.32** **Xr04-32** Many traffic experts argue that the most important factor in accidents is not the average speed of cars but the amount of variation. Suppose that the speeds of a sample of 200 cars were taken over a stretch of highway that has seen numerous accidents. Compute the variance and standard deviation of the speeds, and interpret the results.

- 4.33** **Xr04-33** Three men were trying to make the football team as punters. The coach had each of them punt the ball 50 times, and the distances were recorded.
- a. Compute the variance and standard deviation for each punter.
 - b. What do these statistics tell you about the punters?

- 4.34** **Xr04-34** Variance is often used to measure quality in production-line products. Suppose that a sample of steel rods that are supposed to be exactly 100 cm long is taken. The length of each is determined, and the results are recorded. Calculate the variance and the standard deviation. Briefly describe what these statistics tell you.

- 4.35** **Xr04-35** To learn more about the size of withdrawals at a banking machine, the proprietor took a sample of 75 withdrawals and recorded the amounts. Determine the mean and standard deviation of these data, and describe what these two statistics tell you about the withdrawal amounts.

- 4.36** **Xr04-36** Everyone is familiar with waiting lines or queues. For example, people wait in line at a supermarket to go through the checkout counter. There are two factors that determine how long the queue becomes. One is the speed of service. The other is the number of arrivals at the checkout counter.

The mean number of arrivals is an important number, but so is the standard deviation. Suppose that a consultant for the supermarket counts the number of arrivals per hour during a sample of 150 hours.

- Compute the standard deviation of the number of arrivals.
- Assuming that the histogram is bell shaped, interpret the standard deviation.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 4.37 **ANES2008*** The ANES in 2012 asked respondents to state their ages stored as AGE.

- Calculate the mean, variance, and standard deviation.
- Draw a histogram.
- Use the Empirical rule, if applicable, or Chebyshev's Theorem to interpret the mean and standard deviation.

- 4.38 **ANES2008*** Respondents were asked to report the number of minutes spent watching news on television during a typical day (TIME2).

- Calculate the mean and standard deviation.
- Draw a histogram.
- Use the Empirical rule, if applicable, or Chebyshev's Theorem to interpret the mean and standard deviation.



GENERAL SOCIAL SURVEY EXERCISE

- 4.39 **GSS2008*** One of the questions in the 2008 General Social Survey was, if you were born outside the United States, at what age did you permanently move to the United States (AGECMUS)?

- Calculate the mean, variance, and standard deviation.

- Draw a histogram.
- Use the Empirical rule, if applicable, or Chebyshev's Theorem to interpret the mean and standard deviation.

4-3 MEASURES OF RELATIVE STANDING AND BOX PLOTS

Measures of relative standing are designed to provide information about the position of particular values relative to the entire data set. We've already presented one measure of relative standing, the median, which is also a measure of central location. Recall that the median divides the data set into halves, allowing the statistics practitioner to determine which half of the data set each observation lies in. The statistics we're about to introduce will give you much more detailed information.

Percentile

The *P*th percentile is the value for which *P* percent are less than that value and $(100 - P)\%$ are greater than that value.

The scores and the percentiles of the Scholastic Achievement Test (SAT) and the Graduate Management Admission Test (GMAT), as well as various other admissions tests, are reported to students taking them. Suppose for example, that your SAT score is reported to be at the 60th percentile. This means that 60% of all the other marks are below yours and 40% are above it. You now know exactly where you stand relative to the population of SAT scores.

We have special names for the 25th, 50th, and 75th percentiles. Because these three statistics divide the set of data into quarters, these measures of relative standing are also called **quartiles**. The *first or lower quartile* is labeled Q_1 . It is equal to the 25th percentile. The *second quartile*, Q_2 , is equal to the 50th percentile, which is also the median. The *third or upper quartile*, Q_3 , is equal to the 75th percentile. Incidentally, many people confuse the terms *quartile* and *quarter*. A common error is to state that someone is in the lower *quartile* of a group when they actually mean that someone is in the lower *quarter* of a group.

Besides quartiles, we can also convert percentiles into quintiles and deciles. *Quintiles* divide the data into fifths, and *deciles* divide the data into tenths.

4-3a Locating Percentiles

The following formula allows us to approximate the location of any percentile.

Location of a Percentile

$$L_P = (n + 1) \frac{P}{100}$$

where L_P is the location of the P th percentile.

EXAMPLE 4.11

Percentiles of Time Spent on Internet

Calculate the 25th, 50th, and 75th percentiles (first, second, and third quartiles) of the data in Example 4.1.

SOLUTION:

Placing the 10 observations in ascending order we get

0 0 5 7 8 9 12 14 22 33

The location of the 25th percentile is

$$L_{25} = (10 + 1) \frac{25}{100} = (11)(.25) = 2.75$$

The 25th percentile is three-quarters of the distance between the second (which is 0) and the third (which is 5) observations. Three-quarters of the distance is

$$(0.75)(5 - 0) = 3.75$$

Because the second observation is 0, the 25th percentile is $0 + 3.75 = 3.75$.

To locate the 50th percentile, we substitute $P = 50$ into the formula and produce

$$L_{50} = (10 + 1) \frac{50}{100} = (11)(.5) = 5.5$$

which means that the 50th percentile is halfway between the fifth and sixth observations. The fifth and sixth observations are 8 and 9, respectively. The 50th percentile is 8.5. This is the median calculated in Example 4.3.

The 75th percentile's location is

$$L_{75} = (10 + 1) \frac{75}{100} = (11)(.75) = 8.25$$

Thus, it is located one-quarter of the distance between the eighth and ninth observations, which are 14 and 22, respectively. One-quarter of the distance is

$$(.25)(22 - 14) = 2$$

which means that the 75th percentile is

$$14 + 2 = 16$$

EXAMPLE 4.12

DATA

Xm03-01

Quartiles of Long-Distance Telephone Bills

Determine the quartiles for Example 3.1.

SOLUTION:

EXCEL

	A	B
1		<i>Bills</i>
2		
3	Mean	43.59
4	Standard Error	2.76
5	Median	26.91
6	Mode	0
7	Standard Deviation	38.97
8	Sample Variance	1518.64
9	Kurtosis	-1.29
10	Skewness	0.54
11	Range	119.63
12	Minimum	0
13	Maximum	119.63
14	Sum	8717.52
15	Count	200
16	Largest(50)	85
17	Smallest(50)	9.22

INSTRUCTIONS

Follow the instructions for **Descriptive Statistics** (page 100). In the dialog box, click **Kth Largest** and type in the integer closest to $n/4$. Repeat for **Kth Smallest**, typing in the integer closest to $n/4$.

Excel approximates the third and first quartiles in the following way. The **Largest(50)** is 85, which is the number such that 150 numbers are below it and 49 numbers are above it. The **Smallest(50)** is 9.22, which is the number such that 49 numbers are below it and 150 numbers are above it. The median is 26.91, a statistic we discussed in Example 4.4.

MINITAB**Descriptive Statistics: Bills**

Variable	Mean	StDev	Variance	Minimum	Q1	Median	Q3	Maximum
Bills	43.59	38.97	1518.64	0.00	9.28	26.91	84.94	119.63

Minitab outputs the first and third quartiles as Q1(9.28) and Q3(84.94), respectively. (See page 100.)

We can often get an idea of the shape of the histogram from the quartiles. For example, if the first and second quartiles are closer to each other than are the second and third quartiles, then the histogram is positively skewed. If the first and second quartiles are farther apart than the second and third quartiles, then the histogram is negatively skewed. If the difference between the first and second quartiles is approximately equal to the difference between the second and third quartiles, then the histogram is approximately symmetric. The box plot described subsequently is particularly useful in this regard.

4-3b Interquartile Range

The quartiles can be used to create another measure of variability, the **interquartile range**, which is defined as follows.

Interquartile Range

$$\text{Interquartile range} = Q_3 - Q_1$$

The interquartile range measures the spread of the middle 50% of the observations. Large values of this statistic mean that the first and third quartiles are far apart, indicating a high level of variability.

EXAMPLE 4.13

DATA
Xm03-01

Interquartile Range of Long-Distance Telephone Bills

Determine the interquartile range for Example 3.1.

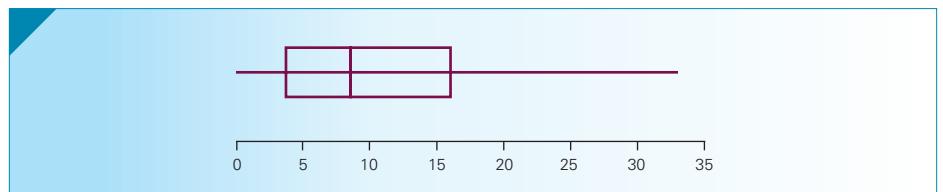
SOLUTION:

Using Excel's approximations of the first and third quartiles, we find

$$\text{Interquartile range} = Q_3 - Q_1 = 85 - 9.22 = 75.78$$

4-3c Box Plots

Now that we have introduced quartiles we can present one more graphical technique, the **box plot**. This technique graphs five statistics: the minimum and maximum observations, and the first, second, and third quartiles. It also depicts other features of a set of data. Figure 4.1 exhibits the box plot of the data in Example 4.1.

FIGURE 4.1 Box Plot for Example 4.1

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The three vertical lines of the box are the first, second, and third quartiles. The lines extending to the left and right are called *whiskers*. Any points that lie outside the whiskers are called *outliers*. The whiskers extend outward to the smaller of 1.5 times the interquartile range or to the most extreme point that is not an outlier.

Outliers Outliers are unusually large or small observations. Because an outlier is considerably removed from the main body of the data set, its validity is suspect. Consequently, outliers should be checked to determine that they are not the result of an error in recording their values. Outliers can also represent unusual observations that should be investigated. For example, if a salesperson's performance is an outlier on the high end of the distribution, the company could profit by determining what sets that salesperson apart from the others.

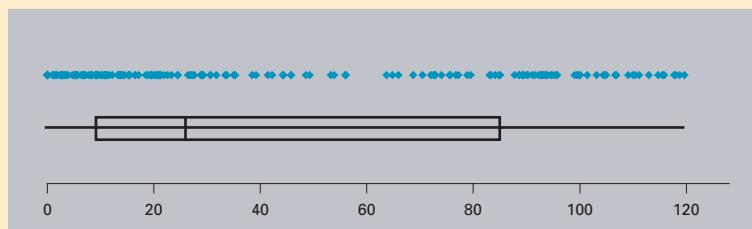
EXAMPLE 4.14

DATA
Xm03-01

Box Plot of Long-Distance Telephone Bills

Draw the box plot for Example 3.1.

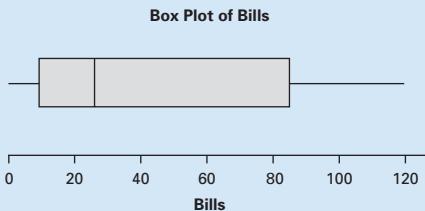
SOLUTION:

EXCEL**INSTRUCTIONS**

1. Type or import the data into one column or two or more adjacent columns. (Open Xm03-01.)
2. Click **Add-Ins**, **Data Analysis Plus**, and **Box Plot**.
3. Specify the **Input Range** (**A1:A201**).

A box plot will be created for each column of data that you have specified or highlighted.

Notice that the quartiles produced in the **Box Plot** are not exactly the same as those produced by **Descriptive Statistics**. The **Box Plot** command uses a slightly different method than the **Descriptive Methods** command.

MINITAB**INSTRUCTIONS**

1. Type or import the data into one column or more columns. ([Open Xm03-01.](#))
2. Click **Graph** and **Box Plot . . .**
3. Click **Simple** if there is only one column of data or **Multiple Y's** if there are two or more columns.
4. Type or **Select** the variable or variables in the **Graph variables** box (**Bills**).
5. The box plot will be drawn so that the values will appear on the vertical axis. To turn the box plot on its side click **Scale . . . , Axes and Ticks**, and **Transpose value and category scales**.

INTERPRET

The smallest value is 0, and the largest is 119.63. The first, second, and third quartiles are 9.275, 26.905, and 84.9425, respectively. The interquartile range is 75.6675. One and one-half times the interquartile range is $1.5 \times 75.6675 = 113.5013$. Outliers are defined as any observations that are less than $9.275 - 113.5013 = -104.226$ and any observations that are larger than $84.9425 + 113.5013 = 198.4438$. The whisker to the left extends only to 0, which is the smallest observation that is not an outlier. The whisker to the right extends to 119.63, which is the largest observation that is not an outlier. There are no outliers.

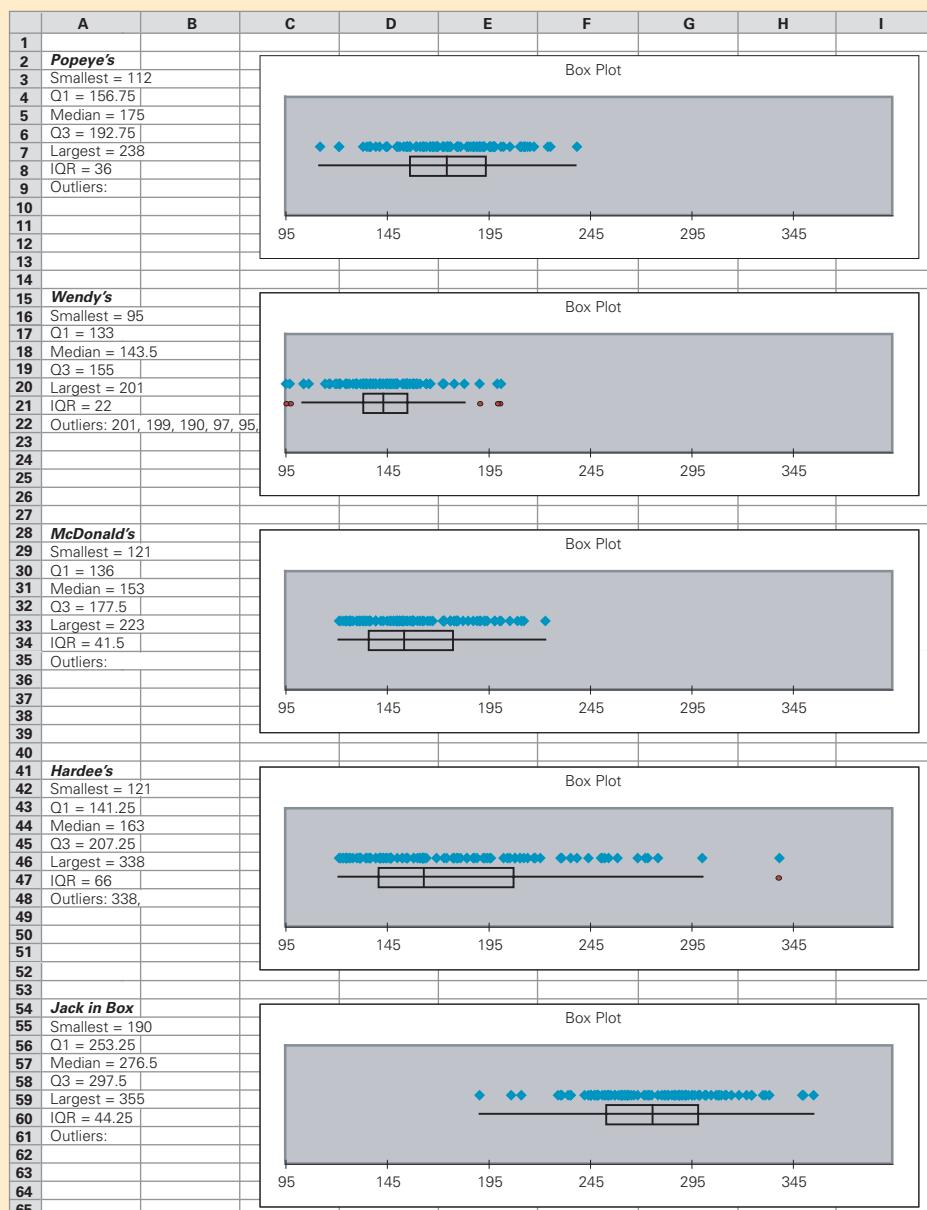
The box plot is particularly useful when comparing two or more data sets.

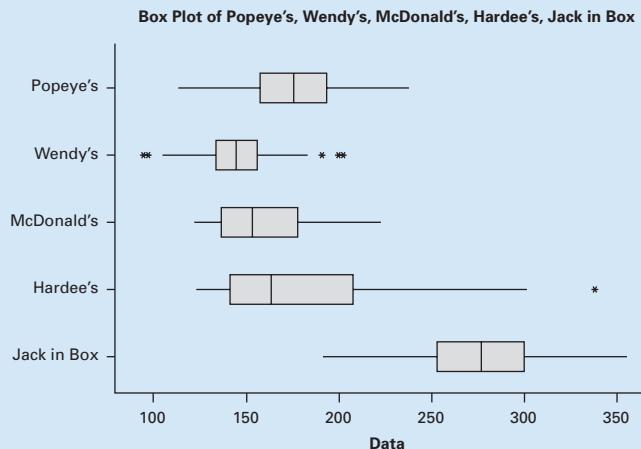
EXAMPLE 4.15**DATA****Xm04-15****Comparing Service Times of Fast-Food Restaurants' Drive-Throughs**

A large number of fast-food restaurants with drive-through windows offer drivers and their passengers the advantages of quick service. To measure how good the service is, an organization called QSR planned a study in which the amount of time taken by a sample of drive-through customers at each of five restaurants was recorded. Compare the five sets of data using a box plot and interpret the results.

SOLUTION:

We use the computer and our software to produce the box plots.

EXCEL

MINITAB**INTERPRET**

Wendy's times appear to be the lowest and most consistent. The service times for Hardee's display considerably more variability. The slowest service times are provided by Jack in the Box. The service times for Popeye's, Wendy's, and Jack in Box seem to be symmetric. However, the times for McDonald's and Hardee's are positively skewed.

4-3d Measures of Relative Standing and Variability for Ordinal Data

Because the measures of relative standing are computed by ordering the data, these statistics are appropriate for ordinal as well as for interval data. Furthermore, because the interquartile range is calculated by taking the difference between the upper and lower quartiles, it too can be employed to measure the variability of ordinal data.

Here are the factors that tell us when to use the techniques presented in this section.

Factors That Identify When to Compute Percentiles and Quartiles

1. **Objective:** Describe a single set of data
2. **Type of data:** Interval or ordinal
3. **Descriptive measurement:** Relative standing

Factors That Identify When to Compute the Interquartile Range

1. **Objective:** Describe a single set of data
2. **Type of data:** Interval or ordinal
3. **Descriptive measurement:** Variability



EXERCISES

- 4.40** Calculate the first, second, and third quartiles of the following sample.

5 8 2 9 5 3 7 4 2 7 4 10 4 3 5

- 4.41** Find the third and eighth deciles (30th and 80th percentiles) of the following data set.

26	23	29	31	24
22	15	31	30	20

- 4.42** Find the first and second quintiles (20th and 40th percentiles) of the data shown here.

52	61	88	43	64
71	39	73	51	60

- 4.43** Determine the first, second, and third quartiles of the following data.

10.5	14.7	15.3	17.7	15.9	12.2	10.0
14.1	13.9	18.5	13.9	15.1	14.7	

- 4.44** Calculate the 3rd and 6th deciles of the accompanying data.

7	18	12	17	29	18	4	27	30	2
4	10	21	5	8					

- 4.45** Refer to Exercise 4.43. Determine the interquartile range.

- 4.46** Refer to Exercise 4.40. Determine the interquartile range.

- 4.47** Compute the interquartile range from the following data.

5 8 14 6 21 11 9 10 18 2

- 4.48** Draw the box plot of the following set of data.

9	28	15	21	12	22	29	
20	23	31	11	19	24	16	13

The following exercises require a computer and software.

- 4.49** **Xr04-49** Many automotive experts believe that speed limits on highways are too low. One particular expert has stated that he thinks that most drivers drive at speeds that they consider safe. He suggested that the “correct” speed limit should be set at the 85th percentile. Suppose that a random sample of 400 speeds on a highway where the limit is 60 mph was recorded. Find the “correct” speed limit.

- 4.50** **Xr04-50** Accountemps, a company that supplies temporary workers, sponsored a survey of 100 executives. Each was asked to report the number of minutes they spend screening each job resume they receive.
- Compute the quartiles.
 - What information did you derive from the quartiles? What does this suggest about writing your resume?

- 4.51** **Xr04-51** How much do pets cost? A random sample of dog and cat owners was asked to compute the amounts of money spent on their pets (exclusive of pet food). Draw a box plot for each data set and describe your findings.

- 4.52** **Xr04-52** The Travel Industry Association of America sponsored a poll that asked a random sample of people how much they spent in preparation for pleasure travel. Determine the quartiles and describe what they tell you.

- 4.53** **Xr04-53** The career-counseling center at a university wanted to learn more about the starting salaries of the university’s graduates. They asked each graduate to report the highest salary offer received. The survey also asked each graduate to report the degree and starting salary (column 1 = BA, column 2 = BSc, column 3 = BBA, column 4 = other). Draw box plots to compare the four groups of starting salaries. Report your findings.

- 4.54 Xr04-54** A random sample of Boston Marathon runners was drawn and the times to complete the race were recorded.
- Draw the box plot.
 - What are the quartiles?
 - Identify outliers.
 - What information does the box plot deliver?
- 4.55 Xr04-55** Do golfers who are members of private courses play faster than players on a public course? The amount of time taken for a sample of private-course and public-course golfers was recorded.
- Draw box plots for each sample.
 - What do the box plots tell you?
- 4.56 Xr04-56** For many restaurants, the amount of time customers linger over coffee and dessert negatively

affects profits. To learn more about this variable, a sample of 200 restaurant groups was observed, and the amount of time customers spent in the restaurant was recorded.

- Calculate the quartiles of these data.
- What do these statistics tell you about the amount of time spent in this restaurant?

- 4.57 Xr04-57** In the United States, taxpayers are allowed to deduct mortgage interest from their incomes before calculating the amount of income tax they are required to pay. In 2008, the Internal Revenue Service sampled 500 tax returns that had a mortgage interest deduction.

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 489.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 4.58 ANES2008*** In the 2008 survey people were asked to indicate the amount of time they spent in a typical day receiving news about the election on the Internet (TIME1) and on television (TIME2). Compare the two amounts of time by drawing box plots (using the same scale) and describe what the graphs tell you. (Excel users: You must have adjacent columns.)

- 4.59 ANES2008*** Draw a box plot of the ages (AGE) of respondents in the 2008 survey.

- 4.60 ANES2008*** Draw a box plot of the education level of both married spouses (EDUC and SPEDUC). Describe your findings.



GENERAL SOCIAL SURVEY EXERCISES

- 4.61 GSS2012*** Draw a box plot of the ages (AGE) of respondents from the 2012 survey. Briefly describe the graph.

- 4.62 GSS2012*** Produce a box plot of the amount of television watched (TVHOURS). State what the graph tells you.

4-4

MEASURES OF LINEAR RELATIONSHIP

In Chapter 3, we introduced the scatter diagram, a graphical technique that describes the relationship between two interval variables. At that time, we pointed out that we were particularly interested in the direction and strength of the linear relationship. We now present three numerical measures of linear relationship that provide this information: *covariance*, *coefficient of correlation*, and *coefficient of determination*. Later in this section, we discuss another related numerical technique, the *least squares line*.

4-4a Covariance

As we did in Chapter 3, we label one variable X and the other Y .

Covariance

$$\text{Population covariance: } \sigma_{xy} = \frac{\sum_{i=1}^N (x_i - \mu_x)(y_i - \mu_y)}{N}$$

$$\text{Sample covariance: } s_{xy} = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{n - 1}$$

The denominator in the calculation of the sample **covariance** is $n - 1$, not the more logical n for the same reason we divide by $n - 1$ to calculate the sample variance (see page 106). If you plan to compute the sample covariance manually, here is a shortcut calculation.

Shortcut for Sample Covariance

$$s_{xy} = \frac{1}{n - 1} \left[\sum_{i=1}^n x_i y_i - \frac{\sum_{i=1}^n x_i \sum_{i=1}^n y_i}{n} \right]$$

To illustrate how covariance measures the linear relationship, examine the following three sets of data.

Set 1

x_i	y_i	$(x_i - \bar{x})$	$(y_i - \bar{y})$	$(x_i - \bar{x})(y_i - \bar{y})$
2	13	-3	-7	21
6	20	1	0	0
7	27	2	7	14
$\bar{x} = 5$ $\bar{y} = 20$			$s_{xy} = 35/2 = 17.5$	

Set 2

x_i	y_i	$(x_i - \bar{x})$	$(y_i - \bar{y})$	$(x_i - \bar{x})(y_i - \bar{y})$
2	27	-3	7	-21
6	20	1	0	0
7	13	2	-7	-14
$\bar{x} = 5$ $\bar{y} = 20$			$s_{xy} = -35/2 = -17.5$	

Set 3

x_i	y_i	$(x_i - \bar{x})$	$(y_i - \bar{y})$	$(x_i - \bar{x})(y_i - \bar{y})$
2	20	-3	0	0
6	27	1	7	7
7	13	2	-7	-14
$\bar{x} = 5$		$\bar{y} = 20$	$s_{xy} = -7/2 = -3.5$	

Notice that the values of x are the same in all three sets and that the values of y are also the same. The only difference is the *order* of the values of y .

In set 1, as x increases so does y . When x is larger than its mean, y is at least as large as its mean. Thus $(x_i - \bar{x})$ and $(y_i - \bar{y})$ have the same sign or 0. Their product is also positive or 0. Consequently, the covariance is a positive number. Generally, when two variables move in the same direction (both increase or both decrease), the covariance will be a large positive number.

If you examine set 2, you will discover that as x increases, y decreases. When x is larger than its mean, y is less than or equal to its mean. As a result when $(x_i - \bar{x})$ is positive, $(y_i - \bar{y})$ is negative or 0. Their products are either negative or 0. It follows that the covariance is a negative number. In general, when two variables move in opposite directions, the covariance is a large negative number.

In set 3, as x increases, y does not exhibit any particular direction. One of the products $(x_i - \bar{x})(y_i - \bar{y})$ is 0, one is positive, and one is negative. The resulting covariance is a small number. In general, when there is no particular pattern, the covariance is a small number.

We would like to extract two pieces of information. The first is the sign of the covariance, which tells us the nature of the relationship. The second is the magnitude, which describes the strength of the association. Unfortunately, the magnitude may be difficult to judge. For example, if you're told that the covariance between two variables is 500, does this mean that there is a strong linear relationship? The answer is that it is impossible to judge without additional statistics. Fortunately, we can improve on the information provided by this statistic by creating another one.

4-4b Coefficient of Correlation

The **coefficient of correlation** is defined as the covariance divided by the standard deviations of the variables.

Coefficient of Correlation

$$\text{Population coefficient of correlation: } \rho = \frac{\sigma_{xy}}{\sigma_x \sigma_y}$$

$$\text{Sample coefficient of correlation: } r = \frac{s_{xy}}{s_x s_y}$$

The population parameter is denoted by the Greek letter *rho*.

The advantage that the coefficient of correlation has over the covariance is that the former has a set lower and upper limit. The limits are -1 and +1, respectively—that is,

$$-1 \leq r \leq +1 \quad \text{and} \quad -1 \leq \rho \leq +1$$

When the coefficient of correlation equals -1 , there is a negative linear relationship and the scatter diagram exhibits a straight line. When the coefficient of correlation equals $+1$, there is a perfect positive relationship. When the coefficient of correlation equals 0 , there is no linear relationship. All other values of correlation are judged in relation to these three values. The drawback to the coefficient of correlation is that—except for the three values -1 , 0 , and $+1$ —we cannot interpret the correlation. For example, suppose that we calculated the coefficient of correlation to be $-.4$. What does this tell us? It tells us two things. The minus sign tells us the relationship is negative and because $.4$ is closer to 0 than to 1 , we judge that the linear relationship is weak. In many applications, we need a better interpretation than the “linear relationship is weak.” Fortunately, there is yet another measure of the strength of a linear relationship, which gives us more information. It is the *coefficient of determination*, which we introduce later in this section.

EXAMPLE 4.16

Calculating the Coefficient of Correlation

Calculate the coefficient of correlation for the three sets of data on pages 123–124.

SOLUTION:

Because we’ve already calculated the covariances we need to compute only the standard deviations of X and Y .

$$\bar{x} = \frac{2 + 6 + 7}{3} = 5.0$$

$$\bar{y} = \frac{13 + 20 + 27}{3} = 20.0$$

$$s_x^2 = \frac{(2 - 5)^2 + (6 - 5)^2 + (7 - 5)^2}{3 - 1} = \frac{9 + 1 + 4}{2} = 7.0$$

$$s_y^2 = \frac{(13 - 20)^2 + (20 - 20)^2 + (27 - 20)^2}{3 - 1} = \frac{49 + 0 + 49}{2} = 49.0$$

The standard deviations are

$$s_x = \sqrt{7.0} = 2.65$$

$$s_y = \sqrt{49.0} = 7.00$$

The coefficients of correlation are:

$$\text{Set 1: } r = \frac{s_{xy}}{s_x s_y} = \frac{17.5}{(2.65)(7.0)} = .943$$

$$\text{Set 2: } r = \frac{s_{xy}}{s_x s_y} = \frac{-17.5}{(2.65)(7.0)} = -.943$$

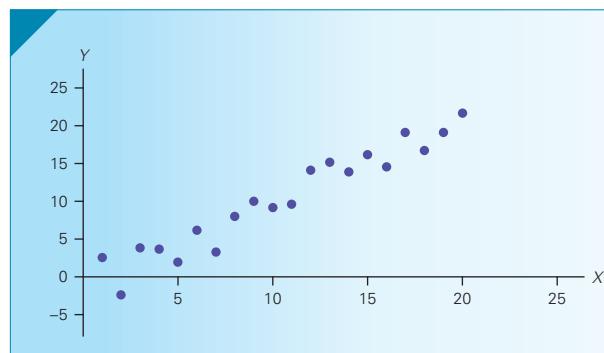
$$\text{Set 3: } r = \frac{s_{xy}}{s_x s_y} = \frac{-3.5}{(2.65)(7.0)} = -.189$$

It is now easier to see the strength of the linear relationship between X and Y .

4-4c Comparing the Scatter Diagram, Covariance, and Coefficient of Correlation

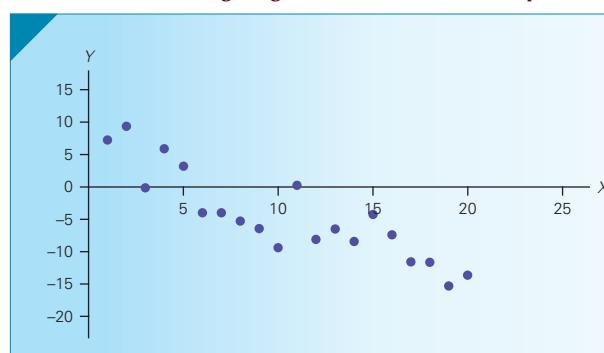
The scatter diagram depicts relationships graphically; the covariance and the coefficient of correlation describe the linear relationship numerically. Figures 4.2, 4.3, and 4.4 depict three scatter diagrams. To show how the graphical and numerical techniques compare, we calculated the covariance and the coefficient of correlation for each. (The data are stored in files Fig04-02, Fig04-03, and Fig04-04.) As you can see, Figure 4.2 depicts a strong positive relationship between the two variables. The covariance is 36.87, and the coefficient of correlation is .9641. The variables in Figure 4.3 produced a relatively strong negative linear relationship; the covariance and coefficient of correlation are -34.18 and -.8791, respectively. The covariance and coefficient of correlation for the data in Figure 4.4 are 2.07 and .1206, respectively. There is no apparent linear relationship in this figure.

FIGURE 4.2 Strong Positive Linear Relationship



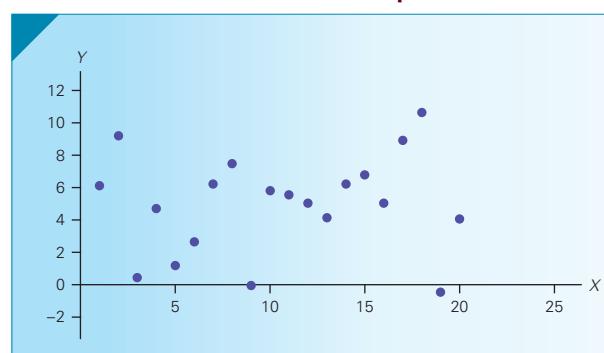
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FIGURE 4.3 Strong Negative Linear Relationship



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FIGURE 4.4 No Linear Relationship



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4-4d Least Squares Method

When we presented the scatter diagram in Section 3-3, we pointed out that we were interested in measuring the strength and direction of the linear relationship. Both can be more easily judged by drawing a straight line through the data. However, if different people draw a line through the same data set, it is likely that each person's line will differ from all the others. Moreover, we often need to know the equation of the line. Consequently, we need an objective method of producing a straight line. Such a method has been developed; it is called the **least squares method**.

The least squares method produces a straight line drawn through the points so that the sum of squared deviations between the points and the line is minimized. The line is represented by the equation:

$$\hat{y} = b_0 + b_1 x$$

where b_0 is the y -intercept (where the line intercepts the y -axis), and b_1 is the slope (defined as rise/run), and \hat{y} (y hat) is the value of y determined by the line. The coefficients b_0 and b_1 are derived using calculus so that we minimize the sum of squared deviations:

$$\sum_{i=1}^n (y_i - \hat{y}_i)^2$$

Least Squares Line Coefficients

$$b_1 = \frac{s_{xy}}{s_x^2}$$

$$b_0 = \bar{y} - b_1 \bar{x}$$

APPLICATIONS in ACCOUNTING

Breakeven Analysis

Breakeven analysis is an extremely important business tool, one that you will likely encounter repeatedly in your course of studies. It can be used to determine how much sales volume your business needs to start making a profit.

In Section 3-1 (page 44) we briefly introduced the four P's of marketing and illustrated the problem of pricing with Example 3.1. Breakeven analysis is especially useful when managers are attempting to determine the appropriate price for the company's products and services.

A company's profit can be calculated simply as

$$\text{Profit} = (\text{Price per unit} - \text{variable cost per unit}) \times (\text{Number of units sold}) - \text{Fixed costs}$$

The breakeven point is the number of units sold such that the profit is 0. Thus, the breakeven point is calculated as

$$\text{Number of units sold} = \text{Fixed cost}/(\text{Price} - \text{Variable cost})$$

Managers can use the formula to help determine the price that will produce a profit. However, to do so requires knowledge of the fixed and variable costs. For example, suppose that a bakery sells only loaves of bread. The bread sells for \$1.20, the variable cost is \$0.40, and the fixed annual costs are \$10,000. The breakeven point is

$$\text{Number of units sold} = 10,000/(1.20 - 0.40) = 12,500$$

The bakery must sell more than 12,500 loaves per year to make a profit.

In the next application box, we discuss fixed and variable costs.

APPLICATIONS in ACCOUNTING

Steve Allen/Brand X Pictures/
Getty Images



Fixed and Variable Costs

Fixed costs are costs that must be paid whether or not any units are produced. These costs are “fixed” over a specified period of time or range of production. Variable costs are costs that vary directly with the number of products produced. For the previous bakery example, the fixed costs would include rent and maintenance of the shop, wages paid to employees, advertising costs, telephone, and any other costs that are not related to the number of loaves baked. The variable cost is primarily the cost of ingredients, which rises in relation to the number of loaves baked.

Some expenses are mixed. For the bakery example, one such cost is the cost of electricity. Electricity is needed for lights, which is considered a fixed cost, but also for the ovens and other equipment, which are variable costs.

There are several ways to break the mixed costs into fixed and variable components. One such method is the least squares line; that is, we express the total costs of some component as

$$y = b_0 + b_1x$$

where y = total mixed cost, b_0 = fixed cost, b_1 = variable cost, and x is the number of units.

EXAMPLE 4.17

DATA
Xm04-17

Estimating Fixed and Variable Costs

A tool and die maker operates out of a small shop making specialized tools. He is considering increasing the size of his business and needs to know more about his costs. One such cost is electricity, which he needs to operate his machines and lights. (Some jobs require that he turn on extra bright lights to illuminate his work.) He keeps track of his daily electricity costs and the number of tools that he made that day. These data are listed next. Determine the fixed and variable electricity costs.

Day	1	2	3	4	5	6	7	8	9	10
Number of tools	7	3	2	5	8	11	5	15	3	6
Electricity cost	23.80	11.89	15.98	26.11	31.79	39.93	12.27	40.06	21.38	18.65

SOLUTION:

The dependent variable is the daily cost of electricity, and the independent variable is the number of tools. To calculate the coefficients of the least squares line and other statistics (calculated below), we need the sum of X , Y , XY , X^2 , and Y^2 .

Day	X	Y	XY	X ²	Y ²
1	7	23.80	166.60	49	566.44
2	3	11.89	35.67	9	141.37
3	2	15.98	31.96	4	255.36
4	5	26.11	130.55	25	681.73
5	8	31.79	254.32	64	1010.60
6	11	39.93	439.23	121	1594.40
7	5	12.27	61.35	25	150.55
8	15	40.06	600.90	225	1604.80
9	3	21.38	64.14	9	457.10
10	6	18.65	111.90	36	347.82
Total	65	241.86	1896.62	567	6810.20

Covariance:

$$s_{xy} = \frac{1}{n-1} \left[\sum_{i=1}^n x_i y_i - \frac{\sum_{i=1}^n x_i \sum_{i=1}^n y_i}{n} \right] = \frac{1}{10-1} \left[1896.62 - \frac{(65)(241.86)}{10} \right] = 36.06$$

Variance of X :

$$s_x^2 = \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right] = \frac{1}{10-1} \left[567 - \frac{(65)^2}{10} \right] = 16.06$$

Sample means

$$\bar{x} = \frac{\sum x_I}{n} = \frac{65}{10} = 6.5$$

$$\bar{y} = \frac{\sum y_i}{n} = \frac{241.86}{10} = 24.19$$

The coefficients of the least squares line are

Slope

$$b_1 = \frac{s_{xy}}{s_x^2} = \frac{36.06}{16.06} = 2.25$$

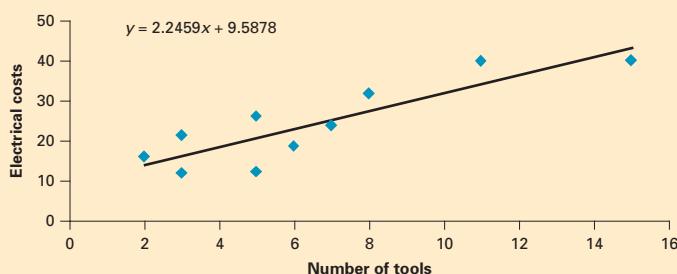
y -intercept:

$$b_0 = \bar{y} - b_1 \bar{x} = 24.19 - (2.25)(6.5) = 9.57$$

The least squares line is

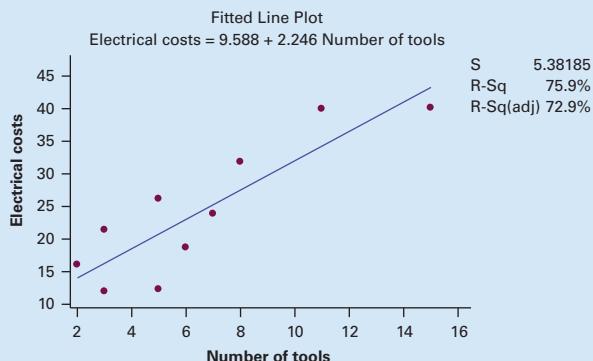
$$\hat{y} = 9.57 + 2.25x$$

EXCEL



INSTRUCTIONS

1. Type or import the data into two columns where the first column stores the values of X and the second stores Y . (Open Xm04-17.) Highlight the columns containing the variables. Follow the instructions to draw a scatter diagram (page 74).
2. In the **Chart Tools** and **Layout** menu, click **Trendline** and **Linear Trendline**.
3. Click **Trendline** and **More Trendline Options . . .** Click **Display Equation on Chart**.

MINITAB**INSTRUCTIONS**

1. Type or import the data into two columns. (Open Xm04-17.)
2. Click **Stat**, **Regression**, and **Fitted Line Plot**.
3. Specify the **Response [Y]** (Electrical cost) and the **Predictor [X]** (Number of tools) variables. Specify **Linear**.

INTERPRET

The slope is defined as rise/run, which means that it is the change in y (rise) for a one-unit increase in x (run). Put less mathematically, the slope measures the *marginal* rate of change in the dependent variable. The marginal rate of change refers to the effect of increasing the independent variable by one additional unit. In this example, the slope is 2.25, which means that in this sample, for each one-unit increase in the number of tools, the marginal increase in the electricity cost is \$2.25. Thus, the estimated variable cost is \$2.25 per tool.

The y -intercept is 9.57; that is, the line strikes the y -axis at 9.57. This is simply the value of \hat{y} when $x = 0$. However, when $x = 0$, we are producing no tools and hence the estimated fixed cost of electricity is \$9.57 per day.

Because the costs are estimates based on a straight line, we often need to know how well the line fits the data.

EXAMPLE 4.18

DATA
Xm04-17

Measuring the Strength of the Linear Relationship

Calculate the coefficient of correlation for Example 4.17.

SOLUTION:

To calculate the coefficient of correlation, we need the covariance and the standard deviations of both variables. The covariance and the variance of X were calculated in Example 4.17. The covariance is

$$s_{xy} = 36.06$$

and the variance of X is

$$s_x^2 = 16.06$$

Standard deviation of X is

$$s_x = \sqrt{s_x^2} = \sqrt{16.06} = 4.01$$

All we need is the standard deviation of Y .

$$s_y^2 = \frac{1}{n-1} \left[\sum_{i=1}^n y_i^2 - \frac{\left(\sum_{i=1}^n y_i \right)^2}{n} \right] = \frac{1}{10-1} \left[6810.20 - \frac{(241.86)^2}{10} \right] = 106.73$$

$$s_y = \sqrt{s_y^2} = \sqrt{106.73} = 10.33$$

The coefficient of correlation is

$$r = \frac{s_{XY}}{s_x s_y} = \frac{36.06}{(4.01)(10.33)} = .8705$$

EXCEL

As with the other statistics introduced in this chapter, there is more than one way to calculate the coefficient of correlation and the covariance. Here are the instructions for both.

INSTRUCTIONS

- Type or import the data into two columns. (Open Xm04-17.) Type the following into any empty cell.

= CORREL([Input range of one variable], [Input range of second variable])

In this example, we would enter

= CORREL(B1:B11, C1:C11)

To calculate the covariance, replace **CORREL** with **COVAR**.

Another method, which is also useful if you have more than two variables and would like to compute the coefficient of correlation or the covariance for each pair of variables, is to produce the correlation matrix and the variance–covariance matrix. We do the correlation matrix first.

	A	B	C
1		Number of tools	Electrical costs
2	Number of tools		1
3	Electrical costs	0.8711	1

INSTRUCTIONS

1. Type or import the data into adjacent columns. (Open Xm04-17.)
2. Click **Data, Data Analysis, and Correlation.**
3. Specify the **Input Range (B1:C11).**

The coefficient of correlation between number of tools and electrical costs is .8711 (slightly different from the manually calculated value). (The two 1s on the diagonal of the matrix are the coefficients of number of tools and number of tools, and electrical costs and electrical costs, telling you the obvious.)

Incidentally, the formula for the population parameter ρ (Greek letter rho) and for the sample statistic r produce exactly the same value.

The variance–covariance matrix is shown next.

	A	B	C
1		Number of tools	Electrical costs
2	Number of tools		14.45
3	Electrical costs	32.45	96.06

INSTRUCTIONS

1. Type or import the data into adjacent columns. (Open Xm04-17.)
2. Click **Data, Data Analysis, and Covariance.**
3. Specify the **Input Range (B1:C11).**

Unfortunately, Excel computes the population parameters. In other words, the variance of the number of tools is $\sigma_x^2 = 14.45$, the variance of the electrical costs is $\sigma_y^2 = 96.06$, and the covariance is $\sigma_{xy} = 32.45$. You can convert these parameters to statistics by multiplying each by $n/(n - 1)$.

	D	E	F
1		Number of tools	Electrical costs
2	Number of tools		16.06
3	Electrical costs	36.06	106.73

MINITAB**Correlations: Number of tools, Electrical costs**

Pearson correlation of Number of tools and Electrical costs = 0.871

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm04-17.)
2. Click **Stat, Basic Statistics and Correlation**
3. In the **Variables** box, type **Select** the variables (**Number of Tools, Electrical Costs**).

Covariances: Number of tools, Electrical costs

	Number of tools	Electrical costs
Number of tools	16.0556	
Electrical costs	36.0589	106.7301

INSTRUCTIONS

Click **Covariance ...** instead of **Correlation ...** in step 2 above.

INTERPRET

The coefficient of correlation is .8711, which tells us that there is a positive linear relationship between the number of tools and the electricity cost. The coefficient of correlation tells us that the linear relationship is quite strong and thus the estimates of the fixed and variable costs should be good.

4-4e Coefficient of Determination

When we introduced the coefficient of correlation (page 125), we pointed out that except for -1 , 0 , and $+1$ we cannot precisely interpret its meaning. We can judge the coefficient of correlation in relation to its proximity to only -1 , 0 , and $+1$. Fortunately, we have another measure that can be precisely interpreted. It is the coefficient of determination, which is calculated by squaring the coefficient of correlation. For this reason, we denote it R^2 .

The coefficient of determination measures the amount of variation in the dependent variable that is explained by the variation in the independent variable. For example, if the coefficient of correlation is -1 or $+1$, a scatter diagram would display all the points lining up in a straight line. The coefficient of determination is 1 , which we interpret to mean that 100% of the variation in the dependent variable Y is explained by the variation in the independent variable X . If the coefficient of correlation is 0 , then there is no linear relationship between the two variables, $R^2 = 0$, and none of the variation in Y is explained by the variation in X . In Example 4.18, the coefficient of correlation was calculated to be $r = .8711$. Thus, the coefficient of determination is

$$r^2 = (.8711)^2 = .7588$$

This tells us that 75.88% of the variation in electrical costs is explained by the number of tools. The remaining 24.12% is unexplained.

Using the Computer

EXCEL

You can use Excel to calculate the coefficient of correlation and then square the result. Alternatively, use Excel to draw the least squares line. After doing so, click **Trendline**, **Trendline Options**, and **Display R-squared value on chart**.

MINITAB

Minitab automatically prints the coefficient of determination.

The concept of explained variation is an extremely important one in statistics. We return to this idea repeatedly in Chapters 13, 14, 16, 17, and 18. In Chapter 16, we explain why we interpret the coefficient of determination in the way that we do.

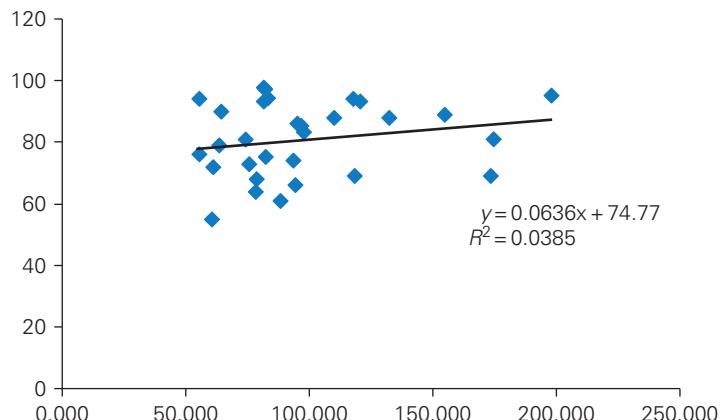
Cost of One More Win: Solution

To determine the cost of an additional win, we must describe the relationship between two variables. To do so, we use the least squares method to produce a straight line through the data. Because we believe that the number of games a baseball team wins depends to some extent on its team payroll, we label Wins as the dependent variable and Payroll as the independent variable. Because of rounding problems, we expressed the payroll in the number of millions of dollars.



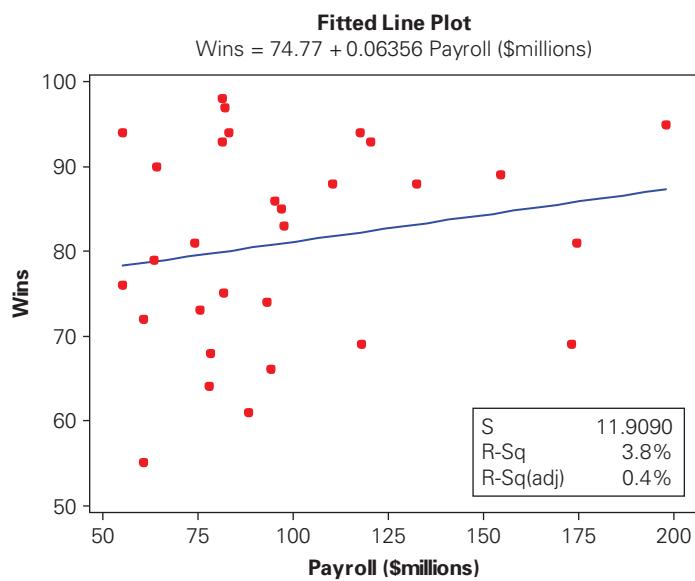
AP Photo/Charles Krupa

EXCEL



As you can see, Excel outputs the least squares line and the coefficient of determination.

MINITAB



INTERPRET

The least squares line is:

$$\hat{y} = 74.77 + .0636 x$$

The slope is equal to .0636, which is the marginal rate of change in games won for each 1-unit increase in payroll. Because payroll is measured in millions of dollars, we estimate that for each \$1 million increase in the payroll the number of games won increases on average by .0636. Thus, to win one more game requires on average an additional expenditure of an incredible \$15,723,270 (calculated as 1 million/.0636).

In addition to analyzing the least squares line, we should determine the strength of the linear relationship. The coefficient of determination is .0385, which means that the variation in the teams' payroll explains 3.85% of the variation in the teams' number of games won. This tells us that there is virtually no linear relationship between team payroll and the number of wins in the 2012 season. This suggests that there are some teams that win a small number of games with large payrolls (e.g., Boston Red Sox, \$173 million payroll, 69 wins), whereas others win a large number of games with small payrolls (e.g., Washington Nationals, \$83 million payroll and 98 wins, the most in baseball).

In the 2006 season, the least squares line was:

$$\hat{y} = 68.31 + .163 x$$

and the coefficient of determination was 28.27%.

The 2009 baseball season produced the least squares line:

$$\hat{y} = 65.76 + .1725 x$$

with a coefficient of determination of 25.12%.

4-4f Interpreting Correlation

Because of its importance, we remind you about the correct interpretation of the analysis of the relationship between two interval variables that we discussed in Chapter 3. That is, if two variables are linearly related, it does not mean that X causes Y . It may mean that another variable causes both X and Y or that Y causes X . Remember:

Correlation is not Causation

We complete this section with a review of when to use the techniques introduced in this section.

Factors that Identify When to Compute Covariance, Coefficient of Correlation, Coefficient of Determination, and Least Squares Line

1. **Objective:** Describe the relationship between two variables
2. **Type of data:** Interval



EXERCISES

- 4.63** The covariance of two variables has been calculated to be -150 . What does the statistic tell you about the relationship between the two variables?
- 4.64** Refer to Exercise 4.63. You've now learned that the two sample standard deviations are 16 and 12.
- Calculate the coefficient of correlation. What does this statistic tell you about the relationship between the two variables?
 - Calculate the coefficient of determination and describe what this says about the relationship between the two variables.
- 4.65** **Xr04-65** A retailer wanted to estimate the monthly fixed and variable selling expenses. As a first step, she collected data from the past 8 months. The total selling expenses (\$1,000) and the total sales (\$1,000) were recorded and listed below.

Total Sales	Selling Expenses
20	14
40	16
60	18
50	17
50	18
55	18
60	18
70	20

- Compute the covariance, the coefficient of correlation, and the coefficient of determination and describe what these statistics tell you.
 - Determine the least squares line and use it to produce the estimates the retailer wants.
- 4.66** **Xr04-66** Are the marks one receives in a course related to the amount of time spent studying the subject? To analyze this mysterious possibility, a student took a random sample of 10 students who had enrolled in an accounting class last semester. He asked each to report his or her mark in the course and the total number of hours spent studying accounting. These data are listed here.

Study

time	40	42	37	47	25	44	41	48	35	28
Marks	77	63	79	86	51	78	83	90	65	47

- Calculate the covariance.
- Calculate the coefficient of correlation.
- Calculate the coefficient of determination.
- Determine the least squares line.
- What do the statistics calculated above tell you about the relationship between marks and study time?

- 4.67** **Xr04-67** Students who apply to MBA programs must take the Graduate Management Admission Test (GMAT). University admissions committees use the GMAT score as one of the critical indicators of how well a student is likely to perform in the MBA program. However, the GMAT may not be a very strong indicator for all MBA programs. Suppose that an MBA program designed for middle managers who wish to upgrade their skills was launched 3 years ago. To judge how well the GMAT score predicts MBA performance, a sample of 12 graduates was taken. Their grade point averages in the MBA program (values from 0 to 12) and their GMAT score (values range from 200 to 800) are listed here. Compute the covariance, the coefficient of correlation, and the coefficient of determination. Interpret your findings.

GMAT and GPA Scores for 12 MBA Students

GMAT	599	689	584	631	594	643
GPA	9.6	8.8	7.4	10.0	7.8	9.2
GMAT	656	594	710	611	593	683
GPA	9.6	8.4	11.2	7.6	8.8	8.0

The following exercises require a computer and software.

- 4.68** **Xr04-68** The unemployment rate is an important measure of a country's economic health. The unemployment rate measures the percentage of people who are looking for work and who are without jobs. Another way of measuring this economic variable is to calculate the employment rate, which is the percentage of adults who are employed. Here are the unemployment rates and employment rates of 19 countries. Calculate the coefficient of determination and describe what you have learned.

Country	Unemployment Rate	Employment Rate
Australia	6.7	70.7
Austria	3.6	74.8
Belgium	6.6	59.9
Canada	7.2	72.0
Denmark	4.3	77.0
Finland	9.1	68.1
France	8.6	63.2
Germany	7.9	69.0
Hungary	5.8	55.4
Ireland	3.8	67.3
Japan	5.0	74.3
Netherlands	2.4	65.4
New Zealand	5.3	62.3
Poland	18.2	53.5
Portugal	4.1	72.2
Spain	13.0	57.5

Sweden	5.1	73.0
United Kingdom	5.0	72.2
United States	4.8	73.1

Source: National Post Business.

- 4.69 *Xr04-69*** All Canadians have government-funded health insurance, which pays for any medical care they require. However, when traveling out of the country, Canadians usually acquire supplementary health insurance to cover the difference between the costs incurred for emergency treatment and what the government program pays. In the United States, this cost differential can be prohibitive. Until recently, private insurance companies (such as BlueCross BlueShield) charged everyone the same weekly rate, regardless of age. However, because of rising costs and the realization that older people frequently incur greater medical emergency expenses, insurers had to change their premium plans. They decided to offer rates that depend on the age of the customer. To help determine the new rates, one insurance company gathered data concerning the age and mean daily medical expenses of a random sample of 1,348 Canadians during the previous 12-month period.
- Calculate the coefficient of determination.
 - What does the statistic calculated in part (a) tell you?
 - Determine the least squares line.
 - Interpret the coefficients.
 - What rate plan would you suggest?

- 4.70 *Xr04-70*** A real estate developer of single-family dwellings across the country is in the process of developing plans for the next several years. An analyst for the company believes that interest rates are likely to increase but remain at low levels. To help make decisions about the number of homes to build, the developer acquired the monthly bank prime rate and the number of new single-family homes sold monthly (thousands) from 1963 to 2012.

Calculate the coefficient of determination. Explain what this statistic tells you about the relationship between the prime bank rate and the number of single-family homes sold.

Source: Federal Reserve Statistics and U.S. Census Bureau.

- 4.71 *Xr04-71*** When the price of crude oil increases, do oil companies drill more oil wells? To determine the strength and nature of the relationship, an economist recorded the price of a barrel of domestic crude oil (West Texas crude) and the number of exploratory oil wells drilled for each month from 1973 to 2010. Analyze the data and explain what you have discovered.

Source: U.S. Department of Energy.

- 4.72 *Xr04-72*** One way of measuring the extent of unemployment is through the help wanted index, which

measures the number of want ads in the nation's newspapers. The higher the index, the greater the demand for workers. Another measure is the unemployment rate among insured workers. An economist wanted to know whether these two variables are related, and if so, how. He acquired the help wanted index and unemployment rates for each month between 1951 and 2006 (last year available). Determine the strength and direction of the relationship.

Source: U.S. Department of Labor Statistics.

- 4.73 *Xr04-73*** A manufacturing firm produces its products in batches using sophisticated machines and equipment. The general manager wanted to investigate the relationship between direct labor costs and the number of units produced per batch. He recorded the data from the last 30 batches. Determine the fixed and variable labor costs.
- 4.74 *Xr04-74*** A manufacturer has recorded its cost of electricity and the total number of hours of machine time for each of 52 weeks. Estimate the fixed and variable electricity costs.
- 4.75 *Xr04-75*** The chapter-opening example showed that there is a very weak linear relationship between a baseball team's payroll and the number of wins. This raises the question: Are success on the field and attendance related? If the answer is no, then profit-driven owners may not be inclined to spend money to improve their teams. The statistics practitioner recorded the number of wins and the average home attendance for the 2012 baseball season.
- Calculate whichever parameters you wish to help guide baseball owners.
 - Estimate the marginal number of tickets sold for each additional game won.
- 4.76 *Xr04-76*** Repeat Exercise 4.75 for the 2009 baseball season.
- 4.77 *Xr04-77*** Refer to Exercise 4.75. The practitioner also recorded the average away attendance for each team in the 2012 season. Because visiting teams take a share of the gate, owners should be interested in this analysis.
- Are visiting team attendance related to number of wins?
 - Estimate the marginal number of tickets sold for each additional game won.
- 4.78 *Xr04-78*** Repeat Exercise 4.77 for the 2009 season.
- 4.79 *Xr04-79*** The number of wins and payrolls for each team in the National Football League (NFL) in the 2012–2013 season was recorded.
- Determine the marginal cost of one more win.
 - Calculate the coefficient of determination and describe what this number tells you.

- 4.80 *Xr04-80*** Repeat Exercise 4.79 for the 2008–2009 NFL season.
- 4.81 *Xr04-81*** The home and away attendance figures for the National Football League for the 2012–2013 season were recorded.
- Analyze the relationship between the number of wins and home attendance.
 - Perform a similar analysis for away attendance.
 - Briefly summarize your findings.
- 4.82 *Xr04-82*** Repeat Exercise 4.81 for the 2008–2009 NFL season.
- 4.83 *Xr04-83*** The number of wins and payrolls for each team in the National Basketball Association (NBA) in the 2012–2013 season was recorded.
- Determine the marginal cost of one more win.
 - Calculate the coefficient of determination and describe what this number tells you.
- 4.84 *Xr04-84*** Repeat Exercise 4.83 for the 2008–2009 NBA season.
- 4.85 *Xr04-85*** We recorded the home and away attendance for the NBA for the 2012–2013 season.
- Analyze the relationship between the number of wins and home attendance.
- 4.86 *Xr04-86*** Repeat Exercise 4.81 for the 2008–2009 NBA season.
- 4.87 *Xr04-87*** The number of wins and payrolls for each team in the National Hockey League (NHL) in the 2013 lockout-shortened season was recorded.
- Determine the marginal cost of one more win.
 - Calculate the coefficient of determination and describe what this number tells you.
- 4.88 *Xr04-88*** Repeat Exercise 4.87 for the 2008–2009 season.
- 4.89 *Xr04-89*** We recorded the home and away attendance for the NHL for the 2013 season.
- Analyze the relationship between the number of wins and home attendance.
 - Perform a similar analysis for away attendance.
 - Briefly summarize what you have learned.
- 4.90 *Xr04-90*** Repeat Exercise 4.89 for the 2008–2009 season.



GENERAL SOCIAL SURVEY EXERCISES

(Excel users: You must have adjacent columns. We recommend that you copy the two columns into adjacent columns in a separate spreadsheet.)

- 4.91 *GSS2012**** Do more educated people watch less television?
- To answer this question, use the least squares method to determine how education (EDUC) affects the amount of time spent watching television (TVHOURS).

- Perform a similar analysis for away attendance.
- What have you learned about the relationship between how well a basketball team performs and its home and away attendance?

- 4.86 *Xr04-86*** Repeat Exercise 4.81 for the 2008–2009 NBA season.
- 4.87 *Xr04-87*** The number of wins and payrolls for each team in the National Hockey League (NHL) in the 2013 lockout-shortened season was recorded.
- Determine the marginal cost of one more win.
 - Calculate the coefficient of determination and describe what this number tells you.
- 4.88 *Xr04-88*** Repeat Exercise 4.87 for the 2008–2009 season.
- 4.89 *Xr04-89*** We recorded the home and away attendance for the NHL for the 2013 season.
- Analyze the relationship between the number of wins and home attendance.
 - Perform a similar analysis for away attendance.
 - Briefly summarize what you have learned.
- 4.90 *Xr04-90*** Repeat Exercise 4.89 for the 2008–2009 season.

- Measure the strength of the linear relationship using an appropriate statistic and explain what the statistic tells you.

- 4.92 *GSS2012**** Determine whether the number of years of education (EDUC) of the respondent is linearly related to the number of years of education of his or her father (PAEDUC).



AMERICAN NATIONAL ELECTION SURVEY EXERCISE

- 4.93 *ANES2008**** Determine whether the age (AGE) of the respondent and the amount of time he or she in a

typical week watches news on television (TIME2) are linearly related.

4-5 / (OPTIONAL) APPLICATIONS IN PROFESSIONAL SPORTS: BASEBALL

In the chapter-opening example, we provided the payrolls and the number of wins from the 2012 season. We discovered that there is a weak positive linear relationship between number of wins and payroll. The strength of the linear relationship tells us that some

teams with large payrolls are not successful on the field, whereas some teams with small payrolls win a large number of games. It would appear that although the amount of money teams spend is a factor, another factor is *how* teams spend their money. In this section, we will analyze the eight seasons between 2002 and 2009 to see how small-payroll teams succeed.

Professional sports in North America is a multibillion-dollar business. The cost of a new franchise in baseball, football, basketball, and hockey is often in the hundreds of millions of dollars. Although some teams are financially successful during losing seasons, success on the field is often related to financial success. (Exercises 4.75 and 4.76 reveal that there is a financial incentive to win more games.)

It is obvious that winning teams have better players. But how does a team get better players? Teams acquire new players in three ways:

- 1.** They can draft players from high school and college.
- 2.** They can sign free agents on their team or on other teams.
- 3.** They can trade with other teams.

4-5a Drafting Players

Every year, high school and university players are drafted by major league baseball teams. The order of the draft is in reverse order of the winning percentage the previous season. Teams that rank low in the standings rank high in the draft. A team that drafts and signs a player owns the rights to that player for his first 7 years in the minor leagues and his first 6 years in the major leagues. The decision on whom to draft and in what order is made by the general manager and a group of scouts who travel the country watching high school and college games. Young players are often invited to a camp where variables such as running speed, home run power, and, for pitchers, velocity are measured. They are often judged by whether a young man “looks” like a player. That is, taller, more athletic men are judged to be better than shorter, heavier ones.

4-5b Free Agency

For the first 3 years in the major leagues, the team can pay a player the minimum, which in 2012 was \$480,000 per year. After 3 years, the player is eligible for arbitration. A successful player can usually increase his salary by 2 to 3 million dollars through arbitration. After 6 years, the player can become a free agent and can sign with any major league team. The top free agents can make well in excess of \$10 million per year in a multiyear contract.

4-5c Trading

Teams will often trade with each other hoping that the players they acquire will help them more than the players they traded away. Many trades produce little improvement in both teams. However, in the history of baseball, there have been some very one-sided trades that resulted in great improvement in one team and the weakening of the other.

As you can see from the solved chapter-opening example “Cost of One More Win,” there is a great variation in team payrolls. In 2012, the New York Yankees spent \$198 million, while the San Diego Padres spent \$55 million (the amounts listed are payrolls at the beginning of the season). To a very large extent, the ability to finance expensive teams is a function of the city in which the team plays. For example, teams in New York, Los Angeles, Atlanta, and Arlington, Texas, are in large markets. Tampa Bay, Oakland, and Minnesota are small-market teams. Large-market teams can afford higher salaries because of the higher gate receipts and higher fees for local television. This means that small-market teams cannot compete for the services of the top free agency players, and thus are more likely to be less successful than large-market teams.

The question arises, can small-market teams be successful on the field and, if so, how? The answer lies in how players are assessed for the draft and for trades. The decisions about whom to draft, whom to trade for, and whom to give in return are made by the team’s general manager with the assistance of his assistants and the team’s scouts. Because scouts are usually former major league and minor league players who were trained by other former minor league and major league players, they tend to generally agree on the value of the players in the draft. Similarly, teams making trades often trade players of “equal” value. As a result, most teams evaluate players in the same way, yielding little differences in a player’s worth. This raises the question, how can a team get the edge on other teams? The answer lies in statistics.

You won’t be surprised to learn that the two most important variables in determining the number of wins are the number of runs the team scores and the number of runs the team allows. The number of runs allowed is a function of the quality of the team’s pitchers and, to a lesser extent, the defense. Most major league teams evaluate pitchers on the velocity of their fastball. Velocities in the 90 to 100 mile per hour range get the scouts’ attention. High school and college pitchers with fastball speeds in the 80s are seldom drafted in the early rounds even when they appear to allow fewer runs by opposing teams.

Scouts also seek out high school and college players with high batting averages and who hit home runs in high school and college.

The only way that small-budget teams can succeed is for them to evaluate players more accurately. In practice, this means that they need to judge players differently from the other teams. In the following analysis, we concentrate on the number of runs a team scores and the statistics that are related to this variable.

If the scouts are correct in their method of evaluating young players, the variables that would be most strongly related to the number of runs a team scores are batting average (BA) and the number of home runs (HR). (A player’s batting average is computed by calculating the number of times the player hits divided by the number of at bats less bases on balls.) The coefficients of correlation for seasons 2002 to 2009 are listed here.

Coefficients of Correlation	Year							
	2002	2003	2004	2005	2006	2007	2008	2009
Number of runs and batting average	.828	.889	.803	.780	.672	.762	.680	.748
Number of runs and home runs	.682	.747	.765	.713	.559	.536	.617	.744

Are there better statistics? In other words, are there other team statistics that correlate more highly with the number of runs a team scores? There are two candidates. The first is the teams’ on-base average (OBA); the second is the slugging percentage (SLG). The OBA is the number of hits plus bases on balls plus being hit by the pitcher divided by the number of at bats. The SLG is calculated by dividing the total number of

bases (Single = 1, Double = 2, Triple = 3, and Home run = 4) by the number of at bats minus bases on balls and hit by pitcher. The coefficients of correlation are listed here.

Coefficients of Correlation	Year							
	2002	2003	2004	2005	2006	2007	2008	2009
Number of runs and on-base average	.835	.916	.875	.783	.800	.875	.834	.851
Number of runs and slugging percentage	.913	.951	.929	.790	.854	.885	.903	.911

As you can see, for all eight seasons the OBA had a higher correlation with runs than did the BA.

Comparing the coefficients of correlation of runs with HR and SLG, we can see that in all eight seasons SLG was more strongly correlated than was HR.

As we've pointed out previously, we cannot definitively conclude a causal relationship from these statistics. However, because most decisions are based on the BA and HR, these statistics suggest that general managers should place much greater weight on batters' ability to get on base instead of simply reading the batting averages.

4-5d The Oakland Athletics (and a Statistics) Success Story*

From 2002 to 2006, no team was as successful as the Oakland Athletics in converting a small payroll into a large number of wins. In 2002, Oakland's payroll was \$40 million and the team won 103 games. In the same season, the New York Yankees spent \$126 million and won the same number of games. In 2003, Oakland won 96 games, second to New York's 101 games. Oakland's payroll was \$50 million, whereas New York's was \$153 million. In 2004, Oakland won 91 games with a payroll of \$59 million, and the Yankees won 101 games with a payroll of \$184 million. Oakland won 88 games in 2005, and the Yankees won 95 games. Payrolls were Oakland \$55 million, Yankees \$208 million. In 2006, the team payrolls were Oakland \$62 million, Yankees \$199 million. Team wins were Oakland 93, Yankees 97.

The Athletics owe their success to general managers who were willing to rethink how teams win. The first of these general managers was Sandy Alderson, who was hired by Oakland in 1993. He was a complete outsider with no baseball experience. This was an unusual hire in an organization in which managers and general managers are either former players or individuals who worked their way up the organization after years of service in a variety of jobs. At the time, Oakland was a high-payroll team that was successful on the field. It was in the World Series in 1988, 1989, and 1990, and had the highest payroll in 1991. The team was owned by Walter A. Haas, Jr., who was willing to spend whatever was necessary to win. When he died in 1995, the new owners decided that the payroll was too large and limited it. This forced Alderson to rethink strategy.

Sandy Alderson was a lawyer and a former marine. Because he was an outsider, he approached the job in a completely different way. He examined each aspect of the game and, among other things, concluded that before three outs everything was possible, but after three outs nothing was possible. This led him to the conclusion that the way to score runs is to minimize each player's probability of making an out. Rather than judge a player by his batting average, which is the way every other general manager assessed players, it would make more sense to judge the player on his OBA. The OBA (explained previously) is the probability of *not* making an out. Thus was born something quite rare in baseball—a new idea.

Alderson's replacement is Billy Beane, who continued and extended Alderson's thinking, including hiring a Harvard graduate to help manage the statistics.

*The Oakland success story is described in the book *Moneyball : The Art of Winning an Unfair Game* by Michael Lewis, New York London: W.W. Norton

In the previous edition of this book, we asked the question, why don't other teams do the same? The answer in 2010 is that other teams have. In the preceding three years, Oakland had not been anywhere nearly as successful as it was in the previous five (winning about 75 games each year). Apparently, Oakland's approach to evaluating players has influenced other teams. However, there is still a weak linear relationship between team success and team payroll. This means that other variables affect how many games a team wins besides what the team pays its players. Perhaps some clever general manager will find these variables. If he or she does, it may be best not to publicize the discovery in another book.

4-6 / (OPTIONAL) APPLICATIONS IN FINANCE: MARKET MODEL

In the Applications in Finance boxes on pages 144 and 145, we introduced the terms *return on investment* and *risk*. We described two goals of investing. The first is to maximize the expected or mean return and the second is to minimize the risk. Financial analysts use a variety of statistical techniques to achieve these goals. Most investors are risk-averse, which means that for them minimizing risk is of paramount importance. In Section 4-2, we pointed out that variance and standard deviation are used to measure the risk associated with investments.

APPLICATIONS in FINANCE

Stock Market Indexes

Stock markets like the New York Stock Exchange (NYSE), NASDAQ, Toronto Stock Exchange (TSE), and many others around the world calculate indexes to provide information about the prices of stocks on their exchanges. A stock market index is composed of a number of stocks that more or less represent the entire market. For example, the Dow Jones Industrial Average (DJIA) is the average price of a group of 30 NYSE stocks of large publicly traded companies. The Standard and Poor's 500 (S&P) is the average price of 500 NYSE stocks. These indexes represent their stock exchanges and give readers a quick view of how well the exchange is doing as well the economy of the country as a whole. The NASDAQ 100 is the average price of the 100 largest nonfinancial companies on the NASDAQ exchange. The S&P/TSX Composite Index is composed of 60 large companies on the TSE.

In this section, we describe one of the most important applications of the use of a least squares line. It is the well-known and often applied *market model*. This model assumes that the rate of return on a stock is linearly related to the rate of return on the stock market index. The return on the index is calculated in the same way the return on a single stock is computed. For example, if the index at the end of last year was 10,000 and the value at the end of this year is 11,000, the market index annual return is 10%. The return on the stock is the dependent variable Y and the return on the index is the independent variable X .

We use the least squares line to represent the linear relationship between X and Y . The coefficient b_1 is called the stock's *beta coefficient*, which measures how sensitive the stock's rate of return is to changes in the level of the overall market. For example, if b_1

is greater than 1, the stock's rate of return is more sensitive to changes in the level of the overall market than is the average stock. To illustrate, suppose that $b_1 = 2$. Then a 1% increase in the index results in an average increase of 2% in the stock's return. A 1% decrease in the index produces an average 2% decrease in the stock's return. Thus, a stock with a beta coefficient greater than 1 will tend to be more volatile than the market.

EXAMPLE 4.19

DATA
Xm04-19

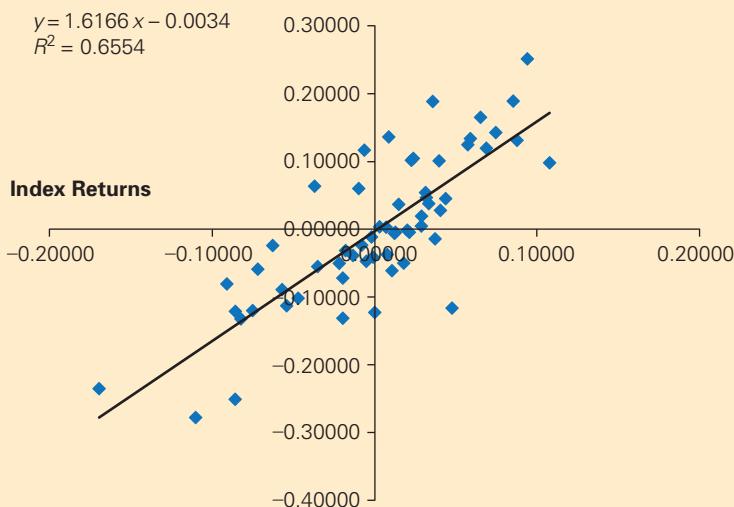
Market Model for General Electric

The monthly rates of return for General Electric (Symbol GE) and the Standard and Poor's index (a measure of the overall NYSE stock market) were recorded for each month between January 2008 and December 2012. Some of these data are shown here. Estimate the market model and analyze the results.

Year	Month	S&P 500 Index	GE
2008	January	-0.03476	-0.05446
	February	-0.00596	0.11703
	March	0.04755	-0.11651
	April	0.01067	-0.06058
	May	-0.08596	-0.12151
	June	-0.00986	0.05998
	July	0.01219	-0.00676
	August	-0.09079	-0.08036
	September	-0.16942	-0.23486
	October	-0.07485	-0.12024
	November	0.00782	-0.03777
	December	-0.08566	-0.25125
2012	January	0.04059	0.02765
	February	0.03133	0.05328
	March	-0.00750	-0.02453
	April	-0.06265	-0.02462
	May	0.03955	0.10097
	June	0.01260	-0.00439
	July	0.01976	-0.00196
	August	0.02424	0.10457
	September	-0.01979	-0.07244
	October	0.00285	0.00335
	November	0.00707	0.00239
	December	0.02171	-0.00429

SOLUTION:

Excel's scatter diagram and least squares line are shown below. (Minitab produces a similar result.) We added the equation and the coefficient of determination to the scatter diagram.

EXCEL

We note that the slope coefficient for General Electric is 1.6166. We interpret this to mean that in this sample for each 1% increase in the Standard and Poor's Index return, the average increase in General Electric's return is 1.6166%. Because b_1 is greater than 1, we conclude that the return on investing in General Electric is more volatile and therefore riskier than the Standard and Poor's Index.

4-6a Systematic and Firm-Specific Risk

The slope coefficient b_1 is a measure of the stock's *market-related* (or *systematic*) risk because it measures the volatility of the stock price that is related to the overall market volatility. The slope coefficient only informs us about the nature of the relationship between the two sets of returns. It tells us nothing about the *strength* of the linear relationship.

The coefficient of determination measures the proportion of the total risk that is market-related. In this case, we see that 65.54% of GE's total risk is market-related. That is, 65.54% of the variation in GE's returns is explained by the variation in the returns of the Standard and Poor's Index. The remaining 34.46% is the proportion of the risk that is associated with events specific to GE, rather than the market. Financial analysts (and most everyone else) call this the *firm-specific* (or *nonsystematic*) risk. The firm-specific risk is attributable to variables and events not included in the market model, such as the effectiveness of General Electric's sales force and managers. This is the part of the risk that can be "diversified away" by creating a portfolio of stocks as discussed in Section 7-3. We cannot, however, diversify away the part of the risk that is market-related.

When a portfolio has been created, we can estimate its beta by averaging the betas of the stocks that compose the portfolio. If an investor believes that the market is likely to rise, a portfolio with a beta coefficient greater than 1 is desirable. Risk-averse investors or ones who believe that the market will fall will seek out portfolios with betas less than 1.



EXERCISES

The following exercises require the use of a computer and software.

Xr04-S&P500 We have recorded the monthly returns for the S&P 500 index and the following Dow Jones Industrials 30 stocks listed on the New York Stock Exchange for the period January 2008 to December 2012:

- 3M (MMM)
- Alcoa (AA)
- American Express (AXP)
- AT&T (T)
- Bank of America (BAC)
- Boeing (BA)
- Caterpillar (CAT)
- Chevron (CVX)
- Cisco Systems (CSCO)
- Coca-Cola (KO)
- Disney (DIS)
- Du Pont (DD)
- Exxon (XOM)
- General Electric (GE)
- Hewlett-Packard (HPQ)
- Home Depot (HD)
- Intel (INTC)
- International Business Machines (IBM)
- Johnson & Johnson (JNJ)
- JP Morgan Chase (JPM)
- McDonald's (MCD)
- Merck (MRK)
- Microsoft (MSFT)
- Pfizer (PFE)
- Proctor & Gamble (PG)
- Travelers (TRV)
- United Technologies (UTX)
- United Health (UNH)
- Verizon Communications (VZ)
- Wal-Mart Stores (WMT)

For the following exercises, calculate the beta coefficient and the coefficient of determination for the listed stock and interpret their values.

(Excel users: Note that to use the scatter diagram to compute the beta coefficient, the data must be stored in two adjacent columns. The first must contain the returns on the index and the second stores the returns for the coefficient of whichever stock you wish to calculate.)

4.94 American Express (AXP)

4.95 General Electric (GE)

4.96 Home Depot (HD)

4.97 Microsoft (MSFT)

For the following exercises, determine the average beta coefficient for the stocks in the listed portfolio.

4.98 3M (MMM), Bank of America (BAC), and Disney (DIS)

4.99 Boeing (BA), Caterpillar (CAT), and Exxon (XOM)

4.100 Hewlett-Packard (HPQ), Intel (INTC), and McDonald's (MCD)

4.101 Merck (MRK), Pfizer (PFE), and United Health (UNH)

Xr04-TSE Monthly returns for the Toronto Stock Exchange Index and the following selected stocks on the Toronto Stock Exchange were recorded for the years 2008 to 2012:

- Barrick Gold (ABX)
- Bombardier (BBD.B)
- Bell Canada Enterprises (BCE)
- Bank of Montreal (BMO)
- Bank of Nova Scotia (BNS)
- Canadian Imperial Bank of Commerce (CM)
- Canadian National Railways (CNR)
- Canadian Oil Sands (COS)
- Canadian Tire (CTC.A)
- Encana (ECA)
- Enbridge (ENB)
- Manulife Financial (MFG)
- Magna International (MG)
- Potash Corporation of Saskatchewan (POT)
- Power Corporation of Canada (POW)
- Research in Motion (RIM)
- Rogers Communication (RCI.B)
- Royal Bank of Canada (RY)
- Shaw Communications (SJR.B)
- Suncor Energy (SU)
- Telus (T)
- Tim Hortons (THI)

Calculate the beta coefficient and the coefficient of determination for the listed stock and interpret their values.

4.102 Barrick Gold (ABX)

4.103 Tim Hortons (THI)

4.104 Canadian Tire (CTC.A)

Determine the average beta coefficient for the stocks in the listed portfolio.

4.105 Bank of Montreal (BMO), Bank of Nova Scotia (BNS), and Royal Bank of Canada (RY)

4.106 Encana (ECA), Enbridge (ENB), and Suncor Energy (SU)

- 4.107** Bell Canada Enterprises (BCE), Rogers Communication (RCI.B), and Telus (T)

Xr04-NASDAQ We calculated the returns on the NASDAQ Index and the following selected stocks on the NASDAQ Exchange for the period January 2008 to December 2012:

Adobe Systems (ADBE)
Amazon (AMZN)
Amgen (AMGN)
Apple (AAPL)
Bed Bath & Beyond (BBBY)
Cisco Systems (CSCO)
Comcast (CMCSA)
Costco Wholesale (COST)
Dell (DELL)
Dollar Tree (DLTR)
Expedia (EXPE)
Garmin (GRMN)
Google (GOOG)
Intel (INTC)
Mattel (MAT)
Microsoft (MSFT)
Netflix (NFLX)

Oracle (ORCL)
Research in Motion (RIMM)
ScanDisk (SNDK)
Sirius XM Radio (SIRI)
Staples (SPLS)
Starbucks (SBUX)
Whole Foods Market (WFM)
Wynn Resorts (WYNN)
Yahoo (YHOO)

Calculate the beta coefficient and the coefficient of determination for the listed stock and interpret their values.

- 4.108** Amazon (AMZN)

- 4.109** Expedia (EXPE)

- 4.110** Netflix (NFLX)

Determine the average beta coefficient for the stocks in the listed portfolio.

- 4.111** Apple (AAPL), Dell (DELL), and Google (GOOG)

- 4.112** Costco Wholesale (COST) and Dollar Tree (DLTR)

- 4.113** Cisco Systems (CSCO), Intel (INTC), and Oracle (ORCL)

4-7 COMPARING GRAPHICAL AND NUMERICAL TECHNIQUES

As we mentioned before, graphical techniques are useful in producing a quick picture of the data. For example, you learn something about the location, spread, and shape of a set of interval data when you examine its histogram. Numerical techniques provide the same approximate information. We have measures of central location, measures of variability, and measures of relative standing that do what the histogram does. The scatter diagram graphically describes the relationship between two interval variables, but so do the numerical measures covariance, coefficient of correlation, coefficient of determination, and least squares line. Why then do we need to learn both categories of techniques? The answer is that they differ in the information each provides. We illustrate the difference between graphical and numerical methods by redoing four examples we used to illustrate graphical techniques in Chapter 3.

EXAMPLE 3.2

Comparing Returns on Two Investments

In Example 3.2, we wanted to judge which investment appeared to be better. As we discussed in the Applications in Finance: Return on Investment (page 52), we judge investments in terms of the return we can expect and its risk. We drew histograms and attempted to interpret them. The centers of the histograms provided us with information about the expected return and their spreads gauged the risk. However, the histograms were not clear. Fortunately, we can use numerical measures. The mean and median provide us with information about the return we can expect, and the variance or standard deviation tell us about the risk associated with each investment.

Here are the descriptive statistics produced by Excel. Minitab's are similar. (We combined the output into one worksheet.)

Microsoft Excel Output for Example 3.2

	A	B	C	D	E
1	<i>Return A</i>			<i>Return B</i>	
2					
3	Mean	10.95	Mean	12.76	
4	Standard Error	3.10	Standard Error	3.97	
5	Median	9.88	Median	10.76	
6	Mode	12.89	Mode	#N/A	
7	Standard Deviation	21.89	Standard Deviation	28.05	
8	Sample Variance	479.35	Sample Variance	786.62	
9	Kurtosis	-0.32	Kurtosis	-0.62	
10	Skewness	0.54	Skewness	0.01	
11	Range	84.95	Range	106.47	
12	Minimum	-21.95	Minimum	-38.47	
13	Maximum	63	Maximum	68	
14	Sum	547.27	Sum	638.01	
15	Count	50	Count	50	

We can now see that investment B has a larger mean and median but that investment A has a smaller variance and standard deviation. If an investor were interested in low-risk investments, then he or she would choose investment A. If you reexamine the histograms from Example 3.2 (page 53), you will see that the precision provided by the numerical techniques (mean, median, and standard deviation) provides more useful information than did the histograms.

EXAMPLES 3.3 AND 3.4

Business Statistics Marks; Mathematical Statistical Marks

In these examples we wanted to see what differences existed between the marks in the two statistics classes. Here are the descriptive statistics. (We combined the two printouts in one worksheet.)

Microsoft Excel Output for Examples 3.3 and 3.4

	A	B	C	D	E
1	<i>Marks (Example 3.3)</i>		<i>Marks (Example 3.4)</i>		
2					
3	Mean	72.67	Mean	66.40	
4	Standard Error	1.07	Standard Error	1.610	
5	Median	72	Median	71.5	
6	Mode	67	Mode	75	
7	Standard Deviation	8.29	Standard Deviation	12.470	
8	Sample Variance	68.771	Sample Variance	155.498	
9	Kurtosis	-0.36	Kurtosis	-1.241	
10	Skewness	0.16	Skewness	-0.217	
11	Range	39	Range	48	
12	Minimum	53	Minimum	44	
13	Maximum	92	Maximum	92	
14	Sum	4360	Sum	3984	
15	Count	60	Count	60	
16	Largest(15)	79	Largest(15)	76	
17	Smallest(15)	67	Smallest(15)	53	

The statistics tell us that the mean and median of the marks in the business statistics course (Example 3.3) are higher than in the mathematical statistics course (Example 3.4). We found that the histogram of the mathematical statistics marks was bimodal, which we interpreted to mean that this type of approach created differences between students. The unimodal histogram of the business statistics marks informed us that this approach eliminated those differences.

Chapter 3 Opening Example

In this example, we wanted to know whether the prices of gasoline and oil were related. The scatter diagram did reveal a strong positive linear relationship. We can improve on

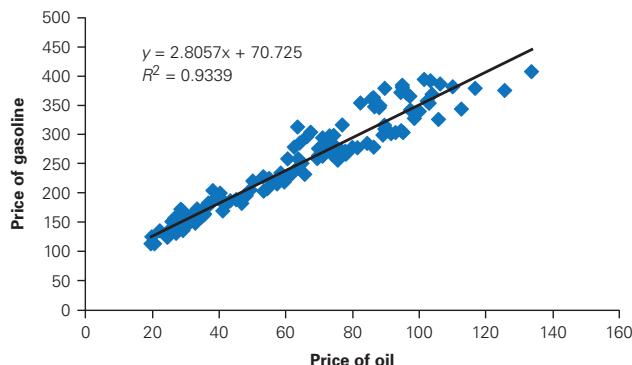
the quality of this information by computing the coefficient of correlation and drawing the least squares line.

Excel Output for Chapter 3 Opening Example: Coefficient of Correlation

	A	B	C
1		<i>Oil</i>	<i>Gasoline</i>
2	Oil		1
3	Gasoline	0.9664	1

The coefficient of correlation seems to confirm what we learned from the scatter diagram. That is, there is a strong positive linear relationship between the two variables.

Excel Output for Chapter 3 Opening Example: Least Squares Line



The slope coefficient tells us that for each dollar increase in the price of a barrel of oil, the price of a (U.S.) gallon of gasoline increases on average by 2.8 cents. However, because there are 42 gallons per barrel, we would expect a dollar increase in a barrel of oil to yield a 2.4[†] cents per gallon (calculated as \$1.00/42) increase. It does appear that the oil companies are taking some small advantage by adding an extra half cent per gallon. The coefficient of determination is .9339, which indicates that 93.39% of the variation in gasoline prices is explained by the variation in oil prices.



EXERCISES

The following exercises require a computer and statistical software.

- 4.114** [Xr03-50](#) Calculate the coefficient of determination for Exercise 3.50. Is this more informative than the scatter diagram?

- 4.115** [Xr03-51](#) Refer to Exercise 3.51. Compute the coefficients of the least squares line and compare your results with the scatter diagram.

- 4.116** [Xr03-56](#) Compute the coefficient of determination and the least squares line for Exercise 3.56. Compare this information with that developed by the scatter diagram alone.

- 4.117** [Xr03-59](#) Refer to Exercise 3.59. Calculate the coefficient of determination and the least squares line. Is this more informative than the scatter diagram?

- 4.118** [Xm03-07](#) a. Calculate the coefficients of the least squares line for the data in Example 3.7.
b. Interpret the coefficients.
c. Is this information more useful than the information extracted from the scatter diagram?

- 4.119** [Xr04-53](#) In Exercise 4.53 you drew box plots. Draw histograms instead and compare the results.

- 4.120** [Xr04-55](#) Refer to Exercise 4.55. Draw histograms of the data. What have you learned?

[†]This is a simplification. In fact, a barrel of oil yields a variety of other profitable products. See Exercise 2.14.

4-8 GENERAL GUIDELINES FOR EXPLORING DATA

The purpose of applying graphical and numerical techniques is to describe and summarize data. Statisticians usually apply graphical techniques as a first step because we need to know the shape of the distribution. The shape of the distribution helps answer the following questions:

- 1.** Where is the approximate center of the distribution?
- 2.** Are the observations close to one another, or are they widely dispersed?
- 3.** Is the distribution unimodal, bimodal, or multimodal? If there is more than one mode, where are the peaks, and where are the valleys?
- 4.** Is the distribution symmetric? If not, is it skewed? If symmetric, is it bell shaped?

Histograms and box plots provide most of the answers. We can frequently make several inferences about the nature of the data from the shape. For example, we can assess the relative risk of investments by noting their spreads. We can attempt to improve the teaching of a course by examining whether the distribution of final grades is bimodal or skewed.

The shape can also provide some guidance on which numerical techniques to use. As we noted in this chapter, the central location of highly skewed data may be more appropriately measured by the median. We may also choose to use the interquartile range instead of the standard deviation to describe the spread of skewed data.

When we have an understanding of the structure of the data, we may do additional analysis. For example, we often want to determine how one variable, or several variables, affects another. Scatter diagrams, covariance, and the coefficient of correlation are useful techniques for detecting relationships between variables. A number of techniques to be introduced later in this book will help uncover the nature of these associations.

CHAPTER SUMMARY

This chapter extended our discussion of descriptive statistics, which deals with methods of summarizing and presenting the essential information contained in a set of data. After constructing a frequency distribution to obtain a general idea about the distribution of a data set, we can use numerical measures to describe the central location and variability of interval data. Three popular measures of central location, or averages, are the mean, the median, and the mode. Taken by themselves, these measures provide an inadequate description of the data because they say nothing about the extent to which the data vary. Information regarding the variability of interval data is conveyed by such numerical measures as the range, variance, and standard deviation.

For the special case in which a sample of measurements has a mound-shaped distribution, the Empirical Rule provides a good approximation of the percentages of measurements that fall within one, two, and three standard deviations of the mean. Chebyshev's Theorem applies to all sets of data no matter the shape of the histogram.

Measures of relative standing that were presented in this chapter are percentiles and quartiles. The box plot graphically depicts these measures as well as several others. The linear relationship between two interval variables is measured by the covariance, the coefficient of correlation, the coefficient of determination, and the least squares line.

IMPORTANT TERMS:

Measures of central location	95	Empirical Rule	110
Mean	95	Chebyshev's Theorem	111
Median	97	Skewed	111
Mode	98	Coefficient of variation	112
Modal class	99	Percentiles	114
Geometric mean	102	Quartiles	115
Measures of variability	105	Interquartile range	117
Range	105	Box plots	117
Variance	105	Outlier	118
Standard deviation	105	Covariance	124
Deviation	106	Coefficient of correlation	125
Mean absolute deviation	107	Least squares method	128

SYMBOLS:

Symbol	Pronounced	Represents
μ	mu	Population mean
σ^2	sigma squared	Population variance
σ	sigma	Population standard deviation
ρ	rho	Population coefficient of correlation
\sum	Sum of	Summation
$\sum_{i=1}^n x_i$	Sum of x_i from 1 to n	Summation of n numbers
\hat{y}	y hat	Fitted or calculated value of y
b_0	b zero	y -Intercept
b_1	b one	Slope coefficient

FORMULAS:

Population mean

$$\mu = \frac{\sum_{i=1}^N x_i}{N}$$

Sample mean

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n}$$

Range

Largest observation – Smallest observation

Population variance

$$\sigma^2 = \frac{\sum_{i=1}^N (x_i - \mu)^2}{N}$$

Sample variance

$$s^2 = \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1}$$

Population standard deviation

$$\sigma = \sqrt{\sigma^2}$$

Sample standard deviation

$$s = \sqrt{s^2}$$

Population covariance

$$\sigma_{xy} = \frac{\sum_{i=1}^N (x_i - \mu_x)(y_i - \mu_y)}{N}$$

Sample covariance

$$s_{xy} = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{n - 1}$$

Population coefficient of correlation

$$\rho = \frac{\sigma_{xy}}{\sigma_x \sigma_y}$$

Sample coefficient of correlation

$$r = \frac{s_{xy}}{s_x s_y}$$

Coefficient of determination

$$R^2 = r^2$$

Slope coefficient

$$b_1 = \frac{s_{xy}}{s_x^2}$$

y-intercept

$$b_0 = \bar{y} - b_1 \bar{x}$$

COMPUTER OUTPUT AND INSTRUCTIONS

Technique	Excel	Minitab
Mean	97	97
Median	98	98
Mode	99	99
Variance	108	108
Standard deviation	109	110
Descriptive statistics	116	117
Box plot	118	119
Least squares line	131	132
Covariance	133	134
Correlation	133	134
Coefficient of determination	135	135

CHAPTER EXERCISES

- 4.121** *Xr04-121** Osteoporosis is a condition in which bone density decreases, often resulting in broken bones. Bone density usually peaks at age 30 and decreases thereafter. To understand more about the condition, a random sample of women aged 50 and over were recruited. Each woman's bone density loss was recorded.
- Compute the mean and median of these data.
 - Compute the standard deviation of the bone density losses.
 - Describe what you have learned from the statistics.
- 4.122** *Xr04-122** The temperature in December in Buffalo, New York, is often below 40 degrees Fahrenheit (4 degrees Celsius). Not surprisingly, when the National Football League Buffalo Bills play at home in December, coffee is a popular item at the concession stand. The concession manager would like to acquire more information so that he can manage inventories more efficiently. The number of cups of coffee sold during 50 games played in December in Buffalo was recorded.
- Determine the mean and median.
 - Determine the variance and standard deviation.
 - Draw a box plot.
 - Briefly describe what you have learned from your statistical analysis.
- 4.123** Refer to Exercise 4.121. In addition to the bone density losses, the ages of the women were also recorded. Compute the coefficient of determination and describe what this statistic tells you.
- 4.124** Refer to Exercise 4.122. Suppose that in addition to recording the coffee sales, the manager also recorded the average temperature (measured in degrees Fahrenheit) during the game. These data together with the number of cups of coffee sold were recorded.
- Compute the coefficient of determination.
 - Determine the coefficients of the least squares line.
 - What have you learned from the statistics calculated in parts (a) and (b) about the relationship between the number of cups of coffee sold and the temperature?
 - Discuss the information obtained here and in Exercise 4.80. Which is more useful to the manager?
- 4.125** *Xr04-125** Chris Golfnut loves the game of golf. Chris also loves statistics. Combining both passions, Chris records a sample of 100 scores.
- What statistics should Chris compute to describe the scores?
 - Calculate the mean and standard deviation of the scores.

- c. Briefly describe what the statistics computed in part (b) divulge.
- 4.126** **Xr04-126*** The Internet is growing rapidly with an increasing number of regular users. However, among people older than 50, Internet use is still relatively low. To learn more about this issue, a sample of 250 men and women older than 50 who had used the Internet at least once were selected. The number of hours on the Internet during the past month was recorded.
- Calculate the mean and median.
 - Calculate the variance and standard deviation.
 - Draw a box plot.
 - Briefly describe what you have learned from the statistics you calculated.
- 4.127** Refer to Exercise 4.125. For each score, Chris also recorded the number of putts as well as his scores. Conduct an analysis of both sets of data. What conclusions can be achieved from the statistics?
- 4.128** Refer to Exercise 4.126. In addition to Internet use, the numbers of years of education were recorded.
- Compute the coefficient of determination.
 - Determine the coefficients of the least squares line.
 - Describe what these statistics tell you about the relationship between Internet use and education.
 - Discuss the information obtained here and in Exercise 4.84.
- 4.129** **Xr04-129*** A sample was drawn of one-acre plots of land planted with corn. The crop yields were recorded. Calculate the descriptive statistics you judge to be useful. Interpret these statistics.
- 4.130** Refer to Exercise 4.129. For each plot, the amounts of rainfall were also recorded.
- Compute the coefficient of determination.
 - Determine the coefficients of the least squares line.
 - Describe what these statistics tell you about the relationship between crop yield and rainfall.
 - Discuss the information obtained here and in Exercise 4.87.
- 4.131** Refer to Exercise 4.129. For each plot, the amounts of fertilizer were recorded.
- Compute the coefficient of determination.
 - Determine the coefficients of the least squares line.
 - Describe what these statistics tell you about the relationship between crop yield and the amount of fertilizer.
 - Discuss the information obtained here and in Exercise 4.129.
- 4.132** **Xr04-132** Increasing tuition has resulted in some students being saddled with large debts on graduation. To examine this issue, a random sample of recent graduates was asked to report whether they had student loans, and, if so, how much was the debt at graduation.
- Compute all three measures of central location.
 - What do these statistics reveal about student loan debt at graduation?

CASE 4.1

Return to the Global Warming Question

Now that we have presented techniques that allow us to conduct more precise analyses, we'll return to Case 3.1. Recall that there are two issues in this discussion. First, is there global warming and, second, if so, is carbon dioxide the cause? The only tools available at the end of Chapter 3 were graphical techniques including line charts and scatter diagrams. You are now invited to apply the more precise techniques used in this chapter to answer the same questions.

Here are the data sets you can work with:

C04-01a: Column 1: Months numbered 1 to 1597

Column 2: Temperature anomalies produced by the National Climatic Data Center

C04-01b: Column 1: Year

Column 2: Month

Column 3: Monthly carbon dioxide levels measured by the Mauna Loa Observatory

Column 4: Temperature anomalies produced by the National Climatic Data Center

- Use the least squares method to estimate average monthly changes in temperature anomalies.
- Calculate the least squares line and the coefficient of correlation between CO₂ levels and temperature anomalies and describe your findings.

DATA

C04-01a
C04-01b

CASE 4.2**Another Return to the Global Warming Question****DATA**

C04-02a
C04-02b
C04-02c
C04-02d

Did you conclude in Case 4.1 that the earth has warmed since 1880 and that there is some linear relationship between CO₂ and temperature

anomalies? If so, here is another look at the same data. C04-02a lists the temperature anomalies from 1880 to 1940, C04-02b lists the data from 1941 to 1975, C04-02c stores the

temperature anomalies from 1976 to 1997, and C04-02d contains the data from 1998 to 2013. For each set of data, draw a line chart and report your findings.

CASE 4.3**The Effect of the Players' Strike in the 2004–2005 Hockey Season****DATA**

C04-03a
C04-03b

The 2004–2005 hockey season was cancelled because of a player strike. The key issue in this labor dispute was a "salary cap." The team owners wanted a salary cap to cut their costs. The owners of small-market teams wanted the cap to help their teams be competitive. Of course, caps on salaries would lower the

salaries of most players and as a result the players association fought against it. The team owners prevailed and the collective bargaining agreement specified a salary cap of \$39 million and a floor of \$21.5 million for the 2005–2006 season.

Conduct an analysis of the 2003–2004 season (C04-02a) and

the 2005–2006 season (C04-02b). For each season:

- Estimate how much on average a team needs to spend to win one more game.
- Measure the strength of the linear relationship.
- Discuss the differences between the two seasons.

CASE 4.4**Quebec Referendum Vote: Was There Electoral Fraud?*****DATA**

C04-04

Since the 1960s, Québécois have been debating whether to separate from Canada and form an independent nation. A referendum was held on October 30, 1995, in which the people of Quebec voted not to separate. The vote was extremely close, with the "no" side winning by only 52,448 votes. A large number of "No" votes was cast by the non-Francophone (non-French-speaking) people of

Quebec, who make up about 20% of the population and who very much want to remain Canadians. The remaining 80% are Francophones, a majority of whom voted "yes."

After the votes were counted, it became clear that the tallied vote was much closer than it should have been. Supporters of the "no" side charged that poll scrutineers, all of whom were appointed by the pro-separatist provincial



Bettmann/CORBIS

government, rejected a disproportionate number of ballots in ridings where the percentage of "yes" votes was low and where there are large numbers of Allophone (people whose first language is neither English nor French) and Anglophone (English-speaking) residents. (Electoral laws require

*This case is based on "Voting Irregularities in the 1995 Referendum on Quebec Sovereignty" Jason Cawley and Paul Sommers, *Chance*, Vol. 9, No. 4, Fall, 1996. We are grateful to Dr. Paul Sommers, Middlebury College, for his assistance in writing this case.

<p>the rejection of ballots that do not appear to be properly marked.) They were outraged that in a strong democracy such as Canada, votes would be rigged much as they are in many nondemocratic countries around the world.</p> <p>If in ridings where there was a low percentage of "yes" votes there was a high percentage of rejected ballots, this would be evidence</p>	<p>of electoral fraud. Moreover, if in ridings where there were large percentages of Allophone and/or Anglophone voters, there were high percentages of rejected ballots, this, too, would constitute evidence of fraud on the part of the scrutineers and possibly the government.</p> <p>To determine the veracity of the charges, the following variables were recorded for each riding:</p>	<p>Percentage of rejected ballots in referendum Percentage of "yes" votes Percentage of Allophones Percentage of Anglophones</p> <p>Conduct a statistical analysis of these data to determine whether there are indications that electoral fraud took place.</p>
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APPENDIX 4 / REVIEW OF DESCRIPTIVE TECHNIQUES

Here is a list of the statistical techniques introduced in Chapters 2, 3, and 4. This is followed by a flowchart designed to help you select the most appropriate method to use to address any problem requiring a descriptive method.

To provide practice in identifying the correct descriptive method to use we have created a number of review exercises. These are in Keller's website Appendix Descriptive Techniques Review Exercises.

Graphical Techniques

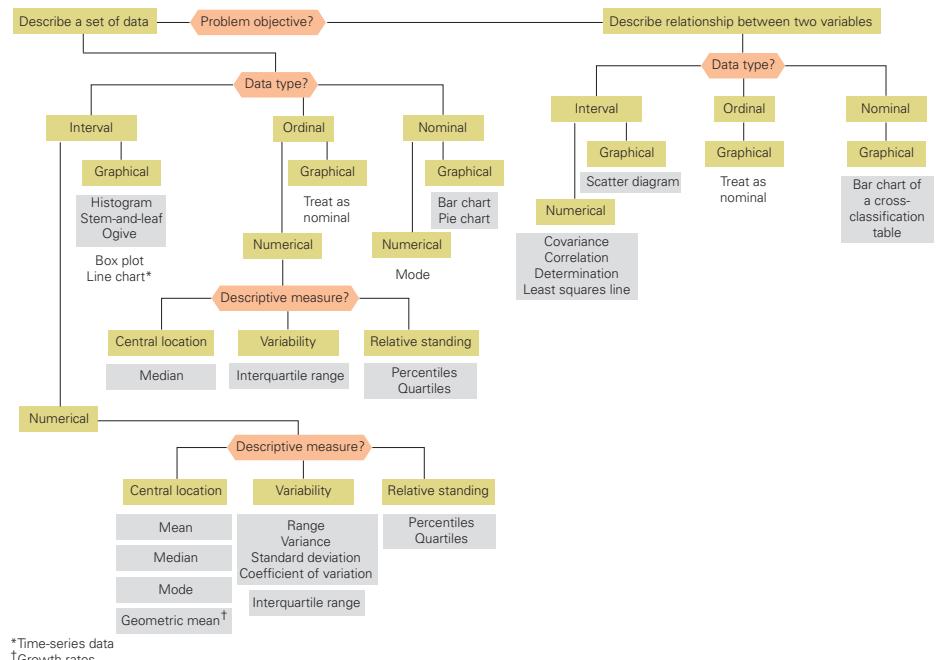
- Histogram
- Stem-and-leaf display
- Ogive
- Bar chart
- Pie chart
- Scatter diagram
- Line chart (time series)
- Box plot

Numerical Techniques

- Measures of Central Location
- Mean
- Median
- Mode
- Geometric mean (growth rates)
- Measures of Variability
- Range

Variance
 Standard deviation
 Coefficient of variation
 Interquartile range
 Measures of Relative Standing
 Percentiles
 Quartiles
 Measures of Linear Relationship
 Covariance
 Coefficient of correlation
 Coefficient of determination
 Least squares line

Flowchart: Graphical and Numerical Techniques



5



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DATA COLLECTION AND SAMPLING

- 5-1 *Methods of Collecting Data*
- 5-2 *Sampling*
- 5-3 *Sampling Plans*
- 5-4 *Sampling and Nonsampling Errors*

Sampling and the Census

The census, which is conducted every 10 years in the United States, serves an important function. It is the basis for deciding how many congressional representatives and how many votes in the electoral college each state will have. Businesses often use the information derived from the census to help make decisions about products, advertising, and plant locations.

One of the problems with the census is the issue of undercounting, which occurs when some people are not included. For example, the 1990 census reported that 12.05% of adults were African American; the true value was 12.41%. To address undercounting, the Census Bureau adjusts the numbers it gets from the census. The adjustment is based



On page 168, you will find our answer.

Spencer Grant/Age Fotostock

on another survey. The mechanism is called the Accuracy and Coverage Evaluation. Using sampling methods described in this chapter, the Census Bureau is able to adjust the numbers in American subgroups. For example, the Bureau may discover that the number of Hispanics has been undercounted or that the number of people living in California has not been accurately counted.

Later in this chapter we'll discuss how the sampling is conducted and how the adjustments are made.

INTRODUCTION

In Chapter 1, we briefly introduced the concept of statistical inference—the process of inferring information about a population from a sample. Because information about populations can usually be described by parameters, the statistical technique used generally deals with drawing inferences about population parameters from sample statistics. (Recall that a parameter is a measurement about a population, and a statistic is a measurement about a sample.)

Working within the covers of a statistics textbook, we can assume that population parameters are known. In real life, however, calculating parameters is virtually impossible because populations tend to be very large. As a result, most population parameters are not only unknown but also unknowable. The problem that motivates the subject of statistical inference is that we often need information about the value of parameters in order to make decisions. For example, to make decisions about whether to expand a line of clothing, we may need to know the mean annual expenditure on clothing by North American adults. Because the size of this population is approximately 200 million, determining the mean is prohibitive. However, if we are willing to accept less than 100% accuracy, we can use statistical inference to obtain an estimate. Rather than investigating the entire population, we select a sample of people, determine the annual expenditures on clothing in this group, and calculate the sample mean. Although the probability that the sample mean will equal the population mean is very small, we would expect them to be close. For many decisions, we need to know how close. We postpone that discussion until Chapters 10 and 11. In this chapter, we will discuss the basic concepts and techniques of sampling itself. But first we take a look at various sources for collecting data.

5-1 / METHODS OF COLLECTING DATA

Most of this book addresses the problem of converting data into information. The question arises, where do data come from? The answer is that a large number of methods produce data. Before we proceed however, we'll remind you of the definition of data introduced in Section 2-1. Data are the observed values of a variable; that is, we define a variable or variables that are of interest to us and then proceed to collect observations of those variables.

5-1a Direct Observation

The simplest method of obtaining data is by direct observation. When data are gathered in this way, they are said to be **observational**. For example, suppose that a researcher for a pharmaceutical company wants to determine whether aspirin actually reduces the

incidence of heart attacks. Observational data may be gathered by selecting a sample of men and women and asking each whether he or she has taken aspirin regularly over the past 2 years. Each person would be asked whether he or she had suffered a heart attack over the same period. The proportions reporting heart attacks would be compared and a statistical technique that is introduced in Chapter 13 would be used to determine whether aspirin is effective in reducing the likelihood of heart attacks. There are many drawbacks to this method. One of the most critical is that it is difficult to produce useful information in this way. For example, if the statistics practitioner concludes that people who take aspirin suffer fewer heart attacks, can we conclude that aspirin is effective? It may be that people who take aspirin tend to be more health conscious, and health-conscious people tend to have fewer heart attacks. The one advantage of direct observation is that it is relatively inexpensive.

5-1b Experiments

A more expensive but better way to produce data is through experiments. Data produced in this manner are called **experimental**. In the aspirin illustration, a statistics practitioner can randomly select men and women. The sample would be divided into two groups. One group would take aspirin regularly, and the other would not. After 2 years, the statistics practitioner would determine the proportion of people in each group who had suffered heart attacks, and statistical methods again would be used to determine whether aspirin works. If we find that the aspirin group suffered fewer heart attacks, then we may more confidently conclude that taking aspirin regularly is a healthy decision.

5-1c Surveys

One of the most familiar methods of collecting data is the **survey**, which solicits information from people concerning such things as their income, family size, and opinions on various issues. We're all familiar, for example, with opinion polls that accompany each political election. The Gallup Poll and the Harris Survey are two well-known surveys of public opinion whose results are often reported by the media. But the majority of surveys are conducted for private use. Private surveys are used extensively by market researchers to determine the preferences and attitudes of consumers and voters. The results can be used for a variety of purposes, from helping to determine the target market for an advertising campaign to modifying a candidate's platform in an election campaign. As an illustration, consider a television network that has hired a market research firm to provide the network with a profile of owners of luxury automobiles, including what they watch on television and at what times. The network could then use this information to develop a package of recommended time slots for Cadillac commercials, including costs, which it would present to General Motors. It is quite likely that many students reading this book will one day be marketing executives who will "live and die" by such market research data.

An important aspect of surveys is the **response rate**. The response rate is the proportion of all people who were selected who complete the survey. As we discuss in the next section, a low response rate can destroy the validity of any conclusion resulting from the statistical analysis. Statistics practitioners need to ensure that data are reliable.

Personal Interview Many researchers feel that the best way to survey people is by means of a personal interview, which involves an interviewer soliciting information

from a respondent by asking prepared questions. A personal interview has the advantage of having a higher expected response rate than other methods of data collection. In addition, there will probably be fewer incorrect responses resulting from respondents misunderstanding some questions because the interviewer can clarify misunderstandings when asked to. But the interviewer must also be careful not to say too much for fear of biasing the response. To avoid introducing such biases, as well as to reap the potential benefits of a personal interview, the interviewer must be well trained in proper interviewing techniques and well informed on the purpose of the study. The main disadvantage of personal interviews is that they are expensive, especially when travel is involved.

Telephone Interview A telephone interview is usually less expensive, but it is also less personal and has a lower expected response rate. Unless the issue is of interest, many people will refuse to respond to telephone surveys. This problem is exacerbated by telemarketers trying to sell something.

Self-Administered Survey A third popular method of data collection is the self-administered questionnaire, which is usually mailed to a sample of people. This is an inexpensive method of conducting a survey and is therefore attractive when the number of people to be surveyed is large. But self-administered questionnaires usually have a low response rate and may have a relatively high number of incorrect responses due to respondents misunderstanding some questions.

Questionnaire Design Whether a questionnaire is self-administered or completed by an interviewer, it must be well designed. Proper questionnaire design takes knowledge, experience, time, and money. Some basic points to consider regarding questionnaire design follow.

1. First and foremost, the questionnaire should be kept as short as possible to encourage respondents to complete it. Most people are unwilling to spend much time filling out a questionnaire.
2. The questions themselves should also be short, as well as simply and clearly worded, to enable respondents to answer quickly, correctly, and without ambiguity. Even familiar terms such as “*unemployed*” and “*family*” must be defined carefully because several interpretations are possible.
3. Questionnaires often begin with simple demographic questions to help respondents get started and become comfortable quickly.
4. Dichotomous questions (questions with only two possible responses such as “yes” and “no” and multiple-choice questions) are useful and popular because of their simplicity, but they also have possible shortcomings. For example, a respondent’s choice of yes or no to a question may depend on certain assumptions not stated in the question. In the case of a multiple-choice question, a respondent may feel that none of the choices offered is suitable.
5. Open-ended questions provide an opportunity for respondents to express opinions more fully, but they are time consuming and more difficult to tabulate and analyze.
6. Avoid using leading questions, such as “Wouldn’t you agree that the statistics exam was too difficult?” These types of questions tend to lead the respondent to a particular answer.

- 7.** Time permitting, it is useful to pretest a questionnaire on a small number of people in order to uncover potential problems such as ambiguous wording.
- 8.** Finally, when preparing the questions, think about how you intend to tabulate and analyze the responses. First, determine whether you are soliciting values (i.e., responses) for an interval variable or a nominal variable. Then consider which type of statistical techniques—descriptive or inferential—you intend to apply to the data to be collected, and note the requirements of the specific techniques to be used. Thinking about these questions will help ensure that the questionnaire is designed to collect the data you need.

Whatever method is used to collect primary data, we need to know something about sampling, the subject of the next section.



EXERCISES

- 5.1** Briefly describe the difference between observational and experimental data.
- 5.2** A soft drink manufacturer has been supplying its cola drink in bottles to grocery stores and in cans to small convenience stores. The company is analyzing sales of this cola drink to determine which type of packaging is preferred by consumers.
- Is this study observational or experimental? Explain your answer.
 - Outline a better method for determining whether a store will be supplied with cola in bottles or in cans so that future sales data will be more helpful in assessing the preferred type of packaging.
- 5.3** a. Briefly describe how you might design a study to investigate the relationship between smoking and lung cancer.
b. Is your study in part (a) observational or experimental? Explain why.
- 5.4** a. List three methods of conducting a survey of people.
b. Give an important advantage and disadvantage of each of the methods listed in part (a).
- 5.5** List five important points to consider when designing a questionnaire.

5-2 / SAMPLING

The chief motive for examining a sample rather than a population is cost. Statistical inference permits us to draw conclusions about a population parameter based on a sample that is quite small in comparison to the size of the population. For example, television executives want to know the proportion of television viewers who watch a network's programs. Because 100 million people may be watching television in the United States on a given evening, determining the actual proportion of the population that is watching certain programs is impractical and prohibitively expensive. The Nielsen ratings provide approximations of the desired information by observing what is watched by a sample of 5,000 television viewers. The proportion of households watching a particular program can be calculated for the households in the Nielsen sample. This sample proportion is then used as an **estimate** of the proportion of all households (the population proportion) that watched the program.

Another illustration of sampling can be taken from the field of quality management. To ensure that a production process is operating properly, the operations manager needs to know what proportion of items being produced is defective. If the quality technician must destroy the item to determine whether it is defective, then there is no alternative to sampling: A complete inspection of the product population would destroy the entire output of the production process.

We know that the sample proportion of television viewers or of defective items is probably not exactly equal to the population proportion we want to estimate. Nonetheless, the sample statistic can come quite close to the parameter it is designed to estimate if the **target population** (the population about which we want to draw inferences) and the **sampled population** (the actual population from which the sample has been taken) are the same. In practice, these may not be the same. One of statistics' most famous failures illustrates this phenomenon.

The *Literary Digest* was a popular magazine of the 1920s and 1930s that had correctly predicted the outcomes of several presidential elections. In 1936, the *Digest* predicted that the Republican candidate, Alfred Landon, would defeat the Democratic incumbent, Franklin D. Roosevelt, by a 3 to 2 margin. But in that election, Roosevelt defeated Landon in a landslide victory, garnering the support of 62% of the electorate. The source of this blunder was the sampling procedure, and there were two distinct mistakes.* First, the *Digest* sent out 10 million sample ballots to prospective voters. However, most of the names of these people were taken from the *Digest's* subscription list and from telephone directories. Subscribers to the magazine and people who owned telephones tended to be wealthier than average and such people then, as today, tended to vote Republican. In addition, only 2.3 million ballots were returned resulting in a self-selected sample.

Self-selected samples are almost always biased because the individuals who participate in them are more keenly interested in the issue than are the other members of the population. You often find similar surveys conducted today when radio and television stations ask people to call and give their opinion on an issue of interest. Again, only listeners who are concerned about the topic and have enough patience to get through to the station will be included in the sample. Hence, the sampled population is composed entirely of people who are interested in the issue, whereas the target population is made up of all the people within the listening radius of the radio station. As a result, the conclusions drawn from such surveys are frequently wrong.

An excellent example of this phenomenon occurred on ABC's *Nightline* in 1984. Viewers were given a 900 telephone number (cost: 50 cents) and asked to phone in their responses to the question of whether the United Nations should continue to be located in the United States. More than 186,000 people called, with 67% responding "no." At the same time, a (more scientific) market research poll of 500 people revealed that 72% wanted the United Nations to remain in the United States. In general, because the true value of the parameter being estimated is never known, these surveys give the impression of providing useful information. In fact, the results of such surveys are likely to be no more accurate than the results of the 1936 *Literary Digest* poll or *Nightline's* phone-in show. Statisticians have coined two terms to describe these polls: SLOP (self-selected opinion poll) and *Oy vey* (from the Yiddish lament), both of which convey the contempt that statisticians have for such data-gathering processes.

*Many statisticians ascribe the *Literary Digest's* statistical debacle to the wrong causes. For an understanding of what really happened, read Maurice C. Bryson, "The Literary Digest Poll: Making of a Statistical Myth" *American Statistician* 30(4) (November 1976): 184–185.



EXERCISES

- 5.6 For each of the following sampling plans, indicate why the target population and the sampled population are not the same.
- To determine the opinions and attitudes of customers who regularly shop at a particular mall, a surveyor stands outside a large department store in the mall and randomly selects people to participate in the survey.
 - A library wants to estimate the proportion of its books that have been damaged. The librarians

- decide to select one book per shelf as a sample by measuring 12 inches from the left edge of each shelf and selecting the book in that location.
- c. Political surveyors visit 200 residences during one afternoon to ask eligible voters present in the house at the time whom they intend to vote for.
- 5.7 a. Describe why the *Literary Digest* poll of 1936 has become infamous.
 b. What caused this poll to be so wrong?
- 5.8 a. What is meant by *self-selected sample*?
 b. Give an example of a recent poll that involved a self-selected sample.
 c. Why are self-selected samples not desirable?
- 5.9 A regular feature in a newspaper asks readers to respond via e-mail to a survey that requires a yes or no response. In the following day's newspaper, the percentage of yes and no responses are reported. Discuss why we should ignore these statistics.
- 5.10 Suppose your statistics professor distributes a questionnaire about the course. One of the questions asks, "Would you recommend this course to a friend?" Can the professor use the results to infer something about all statistics courses? Explain.

5-3 / SAMPLING PLANS

Our objective in this section is to introduce three different sampling plans: simple random sampling, stratified random sampling, and cluster sampling. We begin our presentation with the most basic design.

5-3a Simple Random Sampling

Simple Random Sample

A **simple random sample** is a sample selected in such a way that every possible sample with the same number of observations is equally likely to be chosen.

One way to conduct a simple random sample is to assign a number to each element in the population, write these numbers on individual slips of paper, toss them into a hat, and draw the required number of slips (the sample size, n) from the hat. This is the kind of procedure that occurs in raffles, when all the ticket stubs go into a large rotating drum from which the winners are selected.

Sometimes the elements of the population are already numbered. For example, virtually all adults have Social Security numbers (in the United States) or Social Insurance numbers (in Canada); all employees of large corporations have employee numbers; many people have driver's license numbers, medical plan numbers, student numbers, and so on. In such cases, choosing which sampling procedure to use is simply a matter of deciding how to select from among these numbers.

In other cases, the existing form of numbering has built-in flaws that make it inappropriate as a source of samples. Not everyone has a phone number, for example, so the telephone book does not list all the people in a given area. Many households have two (or more) adults but only one phone listing. It seems that everyone in the world has a cell phone. Many of these people have no land phone, so they do not appear on any list. Some people do not have phones, some have unlisted phone numbers, and some have more than one phone; these differences mean that each element of the population does not have an equal probability of being selected.

After each element of the chosen population has been assigned a unique number, sample numbers can be selected at random. A random number table can be used to select these sample numbers. (See, for example, *CRC Standard Management Tables*, W. H. Beyer, ed., Boca Raton FL: CRC Press.) Alternatively, we can use Excel to perform this function.

EXAMPLE 5.1

Random Sample of Income Tax Returns

A government income tax auditor has been given responsibility for 1,000 tax returns. A computer is used to check the arithmetic of each return. However, to determine whether the returns have been completed honestly, the auditor must check each entry and confirm its veracity. Because it takes, on average, 1 hour to completely audit a return and she has only 1 week to complete the task, the auditor has decided to randomly select 40 returns. The returns are numbered from 1 to 1,000. Use a computer random-number generator to select the sample for the auditor.

SOLUTION:

We generated 50 numbers between 1 and 1,000 even though we needed only 40 numbers. We did so because it is likely that there will be some duplicates. We will use the first 40 unique random numbers to select our sample. The following numbers were generated by Excel. The instructions for both Excel and Minitab are provided here. [Notice that the 24th and 36th (counting down the columns) numbers generated were the same—467.]

Computer-Generated Random Numbers

383	246	372	952	75
101	46	356	54	199
597	33	911	706	65
900	165	467	817	359
885	220	427	973	488
959	18	304	467	512
15	286	976	301	374
408	344	807	751	986
864	554	992	352	41
139	358	257	776	231

EXCEL

INSTRUCTIONS

1. Click **Data**, **Data Analysis**, and **Random Number Generation**.
2. Specify the **Number of Variables** (1) and the **Number of Random Numbers** (50).
3. Select **Uniform Distribution**.
4. Specify the range of the uniform distribution (**Parameters**) (0 and 1).
5. Click **OK**. Column A will fill with 50 numbers that range between 0 and 1.
6. Multiply column A by 1,000 and store the products in column B.

7. Make cell C1 active, and click f_x , **Math & Trig**, **ROUNDUP**, and **OK**.
8. Specify the first number to be rounded (**B1**).
9. Type the **number of digits** (decimal places) (**0**). Click **OK**.
10. Complete column C.

The first five steps command Excel to generate 50 uniformly distributed random numbers between 0 and 1 to be stored in column A. Steps 6 through 10 convert these random numbers to integers between 1 and 1,000. Each tax return has the same probability ($1/1,000 = .001$) of being selected. Thus, each member of the population is equally likely to be included in the sample.

MINITAB

INSTRUCTIONS

1. Click **Calc**, **Random Data**, and **Integer**
2. Type the number of random numbers you wish (**50**).
3. Specify where the numbers are to be stored (**C1**).
4. Specify the **Minimum value** (**1**).
5. Specify the **Maximum value** (**1000**). Click **OK**.

INTERPRET

The auditor would examine the tax returns selected by the computer. She would pick returns numbered 383, 101, 597, . . . , 352, 776, and 75 (the first 40 unique numbers). Each of these returns would be audited to determine whether it is fraudulent. If the objective is to audit these 40 returns, no statistical procedure would be employed. However, if the objective is to estimate the proportion of all 1,000 returns that are dishonest, then she would use one of the inferential techniques presented later in this book.

5-3b Stratified Random Sampling

In making inferences about a population, we attempt to extract as much information as possible from a sample. The basic sampling plan, simple random sampling, often accomplishes this goal at low cost. Other methods, however, can be used to increase the amount of information about the population. One such procedure is *stratified random sampling*.

Stratified Random Sample

A **stratified random sample** is obtained by separating the population into mutually exclusive sets, or strata, and then drawing simple random samples from each stratum.

Examples of criteria for separating a population into strata (and of the strata themselves) follow.

1. Gender
 - male
 - female
2. Age
 - under 20
 - 20–30
 - 31–40
 - 41–50
 - 51–60
 - over 60
3. Occupation
 - professional
 - clerical
 - blue-collar
 - other
4. Household income
 - under \$25,000
 - \$25,000–\$39,999
 - \$40,000–\$60,000
 - over \$60,000

To illustrate, suppose a public opinion survey is to be conducted to determine how many people favor a tax increase. A stratified random sample could be obtained by selecting a random sample of people from each of the four income groups we just described. We usually stratify in a way that enables us to obtain particular kinds of information. In this example, we would like to know whether people in the different income categories differ in their opinions about the proposed tax increase, because the tax increase will affect the strata differently. We avoid stratifying when there is no connection between the survey and the strata. For example, little purpose is served in trying to determine whether people within religious strata have divergent opinions about the tax increase.

One advantage of stratification is that, besides acquiring information about the entire population, we can also make inferences within each stratum or compare strata. For instance, we can estimate what proportion of the lowest income group favors the tax increase, or we can compare the highest and lowest income groups to determine whether they differ in their support of the tax increase.

Any stratification must be done in such a way that the strata are mutually exclusive: Each member of the population must be assigned to exactly one stratum. After the population has been stratified in this way, we can use simple random sampling to generate the complete sample. There are several ways to do this. For example, we can draw random samples from each of the four income groups according to their proportions in the population. Thus, if in the population the relative frequencies of the four groups are as listed here, our sample will be stratified in the same proportions. If a total sample of 1,000 is to be drawn, then we will randomly select 250 from stratum 1, 400 from stratum 2, 300 from stratum 3, and 50 from stratum 4.

Stratum	Income Categories (\$)	Population Proportions (%)
1	Less than 25,000	25
2	25,000–39,999	40
3	40,000–60,000	30
4	More than 60,000	5

The problem with this approach, however, is that if we want to make inferences about the last stratum, a sample of 50 may be too small to produce useful information. In such cases, we usually increase the sample size of the smallest stratum to ensure that the sample data provide enough information for our purposes. An adjustment must then be made before we attempt to draw inferences about the entire population. The required procedure is beyond the level of this book. We recommend that anyone planning such a survey consult an expert statistician or a reference book on the subject. Better still, become an expert statistician yourself by taking additional statistics courses.

5-3c Cluster Sampling

Cluster Sample

A **cluster sample** is a simple random sample of groups or clusters of elements.

Cluster sampling is particularly useful when it is difficult or costly to develop a complete list of the population members (making it difficult and costly to generate a simple random sample). It is also useful whenever the population elements are widely dispersed geographically. For example, suppose we wanted to estimate the average annual household income in a large city. To use simple random sampling, we would need a complete list of households in the city from which to sample. To use stratified random sampling, we would need the list of households, and we would also need to have each household categorized by some other variable (such as age of household head) in order to develop the strata. A less-expensive alternative would be to let each block within the city represent a cluster. A sample of clusters could then be randomly selected, and every household within these clusters could be questioned to determine income. By reducing the distances the surveyor must cover to gather data, cluster sampling reduces the cost.

But cluster sampling also increases sampling error (see Section 5-4) because households belonging to the same cluster are likely to be similar in many respects, including household income. This can be partially offset by using some of the cost savings to choose a larger sample than would be used for a simple random sample.

5-3d Sample Size

Whichever type of sampling plan you select, you still have to decide what size sample to use. Determining the appropriate sample size will be addressed in detail in Chapters 10 and 12. Until then, we can rely on our intuition, which tells us that the larger the sample size is, the more accurate we can expect the estimates to be.

Sampling and the Census

To adjust for undercounting, the Census Bureau conducts cluster sampling. The clusters are geographic blocks. For the year 2000 census, the bureau randomly sampled 11,800 blocks, which contained 314,000 housing units. Each unit was intensively revisited to ensure that all residents were counted. From the results of this survey, the Census Bureau estimated the number of people missed by the first census in various subgroups, defined by several variables including gender, race, and age. Because of the importance of



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determining state populations, adjustments were made to state totals. For example, by comparing the results of the census and of the sampling, the Bureau determined that the undercount in the state of Texas was 1.7087%.

The official census produced a state population of 20,851,820. Taking 1.7087% of this total produced an adjustment of 356,295. Using this method changed the population of the state of Texas to 21,208,115.

It should be noted that this process is contentious. The controversy concerns the way in which subgroups are defined. Changing the definition alters the undercounts, making this statistical technique subject to politicking.



EXERCISES

- 5.11** A statistics practitioner would like to conduct a survey to ask people their views on a proposed new shopping mall in their community. According to the latest census, there are 500 households in the community. The statistician has numbered each household (from 1 to 500), and she would like to randomly select 25 of these households to participate in the study. Use Excel or Minitab to generate the sample.
- 5.12** A safety expert wants to determine the proportion of cars in his state with worn tire treads. The state license plate contains six digits. Use Excel or Minitab to generate a sample of 20 cars to be examined.
- 5.13** A large university campus has 60,000 students. The president of the students' association wants to conduct a survey of the students to determine their views on an increase in the student activity fee. She would like to acquire information about all the students but would also like to compare the school of business, the faculty of arts and sciences, and the graduate school. Describe a sampling plan that accomplishes these goals.
- 5.14** A telemarketing firm has recorded the households that have purchased one or more of the company's products. These number in the millions. The firm would like to conduct a survey of purchasers to acquire information about their attitude concerning the timing of the telephone calls. The president of the company would like to know the views of all purchasers but would also like to compare the attitudes of people in the West, South, North, and East. Describe a suitable sampling plan.
- 5.15** The operations manager of a large plant with four departments wants to estimate the person-hours lost per month from accidents. Describe a sampling plan that would be suitable for estimating the plantwide loss and for comparing departments.
- 5.16** A statistics practitioner wants to estimate the mean age of children in his city. Unfortunately, he does not have a complete list of households. Describe a sampling plan that would be suitable for his purposes.

5-4 / SAMPLING AND NONSAMPLING ERRORS

Two major types of error can arise when a sample of observations is taken from a population: *sampling error* and *nonsampling error*. Anyone reviewing the results of sample surveys and studies, as well as statistics practitioners conducting surveys and applying statistical techniques, should understand the sources of these errors.

5-4a Sampling Error

Sampling error refers to differences between the sample and the population that exists only because of the observations that happened to be selected for the sample. Sampling error is an error that we expect to occur when we make a statement about a population that is based only on the observations contained in a sample taken from the population.

To illustrate, suppose that we wish to determine the mean annual income of North American blue-collar workers. To determine this parameter we would have to ask each North American blue-collar worker what his or her income is and then calculate the mean of all the responses. Because the size of this population is several million, the task is both expensive and impractical. We can use statistical inference to estimate

the mean income μ of the population if we are willing to accept less than 100% accuracy. We record the incomes of a sample of the workers and find the mean \bar{x} of this sample of incomes. This sample mean is an estimate, of the desired, population mean. But the value of the sample mean will deviate from the population mean simply by chance because the value of the sample mean depends on which incomes just happened to be selected for the sample. The difference between the true (unknown) value of the population mean and its estimate, the sample mean, is the sampling error. The size of this deviation may be large simply because of bad luck—bad luck that a particularly unrepresentative sample happened to be selected. The only way we can reduce the expected size of this error is to take a larger sample.

Given a fixed sample size, the best we can do is to state the probability that the sampling error is less than a certain amount (as we will discuss in Chapter 10). It is common today for such a statement to accompany the results of an opinion poll. If an opinion poll states that, based on sample results, the incumbent candidate for mayor has the support of 54% of eligible voters in an upcoming election, the statement may be accompanied by the following explanatory note: “This percentage is correct to within three percentage points, 19 times out of 20.” This statement means that we estimate that the actual level of support for the candidate is between 51% and 57%, and that in the long run this type of procedure is correct 95% of the time.

5-4b Nonsampling Error

Nonsampling error is more serious than sampling error because taking a larger sample won’t diminish the size, or the possibility of occurrence, of this error. Even a census can (and probably will) contain nonsampling errors. **Nonsampling errors** result from mistakes made in the acquisition of data or from the sample observations being selected improperly.

- 1.** *Errors in data acquisition.* This type of error arises from the recording of incorrect responses. Incorrect responses may be the result of incorrect measurements being taken because of faulty equipment, mistakes made during transcription from primary sources, inaccurate recording of data because terms were misinterpreted, or inaccurate responses were given to questions concerning sensitive issues such as sexual activity or possible tax evasion.
- 2.** *Nonresponse error:* **Nonresponse error** refers to error (or **bias**) introduced when responses are not obtained from some members of the sample. When this happens, the sample observations that are collected may not be representative of the target population, resulting in biased results (as was discussed in Section 5-2). Nonresponse can occur for a number of reasons. An interviewer may be unable to contact a person listed in the sample, or the sampled person may refuse to respond for some reason. In either case, responses are not obtained from a sampled person, and bias is introduced. The problem of nonresponse is even greater when self-administered questionnaires are used rather than an interviewer, who can attempt to reduce the nonresponse rate by means of callbacks. As noted previously, the *Literary Digest* fiasco was largely the result of a high nonresponse rate, resulting in a biased, self-selected sample.
- 3.** *Selection bias.* **Selection bias** occurs when the sampling plan is such that some members of the target population cannot possibly be selected for inclusion in the sample. Together with nonresponse error, selection bias played a role in the *Literary Digest* poll being so wrong, as voters without telephones or without a subscription to *Literary Digest* were excluded from possible inclusion in the sample taken.



EXERCISES

- 5.17** a. Explain the difference between sampling error and nonsampling error.
 b. Which type of error in part (a) is more serious? Why?
- 5.18** Briefly describe three types of nonsampling error.
- 5.19** Is it possible for a sample to yield better results than a census? Explain.

CHAPTER SUMMARY

Because most populations are very large, it is extremely costly and impractical to investigate each member of the population to determine the values of the parameters. As a practical alternative, we take a sample from the population and use the sample statistics to draw inferences about the parameters. Care must be taken to ensure that the **sampled population** is the same as the **target population**.

IMPORTANT TERMS:

Observational 159
 Experimental 160
 Survey 160
 Response rate 160
 Estimate 162
 Target population 163
 Sampled population 163
 Self-selected sample 163

We can choose from among several different sampling plans, including **simple random sampling**, **stratified random sampling**, and **cluster sampling**. Whatever sampling plan is used, it is important to realize that both **sampling error** and **nonsampling error** will occur and to understand what the sources of these errors are.

Simple random sample 164
 Stratified random sample 166
 Cluster sample 168
 Sampling error 169
 Nonsampling error 170
 Nonresponse error (bias) 170
 Selection bias 170

6



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PROBABILITY

- 6-1 *Assigning Probability to Events*
- 6-2 *Joint, Marginal, and Conditional Probability*
- 6-3 *Probability Rules and Trees*
- 6-4 *Bayes's Law*
- 6-5 *Identifying the Correct Method*

Auditing Tax Returns

Government auditors routinely check tax returns to determine whether calculation errors were made. They also attempt to detect fraudulent returns. There are several methods that dishonest taxpayers use to evade income tax. One method is not to declare various sources of income. Auditors have several detection methods, including spending patterns. Another form of tax fraud is to invent deductions that are not real. After analyzing the returns of thousands of self-employed taxpayers, an auditor has determined that 45% of fraudulent returns contain two suspicious deductions, 28% contain one suspicious deduction, and the rest no suspicious deductions. Among honest returns the rates are 11% for two deductions, 18% for one deduction, and 71% for no deductions. The auditor believes that 5% of the returns of self-employed individuals contain significant fraud. The auditor has just received a tax return for a self-employed individual that contains one suspicious expense deduction. What is the probability that this tax return contains significant fraud?



Gary Bus/Fax/Getty Images

See page 199 for the answer

INTRODUCTION

In Chapters 2, 3, and 4, we introduced graphical and numerical descriptive methods. Although the methods are useful on their own, we are particularly interested in developing statistical inference. As we pointed out in Chapter 1, statistical inference is the process by which we acquire information about populations from samples. A critical component of inference is *probability* because it provides the link between the population and the sample.

Our primary objective in this and the following two chapters is to develop the probability-based tools that are at the basis of statistical inference. However, probability can also play a critical role in decision making, a subject we explore in Chapter 22.

6-1 / ASSIGNING PROBABILITY TO EVENTS

To introduce probability, we must first define a *random experiment*.

Random Experiment

A **random experiment** is an action or process that leads to one of several possible outcomes.

Here are six illustrations of random experiments and their outcomes.

Illustration 1. Experiment: Flip a coin.

Outcomes: Heads and tails

Illustration 2. Experiment: Record marks on a statistics test (out of 100).

Outcomes: Numbers between 0 and 100

Illustration 3. Experiment: Record grade on a statistics test.

Outcomes: A, B, C, D, and F

Illustration 4. Experiment: Record student evaluations of a course.

Outcomes: Poor, fair, good, very good, and excellent

Illustration 5. Experiment: Measure the time to assemble a computer.

Outcomes: Number whose smallest possible value is 0 seconds with no predefined upper limit

Illustration 6. Experiment: Record the party that a voter will vote for in an upcoming election.

Outcomes: Party A, Party B, ...

The first step in assigning probabilities is to produce a list of the outcomes. The listed outcomes must be **exhaustive**, which means that all possible outcomes must be included. In addition, the outcomes must be **mutually exclusive**, which means that no two outcomes can occur at the same time.

To illustrate the concept of exhaustive outcomes consider this list of the outcomes of the toss of a die:

1 2 3 4 5

This list is not exhaustive, because we have omitted 6.

The concept of mutual exclusiveness can be seen by listing the following outcomes in illustration 2:

0–50 50–60 60–70 70–80 80–100

If these intervals include both the lower and upper limits, then these outcomes are not mutually exclusive because two outcomes can occur for any student. For example, if a student receives a mark of 70, both the third and fourth outcomes occur.

Note that we could produce more than one list of exhaustive and mutually exclusive outcomes. For example, here is another list of outcomes for illustration 3:

Pass and fail

A list of exhaustive and mutually exclusive outcomes is called a *sample space* and is denoted by S . The outcomes are denoted by O_1, O_2, \dots, O_k .

Sample Space

A **sample space** of a random experiment is a list of all possible outcomes of the experiment. The outcomes must be exhaustive and mutually exclusive.

Using set notation, we represent the sample space and its outcomes as

$$S = \{O_1, O_2, \dots, O_k\}$$

Once a sample space has been prepared we begin the task of assigning probabilities to the outcomes. There are three ways to assign probability to outcomes. However it is done, there are two rules governing probabilities as stated in the next box.

Requirements of Probabilities

Given a sample space $S = \{O_1, O_2, \dots, O_k\}$, the probabilities assigned to the outcomes must satisfy two requirements.

1. The probability of any outcome must lie between 0 and 1; that is,

$$0 \leq P(O_i) \leq 1 \quad \text{for each } i$$

[Note: $P(O_i)$ is the notation we use to represent the probability of outcome i .]

2. The sum of the probabilities of all the outcomes in a sample space must be 1. That is,

$$\sum_{i=1}^k P(O_i) = 1$$

6-1a Three Approaches to Assigning Probabilities

The **classical approach** is used by mathematicians to help determine probability associated with games of chance. For example, the classical approach specifies that the

probabilities of heads and tails in the flip of a balanced coin are equal to each other. Because the sum of the probabilities must be 1, the probability of heads and the probability of tails are both 50%. Similarly, the six possible outcomes of the toss of a balanced die have the same probability; each is assigned a probability of 1/6. In some experiments, it is necessary to develop mathematical ways to count the number of outcomes. For example, to determine the probability of winning a lottery, we need to determine the number of possible combinations. For details on how to count events, see Keller's website Appendix Counting Formulas.

The **relative frequency approach** defines probability as the long-run relative frequency with which an outcome occurs. For example, suppose that we know that of the last 1,000 students who took the statistics course you're now taking, 200 received a grade of *A*. The relative frequency of *A*'s is then 200/1000 or 20%. This figure represents an estimate of the probability of obtaining a grade of *A* in the course. It is only an estimate because the relative frequency approach defines probability as the "long-run" relative frequency. One thousand students do not constitute the long run. The larger the number of students whose grades we have observed, the better the estimate becomes. In theory, we would have to observe an infinite number of grades to determine the exact probability.

When it is not reasonable to use the classical approach and there is no history of the outcomes, we have no alternative but to employ the **subjective approach**. In the subjective approach, we define probability as the degree of belief that we hold in the occurrence of an event. An excellent example is derived from the field of investment. An investor would like to know the probability that a particular stock will increase in value. Using the subjective approach, the investor would analyze a number of factors associated with the stock and the stock market in general and, using his or her judgment, assign a probability to the outcomes of interest.

6-1b Defining Events

An individual outcome of a sample space is called a *simple event*. All other events are composed of the simple events in a sample space.

Event

An **event** is a collection or set of one or more simple events in a sample space.

In illustration 2, we can define the event, achieve a grade of *A*, as the set of numbers that lie between 80 and 100, inclusive. Using set notation, we have

$$A = \{80, 81, 82, \dots, 99, 100\}$$

Similarly,

$$F = \{0, 1, 2, \dots, 48, 49\}$$

6-1c Probability of Events

We can now define the probability of any event.

Probability of an Event

The probability of an event is the sum of the probabilities of the simple events that constitute the event.

For example, suppose that in illustration 3, we employed the relative frequency approach to assign probabilities to the simple events as follows:

$$\begin{aligned}P(A) &= .20 \\P(B) &= .30 \\P(C) &= .25 \\P(D) &= .15 \\P(F) &= .10\end{aligned}$$

The probability of the event, pass the course, is

$$P(\text{Pass the course}) = P(A) + P(B) + P(C) + P(D) = .20 + .30 + .25 + .15 = .90$$

6-1d Interpreting Probability

No matter what method was used to assign probability, we interpret it using the relative frequency approach for an infinite number of experiments. For example, an investor may have used the subjective approach to determine that there is a 65% probability that a particular stock's price will increase over the next month. However, we interpret the 65% figure to mean that if we had an infinite number of stocks with exactly the same economic and market characteristics as the one the investor will buy, 65% of them will increase in price over the next month. Similarly, we can determine that the probability of throwing a 5 with a balanced die is 1/6. We may have used the classical approach to determine this probability. However, we interpret the number as the proportion of times that a 5 is observed on a balanced die thrown an infinite number of times.

This relative frequency approach is useful to interpret probability statements such as those heard from weather forecasters or scientists. You will also discover that this is the way we link the population and the sample in statistical inference.



EXERCISES

- 6.1** The weather forecaster reports that the probability of rain tomorrow is 10%.
 - a. Which approach was used to arrive at this number?
 - b. How do you interpret the probability?

- 6.2** A sportscaster states that he believes that the probability that the New York Yankees will win the World Series this year is 25%.
 - a. Which method was used to assign that probability?
 - b. How would you interpret the probability?

- 6.3** A quiz contains a multiple-choice question with five possible answers, only one of which is correct. A student plans to guess the answer because he knows absolutely nothing about the subject.
 - a. Produce the sample space for each question.
 - b. Assign probabilities to the simple events in the sample space you produced.
 - c. Which approach did you use to answer part (b)?
 - d. Interpret the probabilities you assigned in part (b).

- 6.4** An investor tells you that in her estimation there is a 60% probability that the Dow Jones Industrial Averages index will increase tomorrow.
- Which approach was used to produce this figure?
 - Interpret the 60% probability.

- 6.5** The sample space of the toss of a fair die is

$$S = \{1, 2, 3, 4, 5, 6\}$$

If the die is balanced each simple event has the same probability. Find the probability of the following events.

- An even number
- A number less than or equal to 4
- A number greater than or equal to 5

- 6.6** Four candidates are running for mayor. The four candidates are Adams, Brown, Collins, and Dalton. Determine the sample space of the results of the election.

- 6.7** Refer to Exercise 6.6. Employing the subjective approach a political scientist has assigned the following probabilities:

$$P(\text{Adams wins}) = .42$$

$$P(\text{Brown wins}) = .09$$

$$P(\text{Collins wins}) = .27$$

$$P(\text{Dalton wins}) = .22$$

Determine the probabilities of the following events.

- Adams loses.
- Either Brown or Dalton wins.
- Adams, Brown, or Collins wins.

- 6.8** The manager of a computer store has kept track of the number of computers sold per day. On the basis of this information, the manager produced the following list of the number of daily sales.

Number of Computers Sold	Probability
0	.08
1	.17
2	.26
3	.21
4	.18
5	.10

- If we define the experiment as observing the number of computers sold tomorrow, determine the sample space.

- Use set notation to define the event, sell more than three computers.
- What is the probability of selling five computers?
- What is the probability of selling two, three, or four computers?
- What is the probability of selling six computers?

- 6.9** Three contractors (call them contractors 1, 2, and 3) bid on a project to build a new bridge. What is the sample space?

- 6.10** Refer to Exercise 6.9. Suppose that you believe that contractor 1 is twice as likely to win as contractor 3 and that contractor 2 is three times as likely to win as contractor 3. What are the probabilities of winning for each contractor?

- 6.11** Shoppers can pay for their purchases with cash, a credit card, or a debit card. Suppose that the proprietor of a shop determines that 60% of her customers use a credit card, 30% pay with cash, and the rest use a debit card.

- Determine the sample space for this experiment.
- Assign probabilities to the simple events.
- Which method did you use in part (b)?

- 6.12** Refer to Exercise 6.11.

- What is the probability that a customer does not use a credit card?
- What is the probability that a customer pays in cash or with a credit card?

- 6.13** A survey asks adults to report their marital status. The sample space is $S = \{\text{single, married, divorced, widowed}\}$. Use set notation to represent the event the adult is not married.

- 6.14** Refer to Exercise 6.13. Suppose that in the city in which the survey is conducted, 50% of adults are married, 15% are single, 25% are divorced, and 10% are widowed.

- Assign probabilities to each simple event in the sample space.
- Which approach did you use in part (a)?

- 6.15** Refer to Exercises 6.13 and 6.14. Find the probability of each of the following events.

- The adult is single.
- The adult is not divorced.
- The adult is either widowed or divorced.

6-2 / JOINT, MARGINAL, AND CONDITIONAL PROBABILITY

In the previous section, we described how to produce a sample space and assign probabilities to the simple events in the sample space. Although this method of determining probability is useful, we need to develop more sophisticated methods. In this section, we

discuss how to calculate the probability of more complicated events from the probability of related events. Here is an illustration of the process.

The sample space for the toss of a die is

$$S = \{1, 2, 3, 4, 5, 6\}$$

If the die is balanced, the probability of each simple event is $1/6$. In most parlor games and casinos, players toss two dice. To determine playing and wagering strategies, players need to compute the probabilities of various totals of the two dice. For example, the probability of tossing a total of 3 with two dice is $2/36$. This probability was derived by creating combinations of the simple events. There are several different types of combinations. One of the most important types is the *intersection* of two events.

6-2a Intersection

Intersection of Events A and B

The **intersection** of events A and B is the event that occurs when both A and B occur. It is denoted as

$$A \text{ and } B$$

The probability of the intersection is called the **joint probability**.

For example, one way to toss a 3 with two dice is to toss a 1 on the first die *and* a 2 on the second die, which is the intersection of two simple events. Incidentally, to compute the probability of a total of 3, we need to combine this intersection with another intersection, namely, a 2 on the first die and a 1 on the second die. This type of combination is called a *union* of two events, and it will be described later in this section. Here is another illustration.

APPLICATIONS in FINANCE

AP Photo/Charles Bennett



Mutual Funds

A mutual fund is a pool of investments made on behalf of people who share similar objectives. In most cases, a professional manager who has been educated in finance and statistics manages the fund. He or she makes decisions to buy and sell individual stocks and bonds in accordance with a specified investment philosophy. For example, there are funds that concentrate on other publicly traded mutual fund companies. Other mutual funds specialize in Internet stocks

(so-called dot-coms), whereas others buy stocks of biotechnology firms. Surprisingly, most mutual funds do not outperform the market; that is, the increase in the net asset value (NAV) of the mutual fund is often less than the increase in the value of stock indexes that represent their stock markets. One reason for this is the management expense ratio (MER) which is a measure of the costs charged to the fund by the manager to cover expenses, including the salary and bonus of the managers. The MERs for most funds range from .5% to more than 4%. The ultimate success of the fund depends on the skill and knowledge of the fund manager. This raises the question, which managers do best?

EXAMPLE 6.1

Determinants of Success among Mutual Fund Managers—Part 1*

Why are some mutual fund managers more successful than others? One possible factor is the university where the manager earned his or her master of business administration (MBA). Suppose that a potential investor examined the relationship between how well the mutual fund performs and where the fund manager earned his or her MBA. After the analysis, Table 6.1, a table of joint probabilities, was developed. Analyze these probabilities and interpret the results.

TABLE 6.1 Determinants of Success among Mutual Fund Managers, Part 1*

	MUTUAL FUND OUTPERFORMS MARKET	MUTUAL FUND DOES NOT OUTPERFORM MARKET
Top-20 MBA program	.11	.29
Not top-20 MBA program	.06	.54

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Table 6.1 tells us that the joint probability that a mutual fund outperforms the market *and* that its manager graduated from a top-20 MBA program is .11; that is, 11% of all mutual funds outperform the market and their managers graduated from a top-20 MBA program. The other three joint probabilities are defined similarly:

The probability that a mutual fund outperforms the market and its manager did not graduate from a top-20 MBA program is .06.

The probability that a mutual fund does not outperform the market and its manager graduated from a top-20 MBA program is .29.

The probability that a mutual fund does not outperform the market and its manager did not graduate from a top-20 MBA program is .54.

To help make our task easier, we'll use notation to represent the events. Let

A_1 = Fund manager graduated from a top-20 MBA program

A_2 = Fund manager did not graduate from a top-20 MBA program

B_1 = Fund outperforms the market

B_2 = Fund does not outperform the market

Thus,

$$P(A_1 \text{ and } B_1) = .11$$

$$P(A_2 \text{ and } B_1) = .06$$

$$P(A_1 \text{ and } B_2) = .29$$

$$P(A_2 \text{ and } B_2) = .54$$

*This example is adapted from “Are Some Mutual Fund Managers Better than Others? Cross-Sectional Patterns in Behavior and Performance” by Judith Chevalier and Glenn Ellison, Working paper 5852, National Bureau of Economic Research.

6-2b Marginal Probability

The joint probabilities in Table 6.1 allow us to compute various probabilities. **Marginal probabilities**, computed by adding across rows or down columns, are so named because they are calculated in the margins of the table.

Adding across the first row produces

$$P(A_1 \text{ and } B_1) + P(A_1 \text{ and } B_2) = .11 + .29 = .40$$

Notice that both intersections state that the manager graduated from a top-20 MBA program (represented by A_1). Thus, when randomly selecting mutual funds, the probability that its manager graduated from a top-20 MBA program is .40. Expressed as relative frequency, 40% of all mutual fund managers graduated from a top-20 MBA program.

Adding across the second row:

$$P(A_2 \text{ and } B_1) + P(A_2 \text{ and } B_2) = .06 + .54 = .60$$

This probability tells us that 60% of all mutual fund managers did not graduate from a top-20 MBA program (represented by A_2). Notice that the probability that a mutual fund manager graduated from a top-20 MBA program and the probability that the manager did not graduate from a top-20 MBA program add to 1.

Adding down the columns produces the following marginal probabilities.

$$\text{Column 1: } P(A_1 \text{ and } B_1) + P(A_2 \text{ and } B_1) = .11 + .06 = .17$$

$$\text{Column 2: } P(A_1 \text{ and } B_2) + P(A_2 \text{ and } B_2) = .29 + .54 = .83$$

These marginal probabilities tell us that 17% of all mutual funds outperform the market and that 83% of mutual funds do not outperform the market.

Table 6.2 lists all the joint and marginal probabilities.

TABLE 6.2 Joint and Marginal Probabilities

	MUTUAL FUND OUTPERFORMS MARKET	MUTUAL FUND DOES NOT OUTPERFORM MARKET	TOTALS
Top-20 MBA program	$P(A_1 \text{ and } B_1) = .11$	$P(A_1 \text{ and } B_2) = .29$	$P(A_1) = .40$
Not top-20 MBA program	$P(A_2 \text{ and } B_1) = .06$	$P(A_2 \text{ and } B_2) = .54$	$P(A_2) = .60$
Totals	$P(B_1) = .17$	$P(B_2) = .83$	1.00

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6-2c Conditional Probability

We frequently need to know how two events are related. In particular, we would like to know the probability of one event given the occurrence of another related event. For example, we would certainly like to know the probability that a fund managed by a graduate of a top-20 MBA program will outperform the market. Such a probability will allow us to make an informed decision about where to invest our money. This probability is called a **conditional probability** because we want to know the probability that a

fund will outperform the market *given* the condition that the manager graduated from a top-20 MBA program. The conditional probability that we seek is represented by

$$P(B_1|A_1)$$

where the “|” represents the word *given*. Here is how we compute this conditional probability.

The marginal probability that a manager graduated from a top-20 MBA program is .40, which is made up of two joint probabilities. They are (1) the probability that the mutual fund outperforms the market and the manager graduated from a top-20 MBA program [$P(A_1 \text{ and } B_1)$] and (2) the probability that the fund does not outperform the market and the manager graduated from a top-20 MBA program [$P(A_1 \text{ and } B_2)$]. Their joint probabilities are .11 and .29, respectively. We can interpret these numbers in the following way. On average, for every 100 mutual funds, 40 will be managed by a graduate of a top-20 MBA program. Of these 40 managers, on average 11 of them will manage a mutual fund that will outperform the market. Thus, the conditional probability is $11/40 = .275$. Notice that this ratio is the same as the ratio of the joint probability to the marginal probability $.11/.40$. All conditional probabilities can be computed this way.

Conditional Probability

The probability of event A given event B is

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)}$$

The probability of event B given event A is

$$P(B|A) = \frac{P(A \text{ and } B)}{P(A)}$$

EXAMPLE 6.2

Determinants of Success among Mutual Fund Managers—Part 2

Suppose that in Example 6.1 we select one mutual fund at random and discover that it did not outperform the market. What is the probability that a graduate of a top-20 MBA program manages it?

SOLUTION:

We wish to find a conditional probability. The condition is that the fund did not outperform the market (event B_2), and the event whose probability we seek is that the fund is managed by a graduate of a top-20 MBA program (event A_1). Thus, we want to compute the following probability:

$$P(A_1|B_2)$$

Using the conditional probability formula, we find

$$P(A_1|B_2) = \frac{P(A_1 \text{ and } B_2)}{P(B_2)} = \frac{.29}{.83} = .349$$

Thus, 34.9% of all mutual funds that do not outperform the market are managed by top-20 MBA program graduates.

The calculation of conditional probabilities raises the question of whether the two events, the fund outperformed the market and the manager graduated from a top-20 MBA program, are related, a subject we tackle next.

6-2d Independence

One of the objectives of calculating conditional probability is to determine whether two events are related. In particular, we would like to know whether they are **independent events**.

Independent Events

Two events A and B are said to be independent if

$$P(A|B) = P(A)$$

or

$$P(B|A) = P(B)$$

Put another way, two events are independent if the probability of one event is not affected by the occurrence of the other event.

EXAMPLE 6.3

Determinants of Success among Mutual Fund Managers—Part 3

Determine whether the event that the manager graduated from a top-20 MBA program and the event the fund outperforms the market are independent events.

SOLUTION:

We wish to determine whether A_1 and B_1 are independent. To do so, we must calculate the probability of A_1 given B_1 ; that is,

$$P(A_1|B_1) = \frac{P(A_1 \text{ and } B_1)}{P(B_1)} = \frac{.11}{.17} = .647$$

The marginal probability that a manager graduated from a top-20 MBA program is

$$P(A_1) = .40$$

Since the two probabilities are not equal, we conclude that the two events are dependent.

Incidentally, we could have made the decision by calculating $P(B_1|A_1) = .275$ and observing that it is not equal to $P(B_1) = .17$.

Note that there are three other combinations of events in this problem. They are $(A_1 \text{ and } B_2)$, $(A_2 \text{ and } B_1)$, $(A_2 \text{ and } B_2)$ [ignoring mutually exclusive combinations $(A_1 \text{ and } A_2)$ and $(B_1 \text{ and } B_2)$, which are dependent]. In each combination, the two events are dependent. In this type of problem, where there are only four combinations, if one

combination is dependent, then all four will be dependent. Similarly, if one combination is independent, then all four will be independent. This rule does not apply to any other situation.

6-2e Union

Another event that is the combination of other events is the *union*.

Union of Events A and B

The **union** of events A and B is the event that occurs when either A or B or both occur. It is denoted as

$$A \text{ or } B$$

EXAMPLE 6.4

Determinants of Success among Mutual Fund Managers—Part 4

Determine the probability that a randomly selected fund outperforms the market or the manager graduated from a top-20 MBA program.

SOLUTION:

We want to compute the probability of the union of two events

$$P(A_1 \text{ or } B_1)$$

The union A_1 or B_1 consists of three events; That is, the union occurs whenever any of the following joint events occurs:

1. Fund outperforms the market and the manager graduated from a top-20 MBA program
2. Fund outperforms the market and the manager did not graduate from a top-20 MBA program
3. Fund does not outperform the market and the manager graduated from a top-20 MBA program

Their probabilities are

$$P(A_1 \text{ and } B_1) = .11$$

$$P(A_2 \text{ and } B_1) = .06$$

$$P(A_1 \text{ and } B_2) = .29$$

Thus, the probability of the union—the fund outperforms the market or the manager graduated from a top-20 MBA program—is the sum of the three probabilities; That is,

$$P(A_1 \text{ or } B_1) = P(A_1 \text{ and } B_1) + P(A_2 \text{ and } B_1) + P(A_1 \text{ and } B_2) = .11 + .06 + .29 = .46$$

Notice that there is another way to produce this probability. Of the four probabilities in Table 6.1, the only one representing an event that is not part of the union is the

probability of the event the fund does not outperform the market and the manager did not graduate from a top-20 MBA program. That probability is

$$P(A_2 \text{ and } B_2) = .54$$

which is the probability that the union *does not* occur. Thus, the probability of the union is

$$P(A_1 \text{ or } B_1) = 1 - P(A_2 \text{ and } B_2) = 1 - .54 = .46.$$

Thus, we determined that 46% of mutual funds either outperform the market or are managed by a top-20 MBA program graduate or have both characteristics.



EXERCISES

- 6.16** Given the following table of joint probabilities, calculate the marginal probabilities.

	A_1	A_2	A_3
B_1	.1	.3	.2
B_2	.2	.1	.1

- 6.17** Calculate the marginal probabilities from the following table of joint probabilities.

	A_1	A_2
B_1	.4	.3
B_2	.2	.1

- 6.18** Refer to Exercise 6.17.

- Determine $P(A_1|B_1)$.
- Determine $P(A_2|B_1)$.
- Did your answers to parts (a) and (b) sum to 1? Is this a coincidence? Explain.

- 6.19** Refer to Exercise 6.17. Calculate the following probabilities.

- $P(A_1|B_2)$
- $P(B_2|A_1)$
- Did you expect the answers to parts (a) and (b) to be reciprocals? In other words, did you expect that $P(A_1|B_2) = 1/P(B_2|A_1)$? Why is this impossible (unless both probabilities are 1)?

- 6.20** Are the events in Exercise 6.17 independent? Explain.

- 6.21** Refer to Exercise 6.17. Compute the following.

- $P(A_1 \text{ or } B_1)$
- $P(A_1 \text{ or } B_2)$
- $P(A_1 \text{ or } A_2)$

- 6.22** Suppose that you have been given the following joint probabilities. Are the events independent? Explain.

	A_1	A_2
B_1	.20	.60
B_2	.05	.15

- 6.23** Determine whether the events are independent from the following joint probabilities.

	A_1	A_2
B_1	.20	.15
B_2	.60	.05

- 6.24** Suppose we have the following joint probabilities.

	A_1	A_2	A_3
B_1	.15	.20	.10
B_2	.25	.25	.05

Compute the marginal probabilities.

- 6.25** Refer to Exercise 6.24.

- Compute $P(A_2|B_2)$.
- Compute $P(B_2|A_2)$.
- Compute $P(B_1|A_2)$.

- 6.26** Refer to Exercise 6.24.

- Compute $P(A_1 \text{ or } A_2)$.
- Compute $P(A_2 \text{ or } B_2)$.
- Compute $P(A_3 \text{ or } B_1)$.

- 6.27** Discrimination in the workplace is illegal, and companies that discriminate are often sued. The female instructors at a large university recently lodged a complaint about the most recent round of promotions from assistant professor to associate professor. An analysis of the relationship between gender and promotion produced the following joint probabilities.

	Promoted	Not Promoted
Female	.03	.12
Male	.17	.68

- a. What is the rate of promotion among female assistant professors?
 b. What is the rate of promotion among male assistant professors?
 c. Is it reasonable to accuse the university of gender bias?
- 6.28** A department store analyzed its most recent sales and determined the relationship between the way the customer paid for the item and the price category of the item. The joint probabilities in the following table were calculated.

	Cash	Credit Card	Debit Card
Less than \$20	.09	.03	.04
\$20–\$100	.05	.21	.18
More than \$100	.03	.23	.14

- a. What proportion of purchases was paid by debit card?
 b. Find the probability that a credit card purchase was more than \$100.
 c. Determine the proportion of purchases made by credit card or by debit card.
- 6.29** The following table lists the probabilities of unemployed females and males and their educational attainment.

	Female	Male
Less than high school	.057	.104
High school graduate	.136	.224
Some college/university—no degree	.132	.150
College/university graduate	.095	.103

Source: *Statistical Abstract of the United States*, 2012, Table 627.

- a. If one unemployed person is selected at random, what is the probability that he or she did not finish high school?
 b. If an unemployed female is selected at random, what is the probability that she has a college or university degree?
 c. If an unemployed high school graduate is selected at random, what is the probability that he is a male?
- 6.30** The costs of medical care in North America are increasing faster than inflation, and with the baby boom generation soon to need health care, it becomes imperative that countries find ways to reduce both costs and demand. The following table lists the joint probabilities associated with smoking and lung disease among 60- to 65-year-old men.

	He is a smoker	He is a nonsmoker
He has lung disease	.12	.03
He does not have lung disease	.19	.66

One 60- to 65-year-old man is selected at random. What is the probability of the following events?
 a. He is a smoker.
 b. He does not have lung disease.
 c. He has lung disease given that he is a smoker.
 d. He has lung disease given that he does not smoke.

- 6.31** Refer to Exercise 6.30. Are smoking and lung disease among 60- to 65-year-old men related?
- 6.32** The method of instruction in college and university applied statistics courses is changing. Historically, most courses were taught with an emphasis on manual calculation. The alternative is to employ a computer and a software package to perform the calculations. An analysis of applied statistics courses investigated whether the instructor's educational background is primarily mathematics (or statistics) or some other field. The result of this analysis is the accompanying table of joint probabilities.

Statistics Course Emphasizes Manual Calculations	Statistics Course Employs Computer and Software
Mathematics or statistics education	.23 .36
Other education	.11 .30

- a. What is the probability that a randomly selected applied statistics course instructor whose education was in statistics emphasizes manual calculations?
 b. What proportion of applied statistics courses employ a computer and software?
 c. Are the educational background of the instructor and the way his or her course is taught independent?

- 6.33** A restaurant chain routinely surveys its customers. Among other questions, the survey asks each customer whether he or she would return and to rate the quality of food. Summarizing hundreds of thousands of questionnaires produced this table of joint probabilities.

Customer Will Return Rating	Customer Will Not Return
Poor	.02 .10
Fair	.08 .09
Good	.35 .14
Excellent	.20 .02

- a. What proportion of customers say that they will return and rate the restaurant's food as good?
 b. What proportion of customers who say that they will return rate the restaurant's food as good?
 c. What proportion of customers who rate the restaurant's food as good say that they will return?
 d. Discuss the differences in your answers to parts (a), (b), and (c).

- 6.34** To determine whether drinking alcoholic beverages has an effect on the bacteria that cause ulcers, researchers developed the following table of joint probabilities.

Number of Alcoholic Drinks per Day	Ulcer	No Ulcer
None	.01	.22
One	.03	.19
Two	.03	.32
More than two	.04	.16

- a. What proportion of people have ulcers?
- b. What is the probability that a teetotaler (no alcoholic beverages) develops an ulcer?
- c. What is the probability that someone who has an ulcer does not drink alcohol?
- d. What is the probability that someone who has an ulcer drinks alcohol?

- 6.35** An analysis of fired or laid-off workers, their age, and the reasons for their departure produced the following table of joint probabilities.

Reason for job loss	Age Category			
	20–24	25–54	55–64	65 and older
Plant or company closed or moved	.015	.320	.089	.029
Insufficient work	.014	.180	.034	.011
Position or shift abolished	.006	.214	.071	.016

Source: *Statistical Abstract of the United States*, 2009, Table 593.

- a. What is the probability that a 25- to 54-year-old employee was laid off or fired because of insufficient work?
- b. What proportion of laid-off or fired workers is age 65 and older?
- c. What is the probability that a laid-off or fired worker because the plant or company closed is 65 or older?

- 6.36** Many critics of television claim that there is too much violence and that it has a negative effect on society. There may also be a negative effect on advertisers. To examine this issue, researchers developed two versions of a cops-and-robbers made-for-television movie. One version depicted several violent crimes, and the other removed these scenes. In the middle of the movie, one 60-second commercial was shown advertising a new product and brand name. At the end of the movie, viewers were asked to name the brand. After observing the results, the researchers produced the following table of joint probabilities.

	Watch Violent Movie	Watch Nonviolent Movie
Remember the brand name	.15	.18
Do not remember the brand name	.35	.32

- a. What proportion of viewers remember the brand name?
- b. What proportion of viewers who watch the violent movie remember the brand name?
- c. Does watching a violent movie affect whether the viewer will remember the brand name? Explain.

- 6.37** Is there a relationship between the male hormone testosterone and criminal behavior? To answer this question, medical researchers measured the testosterone level of penitentiary inmates and recorded whether they were convicted of murder. After analyzing the results, the researchers produced the following table of joint probabilities.

Testosterone Level	Murderer	Other Felon
Above average	.27	.24
Below average	.21	.28

- a. What proportion of murderers have above-average testosterone levels?
- b. Are levels of testosterone and the crime committed independent? Explain.

- 6.38** The issue of health care coverage in the United States is becoming a critical issue in American politics. A large-scale study was undertaken to determine who is and is not covered. From this study, the following table of joint probabilities was produced.

Age Category	Has Health Insurance	Does Not Have Health Insurance
25–34	.167	.085
35–44	.209	.061
45–54	.225	.049
55–64	.177	.026

Source: U.S. Department of Health and Human Services.

If one person is selected at random, find the following probabilities.

- a. $P(\text{Person has health insurance})$
- b. $P(\text{Person } 55\text{--}64 \text{ has no health insurance})$
- c. $P(\text{Person without health insurance is between } 25 \text{ and } 34 \text{ years old})$

- 6.39** Violent crime in many American schools is an unfortunate fact of life. An analysis of schools and violent crime yielded the table of joint probabilities shown next.

Level	Violent Crime Committed This Year	No Violent Crime Committed
Primary	.393	.191
Middle	.176	.010
High School	.134	.007
Combined	.074	.015

Source: *Statistical Abstract of the United States*, 2009, Table 237.

If one school is randomly selected find the following probabilities.

- a. Probability of at least one incident of violent crime during the year in a primary school
- b. Probability of no violent crime during the year

- 6.40 Refer to Exercise 6.39. A similar analysis produced these joint probabilities.

Enrollment	Violent Crime Committed This Year	No Violent Crime Committed
Less than 300	.159	.091
300 to 499	.221	.065
500 to 999	.289	.063
1,000 or more	.108	.004

Source: *Statistical Abstract of the United States*, 2009, Table 237.

- a. What is the probability that a school with an enrollment of less than 300 had at least one violent crime during the year?
- b. What is the probability that a school that has at least one violent crime had an enrollment of less than 300?

- 6.41 A firm has classified its customers in two ways: (1) according to whether the account is overdue and (2) whether the account is new (less than 12 months) or old. An analysis of the firm's records provided the input for the following table of joint probabilities.

	Overdue	Not Overdue
New	.06	.13
Old	.52	.29

One account is randomly selected.

- a. If the account is overdue, what is the probability that it is new?
- b. If the account is new, what is the probability that it is overdue?
- c. Is the age of the account related to whether it is overdue? Explain.

- 6.42 How are the size of a firm (measured in terms of the number of employees) and the type of firm related? To help answer the question, an analyst referred to the U.S. Census and developed the following table of joint probabilities.

Number of Employees	Industry		
	Construction	Manufacturing	Retail
Fewer than 20	.464	.147	.237
20 to 99	.039	.049	.035
100 or more	.005	.019	.005

Source: *Statistical Abstract of the United States*, 2009, Table 737.

If one firm is selected at random, find the probability of the following events.

- a. The firm employs fewer than 20 employees.
- b. The firm is in the retail industry.
- c. A firm in the construction industry employs between 20 and 99 workers.

- 6.43 Credit scorecards are used by financial institutions to help decide to whom loans should be granted. An analysis of the records of one bank produced the following probabilities.

Loan Performance	Score	
	Under 400	400 or More
Fully repaid	.19	.64
Defaulted	.13	.04

- a. What proportion of loans are fully repaid?
- b. What proportion of loans given to scorers of less than 400 fully repay?
- c. What proportion of loans given to scorers of 400 or more fully repay?
- d. Are score and whether the loan is fully repaid independent? Explain.

- 6.44 A retail outlet wanted to know whether its weekly advertisement in the daily newspaper works. To acquire this critical information, the store manager surveyed the people who entered the store and determined whether each individual saw the ad and whether a purchase was made. From the information developed, the manager produced the following table of joint probabilities. Are the ads effective? Explain.

	Purchase	No Purchase
See ad	.18	.42
Do not see ad	.12	.28

- 6.45 To gauge the relationship between education and unemployment, an economist turned to the U.S. Census from which the following table of joint probabilities was produced:

Education	Employed	Unemployed
Not a high school graduate	.075	.015
High school graduate	.257	.035

(Continued)

Some college, no degree	.155	.016
Associate's degree	.096	.008
Bachelor's degree	.211	.012
Advanced degree	.118	.004

Source: *Statistical Abstract of the United States*, 2012, Table 221.

- What is the probability that a high school graduate is unemployed?
- Determine the probability that a randomly selected individual is employed.
- Find the probability that an unemployed person possesses an advanced degree.
- What is the probability that a randomly selected person did not finish high school?

- 6.46 The decision about where to build a new plant is a major one for most companies. One of the factors that is often considered is the education level of the location's residents. Census information may be useful in this regard. After analyzing a recent census, a company produced the following joint probabilities:

Education	Region			
	Northeast	Midwest	South	West
Not a high school graduate	.021	.022	.053	.032
High school graduate	.062	.075	.118	.058
Some college, no degree	.024	.038	.062	.044
Associate's degree	.015	.022	.032	.022
Bachelor's degree	.038	.040	.067	.050
Advanced degree	.024	.021	.036	.025

Source: *Statistical Abstract of the United States*, 2012, Table 231.

- Determine the probability that a person living in the West has a bachelor's degree.
- Find the probability that a high school graduate lives in the Northeast.
- What is the probability that a person selected at random lives in the South?
- What is the probability that a person selected at random does not live in the South?

6-3 PROBABILITY RULES AND TREES

In Section 6-2, we introduced intersection and union and described how to determine the probability of the intersection and the union of two events. In this section, we present other methods of determining these probabilities. We introduce three rules that enable us to calculate the probability of more complex events from the probability of simpler events.

6-3a Complement Rule

The **complement** of event A is the event that occurs when event A does not occur. The complement of event A is denoted by A^C . The **complement rule** defined here derives from the fact that the probability of an event and the probability of the event's complement must sum to 1.

Complement Rule

$$P(A^C) = 1 - P(A)$$

for any event A .

We will demonstrate the use of this rule after we introduce the next rule.

6-3b Multiplication Rule

The **multiplication rule** is used to calculate the joint probability of two events. It is based on the formula for conditional probability supplied in the previous section; that is, from the following formula

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)}$$

we derive the multiplication rule simply by multiplying both sides by $P(B)$.

Multiplication Rule

The joint probability of any two events A and B is

$$P(A \text{ and } B) = P(B)P(A|B)$$

or, altering the notation,

$$P(A \text{ and } B) = P(A)P(B|A)$$

If A and B are independent events, $P(A|B) = P(A)$ and $P(B|A) = P(B)$. It follows that the joint probability of two independent events is simply the product of the probabilities of the two events. We can express this as a special form of the multiplication rule.

Multiplication Rule for Independent Events

The joint probability of any two independent events A and B is

$$P(A \text{ and } B) = P(A)P(B)$$

EXAMPLE 6.5*

Selecting Two Students without Replacement

A graduate statistics course has seven male and three female students. The professor wants to select two students at random to help her conduct a research project. What is the probability that the two students chosen are female?

SOLUTION:

Let A represent the event that the first student chosen is female and B represent the event that the second student chosen is also female. We want the joint probability $P(A \text{ and } B)$. Consequently, we apply the multiplication rule:

$$P(A \text{ and } B) = P(A)P(B|A)$$

Because there are 3 female students in a class of 10, the probability that the first student chosen is female is

$$P(A) = 3/10$$

*This example can be solved using the Hypergeometric distribution, which is described in the Keller's website Appendix Hypergeometric Distribution.

After the first student is chosen, there are only nine students left. Given that the first student chosen was female, there are only two female students left. It follows that

$$P(B|A) = 2/9$$

Thus, the joint probability is

$$P(A \text{ and } B) = P(A)P(B|A) = \left(\frac{3}{10}\right)\left(\frac{2}{9}\right) = \frac{6}{90} = .067$$

EXAMPLE 6.6

Selecting Two Students with Replacement

Refer to Example 6.5. The professor who teaches the course is suffering from the flu and will be unavailable for two classes. The professor's replacement will teach the next two classes. His style is to select one student at random and pick on him or her to answer questions during that class. What is the probability that the two students chosen are female?

SOLUTION:

The form of the question is the same as in Example 6.5: We wish to compute the probability of choosing two female students. However, the experiment is slightly different. It is now possible to choose the *same* student in each of the two classes taught by the replacement. Thus, A and B are independent events, and we apply the multiplication rule for independent events:

$$P(A \text{ and } B) = P(A)P(B)$$

The probability of choosing a female student in each of the two classes is the same; that is,

$$P(A) = 3/10 \text{ and } P(B) = 3/10$$

Hence,

$$P(A \text{ and } B) = P(A)P(B) = \left(\frac{3}{10}\right)\left(\frac{3}{10}\right) = \frac{9}{100} = .09$$

6-3c Addition Rule

The **addition rule** enables us to calculate the probability of the union of two events.

Addition Rule

The probability that event A , or event B , or both occur is

$$P(A \text{ or } B) = P(A) + P(B) - P(A \text{ and } B)$$

If you're like most students, you're wondering why we subtract the joint probability from the sum of the probabilities of A and B . To understand why this is necessary, examine Table 6.2 (page 180), which we have reproduced here as Table 6.3.

TABLE 6.3 Joint and Marginal Probabilities

	B₁	B₂	TOTALS
<i>A₁</i>	$P(A_1 \text{ and } B_1) = .11$	$P(A_1 \text{ and } B_2) = .29$	$P(A_1) = .40$
<i>A₂</i>	$P(A_2 \text{ and } B_1) = .06$	$P(A_2 \text{ and } B_2) = .54$	$P(A_2) = .60$
Totals	$P(B_1) = .17$	$P(B_2) = .83$	1.00

This table summarizes how the marginal probabilities were computed. For example, the marginal probability of A_1 and the marginal probability of B_1 were calculated as

$$\begin{aligned} P(A_1) &= P(A_1 \text{ and } B_1) + P(A_1 \text{ and } B_2) = .11 + .29 = .40 \\ P(B_1) &= P(A_1 \text{ and } B_1) + P(A_2 \text{ and } B_1) = .11 + .06 = .17 \end{aligned}$$

If we now attempt to calculate the probability of the union of A_1 and B_1 by summing their probabilities, we find

$$P(A_1) + P(B_1) = .11 + .29 + .11 + .06$$

Notice that we added the joint probability of A_1 and B_1 (which is .11) twice. To correct the double counting, we subtract the joint probability from the sum of the probabilities of A_1 and B_1 . Thus,

$$\begin{aligned} P(A_1 \text{ or } B_1) &= P(A_1) + P(B_1) - P(A_1 \text{ and } B_1) \\ &= [.11 + .29] + [.11 + .06] - .11 \\ &= .40 + .17 - .11 = .46 \end{aligned}$$

This is the probability of the union of A_1 and B_1 , which we calculated in Example 6.4 (page 183).

As was the case with the multiplication rule, there is a special form of the addition rule. When two events are mutually exclusive (which means that the two events cannot occur together), their joint probability is 0.

Addition Rule for Mutually Exclusive Events

The probability of the union of two mutually exclusive events A and B is

$$P(A \text{ or } B) = P(A) + P(B)$$

EXAMPLE 6.7

Applying the Addition Rule

In a large city, two newspapers are published, the *Sun* and the *Post*. The circulation departments report that 22% of the city's households have a subscription to the *Sun* and 35% subscribe to the *Post*. A survey reveals that 6% of all households subscribe to both newspapers. What proportion of the city's households subscribe to either newspaper?

SOLUTION:

We can express this question as, what is the probability of selecting a household at random that subscribes to the *Sun*, the *Post*, or both? Another way of asking the question is, what is the probability that a randomly selected household subscribes to *at least one* of the newspapers? It is now clear that we seek the probability of the union, and we must apply the addition rule. Let A = household subscribes to the *Sun* and B = the household subscribes to the *Post*. We perform the following calculation:

$$P(A \text{ or } B) = P(A) + P(B) - P(A \text{ and } B) = .22 + .35 - .06 = .51$$

The probability that a randomly selected household subscribes to either newspaper is .51. Expressed as relative frequency, 51% of the city's households subscribe to either newspaper.

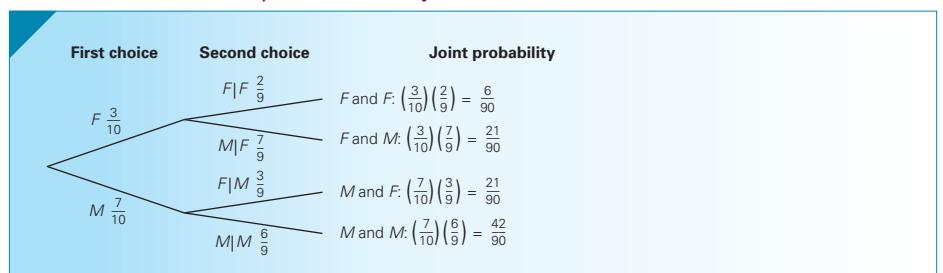
6-3d Probability Trees

An effective and simpler method of applying the probability rules is the probability tree, wherein the events in an experiment are represented by lines. The resulting figure resembles a tree, hence the name. We will illustrate the probability tree with several examples, including two that we addressed using the probability rules alone.

In Example 6.5, we wanted to find the probability of choosing two female students, where the two choices had to be different. The tree diagram in Figure 6.1 describes this experiment. Notice that the first two branches represent the two possibilities, female and male students, on the first choice. The second set of branches represents the two possibilities on the second choice. The probabilities of female and male student chosen first are $3/10$ and $7/10$, respectively. The probabilities for the second set of branches are conditional probabilities based on the choice of the first student selected.

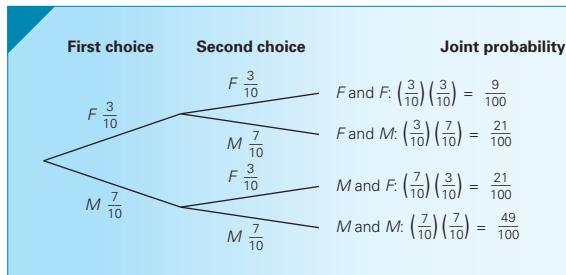
We calculate the joint probabilities by multiplying the probabilities on the linked branches. Thus, the probability of choosing two female students is $P(F \text{ and } F) = (3/10)(2/9) = 6/90$. The remaining joint probabilities are computed similarly.

FIGURE 6.1 Probability Tree for Example 6.5



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In Example 6.6, the experiment was similar to that of Example 6.5. However, the student selected on the first choice was returned to the pool of students and was eligible to be chosen again. Thus, the probabilities on the second set of branches remain the same as the probabilities on the first set, and the probability tree is drawn with these changes, as shown in Figure 6.2.

FIGURE 6.2 Probability Tree for Example 6.6

The advantage of a probability tree on this type of problem is that it restrains its users from making the wrong calculation. Once the tree is drawn and the probabilities of the branches inserted, virtually the only allowable calculation is the multiplication of the probabilities of linked branches. An easy check on those calculations is available. The joint probabilities at the ends of the branches must sum to 1 because all possible events are listed. In both figures, notice that the joint probabilities do indeed sum to 1.

The special form of the addition rule for mutually exclusive events can be applied to the joint probabilities. In both probability trees, we can compute the probability that one student chosen is female and one is male simply by adding the joint probabilities. For the tree in Example 6.5, we have

$$P(F \text{ and } M) + P(M \text{ and } F) = 21/90 + 21/90 = 42/90$$

In the probability tree in Example 6.6, we find

$$P(F \text{ and } M) + P(M \text{ and } F) = 21/100 + 21/100 = 42/100$$

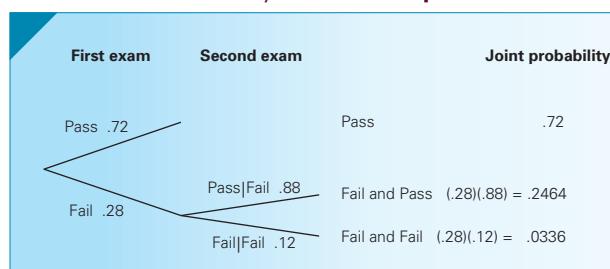
EXAMPLE 6.8

Probability of Passing the Bar Exam

Students who graduate from law schools must still pass a bar exam before becoming lawyers. Suppose that in a particular jurisdiction the pass rate for first-time test takers is 72%. Candidates who fail the first exam may take it again several months later. Of those who fail their first test, 88% pass their second attempt. Find the probability that a randomly selected law school graduate becomes a lawyer. Assume that candidates cannot take the exam more than twice.

SOLUTION:

The probability tree in Figure 6.3 is employed to describe the experiment. Note that we use the complement rule to determine the probability of failing each exam.

FIGURE 6.3 Probability Tree for Example 6.8

We apply the multiplication rule to calculate $P(\text{Fail and Pass})$, which we find to be .2464. We then apply the addition rule for mutually exclusive events to find the probability of passing the first or second exam:

$$\begin{aligned} P(\text{Pass [on first exam]}) + P(\text{Fail [on first exam] and Pass [on second exam]}) \\ = .72 + .2464 = .9664 \end{aligned}$$

Thus, 96.64% of applicants become lawyers by passing the first or second exam.



EXERCISES

- 6.47** Given the following probabilities, compute all joint probabilities.

$$P(A) = .9$$

$$P(B|A) = .4$$

$$P(A^C) = .1$$

$$P(B|A^C) = .7$$

- 6.48** Determine all joint probabilities from the following.

$$P(A) = .8$$

$$P(B|A) = .4$$

$$P(A^C) = .2$$

$$P(B|A^C) = .7$$

- 6.49** Draw a probability tree to compute the joint probabilities from the following probabilities.

$$P(A) = .5$$

$$P(B|A) = .4$$

$$P(A^C) = .2$$

$$P(B|A^C) = .7$$

- 6.50** Given the following probabilities, draw a probability tree to compute the joint probabilities.

$$P(A) = .8$$

$$P(B|A) = .3$$

$$P(A^C) = .2$$

$$P(B|A^C) = .3$$

- 6.51** Given the following probabilities, find the joint probability $P(A \text{ and } B)$.

$$P(A) = .7$$

$$P(B|A) = .3$$

- 6.52** Approximately 10% of people are left-handed. If two people are selected at random, what is the probability of the following events?

- Both are right-handed.
- Both are left-handed.
- One is right-handed and the other is left-handed.
- At least one is right-handed.

- 6.53** Refer to Exercise 6.52. Suppose that three people are selected at random.

- Draw a probability tree to depict the experiment.
- If we use the notation RRR to describe the selection of three right-handed people, what are the descriptions of the remaining seven events? (Use L for left-hander.)
- How many of the events yield no right-handers, one right-hander, two right-handers, and three right-handers?

- d. Find the probability of no right-handers, one right-hander, two right-handers, and three right-handers.

- 6.54** Suppose there are 100 students in your accounting class, 10 of whom are left-handed. Two students are selected at random.

- Draw a probability tree and insert the probabilities for each branch.

What is the probability of the following events?

- Both are right-handed.
- Both are left-handed.
- One is right-handed and the other is left-handed.
- At least one is right-handed

- 6.55** Refer to Exercise 6.54. Suppose that three people are selected at random.

- Draw a probability tree and insert the probabilities of each branch.
- What is the probability of no right-handers, one right-hander, two right-handers, and three right-handers?

- 6.56** An aerospace company has submitted bids on two separate federal government defense contracts. The company president believes that there is a 40% probability of winning the first contract. If they win the first contract, the probability of winning the second is 70%. However, if they lose the first contract, the president thinks that the probability of winning the second contract decreases to 50%.

- What is the probability that they win both contracts?
- What is the probability that they lose both contracts?
- What is the probability that they win only one contract?

- 6.57** A telemarketer calls people and tries to sell them a subscription to a daily newspaper. On 20% of her calls, there is no answer or the line is busy. She sells subscriptions to 5% of the remaining calls. For what proportion of calls does she make a sale?

- 6.58** A foreman for an injection-molding firm admits that on 10% of his shifts, he forgets to shut off the injection machine on his line. This causes the machine to overheat, increasing the probability from 2% to 20% that a defective molding will be produced during the early morning run. What proportion of moldings from the early morning run is defective?

- 6.59** A study undertaken by the Miami-Dade Supervisor of Elections in 2002 revealed that 44% of registered voters are Democrats, 37% are Republicans, and 19% are others. If two registered voters are selected at random, what is the probability that both of them have the same party affiliation?

Source: Miami Herald, April 11, 2002.

- 6.60** In early 2001, the U.S. Census Bureau started releasing the results of the 2000 census. Among many other pieces of information, the bureau recorded the race or ethnicity of the residents of every county in every state. From these results, the bureau calculated a “diversity index” that measures the probability that two people chosen at random are of different races or ethnicities. Suppose that the census determined that in a county in Wisconsin 80% of its residents are white, 15% are black, and 5% are Asian. Calculate the diversity index for this county.

- 6.61** A survey of middle-aged men reveals that 28% of them are balding at the crown of their heads. Moreover, it is known that such men have an 18% probability of suffering a heart attack in the next 10 years. Men who are not balding in this way have an 11% probability of a heart attack. Find the probability that a middle-aged man will suffer a heart attack sometime in the next 10 years.

- 6.62** The chartered financial analyst (CFA) is a designation earned after a candidate has taken three annual exams (CFA I, II, and III). The exams are taken in early June. Candidates who pass an exam are eligible to take the exam for the next level in the following year. The pass rates for levels I, II, and III are .57, .73, and .85, respectively. Suppose that 3,000 candidates take the level I exam, 2,500 take the level II exam, and 2,000 take the level III exam. Suppose that one student is selected at random. What is the probability that he or she has passed the exam?

Source: Institute of Financial Analysts.

- 6.63** The Nickels restaurant chain regularly conducts surveys of its customers. Respondents are asked to assess food quality, service, and price. The responses are

Excellent Good Fair

Surveyed customers are also asked whether they would come back. After analyzing the responses, an expert in probability determined that 87% of customers say that they will return. Of those who so

indicate, 57% rate the restaurant as excellent, 36% rate it as good, and the remainder rate it as fair. Of those who say that they won’t return, the probabilities are 14%, 32%, and 54%, respectively. What proportion of customers rate the restaurant as good?

- 6.64** Researchers at the University of Pennsylvania School of Medicine have determined that children under 2 years old who sleep with the lights on have a 36% chance of becoming myopic before they are 16. Children who sleep in darkness have a 21% probability of becoming myopic. A survey indicates that 28% of children under 2 sleep with some light on. Find the probability that a child under 16 is myopic.

- 6.65** All printed circuit boards (PCBs) that are manufactured at a certain plant are inspected. An analysis of the company’s records indicates that 22% of all PCBs are flawed in some way. Of those that are flawed, 84% are repairable and the rest must be discarded. If a newly produced PCB is randomly selected, what is the probability that it does not have to be discarded?

- 6.66** A financial analyst has determined that there is a 22% probability that a mutual fund will outperform the market over a 1-year period provided that it outperformed the market the previous year. If only 15% of mutual funds outperform the market during any year, what is the probability that a mutual fund will outperform the market 2 years in a row?

- 6.67** An investor believes that on a day when the Dow Jones Industrial Average (DJIA) increases, the probability that the NASDAQ also increases is 77%. If the investor believes that there is a 60% probability that the DJIA will increase tomorrow, what is the probability that the NASDAQ will increase as well?

- 6.68** The controls of an airplane have several backup systems or redundancies so that if one fails the plane will continue to operate. Suppose that the mechanism that controls the flaps has two backups. If the probability that the main control fails is .0001 and the probability that each backup will fail is .01, what is the probability that all three fail to operate?

- 6.69** According to TNS Intersearch, 69% of wireless web users use it primarily for receiving and sending e-mail. Suppose that three wireless web users are selected at random. What is the probability that all of them use it primarily for e-mail?

- 6.70** A financial analyst estimates that the probability that the economy will experience a recession in the next 12 months is 25%. She also believes that if the economy encounters a recession, the probability that her mutual fund will increase in value is 20%. If there is no recession, the probability that the mutual fund will increase in value is 75%. Find the probability that the mutual fund’s value will increase.

6-4 / BAYES'S LAW

Conditional probability is often used to gauge the relationship between two events. In many of the examples and exercises you've already encountered, conditional probability measures the probability that an event occurs given that a possible cause of the event has occurred. In Example 6.2, we calculated the probability that a mutual fund outperforms the market (the effect) given that the fund manager graduated from a top-20 MBA program (the possible cause). There are situations, however, where we witness a particular event and we need to compute the probability of one of its possible causes. **Bayes's Law** is the technique we use.

EXAMPLE 6.9

Should an MBA Applicant Take a Preparatory Course?

The Graduate Management Admission Test (GMAT) is a requirement for all applicants of MBA programs. A variety of preparatory courses are designed to help applicants improve their GMAT scores, which range from 200 to 800. Suppose that a survey of MBA students reveals that among GMAT scorers above 650, 52% took a preparatory course; whereas among GMAT scorers of less than 650 only 23% took a preparatory course. An applicant to an MBA program has determined that he needs a score of more than 650 to get into a certain MBA program, but he feels that his probability of getting that high a score is quite low—10%. He is considering taking a preparatory course that costs \$500. He is willing to do so only if his probability of achieving 650 or more doubles. What should he do?

SOLUTION:

The easiest way to address this problem is to draw a tree diagram. The following notation will be used:

- A = GMAT score is 650 or more
- A^C = GMAT score less than 650
- B = Took preparatory course
- B^C = Did not take preparatory course

The probability of scoring 650 or more is

$$P(A) = .10$$

The complement rule gives us

$$P(A^C) = 1 - .10 = .90$$

Conditional probabilities are

$$P(B|A) = .52$$

and

$$P(B|A^C) = .23$$

Again using the complement rule, we find the following conditional probabilities:

$$P(B^C|A) = 1 - .52 = .48$$

and

$$P(B^C|A^C) = 1 - .23 = .77$$

We would like to determine the probability that he would achieve a GMAT score of 650 or more given that he took the preparatory course; that is, we need to compute

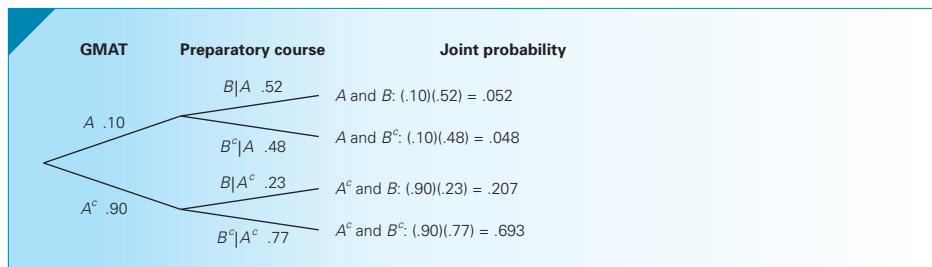
$$P(A|B)$$

Using the definition of conditional probability (page 181), we have

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)}$$

Neither the numerator nor the denominator is known. The probability tree (Figure 6.4) will provide us with the probabilities.

FIGURE 6.4 Probability Tree for Example 6.9



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As you can see,

$$P(A \text{ and } B) = (.10)(.52) = .052$$

$$P(A^c \text{ and } B) = (.90)(.23) = .207$$

and

$$P(B) = P(A \text{ and } B) + P(A^c \text{ and } B) = .052 + .207 = .259$$

Thus,

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)} = \frac{.052}{.259} = .201$$

The probability of scoring 650 or more on the GMAT doubles when the preparatory course is taken.

Thomas Bayes first employed the calculation of conditional probability as shown in Example 6.9 during the 18th century. Accordingly, it is called Bayes's Law.

The probabilities $P(A)$ and $P(A^c)$ are called **prior probabilities** because they are determined *prior* to the decision about taking the preparatory course. The conditional probabilities are called **likelihood probabilities** for reasons that are beyond the mathematics in this book. Finally, the conditional probability $P(A|B)$ and similar conditional probabilities $P(A^c|B)$, $P(A|B^c)$, and $P(A^c|B^c)$ are called **posterior probabilities** or **revised probabilities** because the prior probabilities are revised *after* the decision about taking the preparatory course.

You may be wondering why we did not get $P(A|B)$ directly. In other words, why not survey people who took the preparatory course and ask whether they received a score of 650 or more? The answer is that using the likelihood probabilities and using Bayes's Law allows individuals to set their own prior probabilities, which can then be revised.

For example, another MBA applicant may assess her probability of scoring 650 or more as .40. Inputting the new prior probabilities produces the following probabilities:

$$\begin{aligned} P(A \text{ and } B) &= (.40)(.52) = .208 \\ P(A^C \text{ and } B) &= (.60)(.23) = .138 \\ P(B) &= P(A \text{ and } B) + P(A^C \text{ and } B) = .208 + .138 = .346 \\ P(A|B) &= \frac{P(A \text{ and } B)}{P(B)} = \frac{.208}{.346} = .601 \end{aligned}$$

The probability of achieving a GMAT score of 650 or more increases by a more modest 50% (from .40 to .601).

6-4a Bayes's Law Formula (Optional)

Bayes's Law can be expressed as a formula for those who prefer an algebraic approach rather than a probability tree. We use the following notation.

The event B is the given event and the events

$$A_1, A_2, \dots, A_k$$

are the events for which prior probabilities are known; that is,

$$P(A_1), P(A_2), \dots, P(A_k)$$

are the prior probabilities.

The likelihood probabilities are

$$P(B|A_1), P(B|A_2), \dots, P(B|A_k)$$

and

$$P(A_1|B), P(A_2|B), \dots, P(A_k|B)$$

are the posterior probabilities, which represent the probabilities we seek.

Bayes's Law Formula

$$P(A_i|B) = \frac{P(A_i)P(B|A_i)}{P(A_1)P(B|A_1) + P(A_2)P(B|A_2) + \dots + P(A_k)P(B|A_k)}$$

To illustrate the use of the formula, we'll redo Example 6.9. We begin by defining the events.

A_1 = GMAT score is 650 or more

A_2 = GMAT score less than 650

B = Take preparatory course

The probabilities are

$$P(A_1) = .10$$

The complement rule gives us

$$P(A_2) = 1 - .10 = .90$$

Conditional probabilities are

$$P(B|A_1) = .52$$

and

$$P(B|A_2) = .23$$

Substituting the prior and likelihood probabilities into the Bayes's Law formula yields the following:

$$\begin{aligned} P(A_1|B) &= \frac{P(A_1)P(B|A_1)}{P(A_1)P(B|A_1) + P(A_2)P(B|A_2)} = \frac{(.10)(.52)}{(.10)(.52) + (.90)(.23)} \\ &= \frac{.052}{.052 + .207} = \frac{.052}{.259} = .201 \end{aligned}$$

As you can see, the calculation of the Bayes's Law formula produces the same results as the probability tree.

Auditing Tax Returns: Solution

We need to revise the prior probability that this return contains significant fraud. The tree shown in Figure 6.5 details the calculation.

F = Tax return is fraudulent

F^C = Tax return is honest

E_0 = Tax return contains no expense deductions

E_1 = Tax return contains one expense deduction

E_2 = tax return contains two expense deductions

$$P(E_1) = P(F \text{ and } E_1) + P(F^C \text{ and } E_1) = .0140 + .1710 = .1850$$

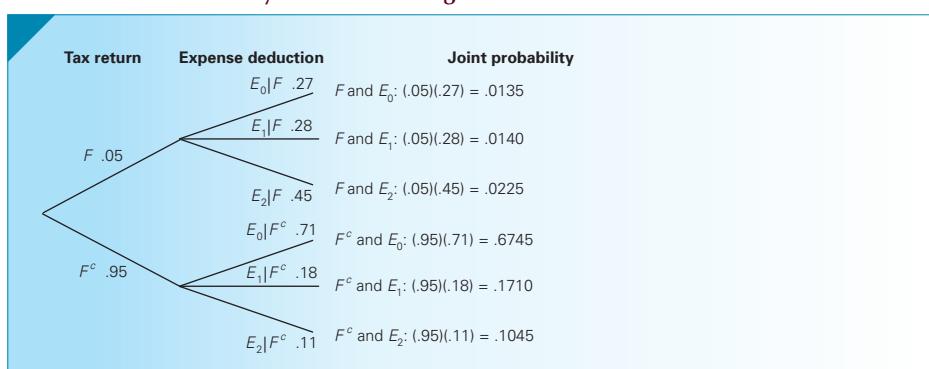
$$P(F|E_1) = P(F \text{ and } E_1)/P(E_1) = .0140/.1850 = .0757$$

The probability that this return is fraudulent is .0757.



Gary Buss/Faxi/Getty Images

FIGURE 6.5 Probability Tree for Auditing Tax Returns



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6-4b Applications in Medicine and Medical Insurance (Optional)

Physicians routinely perform medical tests, called *screenings*, on their patients. Screening tests are conducted for all patients in a particular age and gender group, regardless of their symptoms. For example, men in their 50s are advised to take a prostate-specific antigen (PSA) test to determine whether there is evidence of prostate cancer. Women undergo a Pap test for cervical cancer. Unfortunately, few of these tests are 100% accurate. Most can produce *false-positive* and *false-negative* results. A **false-positive** result is one in which the patient does not have the disease, but the test shows positive. A **false-negative** result is one in which the patient does have the disease, but the test produces a negative result. The consequences of each test are serious and costly. A false-negative test results in not detecting a disease in a patient, therefore postponing treatment, perhaps indefinitely. A false-positive test leads to apprehension and fear for the patient. In most cases, the patient is required to undergo further testing such as a biopsy. The unnecessary follow-up procedure can pose medical risks.

False-positive test results have financial repercussions. The cost of the follow-up procedure, for example, is usually far more expensive than the screening test. Medical insurance companies as well as government-funded plans are all adversely affected by false-positive test results. Compounding the problem is that physicians and patients are incapable of properly interpreting the results. A correct analysis can save both lives and money.

Bayes's Law is the vehicle we use to determine the true probabilities associated with screening tests. Applying the complement rule to the false-positive and false-negative rates produces the conditional probabilities that represent correct conclusions. Prior probabilities are usually derived by looking at the overall proportion of people with the diseases. In some cases, the prior probabilities may themselves have been revised because of heredity or demographic variables such as age or race. Bayes's Law allows us to revise the prior probability after the test result is positive or negative.

Example 6.10 is based on the actual false-positive and false-negative rates. Note however, that different sources provide somewhat different probabilities. The differences may be the result of the way positive and negative results are defined or the way technicians conduct the tests. Students who are affected by the diseases described in the example and exercises should seek clarification from their physicians.

EXAMPLE 6.10

Probability of Prostate Cancer

Prostate cancer is the most common form of cancer found in men. The probability of developing prostate cancer over a lifetime is 16%. (This figure may be higher since many prostate cancers go undetected.) Many physicians routinely perform a PSA test, particularly for men over age 50. PSA is a protein produced only by the prostate gland and thus is fairly easy to detect. Normally, men have PSA levels between 0 and 4 mg/ml. Readings above 4 may be considered high and potentially indicative of cancer. However, PSA levels tend to rise with age even among men who are cancer free. Studies have shown that the test is not very accurate. In fact, the probability of having an elevated PSA level given that the man does not have cancer (false positive) is .135. If the man does have cancer, the probability of a normal PSA level (false negative) is almost .300. (This figure may vary by age and by the definition of *high* PSA level.) If a physician concludes that the PSA is high, a biopsy is performed. Besides the concerns and health needs of the men, there are also financial costs. The cost of the blood test is low (approximately \$50). However, the cost of the biopsy is considerably higher (approximately \$1,000). A false-positive PSA

test will lead to an unnecessary biopsy. Because the PSA test is so inaccurate, some private and public medical plans do not pay for it. Suppose you are a manager in a medical insurance company and must decide on guidelines for whom should be routinely screened for prostate cancer. An analysis of prostate cancer incidence and age produces the following table of probabilities. (The probability of a man under 40 developing prostate cancer is less than .0001, or small enough to treat as 0.)

Age	Probability of Developing Prostate Cancer
40–49	.010
50–59	.022
60–69	.046
70 and older	.079

Assume that a man in each of the age categories undergoes a PSA test with a positive result. Calculate the probability that each man actually has prostate cancer and the probability that he does not. Perform a cost–benefit analysis to determine the cost per cancer detected.

SOLUTION:

As we did in Example 6.9 and the chapter-opening example, we'll draw a probability tree (Figure 6.6). The notation is

C = Has prostate cancer

C^C = Does not have prostate cancer

PT = Positive test result

NT = Negative test result

Starting with a man between 40 and 50 years old, we have the following probabilities

Prior

$$P(C) = .010$$

$$P(C^C) = 1 - .010 = .990$$

Likelihood probabilities

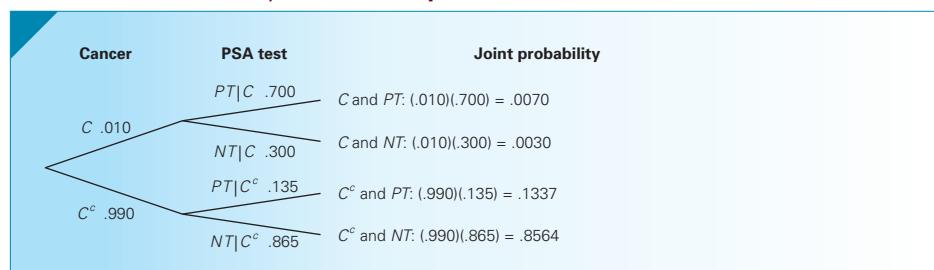
$$\text{False negative: } P(NT|C) = .300$$

$$\text{True positive: } P(PT|C) = 1 - .300 = .700$$

$$\text{False positive: } P(PT|C^C) = .135$$

$$\text{True negative: } P(NT|C^C) = 1 - .135 = .865$$

FIGURE 6.6 Probability Tree for Example 6.10



The tree allows you to determine the probability of obtaining a positive test result. It is

$$P(PT) = P(C \text{ and } PT) + P(C^C \text{ and } PT) = .0070 + .1337 = .1407$$

We can now compute the probability that the man has prostate cancer given a positive test result:

$$P(C|PT) = \frac{P(C \text{ and } PT)}{P(PT)} = \frac{.0070}{.1407} = .0498$$

The probability that he does not have prostate cancer is

$$P(C^C|PT) = 1 - P(C|PT) = 1 - .0498 = .9502$$

We can repeat the process for the other age categories. Here are the results.

Probabilities Given a Positive PSA Test		
Age	Has Prostate Cancer	Does Not Have Prostate Cancer
40–49	.0498	.9502
50–59	.1045	.8955
60–69	.2000	.8000
70 and older	.3078	.6922

The following table lists the proportion of each age category wherein the PSA test is positive [$P(PT)$]

Age	Proportion of Tests That Are Positive	Number of Biopsies Performed per Million	Number of Cancers Detected	Number of Biopsies per Cancer Detected
40–49	.1407	140,700	.0498(140,700) = 7,007	20.10
50–59	.1474	147,400	.1045(147,400) = 15,403	9.57
60–79	.1610	161,000	.2000(161,000) = 32,200	5.00
70 and older	.1796	179,600	.3078(179,600) = 55,281	3.25

If we assume a cost of \$1,000 per biopsy, the cost per cancer detected is \$20,100 for 40 to 50, \$9,570 for 50 to 60, \$5,000 for 60 to 70, and \$3,250 for over 70.

We have created an Excel spreadsheet to help you perform the calculations in Example 6.10. Open the **Excel Workbooks** folder and select **Medical screening**. There are three cells that you may alter. In cell B5, enter a new prior probability for prostate cancer. Its complement will be calculated in cell B15. In cells D6 and D15, type new values for the false-negative and false-positive rates, respectively. Excel will do the rest. We will use this spreadsheet to demonstrate some terminology standard in medical testing.

Terminology We will illustrate the terms using the probabilities calculated for the 40 to 50 age category.

The false-negative rate is .300. Its complement is the likelihood probability $P(PT|C)$, called the *sensitivity*. It is equal to $1 - .300 = .700$. Among men with prostate cancer, this is the proportion of men who will get a positive test result.

The complement of the false-positive rate (.135) is $P(NT|C^C)$, which is called the *specificity*. This likelihood probability is $1 - .135 = .865$.

The posterior probability that someone has prostate cancer given a positive test result [$P(C|PT) = .0498$] is called the *positive predictive value*. Using Bayes's Law, we can compute the other three posterior probabilities.

The probability that the patient does not have prostate cancer given a positive test result is

$$P(C^C|PT) = .9502$$

The probability that the patient has prostate cancer given a negative test result is

$$P(C|NT) = .0035$$

The probability that the patient does not have prostate cancer given a negative test result:

$$P(C^C|NT) = .9965$$

This revised probability is called the *negative predictive value*.

6-4c Developing an Understanding of Probability Concepts

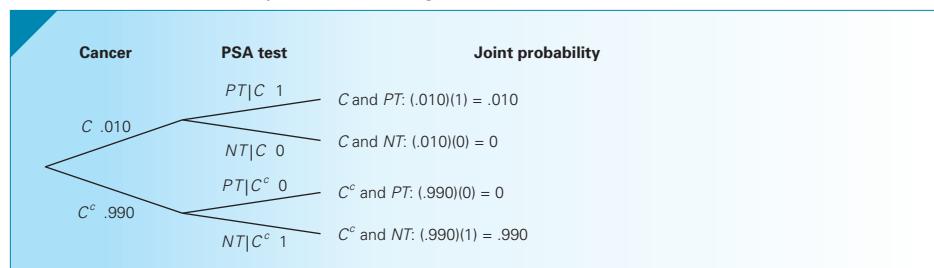
If you review the computations made previously, you'll realize that the prior probabilities are as important as the probabilities associated with the test results (the likelihood probabilities) in determining the posterior probabilities. The following table shows the prior probabilities and the revised probabilities.

Age	Prior Probabilities for Prostate Cancer	Posterior Probabilities Given a Positive PSA Test
40–49	.010	.0498
50–59	.022	.1045
60–69	.046	.2000
70 and older	.079	.3078

As you can see, if the prior probability is low, then unless the screening test is quite accurate, the revised probability will still be quite low.

To see the effects of different likelihood probabilities, suppose the PSA test is a perfect predictor. In other words, the false-positive and false-negative rates are 0. Figure 6.7 displays the probability tree.

FIGURE 6.7 Probability Tree for Example 6.10 with a Perfect Predictor Test



We find

$$P(PT) = P(C \text{ and } PT) + P(C^C \text{ and } PT) = .01 + 0 = .01$$

$$P(C|PT) = \frac{P(C \text{ and } PT)}{P(PT)} = \frac{.01}{.01} = 1.00$$

Now we calculate the probability of prostate cancer when the test is negative.

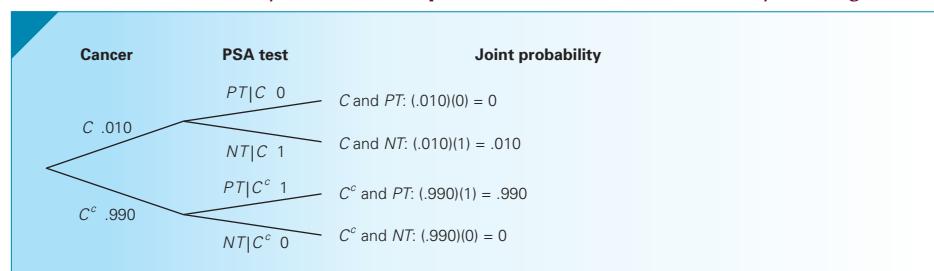
$$P(NT) = P(C \text{ and } NT) + P(C^c \text{ and } NT) = 0 + .99 = .99$$

$$P(C|NT) = \frac{P(C \text{ and } NT)}{P(NT)} = \frac{0}{.99} = 0$$

Thus, if the test is a perfect predictor and a man has a positive test, then as expected the probability that he has prostate cancer is 1.0. The probability that he does not have cancer when the test is negative is 0.

Now suppose that the test is always wrong; that is, the false-positive and false-negative rates are 100%. The probability tree is shown in Figure 6.8.

FIGURE 6.8 Probability Tree for Example 6.10 with a Test That Is Always Wrong



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$$P(PT) = P(C \text{ and } PT) + P(C^c \text{ and } PT) = 0 + .99 = .99$$

$$P(C|PT) = \frac{P(C \text{ and } PT)}{P(PT)} = \frac{0}{.99} = 0$$

and

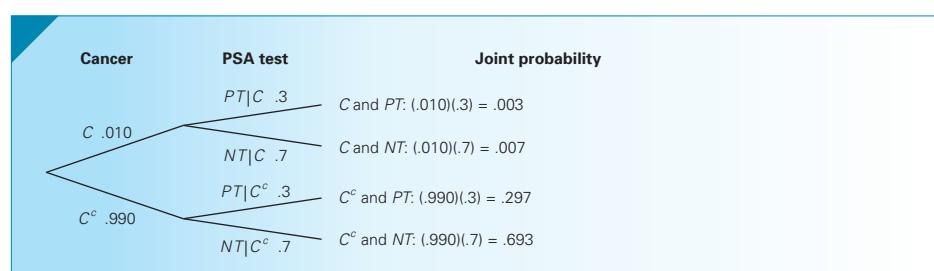
$$P(NT) = P(C \text{ and } NT) + P(C^c \text{ and } NT) = .01 + 0 = .01$$

$$P(C|NT) = \frac{P(C \text{ and } NT)}{P(NT)} = \frac{.01}{.01} = 1.00$$

Notice we have another perfect predictor except that it is reversed. The probability of prostate cancer given a positive test result is 0, but the probability becomes 1.00 when the test is negative.

Finally we consider the situation when the set of likelihood probabilities are the same. Figure 6.9 depicts the probability tree for a 40- to 50-year-old male and the probability of a positive test is (say) .3 and a the probability of a negative test is .7.

FIGURE 6.9 Probability Tree for Example 6.10 with Identical Likelihood Probabilities



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$$P(PT) = P(C \text{ and } PT) + P(C^C \text{ and } PT) = .003 + .297 = .300$$

$$P(C|PT) = \frac{P(C \text{ and } PT)}{P(PT)} = \frac{.003}{.300} = .01$$

and

$$P(NT) = P(C \text{ and } NT) + P(C^C \text{ and } NT) = .007 + .693 = .700$$

$$P(C|NT) = \frac{P(C \text{ and } NT)}{P(NT)} = \frac{.007}{.700} = .01$$

As you can see, the posterior and prior probabilities are the same. That is, the PSA test does not change the prior probabilities. Obviously, the test is useless.

We could have used any probability for the false-positive and false-negative rates, including .5. If we had used .5, then one way of performing this PSA test is to flip a fair coin. One side would be interpreted as positive and the other side as negative. It is clear that such a test has no predictive power.

The exercises and Case 6.4 offer the probabilities for several other screening tests.



EXERCISES

- 6.71** Refer to Exercise 6.47. Determine $P(A|B)$.
- 6.72** Refer to Exercise 6.48. Find the following.
- $P(A|B)$
 - $P(A^C|B)$
 - $P(A|B^C)$
 - $P(A^C|B^C)$
- 6.73** Refer to Example 6.9. An MBA applicant believes that the probability of scoring more than 650 on the GMAT without the preparatory course is .95. What is the probability of attaining that level after taking the preparatory course?
- 6.74** Refer to Exercise 6.58. The plant manager randomly selects a molding from the early morning run and discovers it is defective. What is the probability that the foreman forgot to shut off the machine the previous night?
- 6.75** The U.S. National Highway Traffic Safety Administration gathers data concerning the causes of highway crashes where at least one fatality has occurred. The following probabilities were determined from the 1998 annual study (BAC is blood-alcohol content).
- Source: Statistical Abstract of the United States, 2000, Table 1042.*
- $$P(BAC = 0 | \text{Crash with fatality}) = .616$$
- $$P(\text{BAC is between .01 and .09} | \text{Crash with fatality}) \\ = .300$$
- $$P(\text{BAC is greater than .09} | \text{Crash with fatality}) \\ = .084$$
- 6.76** Over a certain stretch of highway during a 1-year period, suppose the probability of being involved in a crash that results in at least one fatality is .01. It has been estimated that 12% of the drivers on this highway drive while their BAC is greater than .09. Determine the probability of a crash with at least one fatality if a driver drives while legally intoxicated (BAC greater than .09).
- 6.77** Refer to Exercise 6.62. A randomly selected candidate who took a CFA exam tells you that he has passed the exam. What is the probability that he took the CFA I exam?
- 6.78** Bad gums may mean a bad heart. Researchers discovered that 85% of people who have suffered a heart attack had periodontal disease, an inflammation of the gums. Only 29% of healthy people have this disease. Suppose that in a certain community heart attacks are quite rare, occurring with only 10% probability. If someone has periodontal disease, what is the probability that he or she will have a heart attack?
- 6.79** Refer to Exercise 6.77. If 40% of the people in a community will have a heart attack, what is the probability that a person with periodontal disease will have a heart attack?
- 6.80** Data from the Office on Smoking and Health, Centers for Disease Control and Prevention, indicate that 40% of adults who did not finish high school, 34% of high school graduates, 24% of adults

who completed some college, and 14% of college graduates smoke. Suppose that one individual is selected at random, and it is discovered that the individual smokes. What is the probability that the individual is a college graduate? Use the probabilities in Exercise 6.45 to calculate the probability that the individual is a college graduate.

- 6.80** Three airlines serve a small town in Ohio. Airline A has 50% of all the scheduled flights, airline B has 30%, and airline C has the remaining 20%. Their on-time rates are 80%, 65%, and 40%, respectively. A plane has just left on time. What is the probability that it was airline A?

- 6.81** Your favorite team is in the final playoffs. You have assigned a probability of 60% that it will win the championship. Past records indicate that when teams win the championship, they win the first game of the series 70% of the time. When they lose the series, they win the first game 25% of the time. The first game is over; your team has lost. What is the probability that it will win the series?

The following exercises are based on the Applications in Medical Screening and Medical Insurance subsection.

- 6.82** Transplant operations have become routine. One common transplant operation is for kidneys. The most dangerous aspect of the procedure is the possibility that the body may reject the new organ. Several new drugs are available for such circumstances, and the earlier the drug is administered, the higher the probability of averting rejection. The *New England Journal of Medicine* recently reported the development of a new urine test to detect early warning signs that the body is rejecting a transplanted kidney. However, like most other tests, the

new test is not perfect. When the test is conducted on someone whose kidney will be rejected, approximately one out of five tests will be negative (i.e., the test is wrong). When the test is conducted on a person whose kidney will not be rejected, 8% will show a positive test result (i.e., another incorrect result). Physicians know that in about 35% of kidney transplants the body tries to reject the organ. Suppose that the test was performed and the test is positive (indicating early warning of rejection). What is the probability that the body is attempting to reject the kidney?

- 6.83** The Rapid Test is used to determine whether someone has HIV (the virus that causes AIDS). The false-positive and false-negative rates are .027 and .080, respectively. A physician has just received the Rapid Test report that his patient tested positive. Before receiving the result, the physician assigned his patient to the low-risk group (defined on the basis of several variables) with only a 0.5% probability of having HIV. What is the probability that the patient actually has HIV?
- 6.84** What are the sensitivity, specificity, positive predictive value, and negative predictive value in the previous exercise?
- 6.85** The Pap smear is the standard test for cervical cancer. The false-positive rate is .636; the false-negative rate is .180. Family history and age are factors that must be considered when assigning a probability of cervical cancer. Suppose that, after obtaining a medical history, a physician determines that 2% of women of his patient's age and with similar family histories have cervical cancer. Determine the effects a positive and a negative Pap smear test have on the probability that the patient has cervical cancer.

6-5 / IDENTIFYING THE CORRECT METHOD

As we've previously pointed out, the emphasis in this book will be on identifying the correct statistical technique to use. In Chapters 2 and 4, we showed how to summarize data by first identifying the appropriate method to use. Although it is difficult to offer strict rules on which probability method to use, we can still provide some general guidelines.

In the examples and exercises in this text (and most other introductory statistics books), the key issue is whether joint probabilities are provided or are required.

6-5a Joint Probabilities Are Given

In Section 6-2, we addressed problems where the joint probabilities were given. In these problems, we can compute marginal probabilities by adding across rows and down columns. We can use the joint and marginal probabilities to compute conditional

probabilities, for which a formula is available. This allows us to determine whether the events described by the table are independent or dependent.

We can also apply the addition rule to compute the probability that either of two events occur.

6-5b Joint Probabilities Are Required

The previous section introduced three probability rules and probability trees. We need to apply some or all of these rules in circumstances where one or more joint probabilities are required. We apply the multiplication rule (either by formula or through a probability tree) to calculate the probability of intersections. In some problems, we're interested in adding these joint probabilities. We're actually applying the addition rule for mutually exclusive events here. We also frequently use the complement rule. In addition, we can also calculate new conditional probabilities using Bayes's Law.

CHAPTER SUMMARY

The first step in assigning probability is to create an **exhaustive** and **mutually exclusive** list of outcomes. The second step is to use the **classical**, **relative frequency**, or **subjective approach** and assign probability to the outcomes. A variety of methods are available to compute

the probability of other events. These methods include **probability rules** and **trees**.

An important application of these rules is **Bayes's Law**, which allows us to compute conditional probabilities from other forms of probability.

IMPORTANT TERMS:

Random experiment 173
 Exhaustive 173
 Mutually exclusive 173
 Sample space 174
 Classical approach 174
 Relative frequency approach 175
 Subjective approach 175
 Event 175
 Intersection 178
 Joint probability 178
 Marginal probability 180
 Conditional probability 180

Independent events 182
 Union 183
 Complement 188
 Complement rule 188
 Multiplication rule 188
 Addition rule 190
 Bayes's Law 196
 Prior probability 197
 Likelihood probability 197
 Posterior probability 197
 False-positive 200
 False-negative 200

FORMULAS:

Conditional probability

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)}$$

Complement rule

$$P(A^C) = 1 - P(A)$$

Multiplication rule

$$P(A \text{ and } B) = P(A|B)P(B)$$

Addition rule

$$P(A \text{ or } B) = P(A) + P(B) - P(A \text{ and } B)$$

CHAPTER EXERCISES

- 6.86** The following table lists the joint probabilities of achieving grades of A and not achieving A's in two MBA courses.

	Achieve a Grade of A in Marketing	Does Not Achieve a Grade of A in Marketing
--	-----------------------------------	--

Achieve a grade of A

in statistics .053 .130

Does not achieve a

grade of A in statistics .237 .580

- a. What is the probability that a student achieves a grade of A in marketing?
- b. What is the probability that a student achieves a grade of A in marketing, given that he or she does not achieve a grade of A in statistics?
- c. Are achieving grades of A in marketing and statistics independent events? Explain.

- 6.87** A construction company has bid on two contracts. The probability of winning contract A is .3. If the company wins contract A, then the probability of winning contract B is .4. If the company loses contract A, then the probability of winning contract B decreases to .2. Find the probability of the following events.

- a. Winning both contracts
- b. Winning exactly one contract
- c. Winning at least one contract

- 6.88** Laser surgery to fix shortsightedness is becoming more popular. However, for some people, a second procedure is necessary. The following table lists the joint probabilities of needing a second procedure and whether the patient has a corrective lens with a factor (diopter) of minus 8 or less.

	Vision Corrective Factor of More Than Minus 8	Vision Corrective Factor of Minus 8 or Less
First procedure is successful	.66	.15
Second procedure is required	.05	.14

- a. Find the probability that a second procedure is required.
- b. Determine the probability that someone whose corrective lens factor is minus 8 or less does not require a second procedure.
- c. Are the events independent? Explain your answer.

- 6.89** The effect of an antidepressant drug varies from person to person. Suppose that the drug is effective on 80% of women and 65% of men. It is known that 66% of the people who take the drug are women. What is the probability that the drug is effective?

- 6.90** Refer to Exercise 6.89. Suppose that you are told that the drug is effective. What is the probability that the drug taker is a man?

- 6.91** In a four-cylinder engine there are four spark plugs. If any one of them malfunctions, the car will idle roughly and power will be lost. Suppose that for a certain brand of spark plugs the probability that a spark plug will function properly after 5,000 miles is .90. Assuming that the spark plugs operate independently, what is the probability that the car will idle roughly after 5,000 miles?

- 6.92** A telemarketer sells magazine subscriptions over the telephone. The probability of a busy signal or no answer is 65%. If the telemarketer does make contact, the probability of 0, 1, 2, or 3 magazine subscriptions is .5, .25, .20, and .05, respectively. Find the probability that in one call she sells no magazines.

- 6.93** A statistics professor believes that there is a relationship between the number of missed classes and the grade on his midterm test. After examining his records, he produced the following table of joint probabilities.

	Student Fails the Test	Student Passes the Test
Student misses fewer than 5 classes	.02	.86
Student misses 5 or more classes	.09	.03

- a. What is the pass rate on the midterm test?
- b. What proportion of students who miss five or more classes passes the midterm test?
- c. What proportion of students who miss fewer than five classes passes the midterm test?
- d. Are the events independent?

- 6.94** In Canada, criminals are entitled to parole after serving only one-third of their sentence. Virtually all prisoners, with several exceptions including murderers, are released after serving two-thirds of their sentence. The government has proposed a new law that would create a special category of inmates based on whether they had committed crimes involving violence or drugs. Such criminals would be subject to additional detention if the Correction Services

judges them highly likely to reoffend. Currently, 27% of prisoners who are released commit another crime within 2 years of release. Among those who have reoffended, 41% would have been detained under the new law, whereas 31% of those who have not reoffended would have been detained.

- What is the probability that a prisoner who would have been detained under the new law does commit another crime within 2 years?
- What is the probability that a prisoner who would not have been detained under the new law does commit another crime within 2 years?

- 6.95** Casino Windsor conducts surveys to determine the opinions of its customers. Among other questions, respondents are asked to give their opinion about "Your overall impression of Casino Windsor." The responses are

Excellent Good Average Poor

In addition, the gender of the respondent is noted. After analyzing the results, the following table of joint probabilities was produced.

Rating	Women	Men
Excellent	.27	.22
Good	.14	.10
Average	.06	.12
Poor	.03	.06

- What proportion of customers rate Casino Windsor as excellent?
- Determine the probability that a male customer rates Casino Windsor as excellent.
- Find the probability that a customer who rates Casino Windsor as excellent is a man.
- Are gender and rating independent? Explain your answer.

- 6.96** A customer-service supervisor regularly conducts a survey of customer satisfaction. The results of the latest survey indicate that 8% of customers were not satisfied with the service they received at their last visit to the store. Of those who are not satisfied, only 22% return to the store within a year. Of those who are satisfied, 64% return within a year. A customer has just entered the store. In response to your question, he informs you that it is less than 1 year since his last visit to the store. What is the probability that he was satisfied with the service he received?

- 6.97** How does level of affluence affect health care? To address one dimension of the problem, a group of heart attack victims was selected. Each was categorized as a low-, medium-, or high-income earner. Each was also categorized as having survived or died. A demographer notes that in our society 21% fall into the low-income group, 49% are in the

medium-income group, and 30% are in the high-income group. Furthermore, an analysis of heart attack victims reveals that 12% of low-income people, 9% of medium-income people, and 7% of high-income people die of heart attacks. Find the probability that a survivor of a heart attack is in the low-income group.

- 6.98** A statistics professor and his wife are planning to take a 2-week vacation in Hawaii, but they can't decide whether to spend 1 week on each of the islands of Maui and Oahu, 2 weeks on Maui, or 2 weeks on Oahu. Placing their faith in random chance, they insert two Maui brochures in one envelope, two Oahu brochures in a second envelope, and one brochure from each island in a third envelope. The professor's wife will select one envelope at random, and their vacation schedule will be based on the brochures of the islands so selected. After his wife randomly selects an envelope, the professor removes one brochure from the envelope (without looking at the second brochure) and observes that it is a Maui brochure. What is the probability that the other brochure in the envelope is a Maui brochure? (Proceed with caution: The problem is more difficult than it appears.)

- 6.99** The owner of an appliance store is interested in the relationship between the price at which an item is sold (regular or sale price) and the customer's decision on whether to purchase an extended warranty. After analyzing her records, she produced the following joint probabilities.

	Purchased Extended Warranty	Did Not Purchase Extended Warranty
Regular price	.21	.57
Sale price	.14	.08

- What is the probability that a customer who bought an item at the regular price purchased the extended warranty?
- What proportion of customers buy an extended warranty?
- Are the events independent? Explain.

- 6.100** Researchers have developed statistical models based on financial ratios that predict whether a company will go bankrupt over the next 12 months. In a test of one such model, the model correctly predicted the bankruptcy of 85% of firms that did in fact fail, and it correctly predicted nonbankruptcy for 74% of firms that did not fail. Suppose that we expect 8% of the firms in a particular city to fail over the next year. Suppose that the model predicts bankruptcy for a firm that you own. What is the probability that your firm will fail within the next 12 months?

- 6.101** A union's executive conducted a survey of its members to determine what the membership felt were the important issues to be resolved during upcoming negotiations with management. The results indicate that 74% of members felt that job security was an important issue, whereas 65% identified pension benefits as an important issue. Of those who felt that pension benefits were important, 60% also felt that job security was an important issue. One member is selected at random.
- What is the probability that he or she felt that both job security and pension benefits were important?

- What is the probability that the member felt that at least one of these two issues was important?
- 6.102** In a class on probability, a statistics professor flips two balanced coins. Both fall to the floor and roll under his desk. A student in the first row informs the professor that he can see both coins. He reports that at least one of them shows tails. What is the probability that the other coin is also tails? (Beware the obvious.)
- 6.103** Refer to Exercise 6.102. Suppose the student informs the professor that he can see only one coin and it shows tails. What is the probability that the other coin is also tails?

CASE 6.1

Let's Make a Deal

A number of years ago, there was a popular television game show called *Let's Make a Deal*. The host, Monty Hall, would randomly select contestants from the audience and, as the title suggests, he would make deals for prizes. Contestants would be given relatively modest prizes and would then be offered the opportunity to risk those prizes to win better ones.

Suppose that you are a contestant on this show. Monty has just given you a free trip touring toxic waste sites around the country. He now offers you a trade: Give up the trip in exchange for a gamble. On the

stage are three curtains, A, B, and C. Behind one of them is a brand new car worth \$20,000. Behind the other two curtains, the stage is empty. You decide to gamble and select curtain A. In an attempt to make things more interesting, Monty then exposes an empty stage by opening curtain C (he knows there is nothing behind curtain C). He then offers you the free trip again if you quit now or, if you like, he will propose another deal (i.e., you can keep your choice of curtain A or perhaps switch to curtain B). What do you do?

To help you answer that question, try first answering these questions.

Michael Newman/PhotoEdit, Inc



- Before Monty shows you what's behind curtain C, what is the probability that the car is behind curtain A? What is the probability that the car is behind curtain B?
- After Monty shows you what's behind curtain C, what is the probability that the car is behind curtain A? What is the probability that the car is behind curtain B?

CASE 6.2

To Bunt or Not to Bunt, That Is the Question

No sport generates as many statistics as baseball. Reporters, managers, and fans argue and discuss strategies on the basis of these statistics. An article in *Chance* ("A Statistician Reads the Sports Page," Hal S. Stern, Vol. 1,

Winter 1997) offers baseball lovers another opportunity to analyze numbers associated with the game. Table 1 lists the probabilities of scoring at least one run in situations that are defined by the number of outs and the bases occupied. For

AP Photo/Al Behrman



example, the probability of scoring at least one run when there are no outs and a man is on first base is .39. If the bases are loaded with one out,

(Case 6.2 continued)
then the probability of scoring any runs is .67. (Probabilities are based on results from the American League during the 1989 season. The results for the National League are also shown in the article and are similar.)

TABLE 1 Probability of Scoring Any Runs

Bases Occupied	0 Outs	1 Out	2 Outs
Bases empty	.26	.16	.07
First base	.39	.26	.13
Second base	.57	.42	.24
Third base	.72	.55	.28
First base and second base	.59	.45	.24
First base and third base	.76	.61	.37
Second base and third base	.83	.74	.37
Bases loaded	.81	.67	.43

Table 1 allows us to determine the best strategy in a variety of circumstances. This case will concentrate on the strategy of the sacrifice bunt. The purpose of the sacrifice bunt is to sacrifice the batter to move base runners to the next base. It can be employed when there are fewer than two outs and men on base. Ignoring the suicide squeeze, any of four outcomes can occur:

1. The bunt is successful. The runner (or runners) advances one base, and the batter is out.
2. The batter is out but fails to advance the runner.
3. The batter bunts into a double play.

4. The batter is safe (hit or error), and the runner advances.

Suppose that you are an American League manager. The game is tied in the middle innings of a game, and there is a runner on first base with no one out. Given the following probabilities of the four outcomes of a bunt for the batter at the plate, should you signal the batter to sacrifice bunt?

$$\begin{aligned} P(\text{Outcome 1}) &= .75 \\ P(\text{Outcome 2}) &= .10 \\ P(\text{Outcome 3}) &= .10 \\ P(\text{Outcome 4}) &= .05 \end{aligned}$$

Assume for simplicity that after the hit or error in outcome 4, there will be men on first and second base and no one out.

CASE 6.3

Should He Attempt to Steal a Base?

Refer to Case 6.2. Another baseball strategy is to attempt to steal second base. Historically the probability of a successful steal of second base is approximately 68%. The probability of being thrown out is 32%.

(We'll ignore the relatively rare event wherein the catcher throws the ball into center field allowing the base runner to advance to third base.) Suppose there is a runner on first base. For each of the possible number of outs (0, 1, or 2),



determine whether it is advisable to have the runner attempt to steal second base.

CASE 6.4

Maternal Serum Screening Test for Down Syndrome

Pregnant women are screened for a birth defect called Down syndrome. Down syndrome babies are mentally and physically challenged. Some mothers choose to abort the fetus when they are

certain that their baby will be born with the syndrome. The most common screening is maternal serum screening, a blood test that looks for markers in the blood to indicate whether the birth defect may occur. The false-positive and



false-negative rates vary according to the age of the mother.

(Case 6.4 continued)

Mother's Age	False-Positive Rate	False-Negative Rate
Under 30	.04	.376
30–34	.082	.290
35–37	.178	.269
Over 38	.343	.029
The probability that a baby has Down syndrome is primarily a		

function of the mother's age. The probabilities are listed here.

Age	Probability of Down Syndrome
25	1/1300
30	1/900
35	1/350
40	1/100
45	1/25
49	1/12

- For each of the ages 25, 30, 35, 40, 45, and 49 determine the probability of Down syndrome if the maternity serum screening produces a positive result.
- Repeat for a negative result.

CASE 6.5**Probability That at Least Two People in the Same Room Have the Same Birthday**

Suppose that there are two people in a room. The probability that they share the same birthday (date, not necessarily year) is $1/365$, and the probability that they have different birthdays is $364/365$. To illustrate, suppose that you're in a room with one other person and that your birthday is July 1. The probability that the other person does not have the same birthday is $364/365$ because there are 364 days in the year that

are not July 1. If a third person now enters the room, the probability that he or she has a different birthday from the first two people in the room is $363/365$. Thus, the probability that three people in a room having different birthdays is $(364/365)(363/365)$. You can continue this process for any number of people.

Find the number of people in a room so that there is about a 50%

Anna Jurkovska/Shutterstock



probability that at least two have the same birthday.

Hint 1: Calculate the probability that they don't have the same birthday.

Hint 2: Excel users can employ the **product** function to calculate joint probabilities.



Baloncici/Shutterstock.com

RANDOM VARIABLES AND DISCRETE PROBABILITY DISTRIBUTIONS

- 7-1 *Random Variables and Probability Distributions*
- 7-2 *Bivariate Distributions*
- 7-3 *(Optional) Applications in Finance:
Portfolio Diversification and Asset Allocation*
- 7-4 *Binomial Distribution*
- 7-5 *Poisson Distribution*

Investing to Maximize Returns and Minimize Risk

DATA

Xm07-00

An investor has \$100,000 to invest in the stock market. She is interested in developing a stock portfolio made up of stocks on the New York Stock Exchange (NYSE), the Toronto Stock Exchange (TSX), and the NASDAQ. The stocks are American Express (AXP) and Home Depot (HD) (NYSE), Bank of Nova Scotia (BNS) (TSX) and Starbucks (SBUX) (NASDAQ). However, she doesn't know how much to invest in each one. She wants to maximize her return, but she would also like to minimize the risk. She has computed the monthly returns for all four stocks during a 60-month period (January 2008 to December 2012). After some consideration, she narrowed her choices down to the following three. What should she do?

1. \$25,000 in each stock
2. American Express: \$10,000, Home Depot: \$20,000, Bank of Nova Scotia: \$30,000, Starbucks: \$40,000
3. American Express: \$10,000, Home Depot: \$50,000, Bank of Nova Scotia: \$20,000, Starbucks: \$20,000



Terry Vine/Blend/Getty Images

We will provide our answer after we've developed the necessary tools in Section 7-3.

INTRODUCTION

In this chapter, we extend the concepts and techniques of probability introduced in Chapter 6. We present random variables and probability distributions, which are essential in the development of statistical inference.

Here is a brief glimpse into the wonderful world of statistical inference. Suppose that you flip a coin 100 times and count the number of heads. The objective is to determine whether we can infer from the count that the coin is not balanced. It is reasonable to believe that observing a large number of heads (say, 90) or a small number (say, 15) would be a statistical indication of an unbalanced coin. However, where do we draw the line? At 75 or 65 or 55? Without knowing the probability of the frequency of the number of heads from a balanced coin, we cannot draw any conclusions from the sample of 100 coin flips.

The concepts and techniques of probability introduced in this chapter will allow us to calculate the probability we seek. As a first step, we introduce random variables and probability distributions.

7-1 / RANDOM VARIABLES AND PROBABILITY DISTRIBUTIONS

Consider an experiment where we flip two balanced coins and observe the results. We can represent the events as

- Heads on the first coin and heads on the second coin
- Heads on the first coin and tails on the second coin
- Tails on the first coin and heads on the second coin
- Tails on the first coin and tails on the second coin

However, we can list the events in a different way. Instead of defining the events by describing the outcome of each coin, we can count the number of heads (or, if we wish, the number of tails). Thus, the events are now

- 2 heads
- 1 heads
- 1 heads
- 0 heads

The number of heads is called the **random variable**. We often label the random variable X , and we're interested in the probability of each value of X . Thus, in this illustration, the values of X are 0, 1, and 2.

Here is another example. In many parlor games as well as in the game of craps played in casinos, the player tosses two dice. One way of listing the events is to describe the number on the first die and the number on the second die as follows.

1, 1	1, 2	1, 3	1, 4	1, 5	1, 6
2, 1	2, 2	2, 3	2, 4	2, 5	2, 6
3, 1	3, 2	3, 3	3, 4	3, 5	3, 6
4, 1	4, 2	4, 3	4, 4	4, 5	4, 6
5, 1	5, 2	5, 3	5, 4	5, 5	5, 6
6, 1	6, 2	6, 3	6, 4	6, 5	6, 6

However, in almost all games, the player is primarily interested in the total. Accordingly, we can list the totals of the two dice instead of the individual numbers.

2	3	4	5	6	7
3	4	5	6	7	8
4	5	6	7	8	9
5	6	7	8	9	10
6	7	8	9	10	11
7	8	9	10	11	12

If we define the random variable X as the total of the two dice, then X can equal 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, and 12.

Random Variable

A **random variable** is a function or rule that assigns a number to each outcome of an experiment.

In some experiments, the outcomes are numbers. For example, when we observe the return on an investment or measure the amount of time to assemble a computer, the experiment produces events that are numbers. Simply stated, the value of a random variable is a numerical event.

There are two types of random variables, discrete and continuous. A **discrete random variable** is one that can take on a countable number of values. For example, if we define X as the number of heads observed in an experiment that flips a coin 10 times, then the values of X are 0, 1, 2, . . . , 10. The variable X can assume a total of 11 values. Obviously, we counted the number of values; hence, X is discrete.

A **continuous random variable** is one whose values are uncountable. An excellent example of a continuous random variable is the amount of time to complete a task. For example, let X = time to write a statistics exam in a university where the time limit is 3 hours and students cannot leave before 30 minutes. The smallest value of X is 30 minutes. If we attempt to count the number of values that X can take on, we need to identify the next value. Is it 30.1 minutes? 30.01 minutes? 30.001 minutes? None of these is the second possible value of X because there exist numbers larger than 30 and smaller than 30.001. It becomes clear that we cannot identify the second, or third, or any other values of X (except for the largest value 180 minutes). Thus, we cannot count the number of values, and X is continuous.

A **probability distribution** is a table, formula, or graph that describes the values of a random variable and the probability associated with these values. We will address discrete probability distributions in the rest of this chapter and cover continuous distributions in Chapter 8.

As we noted earlier, an uppercase letter will represent the *name* of the random variable, usually X . Its lowercase counterpart will represent the value of the random variable. Thus, we represent the probability that the random variable X will equal x as

$$P(X = x)$$

or more simply

$$P(x)$$

7-1a Discrete Probability Distributions

The probabilities of the values of a discrete random variable may be derived by means of probability tools such as tree diagrams or by applying one of the definitions of probability. However, two fundamental requirements apply as stated in the box.

Requirements for a Distribution of a Discrete Random Variable

1. $0 \leq P(x) \leq 1$ for all x

2. $\sum_{\text{all } x} P(x) = 1$

where the random variable can assume values x and $P(x)$ is the probability that the random variable is equal to x .

These requirements are equivalent to the rules of probability provided in Chapter 6. To illustrate, consider the following example.

EXAMPLE 7.1

Probability Distribution of Persons per Household

The *Statistical Abstract of the United States* is published annually. It contains a wide variety of information based on the census as well as other sources. The objective is to provide information about a variety of different aspects of the lives of the country's residents. One of the questions asks households to report the number of persons living in the household. The following table summarizes the data. Develop the probability distribution of the random variable defined as the number of persons per household.

Number of Persons	Number of Households (Millions)
1	31.1
2	38.6
3	18.8
4	16.2
5	7.2
6	2.7
7 or more	1.4
Total	116.0

Source: *Statistical Abstract of the United States*, 2009, Table 61.

SOLUTION:

The probability of each value of X , the number of persons per household is computed as the relative frequency. We divide the frequency for each value of X by the total number of households, producing the following probability distribution.

x	$P(x)$
1	$31.1/116.0 = .268$
2	$38.6/116.0 = .333$
3	$18.8/116.0 = .162$
4	$16.2/116.0 = .140$
5	$7.2/116.0 = .062$
6	$2.7/116.0 = .023$
7 or more	$1.4/116.0 = .012$
Total	1.000

As you can see, the requirements are satisfied. Each probability lies between 0 and 1, and the total is 1.

We interpret the probabilities in the same way we did in Chapter 6. For example, if we select one household at random, the probability that it has three persons is

$$P(3) = .162$$

We can also apply the addition rule for mutually exclusive events. (The values of X are mutually exclusive; a household can have 1, 2, 3, 4, 5, 6, or 7 or more persons.) The probability that a randomly selected household has four or more persons is

$$\begin{aligned} P(X \geq 4) &= P(4) + P(5) + P(6) + P(7 \text{ or more}) \\ &= .140 + .062 + .023 + .012 = .237 \end{aligned}$$

In Example 7.1, we calculated the probabilities using census information about the entire population. The next example illustrates the use of the techniques introduced in Chapter 6 to develop a probability distribution.

EXAMPLE 7.2

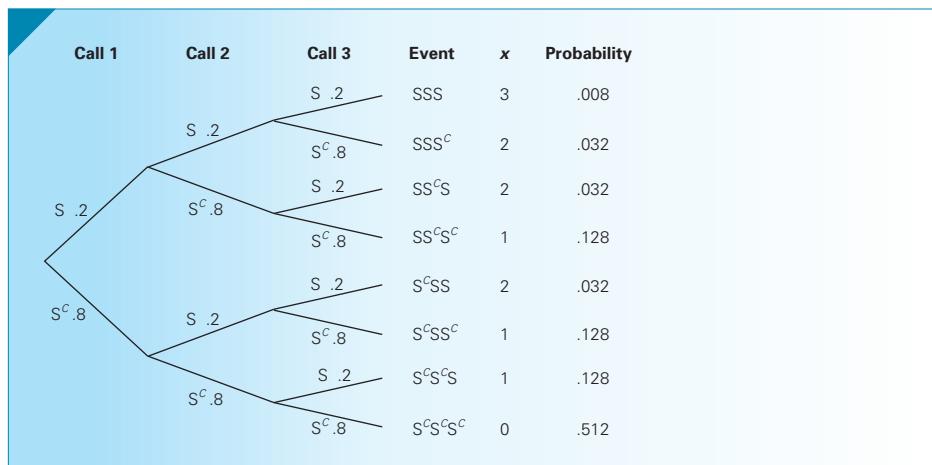
Probability Distribution of the Number of Sales

A mutual fund salesperson has arranged to call on three people tomorrow. Based on past experience, the salesperson knows there is a 20% chance of closing a sale on each call. Determine the probability distribution of the number of sales the salesperson will make.

SOLUTION:

We can use the probability rules and trees introduced in Section 6-3. Figure 7.1 displays the probability tree for this example. Let X = the number of sales.

FIGURE 7.1



The tree exhibits each of the eight possible outcomes and their probabilities. We see that there is one outcome that represents no sales, and its probability is $P(0) = .512$. There are three outcomes representing one sale, each with probability .128, so we add these probabilities. Thus,

$$P(1) = .128 + .128 + .128 = 3(.128) = .384$$

The probability of two sales is computed similarly:

$$P(X) = 3(.032) = .096$$

There is one outcome where there are three sales:

$$P(3) = .008$$

The probability distribution of X is listed in Table 7.1.

TABLE 7.1 Probability Distribution of the Number of Sales in Example 7.2

x	P(x)
0	.512
1	.384
2	.096
3	.008

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7-1b Probability Distributions and Populations

The importance of probability distributions derives from their use as representatives of populations. In Example 7.1, the distribution provided us with information about the population of numbers of persons per household. In Example 7.2, the population was the number of sales made in three calls by the salesperson. And as we noted before, statistical inference deals with inference about populations.

7-1c Describing the Population/Probability Distribution

In Chapter 4, we showed how to calculate the mean, variance, and standard deviation of a population. The formulas we provided were based on knowing the value of the random variable for each member of the population. For example, if we want to know the mean and variance of annual income of all North American blue-collar workers, we would record each of their incomes and use the formulas introduced in Chapter 4:

$$\mu = \frac{\sum_{i=1}^N X_i}{N}$$

$$\sigma^2 = \frac{\sum_{i=1}^N (X_i - \mu)^2}{N}$$

where X_1 is the income of the first blue-collar worker, X_2 is the second worker's income, and so on. It is likely that N equals several million. As you can appreciate, these formulas are seldom used in practical applications because populations are so large. It is unlikely that we would be able to record all the incomes in the population of North American

blue-collar workers. However, probability distributions often represent populations. Rather than record each of the many observations in a population, we list the values and their associated probabilities as we did in deriving the probability distribution of the number of persons per household in Example 7.1 and the number of successes in three calls by the mutual fund salesperson. These can be used to compute the mean and variance of the population.

The population mean is the weighted average of all of its values. The weights are the probabilities. This parameter is also called the **expected value** of X and is represented by $E(X)$.

Population Mean

$$E(X) = \mu = \sum_{\text{all } x} xP(x)$$

The population variance is calculated similarly. It is the weighted average of the squared deviations from the mean.

Population Variance

$$V(X) = \sigma^2 = \sum_{\text{all } x} (x - \mu)^2 P(x)$$

There is a shortcut calculation that simplifies the calculations for the population variance. This formula is not an approximation; it will yield the same value as the formula above.

Shortcut Calculation for Population Variance

$$V(X) = \sigma^2 = \sum_{\text{all } x} x^2 P(x) - \mu^2$$

The standard deviation is defined as in Chapter 4.

Population Standard Deviation

$$\sigma = \sqrt{\sigma^2}$$

EXAMPLE 7.3

Describing the Population of the Number of Persons per Household

Find the mean, variance, and standard deviation for the population of the number of persons per household Example 7.1.

SOLUTION:

For this example, we will assume that the last category is exactly seven persons. The mean of X is

$$\begin{aligned} E(X) = \mu &= \sum_{\text{all } x} xP(x) = 1P(1) + 2P(2) + 3P(3) + 4P(4) + 5P(5) + 6P(6) + 7P(7) \\ &= 1(.268) + 2(.333) + 3(.162) + 4(.140) + 5(.062) + 6(.023) + 7(.012) \\ &= 2.512 \end{aligned}$$

Notice that the random variable can assume integer values only, yet the mean is 2.513.

The variance of X is

$$\begin{aligned} V(X) = \sigma^2 &= \sum_{\text{all } x} (x - \mu)^2 P(x) \\ &= (1 - 2.512)^2(.268) + (2 - 2.512)^2(.333) + (3 - 2.512)^2(.162) \\ &\quad + (4 - 2.512)^2(.140) + (5 - 2.512)^2(.062) + (6 - 2.512)^2(.023) \\ &\quad + (7 - 2.512)^2(.012) \\ &= 1.954 \end{aligned}$$

To demonstrate the shortcut method, we'll use it to recompute the variance:

$$\begin{aligned} \sum_{\text{all } x} x^2 P(x) &= 1^2(.268) + 2^2(.333) + 3^2(.162) + 4^2(.140) + 5^2(.062) \\ &\quad + 6^2(.023) + 7^2(.012) = 8.264 \end{aligned}$$

and

$$\mu = 2.512$$

Thus,

$$\sigma^2 = \sum_{\text{all } x} x^2 P(x) - \mu^2 = 8.264 - (2.512)^2 = 1.954$$

The standard deviation is

$$\sigma = \sqrt{\sigma^2} = \sqrt{1.954} = 1.398$$

These parameters tell us that the mean and standard deviation of the number of persons per household are 2.512 and 1.398, respectively.

7-1d Laws of Expected Value and Variance

As you will discover, we often create new variables that are functions of other random variables. The formulas given in the next two boxes allow us to quickly determine the expected value and variance of these new variables. In the notation used here, X is the random variable and c is a constant.

Laws of Expected Value

1. $E(c) = c$
2. $E(X + c) = E(X) + c$
3. $E(cX) = cE(X)$

Laws of Variance

1. $V(c) = 0$
2. $V(X + c) = V(X)$
3. $V(cX) = c^2V(X)$

EXAMPLE 7.4**Describing the Population of Monthly Profits**

The monthly sales at a computer store have a mean of \$25,000 and a standard deviation of \$4,000. Profits are calculated by multiplying sales by 30% and subtracting fixed costs of \$6,000. Find the mean and standard deviation of monthly profits.

SOLUTION:

We can describe the relationship between profits and sales by the following equation:

$$\text{Profit} = .30(\text{Sales}) - 6,000$$

The expected or mean profit is

$$E(\text{Profit}) = E[.30(\text{Sales}) - 6,000]$$

Applying the second law of expected value, we produce

$$E(\text{Profit}) = E[.30(\text{Sales})] - 6,000$$

Applying law 3 yields

$$E(\text{Profit}) = .30E(\text{Sales}) - 6,000 = .30(25,000) - 6,000 = 1,500$$

Thus, the mean monthly profit is \$1,500.

The variance is

$$V(\text{Profit}) = V[.30(\text{Sales}) - 6,000]$$

The second law of variance states that

$$V(\text{Profit}) = V[.30(\text{Sales})]$$

and law 3 yields

$$V(\text{Profit}) = (.30)^2V(\text{Sales}) = .09(4,000)^2 = 1,440,000$$

Thus, the standard deviation of monthly profits is

$$\sigma_{\text{Profit}} = \sqrt{1,440,000} = \$1,200$$



EXERCISES

- 7.1** The number of accidents that occur on a busy stretch of highway is a random variable.
- What are the possible values of this random variable?
 - Are the values countable? Explain.
 - Is there a finite number of values? Explain.
 - Is the random variable discrete or continuous? Explain.
- 7.2** The distance a car travels on a tank of gasoline is a random variable.
- What are the possible values of this random variable?
 - Are the values countable? Explain.
 - Is there a finite number of values? Explain.
 - Is the random variable discrete or continuous? Explain.
- 7.3** The amount of money students earn on their summer jobs is a random variable.
- What are the possible values of this random variable?
 - Are the values countable? Explain.
 - Is there a finite number of values? Explain.
 - Is the random variable discrete or continuous? Explain.
- 7.4** The mark on a statistics exam that consists of 100 multiple-choice questions is a random variable.
- What are the possible values of this random variable?
 - Are the values countable? Explain.
 - Is there a finite number of values? Explain.
 - Is the random variable discrete or continuous? Explain.
- 7.5** Determine whether each of the following is a valid probability distribution.
- $$\begin{array}{c} x & 0 & 1 & 2 & 3 \\ P(x) & .1 & .3 & .4 & .1 \end{array}$$
 - $$\begin{array}{c} x & 5 & -6 & 10 & 0 \\ P(x) & .01 & .01 & .01 & .97 \end{array}$$
 - $$\begin{array}{c} x & 14 & 12 & -7 & 13 \\ P(x) & .25 & .46 & .04 & .24 \end{array}$$
- 7.6** Let X be the random variable designating the number of spots that turn up when a balanced die is rolled. What is the probability distribution of X ?
- 7.7** In a recent census, the number of color televisions per household was recorded

	Number of color televisions					
	0	1	2	3	4	5

	Number of households (thousands)					
	1,218	32,379	37,961	19,387	7,714	2,842

- Develop the probability distribution of X , the number of color televisions per household.
- Determine the following probabilities.

$$P(X \leq 2)$$

$$P(X > 2)$$

$$P(X \geq 4)$$

- 7.8** Using historical records, the personnel manager of a plant has determined the probability distribution of X , the number of employees absent per day. It is

x	0	1	2	3	4	5	6	7
$P(x)$.005	.025	.310	.340	.220	.080	.019	.001

- Find the following probabilities.

$$P(2 \leq X \leq 5)$$

$$P(X > 5)$$

$$P(X < 4)$$

- Calculate the mean of the population.
- Calculate the standard deviation of the population.

- 7.9** Second-year business students at many universities are required to take 10 one-semester courses. The number of courses that result in a grade of A is a discrete random variable. Suppose that each value of this random variable has the same probability. Determine the probability distribution.

- 7.10** The random variable X has the following probability distribution.

x	-3	2	6	8
$P(x)$.2	.3	.4	.1

Find the following probabilities.

- $P(X > 0)$
- $P(X \geq 1)$
- $P(X \geq 2)$
- $P(2 \leq X \leq 5)$

- 7.11** An Internet pharmacy advertises that it will deliver the over-the-counter products that customers purchase in 3 to 6 days. The manager of the company wanted to be more precise in its advertising. Accordingly, she recorded the number of days it

took to deliver to customers. From the data, the following probability distribution was developed.

Number of days	0	1	2	3	4	5	6	7	8
Probability	0	0	.01	.04	.28	.42	.21	.02	.02

- a. What is the probability that a delivery will be made within the advertised 3- to 6-day period?
 - b. What is the probability that a delivery will be late?
 - c. What is the probability that a delivery will be early?
- 7.12 A gambler believes that a strategy called “doubling up” is an effective way to gamble. The method requires the gambler to double the stake after each loss. Thus, if the initial bet is \$1, after losing he will double the bet until he wins. After a win, he resorts back to a \$1 bet. The result is that he will net \$1 for every win. The problem however, is that he will eventually run out of money or bump up against the table limit. Suppose that for a certain game the probability of winning is .5 and that losing six in a row will result in bankrupting the gambler. Find the probability of losing six times in a row.
- 7.13 The probability that a university graduate will be offered no jobs within a month of graduation is estimated to be 5%. The probability of receiving one, two, and three job offers has similarly been estimated to be 43%, 31%, and 21%, respectively. Determine the following probabilities.
- a. A graduate is offered fewer than two jobs.
 - b. A graduate is offered more than one job.
- 7.14 Use a probability tree to compute the probability of the following events when flipping two fair coins.
- a. Heads on the first coin and heads on the second coin
 - b. Heads on the first coin and tails on the second coin
 - c. Tails on the first coin and heads on the second coin
 - d. Tails on the first coin and tails on the second coin
- 7.15 Refer to Exercise 7.14. Find the following probabilities.
- a. No heads
 - b. One head
 - c. Two heads
 - d. At least one head
- 7.16 Draw a probability tree to describe the flipping of three fair coins.
- 7.17 Refer to Exercise 7.16. Find the following probabilities.
- a. Two heads
 - b. One head
- c. At least one head
 - d. At least two heads
- 7.18 The random variable X has the following distribution.
- | x | -2 | 5 | 7 | 8 |
|--------|-----|-----|-----|-----|
| $P(x)$ | .59 | .15 | .25 | .01 |
- a. Find the mean and variance for the probability distribution below.
 - b. Determine the probability distribution of Y where $Y = 5X$.
 - c. Use the probability distribution in part (b) to compute the mean and variance of Y .
 - d. Use the laws of expected value and variance to find the expected value and variance of Y from the parameters of X .
- 7.19 We are given the following probability distribution.
- | x | 0 | 1 | 2 | 3 |
|--------|----|----|----|----|
| $P(x)$ | .4 | .3 | .2 | .1 |
- a. Calculate the mean, variance, and standard deviation.
 - b. Suppose that $Y = 3X + 2$. For each value of X , determine the value of Y . What is the probability distribution of Y ?
 - c. Calculate the mean, variance, and standard deviation from the probability distribution of Y .
 - d. Use the laws of expected value and variance to calculate the mean, variance, and standard deviation of Y from the mean, variance, and standard deviation of X . Compare your answers in parts (c) and (d). Are they the same (except for rounding)?
- 7.20 The number of pizzas delivered to university students each month is a random variable with the following probability distribution.
- | x | 0 | 1 | 2 | 3 |
|--------|----|----|----|----|
| $P(x)$ | .1 | .3 | .4 | .2 |
- a. Find the probability that a student has received delivery of two or more pizzas this month.
 - b. Determine the mean and variance of the number of pizzas delivered to students each month.
- 7.21 Refer to Exercise 7.20. If the pizzeria makes a profit of \$3 per pizza, determine the mean and variance of the profits per student.
- 7.22 After watching a number of children playing games at a video arcade, a statistics practitioner estimated the following probability distribution of X , the number of games per visit.
- | x | 1 | 2 | 3 | 4 | 5 | 6 | 7 |
|--------|-----|-----|-----|-----|-----|-----|-----|
| $P(x)$ | .05 | .15 | .15 | .25 | .20 | .10 | .10 |

- a. What is the probability that a child will play more than four games?
- b. What is the probability that a child will play at least two games?

7.23 Refer to Exercise 7.22. Determine the mean and variance of the number of games played.

7.24 Refer to Exercise 7.23. Suppose that each game costs the player 25 cents. Use the laws of expected value and variance to determine the expected value and variance of the amount of money the arcade takes in.

7.25 Refer to Exercise 7.22.

- a. Determine the probability distribution of the amount of money the arcade takes in per child.
- b. Use the probability distribution to calculate the mean and variance of the amount of money the arcade takes in.
- c. Compare the answers in part (b) with those of Exercise 7.24. Are they identical (except for rounding errors)?

7.26 A survey of Amazon.com shoppers reveals the following probability distribution of the number of books purchased per hit.

x	0	1	2	3	4	5	6	7
$P(x)$.35	.25	.20	.08	.06	.03	.02	.01

- a. What is the probability that an Amazon.com visitor will buy four books?
- b. What is the probability that an Amazon.com visitor will buy eight books?
- c. What is the probability that an Amazon.com visitor will not buy any books?
- d. What is the probability that an Amazon.com visitor will buy at least one book?

7.27 A university librarian produced the following probability distribution of the number of times a student walks into the library over the period of a semester.

x	0	5	10	15	20	25	30	40	50	75	100
$P(x)$.22	.29	.12	.09	.08	.05	.04	.04	.03	.03	.01

Find the following probabilities.

- a. $P(X \geq 20)$
- b. $P(X = 60)$
- c. $P(X > 50)$
- d. $P(X > 100)$

7.28 After analyzing the frequency with which cross-country skiers participate in their sport, a sports-writer created the following probability distribution for X = number of times per year cross-country skiers ski.

x	0	1	2	3	4	5	6	7	8
$P(x)$.04	.09	.19	.21	.16	.12	.08	.06	.05

Find the following.

- a. $P(3)$
- b. $P(X \geq 5)$
- c. $P(5 \leq X \leq 7)$

7.29 The natural remedy echinacea is reputed to boost the immune system, which will reduce the number of flu and colds. A 6-month study was undertaken to determine whether the remedy works. From this study, the following probability distribution of the number of respiratory infections per year (X) for echinacea users was produced.

x	0	1	2	3	4
$P(x)$.45	.31	.17	.06	.01

Find the following probabilities.

- a. An echinacea user has more than one infection per year.
- b. An echinacea user has no infections per year.
- c. An echinacea user has between one and three (inclusive) infections per year.

7.30 A shopping mall estimates the probability distribution of the number of stores mall customers actually enter, as shown in the table.

x	0	1	2	3	4	5	6
$P(x)$.04	.19	.22	.28	.12	.09	.06

Find the mean and standard deviation of the number of stores entered.

7.31 Refer to Exercise 7.30. Suppose that, on average, customers spend 10 minutes in each store they enter. Find the mean and standard deviation of the total amount of time customers spend in stores.

7.32 When parking a car in a downtown parking lot, drivers pay according to the number of hours or parts thereof. The probability distribution of the number of hours cars are parked has been estimated as follows.

x	1	2	3	4	5	6	7	8
$P(x)$.24	.18	.13	.10	.07	.04	.04	.20

Find the mean and standard deviation of the number of hours cars are parked in the lot.

7.33 Refer to Exercise 7.32. The cost of parking is \$2.50 per hour. Calculate the mean and standard deviation of the amount of revenue each car generates.

7.34 You have been given the choice of receiving \$500 in cash or receiving a gold coin that has a face value of \$100. However, the actual value of the gold coin depends on its gold content. You are told that the coin has a 40% probability of being worth \$400, a 30% probability of being worth \$900, and a 30%

probability of being worth its face value. Basing your decision on expected value, should you choose the coin?

- 7.35 The manager of a bookstore recorded the number of customers who arrive at a checkout counter every 5 minutes from which the following distribution was calculated. Calculate the mean and standard deviation of the random variable.

x	0	1	2	3	4
$P(x)$.10	.20	.25	.25	.20

- 7.36 The owner of a small firm has just purchased a personal computer, which she expects will serve her for the next 2 years. The owner has been told that she "must" buy a surge suppressor to provide protection for her new hardware against possible surges or variations in the electrical current, which have the capacity to damage the computer. The amount of damage to the computer depends on the strength of the surge. It has been estimated that there is a 1% chance of incurring \$400 damage, a 2% chance of incurring \$200 damage, and 10% chance of \$100 damage. An inexpensive suppressor, which would provide protection for only one surge can be purchased. How much should the owner be willing to pay if she makes decisions on the basis of expected value?

- 7.37 It cost one dollar to buy a lottery ticket, which has five prizes. The prizes and the probability that a player wins the prize are listed here. Calculate the expected value of the payoff.

Prize (\$)	1 million	200,000	50,000
Probability	1/10 million	1/1 million	1/500,000
Prize (\$)	10,000	1,000	
Probability	1/50,000	1/10,000	

- 7.38 After an analysis of incoming faxes, the manager of an accounting firm determined the probability

distribution of the number of pages per facsimile as follows:

x	1	2	3	4	5	6	7
$P(x)$.05	.12	.20	.30	.15	.10	.08

Compute the mean and variance of the number of pages per fax.

- 7.39 Refer to Exercise 7.38. Further analysis by the manager revealed that the cost of processing each page of a fax is \$.25. Determine the mean and variance of the cost per fax.

- 7.40 To examine the effectiveness of its four annual advertising promotions, a mail-order company has sent a questionnaire to each of its customers, asking how many of the previous year's promotions prompted orders that would not otherwise have been made. The table lists the probabilities that were derived from the questionnaire, where X is the random variable representing the number of promotions that prompted orders. If we assume that overall customer behavior next year will be the same as last year, what is the expected number of promotions that each customer will take advantage of next year by ordering goods that otherwise would not be purchased?

x	0	1	2	3	4
$P(x)$.10	.25	.40	.20	.05

- 7.41 Refer to Exercise 7.40. A previous analysis of historical records found that the mean value of orders for promotional goods is \$20, with the company earning a gross profit of 20% on each order. Calculate the expected value of the profit contribution next year.

- 7.42 Refer to Exercises 7.40 and 7.41. The fixed cost of conducting the four promotions is estimated to be \$15,000, with a variable cost of \$3.00 per customer for mailing and handling costs. How large a customer base does the company need to cover the cost of promotions?

7-2 / BIVARIATE DISTRIBUTIONS

Thus far, we have dealt with the distribution of a *single* variable. However, there are circumstances where we need to know about the relationship between two variables. Recall that we have addressed this problem statistically in Chapter 3 by drawing the scatter diagram and in Chapter 4 by calculating the covariance and the coefficient of correlation. In this section, we present the **bivariate distribution**, which provides probabilities of combinations of two variables. Incidentally, when we need to distinguish between the bivariate distributions and the distributions of one variable, we'll refer to the latter as *univariate* distributions.

The joint probability that two variables will assume the values x and y is denoted $P(x, y)$. A bivariate (or joint) probability distribution of X and Y is a table or formula

that lists the joint probabilities for all pairs of values of x and y . As was the case with univariate distributions, the joint probability must satisfy two requirements.

Requirements for a Discrete Bivariate Distribution

- $0 \leq P(x, y) \leq 1$ for all pairs of values (x, y)

- $\sum_{\text{all } x} \sum_{\text{all } y} P(x, y) = 1$

EXAMPLE 7.5

Bivariate Distribution of the Number of House Sales

Xavier and Yvette are real estate agents. Let X denote the number of houses that Xavier will sell in a month and let Y denote the number of houses Yvette will sell in a month. An analysis of their past monthly performances has the following joint probabilities.

Bivariate Probability Distribution

		X		
		0	1	2
Y	0	.12	.42	.06
	1	.21	.06	.03
	2	.07	.02	.01

We interpret these joint probabilities in the same way we did in Chapter 6. For example, the probability that Xavier sells 0 houses and Yvette sells 1 house in the month is $P(0, 1) = .21$.

7-2a Marginal Probabilities

As we did in Chapter 6, we can calculate the marginal probabilities by summing across rows or down columns.

Marginal Probability Distribution of X in Example 7.5

$$P(X = 0) = P(0, 0) + P(0, 1) + P(0, 2) = .12 + .21 + .07 = .4$$

$$P(X = 1) = P(1, 0) + P(1, 1) + P(1, 2) = .42 + .06 + .02 = .5$$

$$P(X = 2) = P(2, 0) + P(2, 1) + P(2, 2) = .06 + .03 + .01 = .1$$

The marginal probability distribution of X is

x	$P(x)$
0	.4
1	.5
2	.1

Marginal Probability Distribution of Y in Example 7.5

$$P(Y = 0) = P(0, 0) + P(1, 0) + P(2, 0) = .12 + .42 + .06 = .6$$

$$P(Y = 1) = P(0, 1) + P(1, 1) + P(2, 1) = .21 + .06 + .03 = .3$$

$$P(Y = 2) = P(0, 2) + P(1, 2) + P(2, 2) = .07 + .02 + .01 = .1$$

The marginal probability distribution of Y is

y	$P(y)$
0	.6
1	.3
2	.1

Notice that both marginal probability distributions meet the requirements; the probabilities are between 0 and 1, and they add to 1.

7-2b Describing the Bivariate Distribution

As we did with the univariate distribution, we often describe the bivariate distribution by computing the mean, variance, and standard deviation of each variable. We do so by utilizing the marginal probabilities.

Expected Value, Variance, and Standard Deviation of X in Example 7.5

$$E(X) = \mu_X = \sum xP(x) = 0(.4) + 1(.5) + 2(.1) = .7$$

$$\begin{aligned} V(X) &= \sigma_X^2 = \sum (x - \mu_X)^2 P(x) = (0 - .7)^2(.4) + (1 - .7)^2(.5) + (2 - .7)^2(.1) = .41 \\ \sigma_X &= \sqrt{\sigma_X^2} = \sqrt{.41} = .64 \end{aligned}$$

Expected Value, Variance, and Standard Deviation of Y in Example 7.5

$$E(Y) = \mu_Y = \sum yP(y) = 0(.6) + 1(.3) + 2(.1) = .5$$

$$\begin{aligned} V(Y) &= \sigma_Y^2 = \sum (y - \mu_Y)^2 P(y) = (0 - .5)^2(.6) + (1 - .5)^2(.3) + (2 - .5)^2(.1) = .45 \\ \sigma_Y &= \sqrt{\sigma_Y^2} = \sqrt{.45} = .67 \end{aligned}$$

There are two more parameters we can and need to compute. Both deal with the relationship between the two variables. They are the covariance and the coefficient of correlation. Recall that both were introduced in Chapter 4, where the formulas were based on the assumption that we knew each of the N observations of the population. In this chapter, we compute parameters like the covariance and the coefficient of correlation from the bivariate distribution.

Covariance

The covariance of two discrete variables is defined as

$$\text{COV}(X, Y) = \sigma_{xy} = \sum_{\text{all } x} \sum_{\text{all } y} (x - \mu_X)(y - \mu_Y)P(x, y)$$

Notice that we multiply the deviations from the mean for both X and Y and then multiply by the joint probability.

The calculations are simplified by the following shortcut method.

Shortcut Calculation for Covariance

$$\text{COV}(X,Y) = \sigma_{xy} = \sum_{\text{all } x} \sum_{\text{all } y} xyP(x,y) - \mu_X\mu_Y$$

The coefficient of correlation is calculated in the same way as in Chapter 4.

Coefficient of Correlation

$$\rho = \frac{\sigma_{xy}}{\sigma_x\sigma_y}$$

EXAMPLE 7.6

Describing the Bivariate Distribution

Compute the covariance and the coefficient of correlation between the numbers of houses sold by the two agents in Example 7.5.

SOLUTION:

We start by computing the covariance.

$$\begin{aligned}\sigma_{xy} &= \sum_{\text{all } x} \sum_{\text{all } y} (x - \mu_X)(y - \mu_Y)P(x,y) \\ &= (0 - .7)(0 - .5)(.12) + (1 - .7)(0 - .5)(.42) + (2 - .7)(0 - .5)(.06) \\ &\quad + (0 - .7)(1 - .5)(.21) + (1 - .7)(1 - .5)(.06) + (2 - .7)(1 - .5)(.03) \\ &\quad + (0 - .7)(2 - .5)(.07) + (1 - .7)(2 - .5)(.02) + (2 - .7)(2 - .5)(.01) \\ &= -.15\end{aligned}$$

As we did with the shortcut method for the variance, we'll recalculate the covariance using its shortcut method.

$$\begin{aligned}\sum_{\text{all } x} \sum_{\text{all } y} xyP(x,y) &= (0)(0)(.12) + (1)(0)(.42) + (2)(0)(.06) \\ &\quad + (0)(1)(.21) + (1)(1)(.06) + (2)(1)(.03) \\ &\quad + (0)(2)(.07) + (1)(2)(.02) + (2)(2)(.01) \\ &= .2\end{aligned}$$

Using the expected values computed above, we find

$$\sigma_{xy} = \sum_{\text{all } x} \sum_{\text{all } y} xyP(x,y) - \mu_X\mu_Y = .2 - (.7)(.5) = -.15$$

We also computed the standard deviations above. Thus, the coefficient of correlation is

$$\rho = \frac{\sigma_{xy}}{\sigma_x \sigma_y} = \frac{-15}{(.64)(.67)} = -.35$$

There is a weak negative relationship between the two variables: the number of houses Xavier will sell in a month (X) and the number of houses Yvette will sell in a month (Y).

7-2c Sum of Two Variables

The bivariate distribution allows us to develop the probability distribution of any combination of the two variables. Of particular interest to us is the sum of two variables. The analysis of this type of distribution leads to an important statistical application in finance, which we present in the next section.

To see how to develop the probability distribution of the sum of two variables from their bivariate distribution, return to Example 7.5. The sum of the two variables X and Y is the total number of houses sold per month. The possible values of $X + Y$ are 0, 1, 2, 3, and 4. The probability that $X + Y = 2$, for example, is obtained by summing the joint probabilities of all pairs of values of X and Y that sum to 2:

$$P(X + Y = 2) = P(0, 2) + P(1, 1) + P(2, 0) = .07 + .06 + .06 = .19$$

We calculate the probabilities of the other values of $X + Y$ similarly, producing the following table.

Probability Distribution of $X + Y$ in Example 7.5

$x + y$	0	1	2	3	4
$P(x + y)$.12	.63	.19	.05	.01

We can compute the expected value, variance, and standard deviation of $X + Y$ in the usual way.

$$E(X + Y) = 0(.12) + 1(.63) + 2(.19) + 3(.05) + 4(.01) = 1.2$$

$$\begin{aligned} V(X + Y) &= \sigma_{X+Y}^2 = (0 - 1.2)^2(.12) + (1 - 1.2)^2(.63) + (2 - 1.2)^2(.19) \\ &\quad + (3 - 1.2)^2(.05) + (4 - 1.2)^2(.01) \\ &= .56 \end{aligned}$$

$$\sigma_{X+Y} = \sqrt{.56} = .75$$

We can derive a number of laws that enable us to compute the expected value and variance of the sum of two variables.

Laws of Expected Value and Variance of the Sum of Two Variables

1. $E(X + Y) = E(X) + E(Y)$
2. $V(X + Y) = V(X) + V(Y) + 2\text{COV}(X, Y)$

If X and Y are independent, $\text{COV}(X, Y) = 0$ and thus $V(X + Y) = V(X) + V(Y)$

EXAMPLE 7.7**Describing the Population of the Total Number of House Sales**

Use the rules of expected value and variance of the sum of two variables to calculate the mean and variance of the total number of houses sold per month in Example 7.5.

SOLUTION:

Using law 1 we compute the expected value of $X + Y$:

$$E(X + Y) = E(X) + E(Y) = .7 + .5 = 1.2$$

which is the same value we produced directly from the probability distribution of $X + Y$.

We apply law 3 to determine the variance:

$$V(X + Y) = V(X) + V(Y) + 2\text{COV}(X, Y) = .41 + .45 + 2(-.15) = .56$$

This is the same value we obtained from the probability distribution of $X + Y$.

We will encounter several applications where we need the laws of expected value and variance for the sum of two variables. Additionally, we will demonstrate an important application in operations management where we need the formulas for the expected value and variance of the sum of more than two variables. See Exercises 7.57–7.60.

**EXERCISES**

- 7.43** The following table lists the bivariate distribution of X and Y .

y	x	
	1	2
1	.5	.1
2	.1	.3

- a. Find the marginal probability distribution of X .
- b. Find the marginal probability distribution of Y .
- c. Compute the mean and variance of X .
- d. Compute the mean and variance of Y .

- 7.44** Refer to Exercise 7.43. Compute the covariance and the coefficient of correlation.

- 7.45** Refer to Exercise 7.43. Use the laws of expected value and variance of the sum of two variables to compute the mean and variance of $X + Y$.

- 7.46** Refer to Exercise 7.43.

- a. Determine the distribution of $X + Y$.
- b. Determine the mean and variance of $X + Y$.
- c. Does your answer to part (b) equal the answer to Exercise 7.45?

- 7.47** The bivariate distribution of X and Y is described here.

y	x	
	1	2
1	.28	.42
2	.12	.18

- a. Find the marginal probability distribution of X .
- b. Find the marginal probability distribution of Y .
- c. Compute the mean and variance of X .
- d. Compute the mean and variance of Y .

- 7.48** Refer to Exercise 7.47. Compute the covariance and the coefficient of correlation.

- 7.49** Refer to Exercise 7.47. Use the laws of expected value and variance of the sum of two variables to compute the mean and variance of $X + Y$.

- 7.50** Refer to Exercise 7.47.

- a. Determine the distribution of $X + Y$.
- b. Determine the mean and variance of $X + Y$.
- c. Does your answer to part (b) equal the answer to Exercise 7.49?

- 7.51 The joint probability distribution of X and Y is shown in the following table.

y	x		
	1	2	3
1	.42	.12	.06
2	.28	.08	.04

- a. Determine the marginal distributions of X and Y .
 b. Compute the covariance and coefficient of correlation between X and Y .
 c. Develop the probability distribution of $X + Y$.
- 7.52 The following distributions of X and of Y have been developed. If X and Y are independent, determine the joint probability distribution of X and Y .

x	0	1	2	y	1	2
$p(x)$.6	.3	.1	$p(y)$.7	.3

- 7.53 The distributions of X and of Y are described here. If X and Y are independent, determine the joint probability distribution of X and Y .

x	0	1	y	1	2	3
$p(x)$.2	.8	$p(y)$.2	.4	.4

- 7.54 After analyzing several months of sales data, the owner of an appliance store produced the following joint probability distribution of the number of refrigerators and stoves sold daily.

		Refrigerators		
		0	1	2
Stoves	0	.08	.14	.12
	1	.09	.17	.13
	2	.05	.18	.04

- a. Find the marginal probability distribution of the number of refrigerators sold daily.
 b. Find the marginal probability distribution of the number of stoves sold daily.

- c. Compute the mean and variance of the number of refrigerators sold daily.
 d. Compute the mean and variance of the number of stoves sold daily.
 e. Compute the covariance and the coefficient of correlation.

- 7.55 Canadians who visit the United States often buy liquor and cigarettes, which are much cheaper in the United States. However, there are limitations. Canadians visiting in the United States for more than 2 days are allowed to bring into Canada one bottle of liquor and one carton of cigarettes. A Canada customs agent has produced the following joint probability distribution of the number of bottles of liquor and the number of cartons of cigarettes imported by Canadians who have visited the United States for 2 or more days.

		Bottles of Liquor		
		Cartons of Cigarettes	0	1
Cartons of Cigarettes	0	.63	.18	
	1	.09	.10	

- a. Find the marginal probability distribution of the number of bottles imported.
 b. Find the marginal probability distribution of the number of cigarette cartons imported.
 c. Compute the mean and variance of the number of bottles imported.
 d. Compute the mean and variance of the number of cigarette cartons imported.
 e. Compute the covariance and the coefficient of correlation.

- 7.56 Refer to Exercise 7.54. Find the following conditional probabilities.
 a. $P(1 \text{ refrigerator} | 0 \text{ stoves})$
 b. $P(0 \text{ stoves} | 1 \text{ refrigerator})$
 c. $P(2 \text{ refrigerators} | 2 \text{ stoves})$

APPLICATIONS in OPERATIONS MANAGEMENT

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PERT/CPM

The Project Evaluation and Review Technique (**PERT**) and the Critical Path Method (**CPM**) are related management-science techniques that help operations managers control the activities and the amount of time it takes to complete a project. Both techniques are based on the order in which the activities must be performed. For example, in building a house the excavation of the foundation must precede the pouring of the foundation, which in turn

(Continued)

precedes the framing. A **path** is defined as a sequence of related activities that leads from the starting point to the completion of a project. In most projects, there are several paths with differing amounts of time needed for their completion. The longest path is called the **critical path** because any delay in the activities along this path will result in a delay in the completion of the project. In some versions of PERT/CPM, the activity completion times are fixed and the chief task of the operations manager is to determine the critical path. In other versions, each activity's completion time is considered to be a random variable, where the mean and variance can be estimated. By extending the laws of expected value and variance for the sum of two variables to more than two variables, we produce the following, where X_1, X_2, \dots, X_k are the times for the completion of activities 1, 2, ..., k , respectively. These times are independent random variables.

Laws of Expected Value and Variance for the Sum of More than Two Independent Variables

1. $E(X_1 + X_2 + \dots + X_k) = E(X_1) + E(X_2) + \dots + E(X_k)$
2. $V(X_1 + X_2 + \dots + X_k) = V(X_1) + V(X_2) + \dots + V(X_k)$

Using these laws, we can then produce the expected value and variance for the complete project. Exercises 7.57–7.60 address this problem.

- 7.57** There are four activities along the critical path for a project. The expected values and variances of the completion times of the activities are listed here. Determine the expected value and variance of the completion time of the project.

Activity	Expected Completion Time (Days)	Variance
1	18	8
2	12	5
3	27	6
4	8	2

- 7.58** The operations manager of a large plant wishes to overhaul a machine. After conducting a PERT/CPM analysis he has developed the following critical path.

1. Disassemble machine
2. Determine parts that need replacing
3. Find needed parts in inventory
4. Reassemble machine
5. Test machine

He has estimated the mean (in minutes) and variances of the completion times as follows.

Activity	Mean	Variance
1	35	8
2	20	5
3	20	4
4	50	12
5	20	2

Determine the mean and variance of the completion time of the project.

- 7.59** In preparing to launch a new product, a marketing manager has determined the critical path for her department. The activities and the mean and variance

of the completion time for each activity along the critical path are shown in the accompanying table. Determine the mean and variance of the completion time of the project.

Activity	Expected Completion Time (Days)	Variance
Develop survey questionnaire	8	2
Pretest the questionnaire	14	5
Revise the questionnaire	5	1
Hire survey company	3	1
Conduct survey	30	8
Analyze data	30	10
Prepare report	10	3

- 7.60 A professor of business statistics is about to begin work on a new research project. Because his time is quite limited, he has developed a PERT/CPM critical path, which consists of the following activities:

1. Conduct a search for relevant research articles.
2. Write a proposal for a research grant.
3. Perform the analysis.
4. Write the article and send to journal.
5. Wait for reviews.
6. Revise on the basis of the reviews and resubmit.

The mean (in days) and variance of the completion times are as follows

Activity	Mean	Variance
1	10	9
2	3	0
3	30	100
4	5	1
5	100	400
6	20	64

Compute the mean and variance of the completion time of the entire project.

7-3 / (OPTIONAL) APPLICATIONS IN FINANCE: PORTFOLIO DIVERSIFICATION AND ASSET ALLOCATION

In this section, we introduce an important application in finance that is based on the previous section.

In Chapter 3 (page 51), we described how the variance or standard deviation can be used to measure the risk associated with an investment. Most investors tend to be risk averse, which means that they prefer to have lower risk associated with their investments. One of the ways in which financial analysts lower the risk that is associated with the stock market is through **diversification**. This strategy was first mathematically developed by Harry Markowitz in 1952. His model paved the way for the development of modern portfolio theory (MPT), which is the concept underlying mutual funds (see page 178).

To illustrate the basics of portfolio diversification, consider an investor who forms a portfolio, consisting of only two stocks, by investing \$4,000 in one stock and \$6,000 in a second stock. Suppose that the results after 1 year are as listed here. (We've previously defined return on investment. See Applications in Finance: Return on Investment on page 52.)

One-Year Results

Stock	Initial Investment (\$)	Value of Investment After One Year (\$)	Rate of Return on Investment
1	4,000	5,000	$R_1 = .25$ (25%)
2	6,000	5,400	$R_2 = -.10$ (-10%)
Total	10,000	10,400	$R_p = .04$ (4%)

Another way of calculating the portfolio return R_p is to compute the weighted average of the individual stock returns R_1 and R_2 , where the weights w_1 and w_2 are the proportions of the initial \$10,000 invested in stocks 1 and 2, respectively. In this illustration, $w_1 = .4$ and $w_2 = .6$. (Note that w_1 and w_2 must always sum to 1 because the two stocks constitute the entire portfolio.) The weighted average of the two returns is

$$\begin{aligned} R_p &= w_1 R_1 + w_2 R_2 \\ &= (.4)(.25) + (.6)(-.10) = .04 \end{aligned}$$

This is how portfolio returns are calculated. However, when the initial investments are made, the investor does not know what the returns will be. In fact, the returns are random variables. We are interested in determining the expected value and variance of the portfolio. The formulas in the box were derived from the laws of expected value and variance introduced in the two previous sections.

Mean and Variance of a Portfolio of Two Stocks

$$\begin{aligned} E(R_p) &= w_1 E(R_1) + w_2 E(R_2) \\ V(R_p) &= w_1^2 V(R_1) + w_2^2 V(R_2) + 2w_1 w_2 \text{COV}(R_1, R_2) \\ &= w_1^2 \sigma_1^2 + w_2^2 \sigma_2^2 + 2w_1 w_2 \rho \sigma_1 \sigma_2 \end{aligned}$$

where w_1 and w_2 are the proportions or weights of investments 1 and 2, $E(R_1)$ and $E(R_2)$ are their expected values, σ_1 and σ_2 are their standard deviations, $\text{COV}(R_1, R_2)$ is the covariance, and ρ is the coefficient of correlation.

(Recall that $\rho = \frac{\text{COV}(R_1, R_2)}{\sigma_1 \sigma_2}$, which means that $\text{COV}(R_1, R_2) = \rho \sigma_1 \sigma_2$.)

EXAMPLE 7.8

Describing the Population of the Returns on a Portfolio

An investor has decided to form a portfolio by putting 25% of his money into McDonald's stock and 75% into Cisco Systems stock. The investor assumes that the expected returns will be 8% and 15%, respectively, and that the standard deviations will be 12% and 22%, respectively.

- a. Find the expected return on the portfolio.
- b. Compute the standard deviation of the returns on the portfolio assuming that
 - i. the two stocks' returns are perfectly positively correlated.
 - ii. the coefficient of correlation is .5.
 - iii. the two stocks' returns are uncorrelated.

S O L U T I O N :

- a. The expected values of the two stocks are

$$E(R_1) = .08 \quad \text{and} \quad E(R_2) = .15$$

The weights are $w_1 = .25$ and $w_2 = .75$.

Thus,

$$E(R_p) = w_1 E(R_1) + w_2 E(R_2) = .25(.08) + .75(.15) = .1325$$

- b. The standard deviations are

$$\sigma_1 = .12 \quad \text{and} \quad \sigma_2 = .22$$

Thus,

$$\begin{aligned} V(R_p) &= w_1^2 \sigma_1^2 + w_2^2 \sigma_2^2 + 2w_1 w_2 \rho \sigma_1 \sigma_2 \\ &= (.25^2)(.12^2) + (.75^2)(.22^2) + 2(.25)(.75)\rho(.12)(.22) \\ &= .0281 + .0099\rho \end{aligned}$$

When $\rho = 1$

$$V(R_p) = .0281 + .0099(1) = .0380$$

$$\text{Standard deviation} = \sqrt{V(R_p)} = \sqrt{.0380} = .1949$$

When $\rho = .5$

$$V(R_p) = .0281 + .0099(.5) = .0331$$

$$\text{Standard deviation} = \sqrt{V(R_p)} = \sqrt{.0331} = .1819$$

When $\rho = 0$

$$V(R_p) = .0281 + .0099(0) = .0281$$

$$\text{Standard deviation} = \sqrt{V(R_p)} = \sqrt{.0281} = .1676$$

Notice that the variance and standard deviation of the portfolio returns decrease as the coefficient of correlation decreases.

7-3a Portfolio Diversification in Practice

The formulas introduced in this section require that we know the expected values, variances, and covariance (or coefficient of correlation) of the investments we're interested in. The question arises, how do we determine these parameters? (Incidentally, this question is rarely addressed in finance textbooks!) The most common procedure is to estimate the parameters from historical data, using sample statistics.

7-3b Portfolios with More Than Two Stocks

We can extend the formulas that describe the mean and variance of the returns of a portfolio of two stocks to a portfolio of any number of stocks.

Mean and Variance of a Portfolio of k Stocks

$$E(R_p) = \sum_{i=1}^k w_i E(R_i)$$

$$V(R_p) = \sum_{i=1}^k w_i^2 \rho_i^2 + 2 \sum_{i=1}^k \sum_{j=i+1}^k w_i w_j \text{COV}(R_i, R_j)$$

Where R_i is the return of the i th stock, w_i is the proportion of the portfolio invested in stock i , and k is the number of stocks in the portfolio.

When k is greater than 2, the calculations can be tedious and time consuming. For example, when $k = 3$, we need to know the values of the three weights, three expected values, three variances, and three covariances. When $k = 4$, there are four expected values, four variances, and six covariances. [The number of covariances required in general is $k(k - 1)/2$.] To assist you, we have created an Excel worksheet to perform the computations when $k = 2, 3$, or 4 . To demonstrate, we'll return to the problem described in this chapter's introduction.

Investing to Maximize Returns and Minimize Risk: Solution

Because of the large number of calculations, we will solve this problem using only Excel. From the file, we compute the means of each stock's returns.

Excel Means

	A	B	C	D
1	0.01420	0.01735	0.01014	0.02387

Next we compute the variance-covariance matrix. (The commands are the same as those described in Chapter 4—simply include all the columns of the returns of the investments you wish to include in the portfolio.)

Excel Variance-Covariance Matrix

	A	B	C	D	E
1	AXP	HD	BNS	SBUX	
2	AXP	0.02224			
3	HD	0.00521	0.00513		
4	BNS	0.00693	0.00228	0.00656	
5	SBUX	0.00935	0.00392	0.00480	0.00992



Terry Vine/Blend/Getty Images

Notice that the variances of the returns are listed on the diagonal. Thus, for example, the variance of the 60 monthly returns of American Express is .02224. The covariances appear below the diagonal. The covariance between the returns of Home Depot and Bank of Nova Scotia is .00228.

The means and the variance-covariance matrix are copied to the spreadsheet using the commands described here. The weights are typed producing the accompanying output.

Excel Worksheet: Portfolio Diversification-Plan 1

	A	B	C	D	E	F
1	Portfolio of 4 Stocks					
2		AXP	HD	BNS	SBUX	
3	Variance-Covariance Matrix	AXP	0.02224			
4		HD	0.00521	0.00513		
5		BNS	0.00693	0.00228	0.00656	
6		SBUX	0.00935	0.00392	0.00480	0.00992
7						
8	Expected Returns		0.01420	0.01735	0.01014	0.02387
9						
10	Weights		0.25000	0.25000	0.25000	0.25000
11						
12	Portfolio Return					
13	Expected Value	0.01639				
14	Variance	0.00680				
15	Standard Deviation	0.08247				

The expected return on the portfolio is .01639 and the variance is .00680.

INSTRUCTIONS

1. Open the file containing the returns. In this example, open file **Ch7:\Xm07-00**
2. Compute the means of the columns containing the returns of the stocks in the portfolio.
3. Using the commands described in Chapter 4 (page 133) compute the variance-covariance matrix.
4. Open the **Portfolio Diversification** workbook. Use the tab to select the **4 Stocks** worksheet. DO NOT CHANGE ANY CELLS THAT APPEAR IN BOLD PRINT. DO NOT SAVE ANY WORKSHEETS.
5. Copy the means into cells C8 to F8. (Use **Copy, Paste Special with Values and number formats.**)
6. Copy the variance-covariance matrix (including row and column labels) into columns B, C, D, E, and F.
7. Type the weights into cells C10 to F10.

The mean, variance, and standard deviation of the portfolio will be printed. Use similar commands for 2 stock and 3 stock portfolios.

The results for Plan 2 are:

	A	B
12	Portfolio Return	
13	Expected Value	0.01748
14	Variance	0.00603
15	Standard Deviation	0.07766

Plan 3:

	A	B
12	Portfolio Return	
13	Expected Value	0.01690
14	Variance	0.00496
15	Standard Deviation	0.07043

Plan 1 has the smallest expected value and the largest variance. As a result, Plan 1 is not the best choice. Plan 2 has the largest expected value and the second largest variance. Plan 3's expected value is the second highest and the variance is the smallest. If the investor is like most investors, she would select Plan 3 because of its lower risk. Other more daring investors may choose Plan 2 to take advantage of its higher expected value.

In this example, we showed how to compute the expected return, variance, and standard deviation from a sample of returns on the investments for any combination of weights. (We illustrated the process with three sets of weights.) It is possible to determine the “optimal” weights that minimize risk for a given expected value or maximize expected return for a given standard deviation. This is an extremely important function of financial analysts and investment advisors. Solutions can be determined using a management science technique called *linear programming*, a subject taught by most schools of business and faculties of management.



EXERCISES

- 7.61** Describe what happens to the expected value and standard deviation of the portfolio returns when the coefficient of correlation decreases.
- 7.62** A portfolio is composed of two stocks. The proportion of each stock, their expected values, and standard deviations are listed next.

Stock	1	2
Proportion of portfolio	.30	.70
Mean	.12	.25
Standard deviation	.02	.15

For each of the following coefficients of correlation, calculate the expected value and standard deviation of the portfolio:

- $\rho = .5$
- $\rho = .2$
- $\rho = 0$

- 7.63** An investor is given the following information about the returns on two stocks:

Stock	1	2
Mean	.09	.13
Standard deviation	.15	.21

- If he is most interested in maximizing his returns, which stock should he choose?
 - If he is most interested in minimizing his risk, which stock should he choose?
- 7.64** Refer to Exercise 7.63. Compute the expected value and standard deviation of the portfolio composed of 60% stock 1 and 40% stock 2. The coefficient of correlation is .4.
- 7.65** Refer to Exercise 7.63. Compute the expected value and standard deviation of the portfolio composed of 30% stock 1 and 70% stock 2.

The following exercises require the use of a computer.

Xr07-NYSE We have recorded the monthly returns for the following Dow Jones Industrials 30 stocks listed on the New York Stock Exchange for the period January 2008 to December 2012:

3M (MMM), Alcoa (AA), American Express (AXP), AT&T (T), Bank of America (BAC), Boeing (BA), Caterpillar (CAT), Chevron (CVX), Cisco Systems (CSCO), Coca-Cola (KO), Disney (DIS), Du Pont (DD), Exxon (XOM), General Electric (GE), Hewlett-Packard (HPQ), Home Depot (HD), Intel (INTC), International Business Machines (IBM), Johnson & Johnson (JNJ), JP Morgan Chase (JPM), McDonald's (MCD), Merck (MRK), Microsoft (MSFT), Pfizer (PFE), Proctor & Gamble (PG), Travelers (TRV), United Technologies (UTX), United Health (UNH), Verizon Communications (VZ), Wal-Mart Stores (WMT).

For Exercises 7.66 to 7.72, calculate the mean and standard deviation of the portfolio. The proportions invested in each stock are shown in parentheses.

- American Express (AXP) (20%), Bank of America (BAC) (30%), JP Morgan Chase (JPM) (50%)
 - AXP (20%), BAC (60%), JPM (20%)
 - AXP (50%), BAC (30%), JPM (20%)
 - Which portfolio would an investor who likes to gamble choose? Explain.
 - Which portfolio would a risk-averse investor choose? Explain.
- 7.67** a. Alcoa (AA) (25%), Home Depot (HD) (25%), International Business Machines (IBM) (25%), Travelers (TRV) (25%)
b. AA (10%), HD (50%), IBM (20%), TRV (20%)
c. AA (30%), HD (20%), IBM (10%), TRV (40%)
d. Which portfolio would a gambler choose? Explain.
e. Which portfolio would a risk-averse investor choose? Explain.

- 7.68** a. Cisco Systems (CSCO)(25%), Disney (DIS) (25%), General Electric (GE) (25%), Wal-Mart Stores (WMT) (25%)
 b. CSCO (10%), DIS (20%), GE (30%), WMT (40%)
 c. CSCO (55%), DIS (15%), GE (15%), WMT (15%)
 d. Explain why the choice of which portfolio to invest in is obvious.
- 7.69** a. Boeing (BA) (25%), Caterpillar (CAT) (25%), Chevron (CVX) (25%), Coca-Cola (KO) (25%)
 b. BA (10%), CAT (20%), CVX (20%), KO (50%)
 c. BA (15%), CAT (55%), CVX (15%), KO (15%)
 d. Which portfolio would a gambler choose? Explain.
 e. Which portfolio would a risk-averse investor choose? Explain.
- 7.70** a. Du Pont (DD) (25%), Exxon (XOM) (25%), Verizon Communications (VZ), (25%), Intel (INTC) (25%)
 b. DD (40%), XOM (30%), VZ (20%), INTC (10%)
 c. DD (10%), XOM (20%), VZ (30%), INTC (40%)
 d. Which portfolio would a gambler choose? Explain.
 e. Which portfolio would a risk-averse investor choose? Explain.
- 7.71** a. Johnson & Johnson (JNJ) (25%), McDonald's (MCD) (25%), Merck (MRK) (25%), Microsoft (MSFT) (25%)
 b. JNJ (10%), MCD (30%), MRK (10%), MSFT (50%)
 c. JNJ (10%), MCD (70%), MRK (10%), MSFT (0%)
 d. Explain why the choice of which portfolio to invest in is obvious.
- 7.72** a. Pfizer (PFE) (25%), Proctor & Gamble (PG) (25%), United Technologies (UTX) (25%), United Health (UNH) (25%)
 b. PFE (40%), PG (30%), UTX (20%), UNH (10%)
 c. PFE (15%), PG (55%), UTX (15%), UNH (15%)
 d. Which portfolio would a gambler choose? Explain.
 e. Which portfolio would a risk-averse investor choose? Explain.

XR07-TSE Monthly returns for the following selected stocks on the Toronto Stock Exchange were recorded for the years 2008 to 2012:

Barrick Gold (ABX), Bombardier (BBD.B), Bell Canada Enterprises (BCE), Bank of Montreal (BMO), Bank of Nova Scotia (BNS), Canadian Imperial Bank of Commerce (CM),

Canadian National Railways (CNR), Canadian Oil Sands (COS), Canadian Tire (CTC.A), Encana (ECA), Enbridge (ENB), Manulife Financial (MFG), Magna International (MG), Potash Corporation of Saskatchewan (POT), Power Corporation of Canada (POW), Research in Motion (RIM), Rogers Communication (RCI.B), Royal Bank of Canada (RY), Shaw Communications (SJR.B), Suncor Energy (SU), Telus (T), Tim Horton's (THI)

For Exercises 7.73 to 7.76, calculate the mean and standard deviation of the portfolio. The proportions invested in each stock are shown in parentheses.

- 7.73** a. Barrick Gold (ABX) (25%), Bombardier (BBD.B) (25%), Bell Canada Enterprises (BCE) (25%), Bank of Montreal (BMO) (25%)
 b. ABX (50%), BBD.B (10%), BCE (10%), BMO (30%)
 c. ABX (10%), BBD.B (40%), BCE (40%), BMO (10%)
 d. Which portfolio would a gambler choose? Explain.
 e. Which portfolio would a risk-averse investor choose? Explain.
- 7.74** a. Rogers Communication (RCI.B) (25%), Royal Bank of Canada (RY) (25%), Shaw Communications (SJR.B) (25%), Suncor Energy (SU) (25%)
 b. RCI.B (10%), RY (50%), SJR.B (30%), (SU) (10%)
 c. RCI.B (20%), RY (40%), SJR.B (30%), (SU) (10%)
 d. Which portfolio would a gambler choose? Explain.
 e. Which portfolio would a risk-averse investor choose? Explain.
- 7.75** a. Canadian Imperial Bank of Commerce (CM) (25%), Enbridge (ENB) (25%), Potash Corporation of Saskatchewan (POT) (25%), Power Corporation of Canada (POW) (25%)
 b. CM (15%), ENB (55%), POT (15%), POW (15%)
 c. CM (10%), ENB (20%), POT (30%), POW (40%)
 d. Explain why the choice of which portfolio to invest in is obvious.
- 7.76** a. Bank of Nova Scotia (BNS) (25%), Canadian National Railways (CNR) (25%), (25%), Canadian Tire (CTC.A) (25%), Magna International (MG) (25%)
 b. BNS (20%), CNR (60%), CTC.A (10%), MG (10%)
 c. BNS (40%), CNR (30%), CTC.A (20%), MG (10%)
 d. Explain why the choice of which portfolio to invest in is obvious.

7.77 Refer to Exercise 7.76. Suppose you want the expected value to be at least 1%. Try several sets of proportions (remember they must add to 1.0) to see if you can find the portfolio with the smallest variance.

7.78 Refer to Exercise 7.76.

- Compute the expected value and variance of the portfolio described next.
BNS (4.9%), CNR (65.1%), CTC.A (27.5%), MG (2.5%)
- Can you do better? That is, can you find a portfolio whose expected value is greater than or equal to 1% and whose variance is less than the one you calculated in part (a)? (*Hint:* Don't spend too much time at this. You won't be able to do better. If you want to learn how we produced the portfolio above, take a course that teaches linear and nonlinear programming.)

XR07-NASDAQ We calculated the returns on the following selected stocks on the NASDAQ Exchange for the period January 2008 to December 2012:

Adobe Systems (ADBE), Amazon (AMZN), Amgen (AMGN), Apple (AAPL), Bed Bath & Beyond (BBBY), Cisco Systems (CSCO), Comcast (CMCSA), Costco Wholesale (COST), Dell (DELL), Dollar Tree (DLTR), Expedia (EXPE), Garmin (GRMN), Google (GOOG), Intel (INTC), Mattel (MAT), Microsoft (MSFT), Netflix (NFLX), Oracle (ORCL), Research in Motion (RIMM), ScanDisk (SNDK), Sirius XM Radio (SIRI), Staples (SPLS), Starbucks (SBUX), Whole Foods Market (WFM), Wynn Resorts (WYNN), Yahoo (YHOO)

For Exercises 7.79 to 7.81 calculate the mean and standard deviation of the portfolio. The proportions invested in each stock are shown in parentheses.

- Bed Bath & Beyond (BBBY) (25%), Expedia (EXPE) (25%), Mattel (MAT) (25%), Starbucks (SBUX) (25%)
- BBBY (40%), EXPE (30%), MAT (20%), SBUX (10%)
- BBBY (10%), EXPE (20%), MAT (30%), SBUX (40%)

d. Explain why the choice of which portfolio to invest in is obvious.

- Netflix (NFLX) (25%), ScanDisk (SNDK) (25%), Sirius XM Radio (SIRI) (25%), Wynn Resorts (WYNN) (25%)
- NFLX (15%), SNDK (15%), SIRI (15%), WYNN (55%)
- NFLX (20%), SNDK (20%), SIRI (50%), WYNN (10%)
- Which portfolio would a gambler choose? Explain.
- Which portfolio would a risk-averse investor choose? Explain.

- Amazon (AMZN) (25%), Apple (AAPL) (25%), Dell (DELL) (25%), Dollar Tree (DLTR) (25%)
- AMZN (10%), AAPL (20%), DELL (30%), DLTR (40%)
- AMZN (40%), AAPL (40%), DELL (10%), DLTR (10%)
- Which portfolio would a gambler choose? Explain.
- Which portfolio would a risk-averse investor choose? Explain.

- Refer to Exercise 7.81. Suppose you want the expected value to be at least 2%. Try several sets of proportions (remember they must add to 1.0) to see if you can find the portfolio with the smallest variance.

7.83 Refer to Exercise 7.81.

- Compute the expected value and variance of the portfolio described next.
AMZN (20.4%), AAPL (8.3%), DELL (9.4%), DLTR (62%)
- Can you do better? That is, can you find a portfolio whose expected value is greater than or equal to 2% and whose variance is less than the one you calculated in part (a)? (*Hint:* Don't spend too much time at this. You won't be able to do better. If you want to learn how we produced the portfolio above, take a course that teaches linear and nonlinear programming.)

7-4 BINOMIAL DISTRIBUTION

Now that we've introduced probability distributions in general, we need to introduce several specific probability distributions. In this section, we present the *binomial distribution*.

The binomial distribution is the result of a *binomial experiment*, which has the following properties.

Binomial Experiment

1. The **binomial experiment** consists of a fixed number of trials. We represent the number of trials by n .
2. Each trial has two possible outcomes. We label one outcome a *success*, and the other a *failure*.
3. The probability of success is p . The probability of failure is $1 - p$.
4. The trials are independent, which means that the outcome of one trial does not affect the outcomes of any other trials.

If properties 2, 3, and 4 are satisfied, we say that each trial is a **Bernoulli process**. Adding property 1 yields the binomial experiment. The random variable of a binomial experiment is defined as the number of successes in the n trials. It is called the **binomial random variable**. Here are several examples of binomial experiments.

- 1.** Flip a coin 10 times. The two outcomes per trial are heads and tails. The terms *success* and *failure* are arbitrary. We can label either outcome success. However, generally, we call success anything we're looking for. For example, if we were betting on heads, we would label heads a success. If the coin is fair, the probability of heads is 50%. Thus, $p = .5$. Finally, we can see that the trials are independent because the outcome of one coin flip cannot possibly affect the outcomes of other flips.
- 2.** Draw five cards out of a shuffled deck. We can label as success whatever card we seek. For example, if we wish to know the probability of receiving five clubs, a club is labeled a success. On the first draw, the probability of a club is $13/52 = .25$. However, if we draw a second card without replacing the first card and shuffling, the trials are not independent. To see why, suppose that the first draw is a club. If we draw again without replacement the probability of drawing a second club is $12/51$, which is not $.25$. In this experiment, the trials are *not* independent.* Hence, this is not a binomial experiment. However, if we replace the card and shuffle before drawing again, the experiment is binomial. Note that in most card games, we do not replace the card, and as a result the experiment is not binomial.
- 3.** A political survey asks 1,500 voters who they intend to vote for in an approaching election. In most elections in the United States, there are only two candidates, the Republican and Democratic nominees. Thus, we have two outcomes per trial. The trials are independent because the choice of one voter does not affect the choice of other voters. In Canada, and in other countries with parliamentary systems of government, there are usually several candidates in the race. However, we can label a vote for our favored candidate (or the party that is paying us to do the survey) a success and all the others are failures.

As you will discover, the third example is a very common application of statistical inference. The actual value of p is unknown, and the job of the statistics practitioner is to estimate its value. By understanding the probability distribution that uses p , we will be able to develop the statistical tools to estimate p .

*The hypergeometric distribution described in Keller's website Appendix of the same name is used to calculate probabilities in such cases.

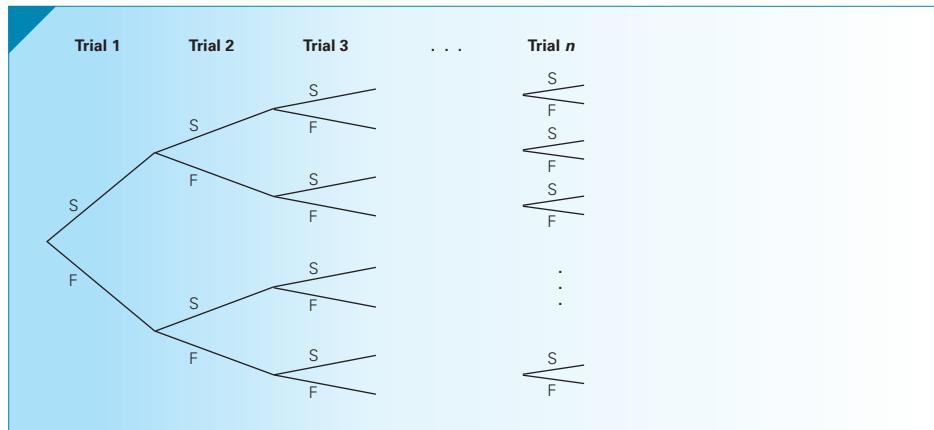
7-4a Binomial Random Variable

The binomial random variable is the number of successes in the experiment's n trials. It can take on values $0, 1, 2, \dots, n$. Thus, the random variable is discrete. To proceed, we must be capable of calculating the probability associated with each value.

Using a probability tree, we draw a series of branches as depicted in Figure 7.2. The stages represent the outcomes for each of the n trials. At each stage, there are two branches representing success and failure. To calculate the probability that there are X successes in n trials, we note that for each success in the sequence, we must multiply by p . And if there are X successes, there must be $n - X$ failures. For each failure in the sequence, we multiply by $1 - p$. Thus, the probability for each sequence of branches that represent x successes and $n - x$ failures has probability

$$p^x(1 - p)^{n-x}$$

FIGURE 7.2 Probability Tree for a Binomial Experiment



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There are a number of branches that yield x successes and $n - x$ failures. For example, there are two ways to produce exactly one success and one failure in two trials: SF and FS. To count the number of branch sequences that produce x successes and $n - x$ failures, we use the combinatorial formula

$$C_x^n = \frac{n!}{x!(n-x)!}$$

where $n! = n(n - 1)(n - 2) \dots (2)(1)$. For example, $3! = 3(2)(1) = 6$. Incidentally, although it may not appear to be logical $0! = 1$.

Pulling together the two components of the probability distribution yields the following.

Binomial Probability Distribution

The probability of x successes in a binomial experiment with n trials and probability of success = p is

$$P(x) = \frac{n!}{x!(n-x)!} p^x(1 - p)^{n-x} \text{ for } x = 0, 1, 2, \dots, n$$

EXAMPLE 7.9**Pat Statsdud and the Statistics Quiz**

Pat Statsdud is a student taking a statistics course. Unfortunately, Pat is not a good student. Pat does not read the textbook before class, does not do homework, and regularly misses class. Pat intends to rely on luck to pass the next quiz. The quiz consists of 10 multiple-choice questions. Each question has five possible answers, only one of which is correct. Pat plans to guess the answer to each question.

- What is the probability that Pat gets no answers correct?
- What is the probability that Pat gets two answers correct?

SOLUTION:

The experiment consists of 10 identical trials, each with two possible outcomes and where success is defined as a correct answer. Because Pat intends to guess, the probability of success is $1/5$ or $.2$. Finally, the trials are independent because the outcome of any of the questions does not affect the outcomes of any other questions. These four properties tell us that the experiment is binomial with $n = 10$ and $p = .2$.

- From

$$P(x) = \frac{n!}{x!(n-x)!} p^x (1-p)^{n-x}$$

we produce the probability of no successes by letting $n = 10$, $p = .2$, and $x = 0$. Hence,

$$P(0) = \frac{10!}{0!(10-0)!} (.2)^0 (1-.2)^{10-0}$$

The combinatorial part of the formula is $\frac{10!}{0!10!}$, which is 1. This is the number of ways to get 0 correct and 10 incorrect. Obviously, there is only one way to produce $X = 0$. And because $(.2)^0 = 1$,

$$P(X = 0) = 1(1)(.8)^{10} = .1074$$

- The probability of two correct answers is computed similarly by substituting $n = 10$, $p = .2$, and $x = 2$:

$$\begin{aligned} P(x) &= \frac{n!}{x!(n-x)!} p^x (1-p)^{n-x} \\ P(0) &= \frac{10!}{2!(10-2)!} (.2)^2 (1-.2)^{10-2} \\ &= \frac{(10)(9)(8)(7)(6)(5)(4)(3)(2)(1)}{(2)(1)(8)(7)(6)(5)(4)(3)(2)(1)} (.04)(.1678) \\ &= 45(.006712) \\ &= .3020 \end{aligned}$$

In this calculation, we discovered that there are 45 ways to get exactly two correct and eight incorrect answers, and that each such outcome has probability $.006712$. Multiplying the two numbers produces a probability of $.3020$.

7-4b Cumulative Probability

The formula of the binomial distribution allows us to determine the probability that X equals individual values. In Example 7.9, the values of interest were 0 and 2. There are

many circumstances where we wish to find the probability that a random variable is less than or equal to a value; that is, we want to determine $P(X \leq x)$, where x is that value. Such a probability is called a **cumulative probability**.

EXAMPLE 7.10

Will Pat Fail the Quiz?

Find the probability that Pat fails the quiz. A mark is considered a failure if it is less than 50%.

SOLUTION:

In this quiz, a mark of less than 5 is a failure. Because the marks must be integers, a mark of 4 or less is a failure. We wish to determine $P(X \leq 4)$. So,

$$P(X \leq 4) = P(0) + P(1) + P(2) + P(3) + P(4)$$

From Example 7.9, we know $P(0) = .1074$ and $P(2) = .3020$. Using the binomial formula, we find $P(1) = .2684$, $P(3) = .2013$, and $P(4) = .0881$. Thus

$$P(X \leq 4) = .1074 + .2684 + .3020 + .2013 + .0881 = .9672$$

There is a 96.72% probability that Pat will fail the quiz by guessing the answer for each question.

7-4c Binomial Table

There is another way to determine binomial probabilities. Table 1 in Appendix B provides cumulative binomial probabilities for selected values of n and p . We can use this table to answer the question in Example 7.10, where we need $P(X \leq 4)$. Refer to Table 1, find $n = 10$, and in that table find $p = .20$. The values in that column are $P(X \leq x)$ for $x = 0, 1, 2, \dots, 10$, which are shown in Table 7.2.

TABLE 7.2 Cumulative Binomial Probabilities with $n = 10$ and $p = .2$

x	$P(X \leq x)$
0	.1074
1	.3758
2	.6778
3	.8791
4	.9672
5	.9936
6	.9991
7	.9999
8	1.000
9	1.000
10	1.000

The first cumulative probability is $P(X \leq 0)$, which is $P(0) = .1074$. The probability we need for Example 7.10 is $P(X \leq 4) = .9672$, which is the same value we obtained manually.

We can use the table and the complement rule to determine probabilities of the type $P(X \geq x)$. For example, to find the probability that Pat will pass the quiz, we note that

$$P(X \leq 4) + P(X \geq 5) = 1$$

Thus,

$$P(X \geq 5) = 1 - P(X \leq 4) = 1 - .9672 = .0328$$

Using Table 1 to Find the Binomial Probability $P(X \geq x)$

$$P(X \geq x) = 1 - P(X \leq [x - 1])$$

The table is also useful in determining the probability of an individual value of X . For example, to find the probability that Pat will get exactly two right answers we note that

$$P(X \leq 2) = P(0) + P(1) + P(2)$$

and

$$P(X \leq 1) = P(0) + P(1)$$

The difference between these two cumulative probabilities is $p(2)$. Thus,

$$P(2) = P(X \leq 2) - P(X \leq 1) = .6778 - .3758 = .3020$$

Using Table 1 to Find the Binomial Probability $P(X = x)$

$$P(x) = P(X \leq x) - P(X \leq [x - 1])$$

Using the Computer

EXAMPLE

INSTRUCTIONS

Type the following into any empty cell:

=BINOMDIST([x], [n], [p], [True] or [False])

Typing “True” calculates a cumulative probability and typing “False” computes the probability of an individual value of X . For Example 7.9(a), type

=BINOMDIST(0, 10, .2, False)

For Example 7.10, enter

=BINOMDIST(4, 10, .2, True)

MINITAB**INSTRUCTIONS**

This is the first of seven probability distributions for which we provide instructions. All work in the same way. Click **Calc**, **Probability Distributions**, and the specific distribution whose probability you wish to compute. In this case, select **Binomial . . .**. Check either **Probability** or **Cumulative probability**. If you wish to make a probability statement about one value of x , specify **Input constant** and type the value of x .

If you wish to make probability statements about several values of x from the same binomial distribution, type the values of x into a column before checking **Calc**. Choose **Input column** and type the name of the column. Finally, enter the components of the distribution. For the binomial, enter the **Number of trials n** and the **Event Probability p** .

For the other six distributions, we list the distribution (here it is **Binomial**) and the components only (for this distribution it is n and p).

7-4d Mean and Variance of a Binomial Distribution

Statisticians have developed general formulas for the mean, variance, and standard deviation of a binomial random variable. They are

$$\begin{aligned}\mu &= np \\ \sigma^2 &= np(1 - p) \\ \sigma &= \sqrt{np(1 - p)}\end{aligned}$$

EXAMPLE 7.11

Pat Statsdud Has Been Cloned!

Suppose that a professor has a class full of students like Pat (a nightmare!). What is the mean mark? What is the standard deviation?

SOLUTION:

The mean mark for a class of Pat Statsduds is

$$\mu = np = 10(.2) = 2$$

The standard deviation is

$$\sigma = \sqrt{np(1 - p)} = \sqrt{10(.2)(1 - .2)} = 1.26$$


EXERCISES

- 7.84** Given a binomial random variable with $n = 10$ and $p = .3$, use the formula to find the following probabilities.
- $P(X = 3)$
 - $P(X = 5)$
 - $P(X = 8)$
- 7.85** Repeat Exercise 7.84 using Table 1 in Appendix B.
- 7.86** Repeat Exercise 7.84 using Excel or Minitab.
- 7.87** Given a binomial random variable with $n = 6$ and $p = .2$, use the formula to find the following probabilities.
- $P(X = 2)$
 - $P(X = 3)$
 - $P(X = 5)$

- 7.88** Repeat Exercise 7.87 using Table 1 in Appendix B.
- 7.89** Repeat Exercise 7.87 using Excel or Minitab.
- 7.90** Suppose X is a binomial random variable with $n = 25$ and $p = .7$. Use Table 1 to find the following.
- $P(X = 18)$
 - $P(X = 15)$
 - $P(X \leq 20)$
 - $P(X \geq 16)$
- 7.91** Repeat Exercise 7.90 using Excel or Minitab.
- 7.92** A sign on the gas pumps of a chain of gasoline stations encourages customers to have their oil checked with the claim that one out of four cars needs to have oil added. If this is true, what is the probability of the following events?
- One out of the next four cars needs oil
 - Two out of the next eight cars need oil
 - Three out of the next 12 cars need oil
- 7.93** The leading brand of dishwasher detergent has a 30% market share. A sample of 25 dishwasher detergent customers was taken. What is the probability that 10 or fewer customers chose the leading brand?
- 7.94** A certain type of tomato seed germinates 90% of the time. A backyard farmer planted 25 seeds.
- What is the probability that exactly 20 germinate?
 - What is the probability that 20 or more germinate?
 - What is the probability that 24 or fewer germinate?
 - What is the expected number of seeds that germinate?
- 7.95** According to the American Academy of Cosmetic Dentistry, 75% of adults believe that an unattractive smile hurts career success. Suppose that 25 adults are randomly selected. What is the probability that 15 or more of them would agree with the claim?
- 7.96** A student majoring in accounting is trying to decide on the number of firms to which he should apply. Given his work experience and grades, he can expect to receive a job offer from 70% of the firms to which he applies. The student decides to apply to only four firms. What is the probability that he receives no job offers?
- 7.97** In the United States, voters who are neither Democrat nor Republican are called Independents. It is believed that 10% of all voters are Independents. A survey asked 25 people to identify themselves as Democrat, Republican, or Independent.
- What is the probability that none of the people are Independent?
 - What is the probability that fewer than five people are Independent?
 - What is the probability that more than two people are Independent?
- 7.98** Most dial-up Internet service providers (ISPs) attempt to provide a large enough service so that customers seldom encounter a busy signal. Suppose that the customers of one ISP encounter busy signals 8% of the time. During the week, a customer of this ISP called 25 times. What is the probability that she did not encounter any busy signals?
- 7.99** Major software manufacturers offer a help line that allows customers to call and receive assistance in solving their problems. However, because of the volume of calls, customers frequently are put on hold. One software manufacturer claims that only 20% of callers are put on hold. Suppose that 100 customers call. What is the probability that more than 25 of them are put on hold?
- 7.100** A statistics practitioner working for major league baseball determined the probability that the hitter will be out on ground balls is .75. In a game where there are 20 ground balls, find the probability that all of them were outs.
- The following exercises are best solved with a computer:*
- 7.101** The probability of winning a game of craps (a dice-throwing game played in casinos) is 244/495.
- What is the probability of winning 5 or more times in 10 games?
 - What is the expected number of wins in 100 games?
- 7.102** In the game of blackjack as played in casinos in Las Vegas, Atlantic City, and Niagara Falls, as well as in many other cities, the dealer has the advantage. Most players do not play very well. As a result, the probability that the average player wins a hand is about 45%. Find the probability that an average player wins.
- Twice in 5 hands
 - Ten or more times in 25 hands
- 7.103** Several books teach blackjack players the “basic strategy,” which increases the probability of winning any hand to 50%. Repeat Exercise 7.102, assuming the player plays the basic strategy.
- 7.104** The best way of winning at blackjack is to “case the deck,” which involves counting 10s, non-10s, and aces. For card counters, the probability of winning a hand may increase to 52%. Repeat Exercise 7.102 for a card counter.
- 7.105** In the game of roulette, a steel ball is rolled onto a wheel that contains 18 red, 18 black, and 2 green slots. If the ball is rolled 25 times, find the probabilities of the following events.
- The ball falls into the green slots two or more times.
 - The ball does not fall into any green slots.
 - The ball falls into black slots 15 or more times.
 - The ball falls into red slots 10 or fewer times.

7.106 According to a Gallup Poll conducted March 5–7, 2001, 52% of American adults think that protecting the environment should be given priority over developing U.S. energy supplies. Thirty-six percent think that developing energy supplies is more important, and 6% believe the two are equally important. The rest had no opinion. Suppose that a sample of 100 American adults is quizzed on the subject. What is the probability of the following events?

- Fifty or more think that protecting the environment should be given priority.
- Thirty or fewer think that developing energy supplies is more important.
- Five or fewer have no opinion.

7.107 In a *Bon Appetit* poll, 38% of people said that chocolate was their favorite flavor of ice cream. A sample

of 20 people was asked to name their favorite flavor of ice cream. What is the probability that half or more of them prefer chocolate?

7.108 The statistics practitioner in Exercise 7.100 also determined that if a batter hits a line drive, the probability of an out is .23. Determine the following probabilities.

- In a game with 10 line drives, at least 5 are outs.
- In a game with 25 line drives, there are 5 outs or less.

7.109 According to the last census, 45% of working women held full-time jobs in 2002. If a random sample of 50 working women is drawn, what is the probability that 19 or more hold full-time jobs?

7-5 / POISSON DISTRIBUTION

Another useful discrete probability distribution is the **Poisson distribution**, named after its French creator. Like the binomial random variable, the **Poisson random variable** is the number of occurrences of events, which we'll continue to call *successes*. The difference between the two random variables is that a binomial random variable is the number of successes in a set number of trials, whereas a Poisson random variable is the number of successes in an interval of time or specific region of space. Here are several examples of Poisson random variables.

- 1.** The number of cars arriving at a service station in 1 hour. (The interval of time is 1 hour.)
- 2.** The number of flaws in a bolt of cloth. (The specific region is a bolt of cloth.)
- 3.** The number of accidents in 1 day on a particular stretch of highway. (The interval is defined by both time, 1 day, and space, the particular stretch of highway.)

The Poisson experiment is described in the box.

Poisson Experiment

A **Poisson experiment** is characterized by the following properties:

1. The number of successes that occur in any interval is independent of the number of successes that occur in any other interval.
2. The probability of a success in an interval is the same for all equal-size intervals.
3. The probability of a success in an interval is proportional to the size of the interval.
4. The probability of more than one success in an interval approaches 0 as the interval becomes smaller.

Poisson Random Variable

The **Poisson random variable** is the number of successes that occur in a period of time or an interval of space in a Poisson experiment.

There are several ways to derive the probability distribution of a Poisson random variable. However, all are beyond the mathematical level of this book. We simply provide the formula and illustrate how it is used.

Poisson Probability Distribution

The probability that a Poisson random variable assumes a value of x in a specific interval is

$$P(x) = \frac{e^{-\mu}\mu^x}{x!} \quad \text{for } x = 0, 1, 2, \dots$$

where μ is the mean number of successes in the interval or region and e is the base of the natural logarithm (approximately 2.71828). Incidentally, the variance of a Poisson random variable is equal to its mean; that is, $\sigma^2 = \mu$.

EXAMPLE 7.12

Probability of the Number of Typographical Errors in Textbooks

A statistics instructor has observed that the number of typographical errors in new editions of textbooks varies considerably from book to book. After some analysis, he concludes that the number of errors is Poisson distributed with a mean of 1.5 per 100 pages. The instructor randomly selects 100 pages of a new book. What is the probability that there are no typographical errors?

SOLUTION:

We want to determine the probability that a Poisson random variable with a mean of 1.5 is equal to 0. Using the formula

$$P(x) = \frac{e^{-\mu}\mu^x}{x!}$$

and substituting $x = 0$ and $\mu = 1.5$, we get

$$P(0) = \frac{e^{-1.5}1.5^0}{0!} = \frac{(2.71828)^{-1.5}(1)}{1} = .2231$$

The probability that in the 100 pages selected there are no errors is .2231.

Notice that in Example 7.12, we wanted to find the probability of 0 typographical errors in 100 pages given a mean of 1.5 typos in 100 pages. The next example illustrates how we calculate the probability of events where the intervals or regions do not match.

EXAMPLE 7.13**Probability of the Number of Typographical Errors in 400 Pages**

Refer to Example 7.12. Suppose that the instructor has just received a copy of a new statistics book. He notices that there are 400 pages.

- What is the probability that there are no typos?
- What is the probability that there are five or fewer typos?

SOLUTION:

The specific region that we're interested in is 400 pages. To calculate Poisson probabilities associated with this region, we must determine the mean number of typos per 400 pages. Because the mean is specified as 1.5 per 100 pages, we multiply this figure by 4 to convert to 400 pages. Thus, $\mu = 6$ typos per 400 pages.

- The probability of no typos is

$$P(0) = \frac{e^{-6}6^0}{0!} = \frac{(2.71828)^{-6}(1)}{1} = .002479$$

- We want to determine the probability that a Poisson random variable with a mean of 6 is 5 or less; that is, we want to calculate

$$P(X \leq 5) = P(0) + P(1) + P(2) + P(3) + P(4) + P(5)$$

To produce this probability, we need to compute the six probabilities in the summation.

$$P(0) = .002479$$

$$P(1) = \frac{e^{-\mu}\mu^x}{x!} = \frac{e^{-6}6^1}{1!} = \frac{(2.71828)^{-6}(6)}{1} = .01487$$

$$P(2) = \frac{e^{-\mu}\mu^x}{x!} = \frac{e^{-6}6^2}{2!} = \frac{(2.71828)^{-6}(36)}{2} = .04462$$

$$P(3) = \frac{e^{-\mu}\mu^x}{x!} = \frac{e^{-6}6^3}{3!} = \frac{(2.71828)^{-6}(216)}{6} = .08924$$

$$P(4) = \frac{e^{-\mu}\mu^x}{x!} = \frac{e^{-6}6^4}{4!} = \frac{(2.71828)^{-6}(1296)}{24} = .1339$$

$$P(5) = \frac{e^{-\mu}\mu^x}{x!} = \frac{e^{-6}6^5}{5!} = \frac{(2.71828)^{-6}(7776)}{120} = .1606$$

Thus,

$$\begin{aligned} P(X \leq 5) &= .002479 + .01487 + .04462 + .08924 + .1339 + .1606 \\ &= .4457 \end{aligned}$$

The probability of observing 5 or fewer typos in this book is .4457.

7-5a Poisson Table

As was the case with the binomial distribution, a table is available that makes it easier to compute Poisson probabilities of individual values of x as well as cumulative and related probabilities.

Table 2 in Appendix B provides cumulative Poisson probabilities for selected values of μ . This table makes it easy to find cumulative probabilities like those in Example 7.13, part (b), where we found $P(X \leq 5)$.

To do so, find $\mu = 6$ in Table 2. The values in that column are $P(X \leq x)$ for $x = 0, 1, 2, \dots, 18$ which are shown in Table 7.3.

TABLE 7.3 Cumulative Poisson Probabilities for $\mu = 6$

x	$P(X \leq x)$
0	.0025
1	.0174
2	.0620
3	.1512
4	.2851
5	.4457
6	.6063
7	.7440
8	.8472
9	.9161
10	.9574
11	.9799
12	.9912
13	.9964
14	.9986
15	.9995
16	.9998
17	.9999
18	1.0000

Theoretically, a Poisson random variable has no upper limit. The table provides cumulative probabilities until the sum is 1.0000 (using four decimal places).

The first cumulative probability is $P(X \leq 0)$, which is $P(0) = .0025$. The probability we need for Example 7.13, part (b), is $P(X \leq 5) = .4457$, which is the same value we obtained manually.

Like Table 1 for binomial probabilities, Table 2 can be used to determine probabilities of the type $P(X \geq x)$. For example, to find the probability that in Example 7.13 there are 6 or more typos, we note that $P(X \leq 5) + P(X \geq 6) = 1$. Thus,

$$P(X \geq 6) = 1 - P(X \leq 5) = 1 - .4457 = .5543$$

Using Table 2 to Find the Poisson Probability $P(X \geq x)$

$$P(X \geq x) = 1 - P(X \leq [x - 1])$$

We can also use the table to determine the probability of one individual value of X . For example, to find the probability that the book contains exactly 10 typos, we note that

$$P(X \leq 10) = P(0) + P(1) + \dots + P(9) + P(10)$$

and

$$P(X \leq 9) = P(0) + P(1) + \dots + P(9)$$

The difference between these two cumulative probabilities is $P(10)$. Thus,

$$P(10) = P(X \leq 10) - P(X \leq 9) = .9574 - .9161 = .0413$$

Using Table 2 to Find the Poisson Probability $P(X = x)$

$$P(x) = P(X \leq x) - P(X \leq [x - 1])$$

Using the Computer

EXCEL

INSTRUCTIONS

Type the following into any empty cell:

$$= \text{POISSON}([x], [\mu], [\text{True}] \text{ or } [\text{False}])$$

We calculate the probability in Example 7.12 by typing

$$= \text{POISSON}(0, 1.5, \text{False})$$

For Example 7.13, we type

$$= \text{POISSON}(5, 6, \text{True})$$

MINITAB

INSTRUCTIONS

Click **Calc**, **Probability Distributions**, and **Poisson . . .** and type the mean.



EXERCISES

- 7.110** Given a Poisson random variable with $\mu = 2$, use the formula to find the following probabilities.

- $P(X = 0)$
- $P(X = 3)$
- $P(X = 5)$

- 7.111** Given that X is a Poisson random variable with $\mu = .5$, use the formula to determine the following probabilities.

- $P(X = 0)$
- $P(X = 1)$
- $P(X = 2)$

- 7.112** The number of accidents that occur at a busy intersection is Poisson distributed with a mean of 3.5 per week. Find the probability of the following events.
- No accidents in one week
 - Five or more accidents in one week
 - One accident today
- 7.113** Snowfalls occur randomly and independently over the course of winter in a Minnesota city. The average is one snowfall every 3 days.
- What is the probability of five snowfalls in 2 weeks?
 - Find the probability of a snowfall today.
- 7.114** The number of students who seek assistance with their statistics assignments is Poisson distributed with a mean of two per day.
- What is the probability that no students seek assistance tomorrow?
 - Find the probability that 10 students seek assistance in a week.
- 7.115** Hits on a personal website occur quite infrequently. They occur randomly and independently with an average of five per week.
- Find the probability that the site gets 10 or more hits in a week.
 - Determine the probability that the site gets 20 or more hits in 2 weeks.
- 7.116** In older cities across North America, infrastructure is deteriorating, including water lines that supply homes and businesses. A report to the Toronto city council stated that there are on average 30 water line breaks per 100 kilometers per year in the city of Toronto. Outside of Toronto, the average number of breaks is 15 per 100 kilometers per year.
- Find the probability that in a stretch of 100 kilometers in Toronto there are 35 or more breaks next year.
 - Find the probability that there are 12 or fewer breaks in a stretch of 100 kilometers outside of Toronto next year.
- 7.117** The number of bank robberies that occur in a large North American city is Poisson distributed with a mean of 1.8 per day. Find the probabilities of the following events.
- Three or more bank robberies in a day
 - Between 10 and 15 (inclusive) robberies during a 5-day period
- 7.118** Flaws in a carpet tend to occur randomly and independently at a rate of one every 200 square feet. What is the probability that a carpet that is 8 feet by 10 feet contains no flaws?
- 7.119** Complaints about an Internet brokerage firm occur at a rate of five per day. The number of complaints appears to be Poisson distributed.
- Find the probability that the firm receives 10 or more complaints in a day.
 - Find the probability that the firm receives 25 or more complaints in a 5-day period.

APPLICATIONS in OPERATIONS MANAGEMENT



Waiting Lines

Everyone is familiar with waiting lines. We wait in line at banks, groceries, and fast-food restaurants. There are also waiting lines in firms where trucks wait to load and unload and on assembly lines where stations wait for new parts. Management scientists have developed mathematical models that allow managers to determine the operating characteristics of waiting lines. Some of the operating characteristics are

- The probability that there are no units in the system
- The average number of units in the waiting line
- The average time a unit spends in the waiting line
- The probability that an arriving unit must wait for service

The Poisson probability distribution is used extensively in waiting-line (also called *queueing*) models. Many models assume that the arrival of units for service is Poisson

(Continued)

distributed with a specific value of μ . In the next chapter, we will discuss the operating characteristics of waiting lines. Exercises 7.120–7.122 require the calculation of the probability of a number of arrivals.

- 7.120** The number of trucks crossing at the Ambassador Bridge connecting Detroit, Michigan, and Windsor, Ontario, is Poisson distributed with a mean of 1.5 per minute.
- What is the probability that in any 1-minute time span two or more trucks will cross the bridge?
 - What is the probability that fewer than four trucks will cross the bridge over the next 4 minutes?
- 7.121** Cars arriving for gasoline at a particular gas station follow a Poisson distribution with a mean of 5 per hour.
- Determine the probability that over the next hour only one car will arrive.
 - Compute the probability that in the next 3 hours more than 20 cars will arrive.
- 7.122** The number of users of an automatic banking machine is Poisson distributed. The mean number of users per 5-minute interval is 1.5. Find the probability of the following events.
- No users in the next 5 minutes
 - Five or fewer users in the next 15 minutes
 - Three or more users in the next 10 minutes

CHAPTER SUMMARY

There are two types of random variables. A **discrete random variable** is one whose values are countable. A **continuous random variable** can assume an uncountable number of values. In this chapter, we discussed discrete random variables and their **probability distributions**. We defined the **expected value**, **variance**, and **standard**

deviation of a population represented by a discrete probability distribution. Also introduced in this chapter were **bivariate discrete distributions** on which an important application in finance was based. Finally, the two most important discrete distributions—the **binomial** and the **Poisson**—were presented.

IMPORTANT TERMS:

Random variable	214	Diversification	233
Discrete random variable	215	Binomial experiment	241
Continuous random variable	215	Bernoulli process	241
Probability distribution	215	Binomial random variable	241
Expected value	219	Binomial probability distribution	242
Bivariate distribution	225	Cumulative probability	244
PERT (Project Evaluation and Review Technique)	231	Poisson distribution	248
CPM (Critical Path Method)	231	Poisson random variable	248
Path	232	Poisson experiment	248
Critical path	232		

S Y M B O L S :

Symbol	Pronounced	Represents
$\sum_{\text{all } x} x$	Sum of x for all values of x	Summation
C_x^n	n choose x	Number of combinations
$n!$	n factorial	$n(n - 1)(n - 2) \cdots (3)(2)(1)$
e		2.71828 ...

F O R M U L A S :

Expected value (mean)

$$E(X) = \mu = \sum_{\text{all } x} xP(x)$$

Variance

$$V(x) = \sigma^2 = \sum_{\text{all } x} (x - \mu)^2 P(x)$$

Standard deviation

$$\sigma = \sqrt{\sigma^2}$$

Covariance

$$\text{COV}(X, Y) = \sigma_{xy} = \sum (x - \mu_x)(y - \mu_y)P(x, y)$$

Coefficient of Correlation

$$\rho = \frac{\text{COV}(X, Y)}{\sigma_x \sigma_y} = \frac{\sigma_{xy}}{\sigma_x \sigma_y}$$

Laws of expected value

1. $E(c) = c$
2. $E(X + c) = E(X) + c$
3. $E(cX) = cE(X)$

Laws of variance

1. $V(c) = 0$
2. $V(X + c) = V(X)$
3. $V(cX) = c^2 V(X)$

Laws of expected value and variance of the sum of two variables

1. $E(X + Y) = E(X) + E(Y)$
2. $V(X + Y) = V(X) + V(Y) + 2\text{COV}(X, Y)$

Laws of expected value and variance for the sum of k variables, where $k \geq 2$

1. $E(X_1 + X_2 + \cdots + X_k) = E(X_1) + E(X_2) + \cdots + E(X_k)$
2. $V(X_1 + X_2 + \cdots + X_k) = V(X_1) + V(X_2) + \cdots + V(X_k)$

if the variables are independent

Mean and variance of a portfolio of two stocks

$$\begin{aligned} E(R_p) &= w_1 E(R_1) + w_2 E(R_2) \\ V(R_p) &= w_1^2 V(R_1) + w_2^2 V(R_2) \\ &\quad + 2w_1 w_2 \text{COV}(R_1, R_2) \\ &= w_1^2 \sigma_1^2 + w_2^2 \sigma_2^2 + 2w_1 w_2 \rho \sigma_1 \sigma_2 \end{aligned}$$

Mean and variance of a portfolio of k stocks

$$\begin{aligned} E(R_p) &= \sum_{i=1}^k w_i E(R_i) \\ V(R_p) &= \sum_{i=1}^k w_i^2 \sigma_i^2 + 2 \sum_{i=1}^k \sum_{j=i+1}^k w_i w_j \text{COV}(R_i, R_j) \end{aligned}$$

Binomial probability

$$\begin{aligned} P(X = x) &= \frac{n!}{x!(n-x)!} p^x (1-p)^{n-x} \\ \mu &= np \\ \sigma^2 &= np(1-p) \\ \sigma &= \sqrt{np(1-p)} \end{aligned}$$

Poisson probability

$$P(X = x) = \frac{e^{-\mu} \mu^x}{x!}$$

C O M P U T E R I N S T R U C T I O N S :

Probability Distribution	Excel	Minitab
Binomial	245	246
Poisson	252	252

CHAPTER EXERCISES

7.123 In 2000, Northwest Airlines boasted that 77.4% of its flights were on time. If we select five Northwest flights at random, what is the probability that all five are on time? (Source: Department of Transportation.)

7.124 The final exam in a one-term statistics course is taken in the December exam period. Students who are sick or have other legitimate reasons for missing the exam are allowed to write a deferred exam scheduled for the first week in January. A statistics professor has observed that only 2% of all students legitimately miss the December final exam. Suppose that the professor has 40 students registered this term.

- How many students can the professor expect to miss the December exam?
- What is the probability that the professor will not have to create a deferred exam?

7.125 The number of magazine subscriptions per household is represented by the following probability distribution.

Magazine subscriptions per household

per household	0	1	2	3	4
Probability	.48	.35	.08	.05	.04

- Calculate the mean number of magazine subscriptions per household.
- Find the standard deviation.

7.126 The number of arrivals at a car wash is Poisson distributed with a mean of eight per hour.

- What is the probability that 10 cars will arrive in the next hour?
- What is the probability that more than 5 cars will arrive in the next hour?
- What is the probability that fewer than 12 cars will arrive in the next hour?

7.127 The percentage of customers who enter a restaurant and ask to be seated in a smoking section is 15%. Suppose that 100 people enter the restaurant.

- What is the expected number of people who request a smoking table?
- What is the standard deviation of the number of requests for a smoking table?
- What is the probability that 20 or more people request a smoking table?

7.128 Lotteries are an important income source for various governments around the world. However, the availability of lotteries and other forms of gambling

have created a social problem: gambling addicts. A critic of government-controlled gambling contends that 30% of people who regularly buy lottery tickets are gambling addicts. If we randomly select 10 people among those who report that they regularly buy lottery tickets, what is the probability that more than 5 of them are addicts?

7.129 The distribution of the number of home runs in soft-ball games is shown here.

Number of home runs	0	1	2	3	4	5
Probability	.05	.16	.41	.27	.07	.04

- Calculate the mean number of home runs.
- Find the standard deviation.

7.130 An auditor is preparing for a physical count of inventory as a means of verifying its value. Items counted are reconciled with a list prepared by the storeroom supervisor. In one particular firm, 20% of the items counted cannot be reconciled without reviewing invoices. The auditor selects 10 items. Find the probability that 6 or more items cannot be reconciled.

7.131 Shutouts in the National Hockey League occur randomly and independently at a rate of 1 every 20 games. Calculate the probability of the following events.

- 2 shutouts in the next 10 games
- 25 shutouts in 400 games
- a shutdown in tonight's game

7.132 Most Miami Beach restaurants offer "early-bird" specials. These are lower-priced meals that are available only from 4 to 6 p.m. However, not all customers who arrive between 4 and 6 p.m. order the special. In fact, only 70% do.

- Find the probability that of 80 customers between 4 and 6 p.m., more than 65 order the special.
- What is the expected number of customers who order the special?
- What is the standard deviation?

7.133 According to climatologists, the long-term average for Atlantic storms is 9.6 per season (June 1 to November 30), with 6 becoming hurricanes and 2.3 becoming intense hurricanes. Find the probability of the following events.

- Ten or more Atlantic storms
- Five or fewer hurricanes
- Three or more intense hurricanes

- 7.134** Researchers at the University of Pennsylvania School of Medicine theorized that children under 2 years old who sleep in rooms with the light on have a 40% probability of becoming myopic by age 16. Suppose that researchers found 25 children who slept with the light on before they were 2.
- What is the probability that 10 of them will become myopic before age 16?
 - What is the probability that fewer than 5 of them will become myopic before age 16?
 - What is the probability that more than 15 of them will become myopic before age 16?
- 7.135** A pharmaceutical researcher working on a cure for baldness noticed that middle-aged men who are balding at the crown of their head have a 45% probability of suffering a heart attack over the next decade. In a sample of 100 middle-age balding men, what are the following probabilities?
- More than 50 will suffer a heart attack in the next decade.
 - Fewer than 44 will suffer a heart attack in the next decade.
 - Exactly 45 will suffer a heart attack in the next decade.
- 7.136** Advertising researchers have developed a theory that states that commercials that appear in violent television shows are less likely to be remembered and will thus be less effective. After examining samples of viewers who watch violent and nonviolent programs and asking them a series of five questions about the commercials, the researchers produced the following probability distributions of the number of correct answers.
- | Viewers of violent shows | | | | | | |
|---------------------------------|-----|-----|-----|-----|-----|-----|
| x | 0 | 1 | 2 | 3 | 4 | 5 |
| $P(x)$ | .36 | .22 | .20 | .09 | .08 | .05 |
- | Viewers of nonviolent shows | | | | | | |
|------------------------------------|-----|-----|-----|-----|-----|-----|
| x | 0 | 1 | 2 | 3 | 4 | 5 |
| $P(x)$ | .15 | .18 | .23 | .26 | .10 | .08 |
- 7.137** According to the U.S. census, one-third of all businesses are owned by women. If we select 25 businesses at random, what is the probability that 10 or more of them are owned by women?
- 7.138** It is recommended that women age 40 and older have a mammogram annually. A recent report indicated that if a woman has annual mammograms over a 10-year period, there is a 60% probability that there will be at least one false-positive result. (A false-positive mammogram test result is one that indicates the presence of cancer when, in fact, there is no cancer.) If the annual test results are independent, what is the probability that in any one year a mammogram will produce a false-positive result? (*Hint:* Find the value of p such that the probability that a binomial random variable with $n = 10$ is greater than or equal to 1 is .60.)
- 7.139** In a recent election, the mayor received 60% of the vote. Last week, a survey was undertaken that asked 100 people whether they would vote for the mayor. Assuming that her popularity has not changed, what is the probability that more than 50 people in the sample would vote for the mayor?
- 7.140** When Earth traveled through the storm of meteorites trailing the comet Tempel-Tuttle on November 17, 1998, the storm was 1,000 times as intense as the average meteor storm. Before the comet arrived, telecommunication companies worried about the potential damage that might be inflicted on the approximately 650 satellites in orbit. It was estimated that each satellite had a 1% chance of being hit, causing damage to the satellite's electronic system. One company had five satellites in orbit at the time. Determine the probability distribution of the number of the company's satellites that would be damaged.

CASE 7.1**To Bunt or Not to Bunt, That Is the Question—Part 2**

In Case 6.2, we presented the probabilities of scoring at least one run and asked you to determine whether the manager should signal for the batter to sacrifice bunt. The decision was made on the basis of comparing the probability of scoring at least one run when the manager signaled for the bunt and when he signaled the batter to swing away. Another factor that should be incorporated into the decision is the *number* of runs the manager expects his team to score. In the same article referred to in Case 6.2, the author also computed the expected number of runs scored for each situation. Table 1 lists the expected

number of runs in situations that are defined by the number of outs and the bases occupied.

TABLE 1 Expected Number of Runs Scored

Bases Occupied	0 Out	1 Out	2 Outs
Bases empty	.49	.27	.10
First base	.85	.52	.23
Second base	1.06	.69	.34
Third base	1.21	.82	.38
First base and second base	1.46	1.00	.48
First base and third base	1.65	1.10	.51
Second base and third base	1.94	1.50	.62
Bases loaded	2.31	1.62	.82

AP Photo/Gene J. Puskar



Assume that the manager wishes to score as many runs as possible. Using the same probabilities of the four outcomes of a bunt listed in Case 6.2, determine whether the manager should signal the batter to sacrifice bunt.

8



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CONTINUOUS PROBABILITY DISTRIBUTIONS

- 8-1 *Probability Density Functions*
- 8-2 *Normal Distribution*
- 8-3 *(Optional) Exponential Distribution*
- 8-4 *Other Continuous Distributions*

Minimum GMAT Score to Enter Executive MBA Program

A university has just approved a new Executive MBA Program. The new director believes that to maintain the prestigious image of the business school, the new program must be seen as having high standards. Accordingly, the Faculty Council decides that one of the entrance requirements will be that applicants must score in the top 1% of Graduate Management Admission Test (GMAT) scores. The director knows that GMAT scores are normally distributed with a mean of 490 and a standard deviation of 61. The only thing she doesn't know is what the minimum GMAT score for admission should be.

After introducing the normal distribution, we will return to this question and answer it.



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See page 276.

INTRODUCTION

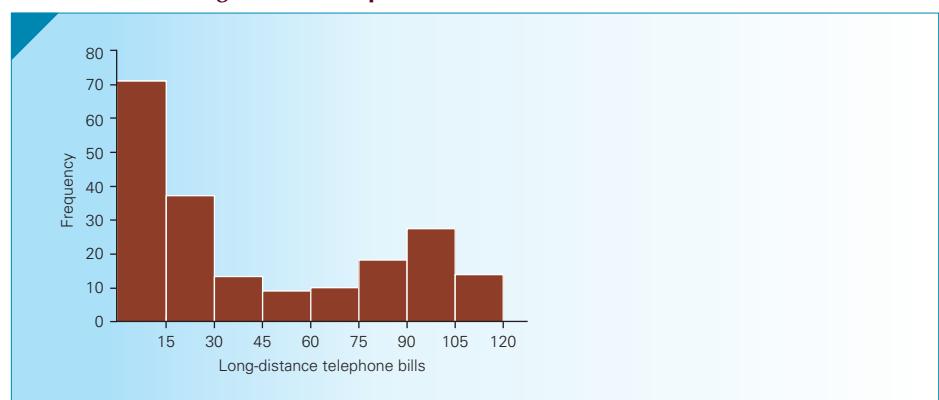
This chapter completes our presentation of probability by introducing continuous random variables and their distributions. In Chapter 7, we introduced discrete probability distributions that are employed to calculate the probability associated with discrete random variables. In Section 7-4, we introduced the binomial distribution, which allows us to determine the probability that the random variable equals a particular value (the number of successes). In this way we connected the population represented by the probability distribution with a sample of nominal data. In this chapter, we introduce continuous probability distributions, which are used to calculate the probability associated with an interval variable. By doing so, we develop the link between a population and a sample of interval data.

Section 8-1 introduces probability density functions and uses the uniform density function to demonstrate how probability is calculated. In Section 8-2, we focus on the normal distribution, one of the most important distributions because of its role in the development of statistical inference. Section 8-3 introduces the exponential distribution, a distribution that has proven to be useful in various management-science applications. Finally, in Section 8-4 we introduce three additional continuous distributions. They will be used in statistical inference throughout the book.

8-1 PROBABILITY DENSITY FUNCTIONS

A continuous random variable is one that can assume an uncountable number of values. Because this type of random variable is so different from a discrete variable, we need to treat it completely differently. First, we cannot list the possible values because there is an infinite number of them. Second, because there is an infinite number of values, the probability of each individual value is virtually 0. Consequently, we can determine the probability of only a range of values. To illustrate how this is done, consider the histogram we created for the long-distance telephone bills (Example 3.1), which is depicted in Figure 8.1.

FIGURE 8.1 Histogram for Example 3.1



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We found, for example, that the relative frequency of the interval 15 to 30 was 37/200. Using the relative frequency approach, we estimate that the probability that a

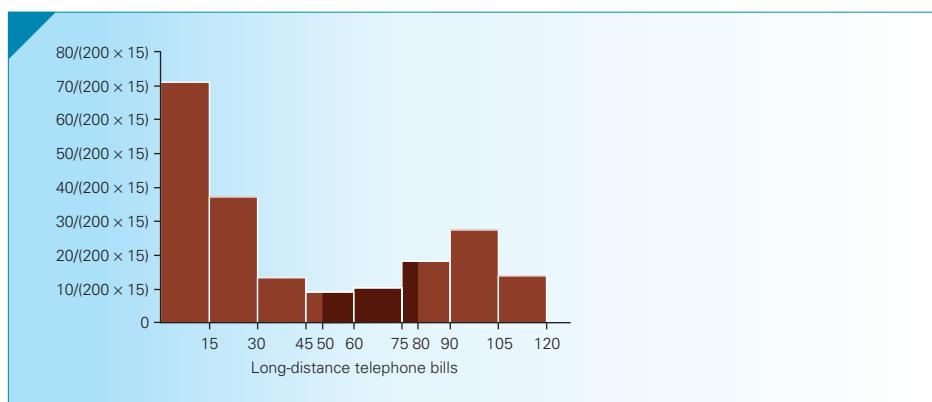
randomly selected long-distance bill will fall between \$15 and \$30 is $37/200 = .185$. We can similarly estimate the probabilities of the other intervals in the histogram.

Interval	Relative Frequency
$0 \leq X \leq 15$	71/200
$15 < X \leq 30$	37/200
$30 < X \leq 45$	13/200
$45 < X \leq 60$	9/200
$60 < X \leq 75$	10/200
$75 < X \leq 90$	18/200
$90 < X \leq 105$	28/200
$105 < X \leq 120$	14/200

Notice that the sum of the probabilities equals 1. To proceed, we set the values along the vertical axis so that the *area* in all the rectangles together adds to 1. We accomplish this by dividing each relative frequency by the width of the interval, which is 15. The result is a rectangle over each interval whose *area* equals the probability that the random variable will fall into that interval.

To determine probabilities of ranges other than the ones created when we drew the histogram, we apply the same approach. For example, the probability that a long-distance bill will fall between \$50 and \$80 is equal to the area between 50 and 80 as shown in Figure 8.2.

FIGURE 8.2 Histogram for Example 3.1: Relative Frequencies Divided by Interval Width



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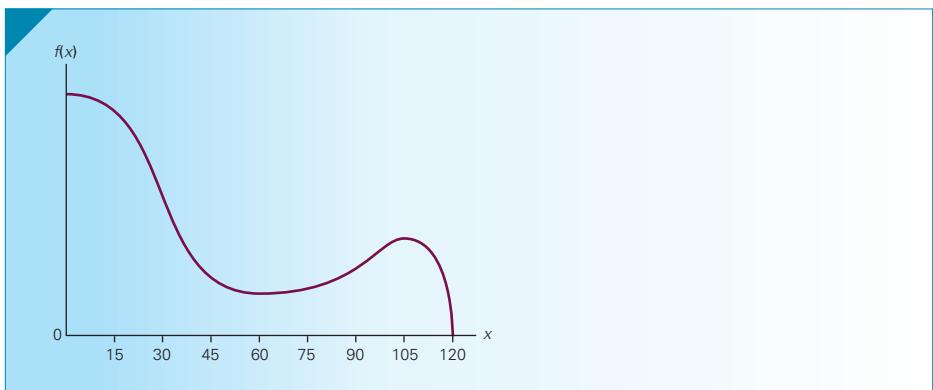
The areas in each shaded rectangle are calculated and added together as follows:

Interval	Height of Rectangle	Base Multiplied by Height
$50 < X \leq 60$	$9/(200 \times 15) = .00300$	$(60 - 50) \times .00300 = .030$
$60 < X \leq 75$	$10/(200 \times 15) = .00333$	$(75 - 60) \times .00333 = .050$
$75 < X \leq 80$	$18/(200 \times 15) = .00600$	$(80 - 75) \times .00600 = .030$
		Total = .110

We estimate that the probability that a randomly selected long-distance bill falls between \$50 and \$80 is .11.

If the histogram is drawn with a large number of small intervals, we can smooth the edges of the rectangles to produce a smooth curve as shown in Figure 8.3. In many cases, it is possible to determine a function $f(x)$ that approximates the curve. The function is called a **probability density function**. Its requirements are stated in the following box.

FIGURE 8.3 Density Function for Example 3.1



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Requirements for a Probability Density Function

The following requirements apply to a probability density function $f(x)$ whose range is $a \leq x \leq b$.

1. $f(x) \geq 0$ for all x between a and b
2. The total area under the curve between a and b is 1.0

Integral calculus* can often be used to calculate the area under a curve. Fortunately, the probabilities corresponding to continuous probability distributions that we deal with do not require this mathematical tool. The distributions will be either simple or too complex for calculus. Let's start with the simplest continuous distribution.

8-1a Uniform Distribution

To illustrate how we find the area under the curve that describes a probability density function, consider the **uniform probability distribution** also called the **rectangular probability distribution**.

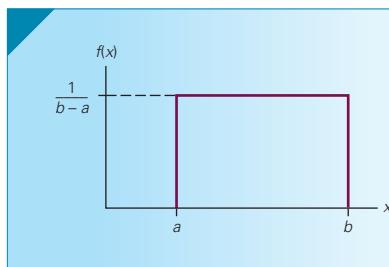
Uniform Probability Density Function

The uniform distribution is described by the function

$$f(x) = \frac{1}{b-a} \quad \text{where } a \leq x \leq b$$

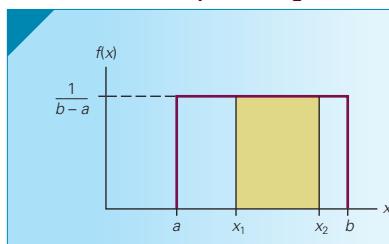
The function is graphed in Figure 8.4. You can see why the distribution is called *rectangular*.

*Keller's website Appendix Continuous Probability Distributions: Calculus Approach demonstrates how to use integral calculus to determine probabilities and parameters for continuous random variables.

FIGURE 8.4 Uniform Distribution

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To calculate the probability of any interval, simply find the area under the curve. For example, to find the probability that X falls between x_1 and x_2 determine the area in the rectangle whose base is $x_2 - x_1$ and whose height is $1/(b - a)$. Figure 8.5 depicts the area we wish to find. As you can see, it is a rectangle and the area of a rectangle is found by multiplying the base times the height.

FIGURE 8.5 $P(x_1 < X < x_2)$ 

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Thus,

$$P(x_1 < X < x_2) = \text{Base} \times \text{Height} = (x_2 - x_1) \times \frac{1}{b - a}$$

EXAMPLE 8.1

Uniformly Distributed Gasoline Sales

The amount of gasoline sold daily at a service station is uniformly distributed with a minimum of 2,000 gallons and a maximum of 5,000 gallons.

- Find the probability that daily sales will fall between 2,500 and 3,000 gallons.
- What is the probability that the service station will sell at least 4,000 gallons?
- What is the probability that the station will sell exactly 2,500 gallons?

SOLUTION:

The probability density function is

$$f(x) = \frac{1}{5000 - 2000} = \frac{1}{3000} \quad 2000 \leq x \leq 5000$$

- a. The probability that X falls between 2,500 and 3,000 is the area under the curve between 2,500 and 3,000 as depicted in Figure 8.6a. The area of a rectangle is the base times the height. Thus,

$$P(2,500 \leq X \leq 3,000) = (3,000 - 2,500) \times \left(\frac{1}{3,000}\right) = .1667$$

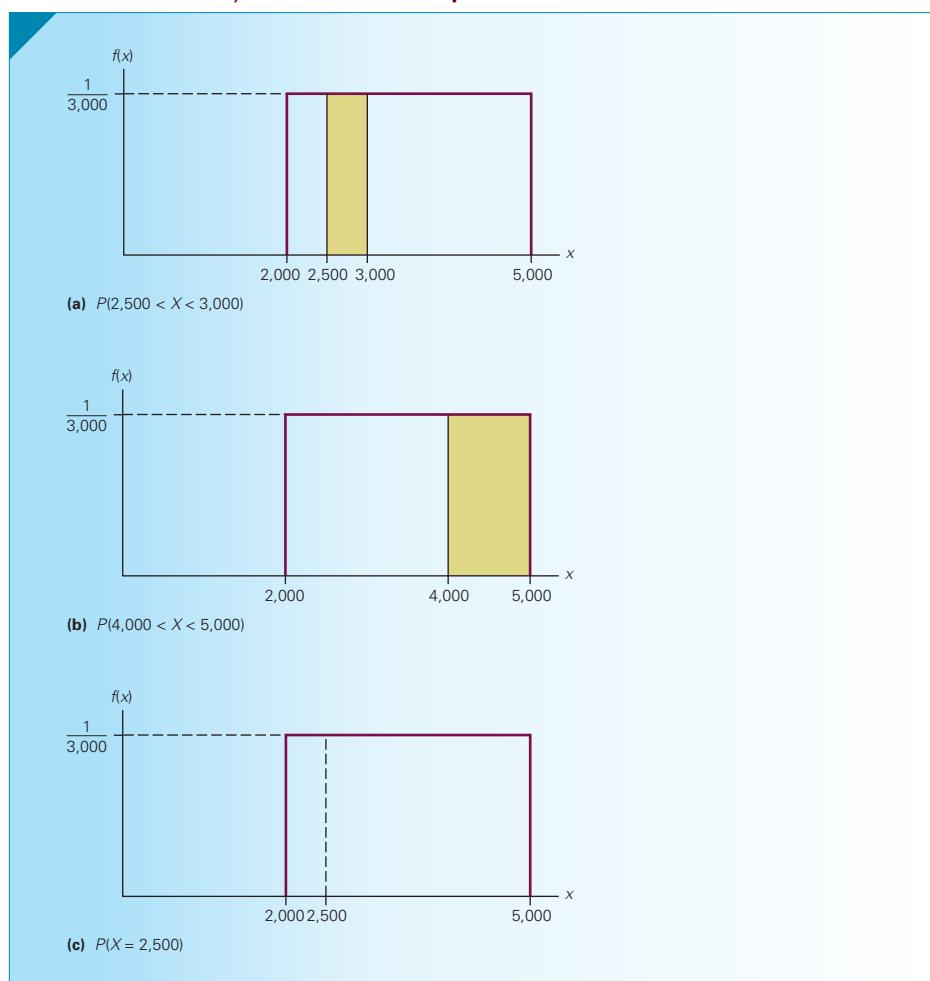
b. $P(X \geq 4,000) = (5,000 - 4,000) \times \left(\frac{1}{3,000}\right) = .3333$ [See Figure 8.6b.]

c. $P(X = 2,500) = 0$

Because there is an uncountable infinite number of values of X , the probability of each individual value is zero. Moreover, as you can see from Figure 8.6c, the area of a line is 0.

Because the probability that a continuous random variable equals any individual value is 0, there is no difference between $P(2,500 \leq X \leq 3,000)$ and $P(2,500 < X < 3,000)$. Of course, we cannot say the same thing about discrete random variables.

FIGURE 8.6 Density Functions for Example 8.1



8-1b Using a Continuous Distribution to Approximate a Discrete Distribution

In our definition of discrete and continuous random variables, we distinguish between them by noting whether the number of possible values is countable or uncountable. However, in practice, we frequently use a continuous distribution to approximate a discrete one when the number of values the variable can assume is countable but large. For example, the number of possible values of weekly income is countable. The values of weekly income expressed in dollars are 0, .01, .02, Although there is no set upper limit, we can easily identify (and thus count) all the possible values. Consequently, weekly income is a discrete random variable. However, because it can assume such a large number of values, we prefer to employ a continuous probability distribution to determine the probability associated with such variables. In the next section, we introduce the normal distribution, which is often used to describe discrete random variables that can assume a large number of values.



EXERCISES

- 8.1** Refer to Example 3.2. From the histogram for investment A, estimate the following probabilities.
- $P(X > 45)$
 - $P(10 < X < 40)$
 - $P(X < 25)$
 - $P(35 < X < 65)$
- 8.2** Refer to Example 3.2. Estimate the following from the histogram of the returns on investment B.
- $P(X > 45)$
 - $P(10 < X < 40)$
 - $P(X < 25)$
 - $P(35 < X < 65)$
- 8.3** Refer to Example 3.3. From the histogram of the marks, estimate the following probabilities.
- $P(55 < X < 80)$
 - $P(X > 65)$
 - $P(X < 85)$
 - $P(75 < X < 85)$
- 8.4** A random variable is uniformly distributed between 5 and 25.
- Draw the density function.
 - Find $P(X > 25)$.
 - Find $P(10 < X < 15)$.
 - Find $P(5.0 < X < 5.1)$.
- 8.5** A uniformly distributed random variable has minimum and maximum values of 20 and 60, respectively.
- Draw the density function.
 - Determine $P(35 < X < 45)$.
 - Draw the density function including the calculation of the probability in part (b).
- 8.6** The amount of time it takes for a student to complete a statistics quiz is uniformly distributed between 30 and 60 minutes. One student is selected at random. Find the probability of the following events.
- The student requires more than 55 minutes to complete the quiz.
 - The student completes the quiz in a time between 30 and 40 minutes.
 - The student completes the quiz in exactly 37.23 minutes.
- 8.7** Refer to Exercise 8.6. The professor wants to reward (with bonus marks) students who are in the lowest quarter of completion times. What completion time should he use for the cutoff for awarding bonus marks?
- 8.8** Refer to Exercise 8.6. The professor would like to track (and possibly help) students who are in the top 10% of completion times. What completion time should he use?
- 8.9** The weekly output of a steel mill is a uniformly distributed random variable that lies between 110 and 175 metric tons.
- Compute the probability that the steel mill will produce more than 150 metric tons next week.
 - Determine the probability that the steel mill will produce between 120 and 160 metric tons next week.
- 8.10** Refer to Exercise 8.9. The operations manager labels any week that is in the bottom 20% of production a “bad week.” How many metric tons should be used to define a bad week?
- 8.11** A random variable has the following density function.
- $$f(x) = 1 - .5x \quad 0 < x < 2$$
- Graph the density function.
 - Verify that $f(x)$ is a density function.

- c. Find $P(X > 1)$.
- d. Find $P(X < .5)$.
- e. Find $P(X = 1.5)$.

8.12 The following function is the density function for the random variable X :

$$f(x) = \frac{x - 1}{8} \quad 1 < x < 5$$

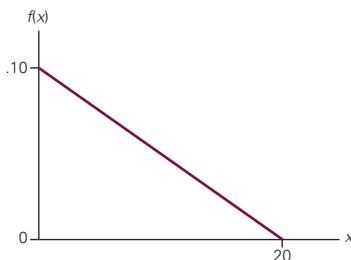
- a. Graph the density function.
- b. Find the probability that X lies between 2 and 4.
- c. What is the probability that X is less than 3?

8.13 The following density function describes the random variable X :

$$f(x) = \begin{cases} \frac{x}{25} & 0 < x < 5 \\ \frac{10-x}{25} & 5 < x < 10 \end{cases}$$

- a. Graph the density function.
- b. Find the probability that X lies between 1 and 3.
- c. What is the probability that X lies between 4 and 8?
- d. Compute the probability that X is less than 7.
- e. Find the probability that X is greater than 3.

8.14 The following is a graph of a density function.



- a. Determine the density function.
- b. Find the probability that X is greater than 10.
- c. Find the probability that X lies between 6 and 12.

8-2/NORMAL DISTRIBUTION

The **normal distribution** is the most important of all probability distributions because of its crucial role in statistical inference.

Normal Density Function

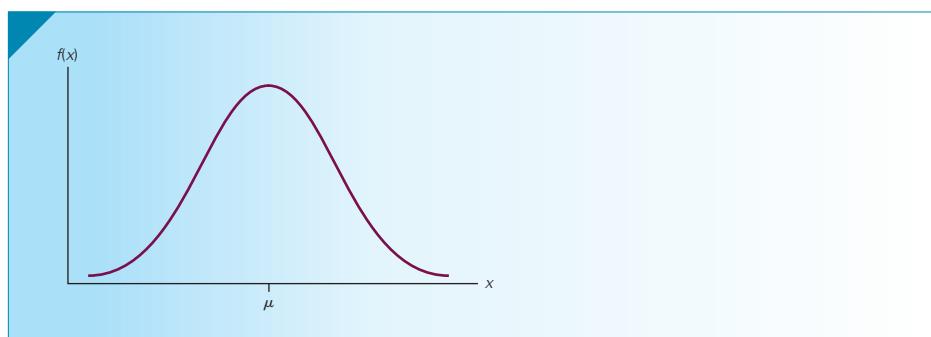
The probability density function of a **normal random variable** is

$$f(x) = \frac{1}{\sigma\sqrt{2\pi}} e^{-\frac{1}{2}\left(\frac{x-\mu}{\sigma}\right)^2} \quad -\infty < x < \infty$$

where $e = 2.71828\dots$ and $\pi = 3.14159\dots$

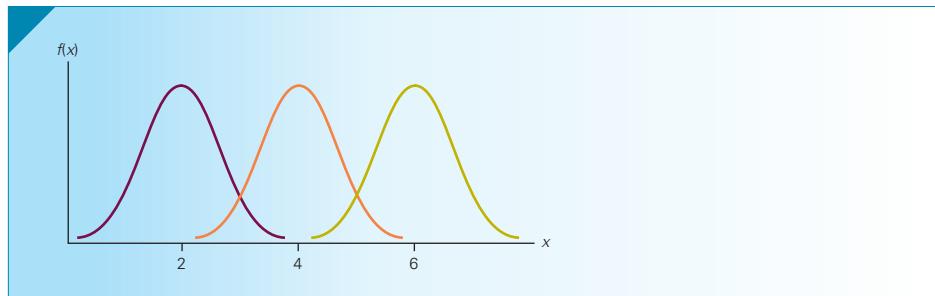
Figure 8.7 depicts a normal distribution. Notice that the curve is symmetric about its mean and the random variable ranges between $-\infty$ and $+\infty$.

FIGURE 8.7 Normal Distribution



The normal distribution is described by two parameters, the mean μ and the standard deviation σ . In Figure 8.8, we demonstrate the effect of changing the value of μ . Obviously, increasing μ shifts the curve to the right and decreasing μ shifts it to the left.

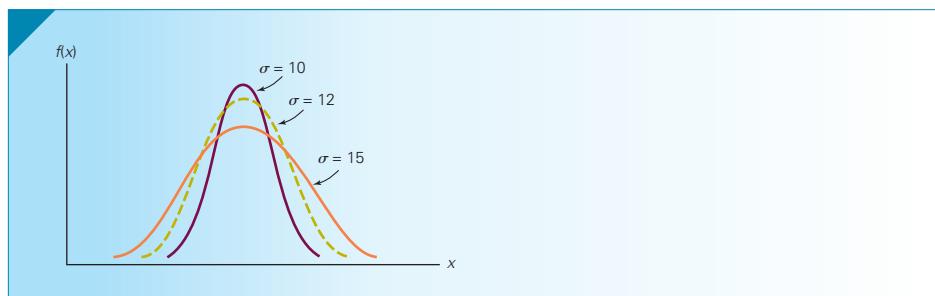
FIGURE 8.8 Normal Distributions with the Same Variance but Different Means



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Figure 8.9 describes the effect of σ . Larger values of σ widen the curve and smaller ones narrow it.

FIGURE 8.9 Normal Distributions with the Same Means but Different Variances



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8-2a Calculating Normal Probabilities

To calculate the probability that a normal random variable falls into any interval, we must compute the area in the interval under the curve. Unfortunately, the function is not as simple as the uniform precluding the use of simple mathematics or even integral calculus. Instead we will resort to using a probability table similar to Tables 1 and 2 in Appendix B, which are used to calculate binomial and Poisson probabilities, respectively. Recall that to determine binomial probabilities from Table 1 we needed probabilities for selected values of n and p . Similarly, to find Poisson probabilities we needed probabilities for each value of μ that we chose to include in Table 2. It would appear then that we will need a separate table for normal probabilities for a selected set of values of μ and σ . Fortunately, this won't be necessary. Instead, we reduce the number of tables needed to one by standardizing the random variable. We standardize a random variable by subtracting its mean and dividing by its standard deviation. When the variable is normal, the transformed variable is called a **standard normal random variable** and denoted by Z ; that is,

$$Z = \frac{X - \mu}{\sigma}$$

The probability statement about X is transformed by this formula into a statement about Z . To illustrate how we proceed, consider the following example.

EXAMPLE 8.2

Normally Distributed Gasoline Sales

Suppose that the daily demand for regular gasoline at another gas station is normally distributed with a mean of 1,000 gallons and a standard deviation of 100 gallons. The station manager has just opened the station for business and notes that there is exactly 1,100 gallons of regular gasoline in storage. The next delivery is scheduled later today at the close of business. The manager would like to know the probability that he will have enough regular gasoline to satisfy today's demands.

SOLUTION:

The amount of gasoline on hand will be sufficient to satisfy the demand if the demand is less than the supply. We label the demand for regular gasoline as X , and we want to find the probability:

$$P(X \leq 1,100)$$

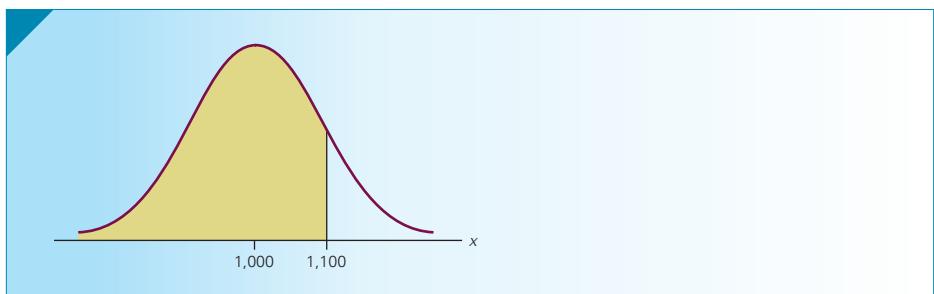
Note that because X is a continuous random variable, we can also express the probability as

$$P(X < 1,100)$$

because the area for $X = 1,100$ is 0.

Figure 8.10 describes a normal curve with mean of 1,000 and standard deviation of 100, and the area we want to find.

FIGURE 8.10 $P(X < 1,100)$

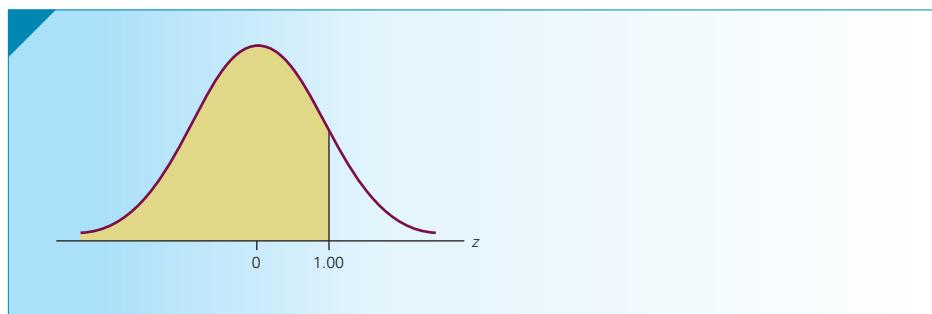


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The first step is to standardize X . However, if we perform any operations on X , we must perform the same operations on 1,100. Thus,

$$P(X < 1,100) = P\left(\frac{X - \mu}{\sigma} < \frac{1,100 - 1,000}{100}\right) = P(Z < 1.00)$$

Figure 8.11 describes the transformation that has taken place. Notice that the variable X was transformed into Z , and 1,100 was transformed into 1.00. However, the area has not changed. In other words, the probability that we wish to compute $P(X < 1,100)$ is identical to $P(Z < 1.00)$.

FIGURE 8.11 $P(Z < 1.00)$ 

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The values of Z specify the location of the corresponding value of X . A value of $Z = 1$ corresponds to a value of X that is 1 standard deviation above the mean. Notice as well that the mean of Z , which is 0, corresponds to the mean of X .

If we know the mean and standard deviation of a normally distributed random variable, we can always transform the probability statement about X into a probability statement about Z . Consequently, we need only one table, Table 3 in Appendix B, the standard normal probability table, which is reproduced here as Table 8.1.*

TABLE 8.1 Normal Probabilities (Table 3 in Appendix B)

Z	0.00	0.01	0.02	0.03	0.04	0.05	0.06	0.07	0.08	0.09
-3.0	0.0013	0.0013	0.0013	0.0012	0.0012	0.0011	0.0011	0.0011	0.0010	0.0010
-2.9	0.0019	0.0018	0.0018	0.0017	0.0016	0.0016	0.0015	0.0015	0.0014	0.0014
-2.8	0.0026	0.0025	0.0024	0.0023	0.0023	0.0022	0.0021	0.0021	0.0020	0.0019
-2.7	0.0035	0.0034	0.0033	0.0032	0.0031	0.0030	0.0029	0.0028	0.0027	0.0026
-2.6	0.0047	0.0045	0.0044	0.0043	0.0041	0.0040	0.0039	0.0038	0.0037	0.0036
-2.5	0.0062	0.0060	0.0059	0.0057	0.0055	0.0054	0.0052	0.0051	0.0049	0.0048
-2.4	0.0082	0.0080	0.0078	0.0075	0.0073	0.0071	0.0069	0.0068	0.0066	0.0064
-2.3	0.0107	0.0104	0.0102	0.0099	0.0096	0.0094	0.0091	0.0089	0.0087	0.0084
-2.2	0.0139	0.0136	0.0132	0.0129	0.0125	0.0122	0.0119	0.0116	0.0113	0.0110
-2.1	0.0179	0.0174	0.0170	0.0166	0.0162	0.0158	0.0154	0.0150	0.0146	0.0143
-2.0	0.0228	0.0222	0.0217	0.0212	0.0207	0.0202	0.0197	0.0192	0.0188	0.0183
-1.9	0.0287	0.0281	0.0274	0.0268	0.0262	0.0256	0.0250	0.0244	0.0239	0.0233
-1.8	0.0359	0.0351	0.0344	0.0336	0.0329	0.0322	0.0314	0.0307	0.0301	0.0294
-1.7	0.0446	0.0436	0.0427	0.0418	0.0409	0.0401	0.0392	0.0384	0.0375	0.0367
-1.6	0.0548	0.0537	0.0526	0.0516	0.0505	0.0495	0.0485	0.0475	0.0465	0.0455
-1.5	0.0668	0.0655	0.0643	0.0630	0.0618	0.0606	0.0594	0.0582	0.0571	0.0559
-1.4	0.0808	0.0793	0.0778	0.0764	0.0749	0.0735	0.0721	0.0708	0.0694	0.0681
-1.3	0.0968	0.0951	0.0934	0.0918	0.0901	0.0885	0.0869	0.0853	0.0838	0.0823
-1.2	0.1151	0.1131	0.1112	0.1093	0.1075	0.1056	0.1038	0.1020	0.1003	0.0985
-1.1	0.1357	0.1335	0.1314	0.1292	0.1271	0.1251	0.1230	0.1210	0.1190	0.1170

(Continued)

*In previous editions we have used another table, which lists $P(0 < Z < z)$. Supplementary Appendix Determining Normal Probabilities using $P(0 < Z < z)$ provides instructions and examples using this table.

TABLE 8.1 Normal Probabilities (Table 3 in Appendix B) (*Continued*)

Z	0.00	0.01	0.02	0.03	0.04	0.05	0.06	0.07	0.08	0.09
-1.0	0.1587	0.1562	0.1539	0.1515	0.1492	0.1469	0.1446	0.1423	0.1401	0.1379
-0.9	0.1841	0.1814	0.1788	0.1762	0.1736	0.1711	0.1685	0.1660	0.1635	0.1611
-0.8	0.2119	0.2090	0.2061	0.2033	0.2005	0.1977	0.1949	0.1922	0.1894	0.1867
-0.7	0.2420	0.2389	0.2358	0.2327	0.2296	0.2266	0.2236	0.2206	0.2177	0.2148
-0.6	0.2743	0.2709	0.2676	0.2643	0.2611	0.2578	0.2546	0.2514	0.2483	0.2451
-0.5	0.3085	0.3050	0.3015	0.2981	0.2946	0.2912	0.2877	0.2843	0.2810	0.2776
-0.4	0.3446	0.3409	0.3372	0.3336	0.3300	0.3264	0.3228	0.3192	0.3156	0.3121
-0.3	0.3821	0.3783	0.3745	0.3707	0.3669	0.3632	0.3594	0.3557	0.3520	0.3483
-0.2	0.4207	0.4168	0.4129	0.4090	0.4052	0.4013	0.3974	0.3936	0.3897	0.3859
-0.1	0.4602	0.4562	0.4522	0.4483	0.4443	0.4404	0.4364	0.4325	0.4286	0.4247
-0.0	0.5000	0.4960	0.4920	0.4880	0.4840	0.4801	0.4761	0.4721	0.4681	0.4641
0.0	0.5000	0.5040	0.5080	0.5120	0.5160	0.5199	0.5239	0.5279	0.5319	0.5359
0.1	0.5398	0.5438	0.5478	0.5517	0.5557	0.5596	0.5636	0.5675	0.5714	0.5753
0.2	0.5793	0.5832	0.5871	0.5910	0.5948	0.5987	0.6026	0.6064	0.6103	0.6141
0.3	0.6179	0.6217	0.6255	0.6293	0.6331	0.6368	0.6406	0.6443	0.6480	0.6517
0.4	0.6554	0.6591	0.6628	0.6664	0.6700	0.6736	0.6772	0.6808	0.6844	0.6879
0.5	0.6915	0.6950	0.6985	0.7019	0.7054	0.7088	0.7123	0.7157	0.7190	0.7224
0.6	0.7257	0.7291	0.7324	0.7357	0.7389	0.7422	0.7454	0.7486	0.7517	0.7549
0.7	0.7580	0.7611	0.7642	0.7673	0.7704	0.7734	0.7764	0.7794	0.7823	0.7852
0.8	0.7881	0.7910	0.7939	0.7967	0.7995	0.8023	0.8051	0.8078	0.8106	0.8133
0.9	0.8159	0.8186	0.8212	0.8238	0.8264	0.8289	0.8315	0.8340	0.8365	0.8389
1.0	0.8413	0.8438	0.8461	0.8485	0.8508	0.8531	0.8554	0.8577	0.8599	0.8621
1.1	0.8643	0.8665	0.8686	0.8708	0.8729	0.8749	0.8770	0.8790	0.8810	0.8830
1.2	0.8849	0.8869	0.8888	0.8907	0.8925	0.8944	0.8962	0.8980	0.8997	0.9015
1.3	0.9032	0.9049	0.9066	0.9082	0.9099	0.9115	0.9131	0.9147	0.9162	0.9177
1.4	0.9192	0.9207	0.9222	0.9236	0.9251	0.9265	0.9279	0.9292	0.9306	0.9319
1.5	0.9332	0.9345	0.9357	0.9370	0.9382	0.9394	0.9406	0.9418	0.9429	0.9441
1.6	0.9452	0.9463	0.9474	0.9484	0.9495	0.9505	0.9515	0.9525	0.9535	0.9545
1.7	0.9554	0.9564	0.9573	0.9582	0.9591	0.9599	0.9608	0.9616	0.9625	0.9633
1.8	0.9641	0.9649	0.9656	0.9664	0.9671	0.9678	0.9686	0.9693	0.9699	0.9706
1.9	0.9713	0.9719	0.9726	0.9732	0.9738	0.9744	0.9750	0.9756	0.9761	0.9767
2.0	0.9772	0.9778	0.9783	0.9788	0.9793	0.9798	0.9803	0.9808	0.9812	0.9817
2.1	0.9821	0.9826	0.9830	0.9834	0.9838	0.9842	0.9846	0.9850	0.9854	0.9857
2.2	0.9861	0.9864	0.9868	0.9871	0.9875	0.9878	0.9881	0.9884	0.9887	0.9890
2.3	0.9893	0.9896	0.9898	0.9901	0.9904	0.9906	0.9909	0.9911	0.9913	0.9916
2.4	0.9918	0.9920	0.9922	0.9925	0.9927	0.9929	0.9931	0.9932	0.9934	0.9936
2.5	0.9938	0.9940	0.9941	0.9943	0.9945	0.9946	0.9948	0.9949	0.9951	0.9952
2.6	0.9953	0.9955	0.9956	0.9957	0.9959	0.9960	0.9961	0.9962	0.9963	0.9964
2.7	0.9965	0.9966	0.9967	0.9968	0.9969	0.9970	0.9971	0.9972	0.9973	0.9974
2.8	0.9974	0.9975	0.9976	0.9977	0.9977	0.9978	0.9979	0.9979	0.9980	0.9981
2.9	0.9981	0.9982	0.9982	0.9983	0.9984	0.9984	0.9985	0.9985	0.9986	0.9986
3.0	0.9987	0.9987	0.9987	0.9988	0.9988	0.9989	0.9989	0.9989	0.9990	0.9990

This table is similar to the ones we used for the binomial and Poisson distributions; that is, this table lists cumulative probabilities

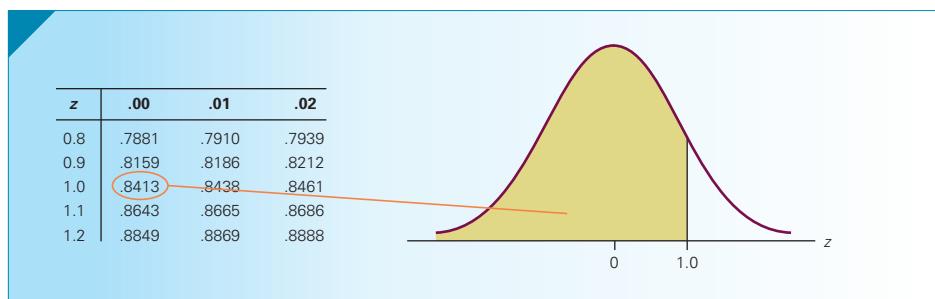
$$P(Z < z)$$

for values of z ranging from -3.09 to $+3.09$.

To use the table, we simply find the value of z and read the probability. For example, the probability $P(Z < 2.00)$ is found by finding 2.0 in the left margin and under the heading 0.00 finding 0.9772. The probability $P(Z < 2.01)$ is found in the same row but under the heading 0.01. It is .9778.

Returning to Example 8.2, the probability we seek is found in Table 8.1 by finding 1.0 in the left margin. The number to its right under the heading 0.00 is .8413. See Figure 8.12.

FIGURE 8.12 $P(Z < 1.00)$



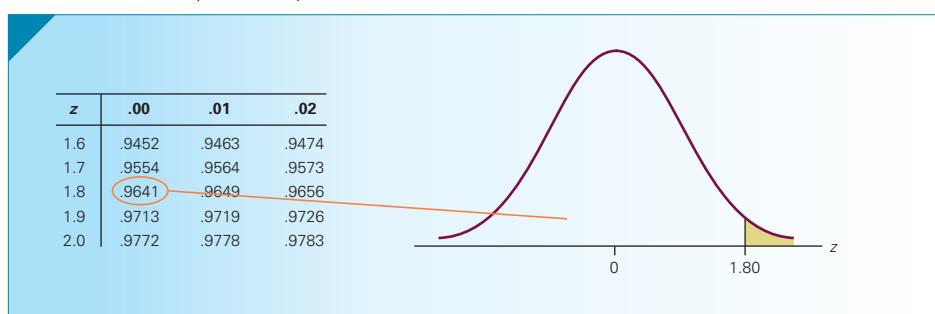
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As was the case with Tables 1 and 2, we can also determine the probability that the standard normal random variable is greater than some value of z . For example, we find the probability that Z is greater than 1.80 by determining the probability that Z is less than 1.80 and subtracting that value from 1. By applying the complement rule, we get

$$P(Z > 1.80) = 1 - P(Z < 1.80) = 1 - .9641 = .0359$$

See Figure 8.13.

FIGURE 8.13 $P(Z > 1.80)$



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We can also easily determine the probability that a standard normal random variable lies between two values of z . For example, we find the probability

$$P(-0.71 < Z < 0.92)$$

by finding the two cumulative probabilities and calculating their difference; that is,

$$P(Z < -0.71) = .2389$$

and

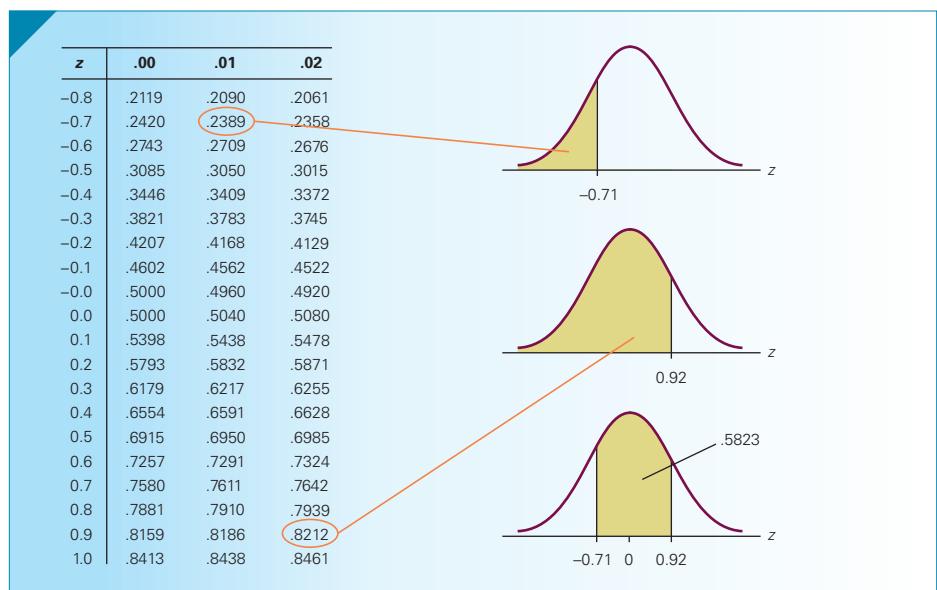
$$P(Z < 0.92) = .8212$$

Hence,

$$P(-0.71 < Z < 0.92) = P(Z < 0.92) - P(Z < -0.71) = .8212 - .2389 = .5823$$

Figure 8.14 depicts this calculation.

FIGURE 8.14 $P(-0.71 < Z < 0.92)$



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Notice that the largest value of z in the table is 3.09 and that $P(Z < 3.09) = .9990$. This means that

$$P(Z > 3.09) = 1 - .9990 = .0010$$

However, because the table lists no values beyond 3.09, we approximate any area beyond 3.10 as 0. In other words,

$$P(Z > 3.10) = P(Z < -3.10) \approx 0$$

Recall that in Tables 1 and 2 we were able to use the table to find the probability that X is *equal* to some value of x , but we won't do the same with the normal table. Remember that the normal random variable is continuous and the probability that a continuous random variable is equal to any single value is 0.

APPLICATIONS in FINANCE



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Measuring Risk

In previous chapters, we discussed several probability and statistical applications in finance where we wanted to measure and perhaps reduce the risk associated with investments. In Example 3.2, we drew histograms to gauge the spread of the histogram of the returns on two investments. We repeated this example in Chapter 4, where we computed the standard deviation and variance as numerical measures of risk. In Section 7-3, we developed an important application in finance in which we emphasized reducing the variance of the returns on a portfolio. However, we have not demonstrated why risk is measured by the variance and standard deviation. The following example corrects this deficiency.

EXAMPLE 8.3**Probability of a Negative Return on Investment**

Consider an investment whose return is normally distributed with a mean of 10% and a standard deviation of 5%.

- Determine the probability of losing money.
- Find the probability of losing money when the standard deviation is equal to 10%.

SOLUTION:

- The investment loses money when the return is negative. Thus, we wish to determine $P(X < 0)$

The first step is to standardize both X and 0 in the probability statement:

$$P(X < 0) = P\left(\frac{X - \mu}{\sigma} < \frac{0 - 10}{5}\right) = P(Z < -2.00) = .0228$$

Therefore, the probability of losing money is .0228.

- If we increase the standard deviation to 10%, the probability of suffering a loss becomes

$$P(X < 0) = P\left(\frac{X - \mu}{\sigma} < \frac{0 - 10}{10}\right) = P(Z < -1.00) = .1587$$

As you can see, increasing the standard deviation increases the probability of losing money. Note that increasing the standard deviation will also increase the probability that the return will exceed some relatively large amount. However, because investors tend to be risk averse, we emphasize the increased probability of negative returns when discussing the effect of increasing the standard deviation.

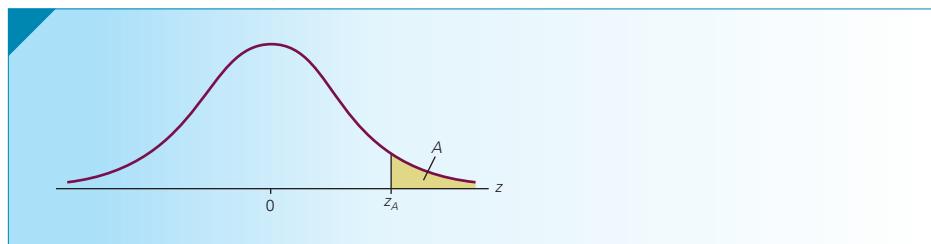
8-2b Finding Values of Z

There is a family of problems that require us to determine the value of Z given a probability. We use the notation Z_A to represent the value of z such that the area to its right under the standard normal curve is A ; that is, Z_A is a value of a standard normal random variable such that

$$P(Z > Z_A) = A$$

Figure 8.15 depicts this notation.

FIGURE 8.15 $P(Z > Z_A) = A$

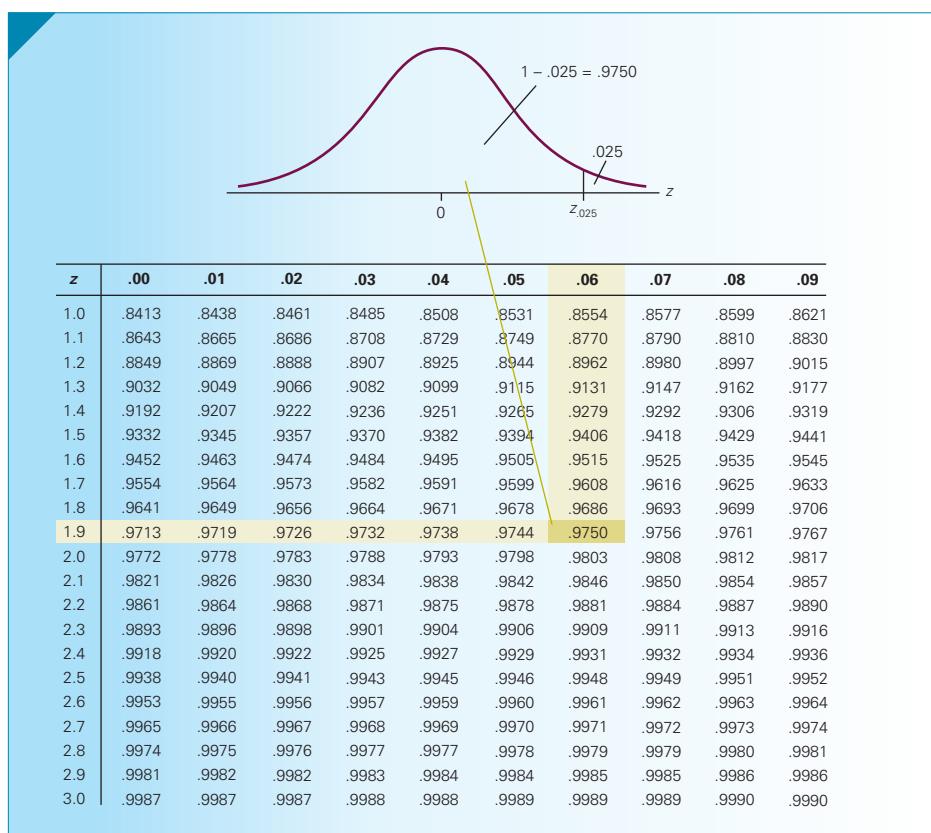


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To find Z_A for any value of A requires us to use the standard normal table backward. As you saw in Example 8.2, to find a probability about Z , we must find the value of z in the table and determine the probability associated with it. To use the table backward, we need to specify a probability and then determine the z -value associated with it. We'll demonstrate by finding $Z_{.025}$. Figure 8.16 depicts the standard normal curve and $Z_{.025}$. Because of the format of the standard normal table, we begin by determining the area *less than* $Z_{.025}$, which is $1 - .025 = .9750$. (Notice that we expressed this probability with four decimal places to make it easier for you to see what you need to do.) We now search through the probability part of the table looking for .9750. When we locate it, we see that the z -value associated with it is 1.96.

Thus, $Z_{.025} = 1.96$, which means that $P(Z > 1.96) = .025$.

FIGURE 8.16 $Z_{.025}$



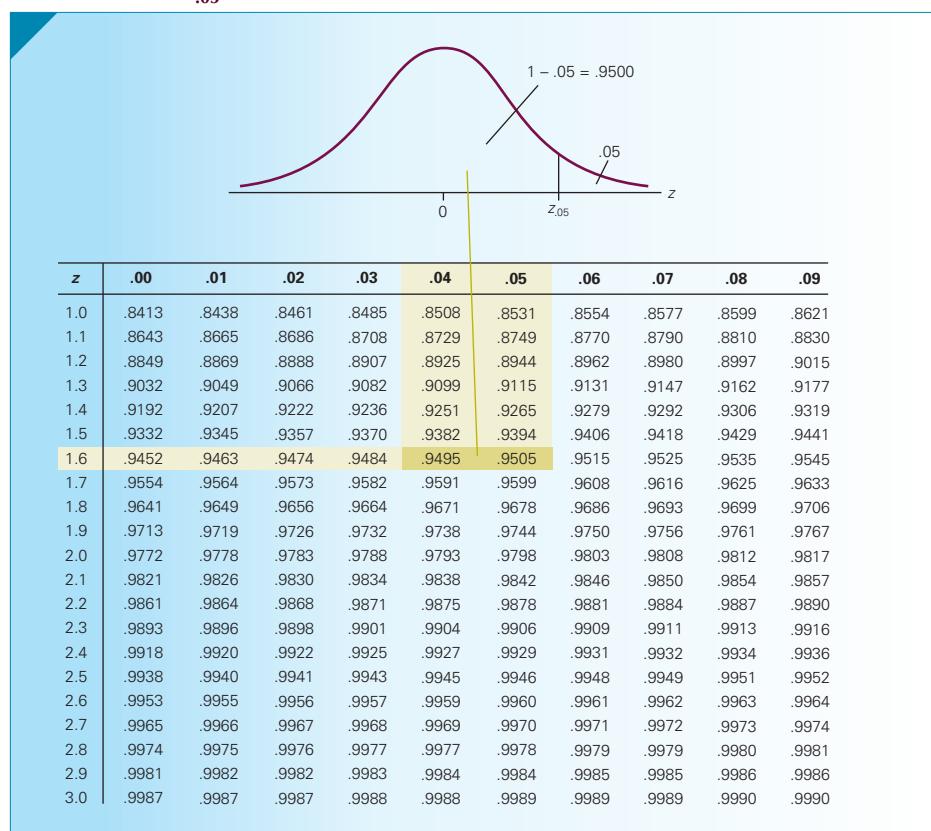
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EXAMPLE 8.4**Finding $Z_{.05}$**

Find the value of a standard normal random variable such that the probability that the random variable is greater than it is 5%.

SOLUTION:

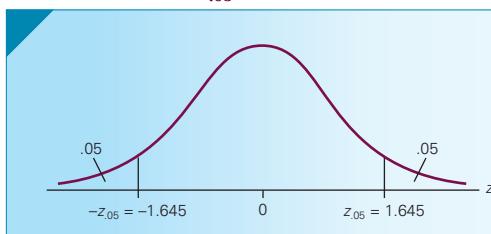
We wish to determine $Z_{.05}$. Figure 8.17 depicts the normal curve and $Z_{.05}$. If .05 is the area in the tail, then the probability less than $Z_{.05}$ must be $1 - .05 = .9500$. To find $Z_{.05}$ we search the table looking for the probability .9500. We don't find this probability, but we find two values that are equally close: .9495 and .9505. The Z-values associated with these probabilities are 1.64 and 1.65, respectively. The average is taken as $Z_{.05}$. Thus, $Z_{.05} = 1.645$.

FIGURE 8.17 $Z_{.05}$ **EXAMPLE 8.5****Finding $-Z_{.05}$**

Find the value of a standard normal random variable such that the probability that the random variable is less than it is 5%.

SOLUTION:

Because the standard normal curve is symmetric about 0, we wish to find $-Z_{.05}$. In Example 8.4 we found $Z_{.05} = 1.645$. Thus, $-Z_{.05} = -1.645$. See Figure 8.18.

FIGURE 8.18 $-z_{.05}$ 

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Minimum GMAT Score to Enter Executive MBA Program: Solution

Figure 8.19 depicts the distribution of GMAT scores. We've labeled the minimum score needed to enter the new MBA program $X_{.01}$ such that

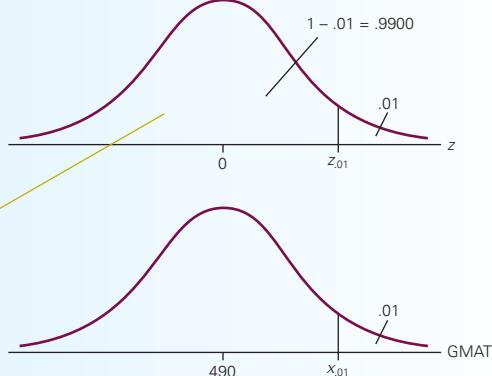
$$P(X > X_{.01}) = .01$$



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FIGURE 8.19 Minimum GMAT Score

<i>z</i>	.00	.01	.02	.03	.04
1.0	.8413	.8438	.8461	.8485	.8508
1.1	.8643	.8665	.8686	.8708	.8729
1.2	.8849	.8869	.8888	.8907	.8925
1.3	.9032	.9049	.9066	.9082	.9099
1.4	.9192	.9207	.9222	.9236	.9251
1.5	.9332	.9345	.9357	.9370	.9382
1.6	.9452	.9463	.9474	.9484	.9495
1.7	.9554	.9564	.9573	.9582	.9591
1.8	.9641	.9649	.9656	.9664	.9671
1.9	.9713	.9719	.9726	.9732	.9738
2.0	.9772	.9778	.9783	.9788	.9793
2.1	.9821	.9826	.9830	.9834	.9838
2.2	.9861	.9864	.9868	.9871	.9875
2.3	.9893	.9896	.9898	.9901	.9904
2.4	.9918	.9920	.9922	.9925	.9927
2.5	.9938	.9940	.9941	.9943	.9945
2.6	.9953	.9955	.9956	.9957	.9959
2.7	.9965	.9966	.9967	.9968	.9969
2.8	.9974	.9975	.9976	.9977	.9977
2.9	.9981	.9982	.9982	.9983	.9984
3.0	.9987	.9987	.9987	.9988	.9988



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Above the normal curve, we depict the standard normal curve and $Z_{.01}$. We can determine the value of $Z_{.01}$ as we did in Example 8.4. In the standard normal table, we find $1 - .01 = .9900$ (its closest value in the table is .9901) and the *Z*-value 2.33. Thus, the standardized value of $X_{.01}$ is $Z_{.01} = 2.33$. To find $X_{.01}$, we must unstandardize $Z_{.01}$. We do so by solving for $X_{.01}$ in the equation

$$Z_{.01} = \frac{X_{.01} - \mu}{\sigma}$$

Substituting $Z_{.01} = 2.33$, $\mu = 490$, and $\sigma = 61$, we find

$$2.33 = \frac{X_{.01} - 490}{61}$$

Solving, we get

$$X_{.01} = 2.33(61) + 490 = 632.13$$

Rounding up (GMAT scores are integers), we find that the minimum GMAT score to enter the Executive MBA Program is 633.

8-2c Z_A and Percentiles

In Chapter 4, we introduced percentiles, which are measures of relative standing. The values of Z_A are the $100(1 - A)$ th percentiles of a standard normal random variable. For example, $Z_{.05} = 1.645$, which means that 1.645 is the 95th percentile: 95% of all values of Z are below it, and 5% are above it. We interpret other values of Z_A similarly.

Using the Computer

EXCEL

INSTRUCTIONS

We can use Excel to compute probabilities as well as values of X and Z . To compute cumulative normal probabilities $P(X < x)$, type (in any cell)

=NORMDIST([X], [μ], [σ], True)

(Typing “True” yields a cumulative probability. Typing “False” will produce the value of the normal density function, a number with little meaning.)

If you type 0 for μ and 1 for σ , you will obtain standard normal probabilities. Alternatively, type

NORMSDIST instead of NORMDIST and enter the value of z .

In Example 8.2, we found $P(X < 1,100) = P(Z < 1.00) = .8413$. To instruct Excel to calculate this probability, we enter

=NORMDIST(1100, 1000, 100, True)

or

=NORMSDIST(1.00)

To calculate a value for Z_A , type

=NORMSINV([1 - A])

In Example 8.4, we would type

=NORMSINV(.95)

and produce 1.6449. We calculated $Z_{.05} = 1.645$.

(Continued)

To calculate a value of x given the probability $P(X > x) = A$, enter

$$= \text{NORMINV}(1 - A, \mu, \sigma)$$

The chapter-opening example would be solved by typing

$$= \text{NORMINV}(.99, 490, 61)$$

which yields 632.

MINITAB

INSTRUCTIONS

We can use Minitab to compute probabilities as well as values of X and Z .

Check **Calc**, **Probability Distributions**, and **Normal ...** and either **Cumulative probability** [to determine $P(X < x)$] or **Inverse cumulative probability** to find the value of x . Specify the **Mean** and **Standard deviation**.

APPLICATIONS in OPERATIONS MANAGEMENT

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Inventory Management

Every organization maintains some inventory, which is defined as a stock of items. For example, grocery stores hold inventories of almost all the products they sell. When the total number of products drops to a specified level, the manager arranges for the delivery of more products. An automobile repair shop keeps an inventory of a large number of replacement parts.

A school keeps stock of items that it uses regularly, including chalk, pens, envelopes, file folders, and paper clips. There are costs associated with inventories.

These include the cost of capital, losses (theft and obsolescence), and warehouse space, as well as maintenance and record keeping. Management scientists have developed many models to help determine the optimum inventory level that balances the cost of inventory with the cost of shortages and the cost of making many small orders. Several of these models are deterministic—that is, they assume that the demand for the product is constant. However, in most realistic situations, the demand is a random variable. One commonly applied probabilistic model assumes that the demand during lead time is a normally distributed random variable. *Lead time* is defined as the amount of time between when the order is placed and when it is delivered.

The quantity ordered is usually calculated by attempting to minimize the total costs, including the cost of ordering and the cost of maintaining inventory. (This topic is discussed in most management-science courses.) Another critical decision involves the *reorder point*, which is the level of inventory at which an order is issued to its supplier. If the reorder point is too low, the company will run out of product, suffering the loss

of sales and potentially customers who will go to a competitor. If the reorder point is too high, the company will be carrying too much inventory, which costs money to buy and store. In some companies, inventory has a tendency to walk out the back door or become obsolete. As a result, managers create a *safety stock*, which is the extra amount of inventory to reduce the times when the company has a shortage. They do so by setting a service level, which is the probability that the company will not experience a shortage. The method used to determine the reorder point will be demonstrated with Example 8.6.

EXAMPLE 8.6

Determining the Reorder Point

During the spring, the demand for electric fans at a large home-improvement store is quite strong. The company tracks inventory using a computer system so that it knows how many fans are in the inventory at any time. The policy is to order a new shipment of 250 fans when the inventory level falls to the reorder point, which is 150. However, this policy has resulted in frequent shortages and thus lost sales because both lead time and demand are highly variable. The manager would like to reduce the incidence of shortages so that only 5% of orders will arrive after inventory drops to 0 (resulting in a shortage). This policy is expressed as a 95% service level. From previous periods, the company has determined that demand during lead time is normally distributed with a mean of 200 and a standard deviation of 50. Find the reorder point.

SOLUTION:

The reorder point is set so that the probability that demand during lead time exceeds this quantity is 5%. Figure 8.20 depicts demand during lead time and the reorder point. As we did in the solution to the chapter-opening example, we find the standard normal value such that the area to its right is .05. The standardized value of the reorder point (ROP) is $Z_{.05} = 1.645$. To find ROP, we must unstandardize $Z_{.05}$.

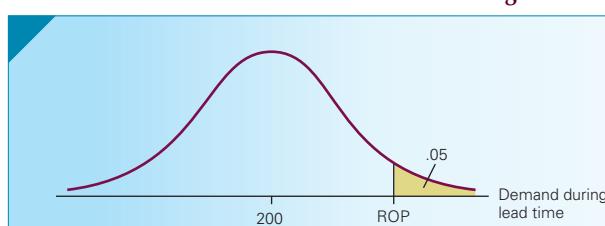
$$Z_{.05} = \frac{ROP - \mu}{\sigma}$$

$$1.645 = \frac{ROP - 200}{50}$$

$$ROP = 50(1.645) + 200 = 282.25$$

which we round up to 283. The policy is to order a new batch of fans when there are 283 fans left in inventory.

FIGURE 8.20 Distribution of Demand During Lead Time





EXERCISES

In Exercises 8.15 to 8.30, find the probabilities.

8.15 $P(Z < 1.50)$

8.16 $P(Z < 1.51)$

8.17 $P(Z < 1.55)$

8.18 $P(Z < -1.59)$

8.19 $P(Z < -1.60)$

8.20 $P(Z < -2.30)$

8.21 $P(-1.40 < Z < .60)$

8.22 $P(Z > -1.44)$

8.23 $P(Z < 2.03)$

8.24 $P(Z > 1.67)$

8.25 $P(Z < 2.84)$

8.26 $P(1.14 < Z < 2.43)$

8.27 $P(-0.91 < Z < -0.33)$

8.28 $P(Z > 3.09)$

8.29 $P(Z > 0)$

8.30 $P(Z > 4.0)$

8.31 Find $z_{.02}$.

8.32 Find $z_{.045}$.

8.33 Find $z_{.20}$.

8.34 X is normally distributed with mean 100 and standard deviation 20. What is the probability that X is greater than 145?

8.35 X is normally distributed with mean 250 and standard deviation 40. What value of X does only the top 15% exceed?

8.36 X is normally distributed with mean 1,000 and standard deviation 250. What is the probability that X lies between 800 and 1,100?

8.37 X is normally distributed with mean 50 and standard deviation 8. What value of X is such that only 8% of values are below it?

8.38 The long-distance calls made by the employees of a company are normally distributed with a mean of 6.3 minutes and a standard deviation of 2.2 minutes. Find the probability that a call
 a. lasts between 5 and 10 minutes.
 b. lasts more than 7 minutes.
 c. lasts less than 4 minutes.

8.39 Refer to Exercise 8.38. How long do the longest 10% of calls last?

8.40 The lifetimes of lightbulbs that are advertised to last for 5,000 hours are normally distributed with a mean of 5,100 hours and a standard deviation of 200 hours. What is the probability that a bulb lasts longer than the advertised figure?

8.41 Refer to Exercise 8.40. If we wanted to be sure that 98% of all bulbs last longer than the advertised figure, what figure should be advertised?

8.42 Travelbyus is an Internet-based travel agency wherein customers can see videos of the cities they plan to visit. The number of hits daily is a normally distributed random variable with a mean of 10,000 and a standard deviation of 2,400.

- What is the probability of getting more than 12,000 hits?
- What is the probability of getting fewer than 9,000 hits?

8.43 Refer to Exercise 8.42. Some Internet sites have bandwidths that are not sufficient to handle all their traffic, often causing their systems to crash. Bandwidth can be measured by the number of hits a system can handle. How large a bandwidth should Travelbyus have in order to handle 99.9% of daily traffic?

8.44 A new gas-electric hybrid car has recently hit the market. The distance traveled on 1 gallon of fuel is normally distributed with a mean of 65 miles and a standard deviation of 4 miles. Find the probability of the following events.

- The car travels more than 70 miles per gallon.
- The car travels less than 60 miles per gallon.
- The car travels between 55 and 70 miles per gallon.

8.45 The top-selling Red and Voss tire is rated 70,000 miles, which means nothing. In fact, the distance the tires can run until they wear out is a normally distributed random variable with a mean of 82,000 miles and a standard deviation of 6,400 miles.

- What is the probability that a tire wears out before 70,000 miles?
- What is the probability that a tire lasts more than 100,000 miles?

8.46 The heights of 2-year-old children are normally distributed with a mean of 32 inches and a standard deviation of 1.5 inches. Pediatricians regularly measure the heights of toddlers to determine whether

there is a problem. There may be a problem when a child is in the top or bottom 5% of heights. Determine the heights of 2-year-old children that could be a problem.

- 8.47** Refer to Exercise 8.46. Find the probability of these events.

- A 2-year-old child is taller than 36 inches.
- A 2-year-old child is shorter than 34 inches.
- A 2-year-old child is between 30 and 33 inches tall.

- 8.48** University and college students average 7.2 hours of sleep per night, with a standard deviation of 40 minutes. If the amount of sleep is normally distributed, what proportion of university and college students sleep for more than 8 hours?

- 8.49** Refer to Exercise 8.48. Find the amount of sleep that is exceeded by only 25% of students.

- 8.50** The amount of time devoted to studying statistics each week by students who achieve a grade of A in the course is a normally distributed random variable with a mean of 7.5 hours and a standard deviation of 2.1 hours.

- What proportion of A students study for more than 10 hours per week?
- Find the probability that an A student spends between 7 and 9 hours studying.
- What proportion of A students spend fewer than 3 hours studying?
- What is the amount of time below which only 5% of all A students spend studying?

- 8.51** The number of pages printed before replacing the cartridge in a laser printer is normally distributed with a mean of 11,500 pages and a standard deviation of 800 pages. A new cartridge has just been installed.

- What is the probability that the printer produces more than 12,000 pages before this cartridge must be replaced?
- What is the probability that the printer produces fewer than 10,000 pages?

- 8.52** Refer to Exercise 8.51. The manufacturer wants to provide guidelines to potential customers advising them of the minimum number of pages they can expect from each cartridge. How many pages should it advertise if the company wants to be correct 99% of the time?

- 8.53** Battery manufacturers compete on the basis of the amount of time their products last in cameras and toys. A manufacturer of alkaline batteries has observed that its batteries last for an average of 26 hours when used in a toy racing car. The amount of time is normally distributed with a standard deviation of 2.5 hours.

- What is the probability that the battery lasts between 24 and 28 hours?
- What is the probability that the battery lasts longer than 28 hours?
- What is the probability that the battery lasts less than 24 hours?

- 8.54** Because of the relatively high interest rates, most consumers attempt to pay off their credit card bills promptly. However, this is not always possible. An analysis of the amount of interest paid monthly by a bank's Visa cardholders reveals that the amount is normally distributed with a mean of \$27 and a standard deviation of \$7.

- What proportion of the bank's Visa cardholders pay more than \$30 in interest?
- What proportion of the bank's Visa cardholders pay more than \$40 in interest?
- What proportion of the bank's Visa cardholders pay less than \$15 in interest?
- What interest payment is exceeded by only 20% of the bank's Visa cardholders?

- 8.55** It is said that sufferers of a cold virus experience symptoms for 7 days. However, the amount of time is actually a normally distributed random variable whose mean is 7.5 days and whose standard deviation is 1.2 days.

- What proportion of cold sufferers experience fewer than 4 days of symptoms?
- What proportion of cold sufferers experience symptoms for between 7 and 10 days?

- 8.56** How much money does a typical family of four spend at a McDonald's restaurant per visit? The amount is a normally distributed random variable with a mean of \$16.40 and a standard deviation of \$2.75.

- Find the probability that a family of four spends less than \$10.
- What is the amount below which only 10% of families of four spend at McDonald's?

- 8.57** The final marks in a statistics course are normally distributed with a mean of 70 and a standard deviation of 10. The professor must convert all marks to letter grades. She decides that she wants 10% A's, 30% B's, 40% C's, 15% D's, and 5% F's. Determine the cutoffs for each letter grade.

- 8.58** Mensa is an organization whose members possess IQs that are in the top 2% of the population. It is known that IQs are normally distributed with a mean of 100 and a standard deviation of 16. Find the minimum IQ needed to be a Mensa member.

- 8.59** According to the 2001 Canadian census, university-educated Canadians earned a mean income of \$61,823. The standard deviation is \$17,301. If

incomes are normally distributed, what is the probability that a randomly selected university-educated Canadian earns more than \$70,000?

- 8.60** The census referred to in the previous exercise also reported that college-educated Canadians earn on average \$41,825. Suppose that incomes are normally distributed with a standard deviation of \$13,444. Find the probability that a randomly selected college-educated Canadian earns less than \$45,000.
- 8.61** The lifetimes of televisions produced by the Hishobi Company are normally distributed with a mean of 75 months and a standard deviation of 8 months. If the manufacturer wants to have to replace only 1% of its televisions, what should its warranty be?
- 8.62** According to the *Statistical Abstract of the United States, 2012* (Table 721), the mean family net worth of families whose head is between 35 and 44 years old is approximately \$325,600. If family net worth is normally distributed with a standard deviation of \$100,000, find the probability that a randomly selected family whose head is between 35 and 44 years old has a net worth greater than \$500,000.
- 8.63** A retailer of computing products sells a variety of computer-related products. One of his most popular products is an HP laser printer. The average weekly demand is 200. Lead time for a new order from the manufacturer to arrive is 1 week. If the demand for

printers were constant, the retailer would reorder when there were exactly 200 printers in inventory. However, the demand is a random variable. An analysis of previous weeks reveals that the weekly demand standard deviation is 30. The retailer knows that if a customer wants to buy an HP laser printer but he has none available, he will lose that sale plus possibly additional sales. He wants the probability of running short in any week to be no more than 6%. How many HP laser printers should he have in stock when he reorders from the manufacturer?

- 8.64** The demand for a daily newspaper at a newsstand at a busy intersection is known to be normally distributed with a mean of 150 and a standard deviation of 25. How many newspapers should the newsstand operator order to ensure that he runs short on no more than 20% of days?
- 8.65** Every day a bakery prepares its famous marble rye. A statistically savvy customer determined that daily demand is normally distributed with a mean of 850 and a standard deviation of 90. How many loaves should the bakery make if it wants the probability of running short on any day to be no more than 30%?
- 8.66** Refer to Exercise 8.65. Any marble ryes that are unsold at the end of the day are marked down and sold for half-price. How many loaves should the bakery prepare so that the proportion of days that result in unsold loaves is no more than 60%?

APPLICATIONS in OPERATIONS MANAGEMENT

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PERT/CPM

In the Applications in Operations Management box on page 231, we introduced PERT/CPM. The purpose of this powerful management-science procedure is to determine the critical path of a project. The expected value and variance of the completion time of the project are based on the expected values and variances of the completion times of the activities on the critical path. Once we have the expected value and variance of the completion time of the project, we can use these figures to determine the probability that the project will be completed by a certain date. Statisticians have established that the completion time of the project is approximately normally distributed, enabling us to compute the needed probabilities.

- 8.67** Refer to Exercise 7.57. Find the probability that the project will take more than 60 days to complete.
- 8.68** The mean and variance of the time to complete the project in Exercise 7.58 was 145 minutes and 31 minutes². What is the probability that it will take less than 2.5 hours to overhaul the machine?

- 8.69** The annual rate of return on a mutual fund is normally distributed with a mean of 14% and a standard deviation of 18%.
- What is the probability that the fund returns more than 25% next year?
 - What is the probability that the fund loses money next year?

- 8.70** In Exercise 7.64, we discovered that the expected return is .1060 and the standard deviation is .1456. Working with the assumption that returns are normally distributed, determine the probability of the following events.
- The portfolio loses money.
 - The return on the portfolio is greater than 20%.

8-3 / (OPTIONAL) EXPONENTIAL DISTRIBUTION

Another important continuous distribution is the **exponential distribution**.

Exponential Probability Density Function

A random variable X is exponentially distributed if its probability density function is given by

$$f(x) = \lambda e^{-\lambda x}, \quad x \geq 0$$

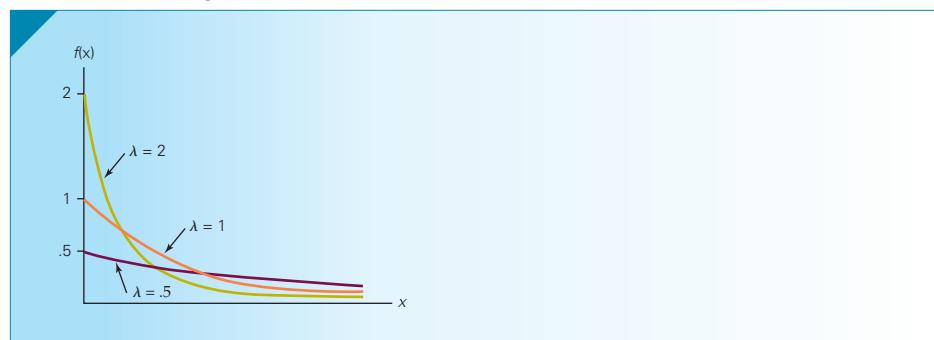
where $e = 2.71828 \dots$ and λ is the parameter of the distribution.

Statisticians have shown that the mean and standard deviation of an exponential random variable are equal to each other:

$$\mu = \sigma = 1/\lambda$$

Recall that the normal distribution is a two-parameter distribution. The distribution is completely specified once the values of the two parameters μ and σ are known. In contrast, the exponential distribution is a one-parameter distribution. The distribution is completely specified once the value of the parameter λ is known. Figure 8.21 depicts three exponential distributions, corresponding to three different values of the parameter λ . Notice that for any exponential density function $f(x)$, $f(0) = \lambda$ and $f(x)$ approaches 0 as x approaches infinity.

FIGURE 8.21 Exponential Distributions



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The exponential density function is easier to work with than the normal. As a result, we can develop formulas for the calculation of the probability of any range of values. Using integral calculus, we can determine the following probability statements.

Probability Associated with an Exponential Random Variable

If X is an exponential random variable,

$$P(X > x) = e^{-\lambda x}$$

$$P(X < x) = 1 - e^{-\lambda x}$$

$$P(x_1 < X < x_2) = P(X < x_2) - P(X < x_1) = e^{-\lambda x_1} - e^{-\lambda x_2}$$

The value of $e^{-\lambda x}$ can be obtained with the aid of a calculator.

EXAMPLE 8.7**Lifetimes of Alkaline Batteries**

The lifetime of an alkaline battery (measured in hours) is exponentially distributed with $\lambda = .05$.

- What is the mean and standard deviation of the battery's lifetime?
- Find the probability that a battery will last between 10 and 15 hours.
- What is the probability that a battery will last for more than 20 hours?

SOLUTION:

- a. The mean and standard deviation are equal to $1/\lambda$. Thus,

$$\mu = \sigma = 1/\lambda = 1/.05 = 20 \text{ hours}$$

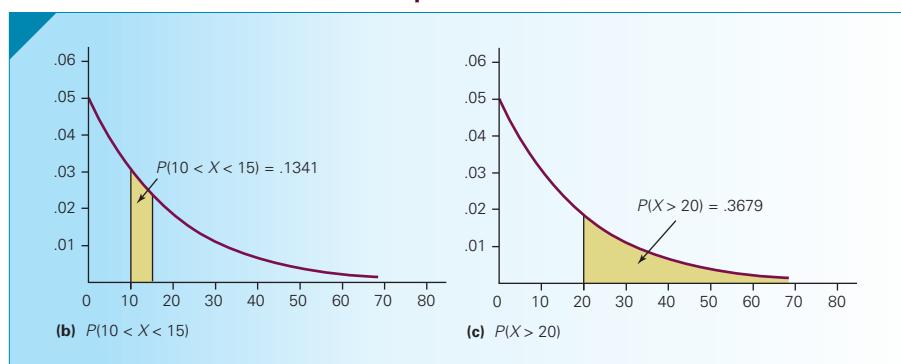
- b. Let X denote the lifetime of a battery. The required probability is

$$\begin{aligned} P(10 < X < 15) &= e^{-.05(10)} - e^{-.05(15)} \\ &= e^{-.5} - e^{-.75} \\ &= .6065 - .4724 \\ &= .1341 \end{aligned}$$

$$\begin{aligned} c. \quad P(X > 20) &= e^{-.05(20)} \\ &= e^{-1} \\ &= .3679 \end{aligned}$$

Figure 8.22 depicts these probabilities.

FIGURE 8.22 Probabilities for Example 8.7



Using the Computer

EXCEL

INSTRUCTIONS

Type (in any cell)

= EXPONDIST ([X], [λ], True)

To produce the answer for Example 8.7c, we would find $P(X < 20)$ and subtract it from 1.

To find $P(X < 20)$, type

= EXPONDIST(20, .05, True)

which outputs .6321 and hence $P(X > 20) = 1 - .6321 = .3679$, which is exactly the number we produced manually.

MINITAB

INSTRUCTIONS

Click **Calc**, **Probability Distributions**, and **Exponential ...** and specify **Cumulative probability**. In the **Scale** box, type the mean, which is $1/\lambda$. In the **Threshold** box, type 0.

Applications in OPERATIONS MANAGEMENT

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Waiting Lines

In Section 7-5, we described waiting-line models and how the Poisson distribution is used to calculate the probabilities of the number of arrivals per time period. To calculate the operating characteristics of waiting lines, management scientists often assume that the times to complete a service are exponentially distributed. In this application, the parameter λ is the service rate, which is defined as the mean number of service completions per time period. For example, if service times are exponentially distributed with $\lambda = 5/\text{hour}$, this tells us that the service rate is 5 units per hour or 5 per 60 minutes. Recall that the mean of an exponential distribution is $\mu = 1/\lambda$. In this case, the service facility can complete a service in an average of 12 minutes. This was calculated as

$$\mu = \frac{1}{\lambda} = \frac{1}{5/\text{hour}} = \frac{1}{5/60 \text{ minutes}} = \frac{60 \text{ minutes}}{5} = 12 \text{ minutes.}$$

We can use this distribution to make a variety of probability statements.

EXAMPLE 8.8**Supermarket Checkout Counter**

A checkout counter at a supermarket completes the process according to an exponential distribution with a service rate of 6 per hour. A customer arrives at the checkout counter. Find the probability of the following events.

- The service is completed in fewer than 5 minutes.
- The customer leaves the checkout counter more than 10 minutes after arriving.
- The service is completed in a time between 5 and 8 minutes.

SOLUTION:

One way to solve this problem is to convert the service rate so that the time period is 1 minute. (Alternatively, we can solve by converting the probability statements so that the time periods are measured in fractions of an hour.) Let the service rate = $\lambda = .1/\text{minute}$.

- $P(X < 5) = 1 - e^{-\lambda x} = 1 - e^{-.1(5)} = 1 - e^{-.5} = 1 - .6065 = .3935$
- $P(X > 10) = e^{-\lambda x} = e^{-.1(10)} = e^{-1} = .3679$
- $P(5 < X < 8) = e^{-\lambda(5)} - e^{-\lambda(8)} = e^{-.5} - e^{-.8} = .6065 - .4493 = .1572$

**EXERCISES**

8.71 The random variable X is exponentially distributed with $\lambda = 3$. Sketch the graph of the distribution of X by plotting and connecting the points representing $f(x)$ for $x = 0, .5, 1, 1.5$, and 2 .

8.72 X is an exponential random variable with $\lambda = .25$. Sketch the graph of the distribution of X by plotting and connecting the points representing $f(x)$ for $x = 0, 2, 4, 6, 8, 10, 15, 20$.

8.73 Let X be an exponential random variable with $\lambda = .5$. Find the following probabilities.

- $P(X > 1)$
- $P(X > .4)$
- $P(X < .5)$
- $P(X < 2)$

8.74 X is an exponential random variable with $\lambda = .3$. Find the following probabilities.

- $P(X > 2)$
- $P(X < 4)$
- $P(1 < X < 2)$
- $P(X = 3)$

8.75 The production of a complex chemical needed for anticancer drugs is exponentially distributed with $\lambda = 6$ kilograms per hour. What is the probability that the production process requires more than 15 minutes to produce the next kilogram of drugs?

8.76 The time between breakdowns of aging machines is known to be exponentially distributed with a mean of 25 hours. The machine has just been repaired. Determine the probability that the next breakdown occurs more than 50 hours from now.

8.77 When trucks arrive at the Ambassador Bridge, each truck must be checked by customs agents. The times are exponentially distributed with a service rate of 10 per hour. What is the probability that a truck requires more than 15 minutes to be checked?

8.78 A bank wishing to increase its customer base advertises that it has the fastest service and that virtually all of its customers are served in less than 10 minutes. A management scientist has studied the service times and concluded that service times are exponentially distributed with a mean of 5 minutes. Determine what the bank means when it claims "virtually all" its customers are served in less than 10 minutes.

8.79 Toll booths on the New York State Thruway are often congested because of the large number of cars waiting to pay. A consultant working for the state concluded that if service times are measured from the time a car stops in line until it leaves, service times are exponentially distributed with a mean of 2.7 minutes. What proportion of cars can get through the toll booth in less than 3 minutes?

- 8.80** The manager of a gas station has observed that the times required by drivers to fill their car's tank and pay are quite variable. In fact, the times are exponentially distributed with a mean of 7.5 minutes. What is the probability that a car can complete the transaction in less than 5 minutes?
- 8.81** Because automatic banking machine (ABM) customers can perform a number of transactions, the times to complete them can be quite variable. A banking consultant has noted that the times are exponentially distributed with a mean of 125 seconds. What proportion of the ABM customers take more than 3 minutes to do their banking?
- 8.82** The manager of a supermarket tracked the amount of time needed for customers to be served by the cashier. After checking with his statistics professor, he concluded that the checkout times are exponentially distributed with a mean of 6 minutes. What proportion of customers require more than 10 minutes to check out?

8-4 OTHER CONTINUOUS DISTRIBUTIONS

In this section, we introduce three more continuous distributions that are used extensively in statistical inference.

8-4a Student *t* Distribution

The Student *t* distribution was first derived by William S. Gosset in 1908. (Gosset published his findings under the pseudonym “Student” and used the letter *t* to represent the random variable, hence the **Student *t* distribution**—also called the *Student’s t distribution*.) It is very commonly used in statistical inference, and we will employ it in Chapters 12, 13, 14, 16, 17, and 18.

Student *t* Density Function

The density function of the Student *t* distribution is as follows:

$$f(t) = \frac{\Gamma[(\nu + 1)/2]}{\sqrt{\nu\pi}\Gamma(\nu/2)} \left[1 + \frac{t^2}{\nu} \right]^{-(\nu+1)/2}$$

where ν (Greek letter *nu*) is the parameter of the Student *t* distribution called the **degrees of freedom**, $\pi = 3.14159$ (approximately), and Γ is the gamma function (its definition is not needed here).

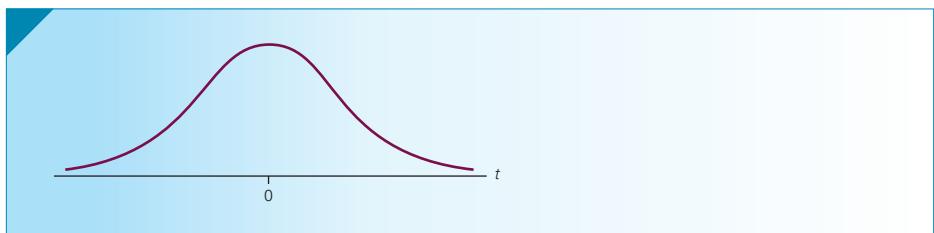
The mean and variance of a Student *t* random variable are

$$E(t) = 0$$

and

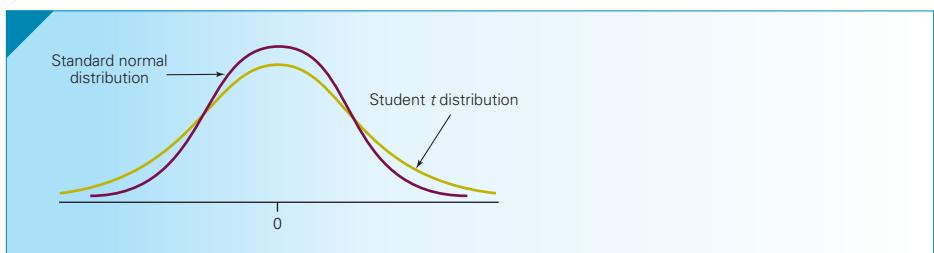
$$V(t) = \frac{\nu}{\nu - 2} \quad \text{for } \nu > 2$$

Figure 8.23 depicts the Student *t* distribution. As you can see, it is similar to the standard normal distribution. Both are symmetrical about 0. (Both random variables have a mean of 0.) We describe the Student *t* distribution as mound shaped, whereas the normal distribution is bell shaped.

FIGURE 8.23 Student *t* Distribution

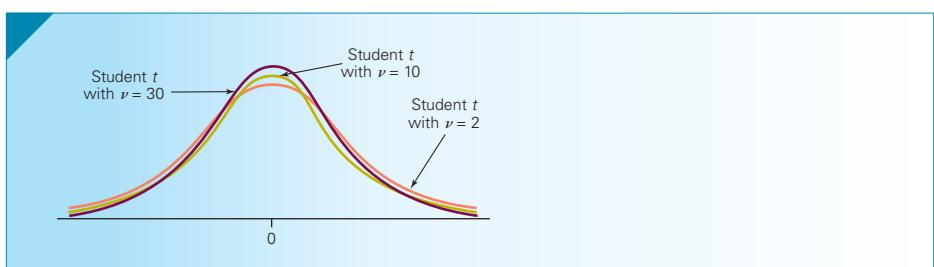
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Figure 8.24 shows both the Student *t* and the standard normal distributions. The former is more widely spread out than the latter. [The variance of a standard normal random variable is 1, whereas the variance of a Student *t* random variable is $\nu/(\nu - 2)$, which is greater than 1 for all ν .]

FIGURE 8.24 Student *t* and Normal Distributions

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Figure 8.25 depicts Student *t* distributions with several different degrees of freedom. Notice that for larger degrees of freedom the Student *t* distribution's dispersion is smaller. For example, when $\nu = 10$, $V(t) = 1.25$; when $\nu = 50$, $V(t) = 1.042$; and when $\nu = 200$, $V(t) = 1.010$. As ν grows larger, the Student *t* distribution approaches the standard normal distribution.

FIGURE 8.25 Student *t* Distribution with $\nu = 2, 10$, and 30

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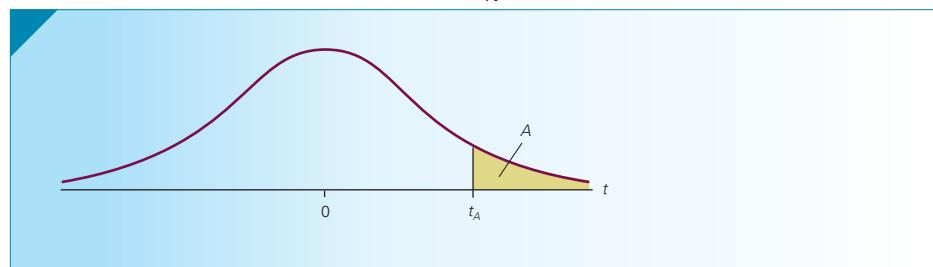
Student *t* Probabilities For each value of ν (the number of degrees of freedom), there is a different Student *t* distribution. If we wanted to calculate probabilities of the Student *t* random variable manually as we did for the normal random variable, then we would need a different table for each ν , which is not practical. Alternatively, we can use Microsoft Excel or Minitab. The instructions are given later in this section.

Determining Student t Values As you will discover later in this book, the Student t distribution is used extensively in statistical inference. And for inferential methods, we often need to find values of the random variable. To determine values of a normal random variable, we used Table 3 backward. Finding values of a Student t random variable is considerably easier. Table 4 in Appendix B (reproduced here as Table 8.2) lists values of $t_{A,\nu}$, which are the values of a Student t random variable with ν degrees of freedom such that

$$P(t > t_{A,\nu}) = A$$

Figure 8.26 depicts this notation.

FIGURE 8.26 Student t Distribution with t_A



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TABLE 8.2 Critical Values of t

ν	$t_{.100}$	$t_{.050}$	$t_{.025}$	$t_{.010}$	$t_{.005}$	ν	$t_{.100}$	$t_{.050}$	$t_{.025}$	$t_{.010}$	$t_{.005}$
1	3.078	6.314	12.71	31.82	63.66	29	1.311	1.699	2.045	2.462	2.756
2	1.886	2.920	4.303	6.965	9.925	30	1.310	1.697	2.042	2.457	2.750
3	1.638	2.353	3.182	4.541	5.841	35	1.306	1.690	2.030	2.438	2.724
4	1.533	2.132	2.776	3.747	4.604	40	1.303	1.684	2.021	2.423	2.704
5	1.476	2.015	2.571	3.365	4.032	45	1.301	1.679	2.014	2.412	2.690
6	1.440	1.943	2.447	3.143	3.707	50	1.299	1.676	2.009	2.403	2.678
7	1.415	1.895	2.365	2.998	3.499	55	1.297	1.673	2.004	2.396	2.668
8	1.397	1.860	2.306	2.896	3.355	60	1.296	1.671	2.000	2.390	2.660
9	1.383	1.833	2.262	2.821	3.250	65	1.295	1.669	1.997	2.385	2.654
10	1.372	1.812	2.228	2.764	3.169	70	1.294	1.667	1.994	2.381	2.648
11	1.363	1.796	2.201	2.718	3.106	75	1.293	1.665	1.992	2.377	2.643
12	1.356	1.782	2.179	2.681	3.055	80	1.292	1.664	1.990	2.374	2.639
13	1.350	1.771	2.160	2.650	3.012	85	1.292	1.663	1.988	2.371	2.635
14	1.345	1.761	2.145	2.624	2.977	90	1.291	1.662	1.987	2.368	2.632
15	1.341	1.753	2.131	2.602	2.947	95	1.291	1.661	1.985	2.366	2.629
16	1.337	1.746	2.120	2.583	2.921	100	1.290	1.660	1.984	2.364	2.626
17	1.333	1.740	2.110	2.567	2.898	110	1.289	1.659	1.982	2.361	2.621
18	1.330	1.734	2.101	2.552	2.878	120	1.289	1.658	1.980	2.358	2.617
19	1.328	1.729	2.093	2.539	2.861	130	1.288	1.657	1.978	2.355	2.614
20	1.325	1.725	2.086	2.528	2.845	140	1.288	1.656	1.977	2.353	2.611
21	1.323	1.721	2.080	2.518	2.831	150	1.287	1.655	1.976	2.351	2.609
22	1.321	1.717	2.074	2.508	2.819	160	1.287	1.654	1.975	2.350	2.607
23	1.319	1.714	2.069	2.500	2.807	170	1.287	1.654	1.974	2.348	2.605
24	1.318	1.711	2.064	2.492	2.797	180	1.286	1.653	1.973	2.347	2.603
25	1.316	1.708	2.060	2.485	2.787	190	1.286	1.653	1.973	2.346	2.602
26	1.315	1.706	2.056	2.479	2.779	200	1.286	1.653	1.972	2.345	2.601
27	1.314	1.703	2.052	2.473	2.771	∞	1.282	1.645	1.960	2.326	2.576
28	1.313	1.701	2.048	2.467	2.763						

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Observe that $t_{A,\nu}$ is provided for degrees of freedom ranging from 1 to 200 and ∞ . To read this table, simply identify the degrees of freedom and find that value or the closest number to it if it is not listed. Then locate the column representing the t_A value you wish. For example, if we want the value of t with 10 degrees of freedom such that the area under the Student t curve is .05, we locate 10 in the first column and move across this row until we locate the number under the heading $t_{.05}$. From Table 8.3, we find

$$t_{.05, 10} = 1.812$$

If the number of degrees of freedom is not shown, find its closest value. For example, suppose we wanted to find $t_{.025, 32}$. Because 32 degrees of freedom is not listed, we find the closest number of degrees of freedom, which is 30 and use $t_{.025, 30} = 2.042$ as an approximation.

TABLE 8.3 Finding $t_{.05, 10}$

DEGREES OF FREEDOM	$t_{.10}$	$t_{.05}$	$t_{.025}$	$t_{.01}$	$t_{.005}$
1	3.078	6.314	12.706	31.821	63.657
2	1.886	2.920	4.303	6.965	9.925
3	1.638	2.353	3.182	4.541	5.841
4	1.533	2.132	2.776	3.747	4.604
5	1.476	2.015	2.571	3.365	4.032
6	1.440	1.943	2.447	3.143	3.707
7	1.415	1.895	2.365	2.998	3.499
8	1.397	1.860	2.306	2.896	3.355
9	1.383	1.833	2.262	2.821	3.250
10	1.372	1.812	2.228	2.764	3.169
11	1.363	1.796	2.201	2.718	3.106
12	1.356	1.782	2.179	2.681	3.055

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Because the Student t distribution is symmetric about 0, the value of t such that the area to its left is A is $-t_{A,\nu}$. For example, the value of t with 10 degrees of freedom such that the area to its left is .05 is

$$-t_{.05, 10} = -1.812$$

Notice the last row in the Student t table. The number of degrees of freedom is infinite, and the t values are identical (except for the number of decimal places) to the values of z . For example,

$$t_{.10, \infty} = 1.282$$

$$t_{.05, \infty} = 1.645$$

$$t_{.025, \infty} = 1.960$$

$$\begin{aligned}t_{.01,\infty} &= 2.326 \\t_{.005,\infty} &= 2.576\end{aligned}$$

In the previous section, we showed (or showed how we determine) that

$$\begin{aligned}z_{.10} &= 1.28 \\z_{.05} &= 1.645 \\z_{.025} &= 1.96 \\z_{.01} &= 2.23 \\z_{.005} &= 2.575\end{aligned}$$

Using the Computer

EXCEL

INSTRUCTIONS

To compute Student t probabilities, type

$$= \text{TDIST}([x], [\nu], [\text{Tails}])$$

where x must be positive, ν is the number of degrees of freedom, and “Tails” is 1 or 2. Typing 1 for “Tails” produces the area to the right of x . Typing 2 for “Tails” produces the area to the right of x plus the area to the left of $-x$. For example,

$$= \text{TDIST}(2, 50, 1) = .02547$$

and

$$= \text{TDIST}(2, 50, 2) = .05095$$

To determine t_A , type

$$= \text{TINV}([2A], [\nu])$$

For example, to find $t_{.05, 200}$ enter

$$= \text{TINV}(.10, 200)$$

yielding 1.6525.

MINITAB

INSTRUCTIONS

Click **Calc**, **Probability Distributions**, and **t ...** and type the **Degrees of freedom**.

Chi-Squared Distribution The density function of another very useful random variable is exhibited next.

Chi-Squared Density Function

The chi-squared density function is

$$f(\chi^2) = \frac{1}{\Gamma(\nu/2)} \frac{1}{2^{\nu/2}} (\chi^2)^{(\nu/2)-1} e^{-\chi^2/2} \quad \chi^2 > 0$$

The parameter ν is the number of degrees of freedom, which like the degrees of freedom of the Student t distribution affects the shape.

Figure 8.27 depicts a **chi-squared distribution**. As you can see, it is positively skewed ranging between 0 and ∞ . Like that of the Student t distribution, its shape depends on its number of degrees of freedom. The effect of increasing the degrees of freedom is seen in Figure 8.28.

FIGURE 8.27 Chi-Squared Distribution

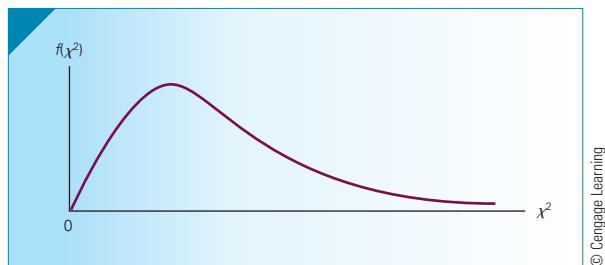
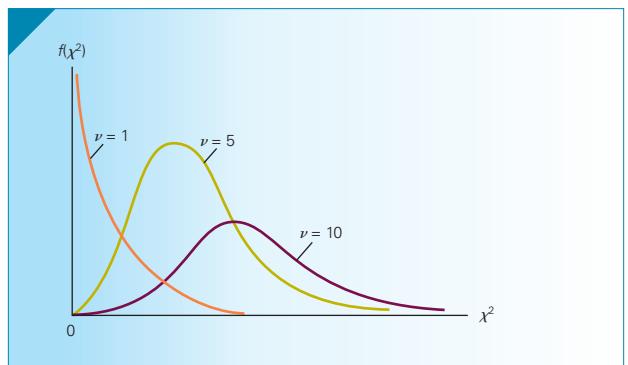


FIGURE 8.28 Chi-Squared Distribution with $\nu = 1, 5$, and 10



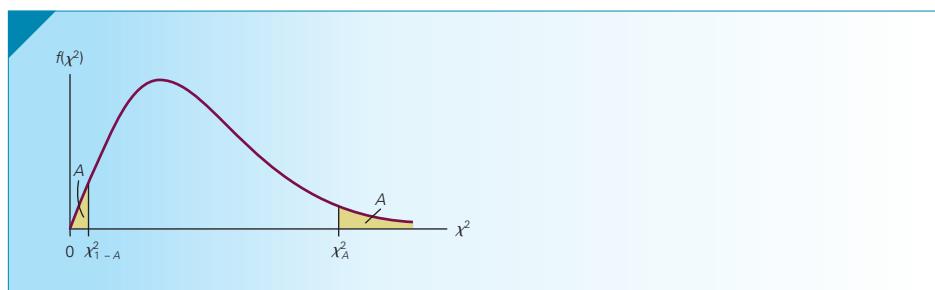
The mean and variance of a chi-squared random variable are

$$E(\chi^2) = \nu$$

and

$$V(\chi^2) = 2\nu$$

Determining Chi-Squared Values The value of χ^2 with ν degrees of freedom such that the area to its right under the chi-squared curve is equal to A is denoted $\chi_{A,\nu}^2$. We cannot use $-\chi_{A,\nu}^2$ to represent the point such that the area to its left is A (as we did with the standard normal and Student t values) because χ^2 is always greater than 0. To represent left-tail critical values, we note that if the area to the left of a point is A , the area to its right must be $1 - A$ because the entire area under the chi-squared curve (as well as all continuous distributions) must equal 1. Thus, $\chi_{1-A,\nu}^2$ denotes the point such that the area to its left is A . See Figure 8.29.

FIGURE 8.29 χ_A^2 and χ_{1-A}^2 

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Table 5 in Appendix B (reproduced here as Table 8.4) lists critical values of the chi-squared distribution for degrees of freedom equal to 1 to 30, 40, 50, 60, 70, 80, 90, and 100. For example, to find the point in a chi-squared distribution with 8 degrees of freedom such that the area to its right is .05, locate 8 degrees of freedom in the left column and $\chi_{.050}^2$ across the top. The intersection of the row and column contains the number we seek as shown in Table 8.5; that is,

$$\chi_{.050, 8}^2 = 15.5$$

To find the point in the same distribution such that the area to its *left* is .05, find the point such that the area to its *right* is .95. Locate $\chi_{.950}^2$ across the top row and 8 degrees of freedom down the left column (also shown in Table 8.5). You should see that

$$\chi_{.950, 8}^2 = 2.73$$

TABLE 8.4 Critical Values of χ^2

ν	$\chi_{.995}^2$	$\chi_{.990}^2$	$\chi_{.975}^2$	$\chi_{.950}^2$	$\chi_{.900}^2$	$\chi_{.100}^2$	$\chi_{.050}^2$	$\chi_{.025}^2$	$\chi_{.010}^2$	$\chi_{.005}^2$
1	0.000039	0.000157	0.000982	0.00393	0.0158	2.71	3.84	5.02	6.63	7.88
2	0.0100	0.0201	0.0506	0.103	0.211	4.61	5.99	7.38	9.21	10.6
3	0.072	0.115	0.216	0.352	0.584	6.25	7.81	9.35	11.3	12.8
4	0.207	0.297	0.484	0.711	1.06	7.78	9.49	11.1	13.3	14.9
5	0.412	0.554	0.831	1.15	1.61	9.24	11.1	12.8	15.1	16.7
6	0.676	0.872	1.24	1.64	2.20	10.6	12.6	14.4	16.8	18.5
7	0.989	1.24	1.69	2.17	2.83	12.0	14.1	16.0	18.5	20.3
8	1.34	1.65	2.18	2.73	3.49	13.4	15.5	17.5	20.1	22.0
9	1.73	2.09	2.70	3.33	4.17	14.7	16.9	19.0	21.7	23.6
10	2.16	2.56	3.25	3.94	4.87	16.0	18.3	20.5	23.2	25.2
11	2.60	3.05	3.82	4.57	5.58	17.3	19.7	21.9	24.7	26.8
12	3.07	3.57	4.40	5.23	6.30	18.5	21.0	23.3	26.2	28.3
13	3.57	4.11	5.01	5.89	7.04	19.8	22.4	24.7	27.7	29.8
14	4.07	4.66	5.63	6.57	7.79	21.1	23.7	26.1	29.1	31.3
15	4.60	5.23	6.26	7.26	8.55	22.3	25.0	27.5	30.6	32.8
16	5.14	5.81	6.91	7.96	9.31	23.5	26.3	28.8	32.0	34.3

(Continued)

TABLE 8.4 Critical Values of χ^2 (Continued)

ν	$\chi^2_{.995}$	$\chi^2_{.990}$	$\chi^2_{.975}$	$\chi^2_{.950}$	$\chi^2_{.900}$	$\chi^2_{.100}$	$\chi^2_{.050}$	$\chi^2_{.025}$	$\chi^2_{.010}$	$\chi^2_{.005}$
17	5.70	6.41	7.56	8.67	10.09	24.8	27.6	30.2	33.4	35.7
18	6.26	7.01	8.23	9.39	10.86	26.0	28.9	31.5	34.8	37.2
19	6.84	7.63	8.91	10.12	11.65	27.2	30.1	32.9	36.2	38.6
20	7.43	8.26	9.59	10.85	12.44	28.4	31.4	34.2	37.6	40.0
21	8.03	8.90	10.28	11.59	13.24	29.6	32.7	35.5	38.9	41.4
22	8.64	9.54	10.98	12.34	14.04	30.8	33.9	36.8	40.3	42.8
23	9.26	10.20	11.69	13.09	14.85	32.0	35.2	38.1	41.6	44.2
24	9.89	10.86	12.40	13.85	15.66	33.2	36.4	39.4	43.0	45.6
25	10.52	11.52	13.12	14.61	16.47	34.4	37.7	40.6	44.3	46.9
26	11.16	12.20	13.84	15.38	17.29	35.6	38.9	41.9	45.6	48.3
27	11.81	12.88	14.57	16.15	18.11	36.7	40.1	43.2	47.0	49.6
28	12.46	13.56	15.31	16.93	18.94	37.9	41.3	44.5	48.3	51.0
29	13.12	14.26	16.05	17.71	19.77	39.1	42.6	45.7	49.6	52.3
30	13.79	14.95	16.79	18.49	20.60	40.3	43.8	47.0	50.9	53.7
40	20.71	22.16	24.43	26.51	29.05	51.8	55.8	59.3	63.7	66.8
50	27.99	29.71	32.36	34.76	37.69	63.2	67.5	71.4	76.2	79.5
60	35.53	37.48	40.48	43.19	46.46	74.4	79.1	83.3	88.4	92.0
70	43.28	45.44	48.76	51.74	55.33	85.5	90.5	95.0	100	104
80	51.17	53.54	57.15	60.39	64.28	96.6	102	107	112	116
90	59.20	61.75	65.65	69.13	73.29	108	113	118	124	128
100	67.33	70.06	74.22	77.93	82.36	118	124	130	136	140

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TABLE 8.5 Critical Values of $\chi^2_{.05,8}$ and $\chi^2_{.950,8}$

DEGREES OF FREEDOM	$\chi^2_{.995}$	$\chi^2_{.990}$	$\chi^2_{.975}$	$\chi^2_{.950}$	$\chi^2_{.900}$	$\chi^2_{.100}$	$\chi^2_{.050}$	$\chi^2_{.025}$	$\chi^2_{.010}$	$\chi^2_{.005}$
1	0.000039	0.000157	0.000982	0.00393	0.0158	2.71	3.84	5.02	6.63	7.88
2	0.0100	0.0201	0.0506	0.103	0.211	4.61	5.99	7.38	9.21	10.6
3	0.072	0.115	0.216	0.352	0.584	6.25	7.81	9.35	11.3	12.8
4	0.207	0.297	0.484	0.711	1.06	7.78	9.49	11.1	13.3	14.9
5	0.412	0.554	0.831	1.15	1.61	9.24	11.1	12.8	15.1	16.7
6	0.676	0.872	1.24	1.64	2.20	10.6	12.6	14.4	16.8	18.5
7	0.989	1.24	1.69	2.17	2.83	12.0	14.1	16.0	18.5	20.3
8	1.34	1.65	2.18	2.73	3.49	13.4	15.5	17.5	20.1	22.0
9	1.73	2.09	2.70	3.33	4.17	14.7	16.9	19.0	21.7	23.6
10	2.16	2.56	3.25	3.94	4.87	16.0	18.3	20.5	23.2	25.2
11	2.60	3.05	3.82	4.57	5.58	17.3	19.7	21.9	24.7	26.8

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For values of degrees of freedom greater than 100, the chi-squared distribution can be approximated by a normal distribution with $\mu = \nu$ and $\sigma = \sqrt{2\nu}$.

Using the Computer

EXCEL

INSTRUCTIONS

To calculate $P(\chi^2 > x)$, type into any cell

$$= \text{CHIDIST}([x], [\nu])$$

For example, $=\text{CHIDIST}(6.25, 3) = .100$.

To determine $\chi_{A,\nu}$, type

$$= \text{CHIINV}([A], [\nu])$$

For example, $=\text{CHIINV}(.10, 3) = 6.25$

MINITAB

INSTRUCTIONS

Click **Calc**, **Probability Distributions**, and **Chi-square ...**. Specify the **Degrees of freedom**.

8-4b F Distribution

The density function of the **F distribution** is given in the following box.

F Density Function

$$f(F) = \frac{\Gamma\left(\frac{\nu_1 + \nu_2}{2}\right)}{\Gamma\left(\frac{\nu_1}{2}\right)\Gamma\left(\frac{\nu_2}{2}\right)} \left(\frac{\nu_1}{\nu_2}\right)^{\frac{\nu_1}{2}} \frac{F^{\frac{\nu_1 - 2}{2}}}{\left(1 + \frac{\nu_1 F}{\nu_2}\right)^{\frac{\nu_2 + \nu_1}{2}}} \quad F > 0$$

where F ranges from 0 to ∞ and ν_1 and ν_2 are the parameters of the distribution called degrees of freedom. For reasons that are clearer in Chapter 13, we call ν_1 the *numerator degrees of freedom* and ν_2 the *denominator degrees of freedom*.

The mean and variance of an F random variable are

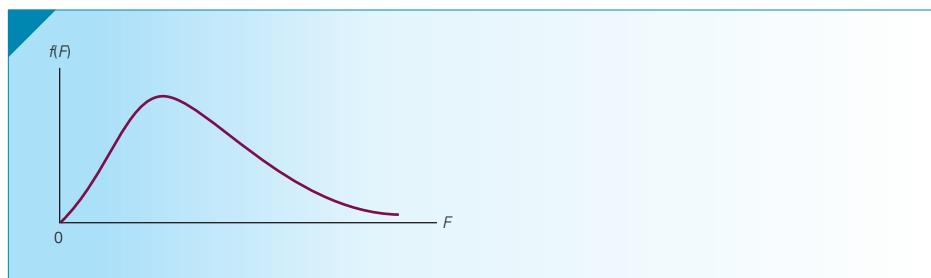
$$E(F) = \frac{\nu_2}{\nu_2 - 2} \quad \nu_2 > 2$$

and

$$V(F) = \frac{2\nu_2^2(\nu_1 + \nu_2 - 2)}{\nu_1(\nu_2 - 2)^2(\nu_2 - 4)} \quad \nu_2 > 4$$

Notice that the mean depends only on the denominator degrees of freedom and that for large ν_2 the mean of the F distribution is approximately 1. Figure 8.30 describes the density function when it is graphed. As you can see, the F distribution is positively skewed. Its actual shape depends on the two numbers of degrees of freedom.

FIGURE 8.30 F Distribution



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Determining Values of F We define F_{A,ν_1,ν_2} as the value of F with ν_1 and ν_2 degrees of freedom such that the area to its right under the curve is A ; that is,

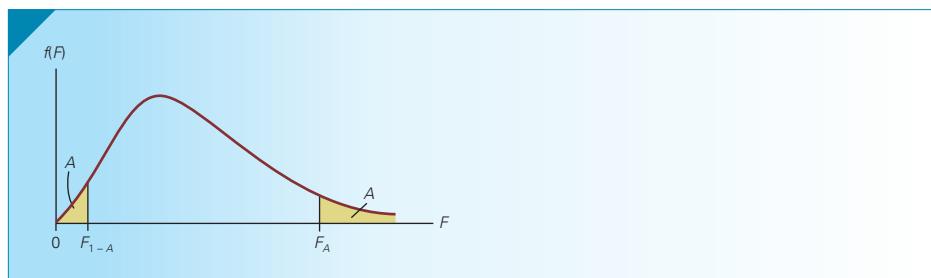
$$P(F > F_{A,\nu_1,\nu_2}) = A$$

Because the F random variable like the chi-squared can equal only positive values, we define F_{1-A,ν_1,ν_2} as the value such that the area to its left is A . Figure 8.31 depicts this notation. Table 6 in Appendix B provides values of F_{A,ν_1,ν_2} for $A = .05, .025, .01$, and $.005$. Part of Table 6 is reproduced here as Table 8.6.

Values of F_{1-A,ν_1,ν_2} are unavailable. However, we do not need them because we can determine F_{1-A,ν_1,ν_2} from F_{A,ν_1,ν_2} . Statisticians can show that

$$F_{1-A,\nu_1,\nu_2} = \frac{1}{F_{A,\nu_2,\nu_1}}.$$

FIGURE 8.31 F_{1-A} and F_A



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TABLE 8.6 Critical Values of F_A for $A = .05$

ν_2	ν_1									
	1	2	3	4	5	6	7	8	9	10
1	161	199	216	225	230	234	237	239	241	242
2	18.5	19.0	19.2	19.2	19.3	19.3	19.4	19.4	19.4	19.4
3	10.1	9.55	9.28	9.12	9.01	8.94	8.89	8.85	8.81	8.79
4	7.71	6.94	6.59	6.39	6.26	6.16	6.09	6.04	6.00	5.96
5	6.61	5.79	5.41	5.19	5.05	4.95	4.88	4.82	4.77	4.74
6	5.99	5.14	4.76	4.53	4.39	4.28	4.21	4.15	4.10	4.06
7	5.59	4.74	4.35	4.12	3.97	3.87	3.79	3.73	3.68	3.64
8	5.32	4.46	4.07	3.84	3.69	3.58	3.50	3.44	3.39	3.35
9	5.12	4.26	3.86	3.63	3.48	3.37	3.29	3.23	3.18	3.14
10	4.96	4.10	3.71	3.48	3.33	3.22	3.14	3.07	3.02	2.98
11	4.84	3.98	3.59	3.36	3.20	3.09	3.01	2.95	2.90	2.85
12	4.75	3.89	3.49	3.26	3.11	3.00	2.91	2.85	2.80	2.75
13	4.67	3.81	3.41	3.18	3.03	2.92	2.83	2.77	2.71	2.67
14	4.60	3.74	3.34	3.11	2.96	2.85	2.76	2.70	2.65	2.60
15	4.54	3.68	3.29	3.06	2.90	2.79	2.71	2.64	2.59	2.54
16	4.49	3.63	3.24	3.01	2.85	2.74	2.66	2.59	2.54	2.49
17	4.45	3.59	3.20	2.96	2.81	2.70	2.61	2.55	2.49	2.45
18	4.41	3.55	3.16	2.93	2.77	2.66	2.58	2.51	2.46	2.41
19	4.38	3.52	3.13	2.90	2.74	2.63	2.54	2.48	2.42	2.38
20	4.35	3.49	3.10	2.87	2.71	2.60	2.51	2.45	2.39	2.35
22	4.30	3.44	3.05	2.82	2.66	2.55	2.46	2.40	2.34	2.30
24	4.26	3.40	3.01	2.78	2.62	2.51	2.42	2.36	2.30	2.25
26	4.23	3.37	2.98	2.74	2.59	2.47	2.39	2.32	2.27	2.22
28	4.20	3.34	2.95	2.71	2.56	2.45	2.36	2.29	2.24	2.19
30	4.17	3.32	2.92	2.69	2.53	2.42	2.33	2.27	2.21	2.16
35	4.12	3.27	2.87	2.64	2.49	2.37	2.29	2.22	2.16	2.11
40	4.08	3.23	2.84	2.61	2.45	2.34	2.25	2.18	2.12	2.08
45	4.06	3.20	2.81	2.58	2.42	2.31	2.22	2.15	2.10	2.05
50	4.03	3.18	2.79	2.56	2.40	2.29	2.20	2.13	2.07	2.03
60	4.00	3.15	2.76	2.53	2.37	2.25	2.17	2.10	2.04	1.99
70	3.98	3.13	2.74	2.50	2.35	2.23	2.14	2.07	2.02	1.97
80	3.96	3.11	2.72	2.49	2.33	2.21	2.13	2.06	2.00	1.95
90	3.95	3.10	2.71	2.47	2.32	2.20	2.11	2.04	1.99	1.94
100	3.94	3.09	2.70	2.46	2.31	2.19	2.10	2.03	1.97	1.93
120	3.92	3.07	2.68	2.45	2.29	2.18	2.09	2.02	1.96	1.91
140	3.91	3.06	2.67	2.44	2.28	2.16	2.08	2.01	1.95	1.90
160	3.90	3.05	2.66	2.43	2.27	2.16	2.07	2.00	1.94	1.89
180	3.89	3.05	2.65	2.42	2.26	2.15	2.06	1.99	1.93	1.88
200	3.89	3.04	2.65	2.42	2.26	2.14	2.06	1.98	1.93	1.88
∞	3.84	3.00	2.61	2.37	2.21	2.10	2.01	1.94	1.88	1.83

To determine any critical value, find the numerator degrees of freedom ν_1 across the top of Table 6 and the denominator degrees of freedom ν_2 down the left column. The intersection of the row and column contains the number we seek. To illustrate, suppose that we want to find $F_{.05, 5, 7}$. Table 8.7 shows how this point is found. Locate the numerator degrees of freedom, 5, across the top and the denominator degrees of freedom, 7, down the left column. The intersection is 3.97. Thus, $F_{.05, 5, 7} = 3.97$.

TABLE 8.7 $F_{.05, 5, 7}$

		NUMERATOR DEGREES OF FREEDOM								
		1	2	3	4	5	6	7	8	9
Denominator Degrees of Freedom	1	161	199	216	225	230	234	237	239	241
	2	18.5	19.0	19.2	19.2	19.3	19.3	19.4	19.4	19.4
	3	10.1	9.55	9.28	9.12	9.01	8.94	8.89	8.85	8.81
	4	7.71	6.94	6.59	6.39	6.26	6.16	6.09	6.04	6.00
	5	6.61	5.79	5.41	5.19	5.05	4.95	4.88	4.82	4.77
	6	5.99	5.14	4.76	4.53	4.39	4.28	4.21	4.15	4.1
	7	5.59	4.74	4.35	4.12	3.97	3.87	3.79	3.73	3.68
	8	5.32	4.46	4.07	3.84	3.69	3.58	3.5	3.44	3.39
	9	5.12	4.26	3.86	3.63	3.48	3.37	3.29	3.23	3.18
	10	4.96	4.10	3.71	3.48	3.33	3.22	3.14	3.07	3.02

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Note that the order in which the degrees of freedom appear is important. To find $F_{.05, 7, 5}$ (numerator degrees of freedom = 7 and denominator degrees of freedom = 5), we locate 7 across the top and 5 down the side. The intersection is $F_{.05, 7, 5} = 4.88$.

Suppose that we want to determine the point in an F distribution with $\nu_1 = 4$ and $\nu_2 = 8$ such that the area to its right is .95. Thus,

$$F_{.95, 4, 8} = \frac{1}{F_{.05, 8, 4}} = \frac{1}{6.04} = .166$$

Using the Computer

EXCEL

INSTRUCTIONS

For probabilities, type

$$= \text{FDIST}([X], [\nu_1], [\nu_2])$$

For example, $= \text{FDIST}(3.97, 5, 7) = .05$.

To determine F_{A, ν_1, ν_2} , type

$$= \text{FINV}([A], [\nu_1], [\nu_2])$$

For example, $= \text{FINV}(.05, 5, 7) = 3.97$.

MINITAB**INSTRUCTIONS**

Click **Calc**, **Probability Distributions**, and **F** Specify the **Numerator degrees of freedom** and the **Denominator degrees of freedom**.

**EXERCISES**

Some of the following exercises require the use of a computer and software.

- 8.83** Use the t table (Table 4) to find the following values of t .
 a. $t_{.10, 15}$ b. $t_{.10, 23}$ c. $t_{.025, 83}$ d. $t_{.05, 195}$
- 8.84** Use the t table (Table 4) to find the following values of t .
 a. $t_{.005, 33}$ b. $t_{.10, 600}$ c. $t_{.05, 4}$ d. $t_{.01, 20}$
- 8.85** Use a computer to find the following values of t .
 a. $t_{.10, 15}$ b. $t_{.10, 23}$ c. $t_{.025, 83}$ d. $t_{.05, 195}$
- 8.86** Use a computer to find the following values of t .
 a. $t_{.05, 143}$ b. $t_{.01, 12}$ c. $t_{.025, \infty}$ d. $t_{.05, 100}$
- 8.87** Use a computer to find the following probabilities.
 a. $P(t_{64} > 2.12)$ c. $P(t_{159} > 1.33)$
 b. $P(t_{27} > 1.90)$ d. $P(t_{550} > 1.85)$
- 8.88** Use a computer to find the following probabilities.
 a. $P(t_{141} > .94)$ c. $P(t_{1000} > 1.96)$
 b. $P(t_{421} > 2.00)$ d. $P(t_{82} > 1.96)$
- 8.89** Use the χ^2 table (Table 5) to find the following values of χ^2 .
 a. $\chi^2_{.10, 5}$ b. $\chi^2_{.01, 100}$ c. $\chi^2_{.95, 18}$ d. $\chi^2_{.99, 60}$
- 8.90** Use the χ^2 table (Table 5) to find the following values of χ^2 .
 a. $\chi^2_{.90, 26}$ b. $\chi^2_{.01, 30}$ c. $\chi^2_{.10, 1}$ d. $\chi^2_{.99, 80}$
- 8.91** Use a computer to find the following values of χ^2 .
 a. $\chi^2_{.25, 66}$ b. $\chi^2_{.40, 100}$ c. $\chi^2_{.50, 17}$ d. $\chi^2_{.10, 17}$
- 8.92** Use a computer to find the following values of χ^2 .
 a. $\chi^2_{.99, 55}$ b. $\chi^2_{.05, 800}$ c. $\chi^2_{.99, 43}$ d. $\chi^2_{.10, 233}$

- 8.93** Use a computer to find the following probabilities.
 a. $P(\chi^2_{73} > 80)$
 b. $P(\chi^2_{300} > 125)$
 c. $P(\chi^2_{88} > 60)$
 d. $P(\chi^2_{1000} > 450)$
- 8.94** Use a computer to find the following probabilities.
 a. $P(\chi^2_{250} > 250)$ c. $P(\chi^2_{600} > 500)$
 b. $P(\chi^2_{36} > 25)$ d. $P(\chi^2_{120} > 100)$
- 8.95** Use the F table (Table 6) to find the following values of F .
 a. $F_{.05, 3, 7}$ b. $F_{.05, 7, 3}$ c. $F_{.025, 5, 20}$ d. $F_{.01, 12, 60}$
- 8.96** Use the F table (Table 6) to find the following values of F .
 a. $F_{.025, 8, 22}$ c. $F_{.01, 9, 18}$
 b. $F_{.05, 20, 30}$ d. $F_{.025, 24, 10}$
- 8.97** Use a computer to find the following values of F .
 a. $F_{.05, 70, 70}$ c. $F_{.025, 36, 50}$
 b. $F_{.01, 45, 100}$ d. $F_{.05, 500, 500}$
- 8.98** Use a computer to find the following values of F .
 a. $F_{.01, 100, 150}$ c. $F_{.01, 11, 33}$
 b. $F_{.05, 25, 125}$ d. $F_{.05, 300, 800}$
- 8.99** Use a computer to find the following probabilities.
 a. $P(F_{7, 20} > 2.5)$ c. $P(F_{34, 62} > 1.8)$
 b. $P(F_{18, 63} > 1.4)$ d. $P(F_{200, 400} > 1.1)$
- 8.100** Use a computer to find the following probabilities.
 a. $P(F_{600, 800} > 1.1)$
 b. $P(F_{35, 100} > 1.3)$
 c. $P(F_{66, 148} > 2.1)$
 d. $P(F_{17, 37} > 2.8)$

CHAPTER SUMMARY

This chapter dealt with **continuous random variables** and their distributions. Because a continuous random variable can assume an infinite number of values, the probability that the random variable equals any single value is 0. Consequently, we addressed the problem of computing the probability of a range of values. We showed that the probability of any interval is the area in the interval under the curve representing the **density function**.

We introduced the most important distribution in statistics and showed how to compute the probability that a

normal random variable falls into any interval. Additionally, we demonstrated how to use the normal table backward to find values of a normal random variable given a probability. Next we introduced the **exponential distribution**, a distribution that is particularly useful in several management-science applications. Finally, we presented three more continuous random variables and their probability density functions. The **Student *t***, **chi-squared**, and ***F* distributions** will be used extensively in statistical inference.

IMPORTANT TERMS:

- Probability density function 261
- Uniform probability distribution 262
- Rectangular probability distribution 262
- Normal distribution 266
- Normal random variable 266
- Standard normal random variable 267

- Exponential distribution 283
- Student *t* distribution 287
- Degrees of freedom 287
- Chi-squared distribution 292
- F* distribution 295

SYMBOLS:

Symbol	Pronounced	Represents
π	pi	3.14159 ...
z_A	z -sub- <i>A</i> or z - <i>A</i>	Value of <i>Z</i> such that area to its right is <i>A</i>
ν	nu	Degrees of freedom
t_A	t -sub- <i>A</i> or t - <i>A</i>	Value of <i>t</i> such that area to its right is <i>A</i>
χ^2_A	chi-squared-sub- <i>A</i> or chi-squared- <i>A</i>	Value of chi-squared such that area to its right is <i>A</i>
F_A	F -sub- <i>A</i> or F - <i>A</i>	Value of <i>F</i> such that area to its right is <i>A</i>
ν_1	nu-sub-one or nu-one	Numerator degrees of freedom
ν_2	nu-sub-two or nu-two	Denominator degrees of freedom

COMPUTER OUTPUT AND INSTRUCTIONS:

Probability/Random Variable	Excel	Minitab
Normal probability	277	278
Normal random variable	277	278
Exponential probability	285	285
Exponential random variable	285	285
Student <i>t</i> probability	291	291
Student <i>t</i> random variable	291	291
Chi-squared probability	295	295
Chi-squared random variable	295	295
<i>F</i> probability	298	299
<i>F</i> random variable	298	299

9



Yuriy Rudyi/Shutterstock.com

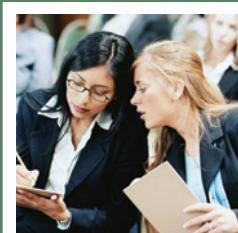
SAMPLING DISTRIBUTIONS

- 9-1 *Sampling Distribution of the Mean*
- 9-2 *Sampling Distribution of a Proportion*
- 9-3 *Sampling Distribution of the Difference between Two Means*
- 9-4 *From Here to Inference*

Salaries of a Business School's Graduates

Deans and other faculty members in professional schools often monitor how well the graduates of their programs fare in the job market. Information about the types of jobs and their salaries may provide useful information about the success of a program.

In the advertisements for a large university, the dean of the School of Business claims that the average salary of the school's graduates 1 year after graduation is \$800 per week, with a standard deviation of \$100. A second-year student in the business school who has just completed his statistics course would like to check whether the claim about the mean is correct. He does a survey of 25 people who graduated 1 year earlier and determines their weekly salary. He discovers the sample mean to be \$750. To interpret his finding, he needs to calculate the probability that a sample of 25 graduates would have a mean of \$750 or less when the population mean is \$800 and the standard deviation is \$100. After calculating the probability, he needs to draw some conclusion.



Leland Bobbe/Stone/Getty Images

See page 309 for the answer.

INTRODUCTION

This chapter introduces the *sampling distribution*, a fundamental element in statistical inference. We remind you that statistical inference is the process of converting data into information. Here are the parts of the process we have thus far discussed:

1. Parameters describe populations.
2. Parameters are almost always unknown.
3. We take a random sample of a population to obtain the necessary data.
4. We calculate one or more statistics from the data.

For example, to estimate a population mean, we compute the sample mean. Although there is very little chance that the sample mean and the population mean are identical, we would expect them to be quite close. However, for the purposes of statistical inference, we need to be able to measure *how* close. The sampling distribution provides this service. It plays a crucial role in the process because the measure of proximity it provides is the key to statistical inference.

9-1 SAMPLING DISTRIBUTION OF THE MEAN

A **sampling distribution** is created by, as the name suggests, sampling. There are two ways to create a sampling distribution. The first is to actually draw samples of the same size from a population, calculate the statistic of interest, and then use descriptive techniques to learn more about the sampling distribution. The second method relies on the rules of probability and the laws of expected value and variance to derive the sampling distribution. We'll demonstrate the latter approach by developing the sampling distribution of the mean of two dice.

9-1a Sampling Distribution of the Mean of Two Dice

The population is created by throwing a fair die infinitely many times, with the random variable X indicating the number of spots showing on any one throw. The probability distribution of the random variable X is as follows:

x	1	2	3	4	5	6
$P(x)$	1/6	1/6	1/6	1/6	1/6	1/6

The population is infinitely large because we can throw the die infinitely many times (or at least imagine doing so). From the definitions of expected value and variance presented in Section 7-1, we calculate the population mean, variance, and standard deviation.

Population mean:

$$\begin{aligned}\mu &= \sum xP(x) \\ &= 1(1/6) + 2(1/6) + 3(1/6) + 4(1/6) + 5(1/6) + 6(1/6) \\ &= 3.5\end{aligned}$$

Population variance:

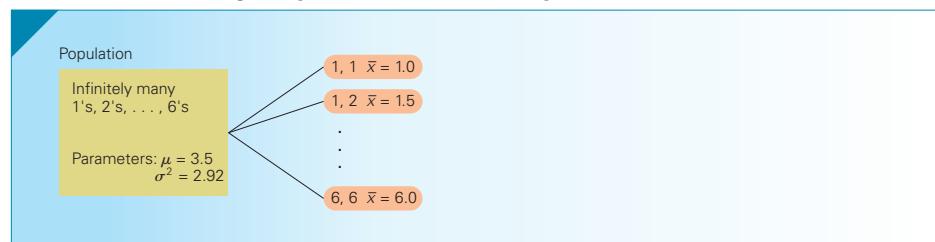
$$\begin{aligned}\sigma^2 &= \sum (x - \mu)^2 P(x) \\ &= (1 - 3.5)^2(1/6) + (2 - 3.5)^2(1/6) + (3 - 3.5)^2(1/6) + (4 - 3.5)^2(1/6) \\ &\quad + (5 - 3.5)^2(1/6) + (6 - 3.5)^2(1/6) \\ &= 2.92\end{aligned}$$

Population standard deviation:

$$\sigma = \sqrt{\sigma^2} = \sqrt{2.92} = 1.71$$

The sampling distribution is created by drawing samples of size 2 from the population. In other words, we toss two dice. Figure 9.1 depicts this process in which we compute the mean for each sample. Because the value of the sample mean varies randomly from sample to sample, we can regard \bar{X} as a new random variable created by sampling. Table 9.1 lists all the possible samples and their corresponding values of \bar{x} .

FIGURE 9.1 Drawing Samples of Size 2 from a Population



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TABLE 9.1 All Samples of Size 2 and Their Means

SAMPLE	\bar{X}	SAMPLE	\bar{X}	SAMPLE	\bar{X}
1, 1	1.0	3, 1	2.0	5, 1	3.0
1, 2	1.5	3, 2	2.5	5, 2	3.5
1, 3	2.0	3, 3	3.0	5, 3	4.0
1, 4	2.5	3, 4	3.5	5, 4	4.5
1, 5	3.0	3, 5	4.0	5, 5	5.0
1, 6	3.5	3, 6	4.5	5, 6	5.5
2, 1	1.5	4, 1	2.5	6, 1	3.5
2, 2	2.0	4, 2	3.0	6, 2	4.0
2, 3	2.5	4, 3	3.5	6, 3	4.5
2, 4	3.0	4, 4	4.0	6, 4	5.0
2, 5	3.5	4, 5	4.5	6, 5	5.5
2, 6	4.0	4, 6	5.0	6, 6	6.0

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There are 36 different possible samples of size 2; because each sample is equally likely, the probability of any one sample being selected is 1/36. However, \bar{x} can assume only 11 different possible values: 1.0, 1.5, 2.0, ..., 6.0, with certain values of \bar{x} occurring more frequently than others. The value $\bar{x} = 1.0$ occurs only once, so its probability is 1/36. The value $\bar{x} = 1.5$ can occur in two ways—(1, 2) and (2, 1)—each having the same probability (1/36). Thus, $P(\bar{x} = 1.5) = 2/36$. The probabilities of the other values

of \bar{x} are determined in similar fashion, and the resulting **sampling distribution of the sample mean** is shown in Table 9.2.

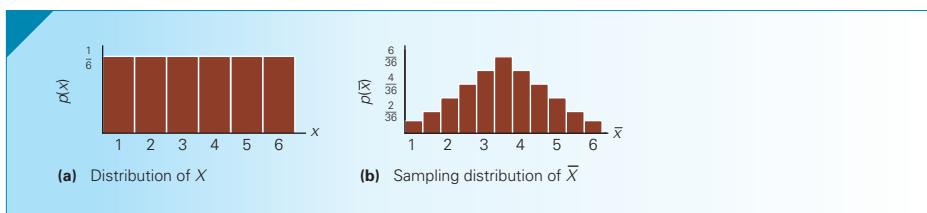
TABLE 9.2 Sampling Distribution of \bar{X}

\bar{x}	$P(\bar{x})$
1.0	1/36
1.5	2/36
2.0	3/36
2.5	4/36
3.0	5/36
3.5	6/36
4.0	5/36
4.5	4/36
5.0	3/36
5.5	2/36
6.0	1/36

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The most interesting aspect of the sampling distribution of \bar{X} is how different it is from the distribution of X , as can be seen in Figure 9.2.

FIGURE 9.2 Distributions of X and \bar{X}



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We can also compute the mean, variance, and standard deviation of the sampling distribution. Once again using the definitions of expected value and variance, we determine the following parameters of the sampling distribution.

Mean of the sampling distribution of \bar{X} :

$$\begin{aligned}\mu_{\bar{x}} &= \sum \bar{x} P(\bar{x}) \\ &= 1.0(1/36) + 1.5(2/36) + \dots + 6.0(1/36) \\ &= 3.5\end{aligned}$$

Notice that the mean of the sampling distribution of \bar{X} is equal to the mean of the population of the toss of a die computed previously.

Variance of the sampling distribution of \bar{X} :

$$\begin{aligned}\sigma_{\bar{x}}^2 &= \sum (\bar{x} - \mu_{\bar{x}})^2 P(\bar{x}) \\ &= (1.0 - 3.5)^2(1/36) + (1.5 - 3.5)^2(2/36) + \dots + (6.0 - 3.5)^2(1/36) \\ &= 1.46\end{aligned}$$

It is no coincidence that the variance of the sampling distribution of \bar{X} is exactly half of the variance of the population of the toss of a die (computed previously as $\sigma^2 = 2.92$).

Standard deviation of the sampling distribution of \bar{X} :

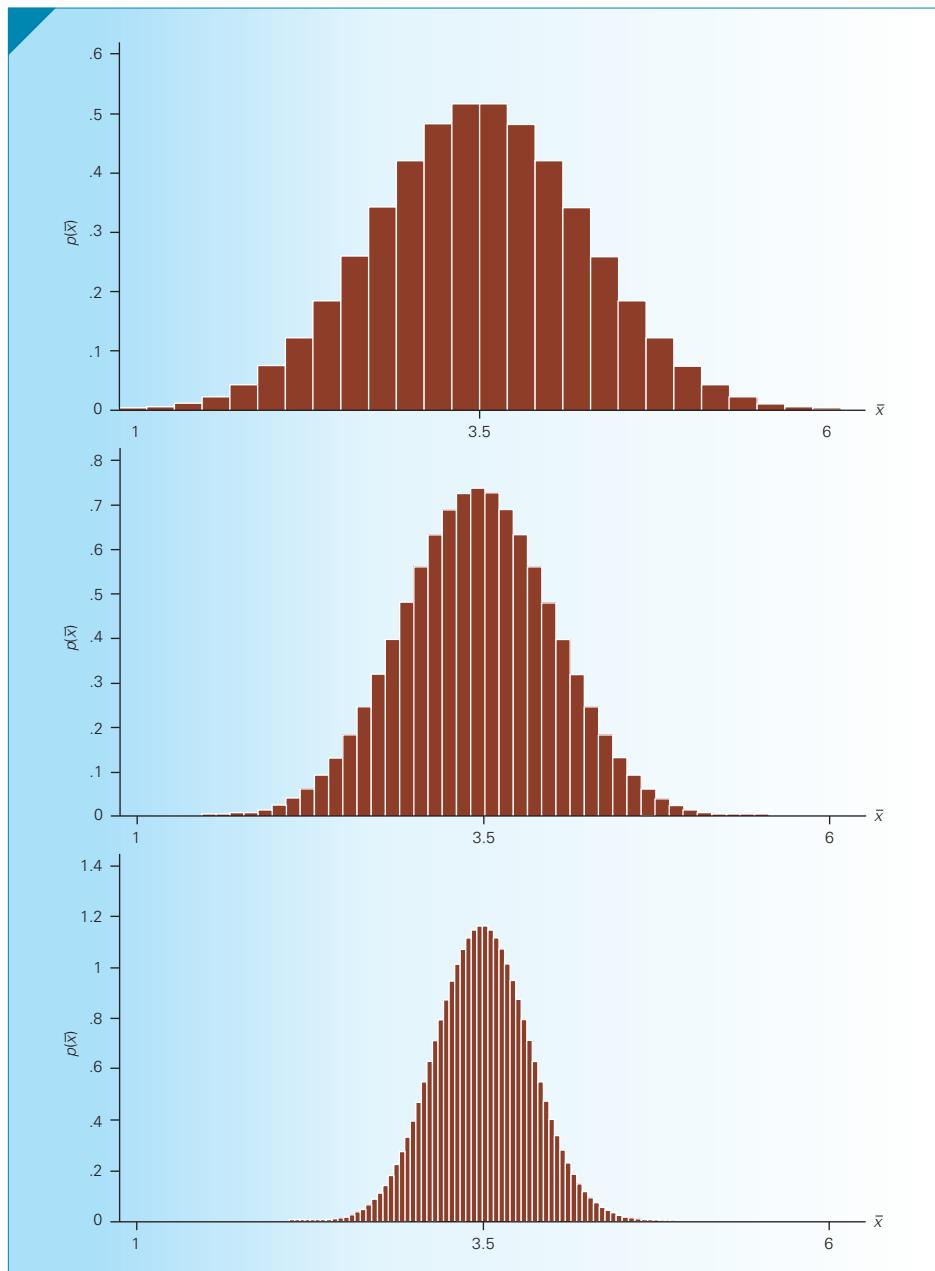
$$\sigma_{\bar{x}} = \sqrt{\sigma_{\bar{x}}^2} = \sqrt{1.46} = 1.21$$

It is important to recognize that the distribution of \bar{X} is different from the distribution of X as depicted in Figure 9.2. However, the two random variables are related. Their means are the same ($\mu_{\bar{X}} = \mu = 3.5$) and their variances are related ($\sigma_{\bar{X}}^2 = \sigma^2/2$).

Don't get lost in the terminology and notation. Remember that μ and σ^2 are the parameters of the population of X . To create the sampling distribution of \bar{X} , we repeatedly drew samples of size $n = 2$ from the population and calculated \bar{x} for each sample. Thus, we treat \bar{X} as a brand-new random variable, with its own distribution, mean, and variance. The mean is denoted $\mu_{\bar{X}}$, and the variance is denoted $\sigma_{\bar{X}}^2$.

If we now repeat the sampling process with the same population but with other values of n , we produce somewhat different sampling distributions of \bar{X} . Figure 9.3 shows the sampling distributions of \bar{X} when $n = 5, 10$, and 25 .

FIGURE 9.3 Sampling Distributions of \bar{X} for $n = 5, 10$, and 25



For each value of n , the mean of the sampling distribution of \bar{X} is the mean of the population from which we're sampling; that is,

$$\mu_{\bar{x}} = \mu = 3.5$$

The variance of the sampling distribution of the sample mean is the variance of the population divided by the sample size:

$$\sigma_{\bar{x}}^2 = \frac{\sigma^2}{n}$$

The standard deviation of the sampling distribution is called the **standard error of the mean**; that is,

$$\sigma_{\bar{x}} = \frac{\sigma}{\sqrt{n}}$$

As you can see, the variance of the sampling distribution of \bar{X} is less than the variance of the population we're sampling from all sample sizes. Thus, a randomly selected value of \bar{X} (the mean of the number of spots observed in, say, five throws of the die) is likely to be closer to the mean value of 3.5 than is a randomly selected value of X (the number of spots observed in one throw). Indeed, this is what you would expect, because in five throws of the die you are likely to get some 5s and 6s and some 1s and 2s, which will tend to offset one another in the averaging process and produce a sample mean reasonably close to 3.5. As the number of throws of the die increases, the probability that the sample mean will be close to 3.5 also increases. Thus, we observe in Figure 9.3 that the sampling distribution of \bar{X} becomes narrower (or more concentrated about the mean) as n increases.

Another thing that happens as n gets larger is that the sampling distribution of \bar{x} becomes increasingly bell shaped. This phenomenon is summarized in the **central limit theorem**.

Central Limit Theorem

The sampling distribution of the mean of a random sample drawn from any population is approximately normal for a sufficiently large sample size. The larger the sample size, the more closely the sampling distribution of \bar{X} will resemble a normal distribution.

The accuracy of the approximation alluded to in the central limit theorem depends on the probability distribution of the population and on the sample size. If the population is normal, then \bar{X} is normally distributed for all values of n . If the population is nonnormal, then \bar{X} is approximately normal only for larger values of n . In many practical situations, a sample size of 30 may be sufficiently large to allow us to use the normal distribution as an approximation for the sampling distribution of \bar{X} . However, if the population is extremely nonnormal (e.g., bimodal and highly skewed distributions), the sampling distribution will also be nonnormal even for moderately large values of n .

Sampling Distribution of the Mean of Any Population We can extend the discoveries we've made to all infinitely large populations. Statisticians have shown that the mean of the sampling distribution is always equal to the mean of the population

and that the standard error is equal to σ/\sqrt{n} for infinitely large populations. (In Keller's website Appendix Using the Laws of Expected Value and Variance to Derive the Parameters of Sampling Distributions we describe how to mathematically prove that $\mu_{\bar{x}} = \mu$ and $\sigma_{\bar{x}}^2 = \sigma^2/n$.) However, if the population is finite the standard error is

$$\sigma_{\bar{x}} = \frac{\sigma}{\sqrt{n}} \sqrt{\frac{N-n}{N-1}}$$

where N is the population size and $\sqrt{\frac{N-n}{N-1}}$ is called the **finite population correction factor**. (The source of the correction factor is provided in Keller's website Appendix Hypergeometric Distribution.) An analysis (see Exercises 9.13 and 9.14) reveals that if the population size is large relative to the sample size, then the finite population correction factor is close to 1 and can be ignored. As a rule of thumb, we will treat any population that is at least 20 times larger than the sample size as large. In practice, most applications involve populations that qualify as large because if the population is small, it may be possible to investigate each member of the population, and in so doing, calculate the parameters precisely. As a consequence, the finite population correction factor is usually omitted.

We can now summarize what we know about the sampling distribution of the sample mean for large populations.

Sampling Distribution of the Sample Mean

1. $\mu_{\bar{x}} = \mu$

2. $\sigma_{\bar{x}}^2 = \sigma^2/n$ and $\sigma_{\bar{x}} = \sigma/\sqrt{n}$

3. If X is normal, then \bar{X} is normal. If X is nonnormal, then \bar{X} is approximately normal for sufficiently large sample sizes. The definition of "sufficiently large" depends on the extent of nonnormality of X .

9-1b Creating the Sampling Distribution Empirically

In the previous analysis, we created the sampling distribution of the mean theoretically. We did so by listing all the possible samples of size 2 and their probabilities. (They were all equally likely with probability 1/36.) From this distribution, we produced the sampling distribution. We could also create the distribution empirically by actually tossing two fair dice repeatedly, calculating the sample mean for each sample, counting the number of times each value of \bar{X} occurs, and computing the relative frequencies to estimate the theoretical probabilities. If we toss the two dice a large enough number of times, the relative frequencies and theoretical probabilities (computed previously) will be similar. Try it yourself. Toss two dice 500 times, calculate the mean of the two tosses, count the number of times each sample mean occurs, and construct the histogram representing the sampling distribution. Obviously, this approach is far from ideal because of the excessive amount of time required to toss the dice enough times to make the relative frequencies good approximations for the theoretical probabilities. However, we can use the computer to quickly simulate tossing dice many times.

EXAMPLE 9.1**Contents of a 32-Ounce Bottle**

The foreman of a bottling plant has observed that the amount of soda in each 32-ounce bottle is actually a normally distributed random variable, with a mean of 32.2 ounces and a standard deviation of .3 ounce.

- If a customer buys one bottle, what is the probability that the bottle will contain more than 32 ounces?
- If a customer buys a carton of four bottles, what is the probability that the mean amount of the four bottles will be greater than 32 ounces?

SOLUTION:

- Because the random variable is the amount of soda in one bottle, we want to find $P(X > 32)$, where X is normally distributed, $\mu = 32.2$, and $\sigma = .3$. Hence,

$$\begin{aligned} P(X > 32) &= P\left(\frac{X - \mu}{\sigma} > \frac{32 - 32.2}{.3}\right) \\ &= P(Z > - .67) \\ &= 1 - P(Z < - .67) \\ &= 1 - .2514 = .7486 \end{aligned}$$

- Now we want to find the probability that the mean amount of four filled bottles exceeds 32 ounces; that is, we want $P(\bar{X} > 32)$. From our previous analysis and from the central limit theorem, we know the following:

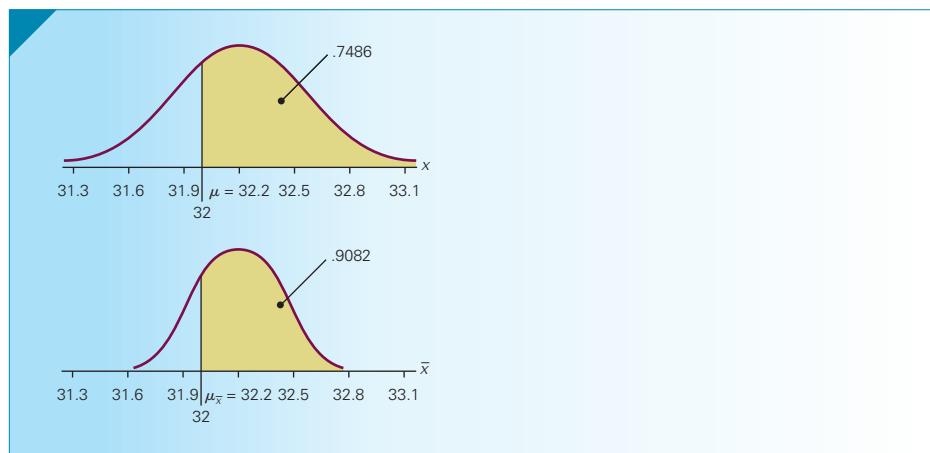
- \bar{X} is normally distributed.
- $\mu_{\bar{x}} = \mu = 32.2$
- $\sigma_{\bar{x}} = \sigma/\sqrt{n} = .3/\sqrt{4} = .15$

Hence,

$$\begin{aligned} P(\bar{X} > 32) &= P\left(\frac{\bar{X} - \mu_{\bar{x}}}{\sigma_{\bar{x}}} > \frac{32 - 32.2}{.15}\right) = P(Z > -1.33) \\ &= 1 - P(Z < -1.33) = 1 - .0918 = .9082 \end{aligned}$$

Figure 9.4 illustrates the distributions used in this example.

FIGURE 9.4 Distribution of X and Sampling Distribution of \bar{X}



In Example 9.1(b), we began with the assumption that both μ and σ were known. Then, using the sampling distribution, we made a probability statement about \bar{X} . Unfortunately, the values of μ and σ are not usually known, so an analysis such as that in Example 9.1 cannot usually be conducted. However, we can use the sampling distribution to infer something about an unknown value of μ on the basis of a sample mean.

Salaries of a Business School's Graduates: Solution

We want to find the probability that the sample mean is less than \$750. Thus, we seek

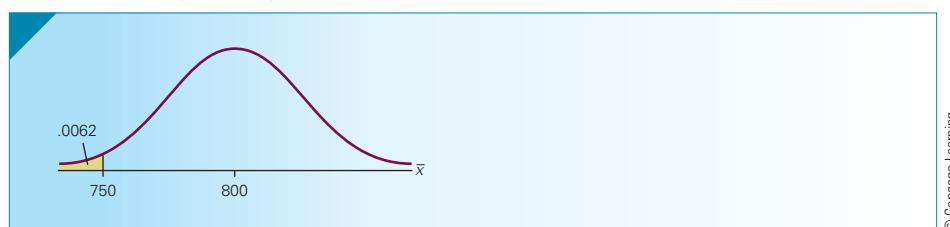
$$P(\bar{X} < 750)$$

The distribution of X , the weekly income, is likely to be positively skewed, but not sufficiently so to make the distribution of \bar{X} nonnormal. As a result, we may assume that \bar{X} is normal with mean $\mu_{\bar{X}} = \mu = 800$ and standard deviation $\sigma_{\bar{X}} = \sigma/\sqrt{n} = 100/\sqrt{25} = 20$. Thus,

$$P(\bar{X} < 750) = P\left(\frac{\bar{X} - \mu_{\bar{X}}}{\sigma_{\bar{X}}} < \frac{750 - 800}{20}\right) = P(Z < -2.5) = .0062$$

Figure 9.5 illustrates the distribution.

FIGURE 9.5 $P(\bar{X} < 750)$



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The probability of observing a sample mean as low as \$750 when the population mean is \$800 is extremely small. Because this event is quite unlikely, we would have to conclude that the dean's claim is not justified.

9-1c Using the Sampling Distribution for Inference

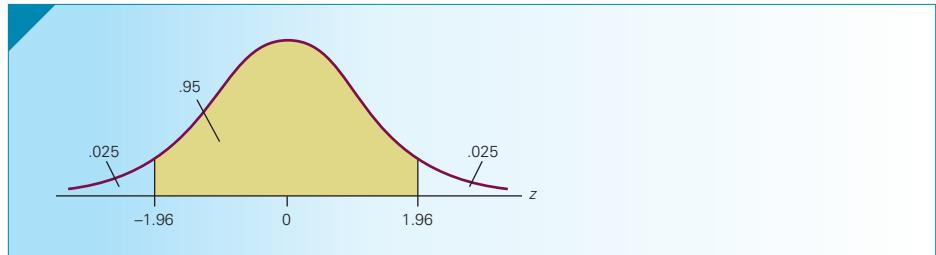
Our conclusion in the chapter-opening example illustrates how the sampling distribution can be used to make inferences about population parameters. The first form of inference is estimation, which we introduce in the next chapter. In preparation for this momentous occasion, we'll present another way of expressing the probability associated with the sampling distribution.

Recall the notation introduced in Section 8-2 (see page 273). We defined z_A to be the value of Z such that the area to the right of z_A under the standard normal curve is equal to A . We also showed that $z_{.025} = 1.96$. Because the standard normal distribution is symmetric about 0, the area to the left of -1.96 is also .025. The area

between -1.96 and 1.96 is $.95$. Figure 9.6 depicts this notation. We can express the notation algebraically as

$$P(-1.96 < Z < 1.96) = .95$$

FIGURE 9.6 $P(-1.96 < Z < 1.96) = .95$



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In this section, we established that

$$Z = \frac{\bar{X} - \mu}{\sigma/\sqrt{n}}$$

is standard normally distributed. Substituting this form of Z into the previous probability statement, we produce

$$P\left(-1.96 < \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < 1.96\right) = .95$$

With a little algebraic manipulation (multiply all three terms by σ/\sqrt{n} and add μ to all three terms), we determine

$$P\left(\mu - 1.96 \frac{\sigma}{\sqrt{n}} < \bar{X} < \mu + 1.96 \frac{\sigma}{\sqrt{n}}\right) = .95$$

Returning to the chapter-opening example where $\mu = 800$, $\sigma = 100$, and $n = 25$, we compute

$$P\left(800 - 1.96 \frac{100}{\sqrt{25}} < \bar{X} < 800 + 1.96 \frac{100}{\sqrt{25}}\right) = .95$$

Thus, we can say that

$$P(760.8 < \bar{X} < 839.2) = .95$$

This tells us that there is a 95% probability that a sample mean will fall between 760.8 and 839.2. Because the sample mean was computed to be \$750, we would have to conclude that the dean's claim is not supported by the statistic.

Changing the probability from $.95$ to $.90$ changes the probability statement to

$$P\left(\mu - 1.645 \frac{\sigma}{\sqrt{n}} < \bar{X} < \mu + 1.645 \frac{\sigma}{\sqrt{n}}\right) = .90$$

We can also produce a general form of this statement:

$$P\left(\mu - z_{\alpha/2} \frac{\sigma}{\sqrt{n}} < \bar{X} < \mu + z_{\alpha/2} \frac{\sigma}{\sqrt{n}}\right) = 1 - \alpha$$

In this formula α (Greek letter *alpha*) is the probability that \bar{X} does not fall into the interval. To apply this formula, all we need do is substitute the values for μ , σ , n , and α . For example, with $\mu = 800$, $\sigma = 100$, $n = 25$, and $\alpha = .01$, we produce

$$\begin{aligned} P\left(\mu - z_{.005}\frac{\sigma}{\sqrt{n}} < \bar{X} < \mu + z_{.005}\frac{\sigma}{\sqrt{n}}\right) &= 1 - .01 \\ P\left(800 - 2.575\frac{100}{\sqrt{25}} < \bar{X} < 800 + 2.575\frac{100}{\sqrt{25}}\right) &= .99 \\ P(748.5 < \bar{X} < 851.5) &= .99 \end{aligned}$$

which is another probability statement about \bar{X} . In Section 10-2, we will use a similar type of probability statement to derive the first statistical inference technique.



EXERCISES

- 9.1** Let X represent the result of the toss of a fair die. Find the following probabilities.
- $P(X = 1)$
 - $P(X = 6)$
- 9.2** Let \bar{X} represent the mean of the toss of two fair dice. Use the probabilities listed in Table 9.2 to determine the following probabilities.
- $P(\bar{X} = 1)$
 - $P(\bar{X} = 6)$
- 9.3** An experiment consists of tossing five balanced dice. Find the following probabilities. (Determine the exact probabilities as we did in Tables 9.1 and 9.2 for two dice.)
- $P(\bar{X} = 1)$
 - $P(\bar{X} = 6)$
- 9.4** Refer to Exercises 9.1 to 9.3. What do the probabilities tell you about the variances of X and \bar{X} ?
- 9.5** A normally distributed population has a mean of 40 and a standard deviation of 12. What does the central limit theorem say about the sampling distribution of the mean if samples of size 100 are drawn from this population?
- 9.6** Refer to Exercise 9.5. Suppose that the population is not normally distributed. Does this change your answer? Explain.
- 9.7** A sample of $n = 16$ observations is drawn from a normal population with $\mu = 1,000$ and $\sigma = 200$. Find the following.
- $P(\bar{X} > 1,050)$
 - $P(\bar{X} < 960)$
 - $P(\bar{X} > 1,100)$
- 9.8** Repeat Exercise 9.7 with $n = 25$.
- 9.9** Repeat Exercise 9.7 with $n = 100$.
- 9.10** Given a normal population whose mean is 50 and whose standard deviation is 5, find the probability that a random sample of
- 4 has a mean between 49 and 52.
 - 16 has a mean between 49 and 52.
 - 25 has a mean between 49 and 52.
- 9.11** Repeat Exercise 9.10 for a standard deviation of 10.
- 9.12** Repeat Exercise 9.10 for a standard deviation of 20.
- 9.13**
- Calculate the finite population correction factor when the population size is $N = 1,000$ and the sample size is $n = 100$.
 - Repeat part (a) when $N = 3,000$.
 - Repeat part (a) when $N = 5,000$.
 - What have you learned about the finite population correction factor when N is large relative to n ?
- 9.14**
- Suppose that the standard deviation of a population with $N = 10,000$ members is 500. Determine the standard error of the sampling distribution of the mean when the sample size is 1,000.
 - Repeat part (a) when $n = 500$.
 - Repeat part (a) when $n = 100$.
- 9.15** The heights of North American women are normally distributed with a mean of 64 inches and a standard deviation of 2 inches.
- What is the probability that a randomly selected woman is taller than 66 inches?
 - A random sample of four women is selected. What is the probability that the sample mean height is greater than 66 inches?
 - What is the probability that the mean height of a random sample of 100 women is greater than 66 inches?

- 9.16** Refer to Exercise 9.15. If the population of women's heights is not normally distributed, which, if any, of the questions can you answer? Explain.
- 9.17** An automatic machine in a manufacturing process is operating properly if the lengths of an important subcomponent are normally distributed with mean = 117 cm and standard deviation = 5.2 cm.
- Find the probability that one selected subcomponent is longer than 120 cm.
 - Find the probability that if four subcomponents are randomly selected, their mean length exceeds 120 cm.
 - Find the probability that if four subcomponents are randomly selected, all four have lengths that exceed 120 cm.
- 9.18** The amount of time the university professors devote to their jobs per week is normally distributed with a mean of 52 hours and a standard deviation of 6 hours.
- What is the probability that a professor works for more than 60 hours per week?
 - Find the probability that the mean amount of work per week for three randomly selected professors is more than 60 hours.
 - Find the probability that if three professors are randomly selected all three work for more than 60 hours per week.
- 9.19** The number of pizzas consumed per month by university students is normally distributed with a mean of 10 and a standard deviation of 3.
- What proportion of students consume more than 12 pizzas per month?
 - What is the probability that in a random sample of 25 students more than 275 pizzas are consumed? (*Hint:* What is the mean number of pizzas consumed by the sample of 25 students?)
- 9.20** The marks on a statistics midterm test are normally distributed with a mean of 78 and a standard deviation of 6.
- What proportion of the class has a midterm mark of less than 75?
 - What is the probability that a class of 50 has an average midterm mark that is less than 75?
- 9.21** The amount of time spent by North American adults watching television per day is normally distributed with a mean of 6 hours and a standard deviation of 1.5 hours.
- What is the probability that a randomly selected North American adult watches television for more than 7 hours per day?
 - What is the probability that the average time watching television by a random sample of five North American adults is more than 7 hours?
 - What is the probability that, in a random sample of five North American adults, all watch television for more than 7 hours per day?
- 9.22** The manufacturer of cans of salmon that are supposed to have a net weight of 6 ounces tells you that the net weight is actually a normal random variable with a mean of 6.05 ounces and a standard deviation of .18 ounces. Suppose that you draw a random sample of 36 cans.
- Find the probability that the mean weight of the sample is less than 5.97 ounces.
 - Suppose your random sample of 36 cans of salmon produced a mean weight that is less than 5.97 ounces. Comment on the statement made by the manufacturer.
- 9.23** The number of customers who enter a supermarket each hour is normally distributed with a mean of 600 and a standard deviation of 200. The supermarket is open 16 hours per day. What is the probability that the total number of customers who enter the supermarket in one day is greater than 10,000? (*Hint:* Calculate the average hourly number of customers necessary to exceed 10,000 in one 16-hour day.)
- 9.24** The sign on the elevator in the Peters Building, which houses the School of Business and Economics at WLU, states, "Maximum Capacity 1,140 kilograms (2,500 pounds) or 16 Persons." A professor of statistics wonders what the probability is that 16 persons would weigh more than 1,140 kilograms. Discuss what the professor needs (besides the ability to perform the calculations) in order to satisfy his curiosity.
- 9.25** Refer to Exercise 9.24. Suppose that the professor discovers that the weights of people who use the elevator are normally distributed with an average of 75 kilograms and a standard deviation of 10 kilograms. Calculate the probability that the professor seeks.
- 9.26** The time it takes for a statistics professor to mark his midterm test is normally distributed with a mean of 4.8 minutes and a standard deviation of 1.3 minutes. There are 60 students in the professor's class. What is the probability that he needs more than 5 hours to mark all the midterm tests? (The 60 midterm tests of the students in this year's class can be considered a random sample of the many thousands of midterm tests the professor has marked and will mark.)
- 9.27** Refer to Exercise 9.26. Does your answer change if you discover that the times needed to mark a midterm test are not normally distributed?
- 9.28** The restaurant in a large commercial building provides coffee for the occupants in the building. The restaurateur has determined that the mean number of cups of coffee consumed in a day by all the occupants is 2.0 with a standard deviation of .6. A new tenant of the building intends to have a total of

- 125 new employees. What is the probability that the new employees will consume more than 240 cups per day?
- 9.29** The number of pages produced by a fax machine in a busy office is normally distributed with a mean of 275 and a standard deviation of 75. Determine the probability that in 1 week (5 days) more than 1,500 faxes will be received?

9-2 SAMPLING DISTRIBUTION OF A PROPORTION

In Section 7-4, we introduced the binomial distribution whose parameter is p , the probability of success in any trial. In order to compute binomial probabilities, we assumed that p was known. However, in the real world p is unknown, requiring the statistics practitioner to estimate its value from a sample. The estimator of a population proportion of successes is the sample proportion; that is, we count the number of successes in a sample and compute

$$\hat{P} = \frac{X}{n}$$

(\hat{P} is read as *p hat*) where X is the number of successes and n is the sample size. When we take a sample of size n , we're actually conducting a binomial experiment; as a result, X is binomially distributed. Thus, the probability of any value of \hat{P} can be calculated from its value of X . For example, suppose that we have a binomial experiment with $n = 10$ and $p = .4$. To find the probability that the sample proportion \hat{P} is less than or equal to .50, we find the probability that X is less than or equal to 5 (because $5/10 = .50$). From Table 1 in Appendix B we find with $n = 10$ and $p = .4$

$$P(\hat{P} \leq .50) = P(X \leq 5) = .8338$$

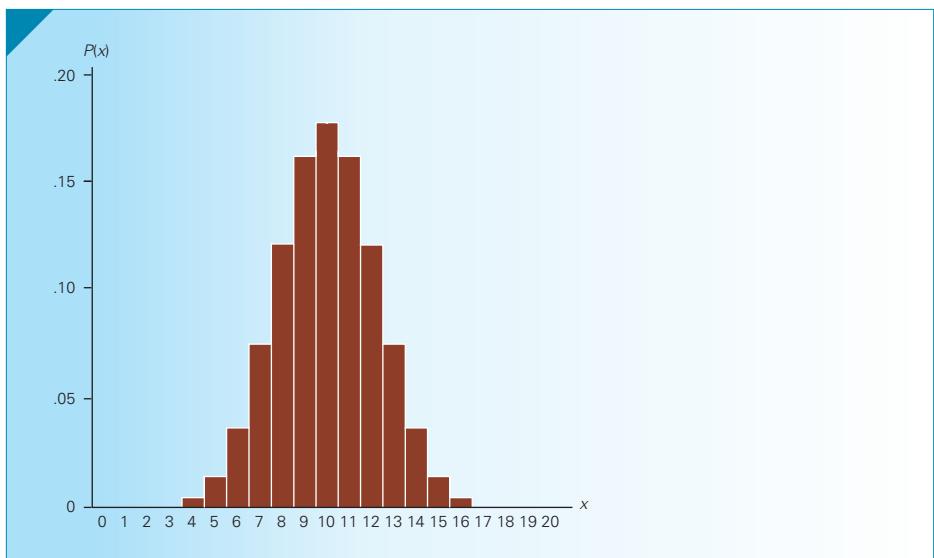
We can calculate the probability associated with other values of \hat{P} similarly.

Discrete distributions such as the binomial do not lend themselves easily to the kinds of calculation needed for inference. And inference is the reason we need sampling distributions. Fortunately, we can approximate the binomial distribution by a normal distribution.

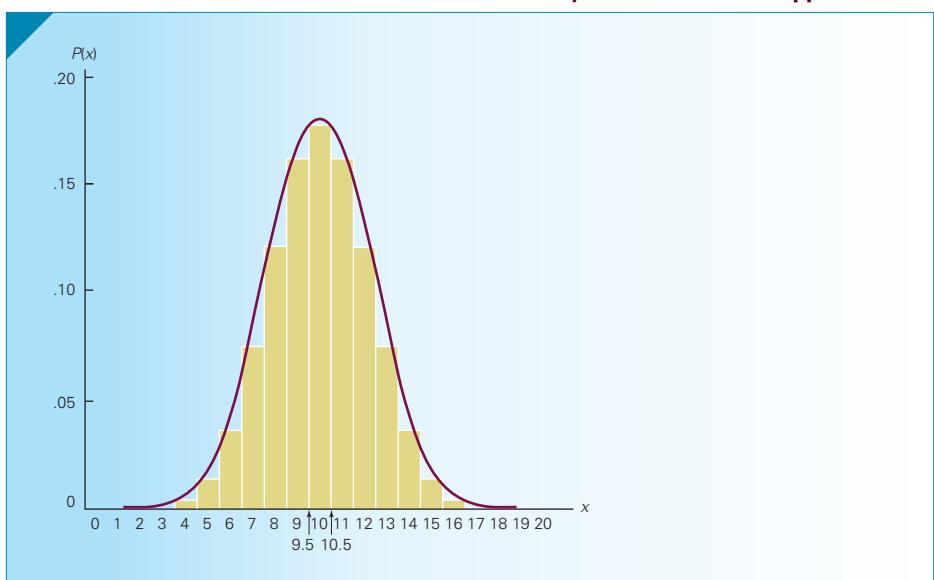
What follows is an explanation of how and why the normal distribution can be used to approximate a binomial distribution. Disinterested readers can skip to page 317, where we present the approximate **sampling distribution of a sample proportion**.

9-2a (Optional) Normal Approximation to the Binomial Distribution

Recall how we introduced continuous probability distributions in Chapter 8. We developed the density function by converting a histogram so that the total area in the rectangles equaled 1. We can do the same for a binomial distribution. To illustrate, let X be a binomial random variable with $n = 20$ and $p = .5$. We can easily determine the probability of each value of X , where $X = 0, 1, 2, \dots, 19, 20$. A rectangle representing a value of x is drawn so that its area equals the probability. We accomplish this by letting the height of the rectangle equal the probability and the base of the rectangle equal 1. Thus, the base of each rectangle for x is the interval $x - .5$ to $x + .5$. Figure 9.7 depicts this graph. As you can see, the rectangle representing $x = 10$ is the rectangle whose base is the interval 9.5 to 10.5 and whose height is $P(X = 10) = .1762$.

FIGURE 9.7 Binomial Distribution with $n = 20$ and $p = .5$ 

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FIGURE 9.8 Binomial Distribution with $n = 20$ and $p = .5$ and Normal Approximation

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If we now smooth the ends of the rectangles, we produce a bell-shaped curve as seen in Figure 9.8. Thus, to use the normal approximation, all we need do is find the area under the *normal* curve between 9.5 and 10.5.

To find normal probabilities it is required to first standardize x by subtracting the mean and dividing by the standard deviation. The values for μ and σ are derived from the binomial distribution being approximated. In Section 7-4 we pointed out that

$$\mu = np$$

and

$$\sigma = \sqrt{np(1-p)}$$

For $n = 20$ and $p = .5$, we have

$$\mu = np = 20(.5) = 10$$

and

$$\sigma = \sqrt{np(1-p)} = \sqrt{20(.5)(1-.5)} = 2.24$$

To calculate the probability that $X = 10$ using the normal distribution requires that we find the area under the normal curve between 9.5 and 10.5; that is,

$$P(X = 10) \approx P(9.5 < Y < 10.5)$$

where Y is a normal random variable approximating the binomial random variable X . We standardize Y and use Table 3 of Appendix B to find

$$\begin{aligned} P(9.5 < Y < 10.5) &= P\left(\frac{9.5 - 10}{2.24} < \frac{Y - \mu}{\sigma} < \frac{10.5 - 10}{2.24}\right) \\ &= P(-.22 < Z < .22) = (Z < .22) - P(Z < -.22) \\ &= .5871 - .4129 = .1742 \end{aligned}$$

The actual probability that X equals 10 is

$$P(X = 10) = .1762$$

As you can see, the approximation is quite good.

Notice that to draw a binomial distribution, which is discrete, it was necessary to draw rectangles whose bases were constructed by adding and subtracting .5 to the values of X . The .5 is called the **continuity correction factor**.

The approximation for any other value of X would proceed in the same manner. In general, the binomial probability $P(X = x)$ is approximated by the area under a normal curve between $x - .5$ and $x + .5$. To find the binomial probability $P(X \leq x)$, we calculate the area under the normal curve to the left of $x + .5$. For the same binomial random variable, the probability that its value is less than or equal to 8 is $P(X \leq 8) = .2517$. The normal approximation is

$$P(X \leq 8) \approx P(Y < 8.5) = P\left(\frac{Y - \mu}{\sigma} < \frac{8.5 - 10}{2.24}\right) = P(Z < -.67) = .2514$$

We find the area under the normal curve to the right of $x - .5$ to determine the binomial probability $P(X \geq x)$. To illustrate, the probability that the binomial random variable (with $n = 20$ and $p = .5$) is greater than or equal to 14 is $P(X \geq 14) = .0577$. The normal approximation is

$$P(X \geq 14) \approx P(Y > 13.5) = P\left(\frac{Y - \mu}{\sigma} > \frac{13.5 - 10}{2.24}\right) = P(Z > 1.56) = .0594$$

9-2b Omitting the Correction Factor for Continuity

When calculating the probability of *individual* values of X as we did when we computed the probability that X equals 10 earlier, the correction factor *must* be used. If we don't, we are left with finding the area in a line, which is 0. When computing the probability of a *range* of values of X , we can omit the correction factor. However, the omission of the correction factor will decrease the accuracy of the approximation. For example, if we approximate $P(X \leq 8)$ as we did previously except without the correction factor, we find

$$P(X \leq 8) \approx P(Y < 8) = P\left(\frac{Y - \mu}{\sigma} < \frac{8 - 10}{2.24}\right) = P(Z < -0.89) = .1867$$

The absolute size of the error between the actual cumulative binomial probability and its normal approximation is quite small when the values of x are in the tail regions of the distribution. For example, the probability that a binomial random variable with $n = 20$ and $p = .5$ is less than or equal to 3 is

$$P(X \leq 3) = .0013$$

The normal approximation with the correction factor is

$$P(X \leq 3) \approx P(Y < 3.5) = P\left(\frac{Y - \mu}{\sigma} < \frac{3.5 - 10}{2.24}\right) = P(Z < -2.90) = .0019$$

The normal approximation without the correction factor is (using Excel)

$$P(X \leq 3) \approx P(Y < 3) = P\left(\frac{Y - \mu}{\sigma} < \frac{3 - 10}{2.24}\right) = P(Z < -3.13) = .0009$$

For larger values of n , the differences between the normal approximation with and without the correction factor are small even for values of X near the center of the distribution. For example, the probability that a binomial random variable with $n = 1,000$ and $p = .3$ is less than or equal to 260 is

$$P(X \leq 260) = .0029 \text{ (using Excel)}$$

The normal approximation with the correction factor is

$$P(X \leq 260) \approx P(Y < 260.5) = P\left(\frac{Y - \mu}{\sigma} < \frac{260.5 - 300}{14.49}\right) = P(Z < -2.73) = .0032$$

The normal approximation without the correction factor is

$$P(X \leq 260) \approx P(Y < 260) = P\left(\frac{Y - \mu}{\sigma} < \frac{260 - 300}{14.49}\right) = P(Z < -2.76) = .0029$$

As we pointed out, the normal approximation of the binomial distribution is made necessary by the needs of statistical inference. As you will discover, statistical inference generally involves the use of large values of n , and the part of the sampling distribution that is of greatest interest lies in the tail regions. The correction factor was a temporary tool that allowed us to convince you that a binomial distribution can be approximated by a normal distribution. Now that we have done so, we will use the normal approximation of the binomial distribution to approximate the sampling distribution of a sample proportion, and in such applications the correction factor will be omitted.

9-2c Approximate Sampling Distribution of a Sample Proportion

Using the laws of expected value and variance (see Keller's website Appendix Using the Laws of Expected Value and Variance to Derive the Parameters of Sampling Distributions), we can determine the mean, variance, and standard deviation of \hat{P} . We will summarize what we have learned.

Sampling Distribution of a Sample Proportion

1. \hat{P} is approximately normally distributed provided that np and $n(1 - p)$ are greater than or equal to 5.
2. The expected value: $E(\hat{P}) = p$
3. The variance: $V(\hat{P}) = \sigma_{\hat{P}}^2 = \frac{p(1 - p)}{n}$
4. The standard deviation: $\sigma_{\hat{P}} = \sqrt{p(1 - p)/n}$

(The standard deviation of \hat{P} is called the **standard error of the proportion**.)

The sample size requirement is theoretical because, in practice, much larger sample sizes are needed for the normal approximation to be useful.

EXAMPLE 9.2

Political Survey

In the last election, a state representative received 52% of the votes cast. One year after the election, the representative organized a survey that asked a random sample of 300 people whether they would vote for him in the next election. If we assume that his popularity has not changed, what is the probability that more than half of the sample would vote for him?

SOLUTION:

The number of respondents who would vote for the representative is a binomial random variable with $n = 300$ and $p = .52$. We want to determine the probability that the sample proportion is greater than 50%. In other words, we want to find $P(\hat{P} > .50)$.

We now know that the sample proportion \hat{P} is approximately normally distributed with mean $p = .52$ and standard deviation $= \sqrt{p(1 - p)/n} = \sqrt{(.52)(.48)/300} = .0288$.

Thus, we calculate

$$\begin{aligned} P(\hat{P} > .50) &= P\left(\frac{\hat{P} - p}{\sqrt{p(1 - p)/n}} > \frac{.50 - .52}{.0288}\right) \\ &= P(Z > -.69) = 1 - P(Z < -.69) = 1 - .2451 = .7549 \end{aligned}$$

If we assume that the level of support remains at 52%, the probability that more than half the sample of 300 people would vote for the representative is .7549.

*As was the case with the standard error of the mean (page 307), the standard error of a proportion is $\sqrt{p(1 - p)/n}$ when sampling from infinitely large populations. When the population is finite, the standard error of the proportion must include the finite population correction factor, which can be omitted when the population is large relative to the sample size, a very common occurrence in practice.



EXERCISES

Use the normal approximation without the correction factor to find the probabilities in the following exercises.

- 9.30** a. In a binomial experiment with $n = 300$ and $p = .5$, find the probability that \hat{P} is greater than 60%.
 b. Repeat part (a) with $p = .55$.
 c. Repeat part (a) with $p = .6$.
- 9.31** a. The probability of success on any trial of a binomial experiment is 25%. Find the probability that the proportion of successes in a sample of 500 is less than 22%.
 b. Repeat part (a) with $n = 800$.
 c. Repeat part (a) with $n = 1,000$.
- 9.32** Determine the probability that in a sample of 100 the sample proportion is less than .75 if $p = .80$.
- 9.33** A binomial experiment where $p = .4$ is conducted. Find the probability that in a sample of 60 the proportion of successes exceeds .35.
- 9.34** The proportion of eligible voters in the next election who will vote for the incumbent is assumed to be 55%. What is the probability that in a random sample of 500 voters less than 49% say they will vote for the incumbent?
- 9.35** The assembly line that produces an electronic component of a missile system has historically resulted in a 2% defective rate. A random sample of 800 components is drawn. What is the probability that the defective rate is greater than 4%? Suppose that in the random sample the defective rate is 4%. What does that suggest about the defective rate on the assembly line?
- 9.36** a. The manufacturer of aspirin claims that the proportion of headache sufferers who get relief with just two aspirins is 53%. What is the probability that in a random sample of 400 headache sufferers, less than 50% obtain relief? If 50% of the sample actually obtained relief, what does this suggest about the manufacturer's claim?
 b. Repeat part (a) using a sample of 1,000.
- 9.37** The manager of a restaurant in a commercial building has determined that the proportion of customers who drink tea is 14%. What is the probability that in the next 100 customers at least 10% will be tea drinkers?
- 9.38** A commercial for a manufacturer of household appliances claims that 3% of all its products require a service call in the first year. A consumer protection association wants to check the claim by surveying 400 households that recently purchased one of the company's appliances. What is the probability that more than 5% require a service call within the first year? What would you say about the commercial's honesty if in a random sample of 400 households 5% report at least one service call?
- 9.39** The Laurier Company's brand has a market share of 30%. Suppose that 1,000 consumers of the product are asked in a survey which brand they prefer. What is the probability that more than 32% of the respondents say they prefer the Laurier brand?
- 9.40** A university bookstore claims that 50% of its customers are satisfied with the service and prices.
 a. If this claim is true, what is the probability that in a random sample of 600 customers less than 45% are satisfied?
 b. Suppose that in a random sample of 600 customers, 270 express satisfaction with the bookstore. What does this tell you about the bookstore's claim?
- 9.41** A psychologist believes that 80% of male drivers when lost continue to drive hoping to find the location they seek rather than ask directions. To examine this belief, he took a random sample of 350 male drivers and asked each what they did when lost. If the belief is true, determine the probability that less than 75% said they continue driving.
- 9.42** The Red Lobster restaurant chain regularly surveys its customers. On the basis of these surveys, the management of the chain claims that 75% of its customers rate the food as excellent. A consumer testing service wants to examine the claim by asking 460 customers to rate the food. What is the probability that less than 70% rate the food as excellent?
- 9.43** An accounting professor claims that no more than one-quarter of undergraduate business students will major in accounting. What is the probability that in a random sample of 1,200 undergraduate business students, 336 or more will major in accounting?
- 9.44** Refer to Exercise 9.43. A survey of a random sample of 1,200 undergraduate business students indicates that 336 students plan to major in accounting. What does this tell you about the professor's claim?

9-3 SAMPLING DISTRIBUTION OF THE DIFFERENCE BETWEEN TWO MEANS

Another sampling distribution that you will soon encounter is that of the **difference between two sample means**. The sampling plan calls for independent random samples drawn from each of two normal populations. The samples are said to be independent if the selection of the members of one sample is independent of the selection of the members of the second sample. We will expand upon this discussion in Chapter 13. We are interested in the sampling distribution of the difference between the two sample means.

In Section 9-1, we introduced the central limit theorem, which states that in repeated sampling from a normal population whose mean is μ and whose standard deviation is σ , the sampling distribution of the sample mean is normal with mean μ and standard deviation σ/\sqrt{n} . Statisticians have shown that the difference between two independent normal random variables is also normally distributed. Thus, the difference between two sample means $\bar{X}_1 - \bar{X}_2$ is normally distributed if both populations are normal.

By using the laws of expected value and variance we derive the expected value and variance of the **sampling distribution of $\bar{X}_1 - \bar{X}_2$** :

$$\mu_{\bar{x}_1 - \bar{x}_2} = \mu_1 - \mu_2$$

and

$$\sigma_{\bar{x}_1 - \bar{x}_2}^2 = \frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}$$

Thus, it follows that in repeated independent sampling from two populations with means μ_1 and μ_2 and standard deviations σ_1 and σ_2 , respectively, the sampling distribution of $\bar{X}_1 - \bar{X}_2$ is normal with mean

$$\mu_{\bar{x}_1 - \bar{x}_2} = \mu_1 - \mu_2$$

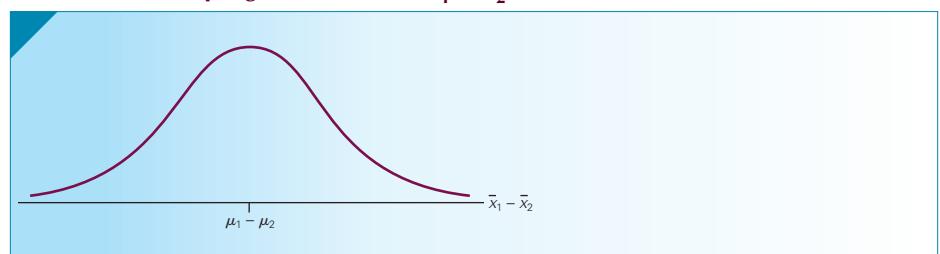
and standard deviation (which is the **standard error of the difference between two means**)

$$\sigma_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

If the populations are nonnormal, then the sampling distribution is only approximately normal for large sample sizes. The required sample sizes depend on the extent of nonnormality. However, for most populations, sample sizes of 30 or more are sufficient.

Figure 9.9 depicts the sampling distribution of the difference between two means.

FIGURE 9.9 Sampling Distribution of $\bar{X}_1 - \bar{X}_2$



EXAMPLE 9.3**Starting Salaries of MBAs**

Suppose that the starting salaries of MBAs at Wilfrid Laurier University (WLU) are normally distributed, with a mean of \$62,000 and a standard deviation of \$14,500. The starting salaries of MBAs at the University of Western Ontario (UWO) are normally distributed, with a mean of \$60,000 and a standard deviation of \$18,300. If a random sample of 50 WLU MBAs and a random sample of 60 UWO MBAs are selected, what is the probability that the sample mean starting salary of WLU graduates will exceed that of the UWO graduates?

SOLUTION:

We want to determine $P(\bar{X}_1 - \bar{X}_2 > 0)$. We know that $\bar{X}_1 - \bar{X}_2$ is normally distributed with mean $\mu_1 - \mu_2 = 62,000 - 60,000 = 2,000$ and standard deviation

$$\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}} = \sqrt{\frac{14,500^2}{50} + \frac{18,300^2}{60}} = 3,128$$

We can standardize the variable and refer to Table 3 of Appendix B:

$$\begin{aligned} P(\bar{X}_1 - \bar{X}_2 > 0) &= P\left(\frac{(\bar{X}_1 - \bar{X}_2) - (\mu_1 - \mu_2)}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}} > \frac{0 - 2,000}{3,128}\right) \\ &= P(Z > -64) = 1 - P(Z < -64) = 1 - .2611 = .7389 \end{aligned}$$

There is a .7389 probability that for a sample of size 50 from the WLU graduates and a sample of size 60 from the UWO graduates, the sample mean starting salary of WLU graduates will exceed the sample mean of UWO graduates.

**EXERCISES**

- 9.45** Independent random samples of 10 observations each are drawn from normal populations. The parameters of these populations are

$$\begin{aligned} \text{Population 1: } \mu &= 280, \sigma = 25 \\ \text{Population 2: } \mu &= 270, \sigma = 30 \end{aligned}$$

Find the probability that the mean of sample 1 is greater than the mean of sample 2 by more than 25.

- 9.46** Repeat Exercise 9.45 with samples of size 50.

- 9.47** Repeat Exercise 9.45 with samples of size 100.

- 9.48** Suppose that we have two normal populations with the means and standard deviations listed here. If random samples of size 25 are drawn from each population, what is the probability that the mean of sample 1 is greater than the mean of sample 2?

$$\begin{aligned} \text{Population 1: } \mu &= 40, \sigma = 6 \\ \text{Population 2: } \mu &= 38, \sigma = 8 \end{aligned}$$

- 9.49** Repeat Exercise 9.48 assuming that the standard deviations are 12 and 16, respectively.

- 9.50** Repeat Exercise 9.48 assuming that the means are 140 and 138, respectively.

- 9.51** A factory's worker productivity is normally distributed. One worker produces an average of 75 units per day with a standard deviation of 20. Another worker produces at an average rate of 65 per day with a standard deviation of 21. What is the probability that in 1 week (5 working days), worker 1 will outproduce worker 2?

- 9.52** A professor of statistics noticed that the marks in his course are normally distributed. He has also noticed that his morning classes average 73%, with a standard deviation of 12% on their final exams. His afternoon classes average 77%, with a standard deviation of 10%. What is the probability that the mean mark of

- four randomly selected students from a morning class is greater than the average mark of four randomly selected students from an afternoon class?
- 9.53** The manager of a restaurant believes that waiters and waitresses who introduce themselves by telling customers their names will get larger tips than those who don't. In fact, she claims that the average tip for the former group is 18%, whereas that of the latter is only 15%. If tips are normally distributed with a standard deviation of 3%, what is the probability that in a random sample of 10 tips recorded from waiters and waitresses who introduce themselves and 10 tips from waiters and waitresses who don't, the mean of the former will exceed that of the latter?
- 9.54** The average North American loses an average of 15 days per year to colds and flu. The natural remedy echinacea reputedly boosts the immune system. One manufacturer of echinacea pills claims that consumers of its product will reduce the number of days lost to colds and flu by one-third. To test the claim, a random sample of 50 people was drawn. Half took echinacea, and the other half took placebos. If we assume that the standard deviation of the number of days lost to colds and flu with and without echinacea is 3 days, find the probability that the mean number of days lost for echinacea users is less than that for nonusers.

9-4 / FROM HERE TO INFERENCE

The primary function of the sampling distribution is statistical inference. To see how the sampling distribution contributes to the development of inferential methods, we need to briefly review how we got to this point.

In Chapters 7 and 8, we introduced probability distributions, which allowed us to make probability statements about values of the random variable. A prerequisite of this calculation is knowledge of the distribution and the relevant parameters. In Example 7.9, we needed to know that the probability that Pat Statsdud guesses the correct answer is 20% ($p = .2$) and that the number of correct answers (successes) in 10 questions (trials) is a binomial random variable. We could then compute the probability of any number of successes. In Example 8.3, we needed to know that the return on investment is normally distributed with a mean of 10% and a standard deviation of 5%. These three bits of information allowed us to calculate the probability of various values of the random variable.

Figure 9.10 symbolically represents the use of probability distributions. Simply put, knowledge of the population and its parameter(s) allows us to use the probability distribution to make probability statements about individual members of the population. The direction of the arrows indicates the direction of the flow of information.

FIGURE 9.10 Probability Distribution



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In this chapter, we developed the sampling distribution, wherein knowledge of the parameter(s) and some information about the distribution allow us to make probability statements about a sample statistic. In Example 9.1(b), knowing the population mean and standard deviation and assuming that the population is not extremely non-normal enabled us to calculate a probability statement about a sample mean. Figure 9.11 describes the application of sampling distributions.

FIGURE 9.11 Sampling Distribution

Notice that in applying both probability distributions and sampling distributions, we must know the value of the relevant parameters, a highly unlikely circumstance. In the real world, parameters are almost always unknown because they represent descriptive measurements about extremely large populations. Statistical inference addresses this problem. It does so by reversing the direction of the flow of knowledge in Figure 9.11. In Figure 9.12, we display the character of statistical inference. Starting in Chapter 10, we will assume that most population parameters are unknown. The statistics practitioner will sample from the population and compute the required statistic. The sampling distribution of that statistic will enable us to draw inferences about the parameter.

FIGURE 9.12 Sampling Distribution in Inference

You may be surprised to learn that, by and large, that is all we do in the remainder of this book. Why then do we need another 14 chapters? They are necessary because there are many more parameter and sampling distribution combinations that define the inferential procedures to be presented in an introductory statistics course. However, they all work in the same way. If you understand how one procedure is developed, then you will likely understand all of them. Our task in the next two chapters is to ensure that you understand the first inferential method. Your job is identical.

CHAPTER SUMMARY

The sampling distribution of a statistic is created by repeated sampling from one population. In this chapter, we introduced the sampling distribution of the mean, the

proportion, and the difference between two means. We described how these distributions are created theoretically and empirically.

IMPORTANT TERMS:

- Sampling distribution 302
- Sampling distribution of the sample mean 304
- Standard error of the mean 306
- Central limit theorem 306
- Finite population correction factor 307
- Sampling distribution of a sample proportion 313

- Continuity correction factor 315
- Standard error of the proportion 317
- Difference between two sample means 319
- Sampling distribution of $\bar{X}_1 - \bar{X}_2$ 319
- Standard error of the difference between two means 319

SYMBOLS:

Symbol	Pronounced	Represents
$\mu_{\bar{x}}$	mu x bar	Mean of the sampling distribution of the sample mean
$\sigma^2_{\bar{x}}$	sigma squared x bar	Variance of the sampling distribution of the sample mean
$\sigma_{\bar{x}}$	sigma x bar	Standard deviation (standard error) of the sampling distribution of the sample mean
α	alpha	Probability
\hat{P}	p hat	Sample proportion
$\sigma^2_{\hat{P}}$	sigma squared p hat	Variance of the sampling distribution of the sample proportion
$\sigma_{\hat{P}}$	sigma p hat	Standard deviation (standard error) of the sampling distribution of the sample proportion
$\mu_{\bar{x}_1 - \bar{x}_2}$	mu x bar 1 minus x bar 2	Mean of the sampling distribution of the difference between two sample means
$\sigma^2_{\bar{x}_1 - \bar{x}_2}$	sigma squared x bar 1 minus x bar 2	Variance of the sampling distribution of the difference between two sample means
$\sigma_{\bar{x}_1 - \bar{x}_2}$	sigma x bar 1 minus x bar 2	Standard deviation (standard error) of the sampling distribution of the difference between two sample means

FORMULAS:

Expected value of the sample mean

$$E(\bar{X}) = \mu_{\bar{x}} = \mu$$

Variance of the sample mean

$$V(\bar{X}) = \sigma^2_{\bar{x}} = \frac{\sigma^2}{n}$$

Standard error of the sample mean

$$\sigma_{\bar{x}} = \frac{\sigma}{\sqrt{n}}$$

Standardizing the sample mean

$$Z = \frac{\bar{X} - \mu}{\sigma/\sqrt{n}}$$

Expected value of the sample proportion

$$E(\hat{P}) = \mu_{\hat{P}} = p$$

Variance of the sample proportion

$$V(\hat{P}) = \sigma^2_{\hat{P}} = \frac{p(1-p)}{n}$$

Standard error of the sample proportion

$$\sigma_{\hat{P}} = \sqrt{\frac{p(1-p)}{n}}$$

Standardizing the sample proportion

$$Z = \frac{\hat{P} - p}{\sqrt{p(1-p)/n}}$$

Expected value of the difference between two means

$$E(\bar{X}_1 - \bar{X}_2) = \mu_{\bar{x}_1 - \bar{x}_2} = \mu_1 - \mu_2$$

Variance of the difference between two means

$$V(\bar{X}_1 - \bar{X}_2) = \sigma^2_{\bar{x}_1 - \bar{x}_2} = \frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}$$

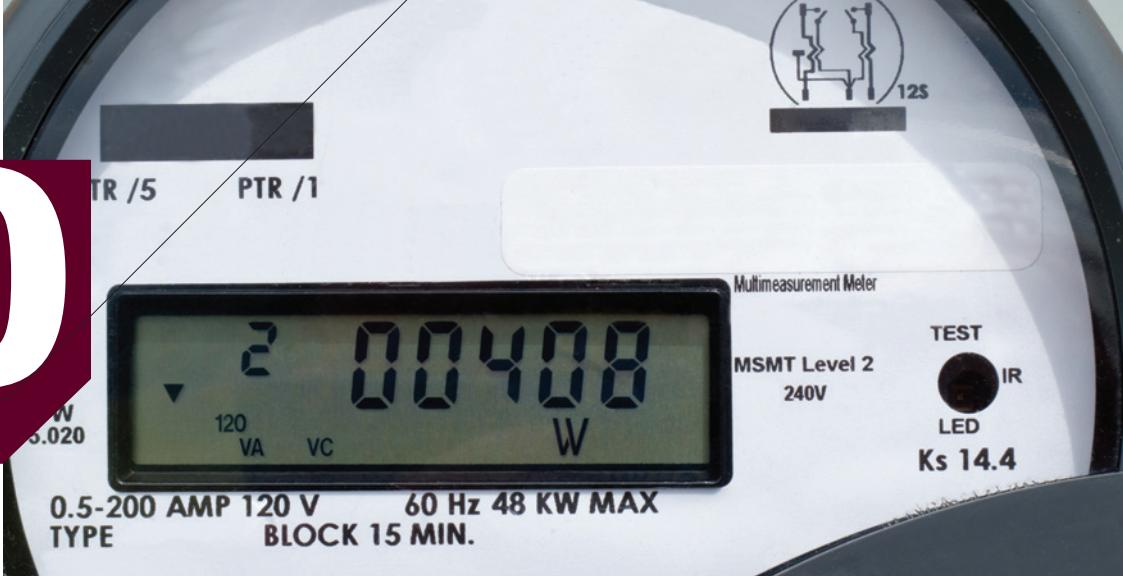
Standard error of the difference between two means

$$\sigma_{\bar{x}_1 - \bar{x}_2} = \sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

Standardizing the difference between two sample means

$$Z = \frac{(\bar{X}_1 - \bar{X}_2) - (\mu_1 - \mu_2)}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$$

10



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INTRODUCTION TO ESTIMATION

- 10-1 Concepts of Estimation
- 10-2 Estimating the Population Mean When the Population Standard Deviation Is Known
- 10-3 Selecting the Sample Size

Determining the Sample Size to Estimate the Mean Tree Diameter

**DATA
ANES2008***

A lumber company has just acquired the rights to a large tract of land containing thousands of trees.

A lumber company needs to be able to estimate the amount of lumber it can harvest in a tract of land to determine whether the effort will be profitable. To do so, it must estimate the mean diameter of the trees. It decides to estimate that parameter to within 1 inch with 90% confidence. A forester familiar with the territory guesses that the diameters of the trees are normally distributed with a standard deviation of 6 inches. Using the formula on page 344, he determines that



See page 343 for the solution.

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he should sample 98 trees. After sampling those 98 trees, the forester calculates the sample mean to be 25 inches. Suppose that after he has completed his sampling and calculations, he discovers that the actual standard deviation is 12 inches. Will he be satisfied with the result?

INTRODUCTION

Having discussed descriptive statistics (Chapter 4), probability distributions (Chapters 7 and 8), and sampling distributions (Chapter 9), we are ready to tackle statistical inference. As we explained in Chapter 1, *statistical inference* is the process by which we acquire information and draw conclusions about populations from samples. There are two general procedures for making inferences about populations: *estimation* and *hypothesis testing*. In this chapter, we introduce the concepts and foundations of estimation and demonstrate them with simple examples. In Chapter 11, we describe the fundamentals of hypothesis testing. Because most of what we do in the remainder of this book applies the concepts of estimation and hypothesis testing, understanding Chapters 10 and 11 is vital to your development as a statistics practitioner.

10-1 CONCEPTS OF ESTIMATION

As its name suggests, the objective of estimation is to determine the approximate value of a population parameter on the basis of a sample statistic. For example, the sample mean is employed to estimate the population mean. We refer to the sample mean as the *estimator* of the population mean. Once the sample mean has been computed, its value is called the *estimate*. In this chapter, we will introduce the statistical process whereby we estimate a population mean using sample data. In the rest of the book, we use the concepts and techniques introduced here for other parameters.

10-1a Point and Interval Estimators

We can use sample data to estimate a population parameter in two ways. First, we can compute the value of the estimator and consider that value as the estimate of the parameter. Such an estimator is called a *point estimator*.

Point Estimator

A **point estimator** draws inferences about a population by estimating the value of an unknown parameter using a single value or point.

There are three drawbacks to using point estimators. First, it is virtually certain that the estimate will be wrong. (The probability that a continuous random variable will equal a specific value is 0; that is, the probability that \bar{x} will exactly equal μ is 0.) Second, we often need to know how close the estimator is to the parameter. Third, in drawing inferences about a population, it is intuitively reasonable to expect that a large sample will produce more accurate results because it contains more information than a smaller sample does. But point estimators don't have the capacity to reflect the effects of larger sample sizes. As a consequence, we use the second method of estimating a population parameter, the *interval estimator*.

Interval Estimator

An **interval estimator** draws inferences about a population by estimating the value of an unknown parameter using an interval.

As you will see, the interval estimator is affected by the sample size; because it possesses this feature, we will deal mostly with interval estimators in this text.

To illustrate the difference between point and interval estimators, suppose that a statistics professor wants to estimate the mean summer income of his second-year business students. Selecting 25 students at random, he calculates the sample mean weekly income to be \$400. The point estimate is the sample mean. In other words, he estimates the mean weekly summer income of all second-year business students to be \$400. Using the technique described subsequently, he may instead use an interval estimate; he estimates that the mean weekly summer income of second-year business students to lie between \$380 and \$420.

Numerous applications of estimation occur in the real world. For example, television network executives want to know the proportion of television viewers who are tuned in to their networks; an economist wants to know the mean income of university graduates; and a medical researcher wishes to estimate the recovery rate of heart attack victims treated with a new drug. In each of these cases, to accomplish the objective exactly, the statistics practitioner would have to examine each member of the population and then calculate the parameter of interest. For instance, network executives would have to ask each person in the country what he or she is watching to determine the proportion of people who are watching their shows. Because there are millions of television viewers, the task is both impractical and prohibitively expensive. An alternative would be to take a random sample from this population, calculate the sample proportion, and use that as an estimator of the population proportion. The use of the sample proportion to estimate the population proportion seems logical. The selection of the sample statistic to be used as an estimator, however, depends on the characteristics of that statistic. Naturally, we want to use the statistic with the most desirable qualities for our purposes.

One desirable quality of an estimator is *unbiasedness*.

Unbiased Estimator

An **unbiased estimator** of a population parameter is an estimator whose expected value is equal to that parameter.

This means that if you were to take an infinite number of samples and calculate the value of the estimator in each sample, the average value of the estimators would equal the parameter. This amounts to saying that, on average, the sample statistic is equal to the parameter.

We know that the sample mean \bar{X} is an unbiased estimator of the population mean μ . In presenting the sampling distribution of \bar{X} in Section 9-1, we stated that $E(\bar{X}) = \mu$. We also know that the sample proportion is an unbiased estimator of the population proportion because $E(\hat{P}) = p$ and that the difference between two sample means is an unbiased estimator of the difference between two population means because $E(\bar{X}_1 - \bar{X}_2) = \mu_1 - \mu_2$.

Recall that in Chapter 4 we defined the sample variance as

$$s^2 = \sum \frac{(x_i - \bar{x})^2}{n - 1}$$

At the time, it seemed odd that we divided by $n - 1$ rather than by n . The reason for choosing $n - 1$ was to make $E(s^2) = \sigma^2$ so that this definition makes the sample variance

an unbiased estimator of the population variance. (The proof of this statement requires about a page of algebraic manipulation, which is more than we would be comfortable presenting here.) Had we defined the sample variance using n in the denominator, the resulting statistic would be a biased estimator of the population variance, one whose expected value is less than the parameter.

Knowing that an estimator is unbiased only assures us that its expected value equals the parameter; it does not tell us how close the estimator is to the parameter. Another desirable quality is that as the sample size grows larger, the sample statistic should come closer to the population parameter. This quality is called *consistency*.

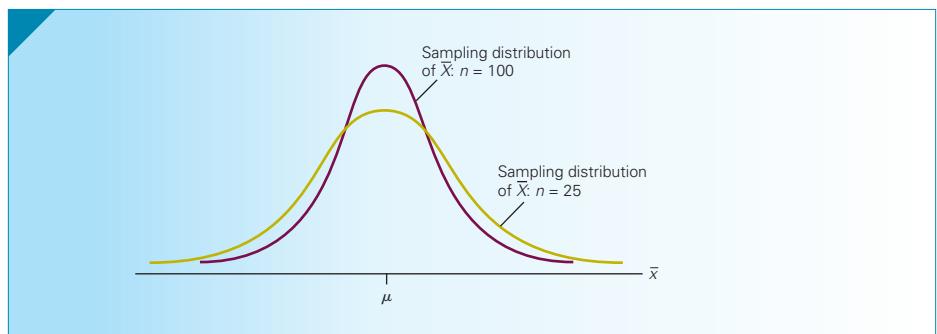
Consistency

An unbiased estimator is said to be **consistent** if the difference between the estimator and the parameter grows smaller as the sample size grows larger.

The measure we use to gauge closeness is the variance (or the standard deviation). Thus, \bar{X} is a consistent estimator of μ because the variance of \bar{X} is σ^2/n . This implies that as n grows larger, the variance of \bar{X} grows smaller. As a consequence, an increasing proportion of sample means falls close to μ .

Figure 10.1 depicts two sampling distributions of \bar{X} . One sampling distribution is based on samples of size 25, and the other is based on samples of size 100. The former is more spread out than the latter.

FIGURE 10.1 Sampling Distribution of \bar{X} with $n = 25$ and $n = 100$



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Similarly, \hat{P} is a consistent estimator of p because it is unbiased and the variance of \hat{P} is $p(1 - p)/n$, which grows smaller as n grows larger.

A third desirable quality is *relative efficiency*, which compares two unbiased estimators of a parameter.

Relative Efficiency

If there are two unbiased estimators of a parameter, the one whose variance is smaller is said to have **relative efficiency**.

We have already seen that the sample mean is an unbiased estimator of the population mean and that its variance is σ^2/n . In the next section, we will discuss the use of the sample median as an estimator of the population mean. Statisticians have established that the sample median is an unbiased estimator but that its variance is greater than that of

the sample mean (when the population is normal). As a consequence, the sample mean is relatively more efficient than the sample median when estimating the population mean.

In the remaining chapters of this book, we will present the statistical inference of a number of different population parameters. In each case, we will select a sample statistic that is unbiased and consistent. When there is more than one such statistic, we will choose the one that is relatively efficient to serve as the estimator.

10-1b Developing an Understanding of Statistical Concepts

In this section, we described three desirable characteristics of estimators: unbiasedness, consistency, and relative efficiency. An understanding of statistics requires that you know that there are several potential estimators for each parameter, but that we choose the estimators used in this book because they possess these characteristics.



EXERCISES

- 10.1** How do point estimators and interval estimators differ?
- 10.2** Define unbiasedness.
- 10.3** Draw a sampling distribution of an unbiased estimator.
- 10.4** Draw a sampling distribution of a biased estimator.
- 10.5** Define consistency.
- 10.6** Draw diagrams representing what happens to the sampling distribution of a consistent estimator when the sample size increases.
- 10.7** Define relative efficiency.
- 10.8** Draw a diagram that shows the sampling distribution representing two unbiased estimators, one of which is relatively efficient.

10-2 ESTIMATING THE POPULATION MEAN WHEN THE POPULATION STANDARD DEVIATION IS KNOWN

We now describe how an interval estimator is produced from a sampling distribution. We choose to demonstrate estimation with an example that is unrealistic. However, this liability is offset by the example's simplicity. When you understand more about estimation, you will be able to apply the technique to more realistic situations.

Suppose we have a population with mean μ and standard deviation σ . The population mean is assumed to be unknown, and our task is to estimate its value. As we just discussed, the estimation procedure requires the statistics practitioner to draw a random sample of size n and calculate the sample mean \bar{x} .

The central limit theorem presented in Section 9-1 stated that \bar{X} is normally distributed if X is normally distributed, or approximately normally distributed if X is non-normal and n is sufficiently large. This means that the variable

$$Z = \frac{\bar{X} - \mu}{\sigma/\sqrt{n}}$$

is standard normally distributed (or approximately so). In Section 9-1 (page 302) we developed the following probability statement associated with the sampling distribution of the mean:

$$P\left(\mu - Z_{\alpha/2} \frac{\sigma}{\sqrt{n}} < \bar{X} < \mu + Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}\right) = 1 - \alpha$$

which was derived from

$$P\left(-Z_{\alpha/2} < \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < Z_{\alpha/2}\right) = 1 - \alpha$$

Using a similar algebraic manipulation, we can express the probability in a slightly different form:

$$P\left(\bar{X} - Z_{\alpha/2} \frac{\sigma}{\sqrt{n}} < \mu < \bar{X} + Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}\right) = 1 - \alpha$$

Notice that in this form the population mean is in the center of the interval created by adding and subtracting $Z_{\alpha/2}$ standard errors to and from the sample mean. It is important for you to understand that this is merely another form of probability statement about the sample mean. This equation says that, with repeated sampling from this population, the proportion of values of \bar{X} for which the interval

$$\bar{X} - Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}, \quad \bar{X} + Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

includes the population mean μ is equal to $1 - \alpha$. This form of probability statement is very useful to us because it is the **confidence interval estimator of μ** .

Confidence Interval Estimator of μ^*

$$\bar{x} - z_{\alpha/2} \frac{\sigma}{\sqrt{n}}, \quad \bar{x} + z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

The probability $1 - \alpha$ is called the **confidence level**.

$\bar{x} - z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$ is called the **lower confidence limit (LCL)**.

$\bar{x} + z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$ is called the **upper confidence limit (UCL)**.

We often represent the confidence interval estimator as

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

where the minus sign defines the lower confidence limit and the plus sign defines the upper confidence limit.

To apply this formula, we specify the confidence level $1 - \alpha$, from which we determine α , $\alpha/2$, $z_{\alpha/2}$ (from Table 3 in Appendix B). Because the confidence level is the

*Since Chapter 7, we've been using the convention whereby an uppercase letter (usually X) represents a random variable and a lowercase letter (usually x) represents one of its values. However, in the formulas used in statistical inference, the distinction between the variable and its value becomes blurred. Accordingly, we will discontinue the notational convention and simply use lowercase letters except when we wish to make a probability statement.

probability that the interval includes the actual value of μ , we generally set $1 - \alpha$ close to 1 (usually between .90 and .99).

In Table 10.1, we list four commonly used confidence levels and their associated values of $z_{\alpha/2}$. For example, if the confidence level is $1 - \alpha = .95$, $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$. The resulting confidence interval estimator is then called the **95% confidence interval estimator of μ** .

TABLE 10.1 Four Commonly Used Confidence Levels and $z_{\alpha/2}$

$1 - \alpha$	α	$\alpha/2$	$z_{\alpha/2}$
.90	.10	.05	$z_{.05} = 1.645$
.95	.05	.025	$z_{.025} = 1.96$
.98	.02	.01	$z_{.01} = 2.33$
.99	.01	.005	$z_{.005} = 2.575$

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The following example illustrates how statistical techniques are applied. It also illustrates how we intend to solve problems in the rest of this book. The solution process that we advocate and use throughout this book is by and large the same one that statistics practitioners use to apply their skills in the real world. The process is divided into three stages. Simply stated, the stages are (1) the activities we perform before the calculations, (2) the calculations, and (3) the activities we perform after the calculations.

In stage 1, we determine the appropriate statistical technique to employ. Of course, for this example you will have no difficulty identifying the technique because you know only one at this point. (In practice, stage 1 also addresses the problem of *how* to gather the data. The methods used in the examples, exercises, and cases are described in the problem.)

In the second stage we calculate the statistics. We will do this in three ways.* To illustrate how the computations are completed, we will do the arithmetic manually with the assistance of a calculator. Solving problems by hand often provides insights into the statistical inference technique. Additionally, we will use the computer in two ways. First, in Excel we will use the Analysis ToolPak (**Data** menu item **Data Analysis**) or the add-ins we created for this book (**Add-Ins** menu item **Data Analysis Plus**). (Additionally, we will teach how to create do-it-yourself Excel spreadsheets that use built-in statistical functions.) Finally, we will use Minitab, one of the easiest software packages to use.

In the third and last stage of the solution, we intend to interpret the results and deal with the question presented in the problem. To be capable of properly interpreting statistical results, one needs to have an understanding of the fundamental principles underlying statistical inference.

*We anticipate that students in most statistics classes will use only one of the three methods of computing statistics: the choice made by the instructor. If such is the case, readers are directed to ignore the other two.

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APPLICATIONS in OPERATIONS MANAGEMENT



Inventory Management

Operations managers use inventory models to determine the stock level that minimizes total costs. In Section 8-2, we showed how the probabilistic model is used to make the inventory level decision (see page 278). One component of that model is the mean demand during lead time. Recall that *lead time* refers to the interval between the time an order is made and when it is delivered. Demand during lead time is a random variable that is often assumed to be normally distributed. There are several ways to determine mean demand during lead time, but the simplest is to estimate that quantity from a sample.

EXAMPLE 10.1

Data
Xm 10-01

Doll Computer Company

The Doll Computer Company makes its own computers and delivers them directly to customers who order them via the Internet. Doll competes primarily on price and speed of delivery. To achieve its objective of speed, Doll makes each of its five most popular computers and transports them to warehouses across the country. The computers are stored in the warehouses from which it generally takes 1 day to deliver a computer to the customer. This strategy requires high levels of inventory that add considerably to the cost. To lower these costs, the operations manager wants to use an inventory model. He notes that both daily demand and lead time are random variables. He concludes that demand during lead time is normally distributed, and he needs to know the mean to compute the optimum inventory level. He observes 25 lead time periods and records the demand during each period. These data are listed here. The manager would like a 95% confidence interval estimate of the mean demand during lead time. From long experience, the manager knows that the standard deviation is 75 computers.

Demand During Lead Time

235	374	309	499	253
421	361	514	462	369
394	439	348	344	330
261	374	302	466	535
386	316	296	332	334

SOLUTION:

IDENTIFY

To ultimately determine the optimum inventory level, the manager must know the mean demand during lead time. Thus, the parameter to be estimated is μ . At this point, we have described only one interval estimator. Thus, the confidence interval estimator that we intend to use is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

The next step is to perform the calculations. As we discussed previously, we will perform the calculations in three ways: manually, using Excel, and using Minitab.

COMPUTE

M A N U A L L Y:

We need four values to construct the confidence interval estimate of μ . They are

$$\bar{x}, z_{\alpha/2}, \sigma, n$$

Using a calculator, we determine the summation $\sum x_i = 9,254$. From this, we find

$$\bar{x} = \frac{\sum x_i}{n} = \frac{9,254}{25} = 370.16$$

The confidence level is set at 95%; thus, $1 - \alpha = .95$, $\alpha = 1 - .95 = .05$, and $\alpha/2 = .025$.

From Table 3 in Appendix B or from Table 10.1, we find

$$z_{\alpha/2} = z_{.025} = 1.96$$

The population standard deviation is $\sigma = 75$, and the sample size is 25. Substituting \bar{x} , $z_{\alpha/2}$, σ , and n into the confidence interval estimator, we find

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 370.16 \pm z_{.025} \frac{75}{\sqrt{25}} = 370.16 \pm 1.96 \frac{75}{\sqrt{25}} = 370.16 \pm 29.40$$

The lower and upper confidence limits are $LCL = 340.76$ and $UCL = 399.56$, respectively.

EXCEL

	A	B	C
1	z-Estimate: Mean		
2			
3			Demand
4	Mean		370.16
5	Standard Deviation		80.783
6	Observations		25
7	SIGMA		75
8	LCL		340.76
9	UCL		399.56

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm10-01](#).)
2. Click Add-Ins, Data Analysis Plus, and Z-Estimate: Mean.
3. Fill in the dialog box: **Input Range** (A1:A26), type the value for the **Standard Deviation** (75), click Labels if the first row contains the name of the variable, and specify the confidence level by typing the value of α (.05).



DO-IT-YOURSELF EXCEL

There is another way to produce the interval estimate for this problem. If you have already calculated the sample mean and know the sample size and population standard deviation, you need

not employ the data set and **Data Analysis Plus** previously described. Instead you can create a spreadsheet that performs the calculations. Our suggested spreadsheet is shown next.

	A	B	C	D	E
1	z-Estimate of a Mean				
2					
3	Sample mean	370.16	Confidence Interval Estimate		
4	Population standard deviation	75	370.16	±	29.40
5	Sample size	25	Lower confidence limit		340.76
6	Confidence level	0.95	Upper confidence limit		399.56

Here are the tools (Excel functions) you will need to create this spreadsheet.

SQRT: Syntax: SQRT (X) Computes the square root of the quantity in parentheses.

Use the **Insert** and **Ω Symbol** to input the \pm sign.

NORMSINV: Syntax: NORMSINV (Probability) This function calculates the value of z such that $P(Z < z) =$ the probability in parentheses. For example, NORMSINV (.95) determines the value of $z_{.05}$, which is 1.645. You will need to figure out how to convert the confidence level specified in Cell B6 into the value for $z_{\alpha/2}$.

We recommend that you save the spreadsheet. It can be used to solve some of the exercises at the end of this section.

In addition to providing another method of using Excel, this spreadsheet allows you to perform a “what-if” analysis; that is, this worksheet provides you the opportunity to learn how changing some of the inputs affects the estimate. For example, type 0.99 in cell B6 to see what happens to the size of the interval when you increase the confidence level. Type 1000 in cell B5 to examine the effect of increasing the sample size. Type 10 in cell B4 to see what happens when the population standard deviation is smaller.

MINITAB

One-Sample Z: Demand

The assumed standard deviation = 75

Variable	N	Mean	StDev	SE Mean	95% CI
Demand	25	370.160	80.783	15.000	(340.761, 399.559)

The output includes the sample standard deviation (**StDev** = 80.783), which is not needed for this interval estimate. Also printed is the standard error (**SE Mean** = σ/\sqrt{n} = 15.0), and last, but not least, the 95% confidence interval estimate of the population mean.

INSTRUCTIONS

1. Type or import that data into one column. ([Open Xm10-01](#).)
2. Click **Stat**, **Basic Statistics**, and **1-Sample Z . . .**

3. Type or use the **Select** button to specify the name of the variable or the column it is stored in. In the **Samples in columns** box (**Demand**), type the value of the population standard deviation (75), and click **Options . . .**
4. Type the value for the confidence level (.95) and in the **Alternative** box select **not equal**.

INTERPRET

The operations manager estimates that the mean demand during lead time lies between 340.76 and 399.56. He can use this estimate as an input in developing an inventory policy. The model discussed in Section 8-2 computes the reorder point, assuming a particular value of the mean demand during lead time. In this example, he could have used the sample mean as a point estimator of the mean demand, from which the inventory policy could be determined. However, the use of the confidence interval estimator allows the manager to use both the lower and upper limits so that he can understand the possible outcomes.

10-2a Interpreting the Confidence Interval Estimate

Some people erroneously interpret the confidence interval estimate in Example 10.1 to mean that there is a 95% probability that the population mean lies between 340.76 and 399.56. This interpretation is wrong because it implies that the population mean is a variable about which we can make probability statements. In fact, the population mean is a fixed but unknown quantity. Consequently, we cannot interpret the confidence interval estimate of μ as a probability statement about μ . To translate the confidence interval estimator properly, we must remember that the confidence interval estimator was derived from the sampling distribution of the sample mean. In Section 9-1, we used the sampling distribution to make probability statements about the sample mean. Although the form has changed, the confidence interval estimator is also a probability statement about the sample mean. It states that there is $1 - \alpha$ probability that the sample mean will be equal to a value such that the interval $\bar{x} - z_{\alpha/2}\sigma/\sqrt{n}$ to $\bar{x} + z_{\alpha/2}\sigma/\sqrt{n}$ will include the population mean. Once the sample mean is computed, the interval acts as the lower and upper limits of the interval estimate of the population mean.

As an illustration, suppose we want to estimate the mean value of the distribution resulting from the throw of a fair die. Because we know the distribution, we also know that $\mu = 3.5$ and $\sigma = 1.71$. Pretend now that we know only that $\sigma = 1.71$, that μ is unknown, and that we want to estimate its value. To estimate μ , we draw a sample of size $n = 100$ (we throw the die 100 times) and calculate \bar{x} . The confidence interval estimator of μ is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

The 90% confidence interval estimator is

$$\bar{x} + z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = \bar{x} \pm 1.645 \frac{1.71}{\sqrt{100}} = \bar{x} \pm .281$$

This notation means that, if we repeatedly draw samples of size 100 from this population, 90% of the values of \bar{x} will be such that μ would lie somewhere between $\bar{x} - .281$ and $\bar{x} + .281$, and 10% of the values of \bar{x} will produce intervals that would not include μ .

Now, imagine that we draw 40 samples of 100 observations each. The values of \bar{x} and the resulting confidence interval estimates of μ are shown in Table 10.2. Notice that not all the intervals include the true value of the parameter. Samples 5, 16, 22, and 34 produce values of \bar{x} that in turn produce intervals that exclude μ .

Students often react to this situation by asking, What went wrong with samples 5, 16, 22, and 34? The answer is nothing. Statistics does not promise 100% certainty. In fact, in this illustration, we expected 90% of the intervals to include μ and 10% to exclude μ . Since we produced 40 intervals, we expected that 4.0 (10% of 40) intervals would not contain $\mu = 3.5$.^{*} It is important to understand that, even when the statistics practitioner performs experiments properly, a certain proportion (in this example, 10%) of the experiments will produce incorrect estimates by random chance.

TABLE 10.2 90% Confidence Interval Estimates of μ

SAMPLE	\bar{x}	$LCL = \bar{x} - .281$	$UCL = \bar{x} + .281$	DOES INTERVAL INCLUDE $\mu = 3.5$?
1	3.550	3.269	3.831	Yes
2	3.610	3.329	3.891	Yes
3	3.470	3.189	3.751	Yes
4	3.480	3.199	3.761	Yes
5	3.800	3.519	4.081	No
6	3.370	3.089	3.651	Yes
7	3.480	3.199	3.761	Yes
8	3.520	3.239	3.801	Yes
9	3.740	3.459	4.021	Yes
10	3.510	3.229	3.791	Yes
11	3.230	2.949	3.511	Yes
12	3.450	3.169	3.731	Yes
13	3.570	3.289	3.851	Yes
14	3.770	3.489	4.051	Yes
15	3.310	3.029	3.591	Yes
16	3.100	2.819	3.381	No
17	3.500	3.219	3.781	Yes
18	3.550	3.269	3.831	Yes
19	3.650	3.369	3.931	Yes
20	3.280	2.999	3.561	Yes
21	3.400	3.119	3.681	Yes

(Continued)

*In this illustration, exactly 10% of the sample means produced interval estimates that excluded the value of μ , but this will not always be the case. Remember, we expect 10% of the sample means in the long run to result in intervals excluding μ . This group of 40 sample means does not constitute “the long run.”

TABLE 10.2 90% Confidence Interval Estimates of μ (Continued)

SAMPLE	\bar{x}	$LCL = \bar{x} - .281$	$UCL = \bar{x} + .281$	DOES INTERVAL INCLUDE $\mu = 3.5$?
22	3.880	3.599	4.161	No
23	3.760	3.479	4.041	Yes
24	3.400	3.119	3.681	Yes
25	3.340	3.059	3.621	Yes
26	3.650	3.369	3.931	Yes
27	3.450	3.169	3.731	Yes
28	3.470	3.189	3.751	Yes
29	3.580	3.299	3.861	Yes
30	3.360	3.079	3.641	Yes
31	3.710	3.429	3.991	Yes
32	3.510	3.229	3.791	Yes
33	3.420	3.139	3.701	Yes
34	3.110	2.829	3.391	No
35	3.290	3.009	3.571	Yes
36	3.640	3.359	3.921	Yes
37	3.390	3.109	3.671	Yes
38	3.750	3.469	4.031	Yes
39	3.260	2.979	3.541	Yes
40	3.540	3.259	3.821	Yes

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We can improve the confidence associated with the interval estimate. If we let the confidence level $1 - \alpha$ equal .95, the 95% confidence interval estimator is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = \bar{x} \pm 1.96 \frac{1.71}{\sqrt{100}} = \bar{x} \pm .335$$

Because this interval is wider, it is more likely to include the value of μ . If you re-do Table 10.2, this time using a 95% confidence interval estimator, only samples 16, 22, and 34 will produce intervals that do not include μ . (Notice that we expected 5% of the intervals to exclude μ and that we actually observed $3/40 = 7.5\%$.) The 99% confidence interval estimator is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = \bar{x} \pm 2.575 \frac{1.71}{\sqrt{100}} = \bar{x} \pm .440$$

Applying this interval estimate to the sample means listed in Table 10.2 would result in having all 40 interval estimates include the population mean $\mu = 3.5$. (We expected 1% of the intervals to exclude μ ; we observed $0/40 = 0\%$.)

In actual practice, only one sample will be drawn, and thus only one value of \bar{x} will be calculated. The resulting interval estimate will either correctly include the parameter or incorrectly exclude it. Unfortunately, statistics practitioners do not know whether they

are correct in each case; they know only that, in the long run, they will incorrectly estimate the parameter some of the time. Statistics practitioners accept that as a fact of life.

We summarize our calculations in Example 10.1 as follows. We estimate that the mean demand during lead time falls between 340.76 and 399.56, and this type of estimator is correct 95% of the time. Thus, the confidence level applies to our estimation procedure and not to any one interval. Incidentally, the media often refer to the 95% figure as “19 times out of 20,” which emphasizes the long-run aspect of the confidence level.

10-2b Information and the Width of the Interval

Interval estimation, like all other statistical techniques, is designed to convert data into information. However, a wide interval provides little information. For example, suppose that as a result of a statistical study we estimate with 95% confidence that the average starting salary of an accountant lies between \$15,000 and \$100,000. This interval is so wide that very little information was derived from the data. Suppose, however, that the interval estimate was \$52,000 to \$55,000. This interval is much narrower, providing accounting students more precise information about the mean starting salary.

The width of the confidence interval estimate is a function of the population standard deviation, the confidence level, and the sample size. Consider Example 10.1, where σ was assumed to be 75. The interval estimate was 370.16 ± 29.40 . If σ equaled 150, the 95% confidence interval estimate would become

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 370.16 \pm z_{.025} \frac{150}{\sqrt{25}} = 370.16 \pm 1.96 \frac{150}{\sqrt{25}} = 370.16 \pm 58.80$$

Thus, doubling the population standard deviation has the effect of doubling the width of the confidence interval estimate. This result is quite logical. If there is a great deal of variation in the random variable (measured by a large standard deviation), it is more difficult to accurately estimate the population mean. That difficulty is translated into a wider interval.

Although we have no control over the value of σ , we do have the power to select values for the other two elements. In Example 10.1, we chose a 95% confidence level. If we had chosen 90% instead, the interval estimate would have been

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 370.16 \pm z_{.05} \frac{75}{\sqrt{25}} = 370.16 \pm 1.645 \frac{75}{\sqrt{25}} = 370.16 \pm 24.68$$

A 99% confidence level results in this interval estimate:

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 370.16 \pm z_{.005} \frac{75}{\sqrt{25}} = 370.16 \pm 2.575 \frac{75}{\sqrt{25}} = 370.16 \pm 38.63$$

As you can see, decreasing the confidence level narrows the interval; increasing it widens the interval. However, a large confidence level is generally desirable because that means a larger proportion of confidence interval estimates that will be correct in the long run. There is a direct relationship between the width of the interval and the confidence level. This is because we need to widen the interval to be more confident in the estimate. (The analogy is that to be more likely to capture a butterfly, we need a larger butterfly net.) The trade-off between increased confidence and the resulting wider confidence interval estimates must be resolved by the statistics practitioner. As a general rule, however, 95% confidence is considered “standard.”

The third element is the sample size. Had the sample size been 100 instead of 25, the confidence interval estimate would become

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 370.16 \pm z_{.025} \frac{75}{\sqrt{100}} = 370.16 \pm 1.96 \frac{75}{\sqrt{100}} = 370.16 \pm 14.70$$

Increasing the sample size fourfold decreases the width of the interval by half. A larger sample size provides more potential information. The increased amount of information is reflected in a narrower interval. However, there is another trade-off: Increasing the sample size increases the sampling cost. We will discuss these issues when we present sample size selection in Section 10-3.

10-2c (Optional) Estimating the Population Mean Using the Sample Median

To understand why the sample mean is most often used to estimate a population mean, let's examine the properties of the sampling distribution of the sample median (denoted here as m). The sampling distribution of a sample median is normally distributed provided that the population is normal. Its mean and standard deviation are

$$\mu_m = \mu$$

and

$$\sigma_m = \frac{1.2533\sigma}{\sqrt{n}}$$

Using the same algebraic steps that we used above, we derive the confidence interval estimator of a population mean using the sample median

$$m \pm z_{\alpha/2} \frac{1.2533\sigma}{\sqrt{n}}$$

To illustrate, suppose that we have drawn the following random sample from a normal population whose standard deviation is 2.

1 1 1 3 4 5 6 7 8

The sample mean is $\bar{x} = 4$, and the sample median is $m = 4$.

The 95% confidence interval estimates using the sample mean and the sample median are

$$\begin{aligned}\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} &= 4.0 \pm 1.96 \frac{2}{\sqrt{9}} = 4 \pm 1.307 \\ m \pm z_{\alpha/2} \frac{1.2533\sigma}{\sqrt{n}} &= 4.0 \pm 1.96 \frac{(1.2533)(2)}{\sqrt{9}} = 4 \pm 1.638\end{aligned}$$

As you can see, the interval based on the sample mean is narrower; as we pointed out previously, narrower intervals provide more precise information. To understand why the sample mean produces better estimators than the sample median, recall how the median is calculated. We simply put the data in order and select the observation that falls in the middle. Thus, as far as the median is concerned the data appear as

1 2 3 4 5 6 7 8 9

By ignoring the actual observations and using their ranks instead, we lose information. With less information, we have less precision in the interval estimators and so ultimately make poorer decisions.



EXERCISES

Developing an Understanding of Statistical Concepts

Exercises 10.9 to 10.16 are “what-if” analyses designed to determine what happens to the interval estimate when the confidence level, sample size, and standard deviation change. These problems can be solved manually, using the spreadsheet you created (that is, if you did create one), or Minitab.

- 10.9** a. A statistics practitioner took a random sample of 50 observations from a population with a standard deviation of 25 and computed the sample mean to be 100. Estimate the population mean with 90% confidence.
 b. Repeat part (a) using a 95% confidence level.
 c. Repeat part (a) using a 99% confidence level.
 d. Describe the effect on the confidence interval estimate of increasing the confidence level.
- 10.10** a. The mean of a random sample of 25 observations from a normal population with a standard deviation of 50 is 200. Estimate the population mean with 95% confidence.
 b. Repeat part (a) changing the population standard deviation to 25.
 c. Repeat part (a) changing the population standard deviation to 10.
 d. Describe what happens to the confidence interval estimate when the standard deviation is decreased.
- 10.11** a. A random sample of 25 was drawn from a normal distribution with a standard deviation of 5. The sample mean is 80. Determine the 95% confidence interval estimate of the population mean.
 b. Repeat part (a) with a sample size of 100.
 c. Repeat part (a) with a sample size of 400.
 d. Describe what happens to the confidence interval estimate when the sample size increases.
- 10.12** a. Given the following information, determine the 98% confidence interval estimate of the population mean:
 $\bar{x} = 500 \quad \sigma = 12 \quad n = 50$
 b. Repeat part (a) using a 95% confidence level.
 c. Repeat part (a) using a 90% confidence level.

- d. Review parts (a)–(c) and discuss the effect on the confidence interval estimator of decreasing the confidence level.

- 10.13** a. The mean of a sample of 25 was calculated as $\bar{x} = 500$. The sample was randomly drawn from a population with a standard deviation of 15. Estimate the population mean with 99% confidence.
 b. Repeat part (a) changing the population standard deviation to 30.
 c. Repeat part (a) changing the population standard deviation to 60.
 d. Describe what happens to the confidence interval estimate when the standard deviation is increased.
- 10.14** a. A statistics practitioner randomly sampled 100 observations from a population with a standard deviation of 5 and found that \bar{x} is 10. Estimate the population mean with 90% confidence.
 b. Repeat part (a) with a sample size of 25.
 c. Repeat part (a) with a sample size of 10.
 d. Describe what happens to the confidence interval estimate when the sample size decreases.
- 10.15** a. From the information given here determine the 95% confidence interval estimate of the population mean.
 $\bar{x} = 100 \quad \sigma = 20 \quad n = 25$
 b. Repeat part (a) with $\bar{x} = 200$.
 c. Repeat part (a) with $\bar{x} = 500$.
 d. Describe what happens to the width of the confidence interval estimate when the sample mean increases.
- 10.16** a. A random sample of 100 observations was randomly drawn from a population with a standard deviation of 5. The sample mean was calculated as $\bar{x} = 400$. Estimate the population mean with 99% confidence.
 b. Repeat part (a) with $\bar{x} = 200$.
 c. Repeat part (a) with $\bar{x} = 100$.
 d. Describe what happens to the width of the confidence interval estimate when the sample mean decreases.

Exercises 10.17 to 10.20 are based on the optional subsection “Estimating the Population Mean Using the Sample Median.” All exercises assume that the population is normal.

- 10.17** Is the sample median an unbiased estimator of the population mean? Explain.
- 10.18** Is the sample median a consistent estimator of the population mean? Explain.
- 10.19** Show that the sample mean is relatively more efficient than the sample median when estimating the population mean.
- 10.20** a. Given the following information, determine the 90% confidence interval estimate of the population mean using the sample median.

$$\text{Sample median} = 500, \sigma = 12, \text{ and } n = 50$$

- b. Compare your answer in part (a) to that produced in part (c) of Exercise 10.12. Why is the confidence interval estimate based on the sample median wider than that based on the sample mean?

Applications

The following exercises may be answered manually or with the assistance of a computer. The names of the files containing the data are shown.

- 10.21** **Xr10-21** The following data represent a random sample of 9 marks (out of 10) on a statistics quiz. The marks are normally distributed with a standard deviation of 2. Estimate the population mean with 90% confidence.

$$7 \ 9 \ 7 \ 5 \ 4 \ 8 \ 3 \ 10 \ 9$$

- 10.22** **Xr10-22** The following observations are the ages of a random sample of 8 men in a bar. It is known that the ages are normally distributed with a standard deviation of 10. Determine the 95% confidence interval estimate of the population mean. Interpret the interval estimate.

$$52 \ 68 \ 22 \ 35 \ 30 \ 56 \ 39 \ 48$$

- 10.23** **Xr10-23** How many rounds of golf do physicians (who play golf) play per year? A survey of 12 physicians revealed the following numbers:

$$3 \ 41 \ 17 \ 1 \ 33 \ 37 \ 18 \ 15 \ 17 \ 12 \ 29 \ 51$$

Estimate with 95% confidence the mean number of rounds per year played by physicians, assuming that the number of rounds is normally distributed with a standard deviation of 12.

- 10.24** **Xr10-24** Among the most exciting aspects of a university professor’s life are the departmental meetings where such critical issues as the color of the

walls will be painted and who gets a new desk are decided. A sample of 20 professors was asked how many hours per year are devoted to these meetings. The responses are listed here. Assuming that the variable is normally distributed with a standard deviation of 8 hours, estimate the mean number of hours spent at departmental meetings by all professors. Use a confidence level of 90%.

$$14 \ 17 \ 3 \ 6 \ 17 \ 3 \ 8 \ 4 \ 20 \ 15 \\ 7 \ 9 \ 0 \ 5 \ 11 \ 15 \ 18 \ 13 \ 8 \ 4$$

- 10.25** **Xr10-25** The number of cars sold annually by used car salespeople is normally distributed with a standard deviation of 15. A random sample of 15 salespeople was taken, and the number of cars each sold is listed here. Find the 95% confidence interval estimate of the population mean. Interpret the interval estimate.

$$79 \ 43 \ 58 \ 66 \ 101 \ 63 \ 79 \ 33 \ 58 \\ 71 \ 60 \ 101 \ 74 \ 55 \ 88$$

- 10.26** **Xr10-26** It is known that the amount of time needed to change the oil on a car is normally distributed with a standard deviation of 5 minutes. The amount of time to complete a random sample of 10 oil changes was recorded and listed here. Compute the 99% confidence interval estimate of the mean of the population.

$$11 \ 10 \ 16 \ 15 \ 18 \ 12 \ 25 \ 20 \ 18 \ 24$$

- 10.27** **Xr10-27** Suppose that the amount of time teenagers spend weekly working at part-time jobs is normally distributed with a standard deviation of 40 minutes. A random sample of 15 teenagers was drawn, and each reported the amount of time spent at part-time jobs (in minutes). These are listed here. Determine the 95% confidence interval estimate of the population mean.

$$180 \ 130 \ 150 \ 165 \ 90 \ 130 \ 120 \ 60 \ 200 \\ 180 \ 80 \ 240 \ 210 \ 150 \ 125$$

- 10.28** **Xr10-28** One of the few negative side effects of quitting smoking is weight gain. Suppose that the weight gain in the 12 months following a cessation in smoking is normally distributed with a standard deviation of 6 pounds. To estimate the mean weight gain, a random sample of 13 quitters was drawn; their recorded weights are listed here. Determine the 90% confidence interval estimate of the mean 12-month weight gain for all quitters.

$$16 \ 23 \ 8 \ 2 \ 14 \ 22 \ 18 \ 11 \ 10 \ 19 \ 5 \ 8 \ 15$$

- 10.29** **Xr10-29** Because of different sales ability, experience, and devotion, the incomes of real estate agents vary considerably. Suppose that in a large city the annual income is normally distributed with a standard deviation of \$15,000. A random sample of 16 real estate agents was asked to report their annual income (in \$1,000). The responses are listed here. Determine the 99% confidence interval estimate of the mean annual income of all real estate agents in the city.

65 94 57 111 83 61 50 73 68 80
93 84 113 41 60 77

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.

- 10.30** **Xr10-30** A survey of 400 statistics professors was undertaken. Each professor was asked how much time was devoted to teaching graphical techniques. We believe that the times are normally distributed with a standard deviation of 30 minutes. Estimate the population mean with 95% confidence.

- 10.31** **Xr10-31** In a survey conducted to determine, among other things, the cost of vacations, 64 individuals were randomly sampled. Each person was asked to compute the cost of her or his most recent vacation. Assuming that the standard deviation is \$400, estimate with 95% confidence the average cost of all vacations.

- 10.32** **Xr10-32** In an article about *disinflation*, various investments were examined. The investments included stocks, bonds, and real estate. Suppose that a random sample of 200 rates of return on real estate investments was computed and recorded. Assuming that the standard deviation of all rates of return on real estate investments is 2.1%, estimate the mean rate of return on all real estate investments with 90% confidence. Interpret the estimate.

- 10.33** **Xr10-33** A statistics professor is in the process of investigating how many classes university students miss each semester. To help answer this question, she took a random sample of 100 university students and asked each to report how many classes he or she had missed in the previous semester. Estimate the mean number of classes missed by all students at the university. Use a 99% confidence level and assume that the population standard deviation is known to be 2.2 classes.

- 10.34** **Xr10-34** As part of a project to develop better lawn fertilizers, a research chemist wanted to determine the mean weekly growth rate of Kentucky bluegrass, a common type of grass. A sample of 250 blades of grass was measured, and the amount of growth in

1 week was recorded. Assuming that weekly growth is normally distributed with a standard deviation of .10 inch, estimate with 99% confidence the mean weekly growth of Kentucky bluegrass. Briefly describe what the interval estimate tells you about the growth of Kentucky bluegrass.

- 10.35** **Xr10-35** A time study of a large production facility was undertaken to determine the mean time required to assemble a cell phone. A random sample of the times to assemble 50 cell phones was recorded. An analysis of the assembly times reveals that they are normally distributed with a standard deviation of 1.3 minutes. Estimate with 95% confidence the mean assembly time for all cell phones. What do your results tell you about the assembly times?

- 10.36** **Xr10-36** The image of the Japanese manager is that of a workaholic with little or no leisure time. In a survey, a random sample of 250 Japanese middle managers was asked how many hours per week they spent in leisure activities (e.g., sports, movies, television). The results of the survey were recorded. Assuming that the population standard deviation is 6 hours, estimate with 90% confidence the mean leisure time per week for all Japanese middle managers. What do these results tell you?

- 10.37** **Xr10-37** One measure of physical fitness is the amount of time it takes for the pulse rate to return to normal after exercise. A random sample of 100 women age 40 to 50 exercised on stationary bicycles for 30 minutes. The amount of time it took for their pulse rates to return to pre-exercise levels was measured and recorded. If the times are normally distributed with a standard deviation of 2.3 minutes, estimate with 99% confidence the true mean pulse-recovery time for all 40- to 50-year-old women. Interpret the results.

- 10.38** **Xr10-38** A survey of 80 randomly selected companies asked them to report the annual income of their presidents. Assuming that incomes are normally distributed with a standard deviation of \$30,000, determine the 90% confidence interval estimate of the mean annual income of all company presidents. Interpret the statistical results.

- 10.39** **Xr10-39** To help make a decision about expansion plans, the president of a music company needs to know how many compact discs teenagers buy annually. Accordingly, he commissions a survey of 250 teenagers. Each is asked to report how many CDs he or she purchased in the previous 12 months. Estimate with 90% confidence the mean annual number of CDs purchased by all teenagers. Assume that the population standard deviation is three CDs.

APPLICATIONS in MARKETING

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**Advertising**

One of the major tools in the promotion mix is advertising. An important decision to be made by the advertising manager is how to allocate the company's total advertising budget among the various competing media types, including television, radio, and newspapers. Ultimately, the manager wants to know, for example, which television programs are most watched by potential customers, and how effective it is to sponsor these programs through advertising. But first the manager must assess the size of the audience, which involves estimating the amount of exposure potential customers have to the various media types, such as television.

- 10.40** **Xr10-40** The sponsors of television shows targeted at the children's market wanted to know the amount of time children spend watching television because the types and number of programs and commercials are greatly influenced by this information. As a result, it was decided to survey 100 North American children and ask them to keep track of the number

of hours of television they watch each week. From past experience, it is known that the population standard deviation of the weekly amount of television watched is $\sigma = 8.0$ hours. The television sponsors want an estimate of the amount of television watched by the average North American child. A confidence level of 95% is judged to be appropriate.

10-3 / SELECTING THE SAMPLE SIZE

As we discussed in the previous section, if the interval estimate is too wide, it provides little information. In Example 10.1 the interval estimate was 340.76 to 399.56. If the manager is to use this estimate as input for an inventory model, he needs greater precision. Fortunately, statistics practitioners can control the width of the interval by determining the sample size necessary to produce narrow intervals.

To understand how and why we can determine the sample size, we discuss the error of estimation.

10-3a Error of Estimation

In Chapter 5, we pointed out that sampling error is the difference between the sample and the population that exists only because of the observations that happened to be selected for the sample. Now that we have discussed estimation, we can define the sampling error as the difference between an estimator and a parameter. We can also define this difference as the **error of estimation**. In this chapter, this can be expressed as the difference between \bar{X} and μ . In our derivation of the confidence interval estimator of μ (see page 329), we expressed the following probability,

$$P\left(-Z_{\alpha/2} < \frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < Z_{\alpha/2}\right) = 1 - \alpha$$

which can also be expressed as

$$P\left(-Z_{\alpha/2} \frac{\sigma}{\sqrt{n}} < \bar{X} - \mu < +Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}\right) = 1 - \alpha$$

This tells us that the difference between \bar{X} and μ lies between $-Z_{\alpha/2}\sigma/\sqrt{n}$ and $Z_{\alpha/2}\sigma/\sqrt{n}$ with probability $1 - \alpha$. Expressed another way, we have with probability $1 - \alpha$,

$$|\bar{X} - \mu| < Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

In other words, the error of estimation is less than $Z_{\alpha/2}\sigma/\sqrt{n}$. We interpret this to mean that $Z_{\alpha/2}\sigma/\sqrt{n}$ is the maximum error of estimation that we are willing to tolerate. We label this value B , which stands for the **bound on the error of estimation**; that is,

$$B = Z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

10-3b Determining the Sample Size

We can solve the equation for n if the population standard deviation σ , the confidence level $1 - \alpha$, and the bound on the error of estimation B are known. Solving for n , we produce the following.

Sample Size to Estimate a Mean

$$n = \left(\frac{z_{\alpha/2}\sigma}{B} \right)^2$$

To illustrate, suppose that in Example 10.1 before gathering the data, the manager had decided that he needed to estimate the mean demand during lead time to within 16 units, which is the bound on the error of estimation. We also have $1 - \alpha = .95$ and $\sigma = 75$. We calculate

$$n = \left(\frac{z_{\alpha/2}\sigma}{B} \right)^2 = \left(\frac{(1.96)(75)}{16} \right)^2 = 84.41$$

Because n must be an integer and because we want the bound on the error of estimation to be *no more* than 16, any noninteger value must be rounded up. Thus, the value of n is rounded to 85, which means that to be 95% confident that the error of estimation will be no larger than 16, we need to randomly sample 85 lead time intervals.

Determining the Sample Size to Estimate the Mean Tree Diameter: Solution

Before the sample was taken, the forester determined the sample size as follows.

The bound on the error of estimation is $B = 1$. The confidence level is 90% ($1 - \alpha = .90$). Thus $\alpha = .10$ and $\alpha/2 = .05$. It follows that $z_{\alpha/2} = 1.645$. The population standard deviation is assumed to be $\sigma = 6$. Thus,



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$$n = \left(\frac{z_{\alpha/2}\sigma}{B} \right)^2 = \left(\frac{1.645 \times 6}{1} \right)^2 = 97.42$$

which is rounded to 98.

However, after the sample is taken the forester discovered that $\sigma = 12$. The 90% confidence interval estimate is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 25 \pm z_{.05} \frac{12}{\sqrt{98}} = 25 \pm 1.645 \frac{12}{\sqrt{98}} = 25 \pm 2$$

As you can see, the bound on the error of estimation is 2 and not 1. The interval is twice as wide as it was designed to be. The resulting estimate will not be as precise as needed.

In this chapter, we have assumed that we know the value of the population standard deviation. In practice, this is seldom the case. (In Chapter 12, we introduce a more realistic confidence interval estimator of the population mean.) It is frequently necessary to “guesstimate” the value of σ to calculate the sample size; that is, we must use our knowledge of the variable with which we’re dealing to assign some value to σ .

Unfortunately, we cannot be very precise in this guess. However, in guessing the value of σ , we prefer to err on the high side. For the chapter-opening example, if the forester had determined the sample size using $\sigma = 12$, he would have computed

$$n = \left(\frac{z_{\alpha/2}\sigma}{B} \right)^2 = \left(\frac{(1.645)(12)}{1} \right)^2 = 389.67 \text{ (rounded to 390)}$$

Using $n = 390$ (assuming that the sample mean is again 25), the 90% confidence interval estimate is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 25 \pm 1.645 \frac{12}{\sqrt{390}} = 25 \pm 1$$

This interval is as narrow as the forester wanted.

What happens if the standard deviation is *smaller* than assumed? If we discover that the standard deviation is less than we assumed when we determined the sample size, the confidence interval estimator will be narrower and therefore more precise. Suppose that after the sample of 98 trees was taken (assuming again that $\sigma = 6$), the forester discovers that $\sigma = 3$. The confidence interval estimate is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 25 \pm 1.645 \frac{3}{\sqrt{98}} = 25 \pm 0.5$$

which is narrower than the forester wanted. Although this means that he would have sampled more trees than needed, the additional cost is relatively low when compared to the value of the information derived.



EXERCISES

Developing an Understanding of Statistical Concepts

- 10.41** a. Determine the sample size required to estimate a population mean to within 10 units given that the population standard deviation is 50. A confidence level of 90% is judged to be appropriate.
 b. Repeat part (a) changing the standard deviation to 100.
 c. Re-do part (a) using a 95% confidence level.
 d. Repeat part (a) wherein we wish to estimate the population mean to within 20 units.
- 10.42** Review Exercise 10.41. Describe what happens to the sample size when
 a. the population standard deviation increases.
 b. the confidence level increases.
 c. the bound on the error of estimation increases.
- 10.43** a. A statistics practitioner would like to estimate a population mean to within 50 units with 99% confidence given that the population standard deviation is 250. What sample size should be used?
 b. Re-do part (a) changing the standard deviation to 50.
 c. Re-do part (a) using a 95% confidence level.
 d. Re-do part (a) wherein we wish to estimate the population mean to within 10 units.
- 10.44** Review the results of Exercise 10.43. Describe what happens to the sample size when
 a. the population standard deviation decreases.
 b. the confidence level decreases.
 c. the bound on the error of estimation decreases.
- 10.45** a. Determine the sample size necessary to estimate a population mean to within 1 with 90% confidence given that the population standard deviation is 10.
 b. Suppose that the sample mean was calculated as 150. Estimate the population mean with 90% confidence.
- 10.46** a. Repeat part (b) in Exercise 10.45 after discovering that the population standard deviation is actually 5.
 b. Repeat part (b) in Exercise 10.45 after discovering that the population standard deviation is actually 20.
- 10.47** Review Exercises 10.45 and 10.46. Describe what happens to the confidence interval estimate when
 a. the standard deviation is equal to the value used to determine the sample size.
 b. the standard deviation is smaller than the one used to determine the sample size.
 c. the standard deviation is larger than the one used to determine the sample size.

- 10.48** a. A statistics practitioner would like to estimate a population mean to within 10 units. The confidence level has been set at 95% and $\sigma = 200$. Determine the sample size.
 b. Suppose that the sample mean was calculated as 500. Estimate the population mean with 95% confidence.
- 10.49** a. Repeat part (b) of Exercise 10.48 after discovering that the population standard deviation is actually 100.
 b. Repeat part (b) of Exercise 10.48 after discovering that the population standard deviation is actually 400.
- 10.50** Review Exercises 10.48 and 10.49. Describe what happens to the confidence interval estimate when
 a. the standard deviation is equal to the value used to determine the sample size.
 b. the standard deviation is smaller than the one used to determine the sample size.
 c. the standard deviation is larger than the one used to determine the sample size.

Applications

- 10.51** A medical statistician wants to estimate the average weight loss of people who are on a new diet plan. In a preliminary study, he guesses that the standard deviation of the population of weight losses is about 10 pounds. How large a sample should he take to estimate the mean weight loss to within 2 pounds, with 90% confidence?
- 10.52** The operations manager of a large production plant would like to estimate the average amount of time workers take to assemble a new electronic component. After observing a number of workers assembling similar devices, she guesses that the standard deviation is 6 minutes. How large a sample of workers should she take if she wishes to estimate the mean assembly time to within 20 seconds? Assume that the confidence level is to be 99%.
- 10.53** A statistics professor wants to compare today's students with those 25 years ago. All his current students' marks are stored on a computer so that he can easily determine the population mean. However, the marks 25 years ago reside only in his musty files. He does not want to retrieve all the marks and will be satisfied with a 95% confidence interval estimate of the mean mark 25 years ago. If he assumes that the population standard deviation is 12, how large a sample should he take to estimate the mean to within 2 marks?

10.54 A medical researcher wants to investigate the amount of time it takes for patients' headache pain to be relieved after taking a new prescription painkiller. She plans to use statistical methods to estimate the mean of the population of relief times. She believes that the population is normally distributed with a standard deviation of 20 minutes. How large a sample should she take to estimate the mean time to within 1 minute with 90% confidence?

10.55 The label on 1-gallon cans of paint states that the amount of paint in the can is sufficient to paint 400 square feet. However, this number is quite variable. In fact, the amount of coverage is known to

be approximately normally distributed with a standard deviation of 25 square feet. How large a sample should be taken to estimate the true mean coverage of all 1-gallon cans to within 5 square feet with 95% confidence?

10.56 The operations manager of a plant making cellular telephones has proposed rearranging the production process to be more efficient. She wants to estimate the time to assemble the telephone using the new arrangement. She believes that the population standard deviation is 15 seconds. How large a sample of workers should she take to estimate the mean assembly time to within 2 seconds with 95% confidence?

CHAPTER SUMMARY

This chapter introduced the concepts of **estimation** and the **estimator** of a population mean when the population

variance is known. It also presented a formula to calculate the sample size necessary to estimate a population mean.

IMPORTANT TERMS:

Point estimator	325	Confidence level	329
Interval estimator	326	Lower confidence limit (LCL)	329
Unbiased estimator	326	Upper confidence limit (UCL)	329
Consistency	327	95% confidence interval estimator of μ	335
Relative efficiency	327	Error of estimation	342
Confidence interval estimator of μ	329	Bound on the error of estimation	343

S Y M B O L S :

Symbol	Pronounced	Represents
$1 - \alpha$	One minus alpha	Confidence level
B		Bound on the error of estimation
$z_{\alpha/2}$	z alpha by 2	Value of Z such that the area to its right is equal to $\alpha/2$

FORMULAS:

Confidence interval estimator of μ with σ known

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}}$$

Sample size to estimate μ

$$n = \left(\frac{z_{\alpha/2}\sigma}{B} \right)^2$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Confidence interval estimate of μ	332	333

11



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INTRODUCTION TO HYPOTHESIS TESTING

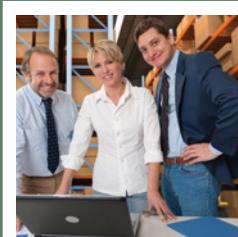
- 11-1 *Concepts of Hypothesis Testing*
- 11-2 *Testing the Population Mean When the Population Standard Deviation Is Known*
- 11-3 *Calculating the Probability of a Type II Error*
- 11-4 *The Road Ahead*

SSA Envelope Plan

Data

Xm11-00

Federal Express (FedEx) sends invoices to customers requesting payment within 30 days. Each bill lists an address, and customers are expected to use their own envelopes to return their payments. Currently, the mean and standard deviation of the amount of time taken to pay bills are 24 days and 6 days, respectively. The chief financial officer (CFO) believes that including a stamped self-addressed (SSA) envelope would decrease the amount of time. She calculates that the improved cash flow from a 2-day decrease in the payment period would pay for the costs of the envelopes and stamps. Any further decrease in the payment period would generate a profit. To test her belief, she randomly selects 220 customers and includes an SSA envelope with their invoices. The numbers of days until payment is received were recorded. Can the CFO conclude that the plan will be profitable?



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After we've introduced the required tools, we'll return to this question and answer it (see page 361).

INTRODUCTION

In Chapter 10, we introduced estimation and showed how it is used. Now we're going to present the second general procedure of making inferences about a population—hypothesis testing. The purpose of this type of inference is to determine whether enough statistical evidence exists to enable us to conclude that a belief or hypothesis about a parameter is supported by the data. You will discover that hypothesis testing has a wide variety of applications in business and economics, as well as many other fields. This chapter will lay the foundation upon which the rest of the book is based. As such it represents a critical contribution to your development as a statistics practitioner.

In the next section, we will introduce the concepts of hypothesis testing, and in Section 11-2 we will develop the method employed to test a hypothesis about a population mean when the population standard deviation is known. The rest of the chapter deals with related topics.

11-1 CONCEPTS OF HYPOTHESIS TESTING

The term **hypothesis testing** is likely new to most readers, but the concepts underlying hypothesis testing are quite familiar. There are a variety of nonstatistical applications of hypothesis testing, the best known of which is a criminal trial.

When a person is accused of a crime, he or she faces a trial. The prosecution presents its case, and a jury must make a decision on the basis of the evidence presented. In fact, the jury conducts a test of hypothesis. There are actually two hypotheses that are tested. The first is called the **null hypothesis** and is represented by H_0 (pronounced *H nought*—*nought* is a British term for zero). It is

H_0 : The defendant is innocent.

The second is called the **alternative hypothesis** (or **research hypothesis**) and is denoted H_1 . In a criminal trial it is

H_1 : The defendant is guilty.

Of course, the jury does not know which hypothesis is correct. The members must make a decision on the basis of the evidence presented by both the prosecution and the defense. There are only two possible decisions. Convict or acquit the defendant. In statistical parlance, convicting the defendant is equivalent to *rejecting the null hypothesis in favor of the alternative*; that is, the jury is saying that there was enough evidence to conclude that the defendant was guilty. Acquitting a defendant is phrased as *not rejecting the null hypothesis in favor of the alternative*, which means that the jury decided that there was not enough evidence to conclude that the defendant was guilty. Notice that we do not say that we accept the null hypothesis. In a criminal trial, that would be interpreted as finding the defendant *innocent*. Our justice system does not allow this decision.

There are two possible errors. A **Type I error** occurs when we reject a true null hypothesis. A **Type II error** is defined as not rejecting a false null hypothesis. In the criminal trial, a Type I error is made when an innocent person is wrongly convicted. A Type II error occurs when a guilty defendant is acquitted. The probability of a Type I error is denoted by α which is also called the **significance level**. The probability of a Type II error is denoted by β (Greek letter *beta*). The error probabilities α and β are inversely related, meaning that any attempt to reduce one will increase the other. Table 11.1 summarizes the terminology and the concepts.

TABLE 11.1 Terminology of Hypothesis Testing

DECISION	H_0 IS TRUE (DEFENDANT IS INNOCENT)	H_0 IS FALSE (DEFENDANT IS GUILTY)
REJECT H_0	Type I Error	Correct decision
Convict defendant	$P(\text{Type I Error}) = \alpha$	
DO NOT REJECT H_0	Correct decision	Type II Error
Acquit defendant		$P(\text{Type II Error}) = \beta$

In our justice system, Type I errors are regarded as more serious. As a consequence, the system is set up so that the probability of a Type I error is small. This is arranged by placing the burden of proof on the prosecution (the prosecution must prove guilt—the defense need not prove anything) and by having judges instruct the jury to find the defendant guilty only if there is “evidence beyond a reasonable doubt.” In the absence of enough evidence, the jury must acquit even though there may be some evidence of guilt. The consequence of this arrangement is that the probability of acquitting guilty people is relatively large. Oliver Wendell Holmes, a United States Supreme Court justice, once phrased the relationship between the probabilities of Type I and Type II errors in the following way: “Better to acquit 100 guilty men than convict one innocent one.” In Justice Holmes’s opinion, the probability of a Type I error should be 1/100 of the probability of a Type II error.

The critical concepts in hypothesis testing follow.

1. There are two hypotheses. One is called the null hypothesis, and the other the alternative or research hypothesis.
2. The testing procedure begins with the assumption that the null hypothesis is true.
3. The goal of the process is to determine whether there is enough evidence to infer that the alternative hypothesis is true.
4. There are two possible decisions:
 - Conclude that there is enough evidence to support the alternative hypothesis
 - Conclude that there is not enough evidence to support the alternative hypothesis
5. Two possible errors can be made in any test. A Type I error occurs when we reject a true null hypothesis, and a Type II error occurs when we don’t reject a false null hypothesis. The probabilities of Type I and Type II errors are

$$P(\text{Type I error}) = \alpha$$

$$P(\text{Type II error}) = \beta$$

Let’s extend these concepts to statistical hypothesis testing.

In statistics we frequently test hypotheses about parameters. The hypotheses we test are generated by questions that managers need to answer. To illustrate, suppose that in Example 10.1 (page 331) the operations manager did not want to estimate the mean demand during lead time but instead wanted to know whether the mean is different from 350, which may be the point at which the current inventory policy needs to be altered. In other words, the manager wants to determine whether he can infer that μ is not equal to 350. We can rephrase the question so that it now reads, Is there enough evidence to conclude that μ is not equal to 350? This wording is analogous to the

criminal trial wherein the jury is asked to determine whether there is enough evidence to conclude that the defendant is guilty. Thus, the alternative (research) hypothesis is

$$H_1: \mu \neq 350$$

In a criminal trial, the process begins with the assumption that the defendant is innocent. In a similar fashion, we start with the assumption that the parameter equals the value we're testing. Consequently, the operations manager would assume that $\mu = 350$, and the null hypothesis is expressed as

$$H_0: \mu = 350$$

When we state the hypotheses, we list the null first followed by the alternative hypothesis. To determine whether the mean is different from 350, we test

$$H_0: \mu = 350$$

$$H_1: \mu \neq 350$$

Now suppose that in this illustration the current inventory policy is based on an analysis that revealed that the actual mean demand during lead time is 350. After a vigorous advertising campaign, the manager suspects that there has been an increase in demand and thus an increase in mean demand during lead time. To test whether there is evidence of an increase, the manager would specify the alternative hypothesis as

$$H_1: \mu > 350$$

Because the manager knew that the mean was (and maybe still is) 350, the null hypothesis would state

$$H_0: \mu = 350$$

Further suppose that the manager does not know the actual mean demand during lead time, but the current inventory policy is based on the assumption that the mean is *less than or equal to* 350. If the advertising campaign increases the mean to a quantity larger than 350, a new inventory plan will have to be instituted. In this scenario, the hypotheses become

$$H_0: \mu \leq 350$$

$$H_1: \mu > 350$$

Notice that in both illustrations the alternative hypothesis is designed to determine whether there is enough evidence to conclude that the mean is greater than 350. Although the two null hypotheses are different (one states that the mean is equal to 350, and the other states that the mean is less than or equal to 350), when the test is conducted, the process begins by assuming that the mean is *equal to* 350. In other words, no matter the form of the null hypothesis, we use the equal sign in the null hypothesis. Here is the reason. If there is enough evidence to conclude that the alternative hypothesis (the mean is greater than 350) is true when we assume that the mean is *equal to* 350, we would certainly draw the same conclusion when we assume that the mean is a value that is *less than* 350. As a result, the null hypothesis will always state that the parameter equals the value specified in the alternative hypothesis.

To emphasize this point, suppose the manager now wanted to determine whether there has been a decrease in the mean demand during lead time. We express the null and alternative hypotheses as

$$H_0: \mu = 350$$

$$H_1: \mu < 350$$

The hypotheses are often set up to reflect a manager's decision problem wherein the null hypothesis represents the *status quo*. Often this takes the form of some course of action such as maintaining a particular inventory policy. If there is evidence of an increase or decrease in the value of the parameter, a new course of action will be taken. Examples include deciding to produce a new product, switching to a better drug to treat an illness, or sentencing a defendant to prison.

The next element in the procedure is to randomly sample the population and calculate the sample mean. This is called the **test statistic**. The test statistic is the criterion on which we base our decision about the hypotheses. (In the criminal trial analogy, this is equivalent to the evidence presented in the case.) The test statistic is based on the best estimator of the parameter. In Chapter 10, we stated that the best estimator of a population mean is the sample mean.

If the test statistic's value is inconsistent with the null hypothesis, we reject the null hypothesis and infer that the alternative hypothesis is true. For example, if we're trying to decide whether the mean is greater than 350, a large value of \bar{x} (say, 600) would provide enough evidence. If \bar{x} is close to 350 (say, 355), we would say that this does not provide much evidence to infer that the mean is greater than 350. In the absence of sufficient evidence, we do not reject the null hypothesis in favor of the alternative. (In the absence of sufficient evidence of guilt, a jury finds the defendant not guilty.)

In a criminal trial, "sufficient evidence" is defined as "evidence beyond a reasonable doubt." In statistics, we need to use the test statistic's sampling distribution to define "sufficient evidence." We will do so in the next section.



EXERCISES

Exercises 11.1–11.5 feature nonstatistical applications of hypothesis testing. For each, identify the hypotheses, define Type I and Type II errors, and discuss the consequences of each error. In setting up the hypotheses, you will have to consider where to place the "burden of proof."

- 11.1 It is the responsibility of the federal government to judge the safety and effectiveness of new drugs. There are two possible decisions: approve the drug or disapprove the drug.
- 11.2 You are contemplating a Ph.D. in business or economics. If you succeed, a life of fame, fortune, and happiness awaits you. If you fail, you've wasted 5 years of your life. Should you go for it?
- 11.3 You are the centerfielder of the New York Yankees. It is the bottom of the ninth inning of the seventh game of the World Series. The Yanks lead by 2 with 2 outs and men on second and third. The batter is known to hit for high average and runs very well but only has mediocre power. A single will tie the game, and a hit over your

head will likely result in the Yanks losing. Do you play shallow?

- 11.4 You are faced with two investments. One is very risky, but the potential returns are high. The other is safe, but the potential is quite limited. Pick one.
- 11.5 You are the pilot of a jumbo jet. You smell smoke in the cockpit. The nearest airport is less than 5 minutes away. Should you land the plane immediately?
- 11.6 Several years ago in a high-profile case, a defendant was acquitted in a double-murder trial but was subsequently found responsible for the deaths in a civil trial. (Guess the name of the defendant—the answer is in Appendix C.) In a civil trial the plaintiff (the victims' relatives) are required only to show that the preponderance of evidence points to the guilt of the defendant. Aside from the other issues in the cases, discuss why these results are logical.

11-2 / TESTING THE POPULATION MEAN WHEN THE POPULATION STANDARD DEVIATION IS KNOWN

To illustrate the process, consider the following example.

EXAMPLE 11.1

Data
Xm11-01

Department Store's New Billing System

The manager of a department store is thinking about establishing a new billing system for the store's credit customers. After a thorough financial analysis, she determines that the new system will be cost-effective only if the mean monthly account is more than \$170. A random sample of 400 monthly accounts is drawn, for which the sample mean is \$178. The manager knows that the accounts are approximately normally distributed with a standard deviation of \$65. Can the manager conclude from this that the new system will be cost-effective?

SOLUTION:

IDENTIFY

This example deals with the population of the credit accounts at the store. To conclude that the system will be cost-effective requires the manager to show that the mean account for all customers is greater than \$170. Consequently, we set up the alternative hypothesis to express this circumstance:

$$H_1: \mu > 170 \quad (\text{Install new system})$$

If the mean is less than or equal to 170, then the system will not be cost-effective. The null hypothesis can be expressed as

$$H_0: \mu \leq 170 \quad (\text{Do not install new system})$$

However, as was discussed in Section 11-1, we will actually test $\mu = 170$, which is how we specify the null hypothesis:

$$H_0: \mu = 170$$

As we previously pointed out, the test statistic is the best estimator of the parameter. In Chapter 10, we used the sample mean to estimate the population mean. To conduct this test, we ask and answer the following question: Is a sample mean of 178 sufficiently greater than 170 to allow us to confidently infer that the population mean is greater than 170?

There are two approaches to answering this question. The first is called the *rejection region method*. It can be used in conjunction with the computer, but it is mandatory for those computing statistics manually. The second is the *p-value approach*, which in general can be employed only in conjunction with a computer and statistical software. We recommend, however, that users of statistical software be familiar with both approaches.

11-2a Rejection Region

It seems reasonable to reject the null hypothesis in favor of the alternative if the value of the sample mean is large relative to 170. If we had calculated the sample mean to be say, 500, it would be quite apparent that the null hypothesis is false and we would reject it.

On the other hand, values of \bar{x} close to 170, such as 171, do not allow us to reject the null hypothesis because it is entirely possible to observe a sample mean of 171 from a population whose mean is 170. Unfortunately, the decision is not always so obvious. In this example, the sample mean was calculated to be 178, a value apparently neither very far away from nor very close to 170. To make a decision about this sample mean, we set up the *rejection region*.

Rejection Region

The **rejection region** is a range of values such that if the test statistic falls into that range, we decide to reject the null hypothesis in favor of the alternative hypothesis.

Suppose we define the value of the sample mean that is just large enough to reject the null hypothesis as \bar{x}_L . The rejection region is

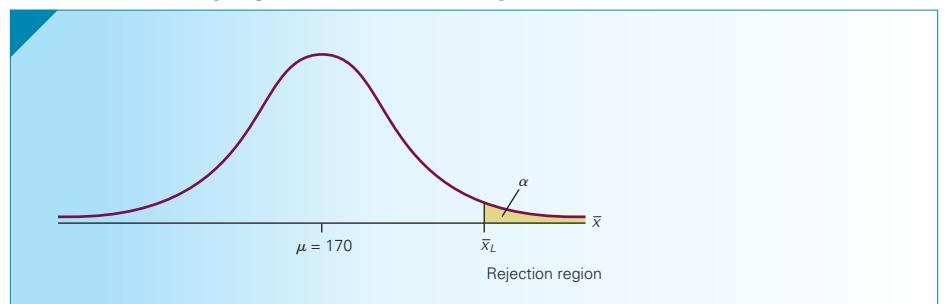
$$\bar{x} > \bar{x}_L$$

Because a Type I error is defined as rejecting a true null hypothesis, and the probability of committing a Type I error is α , it follows that

$$\begin{aligned}\alpha &= P(\text{rejecting } H_0 \text{ given that } H_0 \text{ is true}) \\ &= P(\bar{x} > \bar{x}_L \text{ given that } H_0 \text{ is true})\end{aligned}$$

Figure 11.1 depicts the sampling distribution and the rejection region.

FIGURE 11.1 Sampling Distribution for Example 11.1



From Section 9-1, we know that the sampling distribution of \bar{x} is normal or approximately normal, with mean μ and standard deviation σ / \sqrt{n} . As a result, we can standardize \bar{x} and obtain the following probability:

$$P\left(\frac{\bar{x} - \mu}{\sigma / \sqrt{n}} > \frac{\bar{x}_L - \mu}{\sigma / \sqrt{n}}\right) = P\left(Z > \frac{\bar{x}_L - \mu}{\sigma / \sqrt{n}}\right) = \alpha$$

From Section 8-2, we defined z_α to be the value of a standard normal random variable such that

$$P(Z > z_\alpha) = \alpha$$

Because both probability statements involve the same distribution (standard normal) and the same probability (α), it follows that the limits are identical. Thus,

$$\frac{\bar{x}_L - \mu}{\sigma / \sqrt{n}} = z_\alpha$$

We know that $\sigma = 65$ and $n = 400$. Because the probabilities defined earlier are conditional on the null hypothesis being true, we have $\mu = 170$. To calculate the rejection region, we need a value of α at the significance level. Suppose that the manager chose α to be 5%. It follows that $z_\alpha = z_{0.05} = 1.645$. We can now calculate the value of \bar{x}_L :

$$\frac{\bar{x}_L - \mu}{\sigma / \sqrt{n}} = z_\alpha$$

$$\frac{\bar{x}_L - 170}{65 / \sqrt{400}} = 1.645$$

$$\bar{x}_L = 175.34$$

Therefore, the rejection region is

$$\bar{x} > 175.34$$

The sample mean was computed to be 178. Because the test statistic (sample mean) is in the rejection region (it is greater than 175.34), we reject the null hypothesis. Thus, there is sufficient evidence to infer that the mean monthly account is greater than \$170.

Our calculations determined that any value of \bar{x} above 175.34 represents an event that is quite unlikely when sampling (with $n = 400$) from a population whose mean is 170 (and whose standard deviation is 65). This suggests that the assumption that the null hypothesis is true is incorrect, and consequently we reject the null hypothesis in favor of the alternative hypothesis.

11-2b Standardized Test Statistic

The preceding test used the test statistic \bar{x} ; as a result, the rejection region had to be set up in terms of \bar{x} . An easier method specifies that the test statistic be the standardized value of \bar{x} ; that is, we use the **standardized test statistic**.

$$z = \frac{\bar{x} - \mu}{\sigma / \sqrt{n}}$$

and the rejection region consists of all values of z that are greater than z_α . Algebraically, the rejection region is

$$z > z_\alpha$$

We can redo Example 11.1 using the standardized test statistic.

The rejection region is

$$z > z_\alpha = z_{0.05} = 1.645$$

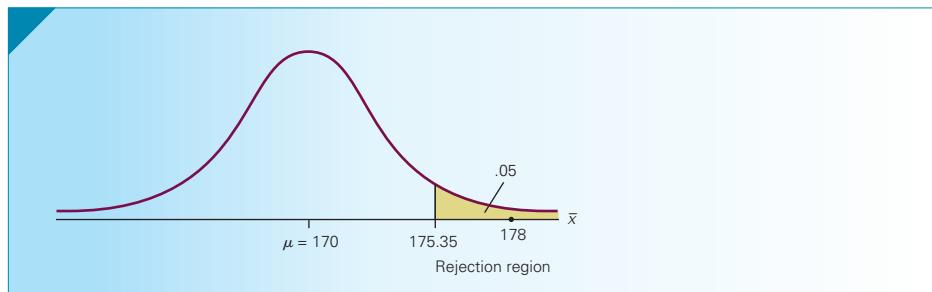
The value of the test statistic is calculated next:

$$z = \frac{\bar{x} - \mu}{\sigma / \sqrt{n}} = \frac{178 - 170}{65 / \sqrt{400}} = 2.46$$

Because 2.46 is greater than 1.645, reject the null hypothesis and conclude that there is enough evidence to infer that the mean monthly account is greater than \$170.

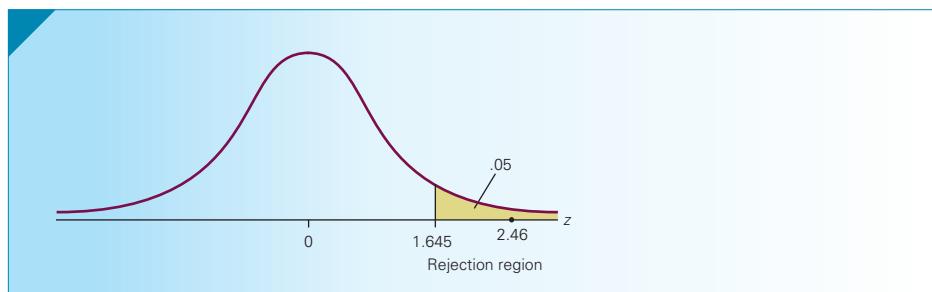
As you can see, the conclusions we draw from using the test statistic \bar{x} and the standardized test statistic z are identical. Figures 11.2 and 11.3 depict the two sampling distributions, highlighting the equivalence of the two tests.

FIGURE 11.2 Sampling Distribution of \bar{X} for Example 11.1



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FIGURE 11.3 Sampling Distribution of Z for Example 11.1



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Because it is convenient and because statistical software packages employ it, the standardized test statistic will be used throughout this book. For simplicity, we will refer to the *standardized test statistic* simply as the *test statistic*.

Incidentally, when a null hypothesis is rejected, the test is said to be **statistically significant** at whatever significance level the test was conducted. Summarizing Example 11.1, we would say that the test was significant at the 5% significance level.

11-2c p -Value

There are several drawbacks to the rejection region method. Foremost among them is the type of information provided by the result of the test. The rejection region method produces a yes or no response to the question, Is there sufficient statistical evidence to infer that the alternative hypothesis is true? The implication is that the result of the test of hypothesis will be converted automatically into one of two possible courses of action: one action as a result of rejecting the null hypothesis in favor of the alternative and another as a result of not rejecting the null hypothesis in favor of the alternative. In Example 11.1, the rejection of the null hypothesis seems to imply that the new billing system will be installed.

In fact, this is not the way in which the result of a statistical analysis is utilized. The statistical procedure is only one of several factors considered by a manager when making a decision. In Example 11.1, the manager discovered that there was enough statistical evidence to conclude that the mean monthly account is greater than \$170. However, before taking any action, the manager would like to consider a number of factors including the cost and feasibility of restructuring the billing system and the possibility of making an error, in this case a Type I error.

What is needed to take full advantage of the information available from the test result and make a better decision is a measure of the amount of statistical evidence supporting the alternative hypothesis so that it can be weighed in relation to the other factors, especially the financial ones. The *p-value of a test* provides this measure.

p-Value

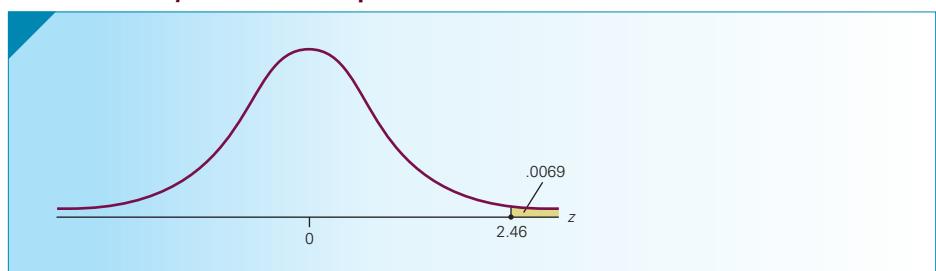
The **p-value** of a test is the probability of observing a test statistic at least as extreme as the one computed given that the null hypothesis is true.

In Example 11.1 the *p*-value is the probability of observing a sample mean at least as large as 178 when the population mean is 170. Thus,

$$\begin{aligned} p\text{-value} &= P(\bar{X} > 178) = P\left(\frac{\bar{X} - \mu}{\sigma / \sqrt{n}} > \frac{178 - 170}{65 / \sqrt{400}}\right) = P(Z > 2.46) \\ &= 1 - P(Z < 2.46) = 1 - .9931 = .0069 \end{aligned}$$

Figure 11.4 describes this calculation.

FIGURE 11.4 *p*-Value for Example 11.1



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11-2d Interpreting the *p*-Value

To properly interpret the results of an inferential procedure, you must remember that the technique is based on the sampling distribution. The sampling distribution allows us to make probability statements about a sample statistic assuming knowledge of the population parameter. Thus, the probability of observing a sample mean at least as large as 178 from a population whose mean is 170 is .0069, which is very small. In other words, we have just observed an unlikely event, an event so unlikely that we seriously doubt the assumption that began the process—that the null hypothesis is true. Consequently, we have reason to reject the null hypothesis and support the alternative.

Students may be tempted to simplify the interpretation by stating that the *p*-value is the probability that the null hypothesis is true. Don't! As was the case with interpreting the confidence interval estimator, you cannot make a probability statement about a parameter. It is not a random variable.

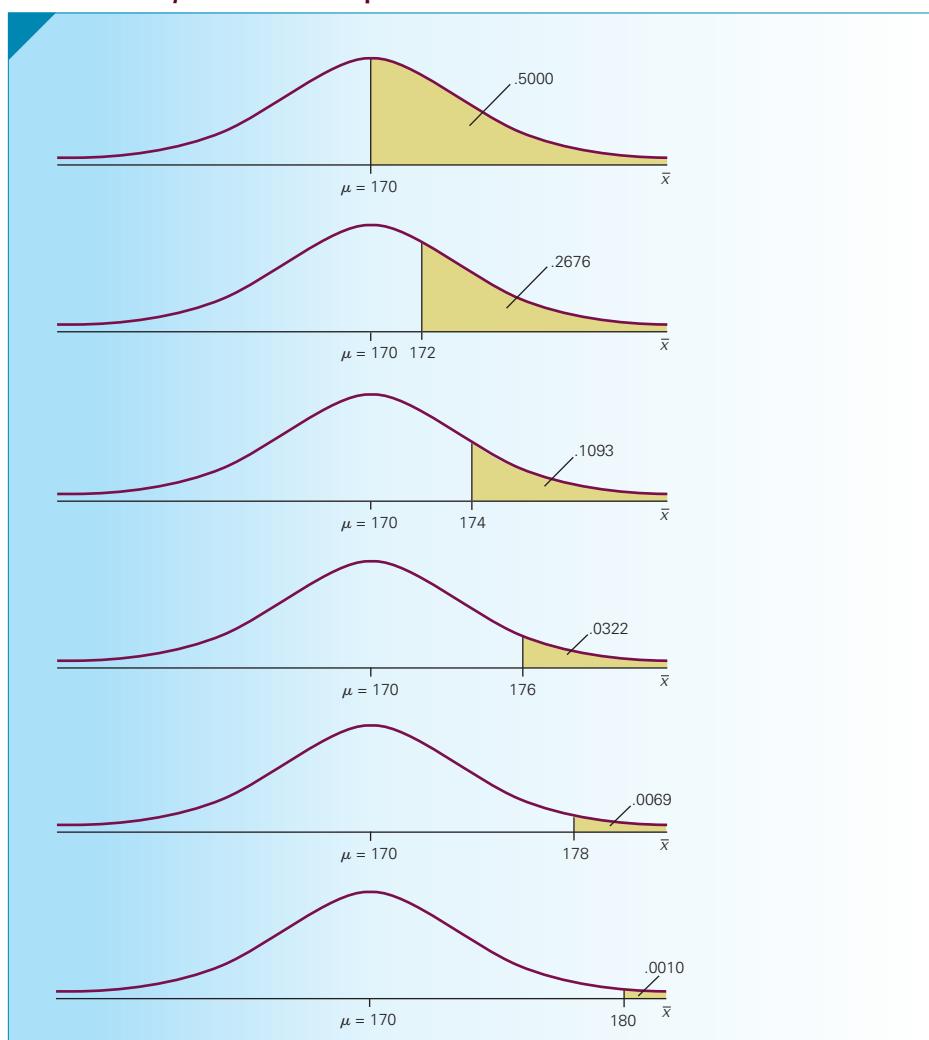
The *p*-value of a test provides valuable information because it is a measure of the amount of statistical evidence that supports the alternative hypothesis. To understand this interpretation fully, refer to Table 11.2 where we list several values of \bar{x} , their *z*-statistics, and *p*-values for Example 11.1. Notice that the closer \bar{x} is to the hypothesized mean, 170, the larger the *p*-value is. The farther \bar{x} is above 170, the smaller the *p*-value is. Values of \bar{x} far above 170 tend to indicate that the alternative hypothesis is true.

Thus, the smaller the p -value, the more the statistical evidence supports the alternative hypothesis. Figure 11.5 graphically depicts the information in Table 11.2.

TABLE 11.2 Test Statistics and p -Values for Example 11.1

SAMPLE MEAN \bar{x}	TEST STATISTIC		p -VALUE
	$z = \frac{\bar{x} - \mu}{\sigma / \sqrt{n}} = \frac{\bar{x} - 170}{65 / \sqrt{400}}$		
170	0		.5000
172	0.62		.2676
174	1.23		.1093
176	1.85		.0322
178	2.46		.0069
180	3.08		.0010

FIGURE 11.5 p -Values for Example 11.1



This raises the question, How small does the p -value have to be to infer that the alternative hypothesis is true? In general, the answer depends on a number of factors, including the costs of making Type I and Type II errors. In Example 11.1, a Type I error would occur if the manager adopts the new billing system when it is not cost-effective. If the cost of this error is high, we attempt to minimize its probability. In the rejection region method, we do so by setting the significance level quite low—say, 1%. Using the p -value method, we would insist that the p -value be quite small, providing sufficient evidence to infer that the mean monthly account is greater than \$170 before proceeding with the new billing system.

11-2e Describing the p -Value

Statistics practitioners can translate p -values using the following descriptive terms:

If the p -value is less than .01, we say that there is *overwhelming* evidence to infer that the alternative hypothesis is true. We also say that the test is **highly significant**.

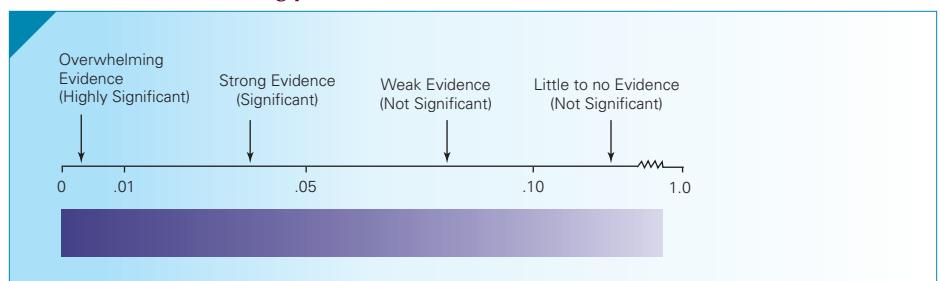
If the p -value lies between .01 and .05, there is *strong* evidence to infer that the alternative hypothesis is true. The result is deemed to be **significant**.

If the p -value is between .05 and .10, we say that there is *weak* evidence to indicate that the alternative hypothesis is true. When the p -value is greater than 5%, we say that the result is **not statistically significant**.

When the p -value exceeds .10, we say that there is little to no evidence to infer that the alternative hypothesis is true.

Figure 11.6 summarizes these terms.

FIGURE 11.6 Describing p -Values



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11-2f The p -Value and Rejection Region Methods

If we so choose, we can use the p -value to make the same type of decisions we make in the rejection region method. The rejection region method requires the decision maker to select a significance level from which the rejection region is constructed. We then decide to reject or not reject the null hypothesis. Another way of making that type of decision is to compare the p -value with the selected value of the significance level. If the p -value is less than α , we judge the p -value to be small enough to reject the null hypothesis. If the p -value is greater than α , we do not reject the null hypothesis.

11-2g Solving Manually, Using Excel, and Using Minitab

As you have already seen, we offer three ways to solve statistical problems. When we perform the calculations manually, we will use the rejection region approach. We will set up the rejection region using the test statistic's sampling distribution and associated table

(in Appendix B). The calculations will be performed manually and a reject–do not reject decision will be made. In this chapter, it is possible to compute the p -value of the test manually. However, in later chapters we will be using test statistics that are not normally distributed, making it impossible to calculate the p -values manually. In these instances, manual calculations require the decision to be made via the rejection region method only.

Most software packages that compute statistics, including Excel and Minitab, print the p -value of the test. When we employ the computer, we will not set up the rejection region. Instead we will focus on the interpretation of the p -value.

EXCEL

	A	B	C	D
1	Z-Test: Mean			
2				
3			Accounts	
4	Mean		178.00	
5	Standard Deviation		68.37	
6	Observations		400	
7	Hypothesized Mean		170	
8	SIGMA		65	
9	z Stat		2.46	
10	P(Z<=z) one-tail		0.0069	
11	z Critical one-tail		1.6449	
12	P(Z<=z) two-tail		0.0138	
13	z Critical two-tail		1.96	

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm11-01](#).)
2. Click **Add-Ins, Data Analysis Plus**, and **Z-Test: Mean**.
3. Fill in the dialog box: **Input Range** (A1:A401), type the **Hypothesized Mean** (170), type a positive value for the **Standard Deviation** (65), click **Labels** if the first row contains the name of the variable, and type the significance level α (.05).

The first part of the printout reports the statistics and the details of the test. As you can see, the test statistic is $z = 2.46$. The p -value* of the test is $P(Z > 2.46) = .0069$. Excel reports this probability as

$$P(Z \leq z) \text{ one-tail}$$

Don't take Excel's notation literally. It is not giving us the probability that Z is less than or equal to the value of the z -statistic. Also printed is the critical value of the rejection region shown as

$$Z \text{ Critical one-tail}$$

The printout shown here was produced from the raw data; that is, we input the 400 observations in the data set and the computer calculated the value of the test statistic and the p -value. Another way of producing the statistical results is through the use of a spreadsheet that you can create yourself. We describe the required tools for the Do-It-Yourself Excel on page 365.

*Excel provides two probabilities in its printout. The way in which we determine the p -value of the test from the printout is somewhat more complicated. Interested students are advised to read Keller's website Appendix Converting Excel's Probabilities to p -Values.

MINITAB**One-Sample Z: Accounts**

Test of $\mu = 170$ vs > 170
 The assumed standard deviation = 65

Variable	N	Mean	StDev	SE Mean	95%		P
					Lower	Bound	
Accounts	400	177.997	68.367	3.250	172.651	2.46	0.007

INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm11-01](#).)
2. Click **Stat**, **Basic Statistics**, and **1-Sample Z**
3. Type or use the **Select** button to specify the name of the variable or the column in the **Samples in Columns** box (**Accounts**). Type the value of the **Standard deviation** ([65](#)), check the **Perform hypothesis test** box, and type the value of μ under the null hypothesis in the **Hypothesized mean** box ([170](#)).
4. Click **Options . . .** and specify the form of the alternative hypothesis in the **Alternative** box ([greater than](#)).

11-2h Interpreting the Results of a Test

In Example 11.1, we rejected the null hypothesis. Does this prove that the alternative hypothesis is true? The answer is no; because our conclusion is based on sample data (and not on the entire population), we can never *prove* anything by using statistical inference. Consequently, we summarize the test by stating that there is enough statistical evidence to infer that the null hypothesis is false and that the alternative hypothesis is true.

Now suppose that \bar{x} had equaled 174 instead of 178. We would then have calculated $z = 1.23$ (p -value = .1093), which is not in the rejection region. Could we conclude on this basis that there is enough statistical evidence to infer that the null hypothesis is true and hence that $\mu = 170$? Again the answer is “no” because it is absurd to suggest that a sample mean of 174 provides enough evidence to infer that the population mean is 170. (If it proved anything, it would prove that the population mean is 174.) Because we’re testing a single value of the parameter under the null hypothesis, we can never have enough statistical evidence to establish that the null hypothesis is true (unless we sample the entire population). (The same argument is valid if you set up the null hypothesis as $H_0 : \mu \leq 170$. It would be illogical to conclude that a sample mean of 174 provides enough evidence to conclude that the population mean is *less than or equal to 170*.)

Consequently, if the value of the test statistic does not fall into the rejection region (or the p -value is large), rather than say we accept the null hypothesis (which implies that we’re stating that the null hypothesis is true), we state that we do not reject the null hypothesis, and we conclude that not enough evidence exists to show that the alternative hypothesis is true. Although it may appear to be the case, we are not being overly technical. Your ability to set up tests of hypotheses properly and to interpret their results correctly very much depends on your understanding of this point. The point is that the conclusion is based on the alternative hypothesis. In the final analysis, there are only two possible conclusions of a test of hypothesis.

Conclusions of a Test of Hypothesis

If we reject the null hypothesis, we conclude that there is enough statistical evidence to infer that the alternative hypothesis is true. If we do *not* reject the null hypothesis, we conclude that there is *not* enough statistical evidence to infer that the alternative hypothesis is true.

Observe that the alternative hypothesis is the focus of the conclusion. It represents what we are investigating, which is why it is also called the *research hypothesis*. Whatever you're trying to show statistically must be represented by the alternative hypothesis (bearing in mind that you have only three choices for the alternative hypothesis—the parameter is greater than, less than, or not equal to the value specified in the null hypothesis).

When we introduced statistical inference in Chapter 10, we pointed out that the first step in the solution is to identify the technique. When the problem involves hypothesis testing, part of this process is the specification of the hypotheses. Because the alternative hypothesis represents the condition we're researching, we will identify it first. The null hypothesis automatically follows because the null hypothesis must specify equality. However, by tradition, when we list the two hypotheses, the null hypothesis comes first, followed by the alternative hypothesis. All examples in this book will follow that format.

SSA Envelope Plan: Solution

IDENTIFY

The objective of the study is to draw a conclusion about the mean payment period. Thus, the parameter to be tested is the population mean μ . We want to know whether there is enough statistical evidence to show that the population mean is less than 22 days. Thus, the alternative hypothesis is

$$H_1: \mu < 22$$

The null hypothesis is

$$H_0: \mu = 22$$

The test statistic is the only one we've presented thus far. It is

$$z = \frac{\bar{x} - \mu}{\sigma / \sqrt{n}}$$



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COMPUTE

M A N U A L L Y:

To solve this problem manually, we need to define the rejection region, which requires us to specify a significance level. A 10% significance level is deemed to be appropriate. (We'll discuss our choice later.)

We wish to reject the null hypothesis in favor of the alternative only if the sample mean and hence the value of the test statistic is small enough. As a result, we locate the rejection region in the left tail of the sampling distribution. To understand why, remember that we're trying to decide whether there is enough statistical evidence to infer that the mean is less than 22 (which is the alternative hypothesis). If we observe a large sample mean (and hence a large value of z), do we want to reject the null hypothesis in favor of the alternative? The answer is an emphatic "no." It is illogical to think that if the sample mean is, say, 30, there is enough evidence to conclude that the mean payment period for all customers would be less than 22.

Consequently, we want to reject the null hypothesis only if the sample mean (and hence the value of the test statistic z) is small. How small is small enough? The answer is determined by the significance level and the rejection region. Thus, we set up the rejection region as

$$z < -z_\alpha = -z_{.10} = -1.28$$

Note that the direction of the inequality in the rejection region ($z < -z_\alpha$) matches the direction of the inequality in the alternative hypothesis ($\mu < 22$). Also note that we use the negative sign, because the rejection region is in the left tail (containing values of z less than 0) of the sampling distribution.

From the data, we compute the sum and the sample mean. They are

$$\begin{aligned}\sum x_i &= 4,759 \\ \bar{x} &= \frac{\sum x_i}{220} = \frac{4,759}{220} = 21.63\end{aligned}$$

We will assume that the standard deviation of the payment periods for the SSA plan is unchanged from its current value of $\sigma = 6$. The sample size is $n = 220$, and the value of μ is hypothesized to be 22. We compute the value of the test statistic as

$$z = \frac{\bar{x} - \mu}{\sigma/\sqrt{n}} = \frac{21.63 - 22}{6/\sqrt{220}} = -.91$$

Because the value of the test statistic, $z = -.91$, is not less than -1.28 , we do not reject the null hypothesis and we do not conclude that the alternative hypothesis is true. There is insufficient evidence to infer that the mean is less than 22 days.

We can determine the p -value of the test as follows:

$$p\text{-value} = P(Z < -.91) = .1814$$

In this type of one-tail (left-tail) test of hypothesis, we calculate the p -value as $P(Z < z)$, where z is the actual value of the test statistic. Figure 11.7 depicts the sampling distribution, rejection region, and p -value.

EXCEL

	A	B	C	D
1	Z-Test: Mean			
2				
3			Payment	
4	Mean		21.63	
5	Standard Deviation		5.84	
6	Observations		220	
7	Hypothesized Mean		22	
8	SIGMA		6	
9	z Stat		-.91	
10	P(Z<=z) one-tail		0.1814	
11	z Critical one-tail		1.6449	
12	P(Z<=z) two-tail		0.3628	
13	z Critical two-tail		1.96	

MINITAB**One-Sample Z: Payment**

Test of mu = 22 vs < 22
The assumed standard deviation = 6

Variable	N	Mean	StDev	SE Mean	95% Upper Bound	Z	P
Payment	220	21.6318	5.8353	0.4045	22.2972	-0.91	0.1814

INTERPRET

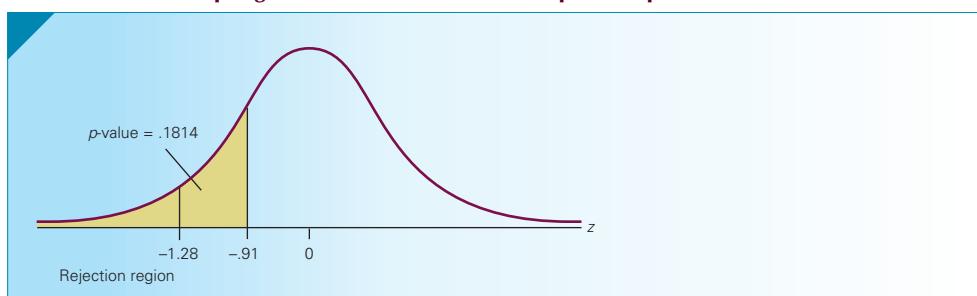
The value of the test statistic is -0.91 , and its p -value is $.1814$, a figure that does not allow us to reject the null hypothesis. Because we were not able to reject the null hypothesis, we say that there is not enough evidence to infer that the mean payment period is less than 22 days. Note that there was some evidence to indicate that the mean of the entire population of payment periods is less than 22 days. We did calculate the sample mean to be 21.63. However, to reject the null hypothesis we need *enough* statistical evidence—and in this case we simply did not have enough reason to reject the null hypothesis in favor of the alternative. In the absence of evidence to show that the mean payment period for all customers sent a stamped self-addressed envelope would be less than 22 days, we cannot infer that the plan would be profitable.

A Type I error occurs when we conclude that the plan works when it actually does not. The cost of this mistake is not high. A Type II error occurs when we don't adopt the SSA envelope plan when it would reduce costs. The cost of this mistake can be high. As a consequence, we would like to minimize the probability of a Type II error. Thus, we chose a large value for the probability of a Type I error; we set

$$\alpha = .10$$

Figure 11.7 exhibits the sampling distribution for this example.

FIGURE 11.7 Sampling Distribution for SSA Envelope Example



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11-2i One- and Two-Tail Tests

The statistical tests conducted in Example 11.1 and the SSA envelope example are called **one-tail tests** because the rejection region is located in only one tail of the sampling distribution. The p -value is also computed by finding the area in one tail of the sampling distribution. The right tail in Example 11.1 is the important one because the

alternative hypothesis specifies that the mean is *greater than* 170. In the SSA envelope example, the left tail is emphasized because the alternative hypothesis specifies that the mean is *less than* 22.

We now present an example that requires a **two-tail test**.

EXAMPLE 11.2

Data

Xm 11-02

Comparison of AT&T and Its Competitor

In recent years, several companies have been formed to compete with AT&T in long-distance calls. All advertise that their rates are lower than AT&T's, and as a result their bills will be lower. AT&T has responded by arguing that there will be no difference in billing for the average consumer. Suppose that a statistics practitioner working for AT&T determines that the mean and standard deviation of monthly long-distance bills for all its residential customers are \$17.09 and \$3.87, respectively. He then takes a random sample of 100 customers and recalculates their last month's bill using the rates quoted by a leading competitor. Assuming that the standard deviation of this population is the same as for AT&T, can we conclude at the 5% significance level that there is a difference between the average AT&T bill and that of the leading competitor?

SOLUTION:

IDENTIFY

In this problem, we want to know whether the mean monthly long-distance bill is different from \$17.09. Consequently, we set up the alternative hypothesis to express this condition:

$$H_1: \mu \neq 17.09$$

The null hypothesis specifies that the mean is equal to the value specified under the alternative hypothesis. Hence

$$H_0: \mu = 17.09$$

COMPUTE

MANUALLY:

To set up the rejection region, we need to realize that we can reject the null hypothesis when the test statistic is large or when it is small. In other words, we must set up a *two-tail rejection region*. Because the total area in the rejection region must be α , we divide this probability by 2. Thus, the rejection region* is

$$z < -z_{\alpha/2} \text{ or } z > z_{\alpha/2}$$

For $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$.

$$z < -1.96 \text{ or } z > 1.96$$

*Statistics practitioners often represent this rejection region as $|z| > z_{\alpha/2}$, which reads, "the absolute value of z is greater than $z_{\alpha/2}$." We prefer our method because it is clear that we are performing a two-tail test.

From the data, we compute

$$\sum x_i = 1,754.99$$

$$\bar{x} = \frac{\sum x_i}{n} = \frac{1,754.99}{100} = 17.55$$

The value of the test statistic is

$$z = \frac{\bar{x} - \mu}{\sigma/\sqrt{n}} = \frac{17.55 - 17.09}{3.87/\sqrt{100}} = 1.19$$

Because 1.19 is neither greater than 1.96 nor less than -1.96, we cannot reject the null hypothesis.

We can also calculate the *p*-value of the test. Because it is a two-tail test, we determine the *p*-value by finding the area in both tails; that is,

$$p\text{-value} = P(Z < -1.19) + P(Z > 1.19) = .1170 + .1170 = .2340$$

Or, more simply multiply the probability in one tail by 2.

In general, the *p*-value in a two-tail test is determined by

$$p\text{-value} = 2P(Z > |z|)$$

where *z* is the actual value of the test statistic and $|z|$ is its absolute value.

EXCEL

	A	B	C	D
1	Z-Test: Mean			
2				
3			Bills	
4	Mean		1755	
5	Standard Deviation		3.94	
6	Observations		100	
7	Hypothesized Mean		1709	
8	SIGMA		3.87	
9	z Stat		1.19	
10	P(Z<=z) one-tail		0.1173	
11	z Critical one-tail		1.6449	
12	P(Z<=z) two-tail		0.2346	
13	z Critical two-tail		1.96	

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DO-IT-YOURSELF EXCEL

As was the case with the spreadsheet you created in Chapter 10, to estimate a population mean you can produce a spreadsheet that does the same for testing a population mean.

Tools: **SQRT** and **NORMSINV** are functions described on page 333.

NORMSDIST: Syntax: NORMSDIST(X) This function computes the probability that a standard normal random variable is less than the quantity in parentheses. For example,

$\text{NORMSDIST}(1.19) = P(z < 1.19)$. However, the quantity we show as **$P(Z < z)$ one-tail**, which is computed by both Data Analysis and Data Analysis Plus is actually calculated in the following way. Find the probability to the left of the ***z Stat*** and the probability to its right. **$P(Z < z)$ one-tail** is the smaller of the two probabilities. **$P(Z < z)$ two-tail** is twice **$P(Z < z)$ one-tail**. For more details, we suggest you read the Keller's website Appendix Converting Excel's Probabilities to *p*-Values.

MINITAB**One-Sample Z: Bills**

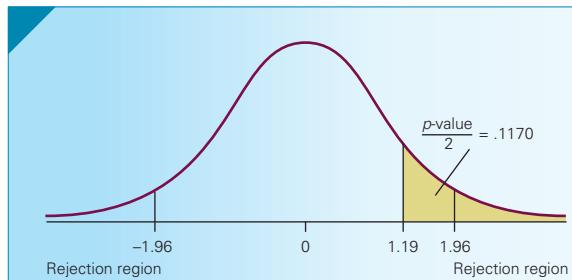
Test of mu = 17.09 vs not = 17.09
The assumed standard deviation = 3.87

Variable	N	Mean	StDev	SE Mean	95% CI	Z	P
Bills	100	17.5499	3.9382	0.3870	(16.7914, 18.3084)	1.19	0.235

INTERPRET

There is not enough evidence to infer that the mean long-distance bill is different from AT&T's mean of \$17.09. Figure 11.8 depicts the sampling distribution for this example.

FIGURE 11.8 Sampling Distribution for Example 11.2



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11-2j When Do We Conduct One- and Two-Tail Tests?

A two-tail test is conducted whenever the alternative hypothesis specifies that the mean is *not equal* to the value stated in the null hypothesis—that is, when the hypotheses assume the following form:

$$H_0: \mu = \mu_0$$

$$H_1: \mu \neq \mu_0$$

There are two one-tail tests. We conduct a one-tail test that focuses on the right tail of the sampling distribution whenever we want to know whether there is enough evidence to infer that the mean is greater than the quantity specified by the null hypothesis—that is, when the hypotheses are

$$H_0: \mu = \mu_0$$

$$H_1: \mu > \mu_0$$

The second one-tail test involves the left tail of the sampling distribution. It is used when the statistician wants to determine whether there is enough evidence to infer that the mean is less than the value of the mean stated in the null hypothesis. The resulting hypotheses appear in this form:

$$H_0: \mu = \mu_0$$

$$H_1: \mu < \mu_0$$

The techniques introduced in Chapters 12, 13, 16, 17, 18, and 19 require you to decide which of the three forms of the test to employ. Make your decision in the same way as we described the process.

11-2k Testing Hypotheses and Confidence Interval Estimators

As you've seen, the test statistic and the confidence interval estimator are both derived from the sampling distribution. It shouldn't be a surprise then that we can use the confidence interval estimator to test hypotheses. To illustrate, consider Example 11.2. The 95% confidence interval estimate of the population mean is

$$\bar{x} \pm z_{\alpha/2} \frac{\sigma}{\sqrt{n}} = 17.55 \pm 1.96 \frac{3.87}{\sqrt{100}} = 17.55 \pm .76$$

LCL = 16.79 and UCL = 18.31

We estimate that μ lies between 16.79 and 18.31. Because this interval includes 17.09, we cannot conclude that there is sufficient evidence to infer that the population mean differs from 17.09.

In Example 11.1, the 95% confidence interval estimate is LCL = 171.63 and UCL = 184.37. The interval estimate excludes 170, allowing us to conclude that the population mean account is not equal to \$170.

As you can see, the confidence interval estimator can be used to conduct tests of hypotheses. This process is equivalent to the rejection region approach. However, instead of finding the critical values of the rejection region and determining whether the test statistic falls into the rejection region, we compute the interval estimate and determine whether the hypothesized value of the mean falls into the interval.

Using the interval estimator to test hypotheses has the advantage of simplicity. Apparently, we don't need the formula for the test statistic; we need only the interval estimator. However, there are two serious drawbacks.

First, when conducting a one-tail test, our conclusion may not answer the original question. In Example 11.1, we wanted to know whether there was enough evidence to infer that the mean is *greater than* 170. The estimate concludes that the mean *differs from* 170. You may be tempted to say that because the entire interval is greater than 170, there is enough statistical evidence to infer that the population mean is greater than 170. However, in attempting to draw this conclusion, we run into the problem of determining the procedure's significance level. Is it 5% or is it 2.5%? We may be able to overcome this problem through the use of **one-sided confidence interval estimators**. However, if the purpose of using confidence interval estimators instead of test statistics is simplicity, one-sided estimators are a contradiction.

Second, the confidence interval estimator does not yield a *p*-value, which we have argued is the better way to draw inferences about a parameter. Using the confidence interval estimator to test hypotheses forces the decision maker into making a reject-don't reject decision rather than providing information about how much statistical evidence exists to be judged with other factors in the decision process. Furthermore, we only postpone the point in time when a test of hypothesis must be used. In later chapters, we will present problems where only a test produces the information we need to make decisions.

11-2l Developing an Understanding of Statistical Concepts 1

As is the case with the confidence interval estimator, the test of hypothesis is based on the sampling distribution of the sample statistic. The result of a test of hypothesis is a probability statement about the sample statistic. We assume that the population mean is

specified by the null hypothesis. We then compute the test statistic and determine how likely it is to observe this large (or small) a value when the null hypothesis is true. If the probability is small, we conclude that the assumption that the null hypothesis is true is unfounded and we reject it.

11-2m Developing an Understanding of Statistical Concepts 2

When we (or the computer) calculate the value of the test statistic

$$z = \frac{\bar{x} - \mu}{\sigma/\sqrt{n}}$$

we're also measuring the difference between the sample statistic \bar{x} and the hypothesized value of the parameter μ in terms of the standard error σ/\sqrt{n} . In Example 11.2, we found that the value of the test statistic was $z = 1.19$. This means that the sample mean was 1.19 standard errors above the hypothesized value of μ . The standard normal probability table told us that this value is not considered unlikely. As a result, we did not reject the null hypothesis.

The concept of measuring the difference between the sample statistic and the hypothesized value of the parameter in terms of the standard errors is one that will be used throughout this book.



EXERCISES

Developing an Understanding of Statistical Concepts

In Exercises 11.7–11.12, calculate the value of the test statistic, set up the rejection region, determine the p -value, interpret the result, and draw the sampling distribution.

11.7 $H_0: \mu = 1000$

$H_1: \mu \neq 1000$

$\sigma = 200, n = 100, \bar{x} = 980, \alpha = .01$

11.8 $H_0: \mu = 50$

$H_1: \mu > 50$

$\sigma = 5, n = 9, \bar{x} = 51, \alpha = .03$

11.9 $H_0: \mu = 15$

$H_1: \mu < 15$

$\sigma = 2, n = 25, \bar{x} = 14.3, \alpha = .10$

11.10 $H_0: \mu = 100$

$H_1: \mu \neq 100$

$\sigma = 10, n = 100, \bar{x} = 100, \alpha = .05$

11.11 $H_0: \mu = 70$

$H_1: \mu > 70$

$\sigma = 20, n = 100, \bar{x} = 80, \alpha = .01$

11.12 $H_0: \mu = 50$

$H_1: \mu < 50$

$\sigma = 15, n = 100, \bar{x} = 48, \alpha = .05$

Exercises 11.13 to 11.27 are “what-if analyses” designed to determine what happens to the test statistic and p -value when the sample size, standard deviation, and sample mean change. These problems can be solved manually, using the spreadsheet you created in this section, or by using Minitab.

- 11.13** a. Compute the p -value in order to test the following hypotheses given that $\bar{x} = 52$, $n = 9$, and $\sigma = 5$.

$H_0: \mu = 50$

$H_1: \mu > 50$

- b. Repeat part (a) with $n = 25$.

- c. Repeat part (a) with $n = 100$.

- d. Describe what happens to the value of the test statistic and its p -value when the sample size increases.

- 11.14** a. A statistics practitioner formulated the following hypotheses.

$H_0: \mu = 200$

$H_1: \mu < 200$

and learned that $\bar{x} = 190$, $n = 9$, and $\sigma = 50$

Compute the p -value of the test.

- b. Repeat part (a) with $\sigma = 30$.

- c. Repeat part (a) with $\sigma = 10$.

- d. Discuss what happens to the value of the test statistic and its p -value when the standard deviation decreases.

- 11.15** a. Given the following hypotheses, determine the p -value when $\bar{x} = 21$, $n = 25$, and $\sigma = 5$.

$$\begin{aligned}H_0: \mu &= 20 \\H_1: \mu &\neq 20\end{aligned}$$

- b. Repeat part (a) with $\bar{x} = 22$.
 c. Repeat part (a) with $\bar{x} = 23$.
 d. Describe what happens to the value of the test statistic and its p -value when the value of \bar{x} increases.
- 11.16** a. Test these hypotheses by calculating the p -value given that $\bar{x} = 99$, $n = 100$, and $\sigma = 8$

$$\begin{aligned}H_0: \mu &= 100 \\H_1: \mu &\neq 100\end{aligned}$$

- b. Repeat part (a) with $n = 50$.
 c. Repeat part (a) with $n = 20$.
 d. What is the effect on the value of the test statistic and the p -value of the test when the sample size decreases?

- 11.17** a. Find the p -value of the following test given that $\bar{x} = 990$, $n = 100$, and $\sigma = 25$.

$$\begin{aligned}H_0: \mu &= 1000 \\H_1: \mu &< 1000\end{aligned}$$

- b. Repeat part (a) with $\sigma = 50$.
 c. Repeat part (a) with $\sigma = 100$.
 d. Describe what happens to the value of the test statistic and its p -value when the standard deviation increases.

- 11.18** a. Calculate the p -value of the test described here.

$$\begin{aligned}H_0: \mu &= 60 \\H_1: \mu &> 60 \\ \bar{x} &= 72, n = 25, \sigma = 20\end{aligned}$$

- b. Repeat part (a) with $\bar{x} = 68$.
 c. Repeat part (a) with $\bar{x} = 64$.
 d. Describe the effect on the test statistic and the p -value of the test when the value of \bar{x} decreases.

- 11.19** Redo Example 11.1 with

- a. $n = 200$
 b. $n = 100$
 c. Describe the effect on the test statistic and the p -value when n increases.

- 11.20** Redo Example 11.1 with

- a. $\sigma = 35$
 b. $\sigma = 100$
 c. Describe the effect on the test statistic and the p -value when σ increases.

- 11.21** Perform a what-if analysis to calculate the p -values in Table 11.2.

- 11.22** Redo the SSA example with

- a. $n = 100$
 b. $n = 500$
 c. What is the effect on the test statistic and the p -value when n increases?

- 11.23** Redo the SSA example with

- a. $\sigma = 3$
 b. $\sigma = 12$
 c. Discuss the effect on the test statistic and the p -value when σ increases.

- 11.24** For the SSA example, create a table that shows the effect on the test statistic and the p -value of decreasing the value of the sample mean. Use $\bar{x} = 22.0, 21.8, 21.6, 21.4, 21.2, 21.0, 20.8, 20.6$, and 20.4 .

- 11.25** Redo Example 11.2 with

- a. $n = 50$
 b. $n = 400$
 c. Briefly describe the effect on the test statistic and the p -value when n increases.

- 11.26** Redo Example 11.2 with

- a. $\sigma = 2$
 b. $\sigma = 10$
 c. What happens to the test statistic and the p -value when σ increases?

- 11.27** Refer to Example 11.2. Create a table that shows the effect on the test statistic and the p -value of changing the value of the sample mean. Use $\bar{x} = 15.0, 15.5, 16.0, 16.5, 17.0, 17.5, 18.0, 18.5$, and 19.0 .

Applications

The following exercises may be answered manually or with the assistance of a computer. The files containing the data are given.

- 11.28** **Xr11-28** A business student claims that, on average, an MBA student is required to prepare more than five cases per week. To examine the claim, a statistics professor asks a random sample of 10 MBA students to report the number of cases they prepare weekly. The results are exhibited here. Can the professor conclude at the 5% significance level that the claim is true, assuming that the number of cases is normally distributed with a standard deviation of 1.5?

2 7 4 8 9 5 11 3 7 4

- 11.29** **Xr11-29** A random sample of 18 young adult men (20–30 years old) was sampled. Each person was asked how many minutes of sports he watched on television daily. The responses are listed here. It is known that $\sigma = 10$. Test to determine at the 5% significance level whether there is enough statistical evidence to infer

that the mean amount of television watched daily by all young adult men is greater than 50 minutes.

50	48	65	74	66	37	45	68	64
65	58	55	52	63	59	57	74	65

- 11.30** **Xr11-30** The club professional at a difficult public course boasts that his course is so tough that the average golfer loses a dozen or more golf balls during a round of golf. A dubious golfer sets out to show that the pro is fibbing. He asks a random sample of 15 golfers who just completed their rounds to report the number of golf balls each lost. Assuming that the number of golf balls lost is normally distributed with a standard deviation of 3, can we infer at the 10% significance level that the average number of golf balls lost is less than 12?

1	14	8	15	17	10	12	6
14	21	15	9	11	4	8	

- 11.31** **Xr11-31** A random sample of 12 second-year university students enrolled in a business statistics course was drawn. At the course's completion, each student was asked how many hours he or she spent doing homework in statistics. The data are listed here. It is known that the population standard deviation is $\sigma = 8.0$. The instructor has recommended that students devote 3 hours per week for the duration of the 12-week semester, for a total of 36 hours. Test to determine whether there is evidence that the average student spent less than the recommended amount of time. Compute the p -value of the test.

31	40	26	30	36	38	29	40	38	30	35	38
----	----	----	----	----	----	----	----	----	----	----	----

- 11.32** **Xr11-32** The owner of a public golf course is concerned about slow play, which clogs the course and results in selling fewer rounds. She believes the problem lies in the amount of time taken to sink putts on the green. To investigate the problem, she randomly samples 10 foursomes and measures the amount of time they spend on the 18th green. The data are listed here. Assuming that the times are normally distributed with a standard deviation of 2 minutes, test to determine whether the owner can infer at the 5% significance level that the mean amount of time spent putting on the 18th green is greater than 6 minutes.

8	11	5	6	7	8	6	4	8	3
---	----	---	---	---	---	---	---	---	---

- 11.33** **Xr11-33** A machine that produces ball bearings is set so that the average diameter is .50 inch. A sample of 10 ball bearings was measured, with the results shown here. Assuming that the standard deviation

is .05 inch, can we conclude at the 5% significance level that the mean diameter is not .50 inch?

.48	.50	.49	.52	.53	.48	.49	.47	.46	.51
-----	-----	-----	-----	-----	-----	-----	-----	-----	-----

- 11.34** **Xr11-34** Spam e-mail has become a serious and costly nuisance. An office manager believes that the average amount of time spent by office workers reading and deleting spam exceeds 25 minutes per day. To test this belief, he takes a random sample of 18 workers and measures the amount of time each spends reading and deleting spam. The results are listed here. If the population of times is normal with a standard deviation of 12 minutes, can the manager infer at the 1% significance level that he is correct?

35	48	29	44	17	21	32	28	34
23	13	9	11	30	42	37	43	48

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.

- 11.35** **Xr11-35** A manufacturer of lightbulbs advertises that, on average, its long-life bulb will last more than 5,000 hours. To test the claim, a statistician took a random sample of 100 bulbs and measured the amount of time until each bulb burned out. If we assume that the lifetime of this type of bulb has a standard deviation of 400 hours, can we conclude at the 5% significance level that the claim is true?

- 11.36** **Xr11-36** In the midst of labor-management negotiations, the president of a company argues that the company's blue-collar workers, who are paid an average of \$30,000 per year, are well paid because the mean annual income of all blue-collar workers in the country is less than \$30,000. That figure is disputed by the union, which does not believe that the mean blue-collar income is less than \$30,000. To test the company president's belief, an arbitrator draws a random sample of 350 blue-collar workers from across the country and asks each to report his or her annual income. If the arbitrator assumes that the blue-collar incomes are normally distributed with a standard deviation of \$8,000, can it be inferred at the 5% significance level that the company president is correct?

- 11.37** **Xr11-37** A dean of a business school claims that the Graduate Management Admission Test (GMAT) scores of applicants to the school's MBA program have increased during the past 5 years. Five years ago, the mean and standard deviation of GMAT scores of MBA applicants were 560 and 50, respectively. Twenty applications for this year's program were randomly selected and the GMAT scores recorded. If we assume that the distribution of

GMAT scores of this year's applicants is the same as that of 5 years ago, with the possible exception of the mean, can we conclude at the 5% significance level that the dean's claim is true?

- 11.38** **Xr11-38** Past experience indicates that the monthly long-distance telephone bill is normally distributed with a mean of \$17.85 and a standard deviation of \$3.87. After an advertising campaign aimed at increasing long-distance telephone usage, a random sample of 25 household bills was taken.
- Do the data allow us to infer at the 10% significance level that the campaign was successful?
 - What assumption must you make to answer part (a)?
- 11.39** **Xr11-39** In an attempt to reduce the number of person-hours lost as a result of industrial accidents, a large production plant installed new safety equipment. In a test of the effectiveness of the equipment, a random sample of 50 departments was chosen. The number of person-hours lost in the month before and the month after the installation of the safety equipment was recorded. The percentage change was calculated and recorded. Assume that the population standard deviation is $\sigma = 6$. Can we infer at the 10% significance level that the new safety equipment is effective?
- 11.40** **Xr11-40** A highway patrol officer believes that the average speed of cars traveling over a certain stretch of highway exceeds the posted limit of 55 mph. The speeds of a random sample of 200 cars were recorded. Do these data provide sufficient evidence at the 1% significance level to support the officer's belief? What is the p -value of the test? (Assume that the standard deviation is known to be 5.)
- 11.41** **Xr11-41** An automotive expert claims that the large number of self-serve gasoline stations has resulted in poor automobile maintenance, and that the average tire pressure is more than 4 pounds per square inch (psi) below its manufacturer's specification. As a quick test, 50 tires are examined, and the number of psi each tire is below specification is recorded. If we assume that tire pressure is normally distributed with $\sigma = 1.5$ psi, can we infer at the 10% significance level that the expert is correct? What is the p -value?
- 11.42** **Xr11-42** For the past few years, the number of customers of a drive-up bank in New York has averaged 20 per hour, with a standard deviation of 3 per hour. This year, another bank 1 mile away opened a drive-up window. The manager of the first bank believes that this will result in a decrease in the number of customers. The number of customers who arrived during 36 randomly selected hours was recorded. Can we conclude at the 5% significance level that the manager is correct?

11.43 **Xr11-43** A fast-food franchiser is considering building a restaurant at a certain location. Based on financial analyses, a site is acceptable only if the number of pedestrians passing the location averages more than 100 per hour. The number of pedestrians observed for each of 40 hours was recorded. Assuming that the population standard deviation is known to be 16, can we conclude at the 1% significance level that the site is acceptable?

11.44 **Xr11-44** Many Alpine ski centers base their projections of revenues and profits on the assumption that the average Alpine skier skis four times per year. To investigate the validity of this assumption, a random sample of 63 skiers is drawn and each is asked to report the number of times he or she skied the previous year. If we assume that the standard deviation is 2, can we infer at the 10% significance level that the assumption is wrong?

11.45 **Xr11-45** The golf professional at a private course claims that members who have taken lessons from him lowered their handicap by more than five strokes. The club manager decides to test the claim by randomly sampling 25 members who have had lessons and asking each to report the reduction in handicap, where a negative number indicates an increase in the handicap. Assuming that the reduction in handicap is approximately normally distributed with a standard deviation of two strokes, test the golf professional's claim using a 10% significance level.

11.46 **Xr11-46** The current no-smoking regulations in office buildings require workers who smoke to take breaks and leave the building in order to satisfy their habits. A study indicates that such workers average 32 minutes per day taking smoking breaks. The standard deviation is 8 minutes. To help reduce the average break, rooms with powerful exhausts were installed in the buildings. To see whether these rooms serve their designed purpose, a random sample of 110 smokers was taken. The total amount of time away from their desks was measured for 1 day. Test to determine whether there has been a decrease in the mean time away from their desks. Compute the p -value and interpret it relative to the costs of Type I and Type II errors.

11.47 **Xr11-47** A low-handicap golfer who uses Titleist brand golf balls observed that his average drive is 230 yards and the standard deviation is 10 yards. Nike has just introduced a new ball, which has been endorsed by Tiger Woods. Nike claims that the ball will travel farther than Titleist. To test the claim, the golfer hits 100 drives with a Nike ball and measures the distances. Conduct a test to determine whether Nike is correct. Use a 5% significance level.

11-3 / CALCULATING THE PROBABILITY OF A TYPE II ERROR

To properly interpret the results of a test of hypothesis, you must be able to specify an appropriate significance level or to judge the p -value of a test. However, you also must understand the relationship between Type I and Type II errors. In this section, we describe how the probability of a Type II error is computed and interpreted.

Recall Example 11.1, where we conducted the test using the sample mean as the test statistic and we computed the rejection region (with $\alpha = .05$) as

$$\bar{x} > 175.34$$

A Type II error occurs when a false null hypothesis is not rejected. In Example 11.1, if \bar{x} is less than 175.34, we will not reject the null hypothesis. If we do not reject the null hypothesis, we will not install the new billing system. Thus, the consequence of a Type II error in this example is that we will not install the new system when it would be cost-effective. The probability of this occurring is the probability of a Type II error. It is defined as

$$\beta = P(\bar{X} < 175.34, \text{ given that the null hypothesis is false})$$

The condition that the null hypothesis is false tells us only that the mean is not equal to 170. If we want to compute β , we need to specify a value for μ . Suppose that when the mean account is at least \$180, the new billing system's savings become so attractive that the manager would hate to make the mistake of not installing the system. As a result, she would like to determine the probability of not installing the new system when it would produce large cost savings. Because calculating probability from an approximately normal sampling distribution requires a value of μ (as well as σ and n), we will calculate the probability of not installing the new system when μ is *equal* to 180:

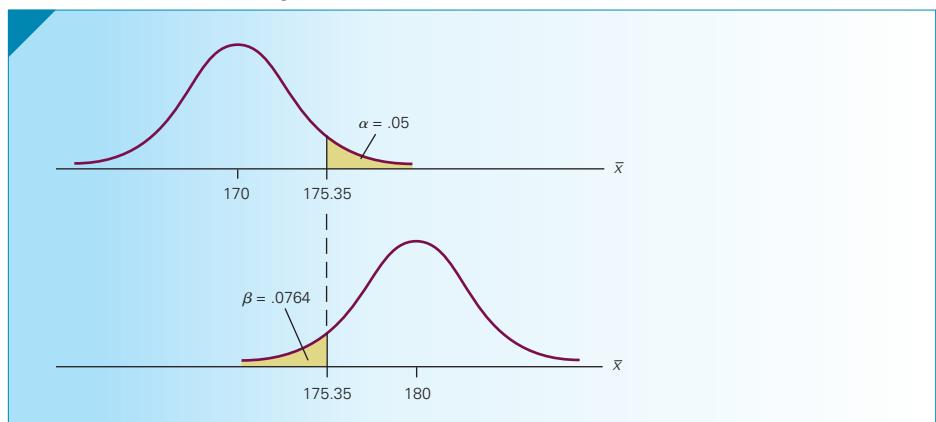
$$\beta = P(\bar{X} < 175.34, \text{ given that } \mu = 180)$$

We know that \bar{x} is approximately normally distributed with mean μ and standard deviation σ/\sqrt{n} . To proceed, we standardize \bar{x} and use the standard normal table (Table 3 in Appendix B):

$$\beta = P\left(\frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < \frac{175.34 - 180}{65/\sqrt{400}}\right) = P(Z < -1.43) = .0764$$

This tells us that when the mean account is actually \$180, the probability of incorrectly not rejecting the null hypothesis is .0764. Figure 11.9 graphically depicts

FIGURE 11.9 Calculating β for $\mu = 180$, $\alpha = .05$, and $n = 400$



how the calculation was performed. Notice that to calculate the probability of a Type II error, we had to express the rejection region in terms of the unstandardized test statistic \bar{x} , and we had to specify a value for μ other than the one shown in the null hypothesis. In this illustration, the value of μ used was based on a financial analysis indicating that when μ is at least \$180 the cost savings would be very attractive.

11-3a Effect on β of Changing α

Suppose that in the previous illustration we had used a significance level of 1% instead of 5%. The rejection region expressed in terms of the standardized test statistic would be

$$z > z_{.01} = 2.33$$

or

$$\frac{\bar{x} - 170}{65/\sqrt{400}} > 2.33$$

Solving for \bar{x} , we find the rejection region in terms of the unstandardized test statistic:

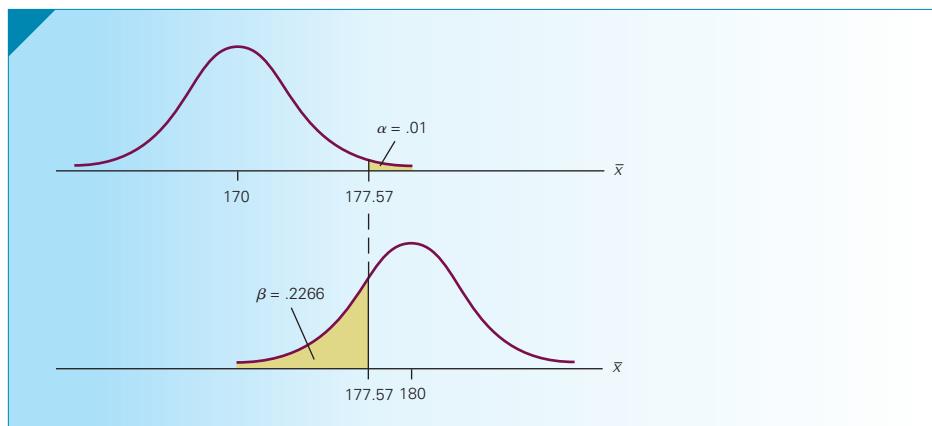
$$\bar{x} > 177.57$$

The probability of a Type II error when $\mu = 180$ is

$$\beta = P\left(\frac{\bar{x} - \mu}{\sigma/\sqrt{n}} < \frac{177.57 - 180}{65/\sqrt{400}}\right) = P(Z < - .75) = .2266$$

Figure 11.10 depicts this calculation. Compare this figure with Figure 11.9. As you can see, by decreasing the significance level from 5% to 1%, we have shifted the critical value of the rejection region to the right and thus enlarged the area where the null hypothesis is not rejected. The probability of a Type II error increases from .0764 to .2266.

FIGURE 11.10 Calculating β for $\mu = 180$, $\alpha = .01$, and $n = 400$



This calculation illustrates the inverse relationship between the probabilities of Type I and Type II errors alluded to in Section 11-1. It is important to understand this relationship. From a practical point of view, it tells us that if you want to decrease the probability of a Type I error (by specifying a small value of α), you increase the probability of a Type II error. In applications where the cost of a Type I error is considerably larger than the cost of a Type II error, this is appropriate. In fact, a significance level of 1% or less is probably justified. However, when the cost of a Type II error is relatively large, a significance level of 5% or more may be appropriate.

Unfortunately, there is no simple formula to determine what the significance level should be. The manager must consider the costs of both mistakes in deciding what to do. Judgment and knowledge of the factors in the decision are crucial.

11-3b Judging the Test

There is another important concept to be derived from this section. A statistical test of hypothesis is effectively defined by the significance level and the sample size, both of which are selected by the statistics practitioner. We can judge how well the test functions by calculating the probability of a Type II error at some value of the parameter. To illustrate, in Example 11.1 the manager chose a sample size of 400 and a 5% significance level on which to base her decision. With those selections, we found β to be .0764 when the actual mean is 180. If we believe that the cost of a Type II error is high and thus that the probability is too large, we have two ways to reduce the probability. We can increase the value of α ; however, this would result in an increase in the chance of making a Type I error, which is very costly.

Alternatively, we can increase the sample size. Suppose that the manager chose a sample size of 1,000. We'll now recalculate β with $n = 1000$ (and $\alpha = .05$). The rejection region is

$$z > z_{.05} = 1.645$$

or

$$\frac{\bar{x} - 170}{65/\sqrt{1000}} > 1.645$$

which yields

$$\bar{x} > 173.38$$

The probability of a Type II error is

$$\beta = P\left(\frac{\bar{X} - \mu}{\sigma/\sqrt{n}} < \frac{173.38 - 180}{65/\sqrt{1000}}\right) = P(Z < -3.22) = 0 \text{ (approximately)}$$

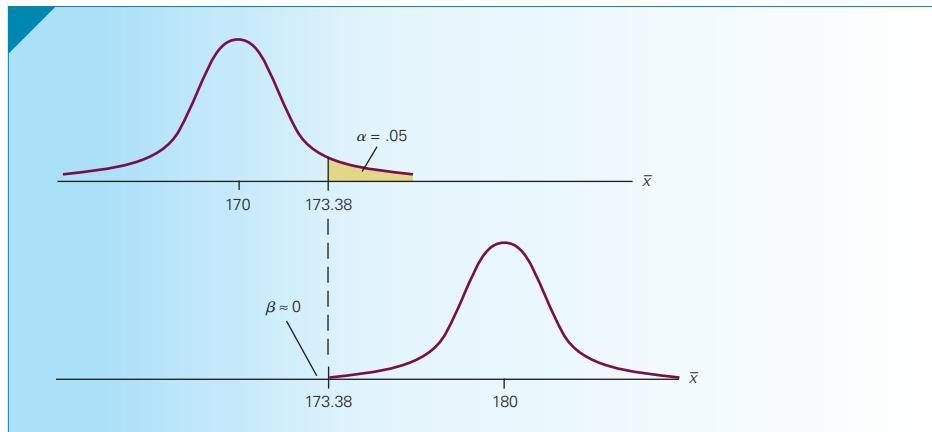
In this case, we maintained the same value of $\alpha(.05)$, but we reduced the probability of not installing the system when the actual mean account is \$180 to virtually 0.

11-3c Developing an Understanding of Statistical Concepts: Larger Sample Size Equals More Information Equals Better Decisions

Figure 11.11 displays the previous calculation. When compared with Figure 11.9, we can see that the sampling distribution of the mean is narrower because the standard

error of the mean σ/\sqrt{n} becomes smaller as n increases. Narrower distributions represent more information. The increased information is reflected in a smaller probability of a Type II error.

FIGURE 11.11 Calculating β for $\mu = 180$, $\alpha = .05$, and $n = 1,000$



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The calculation of the probability of a Type II error for $n = 400$ and for $n = 1,000$ illustrates a concept whose importance cannot be overstated. By increasing the sample size, we reduce the probability of a Type II error. By reducing the probability of a Type II error, we make this type of error less frequently. Hence, larger sample sizes allow us to make better decisions in the long run. This finding lies at the heart of applied statistical analysis and reinforces the book's first sentence: "Statistics is a way to get information from data."

Throughout this book we introduce a variety of applications in accounting, finance, marketing, operations management, human resources management, and economics. In all such applications, the statistics practitioner must make a decision, which involves converting data into information. The more information, the better the decision. Without such information, decisions must be based on guesswork, instinct, and luck. W. Edwards Deming, a famous statistician, said it best: "Without data you're just another person with an opinion."

11-3d Power of a Test

Another way of expressing how well a test performs is to report its *power*: the probability of its leading us to reject the null hypothesis when it is false. Thus, the power of a test is $1 - \beta$.

When more than one test can be performed in a given situation, we would naturally prefer to use the test that is correct more frequently. If (given the same alternative hypothesis, sample size, and significance level) one test has a higher power than a second test, the first test is said to be more powerful.

Using the Computer

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DO-IT-YOURSELF EXCEL

You will need to create three spreadsheets, one for a left-tail, one for a right-tail, and one for a two-tail test.

Here is our spreadsheet for the right-tail test for Example 11.1.

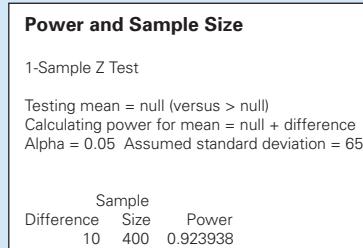
	A	B	C	D
1	Right-tail Test			
2				
3	H0: MU	170	Critical value	175.35
4	SIGMA	65	Prob(Type II error)	0.0761
5	Sample size	400	Power of the test	0.9239
6	ALPHA	0.05		
7	H1: MU	180		

Tools: **NORMSINV:** Use this function to help compute the critical value in Cell D3.

NORMSDIST: This function is needed to calculate the probability in cell D4.

MINITAB

Minitab computes the power of the test.



INSTRUCTIONS

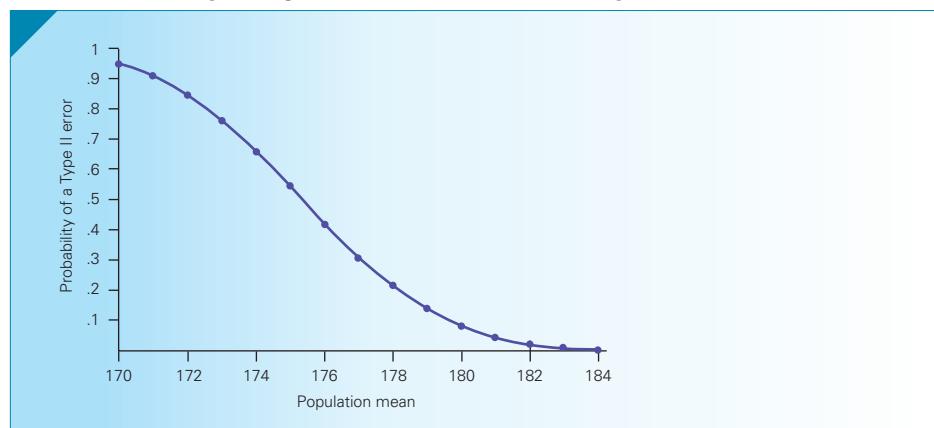
1. Click Stat, Power and Sample Size, and 1-Sample Z . . .
2. Specify the sample size in the **Sample sizes** box. (You can specify more than one value of n . Minitab will compute the power for each value.) Type the difference between the actual value of μ and the value of μ under the null hypothesis. (You can specify more than one value.) Type the value of the standard deviation in the **Standard deviation** box.
3. Click Options . . . and specify the **Alternative Hypothesis** and the **Significance level**.

For Example 11.1, we typed **400** to select the **Sample sizes**, the **Differences** was **10** ($= 180 - 170$), **Standard deviation** was **65**, the **Alternative Hypothesis** was **Greater than**, and the **Significance level** was **0.05**.

11-3e Operating Characteristic Curve

To compute the probability of a Type II error, we must specify the significance level, the sample size, and an alternative value of the population mean. One way to keep track of all these components is to draw the **operating characteristic (OC) curve**, which plots the values of β versus the values of μ . Because of the time-consuming nature of these calculations, the computer is a virtual necessity. To illustrate, we'll draw the OC curve for Example 11.1. We used Excel (we could have used Minitab instead) to compute the probability of a Type II error in Example 11.1 for $\mu = 170, 171, \dots, 185$, with $n = 400$. Figure 11.12 depicts this curve. Notice as the alternative value of μ increases the value of β decreases. This tells us that as the alternative value of μ moves farther from the value of μ under the null hypothesis, the probability of a Type II error decreases. In other words, it becomes easier to distinguish between $\mu = 170$ and other values of μ when μ is farther from 170. Note that when $\mu = 170$ (the hypothesized value of μ), $\beta = 1 - \alpha$.

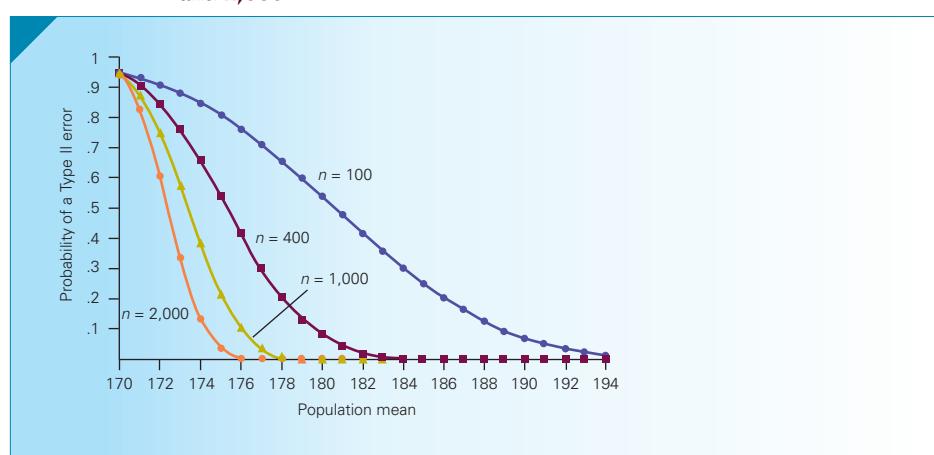
FIGURE 11.12 Operating Characteristic Curve for Example 11.1



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The OC curve can also be useful in selecting a sample size. Figure 11.13 shows the OC curve for Example 11.1 with $n = 100, 400, 1,000$, and $2,000$. An examination of this chart sheds some light concerning the effect increasing the sample size has on how well the test performs at different values of μ . For example, we can see that smaller

FIGURE 11.13 Operating Characteristic Curve for Example 11.1 for $n = 100, 400, 1,000$, and $2,000$



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sample sizes will work well to distinguish between 170 and values of μ larger than 180. However, to distinguish between 170 and smaller values of μ requires larger sample sizes. Although the information is imprecise, it does allow us to select a sample size that is suitable for our purposes.

11-3f Determining the Alternative Hypothesis to Define Type I and Type II Errors

We've already discussed how the alternative hypothesis is determined. It represents the condition we're investigating. In Example 11.1, we wanted to know whether there was sufficient statistical evidence to infer that the new billing system would be cost-effective—that is, whether the mean monthly account is greater than \$170. In this textbook, you will encounter many problems using similar phrasology. Your job will be to conduct the test that answers the question.

In real life, however, the manager (that's you 5 years from now) will be asking and answering the question. In general, you will find that the question can be posed in two ways. In Example 11.1, we asked whether there was evidence to conclude that the new system would be cost-effective. Another way of investigating the issue is to determine whether there is sufficient evidence to infer that the new system would *not* be cost-effective. We remind you of the criminal trial analogy. In a criminal trial, the burden of proof falls on the prosecution to prove that the defendant is guilty. In other countries with less emphasis on individual rights, the defendant is required to prove his or her innocence. In the United States and Canada (and in other countries), we chose the former because we consider the conviction of an innocent defendant to be the greater error. Thus, the test is set up with the null and alternative hypotheses as described in Section 11-1.

In a statistical test where we are responsible for both asking and answering a question, we must ask the question so that we directly control the error that is more costly. As you have already seen, we control the probability of a Type I error by specifying its value (the significance level). Consider Example 11.1 once again. There are two possible errors: (1) conclude that the billing system is cost-effective when it isn't and (2) conclude that the system is not cost-effective when it is. If the manager concludes that the billing plan is cost-effective, the company will install the new system. If, in reality, the system is not cost-effective, the company will incur a loss. On the other hand, if the manager concludes that the billing plan is not going to be cost-effective, the company will not install the system. However, if the system is actually cost-effective, the company will lose the potential gain from installing it. Which cost is greater?

Suppose we believe that the cost of installing a system that is not cost-effective is higher than the potential loss of not installing an effective system. The error we wish to avoid is the erroneous conclusion that the system is cost-effective. We define this as a Type I error. As a result, the burden of proof is placed on the system to deliver sufficient statistical evidence that the mean account is greater than \$170. The null and alternative hypotheses are as formulated previously:

$$\begin{aligned} H_0: \quad & \mu = 170 \\ H_1: \quad & \mu > 170 \end{aligned}$$

However, if we believe that the potential loss of not installing the new system when it would be cost-effective is the larger cost, we would place the burden of proof on the manager to infer that the mean monthly account is less than \$170. Consequently, the hypotheses would be

$$\begin{aligned} H_0: \quad & \mu = 170 \\ H_1: \quad & \mu < 170 \end{aligned}$$

This discussion emphasizes the need in practice to examine the costs of making both types of error before setting up the hypotheses. However, it is important for readers to understand that the questions posed in exercises throughout this book have already taken these costs into consideration. Accordingly, your task is to set up the hypotheses to answer the questions.



EXERCISES

Developing an Understanding of Statistical Concepts

- 11.48** Calculate the probability of a Type II error for the following test of hypothesis, given that $\mu = 203$.

$$\begin{aligned}H_0: \mu &= 200 \\H_1: \mu &\neq 200 \\\alpha &= .05, \sigma = 10, n = 100\end{aligned}$$

- 11.49** Find the probability of a Type II error for the following test of hypothesis, given that $\mu = 1,050$.

$$\begin{aligned}H_0: \mu &= 1,000 \\H_1: \mu &> 1,000 \\\alpha &= .01, \sigma = 50, n = 25\end{aligned}$$

- 11.50** Determine β for the following test of hypothesis, given that $\mu = 48$.

$$\begin{aligned}H_0: \mu &= 50 \\H_1: \mu &< 50 \\\alpha &= .05, \sigma = 10, n = 40\end{aligned}$$

- 11.51** For each of Exercises 11.48–11.50, draw the sampling distributions similar to Figure 11.9.

- 11.52** A statistics practitioner wants to test the following hypotheses with $\sigma = 20$ and $n = 100$:

$$\begin{aligned}H_0: \mu &= 100 \\H_1: \mu &> 100\end{aligned}$$

- a. Using $\alpha = .10$ find the probability of a Type II error when $\mu = 102$.
b. Repeat part (a) with $\alpha = .02$.
c. Describe the effect on β of decreasing α
- 11.53** a. Calculate the probability of a Type II error for the following hypotheses when $\mu = 37$:

$$\begin{aligned}H_0: \mu &= 40 \\H_1: \mu &< 40\end{aligned}$$

The significance level is 5%, the population standard deviation is 5, and the sample size is 25.

- b. Repeat part (a) with $\alpha = 15\%$.
c. Describe the effect on β of increasing α .

- 11.54** Draw the figures of the sampling distributions for Exercises 11.52 and 11.53.

- 11.55** a. Find the probability of a Type II error for the following test of hypothesis, given that $\mu = 196$:

$$\begin{aligned}H_0: \mu &= 200 \\H_1: \mu &< 200\end{aligned}$$

The significance level is 10%, the population standard deviation is 30, and the sample size is 25.

- b. Repeat part (a) with $n = 100$.
c. Describe the effect on β of increasing n .

- 11.56** a. Determine β for the following test of hypothesis, given that $\mu = 310$:

$$\begin{aligned}H_0: \mu &= 300 \\H_1: \mu &> 300\end{aligned}$$

The statistics practitioner knows that the population standard deviation is 50, the significance level is 5%, and the sample size is 81.

- b. Repeat part (a) with $n = 36$.
c. Describe the effect on β of decreasing n .

- 11.57** For Exercises 11.55 and 11.56, draw the sampling distributions similar to Figure 11.9.

- 11.58** For the test of hypothesis

$$\begin{aligned}H_0: \mu &= 1,000 \\H_1: \mu &\neq 1,000 \\\alpha &= .05, \sigma = 200\end{aligned}$$

draw the operating characteristic curve for $n = 25, 100$, and 200.

- 11.59** Draw the operating characteristic curve for $n = 10, 50$, and 100 for the following test:

$$\begin{aligned}H_0: \mu &= 400 \\H_1: \mu &> 400 \\\alpha &= .05, \sigma = 50\end{aligned}$$

- 11.60** Suppose that in Example 11.1 we wanted to determine whether there was sufficient evidence to conclude that the new system would *not* be cost-effective. Set up the null and alternative hypotheses and discuss the consequences of Type I and Type II errors. Conduct the test. Is your conclusion the same as the one reached in Example 11.1? Explain.

Applications

- 11.61** In Exercise 11.39, we tested to determine whether the installation of safety equipment was effective in reducing person-hours lost to industrial accidents. The null and alternative hypotheses were

$$\begin{aligned} H_0: \mu &= 0 \\ H_1: \mu &< 0 \end{aligned}$$

with $\sigma = 6$, $\alpha = .10$, $n = 50$, and μ = the mean percentage change. The test failed to indicate that the new safety equipment is effective. The manager is concerned that the test was not sensitive enough to detect small but important changes. In particular, he worries that if the true reduction in time lost to accidents is actually 2% (i.e., $\mu = -2$), then the firm may miss the opportunity to install very effective equipment. Find the probability that the test with $\sigma = 6$, $\alpha = .10$, and $n = 50$ will fail to conclude that such equipment is effective. Discuss ways to decrease this probability.

- 11.62** The test of hypothesis in the SSA example concluded that there was not enough evidence to infer that the plan would be profitable. The company would hate to not institute the plan if the actual reduction was as little as 3 days (i.e., $\mu = 21$). Calculate the relevant probability and describe how the company should use this information.

- 11.63** The fast-food franchiser in Exercise 11.43 was unable to provide enough evidence that the site is acceptable. She is concerned that she may be missing an opportunity to locate the restaurant in a profitable location. She feels that if the actual mean is 104, the restaurant is likely to be very successful. Determine the probability of a Type II error when the mean is 104. Suggest ways to improve this probability.

- 11.64** Refer to Exercise 11.46. A financial analyst has determined that a 2-minute reduction in the average break would increase productivity. As a result the company would hate to lose this opportunity. Calculate the probability of erroneously concluding

that the renovation would not be successful when the average break is 30 minutes. If this probability is high, describe how it can be reduced.

- 11.65** A school-board administrator believes that the average number of days absent per year among students is less than 10 days. From past experience, he knows that the population standard deviation is 3 days. In testing to determine whether his belief is true, he could use one of the following plans:

- i. $n = 100$, $\alpha = .01$
- ii. $n = 75$, $\alpha = .05$
- iii. $n = 50$, $\alpha = .10$

Which plan has the lowest probability of a Type II error, given that the true population average is 9 days?

- 11.66** The feasibility of constructing a profitable electricity-producing windmill depends on the mean velocity of the wind. For a certain type of windmill, the mean would have to exceed 20 miles per hour to warrant its construction. The determination of a site's feasibility is a two-stage process. In the first stage, readings of the wind velocity are taken and the mean is calculated. The test is designed to answer the question, "Is the site feasible?" In other words, is there sufficient evidence to conclude that the mean wind velocity exceeds 20 mph? If there is enough evidence, further testing is conducted. If there is not enough evidence, the site is removed from consideration. Discuss the consequences and potential costs of Type I and Type II errors.

- 11.67** The number of potential sites for the first-stage test in Exercise 11.66 is quite large and the readings can be expensive. Accordingly, the test is conducted with a sample of 25 observations. Because the second-stage cost is high, the significance level is set at 1%. A financial analysis of the potential profits and costs reveals that if the mean wind velocity is as high as 25 mph, the windmill would be extremely profitable. Calculate the probability that the first-stage test will not conclude that the site is feasible when the actual mean wind velocity is 25 mph. (Assume that σ is 8.) Discuss how the process can be improved.

11-4 / THE ROAD AHEAD

We had two principal goals to accomplish in Chapters 10 and 11. First, we wanted to present the concepts of estimation and hypothesis testing. Second, we wanted to show how to produce confidence interval estimates and conduct tests of hypotheses. The importance of both goals should not be underestimated. Almost everything that follows this chapter will involve either estimating a parameter or testing a set of hypotheses. Consequently, Sections 10-2 and 11-2 set the pattern for the way in which statistical

techniques are applied. It is no exaggeration to state that if you understand how to produce and use confidence interval estimates and how to conduct and interpret hypothesis tests, then you are well on your way to the ultimate goal of being competent at analyzing, interpreting, and presenting data. It is fair for you to ask what more you must accomplish to achieve this goal. The answer, simply put, is much more of the same.

In the chapters that follow, we plan to present about three dozen different statistical techniques that can be (and frequently are) employed by statistics practitioners. To calculate the value of test statistics or confidence interval estimates requires nothing more than the ability to add, subtract, multiply, divide, and compute square roots. If you intend to use the computer, all you need to know are the commands. The key, then, to applying statistics is knowing which formula to calculate or which set of commands to issue. Thus, the real challenge of the subject lies in being able to define the problem and identify which statistical method is the most appropriate one to use.

Most students have some difficulty recognizing the particular kind of statistical problem they are addressing unless, of course, the problem appears among the exercises at the end of a section that just introduced the technique needed. Unfortunately, in practice, statistical problems do not appear already so identified. Consequently, we have adopted an approach to teaching statistics that is designed to help identify the statistical technique.

A number of factors determine which statistical method should be used, but two are especially important: the type of data and the purpose of the statistical inference. In Chapter 2, we pointed out that there are effectively three types of data—interval, ordinal, and nominal. Recall that nominal data represent categories such as marital status, occupation, and gender. Statistics practitioners often record nominal data by assigning numbers to the responses (e.g., 1 = Single, 2 = Married, 3 = Divorced, 4 = Widowed). Because these numbers are assigned completely arbitrarily, any calculations performed on them are meaningless. All that we can do with nominal data is count the number of times each category is observed. Ordinal data are obtained from questions whose answers represent a rating or ranking system. For example, if students are asked to rate a university professor, the responses may be excellent, good, fair, or poor. To draw inferences about such data, we convert the responses to numbers. Any numbering system is valid as long as the order of the responses is preserved. Thus “4 = Excellent, 3 = Good, 2 = Fair, 1 = Poor” is just as valid as “15 = Excellent, 8 = Good, 5 = Fair, 2 = Poor.” Because of this feature, the most appropriate statistical procedures for ordinal data are ones based on a ranking process.

Interval data are real numbers, such as those representing income, age, height, weight, and volume. Computation of means and variances is permissible.

The second key factor in determining the statistical technique is the purpose of doing the work. Every statistical method has some specific objective. We address five such objectives in this book.

11-4a Problem Objectives

- 1. Describe a population.** Our objective here is to describe some property of a population of interest. The decision about which property to describe is generally dictated by the type of data. For example, suppose the population of interest consists of all purchasers of computers. If we are interested in the purchasers' incomes (for which the data are interval), we may calculate the mean or the variance to describe that aspect of the population. But if we are interested in the brand of computer that has been bought (for which the data are nominal), all we can do is compute the proportion of the population that purchases each brand.

2. **Compare two populations.** In this case, our goal is to compare a property of one population with a corresponding property of a second population. For example, suppose the populations of interest are male and female purchasers of computers. We could compare the means of their incomes, or we could compare the proportion of each population that purchases a certain brand. Once again, the data type generally determines what kinds of properties we compare.
3. **Compare two or more populations.** We might want to compare the average income in each of several locations in order (for example) to decide where to build a new shopping center. Or we might want to compare the proportions of defective items in a number of production lines in order to determine which line is the best. In each case, the problem objective involves comparing two or more populations.
4. **Analyze the relationship between two variables.** There are numerous situations in which we want to know how one variable is related to another. Governments need to know what effect rising interest rates have on the unemployment rate. Companies want to investigate how the sizes of their advertising budgets influence sales volume. In most of the problems in this introductory text, the two variables to be analyzed will be of the same type; we will not attempt to cover the fairly large body of statistical techniques that has been developed to deal with two variables of different types.
5. **Analyze the relationship among two or more variables.** Our objective here is usually to forecast one variable (called the *dependent variable*) on the basis of several other variables (called *independent variables*). We will deal with this problem only in situations in which all variables are interval.

Table 11.3 lists the types of data and the five problem objectives. For each combination, the table specifies the chapter or section where the appropriate statistical technique is presented. For your convenience, a more detailed version of this table is reproduced inside the front cover of this book.

TABLE 11.3 Guide to Statistical Inference Showing Where Each Technique Is Introduced

PROBLEM OBJECTIVE	DATA TYPE		
	NOMINAL	ORDINAL	INTERVAL
Describe a population	Sections 12-3, 15-1	Not covered	Sections 12-1, 12-2
Compare two populations	Sections 13-5, 15-2	Sections 19-1, 19-2	Sections 13-1, 13-3, 13-4, 19-1, 19-2
Compare two or more populations	Section 15-2	Section 19-3	Chapter 14 Section 19-3
Analyze the relationship between two variables	Section 15-2	Section 19-4	Chapter 16
Analyze the relationship among two or more variables	Not covered	Not covered	Chapters 17, 18

11-4b Derivations

Because this book is about statistical applications, we assume that our readers have little interest in the mathematical derivations of the techniques described. However, it might be helpful for you to have some understanding about the process that produces the formulas.

As described previously, factors such as the problem objective and the type of data determine the parameter to be estimated and tested. For each parameter, statisticians have determined which statistic to use. That statistic has a sampling distribution that can usually be expressed as a formula. For example, in this chapter, the parameter of interest was the population mean μ , whose best estimator is the sample mean \bar{x} . Assuming that the population standard deviation σ is known, the sampling distribution of \bar{X} is normal (or approximately so) with mean μ and standard deviation σ/\sqrt{n} . The sampling distribution can be described by the formula

$$Z = \frac{\bar{X} - \mu}{\sigma/\sqrt{n}}$$

This formula also describes the test statistic for μ with σ known. With a little algebra, we were able to derive (in Section 10-2) the confidence interval estimator of μ .

In future chapters, we will repeat this process, which in several cases involves the introduction of a new sampling distribution (introduced in Chapter 8). Although its shape and formula will differ from the sampling distribution used in this chapter, the pattern will be the same. In general, the formula that expresses the sampling distribution will describe the test statistic. Then some algebraic manipulation (which we will not show) produces the interval estimator. Consequently, we will reverse the order of presentation of the two techniques. In other words, we will present the test of hypothesis first, followed by the confidence interval estimator.

CHAPTER SUMMARY

In this chapter, we introduced the concepts of hypothesis testing and applied them to testing hypotheses about a population mean. We showed how to specify the null and alternative hypotheses, set up the rejection region, compute the value of the test statistic, and, finally, to make a decision. Equally as important, we discussed

how to interpret the test results. This chapter also demonstrated another way to make decisions; by calculating and using the p -value of the test. To help interpret test results, we showed how to calculate the probability of a Type II error. Finally, we provided a road map of how we plan to present statistical techniques.

IMPORTANT TERMS:

Hypothesis testing	348	Statistically significant	355
Null hypothesis	348	p -value of a test	356
Alternative or research hypothesis	348	Highly significant	358
Type I error	348	Significant	358
Type II error	348	Not statistically significant	358
Significance level	348	One-tail test	363
Test statistic	351	Two-tail test	364
Rejection region	353	One-sided confidence interval estimator	367
Standardized test statistic	354	Operating characteristic curve	377

S Y M B O L S :

Symbol	Pronounced	Represents
H_0	H nought	Null hypothesis
H_1	H one	Alternative (research) hypothesis
α	alpha	Probability of a Type I error
β	beta	Probability of a Type II error
\bar{x}_L	X bar sub L or X bar L	Value of \bar{x} large enough to reject H_0
$ z $	Absolute z	Absolute value of z

F O R M U L A :Test statistic for μ

$$Z = \frac{\bar{x} - \mu}{\sigma/\sqrt{n}}$$

C O M P U T E R O U T P U T A N D I N S T R U C T I O N S :

Technique	Excel	Minitab
Test of μ	359	360
Probability of a Type II error (and Power)	376	376

12



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INFERENCE ABOUT A POPULATION

- 12-1 *Inference about a Population Mean When the Standard Deviation Is Unknown*
- 12-2 *Inference about a Population Variance*
- 12-3 *Inference about a Population Proportion*
- 12-4 *(Optional) Applications in Marketing: Market Segmentation*

Nielsen Ratings

DATA

Xm12-00*

Statistical techniques play a vital role in helping advertisers determine how many viewers watch the shows that they sponsor. Although several companies sample television viewers to determine what shows they watch, the best known is the A. C. Nielsen firm. The Nielsen ratings are based on a random sample of approximately 5,000 of the 115 million households in the United States with at least one television (in 2013). A meter attached to the televisions in the selected households keeps track of when the televisions are turned on and what channels they are tuned to. The data are sent to the Nielsen's computer every night from which Nielsen computes the rating and sponsors can determine the number of viewers and the potential value of any commercials. Of particular interest to advertisers are 18- to 49-year-olds, who are considered the most likely to buy advertised products. In 2013 there were 126.54 million Americans who were between 18 and 49 years old.



Jupiterimages

On page 415, we provide a solution to this problem.

The results for the 18- to 49-year-old group on Thursday, March 7, 2013, for the time slot 8:00 P.M. to 8:30 P.M. have been recorded using the following codes:

Network	Show	Code
ABC	<i>Shark Tank</i>	1
CBS	<i>Big Bang Theory</i>	2
CW	<i>The Vampire Diaries</i>	3
Fox	<i>American Idol</i>	4
NBC	<i>Community</i>	5
Television turned off or watched some other channel		6

Source: tvbythenumbers.com, March 8, 2013.

CBS would like to use the data to estimate how many Americans aged 18 to 49 were tuned to its program *Big Bang Theory*.

INTRODUCTION

In the previous two chapters, we introduced the concepts of statistical inference and showed how to estimate and test a population mean. However, the illustration we chose is unrealistic because the techniques require us to use the population standard deviation σ , which, in general, is unknown. The purpose, then, of Chapters 10 and 11 was to set the pattern for the way in which we plan to present other statistical techniques. In other words, we will begin by identifying the parameter to be estimated or tested. We will then specify the parameter's estimator (each parameter has an estimator chosen because of the characteristics we discussed at the beginning of Chapter 10) and its sampling distribution. Using simple mathematics, statisticians have derived the interval estimator and the test statistic. This pattern will be used repeatedly as we introduce new techniques.

In Section 11-4, we described the five problem objectives addressed in this book, and we laid out the order of presentation of the statistical methods. In this chapter, we will present techniques employed when the problem objective is to describe a population. When the data are interval, the parameters of interest are the population mean μ and the population variance σ^2 . In Section 12-1, we describe how to make inferences about the population mean under the more realistic assumption that the population standard deviation is unknown. In Section 12-2, we continue to deal with interval data, but our parameter of interest becomes the population variance.

In Chapter 2 and Section 11-4, we pointed out that when the data are nominal, the only computation that makes sense is determining the proportion of times each value occurs. Section 12-3 discusses inference about the proportion p . In Section 12-4, we present an important application in marketing: market segmentation.

Keller's website Appendix Applications in Accounting: Auditing describes how the statistical techniques introduced in this chapter are used in auditing.

12-1 / INFERENCE ABOUT A POPULATION MEAN WHEN THE STANDARD DEVIATION IS UNKNOWN

In Sections 10-2 and 11-2, we demonstrated how to estimate and test the population mean when the population standard deviation is known. The confidence interval estimator and the test statistic were derived from the sampling distribution of the sample mean with σ known, expressed as

$$z = \frac{\bar{x} - \mu}{\sigma/\sqrt{n}}$$

In this section, we take a more realistic approach by acknowledging that if the population mean is unknown, then so is the population standard deviation. Consequently, the previous sampling distribution cannot be used. Instead, we substitute the sample standard deviation s in place of the unknown population standard deviation σ . The result is called a ***t*-statistic** because that is what mathematician William S. Gosset called it. In 1908, Gosset showed that the *t*-statistic defined as

$$t = \frac{\bar{x} - \mu}{s/\sqrt{n}}$$

is Student *t*-distributed when the sampled population is normal. (Gosset published his findings under the pseudonym “Student,” hence the **Student *t*-distribution**.) Recall that we introduced the Student *t*-distribution in Section 8-4.

With exactly the same logic used to develop the test statistic in Section 11-2 and the confidence interval estimator in Section 10-2, we derive the following inferential methods.

Test Statistic for μ When σ Is Unknown

When the population standard deviation is unknown and the population is normal, the test statistic for testing hypotheses about μ is

$$t = \frac{\bar{x} - \mu}{s/\sqrt{n}}$$

which is Student *t*-distributed with $\nu = n - 1$ degrees of freedom.

Confidence Interval Estimator of μ When σ Is Unknown

$$\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}} \quad \nu = n - 1$$

These formulas now make obsolete the test statistic and interval estimator employed in Chapters 10 and 11 to estimate and test a population mean. Although we continue to use the concepts developed in Chapters 10 and 11 (as well as all the other chapters), we will no longer use the *z*-statistic and the *z*-estimator of μ . All future inferential problems involving a population mean will be solved using the *t*-statistic and *t*-estimator of μ shown in the preceding boxes.

EXAMPLE 12.1

DATA

Xm12-01*

Newspaper Recycling Plant

In the near future, nations will likely have to do more to save the environment. Possible actions include reducing energy use and recycling. Currently, most products manufactured from recycled material are considerably more expensive than those manufactured from material found in the earth. For example, it is approximately three times as expensive to produce glass bottles from recycled glass than from silica sand, soda ash, and

limestone, all plentiful materials mined in numerous countries. It is more expensive to manufacture aluminum cans from recycled cans than from bauxite. Newspapers are an exception. It can be profitable to recycle newspaper. A major expense is the collection from homes. In recent years, many companies have gone into the business of collecting used newspapers from households and recycling them. A financial analyst for one such company has recently computed that the firm would make a profit if the mean weekly newspaper collection from each household exceeded 2.0 pounds. In a study to determine the feasibility of a recycling plant, a random sample of 148 households was drawn from a large community, and the weekly weight of newspapers discarded for recycling for each household was recorded and listed next. Do these data provide sufficient evidence to allow the analyst to conclude that a recycling plant would be profitable?

Weights of Discarded Newspapers

2.5	0.7	3.4	1.8	1.9	2.0	1.3	1.2	2.2	0.9	2.7	2.9	1.5	1.5	2.2
3.2	0.7	2.3	3.1	1.3	4.2	3.4	1.5	2.1	1.0	2.4	1.8	0.9	1.3	2.6
3.6	0.8	3.0	2.8	3.6	3.1	2.4	3.2	4.4	4.1	1.5	1.9	3.2	1.9	1.6
3.0	3.7	1.7	3.1	2.4	3.0	1.5	3.1	2.4	2.1	2.1	2.3	0.7	0.9	2.7
1.2	2.2	1.3	3.0	3.0	2.2	1.5	2.7	0.9	2.5	3.2	3.7	1.9	2.0	3.7
2.3	0.6	0.0	1.0	1.4	0.9	2.6	2.1	3.4	0.5	4.1	2.2	3.4	3.3	0.0
2.2	4.2	1.1	2.3	3.1	1.7	2.8	2.5	1.8	1.7	0.6	3.6	1.4	2.2	2.2
1.3	1.7	3.0	0.8	1.6	1.8	1.4	3.0	1.9	2.7	0.8	3.3	2.5	1.5	2.2
2.6	3.2	1.0	3.2	1.6	3.4	1.7	2.3	2.6	1.4	3.3	1.3	2.4	2.0	
1.3	1.8	3.3	2.2	1.4	3.2	4.3	0.0	2.0	1.8	0.0	1.7	2.6	3.1	

SOLUTION:

IDENTIFY

The problem objective is to describe the population of the amounts of newspaper discarded by each household in the population. The data are interval, indicating that the parameter to be tested is the population mean. Because the financial analyst needs to determine whether the mean is greater than 2.0 pounds, the alternative hypothesis is

$$H_1: \mu > 2.0$$

As usual, the null hypothesis states that the mean is equal to the value listed in the alternative hypothesis:

$$H_0: \mu = 2.0$$

The test statistic is

$$t = \frac{\bar{x} - \mu}{s/\sqrt{n}} \quad \nu = n - 1$$

COMPUTE

MANUALLY:

The manager believes that the cost of a Type I error (concluding that the mean is greater than 2 when it isn't) is quite high. Consequently, he sets the significance level at 1%. The rejection region is

$$t > t_{\alpha, n-1} = t_{.01, 147} \approx t_{.01, 150} = 2.351$$

To calculate the value of the test statistic, we need to calculate the sample mean \bar{x} and the sample standard deviation s . From the data, we determine

$$\sum x_i = 322.7 \text{ and } \sum x_i^2 = 845.1$$

Thus,

$$\bar{x} = \frac{\sum x_i}{n} = \frac{322.7}{148} = 2.18$$

$$s^2 = \frac{\sum x_i^2 - \frac{(\sum x_i)^2}{n}}{n - 1} = \frac{845.1 - \frac{(322.7)^2}{148}}{148 - 1} = .962$$

and

$$s = \sqrt{s^2} = \sqrt{.962} = .981$$

The value of μ is to be found in the null hypothesis. It is 2.0. The value of the test statistic is

$$t = \frac{\bar{x} - \mu}{s/\sqrt{n}} = \frac{2.18 - 2.0}{.981/\sqrt{148}} = 2.23$$

Because 2.23 is not greater than 2.351, we cannot reject the null hypothesis in favor of the alternative. (Students performing the calculations manually can approximate the p -value. Keller's website Appendix Approximating the p -Value from the Student t Table describes how.)

EXCEL

	A	B	C	D
t-Test: Mean				
			Newspaper	
Mean			2.18	
Standard Deviation			0.98	
Hypothesized Mean			2	
df			147	
t Stat			2.24	
P(T<=t) one-tail			0.0134	
10 t Critical one-tail			2.3520	
11 P(T<=t) two-tail			0.0268	
12 t Critical two-tail			2.6097	

INSTRUCTIONS

1. Type or import the data into one column*. (Open Xm12-01.)
2. Click **Add-Ins, Data Analysis Plus, and t-Test: Mean**.
3. Specify the **Input Range** (**A1:A149**), the **Hypothesized Mean** (**2**), and α (**.01**).

*If there is an empty cell (representing missing data), it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

MINITAB**One-Sample T: Newspaper**Test of $\mu = 2$ vs > 2

Variable	N	Mean	St Dev	SE Mean	95% Lower Bound	T	P
Newspaper	148	2.1804	0.9812	0.0807	2.0469	2.24	0.013

INSTRUCTIONS

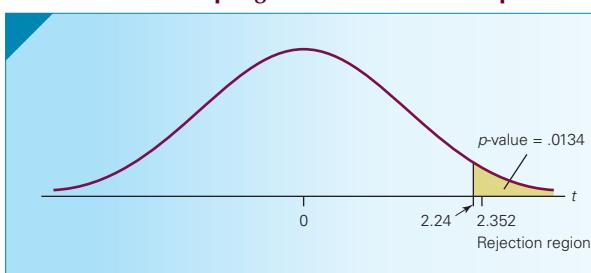
1. Type or import the data into one column. (Open Xm12-01.)
2. Click **Stat**, **Basic Statistics**, and **1-Sample t**
3. Type or use the **Select** button to specify the name of the variable or the column in the **Samples in columns** box (**Newspaper**), choose **Perform hypothesis test** and type the value of μ in the **Hypothesized mean** box (2), and click **Options**
4. Select one of **less than**, **not equal**, or **greater than** in the **Alternative** box (**greater than**).

INTERPRET

The value of the test statistic is $t = 2.24$, and its p -value is .0134. There is not enough evidence to infer that the mean weight of discarded newspapers is greater than 2.0. Note that there is some evidence: The p -value is .0134. However, because we wanted the probability of a Type I error to be small, we insisted on a 1% significance level. Thus, we cannot conclude that the recycling plant would be profitable.

Figure 12.1 exhibits the sampling distribution for this example.

FIGURE 12.1 Sampling Distribution for Example 12.1



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EXAMPLE 12.2**DATA****Xm12-02****Tax Collected from Audited Returns**

In 2010 (the latest year reported), 142,823,000 tax returns were filed in the United States. The Internal Revenue Service (IRS) examined 1.107%, or 1,581,000, of them to determine if they were correctly done. To determine how well the auditors are performing, a random sample of these returns was drawn and the additional tax was reported, which is listed next. Estimate with 95% confidence the mean additional income tax collected from the 1,581,000 files audited.

Additional Income Tax

13069.55	7773.87	6693.27	16293.73	11269.68	1599.52
6915.39	8310.68	21019.45	8625.75	9934.44	8375.89
16103.88	7897.67	10690.97	7844.23	7844.23	10824.18
1088.93	6063.57	3779.98	3483.38	10564.65	527.82
2895.24	9251.80	6725.38	7879.76	7434.50	9160.90
2365.28	9253.47	11285.80	10802.42	9033.40	11992.65
8811.64	10897.11	9191.01	14320.87	8505.35	12233.19
9876.18	2719.66	0.00	12149.66	5486.99	191.24
6811.01	6821.53	12276.66	17986.29	10377.83	8607.87
13736.62	2253.58	12228.93	17107.72	7717.48	9829.19
2324.17	14569.22	7820.71	9048.53	8500.15	12130.53
4969.44	4863.95	11639.65	14303.24	12801.99	4254.72
8440.77	10142.90	1540.58	0.00	5915.89	14102.22
15952.46	7207.52	20865.53	17197.05	7227.33	8598.93
6502.22	12728.47	4316.10	16913.57	12336.05	6983.37
19028.69	8298.02	10869.13	10460.38	12384.07	15452.72
6025.37	19269.79	15706.99	7731.24	10345.13	13577.00
17750.30	9827.53	9977.16	12469.07	8837.12	17295.55
7475.96	11112.31	4309.43	12434.39	8165.34	10436.96
11326.90	3178.42	5391.00	14913.03	10228.61	4896.92
12295.75	11393.22	14382.85	9025.67	9809.67	14203.49
7061.20	10198.69	6705.28	8743.87	8171.03	628.72
0.00	5462.37	8807.22	10359.81	4543.60	10685.24
12232.03	9736.53	16934.01	13157.66	7387.40	14358.06
8414.65	4323.51	14675.43	7327.91	12037.85	8126.13
17638.95	11831.65	8730.90	8133.98	5045.49	5276.17
7706.31	11313.89	6722.39	9821.58	14613.67	4440.67
2123.79	9254.80	10046.07	20814.39	18687.37	11392.17
8811.30	3396.21	13791.36	12901.52	10746.12	6742.86
9060.97	5817.56	8151.45	11263.38	14794.92	8508.47
2493.08	4025.66	17304.42	4989.82	12956.43	4580.93
15902.15	3685.81	11485.57	12164.60	10915.90	11788.37

Source: *Statistical Abstract of the United States*, 2012, Table 481. Adapted from U.S. Internal Revenue Service, *IRS Data Book*, annual, Publication 55B.

SOLUTION:**IDENTIFY**

The problem objective is to describe the population of additional income tax. The data are interval and hence, the parameter is the population mean μ . The question asks us to estimate this parameter. The confidence interval estimator is:

$$\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}}$$

COMPUTE**MANUALLY:**

From the data we determine:

$$\sum x_i = 1,829,247 \quad \text{and} \quad \sum x_i^2 = 21,293,389,277$$

Thus,

$$\bar{x} = \frac{\sum x_i}{n} = \frac{1,829,247}{192} = 9,527$$

and

$$s^2 = \frac{\sum x_i^2 - \frac{(\sum x_i)^2}{n}}{n-1} = \frac{21,293,389,277 - \frac{(1,829,247)^2}{192}}{192-1} = 20,238,531$$

Thus,

$$s = \sqrt{s^2} = \sqrt{20,238,531} = 4499$$

Because we want a 95% confidence interval estimate, $1 - \alpha = .95$, $\alpha = .05$, $\alpha/2 = .025$, and $t_{\alpha/2, n-1} = t_{.025, 191} \approx t_{.025, 190} = 1.973$. Thus, the 95% confidence interval estimate of μ is:

$$\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}} = 9,527 \pm 1.973 \frac{4499}{\sqrt{192}} = 9,527 \pm 641$$

or

$$\text{LCL} = \$8,886 \quad \text{UCL} = \$10,168$$

EXCEL

	A	B	C	D
1	t-Estimate: Mean			
2				
3			Taxes	
4	Mean		9527	
5	Standard Deviation		4499	
6	Observations		192	
7	Standard Error		325	
8	LCL		8887	
9	UCL		10168	

INSTRUCTIONS

1. Type or import the data into one column*. (Open Xm12-02.)
2. Click Add-Ins, Data Analysis Plus, and **t-Estimate: Mean**.
3. Specify the **Input Range** (A1:A193) and α (.05).

MINITAB

One-Sample T: Taxes					
Variable	N	Mean	St Dev	SE Mean	95% CI
Taxes	192	9527	4499	325	(8887, 10168)

INSTRUCTIONS

1. Type or import the data into one column. (Open Xm12-02.)
2. Click **Stat, Basic Statistics, and 1-Sample t** . . .

*If a cell is empty (representing missing data), it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

3. Select or type the variable name in the **Samples in columns** box (**Taxes**) and click **Options . . .**
4. Specify the **Confidence level** (.95) and **not equal** for the **Alternative**.

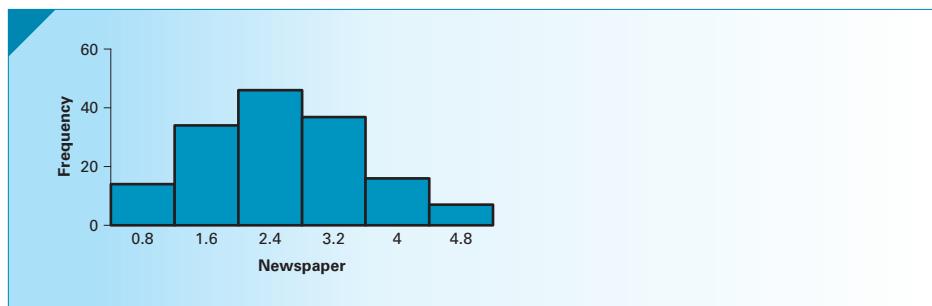
INTERPRET

We estimate that the mean additional tax collected lies between \$8,887 and \$10,168. We can use this estimate to help decide whether the IRS is auditing the individuals who should be audited.

12-1a Checking the Required Conditions

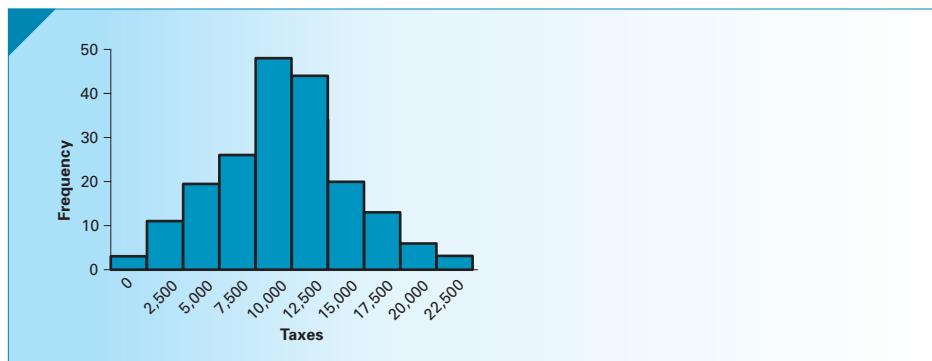
When we introduced the Student *t*-distribution, we pointed out that the *t*-statistic is Student *t*-distributed if the population from which we've sampled is normal. However, statisticians have shown that the mathematical process that derived the Student *t*-distribution is **robust**, which means that if the population is nonnormal, the results of the *t*-test and confidence interval estimate are still valid provided that the population is not *extremely* nonnormal.* To check this requirement, we draw the histogram and determine whether it is far from bell-shaped. Figures 12.2 and 12.3 depict the Excel histograms for Examples 12.1 and 12.2, respectively. (The Minitab histograms are similar.) Both histograms suggest that the variables are not extremely nonnormal, and in fact, may be normal.

FIGURE 12.2 Histogram for Example 12.1



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FIGURE 12.3 Histogram for Example 12.2



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*Statisticians have shown that when the sample size is large, the results of a *t*-test and estimator of a mean are valid even when the population is extremely nonnormal. The sample size required depends on the extent of nonnormality.

12-1b Estimating the Totals of Finite Populations

The inferential techniques introduced thus far were derived by assuming infinitely large populations. In practice, however, most populations are finite. (Infinite populations are usually the result of some endlessly repeatable process, such as flipping a coin or selecting items with replacement.) When the population is small, we must adjust the test statistic and interval estimator using the finite population correction factor introduced in Chapter 9 (page 307). (On our website Appendix Applications in Accounting: Auditing, we feature an application that requires the use of the correction factor.) However, in populations that are large relative to the sample size, we can ignore the correction factor. Large populations are defined as populations that are at least 20 times the sample size.

Finite populations allow us to use the confidence interval estimator of a mean to produce a confidence interval estimator of the population total. To estimate the total, we multiply the lower and upper confidence limits of the estimate of the mean by the population size. Thus, the confidence interval estimator of the total is:

$$N \left[\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}} \right]$$

For example, suppose that we wish to estimate the total amount of additional income tax collected from the 1,581,000 returns that were examined. The 95% confidence interval estimate of the total is:

$$N \left[\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}} \right] = 1,581,000(9527 \pm 641)$$

which is

$$\text{LCL} = 14,048,766,000 \quad \text{and} \quad \text{UCL} = 16,075,608,000$$

12-1c Developing an Understanding of Statistical Concepts 1

This section introduced the term *degrees of freedom*. We will encounter this term many times in this book, so a brief discussion of its meaning is warranted. The Student *t*-distribution is based on using the sample variance to estimate the unknown population variance. The sample variance is defined as

$$s^2 = \frac{\sum (x_i - \bar{x})^2}{n - 1}$$

To compute s^2 , we must first determine \bar{x} . Recall that sampling distributions are derived by repeated sampling from the same population. To repeatedly take samples to compute s^2 , we can choose any numbers for the first $n - 1$ observations in the sample. However, we have no choice on the n th value because the sample mean must be calculated first. To illustrate, suppose that $n = 3$ and we find $\bar{x} = 10$. We can have x_1 and x_2 assume any values without restriction. However, x_3 must be such that $\bar{x} = 10$. For example, if $x_1 = 6$ and $x_2 = 8$, then x_3 must equal 16. Therefore, there are only two degrees of freedom in our selection of the sample. We say that we lose one degree of freedom because we had to calculate \bar{x} .

Notice that the denominator in the calculation of s^2 is equal to the number of degrees of freedom. This is not a coincidence and will be repeated throughout this book.

12-1d Developing an Understanding of Statistical Concepts 2

The *t*-statistic like the *z*-statistic measures the difference between the sample mean \bar{x} and the hypothesized value of μ in terms of the number of standard errors. However,

when the population standard deviation σ is unknown, we estimate the standard error by s/\sqrt{n} .

12-1e Developing an Understanding of Statistical Concepts 3

When we introduced the Student t -distribution in Section 8-4, we pointed out that it is more widely spread out than the standard normal. This circumstance is logical. The only variable in the z -statistic is the sample mean \bar{x} , which will vary from sample to sample. The t -statistic has two variables: the sample mean \bar{x} and the sample standard deviation s , both of which will vary from sample to sample. Because of the greater uncertainty, the t -statistic will display greater variability. Exercises 12.15–12.22 address this concept.

We complete this section with a review of how we identify the techniques introduced in this section.

Factors That Identify the t -Test and Estimator of μ

1. **Problem objective:** Describe a population
2. **Data type:** Interval
3. **Type of descriptive measurement:** Central location



EXERCISES

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DO-IT-YOURSELF EXCEL

- 12.1** Construct an Excel spreadsheet that performs the t -test of μ . Inputs: sample mean, sample standard deviation, sample size, hypothesized mean. Outputs: Test statistic, critical values, and one- and two-tail p -values. Tools: **TINV**, **TDIST**.

- 12.2** Create a spreadsheet that computes the t -estimate of μ . Inputs: sample mean, sample standard deviation, sample size, and confidence level. Outputs: Upper and lower confidence limits. Tools: **TINV**.

Developing an Understanding of Statistical Concepts

The following exercises are “what-if” analyses designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually or using the Do-It-Yourself Excel spreadsheets you created.

- 12.3** a. A random sample of 25 was drawn from a population. The sample mean and standard deviation are $\bar{x} = 510$ and $s = 125$. Estimate μ with 95% confidence.
 b. Repeat part (a) with $n = 50$.
 c. Repeat part (a) with $n = 100$.
 d. Describe what happens to the confidence interval estimate when the sample size increases.

- 12.4** a. The mean and standard deviation of a sample of 100 is $\bar{x} = 1500$ and $s = 300$. Estimate the population mean with 95% confidence.
 b. Repeat part (a) with $s = 200$.
 c. Repeat part (a) with $s = 100$.
 d. Discuss the effect on the confidence interval estimate of decreasing the standard deviation s .
- 12.5** a. A statistics practitioner drew a random sample of 400 observations and found that $\bar{x} = 700$ and $s = 100$. Estimate the population mean with 90% confidence.
 b. Repeat part (a) with a 95% confidence level.
 c. Repeat part (a) with a 99% confidence level.
 d. What is the effect on the confidence interval estimate of increasing the confidence level?

- 12.6** a. The mean and standard deviation of a sample of 100 are

$$\bar{x} = 10 \text{ and } s = 1.$$

Estimate the population mean with 95% confidence.

- b. Repeat part (a) with $s = 4$.
 c. Repeat part (a) with $s = 10$.
 d. Discuss the effect on the confidence interval estimate of increasing the standard deviation s .

- 12.7** a. A statistics practitioner calculated the mean and standard deviation from a sample of 51. They are $\bar{x} = 120$ and $s = 15$. Estimate the population mean with 95% confidence.
 b. Repeat part (a) with a 90% confidence level.
 c. Repeat part (a) with an 80% confidence level.
 d. What is the effect on the confidence interval estimate of decreasing the confidence level?

- 12.8** a. The sample mean and standard deviation from a sample of 81 observations are $\bar{x} = 63$ and $s = 8$. Estimate μ with 95% confidence.
 b. Repeat part (a) with $n = 64$.
 c. Repeat part (a) with $n = 36$.
 d. Describe what happens to the confidence interval estimate when the sample size decreases.

- 12.9** a. The sample mean and standard deviation from a random sample of 10 observations from a normal population were computed as $\bar{x} = 23$ and $s = 9$. Calculate the value of the test statistic (and for Excel users, the p -value) of the test required to determine whether there is enough evidence to infer at the 5% significance level that the population mean is greater than 20.
 b. Repeat part (a) with $n = 30$.
 c. Repeat part (a) with $n = 50$.
 d. Describe the effect on the t -statistic (and for Excel users, the p -value) of increasing the sample size.

- 12.10** a. A statistics practitioner is in the process of testing to determine whether there is enough evidence to infer that the population mean is different from 180. She calculated the mean and standard deviation of a sample of 200 observations as $\bar{x} = 175$ and $s = 22$. Calculate the value of the test statistic (and for Excel users, the p -value) of the test required to determine whether there is enough evidence at the 5% significance level.
 b. Repeat part (a) with $s = 45$.
 c. Repeat part (a) with $s = 60$.
 d. Discuss what happens to the t statistic (and for Excel users, the p -value) when the standard deviation increases.

- 12.11** a. Calculate the test statistic (and for Excel users, the p -value) when $\bar{x} = 145$, $s = 50$, and $n = 100$. Use a 5% significance level.

$$H_0: \mu = 150$$

$$H_1: \mu < 150$$

- b. Repeat part (a) with $\bar{x} = 140$.
 c. Repeat part (a) with $\bar{x} = 135$.
 d. What happens to the t -statistic (and for Excel users, the p -value) when the sample mean decreases?

- 12.12** a. A random sample of 25 observations was drawn from a normal population. The sample mean and sample standard deviation are $\bar{x} = 52$ and $s = 15$. Calculate the test statistic (and for Excel users, the p -value) of a test to determine if there is enough evidence at the 10% significance level to infer that the population mean is not equal to 50.
 b. Repeat part (a) with $n = 15$.
 c. Repeat part (a) with $n = 5$.
 d. Discuss what happens to the t -statistic (and for Excel users, the p -value) when the sample size decreases.

- 12.13** a. A statistics practitioner wishes to test the following hypotheses:

$$H_0: \mu = 600$$

$$H_1: \mu < 600$$

A sample of 50 observations yielded the statistics $\bar{x} = 585$ and $s = 45$. Calculate the test statistic (and for Excel users, the p -value) of a test to determine whether there is enough evidence at the 10% significance level to infer that the alternative hypothesis is true.

- b. Repeat part (a) with $\bar{x} = 590$.
 c. Repeat part (a) with $\bar{x} = 595$.
 d. Describe the effect of increasing the sample mean.

- 12.14** a. To test the following hypotheses, a statistics practitioner randomly sampled 100 observations and found $\bar{x} = 106$ and $s = 35$. Calculate the test statistic (and for Excel users, the p -value) of a test to determine whether there is enough evidence at the 1% significance level to infer that the alternative hypothesis is true.

$$H_0: \mu = 100$$

$$H_1: \mu > 100$$

- b. Repeat part (a) with $s = 25$.
 c. Repeat part (a) with $s = 15$.
 d. Discuss what happens to the t -statistic (and for Excel users, the p -value) when the standard deviation decreases.

- 12.15** A random sample of 8 observations was drawn from a normal population. The sample mean and sample standard deviation are $\bar{x} = 40$ and $s = 10$.

- a. Estimate the population mean with 95% confidence.

- b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 10$.
 c. Explain why the interval estimate produced in part (b) is narrower than that in part (a).
- 12.16** a. Estimate the population mean with 90% confidence given the following: $\bar{x} = 175$, $s = 30$, and $n = 5$.
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 30$.
 c. Explain why the interval estimate produced in part (b) is narrower than that in part (a).
- 12.17** a. After sampling 1,000 members of a normal population, you find $\bar{x} = 15,500$ and $s = 9,950$. Estimate the population mean with 90% confidence.
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 9,950$.
 c. Explain why the interval estimates were virtually identical.
- 12.18** a. In a random sample of 500 observations drawn from a normal population, the sample mean and sample standard deviation were calculated as $\bar{x} = 350$ and $s = 100$. Estimate the population mean with 99% confidence.
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 100$.
 c. Explain why the interval estimates were virtually identical.
- 12.19** a. A random sample of 11 observations was taken from a normal population. The sample mean and standard deviation are $\bar{x} = 74.5$ and $s = 9$. Can we infer at the 5% significance level that the population mean is greater than 70?
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 90$.
 c. Explain why the conclusions produced in parts (a) and (b) differ.
- 12.20** a. A statistics practitioner randomly sampled 10 observations and found $\bar{x} = 103$ and $s = 17$. Is there sufficient evidence at the 10% significance level to conclude that the population mean is less than 110?
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 17$.
 c. Explain why the conclusions produced in parts (a) and (b) differ.
- 12.21** a. A statistics practitioner randomly sampled 1,500 observations and found $\bar{x} = 14$ and $s = 25$. Test to determine whether there is enough evidence at the 5% significance level to infer that the population mean is less than 15.
 b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 25$.
 c. Explain why the conclusions produced in parts (a) and (b) are virtually identical.
- 12.22** a. Test the following hypotheses with $\alpha = .05$ given that $\bar{x} = 405$, $s = 100$, and $n = 1,000$.
- $$H_0: \mu = 400$$
- $$H_1: \mu > 400$$
- b. Repeat part (a) assuming that you know that the population standard deviation is $\sigma = 100$.
 c. Explain why the conclusions produced in parts (a) and (b) are virtually identical.

Applications

The following exercises may be answered manually or with the assistance of a computer. The data are stored in files. Assume that the random variable is normally distributed.

- 12.23** **Xr12-23** A courier service advertises that its average delivery time is less than 6 hours for local deliveries. A random sample of times for 12 deliveries to an address across town was recorded. These data are shown here. Is this sufficient evidence to support the courier's advertisement, at the 5% level of significance?

3.03	6.33	6.50	5.22	3.56	6.76
7.98	4.82	7.96	4.54	5.09	6.46

- 12.24** **Xr12-24** How much money do winners go home with from the television quiz show *Jeopardy!*? To determine an answer, a random sample of winners was drawn; the recorded amount of money each won is listed here. Estimate with 95% confidence the mean winnings for all the show's players.

26,650	6,060	52,820	8,490	13,660
25,840	49,840	23,790	51,480	18,960
990	11,450	41,810	21,060	7,860

- 12.25** **Xr12-25** A diet doctor claims that the average North American is more than 20 pounds overweight. To test his claim, a random sample of 20 North Americans was weighed, and the difference between their actual and ideal weights was calculated. The data are listed here. Do these data allow us to infer at the 5% significance level that the doctor's claim is true?

16	23	18	41	22	18	23	19	22	15
18	35	16	15	17	19	23	15	16	26

- 12.26** **Xr12-26** A federal agency responsible for enforcing laws governing weights and measures routinely inspects packages to determine whether the weight of the contents is at least as great as that advertised on the package. A random sample of 18 containers whose packaging states that the contents weigh 8 ounces was drawn. The contents were weighed and the results follow. Can we conclude at the 1% significance level that on average the containers are mislabeled?

7.80	7.91	7.93	7.99	7.94	7.75
7.97	7.95	7.79	8.06	7.82	7.89
7.92	7.87	7.92	7.98	8.05	7.91

- 12.27** **Xr12-27** A parking control officer is conducting an analysis of the amount of time left on parking meters. A quick survey of 15 cars that have just left their metered parking spaces produced the following times (in minutes). Estimate with 95% confidence the mean amount of time left for all the city's meters.

22	15	1	14	0	9	17	31
18	26	23	15	33	28	20	

- 12.28** **Xr12-28** Part of a university professor's job is to publish his or her research. This task often entails reading a variety of journal articles to keep up to date. To help determine faculty standards, a dean of a business school surveyed a random sample of 12 professors across the country and asked them to count the number of journal articles they read in a typical month. These data are listed here. Estimate with 90% confidence the mean number of journal articles read monthly by professors.

9	17	4	23	56	30	41	45	21	10	44	20
---	----	---	----	----	----	----	----	----	----	----	----

- 12.29** **Xr12-29** Most owners of digital cameras store their pictures on the camera. Some will eventually download these to a computer or print them using their own printers or a commercial printer. A film-processing company wanted to know how many pictures were stored on computers. A random sample of 10 digital camera owners produced the data given here. Estimate with 95% confidence the mean number of pictures stored on digital cameras.

25	6	22	26	31	18	13	20	14	2
----	---	----	----	----	----	----	----	----	---

- 12.30** **Xr12-30** University bookstores order books that instructors adopt for their courses. The number of copies ordered matches the projected demand. However, at the end of the semester, the bookstore has too many copies on hand and must return them to the publisher. A bookstore has a policy that the proportion of books returned should be kept as small as possible. The average is supposed to be less than 10%. To see whether the policy is working, a random sample of book titles was drawn, and the fraction of the total originally ordered that are returned is recorded and listed here. Can we infer at the 10% significance level that the mean proportion of returns is less than 10%?

4	15	11	7	5	9	4	3	5	8
---	----	----	---	---	---	---	---	---	---

The following exercises require the use of a computer and software. The answers to Exercises 12.31 to 12.45 may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level for all tests.

- 12.31** **Xr12-31*** A growing concern for educators in the United States is the number of teenagers who

have part-time jobs while they attend high school. It is generally believed that the amount of time teenagers spend working is deducted from the amount of time devoted to schoolwork. To investigate this problem, a school guidance counselor took a random sample of 200 15-year-old high school students and asked how many hours per week each worked at a part-time job. Estimate with 95% confidence the mean amount of time all 15-year-old high school students devote per week to part-time jobs.

- 12.32** **Xr12-32** A company that produces universal remote controls wanted to determine the number of remote control devices American homes contain. The company hired a statistician to survey 240 randomly selected homes and determine the number of remote controls. If there are 100 million households, estimate with 99% confidence the total number of remote controls in the United States.

- 12.33** **Xr12-33** A random sample of American adults was asked whether or not they smoked cigarettes. Those who responded affirmatively were asked how many cigarettes they smoked per day. Assuming that there are 50 million American adults who smoke, estimate with 95% confidence the number of cigarettes smoked per day in the United States.

Source: Adapted from the *Statistical Abstract of the United States*, 2009, Table 196 and Bloomberg News.

- 12.34** **Xr12-34** Bankers and economists watch for signs that the economy is slowing. One statistic they monitor is consumer debt, particularly credit card debt. The Federal Reserve conducts surveys of consumer finances every 3 years. The last survey determined that 23.8% of American households have no credit cards and another 31.2% of the households paid off their most recent credit card bills. The remainder, approximately 50 million households, did not pay their credit card bills in the previous month. A random sample of these households was drawn. Each household in the sample reported how much credit card debt it currently carries. The Federal Reserve would like an estimate (with 95% confidence) of the total credit card debt in the United States.

- 12.35** **Xr12-35*** OfficeMax, a chain that sells a wide variety of office equipment often features sales of products whose prices are reduced because of rebates. Some rebates are so large that the effective price becomes \$0. The goal is to lure customers into the store to buy other nonsale items. A secondary objective is to acquire addresses and telephone numbers to sell to telemarketers and other mass marketers. During one week in January, OfficeMax offered a 100-pack of CD-ROMs (regular price \$29.99 minus \$10 instant rebate, \$12 manufacturer's rebate, and

\$8 OfficeMax mail-in rebate). The number of packages was limited, and no rain checks were issued. In all OfficeMax stores, 2,800 packages were in stock. All were sold. A random sample of 122 buyers was undertaken. Each was asked to report the total value of the other purchases made that day. Estimate with 95% confidence the total spent on other products purchased by those who bought the CD-ROMs.

- 12.36** **Xr12-36** An increasing number of North Americans regularly take vitamins or herbal remedies daily. To gauge this phenomenon, a random sample of Americans was asked to report the number of vitamin and herbal supplements they take daily. Estimate with 95% confidence the mean number of vitamin and herbal supplements Americans take daily.

- 12.37** **Xr12-37** Generic drug sales make up about half of all prescriptions sold in the United States. The marketing manager for a pharmaceutical company wanted to acquire more information about the sales of generic prescription drugs. To do so, she randomly sampled 475 customers who recently filled prescriptions for generic drugs and recorded the cost of each prescription. Estimate with 95% confidence the mean cost of all generic prescription drugs.

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 159.

- 12.38** **Xr12-38** Traffic congestion seems to worsen each year. This raises the question, How much does roadway congestion cost the United States annually? The Federal Highway Administration's Highway Performance Monitoring System conducts an analysis to produce an estimate of the total cost. Drivers in the 99 most congested areas in the United States were sampled and for each driver the congestion cost in time and gasoline was recorded. The total number of drivers in these 99 areas was 171,000,000. Estimate with 95% confidence the total cost of congestion in the 99 areas.

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 1099.

- 12.39** **Xr12-39** To help estimate the size of the disposable razor market, a random sample of men was asked to count the number of shaves they used each razor for. Assume that each razor is used once per day. Estimate with 95% confidence the number of days a pack of 10 razors will last.

- 12.40** **Xr12-40** Because of the enormity of the viewing audience, firms that advertise during the Super Bowl create special commercials that tend to be quite entertaining. Thirty-second commercials cost several million dollars during the Super Bowl game. A random sample of people who watched the game was asked how many commercials they watched in their

entirety. Do these data allow us to infer that the mean number of commercials watched is greater than 15?

- 12.41** **Xr12-41** On a per capita basis, the United States spends far more on health than any other country. To help assess the costs, annual surveys are undertaken. One such survey asks a sample of Americans to report the number of times they visited a health care professional in the year. The data for 2009 (latest year available) were recorded. In 2009, the United States population was 307,439,000. Estimate with 95% confidence the total number of visits to a health care professional.

Source: Adapted from the *Statistical Abstract of the United States*, 2012, Table 166.

- 12.42** **Xr12-42** Companies that sell groceries over the Internet are called *e-grocery*. Customers enter their orders, pay by credit card, and receive delivery by truck. A potential e-grocer analyzed the market and determined that the average order would have to exceed \$85 if the e-grocer were to be profitable. To determine whether an e-grocery would be profitable in one large city, she offered the service and recorded the size of the order for a random sample of customers. Can we infer from these data that an e-grocery will be profitable in this city?

- 12.43** **Xr12-43** During the last decade, many institutions dedicated to improving the quality of products and services in the United States have been formed. Many of these groups annually give awards to companies that produce high-quality goods and services. An investor believes that publicly traded companies that win awards are likely to outperform companies that do not win such awards. To help determine his return on investment in such companies, he took a random sample of 83 firms that won quality awards the previous year and computed the annual return he would have received had he invested. The investor would like an estimate of the returns he can expect. A 95% confidence level is deemed appropriate.

- 12.44** **Xr12-44** In 2010, most Canadian cities were experiencing a housing boom. As a consequence, home buyers were required to borrow more on their mortgages. To determine the extent of this problem, a survey of Canadian households was undertaken wherein household heads were asked to report their total debt. Assuming that there are 7 million households in Canada, estimate with 95% confidence the total household debt.

- 12.45** **Xr12-45** Refer to Exercise 12.44. In addition to household debt, the survey asked each household to report the debt-to-income ratio. Estimate with 90% confidence the mean debt-to-income ratio.



GENERAL SOCIAL SURVEY EXERCISES

Excel users please note that there are empty cells representing missing data that must be removed. Use a 5% significance level for all tests. Exercises 12.46 to 12.53 are based on the General Social Survey of 2012. Exercises 12.54–12.62 are based on the General Social Survey of 2010.

- 12.46 **GSS2012*** Estimate with 95% confidence the mean income (INCOME) of Americans in 2012.
- 12.47 **GSS2012*** Do the data provide enough evidence to infer that the average American adult completed more than 12 years of education (EDUC)?
- 12.48 **GSS2012*** Estimate with 95% confidence the mean numbers of earners (EARNRS) in the household in 2012.
- 12.49 **GSS2012*** Can we infer that the mean number of hours worked (HRS1) among those working full or part time is greater than 40?
- 12.50 **GSS2012*** Is there sufficient evidence to infer that the average American watches more than 24 hours per week, which is 3 hours per day (TVHOURS)?
- 12.51 **GSS2012*** Can we infer from the data that the average American with children was less than 25 years old when his or her first child was born (AGEKDBRN)?
- 12.52 **GSS2012*** Estimate with 99% confidence the average total family income (TFINCOME) in 2012.
- 12.53 **GSS2012*** Can we infer that the Americans have on average less than two children (CHILDS)?
- 12.54 **GSS2010*** Is there sufficient evidence to conclude that American families with children have on average less than two children (CHILDS)?
- 12.55 **GSS2010*** Estimate with 95% confidence the average amount of television watched per day (TVHOURS).
- 12.56 **GSS2010*** Is there sufficient evidence to infer that the average American has more than a high school education, which is more than 12 years of education (EDUC)?
- 12.57 **GSS2010*** Is there enough evidence to conclude that the average American with children was less than 25 years old when his or her first child was born (AGEKDBRN)?
- 12.58 **GSS2010*** Can we infer that the average American works more than 40 hours per week (HRS1)?
- 12.59 **GSS2010*** Estimate with 95% confidence the average American annual income (INCOME).
- 12.60 **GSS2010*** Estimate with 95% confidence the average American total family annual income (TFINCOME).
- 12.61 **GSS2010*** Estimate with 99% confidence the average number of earners per household (EARNRS).
- 12.62 **GSS2010*** Is there enough evidence to conclude that the average household contains less than two adults (ADULTS)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users please note that there are empty cells representing missing data that must be removed. Use a 5% significance level for any tests.

- 12.63 **ANES2008*** Can we infer that the average American has completed more than 12 years of education (EDUC)?
- 12.64 **ANES2008*** Estimate with 95% confidence the mean number of days in a typical week (DAYS8)

spent by American adults watching the national news on television, not including sports.

- 12.65 **ANES2008*** Estimate with 99% confidence the mean amount of time in a typical day spent by American adults watching or reading news on the Internet (TIME1).

12-2 / INFERENCE ABOUT A POPULATION VARIANCE

In Section 12-1, where we presented the inferential methods about a population mean, we were interested in acquiring information about the central location of the population. As a result, we tested and estimated the population mean. If we are interested instead in drawing inferences about a population's variability, the parameter we need to investigate is the population variance σ^2 . Inference about the variance can be used to make decisions in a variety of problems. In an example illustrating the use of the normal distribution in Section 8-2, we showed why variance is a measure of risk. In Section 7-3, we described an important application in finance wherein stock diversification was shown to reduce the variance of a portfolio and, in so doing, reduce the risk associated with that portfolio. In both sections, we assumed that the population variances were known. In this section, we take a more realistic approach and acknowledge that we need to use statistical techniques to draw inferences about a population variance.

Another application of the use of variance comes from operations management. Quality technicians attempt to ensure that their company's products consistently meet specifications. One way of judging the consistency of a production process is to compute the variance of a product's size, weight, or volume; that is, if the variation in size, weight, or volume is large, it is likely that an unsatisfactorily large number of products will lie outside the specifications for that product. We will return to this subject later in this book. In Section 14-6, we discuss how operations managers search for and reduce the variation in production processes.

The task of deriving the test statistic and the interval estimator provides us with another opportunity to show how statistical techniques in general are developed. We begin by identifying the best estimator. That estimator has a sampling distribution, from which we produce the test statistic and the interval estimator.

12-2a Statistic and Sampling Distribution

The estimator of σ^2 is the sample variance introduced in Section 4-2. The statistic s^2 has the desirable characteristics presented in Section 10-1; that is, s^2 is an unbiased, consistent estimator of σ^2 .

Statisticians have shown that the sum of squared deviations from the mean $\sum (x_i - \bar{x})^2$ [which is equal to $(n - 1)s^2$] divided by the population variance is chi-squared distributed with $\nu = n - 1$ degrees of freedom provided that the sampled population is normal. The statistic

$$\chi^2 = \frac{(n - 1)s^2}{\sigma^2}$$

is called the **chi-squared statistic** (χ^2 -statistic). The chi-squared distribution was introduced in Section 8-4.

12-2b Testing and Estimating a Population Variance

As we discussed in Section 11-4, the formula that describes the sampling distribution is the formula of the test statistic.

Test Statistic for σ^2

The test statistic used to test hypotheses about σ^2 is

$$\chi^2 = \frac{(n - 1)s^2}{\sigma^2}$$

which is chi-squared distributed with $\nu = n - 1$ degrees of freedom when the population random variable is normally distributed with variance equal to σ^2 .

Using the notation introduced in Section 8-4, we can make the following probability statement:

$$P(\chi^2_{1-\alpha/2} < \chi^2 < \chi^2_{\alpha/2}) = 1 - \alpha$$

Substituting

$$\chi^2 = \frac{(n - 1)s^2}{\sigma^2}$$

and with some algebraic manipulation, we derive the confidence interval estimator of a population variance.

Confidence Interval Estimator of σ^2

$$\text{Lower confidence limit (LCL)} = \frac{(n - 1)s^2}{\chi^2_{\alpha/2}}$$

$$\text{Upper confidence limit (UCL)} = \frac{(n - 1)s^2}{\chi^2_{1-\alpha/2}}$$

APPLICATIONS in OPERATIONS MANAGEMENT

Quality

A critical aspect of production is quality. The quality of a final product is a function of the quality of the product's components. If the components don't fit, the product will not function as planned and likely cease functioning before its customers expect it to. For example, if a car door is not made to its specifications, it will not fit. As a result, the door will leak both water and air.

Operations managers attempt to maintain and improve the quality of products by ensuring that all components are made so that there is as little variation as possible. As you have already seen, statisticians measure variation by computing the variance. Incidentally, an entire chapter (Chapter 21) is devoted to the topic of quality.



EXAMPLE 12.3

DATA
Xm12-03

Consistency of a Container-Filling Machine, Part 1

Container-filling machines are used to package a variety of liquids, including milk, soft drinks, and paint. Ideally, the amount of liquid should vary only slightly because large variations will cause some containers to be underfilled (cheating the customer) and some to be overfilled (resulting in costly waste). The president of a company that developed a new type of machine boasts that this machine can fill 1-liter (1,000 cubic centimeters) containers so consistently that the variance of the fills will be less than 1 cubic centimeter². To examine the veracity of the claim, a random sample of 25 1-liter fills was taken and the results (cubic centimeters) recorded. These data are listed here. Do these data allow the president to make this claim at the 5% significance level?

Fills

999.6	1000.7	999.3	1000.1	999.5
1000.5	999.7	999.6	999.1	997.8
1001.3	1000.7	999.4	1000.0	998.3
999.5	1000.1	998.3	999.2	999.2
1000.4	1000.1	1000.1	999.6	999.9

SOLUTION:**IDENTIFY**

The problem objective is to describe the population of 1-liter fills from this machine. The data are interval, and we're interested in the variability of the fills. It follows that the parameter of interest is the population variance. Because we want to determine whether there is enough evidence to support the claim, the alternative hypothesis is

$$H_1: \sigma^2 < 1$$

The null hypothesis is

$$H_0: \sigma^2 = 1$$

and the test statistic we will use is

$$\chi^2 = \frac{(n - 1)s^2}{\sigma^2}$$

COMPUTE**MANUALLY:**

Using a calculator, we find

$$\sum x_i = 24,992.0 \text{ and } \sum x_i^2 = 24,984,017.76$$

Thus,

$$s^2 = \frac{\sum x_i^2 - \frac{(\sum x_i)^2}{n}}{n - 1} = \frac{24,984,017.76 - \frac{(24,992.0)^2}{25}}{25 - 1} = .6333$$

The value of the test statistic is

$$\chi^2 = \frac{(n - 1)s^2}{\sigma^2} = \frac{(25 - 1)(.6333)}{1} = 15.20$$

The rejection region is

$$\chi^2 < \chi^2_{1-\alpha, n-1} = \chi^2_{1-.05, 25-1} = \chi^2_{.95, 24} = 13.85$$

Because 15.20 is not less than 13.85, we cannot reject the null hypothesis in favor of the alternative.

EXCEL

	A	B	C	D
1	Chi-Squared Test: Variance			
2				
3			Fills	
4	Sample Variance		0.6333	
5	Hypothesized Variance		1	
6	df		24	
7	chi-squared Stat		15.20	
8	P (CHI<=chi) one-tail		0.0852	
9	chi-squared Critical one tail	Left-tail	13.85	
10		Right-tail	36.42	
11	P (CHI<=chi) two-tail		0.1705	
12	chi-squared Critical two tail	Left-tail	12.40	
13		Right-tail	39.36	

The value of the test statistic is 15.20. $P(\text{CHI}<=\text{chi})$ one-tail is the probability $P(\chi^2 < 15.20)$, which is equal to .0852. Because this is a one-tail test, the p -value is .0852.

INSTRUCTIONS

1. Type or import the data into one column*. (Open Xm12-03.)
2. Click Add-Ins, Data Analysis Plus, and Chi-squared Test: Variance.
3. Specify the Input Range (A1:A26), type the Hypothesized Variance (1) and the value of α (.05).

MINITAB

Test and CI for One Standard Deviation: Fills				
Null hypothesis				sigma = 1
Alternative hypothesis				sigma < 1
Statistics				
Variable	N	StDev	Variance	
Fills	25	0.796	0.633	
Tests				
Variable	Method	Chi-Square	DF	P-Value
Fills	Standard	15.20	24.00	0.085

INSTRUCTIONS

Some of the output has been deleted.

*If a cell is empty (representing missing data) it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

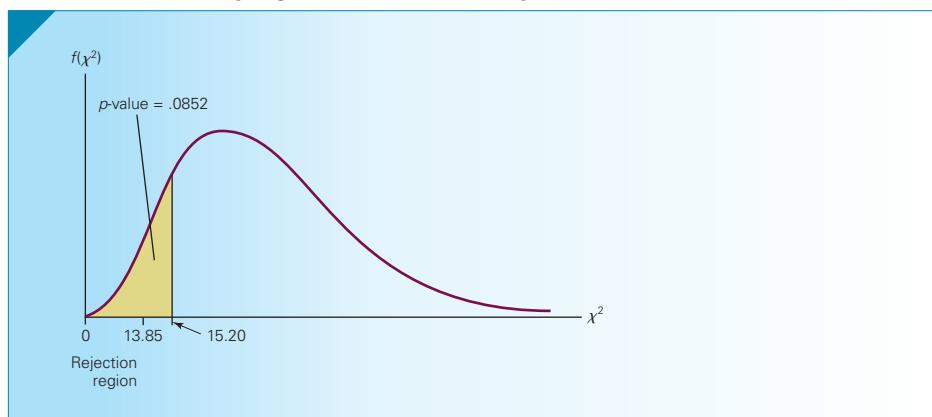
Besides computing the Chi-Squared statistic and p -value, and because we're conducting a one-tail test, Minitab calculates a one-sided confidence interval estimate. (See page 367 for a discussion of one-sided confidence interval estimators.)

1. Type or import the data into one column. (Open Xm12-03.)
2. Click **Stat**, **Basic Statistics**, and **1 Variance . . .**
3. Type or use the **Select** button to specify the name of the variable or the column in the **Samples in columns** box (**Fills**), check **Perform hypothesis test**, and type the value of σ in the **Hypothesized standard deviation** box (**1**).
4. Click **Options . . .** and select one of **less than**, **not equal**, or **greater than** in the **Alternative** box (**less than**).

INTERPRET

There is not enough evidence to infer that the claim is true. As we discussed before, the result does not say that the variance is equal to 1; it merely states that we are unable to show that the variance is less than 1. Figure 12.4 depicts the sampling distribution of the test statistic.

FIGURE 12.4 Sampling Distribution for Example 12.3



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EXAMPLE 12.4

Consistency of a Container-Filling Machine, Part 2

Estimate with 99% confidence the variance of fills in Example 12.3.

SOLUTION:

MANUALLY:

In the solution to Example 12.3, we found $(n - 1)s^2$ to be 15.20. From Table 5 in Appendix B, we find

$$\chi_{\alpha/2, n-1}^2 = \chi_{.005, 24}^2 = 45.6$$

$$\chi_{1-\alpha/2, n-1}^2 = \chi_{.995, 24}^2 = 9.89$$

Thus,

$$\text{LCL} = \frac{(n - 1)s^2}{\chi_{\alpha/2}^2} = \frac{15.20}{45.6} = .3333$$

$$\text{UCL} = \frac{(n - 1)s^2}{\chi_{1-\alpha/2}^2} = \frac{15.20}{9.89} = 1.537$$

We estimate that the variance of fills is a number that lies between .3333 and 1.537.

EXCEL

	A	B
1	Chi-Squared Estimate: Variance	
2		
3		Fills
4	Sample Variance	0.6333
5	df	24
6	LCL	0.3336
7	UCL	1.5375

INSTRUCTIONS

1. Type or import the data into one column*. (Open Xm12-03.)
2. Click Add-Ins, Data Analysis Plus, and Chi-squared Estimate: Variance.
3. Specify the Input Range (A1:A26) and α (.01).

MINITAB

Test and CI for One Standard Deviation: Fills				
Statistics				
Variable	N	StDev	Variance	
Fills	25	0.796	0.633	
99% Confidence Intervals				
Variable	Method	CI for StDev	CI for Variance	
Fills	Standard	(0.578, 1.240)	(0.334, 1.537)	

INSTRUCTIONS

Some of the output has been deleted.

1. Type or import the data into one column. (Open Xm12-03.)
2. Click Stat, Basic Statistics, and 1 Variance

*If a cell is empty (representing missing data) it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

3. Type or use the **Select** button to specify the name of the variable or the column in the **Samples in columns** box (**Fills**).
4. Click **Options . . .**, type the **Confidence level**, and select **not equal** in the **Alternative** box.

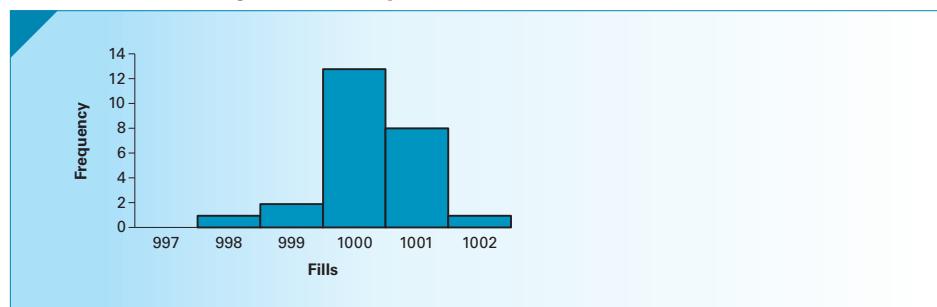
INTERPRET

In Example 12.3, we saw that there was not sufficient evidence to infer that the population variance is less than 1. Here we see that σ^2 is estimated to lie between .3336 and 1.5375. Part of this interval is above 1, which tells us that the variance may be larger than 1, confirming the conclusion we reached in Example 12.3. We may be able to use the estimate to predict the percentage of overfilled and underfilled bottles. This may allow us to choose among competing machines.

12-2c Checking the Required Condition

Like the *t*-test and estimator of μ introduced in Section 12-1, the chi-squared test and estimator of σ^2 theoretically require that the sample population be normal. In practice, however, the technique is valid so long as the population is not extremely nonnormal. We can gauge the extent of nonnormality by drawing the histogram. Figure 12.5 depicts Excel's version of this histogram. As you can see, the fills appear to be somewhat asymmetric. However the variable does not appear to be very nonnormal. We conclude that the normality requirement is not seriously violated.

FIGURE 12.5 Histogram for Examples 12.3 and 12.4



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Here is how we recognize when to use the techniques introduced in this section.

Factors That Identify the Chi-Squared Test and Estimator of σ^2

1. **Problem objective:** Describe a population
2. **Data type:** Interval
3. **Type of descriptive measurement:** Variability



EXERCISES

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DO-IT-YOURSELF EXCEL

Construct Excel spreadsheets that perform the following techniques

12.66 χ^2 -test of σ^2 . Inputs: sample variance, sample size, and hypothesized variance. Outputs: Test statistic, critical values, and one- and two-tail p -values. Tools: **CHIINV, CHITEST**

12.67 χ^2 -estimate of σ^2 . Inputs: sample variance, sample size, and confidence level. Outputs: Upper and lower confidence limits. Tools: **CHIINV**

Developing an Understanding of Statistical Concepts

The following three exercises are “what-if analyses” designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually or using the Do-It-Yourself Excel spreadsheets you created.

- 12.68** a. A random sample of 100 observations was drawn from a normal population. The sample variance was calculated to be $s^2 = 220$. Test with $\alpha = .05$ to determine whether we can infer that the population variance differs from 300.
 b. Repeat Part a changing the sample size to 50.
 c. What is the effect of decreasing the sample size?

- 12.69** a. The sample variance of a random sample of 50 observations from a normal population was found to be $s^2 = 80$. Can we infer at the 1% significance level that σ^2 is less than 100?
 b. Repeat part (a) increasing the sample size to 100.
 c. What is the effect of increasing the sample size?

- 12.70** a. Estimate σ^2 with 90% confidence given that $n = 15$ and $s^2 = 12$.
 b. Repeat part (a) with $n = 30$.
 c. What is the effect of increasing the sample size?

Applications

- 12.71** [Xr12-71](#) The weights of a random sample of cereal boxes that are supposed to weigh 1 pound are listed here. Estimate the variance of the entire population of cereal box weights with 90% confidence.

1.05 1.03 .98 1.00 .99 .97 1.01 .96

- 12.72** [Xr12-72](#) After many years of teaching, a statistics professor computed the variance of the marks on her final exam and found it to be $\sigma^2 = 250$. She recently made changes to the way in which the final exam

is marked and wondered whether this would result in a reduction in the variance. A random sample of this year's final exam marks are listed here. Can the professor infer at the 10% significance level that the variance has decreased?

57 92 99 73 62 64 75 70 88 60

- 12.73** [Xr12-73](#) With gasoline prices increasing, drivers are more concerned with their cars' gasoline consumption. For the past 5 years a driver has tracked the gas mileage of his car and found that the variance from fill-up to fill-up was $\sigma^2 = 23 \text{ mpg}^2$. Now that his car is 5 years old, he would like to know whether the variability of gas mileage has changed. He recorded the gas mileage from his last eight fill-ups; these are listed here. Conduct a test at a 10% significance level to infer whether the variability has changed.

28 25 29 25 32 36 27 24

- 12.74** [Xr12-74](#) During annual checkups physicians routinely send their patients to medical laboratories to have various tests performed. One such test determines the cholesterol level in patients' blood. However, not all tests are conducted in the same way. To acquire more information, a man was sent to 10 laboratories and had his cholesterol level measured in each. The results are listed here. Estimate with 95% confidence the variance of these measurements.

188 193 186 184 190 195 187 190 192 196

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.

- 12.75** [Xr12-75](#) One important factor in inventory control is the variance of the daily demand for the product. A management scientist has developed the optimal

order quantity and reorder point, assuming that the variance is equal to 250. Recently, the company has experienced some inventory problems, which induced the operations manager to doubt the assumption. To examine the problem, the manager took a sample of 25 days and recorded the demand.

- Do these data provide sufficient evidence at the 5% significance level to infer that the management scientist's assumption about the variance is wrong?
 - What is the required condition for the statistical procedure in Part a?
 - Does it appear that the required condition is not satisfied?
- 12.76** **Xr12-76** Some traffic experts believe that the major cause of highway collisions is the differing speeds of cars. That is, when some cars are driven slowly while others are driven at speeds well in excess of the speed limit, cars tend to congregate in bunches, increasing the probability of accidents. Thus, the greater the variation in speeds, the greater will be the number of collisions that occur. Suppose that one expert believes that when the variance exceeds 18 mph^2 , the number of accidents will be unacceptably high. A random sample of the speeds of 245 cars on a highway with one of the highest accident rates in the country is taken. Can we conclude at the 10% significance level that the variance in speeds exceeds 18 mph^2 ?
- 12.77** **Xr12-77** The job placement service at a university observed the not unexpected result of the variance in marks and work experience of the university's graduates: Some graduates received numerous

offers whereas others received far fewer. To learn more about the problem, a survey of 90 recent graduates was conducted wherein each was asked how many job offers they received. Estimate with 90% confidence the variance in the number of job offers made to the university's graduates.

- 12.78** **Xr12-78** One problem facing the manager of maintenance departments is when to change the bulbs in streetlamps. If bulbs are changed only when they burn out, it is quite costly to send crews out to change only one bulb at a time. This method also requires someone to report the problem and, in the meantime, the light is off. If each bulb lasts approximately the same amount of time, they can all be replaced periodically, producing significant cost savings in maintenance. Suppose that a financial analysis of the lights at Yankee Stadium has concluded that it will pay to replace all of the light bulbs at the same time if the variance of the lives of the bulbs is less than 200 hours². The lengths of life of the last 100 bulbs were recorded. What conclusion can be drawn from these data? Use a 5% significance level.

- 12.79** **Xr12-79** Home blood-pressure monitors have been on the market for several years. This device allows people with high blood pressure to measure their own and determine whether additional medication is necessary. Concern has been expressed about inaccurate readings. To judge the severity of the problem a laboratory technician measured his own blood pressure 25 times using the leading brand of monitors. Estimate the population variance with 95% confidence.

12-3 / INFERENCE ABOUT A POPULATION PROPORTION

In this section, we continue to address the problem of describing a population. However, we shift our attention to populations of nominal data, which means that the population consists of nominal or categorical values. For example, in a brand-preference survey in which the statistics practitioner asks consumers of a particular product which brand they purchase, the values of the random variable are the brands. If there are five brands, the values could be represented by their names, by letters (A, B, C, D, and E), or by numbers (1, 2, 3, 4, and 5). When numbers are used, it should be understood that the numbers only represent the name of the brand, are completely arbitrarily assigned, and cannot be treated as real numbers—that is, we cannot calculate means and variances.

12-3a Parameter

Recall the discussion of types of data in Chapter 2. When the data are nominal, all that we are permitted to do to describe the population or sample is count the number of occurrences of each value. From the counts, we calculate proportions. Thus, the parameter of interest in describing a population of nominal data is the population proportion p .

In Section 7-4, this parameter was used to calculate probabilities based on the binomial experiment. One of the characteristics of the binomial experiment is that there are only two possible outcomes per trial. Most practical applications of inference about p involve more than two outcomes. However, in many cases we're interested in only one outcome, which we label a "success." All other outcomes are labeled as "failures." For example, in brand-preference surveys we are interested in our company's brand. In political surveys, we wish to estimate or test the proportion of voters who will vote for one particular candidate—likely the one who has paid for the survey.

12-3b Statistic and Sampling Distribution

The logical statistic used to estimate and test the population proportion is the sample proportion defined as

$$\hat{p} = \frac{x}{n}$$

where x is the number of successes in the sample and n is the sample size. In Section 9-2, we presented the approximate sampling distribution of \hat{P} . (The actual distribution is based on the binomial distribution, which does not lend itself to statistical inference.) The sampling distribution of \hat{P} is approximately normal with mean p and standard deviation $\sqrt{p(1 - p)/n}$ [provided that np and $n(1 - p)$ are greater than 5]. We express this sampling distribution as

$$z = \frac{\hat{P} - p}{\sqrt{p(1 - p)/n}}$$

12-3c Testing and Estimating a Proportion

As you have already seen, the formula that summarizes the sampling distribution also represents the test statistic.

Test Statistic for p

$$z = \frac{\hat{P} - p}{\sqrt{p(1 - p)/n}}$$

which is approximately normal when np and $n(1 - p)$ are greater than 5.

Using the same algebra employed in Sections 10-2 and 12-1, we attempt to derive the confidence interval estimator of p from the sampling distribution. The result is

$$\hat{p} \pm z_{\alpha/2} \sqrt{p(1 - p)/n}$$

This formula, although technically correct, is useless. To understand why, examine the standard error of the sampling distribution $\sqrt{p(1 - p)/n}$. To produce the interval estimate, we must compute the standard error, which requires us to know the value of p , the parameter we wish to estimate. This is the first of several statistical techniques where we face the same problem: how to determine the value of the standard error. In this application, the problem is easily and logically solved: Simply estimate the value of p with \hat{p} .

Thus, we estimate the standard error with $\sqrt{\hat{p}(1 - \hat{p})/n}$.

Confidence Interval Estimator of p

$$\hat{p} \pm z_{\alpha/2} \sqrt{\hat{p}(1 - \hat{p})/n}$$

which is valid provided that $n\hat{p}$ and $n(1 - \hat{p})$ are greater than 5.

EXAMPLE 12.5**DATA**

Xm12-05*

Election Day Exit Poll

When an election for political office takes place, the television networks cancel regular programming and instead provide election coverage. When the ballots are counted, the results are reported. However, for important offices such as president or senator in large states, the networks actively compete to see which will be the first to predict a winner. This is done through exit polls,* wherein a random sample of voters who exit the polling booth is asked for whom they voted. From the data, the sample proportion of voters supporting the candidates is computed. A statistical technique is applied to determine whether there is enough evidence to infer that the leading candidate will garner enough votes to win. Suppose that in the exit poll from the state of Florida during the 2000 year elections, the pollsters recorded only the votes of the two candidates who had any chance of winning, Democrat Albert Gore (code = 1) and Republican George W. Bush (code = 2). The polls close at 8:00 p.m. Can the networks conclude from these data that the Republican candidate will win the state? Should the network announce at 8:01 p.m. that the Republican candidate will win?

SOLUTION:**IDENTIFY**

The problem objective is to describe the population of votes in the state. The data are nominal because the values are “Democrat” (code = 1) and “Republican” (code = 2). Thus the parameter to be tested is the proportion of votes in the entire state that are for the Republican candidate. Because we want to determine whether the network can declare the Republican to be the winner at 8:01 p.m., the alternative hypothesis is

$$H_1: p > .5$$

which makes the null hypothesis

$$H_0: p = .5$$

The test statistic is

$$z = \frac{\hat{p} - p}{\sqrt{p(1 - p)/n}}$$

*Warren Mitofsky is generally credited for creating the election day exit poll in 1967 when he worked for CBS News. Mitofsky claimed to have correctly predicted 2,500 elections and only six wrong. Exit polls are considered so accurate that when the exit poll and the actual election result differ, some newspaper and television reporters claim that the election result is wrong! In the 2004 presidential election, exit polls showed John Kerry leading. However, when the ballots were counted, George Bush won the state of Ohio. Conspiracy theorists now believe that the Ohio election was stolen by the Republicans using the exit poll as their “proof.” However, Mitofsky’s own analysis found that the exit poll was improperly conducted, resulting in many Republican voters refusing to participate in the poll. Blame was placed on poorly trained interviewers (*Source: Amstat News*, December 2006).

COMPUTE**M A N U A L L Y:**

It appears that this is a “standard” problem that requires a 5% significance level. Thus, the rejection region is

$$z > z_\alpha = z_{.05} = 1.645$$

From the file, we count the number of “successes,” which is the number of votes cast for the Republican, and find $x = 407$. The sample size is 765. Hence, the sample proportion is

$$\hat{p} = \frac{x}{n} = \frac{407}{765} = .532$$

The value of the test statistic is

$$z = \frac{\hat{p} - p}{\sqrt{p(1-p)/n}} = \frac{.532 - .5}{\sqrt{.5(1-.5)/765}} = 1.77$$

Because the test statistic is (approximately) normally distributed, we can determine the p -value. It is

$$p\text{-value} = P(Z > 1.77) = 1 - p(Z < 1.77) = 1 - .9616 = .0384$$

There is enough evidence at the 5% significance level that the Republican candidate has won.

E X C E L

	A	B	C	D
1	z-Test: Proportion			
2				
3			<i>Votes</i>	
4	Sample Proportion		0.532	
5	Observations		765	
6	Hypothesized Proportion		0.5	
7	z Stat		1.7716	
8	$P(Z \leq z)$ one-tail		0.0382	
9	z Critical one-tail		1.6449	
10	$P(Z \leq z)$ two-tail		0.0764	
11	z Critical two-tail		1.9600	

I N S T R U C T I O N S

1. Type or import the data into one column*. (Open Xm12-05.)
2. Click Add-Ins, Data Analysis Plus, and Z-Test: Proportion.
3. Specify the Input Range (A1:A766), type the Code for Success (2), the Hypothesized Proportion (.5), and a value of α (.05).

*If a cell is empty (representing missing data) it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

MINITAB**Test and CI for One Proportion: Votes**Test of $p = 0.5$ vs $p > 0.5$

Event = 2

Variable	X	N	Sample p	95%		P-Value
				Lower Bound	Z-Value	
Votes	407	765	0.532026	0.502352	1.77	0.038

Using the normal approximation

As was the case with the test of a variance, Minitab calculates a one-sided confidence interval estimate when we're conducting a one-tail test.

INSTRUCTIONS

The data must represent successes and failures. The codes can be numbers or text. There can be only two kinds of entries: one representing success and the other representing failure. If numbers are used, Minitab will interpret the larger one as a success.

1. Type or import the data into one column. ([Open Xm12-05](#).)
2. Click **Stat**, **Basic Statistics**, and **1 Proportion . . .**
3. Use the **Select** button or type the name of the variable or its column in the **Samples in columns** box ([Votes](#)) and check **Perform hypothesis test** and type the **Hypothesized proportion** (.5).
4. Click **Options . . .** and specify the **Alternative** hypothesis ([greater than](#)). To use the normal approximation of the binomial, click **Use test and interval based on normal approximation**.

INTERPRET

The value of the test statistic is $z = 1.77$ and the one-tail p -value = .0382. Using a 5% significance level, we reject the null hypothesis and conclude that there is enough evidence to infer that George Bush won the presidential election in the state of Florida.

One of the key issues to consider here is the cost of Type I and Type II errors. A Type I error occurs if we conclude that the Republican will win when in fact he has lost. Such an error would mean that a network would announce at 8:01 P.M. that the Republican has won and then later in the evening would have to admit to a mistake. If a particular network were the only one that made this error, it would cast doubt on their integrity and possibly affect the number of viewers.

This is exactly what happened on the evening of the U.S. presidential elections in November 2000. Shortly after the polls closed at 8:00 P.M., all the networks declared that the Democratic candidate Albert Gore would win the state of Florida. A couple of hours later, the networks admitted that a mistake had been made and that Republican candidate George W. Bush had won. Several hours later, they again admitted a mistake and finally declared the race too close to call. Fortunately for each network, all the networks made the same mistake. However, if one network had not done this, it would have developed a better track record, which could have been used in future advertisements for news shows and would likely draw more viewers.

12-3d Missing Data

In real statistical applications, we occasionally find that the data set is incomplete. In some instances, the statistics practitioner may have failed to properly record some observations or some data may have been lost. In other cases, respondents may refuse to answer. For example, in political surveys where the statistics practitioner asks voters for whom they intend to vote in the next election, some people will answer that they haven't decided or that their vote is confidential and refuse to answer. In surveys where respondents are asked to report their income, people often refuse to divulge this information. This is a troublesome issue for statistics practitioners. We can't force people to answer our questions. However, if the number of nonresponses is high, the results of our analysis may be invalid because the sample is no longer truly random. To understand why, suppose that people who are in the top quarter of household incomes regularly refuse to answer questions about their incomes. The resulting estimate of the population household income mean will be lower than the actual value.

The issue can be complicated. There are several ways to compensate for non-responses. The simplest method is eliminating them. To illustrate, suppose that in a political survey respondents are asked for whom they intend to vote in a two-candidate race. Surveyors record the results as 1 = Candidate A, 2 = Candidate B, 3 = "Don't know," and 4 = "Refuse to say." If we wish to infer something about the proportion of decided voters who will vote for Candidate A, we can simply omit codes 3 and 4. If we're doing the work manually, we will count the number of voters who prefer Candidate A and the number who prefer Candidate B. The sum of these two numbers is the total sample size.

In the language of statistical software, nonresponses that we wish to eliminate are collectively called *missing data*. Software packages deal with missing data in different ways. Keller's website Appendix Excel and Minitab Instructions for Missing Data and Recoding Data describes how to address the problem of missing data in Excel and in Minitab as well as how to recode data.

We have deleted the nonresponses in the General Social Surveys and the American National Election Surveys. In Excel, the nonresponses appear as blanks; in Minitab, they appear as asterisks.

12-3e Estimating the Total Number of Successes in a Large Finite Population

As was the case with the inference about a mean, the techniques in this section assume infinitely large populations. When the populations are small, it is necessary to include the finite population correction factor. In our definition a population is small when it is less than 20 times the sample size. When the population is large and finite, we can estimate the total number of successes in the population.

To produce the confidence interval estimator of the total, we multiply the lower and upper confidence limits of the interval estimator of the proportion of successes by the population size. The confidence interval estimator of the total number of successes in a large finite population is

$$N\left(\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}\right)$$

We will use this estimator in the chapter-opening example and several of this section's exercises.

Nielsen Ratings: Solution

IDENTIFY

The problem objective is to describe the population of television shows watched by viewers across the country. The data are nominal. The combination of problem objective and data type make the parameter to be estimated the proportion of the entire population of 18- to 49-year-olds that watched *Big Bang Theory* (code = 2). The confidence interval estimator of the proportion is:

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}$$



Jupiterimages

COMPUTE

M A N U A L L Y :

To solve manually, we count the number of 2's in the file. We find this value to be 275. Thus,

$$\hat{p} = \frac{x}{n} = \frac{275}{5,000} = .0550$$

The confidence level is $1 - \alpha = .95$. It follows that $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$. The 95% confidence interval estimate of p is:

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} = .0550 \pm 1.96 \sqrt{\frac{(.0550)(1 - .0550)}{5,000}} = .0550 \pm .0063$$

$$\text{LCL} = .0487 \quad \text{UCL} = .0613$$

E X C E L

	A	B
1	z-Estimate: Proportion	
2		<i>TV Program</i>
3	Sample Proportion	0.0550
4	Observations	5000
5	LCL	0.0487
6	UCL	0.0613

I N S T R U C T I O N S

- Type or import the data into one column*. (Open Xm12-00.)
- Click **Add-Ins, Data Analysis Plus**, and **Z-Estimate: Proportion**.
- Specify the **Input Range** (B1:B5001), the **Code for Success** (2), and the value of α (.05).

M I N I T A B

Minitab requires that the data set contain only two values, the larger of which would be considered a success. In this example there are six values. If there are more than two codes or if the code for success is smaller than that for failure, we must recode.

Test and CI for One Proportion: Recorded Program				
Event = 2				
Variable	X	N	Sample p	95% CI
Programs	275	5000	0.055000	(0.048842, 0.061684)
Using the normal approximation.				

*If a cell is empty (representing missing data) it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

INSTRUCTIONS

Recode data

1. Click **Data, Code**, and **Numeric to Numeric . . .**
2. In the **Code data from columns** box, type or **Select** the data you wish to recode.
3. In the **Store coded data in columns** box, type the column where the recoded data are to be stored. (We named the column “Recoded Program.”)
4. Specify the **Original values:** you wish to recode and their **New:** values.

Estimate the proportion

1. Click **Stat, Basic Statistics**, and **1 Proportion . . .**
2. In the **Samples in columns** box, type or **Select** the data (**Recoded Programs**).
3. Click **Options . . .**
4. Specify the **Confidence level:** (.95), select **Alternative: not equal**, and **Use test and interval based on normal distribution.**

INTERPRET

We estimate that between 4.87% and 6.13% of all Americans who were between 18 and 49 years old were watching *Big Bang Theory* on Thursday, March 7, 2013, at 8:00 P.M. to 8:30 P.M. If we multiply these figures by the total number of Americans who were between 18 and 49 years old, 126.540 million, we produce an interval estimate of the number of American adults 18–49 were watching *Big Bang Theory*. Thus,

$$\text{LCL} = .0487 \times 126.54 \text{ million} = 6.16 \text{ million}$$

and

$$\text{UCL} = .0613 \times 126.54 \text{ million} = 7.76 \text{ million}$$

Sponsoring companies can then determine the value of any commercials that appeared on the show.

12-3f Selecting the Sample Size to Estimate the Proportion

When we introduced the sample size selection method to estimate a mean in Section 10-3, we pointed out that the sample size depends on the confidence level and the bound on the error of estimation that the statistics practitioner is willing to tolerate. When the parameter to be estimated is a proportion, the bound on the error of estimation is

$$B = z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}$$

Solving for n , we produce the required sample size as indicated in the box.

Sample Size to Estimate a Proportion

$$n = \left(\frac{z_{\alpha/2} \sqrt{\hat{p}(1 - \hat{p})}}{B} \right)^2$$

To illustrate the use of this formula, suppose that in a brand-preference survey we want to estimate the proportion of consumers who prefer our company’s brand to within .03

with 95% confidence. This means that the bound on the error of estimation is $B = .03$. Because $1 - \alpha = .95$, $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$,

$$n = \left(\frac{1.96 \sqrt{\hat{p}(1 - \hat{p})}}{.03} \right)^2$$

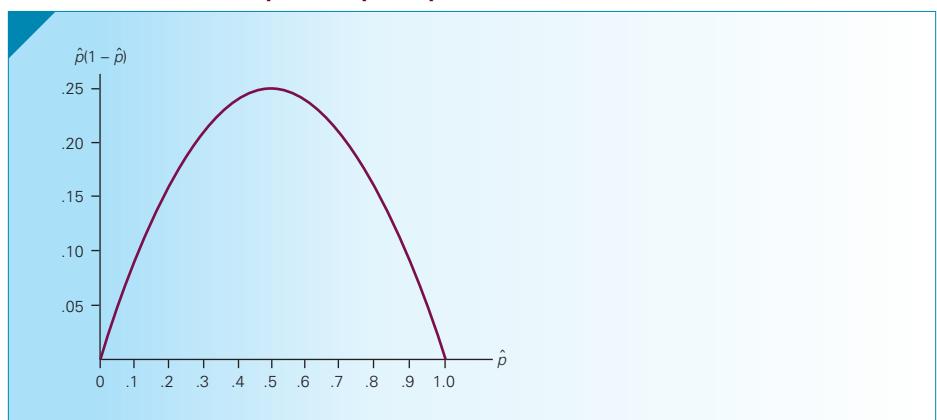
To solve for n , we need to know \hat{p} . Unfortunately, this value is unknown, because the sample has not yet been taken. At this point, we can use either of two methods to solve for n .

Method 1 If we have no knowledge of even the approximate value of \hat{p} , we let $\hat{p} = .5$. We choose $\hat{p} = .5$ because the product $\hat{p}(1 - \hat{p})$ equals its maximum value at $\hat{p} = .5$. (Figure 12.6 illustrates this point.) This, in turn, results in a conservative value of n ; as a result, the confidence interval will be no wider than the interval $\hat{p} \pm .03$. If, when the sample is drawn, \hat{p} does not equal $.5$, the confidence interval estimate will be better (that is, narrower) than planned. Thus,

$$n = \left(\frac{1.96 \sqrt{(.5)(.5)}}{.03} \right)^2 = (32.67)^2 = 1,068$$

If it turns out that $\hat{p} = .5$, the interval estimate is $\hat{p} \pm .03$. If not, the interval estimate will be narrower. For instance, if it turns out that $\hat{p} = .2$, then the estimate is $\hat{p} \pm .024$, which is better than we had planned.

FIGURE 12.6 Plot of \hat{p} versus $\hat{p}(1 - \hat{p})$



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Method 2 If we have some idea about the value of \hat{p} , we can use that quantity to determine n . For example, if we believe that \hat{p} will turn out to be approximately $.2$, we can solve for n as follows:

$$n = \left(\frac{1.96 \sqrt{(.2)(.8)}}{.03} \right)^2 = (26.13)^2 = 683$$

Notice that this produces a smaller value of n (thus reducing sampling costs) than does method 1. If \hat{p} actually lies between $.2$ and $.8$, however, the estimate will not be as good as we wanted, because the interval will be wider than desired.

Method 1 is often used to determine the sample size used in public opinion surveys reported by newspapers, magazines, television, and radio. These polls usually

estimate proportions to within 3%, with 95% confidence. (The media often state the confidence level as “19 times out of 20.”) If you’ve ever wondered why opinion polls almost always estimate proportions to within 3%, consider the sample size required to estimate a proportion to within 1%:

$$n = \left(\frac{1.96\sqrt{(.5)(.5)}}{.01} \right)^2 = (98)^2 = 9,604$$

The sample size 9,604 is 9 times the sample size needed to estimate a proportion to within 3%. Thus, to divide the width of the interval by 3 requires multiplying the sample size by 9. The cost would also increase considerably. For most applications, the increase in accuracy (created by decreasing the width of the confidence interval estimate) does not overcome the increased cost. Confidence interval estimates with 5% or 10% bounds (sample sizes 385 and 97, respectively) are generally considered too wide to be useful. Thus, the 3% bound provides a reasonable compromise between cost and accuracy.

12-3g Wilson Estimators (Optional)

When using the confidence interval estimator of a proportion when success is a relatively rare event, it is possible to find no successes, especially if the sample size is small. To illustrate, suppose that a sample of 100 produced $x = 0$, which means that $\hat{p} = 0$. The 95% confidence interval estimator of the proportion of successes in the population becomes

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} = 0 \pm 1.96 \sqrt{\frac{0(1 - 0)}{100}} = 0 \pm 0$$

This implies that if we find no successes in the sample, then there is no chance of finding a success in the population. Drawing such a conclusion from virtually any sample size is unacceptable. The remedy may be a suggestion made by Edwin Wilson in 1927. The Wilson estimate denoted \tilde{p} (pronounced “ p tilde”) is computed by adding 2 to the number of successes in the sample and 4 to the sample size. Thus,

$$\tilde{p} = \frac{x + 2}{n + 4}$$

The standard error of \tilde{p} is

$$\sigma_{\tilde{p}} = \sqrt{\frac{\tilde{p}(1 - \tilde{p})}{n + 4}}$$

Confidence Interval Estimator of p Using the Wilson Estimate

$$\tilde{p} \pm z_{\alpha/2} \sqrt{\frac{\tilde{p}(1 - \tilde{p})}{n + 4}}$$

Exercises 12.88 to 12.90 require the use of this technique.

We complete this section by reviewing the factors that tell us when to test and estimate a population proportion.

Factors That Identify the z -Test and Interval Estimator of p

1. **Problem objective:** Describe a population
2. **Data type:** Nominal

**EXERCISES**

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**DO-IT-YOURSELF EXCEL****Construct Excel spreadsheets that perform the following techniques**

12.80 z -test of p . Inputs: sample proportion, sample size, and hypothesized proportion. Outputs: Test statistic, critical values, and one- and two-tail p -values. Tools: **NORMINV, NORMSDIST**

12.81 z -estimate of p . Inputs: sample proportion, sample size, and confidence level. Outputs: Upper and lower confidence limits. Tools: **NORMINV**

Developing an Understanding of Statistical Concepts

Exercises 12.82 to 12.85 are “what-if analyses” designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually or using your Do-It-Yourself Excel spreadsheets.

- 12.82** a. In a random sample of 200 observations, we found the proportion of successes to be 48%. Estimate with 95% confidence the population proportion of successes.

- b. Repeat part (a) with $n = 500$.
c. Repeat part (a) with $n = 1000$.
d. Describe the effect on the confidence interval estimate of increasing the sample size.

- 12.83** a. The proportion of successes in a random sample of 400 was calculated as 50%. Estimate the population proportion with 95% confidence.

- b. Repeat part (a) with $\hat{p} = 33\%$.
c. Repeat part (a) with $\hat{p} = 10\%$.
d. Discuss the effect on the width of the confidence interval estimate of reducing the sample proportion.

- 12.84** a. Calculate the p -value of the test of the following hypotheses given that $\hat{p} = .63$ and $n = 100$:

$$\begin{aligned} H_0: p &= .60 \\ H_1: p &> .60 \end{aligned}$$

- b. Repeat part (a) with $n = 200$.

- c. Repeat part (a) with $n = 400$.
d. Describe the effect on the p -value of increasing the sample size.

- 12.85** a. A statistics practitioner wants to test the following hypotheses:

$$\begin{aligned} H_0: p &= .70 \\ H_1: p &> .70 \end{aligned}$$

A random sample of 100 produced $\hat{p} = .73$. Calculate the p -value of the test.

- b. Repeat part (a) with $\hat{p} = .72$.
c. Repeat part (a) with $\hat{p} = .71$.
d. Describe the effect on the z -statistic and its p -value of decreasing the sample proportion.

- 12.86** Determine the sample size necessary to estimate a population proportion to within .03 with 90% confidence assuming you have no knowledge of the approximate value of the sample proportion.

- 12.87** Suppose that you used the sample size calculated in Exercise 12.86 and found $\hat{p} = .5$.

- a. Estimate the population proportion with 90% confidence.
b. Is this the result you expected? Explain.

- 12.88** Suppose that you used the sample size calculated in Exercise 12.86 and found $\hat{p} = .75$.

- a. Estimate the population proportion with 90% confidence.

- b. Is this the result you expected? Explain.
 - c. If you were hired to conduct this analysis, would the person who hired you be satisfied with the interval estimate you produced? Explain.
- 12.89** Re-do Exercise 12.86 assuming that you know that the sample proportion will be no less than .75.
- 12.90** Suppose that you used the sample size calculated in Exercise 12.89 and found $\hat{p} = .75$.
- Estimate the population proportion with 90% confidence.
 - Is this the result you expected? Explain.
- 12.91** Suppose that you used the sample size calculated in Exercise 12.89 and found $\hat{p} = .92$.
- Estimate the population proportion with 90% confidence.
 - Is this the result you expected? Explain.
 - If you were hired to conduct this analysis, would the person who hired you be satisfied with the interval estimate you produced? Explain.
- 12.92** Suppose that you used the sample size calculated in Exercise 12.89 and found $\hat{p} = .5$.
- Estimate the population proportion with 90% confidence.
 - Is this the result you expected? Explain.
 - If you were hired to conduct this analysis, would the person who hired you be satisfied with the interval estimate you produced? Explain.

Applications

- 12.93** A statistics practitioner working for major league baseball wants to supply radio and television commentators with interesting statistics. He observed several hundred games and counted the number of times a runner on first base attempted to steal second base. He found there were 373 such events of which 259 were successful. Estimate with 95% confidence the proportion of all attempted thefts of second base that are successful.
- 12.94** In some states, the law requires drivers to turn on their headlights when driving in the rain. A highway patrol officer believes that less than one-quarter of all drivers follow this rule. As a test, he randomly samples 200 cars driving in the rain and counts the number whose headlights are turned on. He finds this number to be 41. Does the officer have enough evidence at the 10% significance level to support his belief?
- 12.95** A dean of a business school wanted to know whether the graduates of her school used a statistical inference technique during their first year of employment after graduation. She surveyed 314 graduates and asked about the use of statistical techniques. After tallying up the responses, she found that 204

used statistical inference within one year of graduation. Estimate with 90% confidence the proportion of all business school graduates who use their statistical education within a year of graduation.

- 12.96** Has the recent drop in airplane passengers resulted in better on-time performance? Before the recent downturn one airline bragged that 92% of its flights were on time. A random sample of 165 flights completed this year reveals that 153 were on time. Can we conclude at the 5% significance level that the airline's on-time performance has improved?
- 12.97** What type of educational background do CEOs have? In one survey, 344 CEOs of medium and large companies were asked whether they had an MBA degree. There were 97 MBAs. Estimate with 95% confidence the proportion of all CEOs of medium and large companies who have MBAs.
- 12.98** The GO transportation system of buses and commuter trains operates on the honor system. Train travelers are expected to buy their tickets before boarding the train. Only a small number of people will be checked on the train to see whether they bought a ticket. Suppose that a random sample of 400 train travelers was sampled and 68 of them had failed to buy a ticket. Estimate with 95% confidence the proportion of all train travelers who do not buy a ticket.
- 12.99** Refer to Exercise 12.98. Assuming that there are 1 million travelers per year and the fare is \$3.00 estimate with 95% confidence the amount of revenue lost each year.
- The following three exercises require the use of the Wilson Estimator:*
- 12.100** In Chapter 6, we discussed how an understanding of probability allows one to properly interpret the results of medical screening tests. The use of Bayes's Law requires a set of prior probabilities, which are based on historical records. Suppose that a physician wanted to estimate the probability that a woman under 35 years of age would give birth to a Down syndrome baby. She randomly sampled 200 births and discovered only one such case. Use the Wilson estimator to produce a 95% confidence interval estimate of the proportion of women under 35 who will have a Down syndrome baby.
- 12.101** Spam is of concern to anyone with an e-mail address. Several companies offer protection by eliminating spam e-mails as soon as they hit an inbox. To examine one such product, a manager randomly sampled his daily e-mails for 50 days after installing spam software. A total of 374 e-mails were received, of which 3 were spam. Use the Wilson estimator to estimate with 90% confidence the proportion of spam e-mails that get through.

- 12.102** A management professor was in the process of investigating the relationship between education and managerial level achieved. The source of his data was a survey of 385 CEOs of medium and large companies. He discovered that there was only 1 CEO who did not have at least one university degree. Estimate (using a Wilson estimator) with 99% confidence the proportion of CEOs of medium and large companies with no university degrees.

The following exercises require the use of a computer and software. The answers to Exercises 12.103 to 12.116 may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level for all tests.

- 12.103** **Xr12-103** A national survey conducted by Pew Research asked a random sample of 974 American adults how they felt about doing their taxes. The responses are: 1 = Love it, 2 = Like it, 3 = Neither like nor dislike it, 4 = Dislike it, 5 = Hate it. There are 234,564,000 American adults. Estimate with 95% confidence the number of American adults who hates doing their taxes.

- 12.104** **Xr12-104** Refer to Exercise 12.103. Those who hate or dislike doing their taxes were asked the reason. The responses are: 1 = Pay too much taxes, 2 = Complicated/too much paperwork, 3 = Inconvenient/time consuming, 4 = Don't like how government uses tax money, 5 = Owe the government money. 6 = Other. Estimate with 95% confidence the fraction of American adults who had indicated that they hated or disliked doing their taxes who hated or disliked it because they don't like how the government uses tax money.

- 12.105** **Xr12-105*** There is a looming crisis in universities and colleges across North America. In most places enrollments are increasing requiring more instructors. However, there are not enough PhDs to fill the vacancies now. Moreover, among current professors, a large proportion are nearing retirement age. On top of these problems, some universities allow professors over the age of 60 to retire early. To help devise a plan to deal with the crisis, a consultant surveyed 521 55- to 64-year-old professors and asked each whether he or she intended to retire before 65. The responses are 1 = No and 2 = Yes. Estimate with 95% confidence the proportion of professors who plan on early retirement.

- 12.106** Refer to Exercise 12.105. If the number of professors between the ages of 55 and 64 is 75,000, estimate the total number of such professors who plan to retire early.

- 12.107** **Xr12-107** According to the Internal Revenue Service (IRS) in 2009 the top 5% of American income earners earned more than \$153,542 and the top

1% earned more than \$388,806. The top 1% pay slightly more than 40% of all federal income taxes. To determine whether Americans are aware of these figures Investor's Business Daily randomly sampled American adults and asked "What share do you think the rich (earning more than \$388,806) pay in income taxes. The categories are 1. 0% to 10%, 2. 10 to 20%, 3. 20% to 30%, 4. 30% to 40%, 5. Over 40%. The data are stored using the codes 1 to 5. Estimate with 95% confidence the proportion of Americans who knew that the rich pay more than 40% of all federal income taxes.

- 12.108** **Xr12-108** The results of an annual Claimant Satisfaction Survey of policyholders who have had a claim with State Farm Insurance Company revealed a 90% satisfaction rate for claim service. To check the accuracy of this claim, a random sample of State Farm claimants was asked to rate whether they were satisfied with the quality of the service (1 = Satisfied and 2 = Unsatisfied). Can we infer that the satisfaction rate is less than 90%?

- 12.109** **Xr12-109** An increasing number of people are giving gift certificates as Christmas presents. To measure the extent of this practice, a random sample of people was asked (survey conducted December 26–29) whether they had received a gift certificate for Christmas. The responses are recorded as 1 = No and 2 = Yes. Estimate with 95% confidence the proportion of people who received a gift certificate for Christmas.

- 12.110** **Xr12-110*** An important decision faces Christmas holiday celebrators: buy a real or artificial tree? A sample of 1,508 male and female respondents 18 years of age and over was interviewed. Respondents were asked whether they preferred a real (1) or artificial (2) tree. If there are 6 million Canadian households that buy Christmas trees, estimate with 95% confidence the total number of Canadian households that would prefer artificial Christmas trees.

- 12.111** **Xr12-111*** Because television audiences of newscasts tend to be older (and because older people suffer from a variety of medical ailments) pharmaceutical companies' advertising often appears on national news in the three networks (ABC, CBS, and NBC). The ads concern prescription drugs such as those to treat heartburn. To determine how effective the ads are, a survey was undertaken. Adults over 50 who regularly watch network newscasts were asked whether they had contacted their physician to ask about one of the prescription drugs advertised during the newscast. The responses (1 = No and 2 = Yes) were recorded. Estimate with 95% confidence the fraction of adults over 50 who have contacted their physician to inquire about a prescription drug.

- 12.112** *Xr12-112* A professor of business statistics recently adopted a new textbook. At the completion of the course, 100 randomly selected students were asked to assess the book. The responses are as follows:

Excellent (1), Good (2), Adequate (3), Poor (4)

The results are stored using the codes in parentheses. Do the data allow us to conclude that more than 50% of all business students would rate the book as excellent?

- 12.113** Refer to Exercise 12.112. Do the data allow us to conclude that more than 90% of all business students would rate it as at least adequate?

- 12.114** *Xm12-00* Refer to the chapter-opening example. Estimate with 95% confidence the number of Americans 18 to 49 years old who were tuned to the *American Idol*.

- 12.115** *Xr12-115* According to the American Contract Bridge League (ACBL) bridge hands that contain two 4-card suits, one 3-card suit and one 2-card suit (4-4-3-2) occur with 21.55% probability. Suppose that a bridge-playing statistics profess with much

too much time on his hands tracked the number of hands over a one-year period and recorded the following hands with 4-4-3-2 distribution (Code 2) and some other distribution (Code 1). All hands were shuffled and dealt by the players at a bridge club. Test to determine whether the proportion of 4-4-3-2 hands differs from the theoretical probability. If the answer is yes, propose a reason to explain the result.

- 12.116** *Xr12-116* Chlorofluorocarbons (CFCs) are used in air conditioners. However, CFCs damage the ozone layer, which protects us from the sun's harmful rays. As a result many jurisdictions have banned the production and use of CFCs. The latest jurisdiction to do so is the province of Ontario, which has banned the use of CFCs in car and truck air conditioners. However, it is not known how many vehicles will be affected by the new legislation. A survey of 650 vehicles was undertaken. Each vehicle was identified as either using CFCs (2) or not (1). If there are 5 million vehicles registered in Ontario, estimate with 95% confidence the number of vehicles affected by the new law.



GENERAL SOCIAL SURVEY EXERCISES

Exercises 12.117 to 12.124 are based on the 2012 survey and Exercises 12.125 to 12.132 are based on the 2010 survey. Excel users should recall that there are empty cells (representing missing data) that must be removed. **Conduct all tests at the 5% significance level.**

Note: In 2010 (last year available), there were 234,564,000 American adults (18 years of age and older).

Source: *Statistical Abstract of the United States*, 2012, Table 7.

- 12.117** *GSS2012** Estimate with 95% confidence the number of American adults in 2012 who did not finish high school (DEGREE: 0 = Left high school, 1 = High school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree).

- 12.118** *GSS2012** a. Estimate with 90% confidence the number of American adults who were working full time.
b. Estimate with 95% confidence the number of American adults who were unemployed, or laid off. (WRKSTAT: 1 = Working full time, 2 = Working part time, 3 = Temporarily not working, 4 = Unemployed, laid off, 5 = Retired, 6 = School, 7 = Keeping house, 8 = Other)

- 12.119** *GSS2012** Can we infer that more than 10% of Americans are self-employed (WRKSLF: 1 = Self employed, 2 = Someone else)?

- 12.120** *GSS2012** Are you employed by the federal, state, or local government, or by a private employer (WRKGVT)? 1 = Government, 2 = Private. Estimate with 90% confidence the number of Americans who work for government.

- 12.121** *GSS2012** Estimate with 99% confidence the number of Americans who support the Republican party (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican).

- 12.122** *GSS2012** Among Democratic and Republican party supporters only can we conclude that there are less Republican party supporters than Democratic party supporters (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican, 7 = other)?

- 12.123** *GSS2012** Estimate with 95% confidence the number of Americans who consider themselves conservative (POLVIEW3: 1 = liberal, 2 = moderate, 3 = conservative).

- 12.124** *GSS2012** Among conservatives and liberals only is there sufficient evidence to conclude that there are more conservatives (POLVIEWS3: 1 = liberal, 2 = moderate, 3 = conservative)?

Conduct all tests at the 5% significance level.

- 12.125 **GSS2010*** Estimate with 95% confidence the number of American adults who consider themselves political independents (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican).
- 12.126 **GSS2010*** Estimate with 95% confidence the number of Americans who consider themselves moderates (POLVIEW3: 1 = liberal, 2 = moderate, 3 = conservative).
- 12.127 **GSS2010*** Among conservatives and moderates only is there sufficient evidence to conclude that there are more moderates than conservatives (POLVIEW3: 1 = liberal, 2 = moderate, 3 = conservative)?
- 12.128 **GSS2010*** Estimate with 95% confidence the number of American adults in 2012 who finished high school only (DEGREE: 0 = Left high school, 1 = High school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree)

- 12.129 **GSS2010*** Estimate with 95% confidence the number of American adults who work for themselves (WRKSLF: 1 = Self employed, 2 = Someone else).

- 12.130 **GSS2010*** Estimate with 90% confidence the number of American adults who were working part time (WRKSTAT: 1 = Working full time, 2 = Working part time, 3 = Temporarily not working, 4 = Unemployed, laid off, 5 = Retired, 6 = School, 7 = Keeping house, 8 = Other).

- 12.131 **GSS2010*** Estimate with 95% confidence the number of American adults who work in the private sector (WRKGGOVT): 1 = Government, 2 = Private).

- 12.132 **GSS2010*** Is there sufficient evidence to conclude that more than 33% of American adults have at least a Bachelor's degree (DEGREE: 0 = Left high school, 1 = High school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users please note that there are empty cells representing missing data that must be removed. Conduct all tests at the 5% significance level.

Note: In 2010 (last year available), there were 234,564,000 American adults (18 years of age and older).

(Source: Statistical Abstract of the United States, 2012, Table 7.)

- 12.133 **ANES2008*** Is there sufficient evidence to infer that in 2008 more Americans see themselves as Democrats than Republicans (PARTY3: 1 = Democrat, 2 = Republican, 3 = Independent)?

- 12.134 **ANES2008*** Can we infer that in 2008 more Americans perceived themselves as conservative than liberal (LIBCON3: 1 = liberal, 2 = moderate, 3 = conservative)?

- 12.135 **ANES2008*** Estimate with 95% confidence the number of American adults who do not have health insurance (HEALTH: 1 = Yes, 5 = No).

12-4 / (OPTIONAL) APPLICATIONS IN MARKETING: MARKET SEGMENTATION

Mass marketing refers to the mass production and marketing by a company of a single product for the entire market. Mass marketing is especially effective for commodity goods such as gasoline, which are very difficult to differentiate from the competition, except through price and convenience of availability. Generally speaking, however, mass marketing has given way to target marketing, which focuses on satisfying the demands of a particular segment of the entire market. For example, the Coca-Cola Company has moved from the mass marketing of a single beverage to the production of several different beverages. Among the cola products are Coca-Cola Classic, Diet Coke, and Caffeine-Free Diet Coke. Each product is aimed at a different market segment.

Because there is no single way to segment a market, managers must consider several different variables (or characteristics) that could be used to identify segments. Surveys of customers are used to gather data about various aspects of the market, and statistical techniques are applied to define the segments. Market segmentation separates consumers of a product into different groups in such a way that members of each group are similar to each other, and there are differences between groups. Market segmentation grew out of the realization that a single product can seldom satisfy the needs and wants of all consumers. Managers must then formulate a strategy to target these profitable segments, using the four elements of the marketing mix: product, pricing, promotion, and placement.

There are many ways to segment a market. Table 12.1 lists several different segmentation variables and their market segments. For example, car manufacturers can use education levels to segment the market. It is likely that high school graduates would be quite similar to others in this group and that members of this group would differ from university graduates. We would expect those differences to include the types and brands of cars each group would choose to buy. However, it is likely that income level would differentiate more clearly between segments. Statistical techniques can be used to help determine the best way to segment the market. These statistical techniques are more advanced than this textbook. Consequently, we will focus our attention on other statistical applications.

TABLE 12.1 Market Segmentation

SEGMENTATION VARIABLE	SEGMENTS
Geographic	
Countries	Brazil, Canada, China, France, United States
Country regions	Midwest, Northeast, Southwest, Southeast
Demographic	
Age	Under 5, 5–12, 13–19, 20–29, 30–50, older than 50
Education	Some high school, high school graduate, some college, college or university graduate
Income	Under \$20,000, \$20,000–\$29,999, \$30,000–\$49,999, more than \$50,000
Marital status	Single, married, divorced, widowed
Social	
Religion	Catholic, Protestant, Jewish, Muslim, Buddhist
Class	Upper class, middle class, working class, lower class
Behavior	
Media usage	TV, Internet, newspaper, magazine
Payment method	Cash, check, Visa, Mastercard

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It is important for marketing managers to know the size of the segment because the size (among other parameters) determines its profitability. Not all segments are worth pursuing. In some instances, the size of the segment is too small or the costs of satisfying it may be too high. The size can be determined in several ways. The census provides useful information. For example, we can determine the number of Americans in various age categories or the size of geographic residences. For other segments, we may need to survey members of a general population and use the inferential techniques introduced in the previous section, where we showed how to estimate the total number of successes.

In Section 12-3, we showed how to estimate the total number of successes in a large finite population. The confidence interval estimator is

$$N\left(\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}\right)$$

The following example demonstrates the use of this estimator in market segmentation.

EXAMPLE 12.6

DATA
Xm12-06*

Segmenting the Breakfast Cereal Market

In segmenting the breakfast cereal market, a food manufacturer uses health and diet consciousness as the segmentation variable. Four segments are developed:

1. Concerned about eating healthy foods
2. Concerned primarily about weight
3. Concerned about health because of illness
4. Unconcerned

To distinguish between groups, surveys are conducted. On the basis of a questionnaire, people are categorized as belonging to one of these groups. A recent survey asked a random sample of 1,250 American adults (18 and older) to complete the questionnaire. The categories were recorded using the codes. The most recent census reveals that 234,564,000 Americans are 18 and older. Estimate with 95% confidence the number of American adults who are concerned about eating healthy foods.

SOLUTION:

IDENTIFY

The problem objective is to describe the population of American adults. The data are nominal. Consequently, the parameter we wish to estimate is the proportion p of American adults who classify themselves as concerned about eating healthy. The confidence interval estimator we need to employ is

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}}$$

from which we will produce the estimate of the size of the market segment.

COMPUTE

MANUALLY:

To solve manually, we count the number of 1s in the file. We find this value to be 269. Thus,

$$\hat{p} = \frac{x}{n} = \frac{269}{1,250} = .2152$$

The confidence level is $1 - \alpha = .95$. It follows that $\alpha = .05$, $\alpha/2 = .025$, and $z_{\alpha/2} = z_{.025} = 1.96$. The 95% confidence interval estimate of p is

$$\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} = .2152 \pm 1.96 \sqrt{\frac{(0.2152)(1 - 0.2152)}{1,250}} = .2152 \pm .0228$$

LCL = .1924 UCL = .2380

EXCEL

	A	B
1	z-Estimate: Proportion	
2		<i>Group</i>
3	Sample Proportion	0.2152
4	Observations	1250
5	LCL	0.1924
6	UCL	0.2380

MINITAB

Test and CI for One Proportion:

Sample X N Sample p 95% CI
 1 269 1250 0.215200 (0.192418, 0.237982)

Using the normal approximation.

INTERPRET

We estimate that the proportion of American adults who are in group 1 lies between .1924 and .2380. Because there are 234,564,000 adults in the population, we estimate that the number of adults who belong to group 1 falls between

$$\text{LCL} = N \left[\hat{p} - z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} \right] = 234,564,000(.1924) = 45,130,114$$

and

$$\text{UCL} = N \left[\hat{p} + z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} \right] = 234,564,000(.2380) = 55,826,232$$

We will return to the subject of market segmentation in other chapters where we demonstrate how statistics can be used to determine whether differences actually exist between segments.



EXERCISES

The following exercises may be solved manually. See Appendix A for the sample statistics.

- 12.136** *Xr12-136* A new credit card company is investigating various market segments to determine whether it is profitable to direct its advertising specifically at each one. One of the market segments is composed of Hispanic people. The latest census indicates that there are 31,669,000 Hispanic adults (18 and over) people in the United States. A survey of 475 Hispanics asked each how they usually pay for products that they purchase. The responses are:

1. Cash
2. Check
3. Visa
4. MasterCard
5. Other credit card

Estimate with 95% confidence the number of Hispanics in the United States who usually pay by credit card.

Source: Statistical Abstract of the United States 2012, Table 10.

- 12.137** *Xr12-137** A California university is investigating expanding its evening programs. It wants to target people between 25 and 55 years old who have completed high school but did not complete college or university. To help determine the extent and type of offerings, the university needs to know the size of its target market. A survey of 320 California adults was drawn and each person was asked to identify his or her highest educational attainment. The responses are:

1. Did not complete high school
2. Completed high school only
3. Some college or university
4. College or university graduate

The *Statistical Abstract of the United States* (2012, Table 16) indicates that there are 15,753,000 Californians between the ages of 25 and 55. Estimate with 95% confidence the number of Californians between 25 and 55 years of age who are in the market segment the university wishes to target.

- 12.138** *Xr12-138** The JC Penney department store chain segments the market for women's apparel by its identification of values. The three segments are:

1. Conservative
2. Traditional
3. Contemporary

Questionnaires about personal and family values are used to identify which segment a woman falls into. Suppose that the questionnaire was sent to a random sample of 1,836 women. Each woman was classified using the codes 1, 2, and 3. The latest census reveals that there are 120,728,000 adult women in the United States. Use a 95% confidence level.

- a. Estimate the proportion of adult American women who are classified as traditional.
- b. Estimate the size of the traditional market segment.

Source: Statistical Abstract of the United States, 2012, Table 7.

- 12.139** *Xr12-139* Most life insurance companies are leery about offering policies to people over 64. When they do the premiums must be high enough to overcome the predicted length of life. The president of one life insurance company was thinking about offering special discounts to Americans over 64 who held full-time jobs. The plan was based on the belief that full-time workers over 64 are likely to be in good health and would likely live well into their eighties. To help decide what to do, he organized a survey of a random sample of the 40,268,000 American adults over 64. He asked a random sample of 325 Americans over 64 whether they currently hold a full-time job (1 = No and 2 = Yes).

- a. Estimate with 95% confidence the size of this market segment.
- b. Write a report to the executives of an insurance company detailing your statistical analysis.

Source: Statistical Abstract of the United States, 2012, Table 7.

- 12.140** *Xr12-140* An advertising company was awarded the contract to design advertising for Rolls Royce automobiles. An executive in the firm decided to pitch the product not only to the affluent in the United States but also to those who think they are in the top 1% of income earners in the country. A survey was undertaken, which among other questions asked respondents 25 and over where their annual income ranked. The following responses were given.

- 1 = Top 1%
- 2 = Top 5% but not top 1%
- 3 = Top 10% but not top 5%
- 4 = Top 25% but not top 10%
- 5 = Bottom 75%

Estimate with 90% confidence the number of Americans 25 and over who believe they are in the top 1% of income earners. The number of Americans over 25 is 203,882,000.

Source: Statistical Abstract of the United States, 2012, Table 7.

- 12.141 Xr12-141** Suppose the survey in the previous exercise also asked those who were not in the top 1% whether

they believed that within 5 years they would be in the top 1% (1 = will not be in top 1% within 5 years and 2 = will be in top 1% within 5 years). Estimate with 95% confidence the number of Americans who believe that they will be in the top 1% of income earners within 5 years.

CHAPTER SUMMARY

The inferential methods presented in this chapter address the problem of describing a single population. When the data are interval, the parameters of interest are the population mean μ and the population variance σ^2 . The Student t -distribution is used to test and estimate the mean when the population standard deviation is unknown. The chi-squared distribution is used to make inferences about a population variance. When the data are nominal, the parameter

to be tested and estimated is the population proportion p . The sample proportion follows an approximate normal distribution, which produces the test statistic and the interval estimator. We also discussed how to determine the sample size required to estimate a population proportion. We introduced market segmentation and described how statistical techniques presented in this chapter can be used to estimate the size of a segment.

IMPORTANT TERMS:

t -statistic	387
Student t -distribution	387

Robust	393
Chi-squared statistic	401

SYMBOLS:

Symbol	Pronounced	Represents
ν	nu	Degrees of freedom
χ^2	chi squared	Chi-squared statistic
\hat{p}	p hat	Sample proportion
\tilde{p}	p tilde	Wilson estimator

FORMULAS:

Test statistic for μ

$$t = \frac{\bar{x} - \mu}{s/\sqrt{n}}$$

Confidence interval estimator of μ

$$\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}}$$

Test statistic for σ^2

$$\chi^2 = \frac{(n-1)s^2}{\sigma^2}$$

Confidence interval estimator of σ^2

$$\text{LCL} = \frac{(n-1)s^2}{\chi^2_{\alpha/2}}$$

$$\text{UCL} = \frac{(n-1)s^2}{\chi^2_{1-\alpha/2}}$$

Test statistic for p

$$z = \frac{\hat{p} - p}{\sqrt{p(1-p)/n}}$$

Confidence interval estimator of p

$$\hat{p} \pm z_{\alpha/2} \sqrt{\hat{p}(1-\hat{p})/n}$$

Sample size to estimate p

$$n = \left(\frac{z_{\alpha/2} \sqrt{\hat{p}(1 - \hat{p})}}{B} \right)^2$$

Wilson estimator

$$\tilde{p} = \frac{x + 2}{n + 4}$$

Confidence interval estimator of p using the Wilson estimator

$$\tilde{p} \pm z_{\alpha/2} \sqrt{\tilde{p}(1 - \tilde{p})/(n + 4)}$$

Confidence interval estimator of the total of a large finite population

$$N \left[\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}} \right]$$

Confidence interval estimator of the total number of successes in a large finite population

$$N \left[\hat{p} \pm z_{\alpha/2} \sqrt{\frac{\hat{p}(1 - \hat{p})}{n}} \right]$$

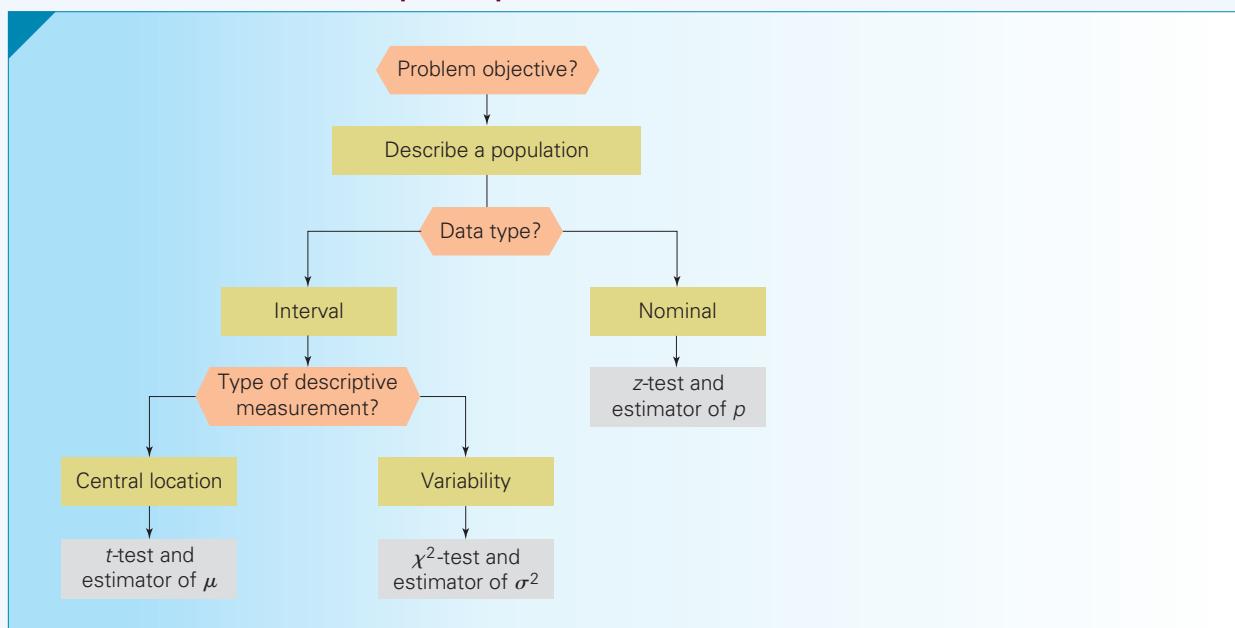
COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
t -test of μ	389	390
t -estimator of μ	392	392
Chi-squared test of σ^2	404	404
Chi-squared estimator of σ^2	406	406
z -test of p	412	413
z -estimator of p	426	426

We present the flowchart in Figure 12.7 as part of our ongoing effort to help you identify the appropriate statistical technique. This flowchart shows the techniques introduced in this chapter only. As we add new techniques in the

upcoming chapters, we will expand this flowchart until it contains all the statistical inference techniques covered in this book. Use the flowchart to select the correct method in the chapter exercises that follow.

FIGURE 12.7 Flowchart of Techniques: Chapter 12



CHAPTER EXERCISES

The following exercises require the use of a computer and software. Use a 5% significance level unless specified otherwise.

- 12.142** [Xr12-142](#) The National Hockey League's Florida Panthers play in the BB&T center. The cost of parking is \$20. However, Lexus occasionally pays the cost by offering free parking to drivers of Lexus cars. A statistician wanted to estimate the cost of this program. He randomly sampled 300 cars entering the parking lot and recorded whether the car was a Lexus (2) or not (1). By counting the number of empty parking spots he discovered that there were 4850 cars parked that night. Estimate with 95% confidence the amount of money Lexus had to pay the BB&T center.

- 12.143** [Xr12-143](#) Hazardous materials are constantly being around the country. To help determine how dangerous these events are a statistics practitioner recorded the distances of a random sample of trucks, trains, airplanes, and boats carrying explosives. Estimate with 95% confidence the mean distance.

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1071.

- 12.144** [Xr12-144](#) One of the issues that came up in a recent municipal election was the high cost of housing. A candidate seeking to unseat an incumbent claimed that the average family spends more than 30% of its annual income on housing. A housing expert was asked to investigate the claim. A random sample of 125 households was drawn, and each household was asked to report the percentage of household income spent on housing costs.

- Is there enough evidence to infer that the candidate is correct?
- Using a confidence level of 95%, estimate the mean percentage of household income spent on housing by all households.
- What is the required condition for the techniques used in Parts a and b? Use a graphical technique to check whether it is satisfied.

- 12.145** [Xr12-145](#) There are 604,474 bridges in the United States. A structural engineering team randomly sample 850 bridges and categorized each as either structurally deficient (restricted to light vehicles, require immediate rehabilitation to remain open, or are closed), functionally obsolete (load carrying capacity, clearance, or approach highway alignment, or structurally sound. These three categories were recorded as 1, 2, and 3, respectively.

- Estimate with 99% confidence the number of American bridges that are structurally deficient.
- Estimate with 90% confidence the number of American bridges that are functionally obsolete.

Source: U.S. Federal Highway Administration, Office of Bridge Technology

- 12.146** [Xr12-146](#) Robots are being used with increasing frequency on production lines to perform monotonous tasks. To determine whether a robot welder should replace human welders in producing automobiles, an experiment was performed. The time for the robot to complete a series of welds was found to be 38 seconds. A random sample of 20 workers was taken, and the time for each worker to complete the welds was measured. The mean was calculated to be 38 seconds, the same as the robot's time. However, the robot's time did not vary, whereas there was variation among the workers' times. An analysis of the production line revealed that if the variance exceeds 17 seconds², there will be problems. Perform an analysis of the data, and determine whether problems using human welders are likely.

- 12.147** [Xr12-147](#) According to FBI statistics, there were 342,000 robberies in the United States in 2009 (latest statistics available). A random sample of robberies was drawn and the amount of loss was recorded. Estimate with 95% confidence the total loss of all the robberies in the United States in 2009.

Source: Adapted from U.S. Department of Justice, Federal Bureau of Investigation, Uniform Crime Reports, Table 321.

- 12.148** [Xr12-148](#) Refer to Exercise 12.147. Also recorded was the weapon used (1 = firearm, 2 = knife or other cutting instrument, 3 = other, 4 = no weapon). Estimate with 90% confidence the number of crimes where a firearm was not used.

- 12.149** [Xr12-149](#) An important factor in attempting to predict the demand for new cars is the age of the cars already on the road. A random sample of 650 cars was drawn and the age of each car was recorded. Estimate with 99% confidence the age mean age of all American cars.

Source: R.L. Polk and Company.

- 12.150** [Xr12-150](#) Refer to Exercise 12.149. A sample of 425 pickup trucks and SUVs was drawn and the age of the vehicles was recorded. Estimate with 95% confidence the mean age of trucks and SUVs.

Source: R.L. Polk and Company.

- 12.151** [Xr12-151](#) Opinion Research International surveyed people whose household incomes exceed \$50,000 and asked each for their top money-related new year's resolutions. The responses are:

- Get out of credit card debt
- Retire before age 65
- Die broke

4. Make do with current finances
5. Look for higher paying job

Estimate with 90% confidence the proportion of people whose household incomes exceed \$50,000 whose top money-related resolution is to get out of credit card debt.

- 12.152** **Xr12-152** In a large state university (with numerous campuses), the marks in an introductory statistics course are normally distributed with a mean of 68%. To determine the effect of requiring students to pass a calculus test (which at present is not a prerequisite), a random sample of 50 students who have taken calculus is given a statistics course. The marks out of 100 were recorded.

- a. Estimate with 95% confidence the mean statistics mark for all students who have taken calculus.
- b. Do these data provide evidence to infer that students with a calculus background would perform better in statistics than students with no calculus?

- 12.153** **Xr12-153** A random sample of complaints about American airlines was drawn and the type of complaint was recorded (1 = Flight problems (cancellations, delays, etc.), 2 = Customer service (unhelpful employees, inadequate means, or cabin service, treatment of delayed passengers), 3 = Baggage, 4 = Ticketing/boarding, 5 = Other. Estimate with 95% confidence the proportion of airline complaints that are due customer service.

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1081.

- 12.154** **Xr12-154** There are 138,592,000 workers in the United States. An economist took a random sample of 550 workers and recorded how they commuted to work (1 = drive alone, 2 = car pool, 3 = public transportation, 4 = walked, 5 = other, and 6 = worked at home). Is there enough evidence to infer that more than 75% of workers drive alone to work?

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1100.

- 12.155** **Xr12-154** Refer to Exercise 12.154. Estimate with 95% confidence the number of workers who carpooled to work.

- 12.156** **Xr12-156** Refer to Exercise 12.154. Also recorded was the amount of time to commute to work on an average day. Estimate with 90% confidence the average commute time.

- 12.157** **Xr12-157** The routes of postal deliverers are carefully planned so that each deliverer works between 7 and 7.5 hours per shift. The planned routes assume an average walking speed of 2 miles per hour and no shortcuts across lawns. In an experiment to examine the amount of time deliverers actually spend

completing their shifts, a random sample of 75 postal deliverers was secretly timed.

- a. Estimate with 99% confidence the mean shift time for all postal deliverers.
- b. Check to determine whether the required condition for this statistical inference is satisfied.
- c. Is there enough evidence at the 10% significance level to conclude that postal workers are on average spending less than 7 hours per day doing their jobs?

- 12.158** **Xr12-158** A national health care system was an issue in recent presidential election campaign and is likely to be a subject of debate for many years. The issue arose because of the large number of Americans who have no health insurance. Under the present system, free health care is available to poor people, whereas relatively well-off Americans buy their own health insurance. Those who are considered working poor and who are in the lower-middle-class economic stratum appear to be most unlikely to have adequate medical insurance. To investigate this problem, a statistician surveyed 250 families whose gross income last year was between \$10,000 and \$25,000. Family heads were asked whether they have medical insurance coverage (2 = Has medical insurance and 1 = Doesn't have medical insurance). The statistics practitioner wanted an estimate of the fraction of all families whose incomes are in the range of \$10,000 to \$25,000 who have medical insurance. Perform the necessary calculations to produce an interval estimate with 90% confidence.

- 12.159** **Xr12-159** The manager of a branch of a major bank wants to improve service. She is thinking about giving \$1 to any customer who waits in line for a period of time that is considered excessive. (The bank ultimately decided that more than 8 minutes is excessive.) However, to get a better idea about the level of current service, she undertakes a survey of customers. A student is hired to measure the time spent waiting in line by a random sample of 50 customers. Using a stopwatch, the student determined the amount of time between the time the customer joined the line and the time he or she reached the teller. The times were recorded. Construct a 90% confidence interval estimate of the mean waiting time for the bank's customers.

- 12.160** **Xr12-160** Obesity is defined as having a Body Mass Index ($BMI = 30 \text{ grams/kilogram}^2$) over 30. A statistics practitioner took a random sample of American adults and classified their BMI as either 1. Under 20, 2. 20–30, 3. Over 30. There are 234,564,000 American adults. Estimate with 95% confidence the number of Americans who are obese.

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1342.

12.161 *Xr12-161* Engineers who are in charge of the production of springs used to make car seats are concerned about the variability in the length of the springs. The springs are designed to be 500 mm long. When the springs are too long, they will loosen and fall out. When they are too short, they will not fit into the frames. The springs that are too long and too short must be reworked at considerable additional cost. The engineers have calculated that a standard deviation of 2 mm will result in an acceptable number of springs that must be reworked. A random sample of 100 springs was measured. Can we infer at the 5% significance level that the number of springs requiring reworking is unacceptably large?

12.162 *Xr12-162* Refer to Exercise 12.161. Suppose the engineers recoded the data so that springs that were the correct length were recorded as 1, springs that were too long were recorded as 2, and springs that were too short were recorded as 3. Can we infer at the 10% significance level that less than 90% of the springs are the correct length?

12.163 *Xr12-163* An advertisement for a major home appliance manufacturer claims that its repair personnel are the loneliest in the world because its appliances require the smallest number of service calls. To examine this claim, a researcher drew a random sample of 100 owners of 5-year-old washing machines. The number of service calls made in the 5-year period were recorded. Find the 90% confidence interval estimate of the mean number of service calls for all 5-year-old washing machines.

12.164 *Xr12-164* An oil company sends out monthly statements to its customers who purchased gasoline and other items using the company's credit card. Until now, the company has not included a preaddressed envelope for returning payments. The average and the standard deviation of the number of days before payment is received are 9.8 and 3.2, respectively. As an experiment to determine whether enclosing preaddressed envelopes speeds up payment, 150 customers selected at random were sent preaddressed envelopes with their bills. The numbers of days to payment were recorded.

- Do the data provide sufficient evidence at the 10% level of significance to establish that enclosure of preaddressed envelopes improves the average speed of payments?
- Can we conclude at the 10% significance level that the variability in payment speeds decreases when a preaddressed envelope is sent?

12.165 *Xr12-165* A rock promoter is in the process of deciding whether to book a new band for a rock concert. He knows that this band appeals almost exclusively to teenagers. According to the latest census, there are 400,000 teenagers in the area. The

promoter decides to do a survey to try to estimate the proportion of teenagers who will attend the concert. How large a sample should be taken in order to estimate the proportion to within .02 with 99% confidence?

12.166 *Xr12-166* Exercise 12.165, suppose that the promoter decided to draw a sample of size 600 (because of financial considerations). Each teenager was asked whether he or she would attend the concert (2 = Yes, I will attend; 1 = No, I will not attend). Estimate with 95% confidence the number of teenagers who will attend the concert.

12.167 *Xr12-167* The owner of a downtown parking lot suspects that the person he hired to run the lot is stealing some money. The receipts as provided by the employee indicate that the average number of cars parked in the lot is 125 per day and that, on average, each car is parked for 3.5 hours. To determine whether the employee is stealing, the owner watches the lot for 5 days. On those days, the numbers of cars parked are as follows:

120 130 124 127 128

The time spent on the lot for the 629 cars that the owner observed during the 5 days was recorded. Can the owner conclude at the 1% level of significance that the employee is stealing? (*Hint:* Since there are two ways to steal, two tests should be performed.)

12.168 *Xr12-168* Jim Cramer hosts CNBC's "Mad Money" program. Mr. Cramer regularly makes suggestions about which stocks to buy and sell. How well has Mr. Cramer's picks performed over the past two years (2005 to 2007)? To answer the question a random sample of Mr. Cramer's picks was selected. The name of the stock, the buy price of the stock, the current or sold price and the percent return were recorded.

- Estimate with 95% confidence the mean return for all of Mr. Cramer's selections.
- Over the two-year period the Standard and Poor's 500 Index rose by 16%. Is there sufficient evidence to infer that Mr. Cramer's picks have done less well?

Source: YourMoneyWatch.com.

12.169 *Xr12-169** Unfortunately, it is not uncommon for high school students in the United States to carry weapons (guns, knives, or clubs). To determine how prevalent this practice is a survey of high school students was undertaken. Students were asked whether they carried a weapon at least once in the previous 30 days (1 = No, 2 = Yes). Estimate with 95% confidence the proportion of all high school students who have carried weapons in the last 30 days.

Source: Adapted from *Statistical Abstract of the United States, 2009*, Table 239.

- 12.170** [Xr12-170](#) In 2006, the average household debt service ratio for homeowners was 14.35. The household debt service ratio is the ratio of debt payments to disposable personal income. Debt payments consist of mortgage payments and payments on consumer debts. To determine whether this economic measure has increased a random sample of Americans was drawn. Can we infer from the data that the debt service ratio has increased since 2006?

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1175.

- 12.171** [Xr12-171](#) Refer to Exercise 12.170. Another measure of indebtedness is the financial obligations ratio, which adds automobile lease payments, rental on tenant occupied property, homeowners insurance, and property tax payments to the debt service ratio. In 2006, the ratio for homeowners was 17.62. Can we infer that financial obligations ratio for homeowners has increased between 2006 and this year?

Source: Adapted from *Statistical Abstract of the United States, 2009*, Table 1135.

- 12.172** [Xr12-172](#) Refer to Exercise 12.171. In 2006 the financial obligations ratio for renters was 25.97. Can we infer that financial obligations ratio for renters has increased between 2006 and this year 2009?

Source: Adapted from *Statistical Abstract of the United States 2009*, Table 1135.

- 12.173** [Xr12-173](#) In 2010, there were 117,538,000 households in the United States. There were 78,833,000 family households made up of married couples, single male, and single female households. To determine how many of each type a survey was undertaken. The results were stored using the codes 1 = married couple, 2 = single male, and 3 = single female. Estimate with 95% confidence the total number of American households with married couples.

Source: Adapted from *Statistical Abstract of the United States 2009*, Table 58.

- 12.174** [Xr12-174](#) Wages and salaries make up only part of a total compensation. Other parts include paid leave,

health insurance, and many others. In 2007, wages and salaries among manufacturers in the United States made up an average of 65.8% of total compensation. To determine if this changed in 2008 a random sample of manufacturing employees was drawn. Can we infer that percentage of total compensation for wages and salaries increased between 2007 and 2008?

Source: Adapted from *Statistical Abstract of the United States, 2009*, Table 970.

- 12.175** [Xr12-175](#) Several decades ago a large proportion of Americans smoked cigarettes. However, in recent years many adults have quit. To measure the extent of current smoking a random sample of American adults was asked to report whether they smoked (1 = yes, 2 = no). There are 234,564,000 American adults. Estimate with 95% confidence the number of American adults who smoke cigarettes.

Source: Adapted from *Statistical Abstract of the United States 2012*, Table 1343.

- 12.176** [Xr12-176](#) Unfortunately, robbery is an all-too-frequent crime. Bank robberies tend to be the most lucrative for criminals. In most cases banks do not report the size of the loss. However, several researchers were able to gain access to bank robberies in England. Here are the variables recorded:

Bank raid successful from the point of view of the robbers (2 = yes and 1 = no)

Amount stolen (for successful raids only)

Number of bank staff present

Number of customers present

If these data can be considered a random sample of British bank robberies estimate with 95% confidence the following parameters.

- a. Proportion of all bank robberies that are successful
- b. Mean amount stolen in successful robberies
- c. Mean number of bank staff present
- d. Mean number of customers present

Source: Adapted from Barry Reilly, Neil Rickman, and Robert Witt, "Robbing Banks," *Significance*, June 2012, Volume 9, Issue 3.

CASE 12.1

Pepsi's Exclusivity Agreement with a University

DATA
C12-01

In the last few years, colleges and universities have signed exclusivity agreements with a variety of private companies. These agreements bind the university to sell that

company's products exclusively on the campus. Many of the agreements involve food and beverage firms.

A large university with a total enrollment of about 50,000

students has offered Pepsi-Cola an exclusivity agreement that



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would give Pepsi exclusive rights to sell its products at all university facilities for the next year and an option for future years. In return, the university would receive 35% of the on-campus revenues and an additional lump sum of \$200,000 per year. Pepsi has been given 2 weeks to respond.

The management at Pepsi quickly reviews what it knows. The market for soft drinks is measured in terms of the equivalent of 12-ounce cans. Pepsi currently sells an average of 22,000 cans or their equivalents per week (over the 40 weeks of the year that the university operates). The cans sell for an average of one dollar each. The costs, including labor, amount to \$.30 per can. Pepsi is unsure of its market share but suspects it is considerably less than 50%. A quick analysis reveals that if its current market share were 25%, then with an exclusivity agreement Pepsi would sell 88,000 cans per week. Thus, annual sales would be 3,520,000 cans per year (calculated as 88,000 cans per week \times 40 weeks). The gross

revenue would be computed as follows*:

$$\text{Gross revenue} = 3,520,000 \text{ cans} \times \$1.00 \text{ revenue/can} = \$3,520,000$$

This figure must be multiplied by 65% because the university would rake in 35% of the gross. Thus, $65\% \times \$3,520,000 = \$2,288,000$. The total cost of 30 cents per can (or \$1,056,000) and the annual payment to the university of \$200,000 is subtracted to obtain the net profit:

$$\begin{aligned}\text{Net profit} &= \$2,288,000 - \$1,056,000 \\ &\quad - \$200,000 = \$1,032,000\end{aligned}$$

Its current annual profit is

$$\begin{aligned}\text{Current profit} &= 40 \text{ weeks} \times \\ &\quad 22,000 \text{ cans/week} \times \$0.70/\text{can} \\ &= \$616,000\end{aligned}$$

If the current market share is 25%, the potential gain from the agreement is

$$\$1,032,000 - \$616,000 = \$416,000$$

The only problem with this analysis is that Pepsi does not know how many soft drinks are sold weekly at the university. In addition, Coke is not likely to supply Pepsi with information about its sales, which

together with Pepsi's line of products constitutes virtually the entire market.

A recent graduate of a business program believes that a survey of the university's students can supply the needed information. Accordingly, she organizes a survey that asks 500 students to keep track of the number of soft drinks they purchase on campus over the next 7 days.

Perform a statistical analysis to extract the needed information from the data. Estimate with 95% confidence the parameter that is at the core of the decision problem.

Use the estimate to compute estimates of the annual profit.

Assume that Coke and Pepsi drinkers would be willing to buy either product in the absence of their first choice.

- On the basis of maximizing profits from sales of soft drinks at the university, should Pepsi agree to the exclusivity agreement?
- Write a report to the company's executives describing your analysis.

*We have created an Excel spreadsheet that does the calculations for this case. To access it, click **Excel Workbooks** and **Case 12.1**. The only cell you may alter is cell C3, which contains the average number of soft drinks sold per week per student, assuming a total of 88,000 drinks sold per year.

CASE 12.2**Pepsi's Exclusivity Agreement with a University: The Coke Side of the Equation****DATA
C12-01**

While the executives of Pepsi Cola are trying to decide what to do, the university informs them that a similar offer has gone out to the Coca-Cola Company. Furthermore, if both companies want exclusive rights, a bidding war will take

place. The executives at Pepsi would like to know how likely it is that Coke will want exclusive rights under the conditions outlined by the university.

Perform a similar analysis to the one you did in Case 12.1, but



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this time from Coke's point of view. Is it likely that Coke will want to conclude an exclusivity agreement with the university? Discuss the reasons for your conclusions.

Petrea Alexandru/E+/Getty Images

CASE 12.3**Estimating Total Medical Costs****DATA
C12-03**

Virtually all countries have universal government-run health-care systems. The United States is one notable exception. This is an issue in every election, with some politicians pushing for the United States to adopt a program similar to Canada's.

In Canada, hospitals are financed and administered by provincial governments. Physicians are paid by the government for each patient service. As a result, Canadians pay nothing for these services. The revenues that support the system are derived through income taxes, corporate taxes, and sales taxes.

Despite higher taxes in Canada than those in the United States, the

system is chronically underfunded, resulting in long waiting times for sometimes critical procedures. For example, in some provinces, newly diagnosed cancer victims must wait several weeks before treatments can begin. Virtually everyone agrees that more money is needed. No one can agree however, on how much is needed. Unfortunately, the problem is going to worsen. Canada, like the United States, has an aging population because of the large numbers of so-called baby boomers (those born between 1946 and 1966), and because medical costs are generally higher for older people.

One of the first steps in addressing the problem is to forecast

medical costs, particularly for the 20-year period starting when the first baby boomers reached age 60 (in 2006). A statistics practitioner has been given the task of making these predictions. Accordingly, random samples of four groups of Canadians were drawn. They are

Group	Ages
1	45–64
2	65–74
3	75–84
4	85+

The medical expenses for the previous 12 months were recorded and stored in columns 1 to 4, respectively, in C12-03.

Age Category	2016	2021	2026	2031	2035
45–64	10,094	10,054	9,892	9,823	10,150
65–74	3,375	4,023	4,538	4,874	4,675
75–84	1,745	2,087	2,666	3,209	3,669
85+	792	872	973	1,193	1,543

Source: Statistics Canada.

Projections for 2016, 2021, 2026, 2031, and 2036 of the numbers of Canadians (in thousands) in each age category are listed here.

- Determine the 95% confidence interval estimates of the mean medical costs for each of the four age categories.
- For each year listed, determine 95% confidence interval estimates of the total medical costs for Canadians 45 years old and older.

CASE 12.4 Estimating the Number of Alzheimer's Cases

As the U.S. population ages, the number of people needing medical care increases. Unless a cure is found in the next decade, one of the most expensive diseases requiring such care is Alzheimer's, a form of dementia. To estimate the total number of Alzheimer's cases in the future, a survey was undertaken. The survey determined the age bracket where $1 = 65\text{--}74$, $2 = 75\text{--}84$, $3 = 85$ and over and whether the individual had

Alzheimer's (1 = no and 2 = yes). (Adapted from the Alzheimer's Association, www.alz.org.)

Here are the projections for the number of Americans (thousands) in each of the three age categories.

Age Category	2015	2020	2025
65–74	26,967	32,312	36,356
75–84	13,578	15,895	20,312
85+	6,292	6,597	7,239

Source: *Statistical Abstract of the United States, 2009*, Table 8.

DATA
C12-04

CASE 12.5 Bias in Roulette Betting

The game of roulette consists of a wheel with 38 colored and numbered slots. The numbers are 1 to 36, 0 and 00. Half of the slots numbered 1 to 36 are red and the other half are black. The two "zeros" are green. The wheel is spun and an iron ball is rolled, which eventually comes to rest in one of the slots. Gamblers can make several different kinds of bets. Most players bet on one or more numbers or on a color (black or red). Here is the layout of the roulette betting table:

0	3	6	9	12	15	18	21	24	27	30	33	36
00	2	5	8	11	14	17	20	23	26	29	32	35
1	4	7	10	13	16	19	22	25	28	31	34	

Two statisticians recorded the bets on 904 spins. There were 21,731 bets.

Researchers wanted to use these data to examine *middle bias*, which is the tendency for guessers in multiple-choice exams to select the middle answers. For example, if there are five choices a, b, c, d, and e, guessers will tend to select answer c.

Most players stand on both sides of the betting table so that the middle numbers are 2, 5, 8, 11, 14, 17, 20, 23, 26, 29, 32, and 35.

- If there is no middle bias, what proportion of the bets

- Determine the 95% confidence interval estimates of the proportion of Alzheimer's patients in each of the three age categories.
- For each year listed, determine 95% confidence interval estimates of the total number of Americans with Alzheimer's disease.

DATA
C12-05

- will be on 1 of the 12 middle numbers?
- Conduct a test at the 5% significance level to determine whether middle bias exists.
 - The middle of the middle are the numbers 17 and 20. If there is no middle bias, what proportion of the bets will be either 17 or 20?
 - Test with a 5% significance level to determine whether middle of the middle bias exists.

Source: Maya Bar-Hillel and Ro'i Zultan, "We Sing the Praise of Good Displays: How Gamblers Bet in Casino Roulette," *Chance*, Volume 25, No. 2, 2012.

13



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INFERENCE ABOUT COMPARING TWO POPULATIONS

- 13-1 *Inference about the Difference between Two Means: Independent Samples*
 - 13-2 *Observational and Experimental Data*
 - 13-3 *Inference about the Difference between Two Means: Matched Pairs Experiment*
 - 13-4 *Inference about the Ratio of Two Variances*
 - 13-5 *Inference about the Difference between Two Population Proportions*
- Appendix 13 *Review of Chapters 12 and 13*

General Social Survey

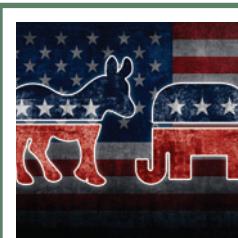
Comparing Democrats and Republicans: Who is Likely to Have Completed a University Degree?

DATA
GSS2012*

In the business of politics it is important to be able to determine what differences exist between supporters and opponents. In 2012 the General Social Survey asked people what is the highest degree earned (DEGREE)?

The responses are:

0. Left high school
1. Completed high school
2. Completed junior college
3. Completed Bachelor's degree
4. Completed graduate degree



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On page 497, we will provide our answer.

The survey also asked, Do you think of yourself as Democrat, Independent, or Republican (PARTYID3)?

1. Democrat
2. Independent
3. Republican

Do these data allow us to infer that people who identify themselves as Republican Party supporters are more likely to have completed a Bachelor's or graduate degree than their Democratic counterparts?

INTRODUCTION

We can compare learning how to use statistical techniques to learning how to drive a car. We began by describing what you are going to do in this course (Chapter 1) and then presented the essential background material (Chapters 2–9). Learning the concepts of statistical inference and applying them the way we did in Chapters 10 and 11 is akin to driving a car in an empty parking lot. You're driving, but it's not a realistic experience. Learning Chapter 12 is like driving on a quiet side street with little traffic. The experience represents real driving, but many of the difficulties have been eliminated. In this chapter, you begin to drive for real, with many of the actual problems faced by licensed drivers, and the experience prepares you to tackle the next difficulty.

In this chapter, we present a variety of techniques used to compare two populations. In Sections 13-1 and 13-3, we deal with interval variables; the parameter of interest is the difference between two means. The difference between these two sections introduces yet another factor that determines the correct statistical method—the design of the experiment used to gather the data. In Section 13-1, the samples are independently drawn, whereas in Section 13-3, the samples are taken from a matched pairs experiment. In Section 13-2, we discuss the difference between observational and experimental data, a distinction that is critical to the way in which we interpret statistical results.

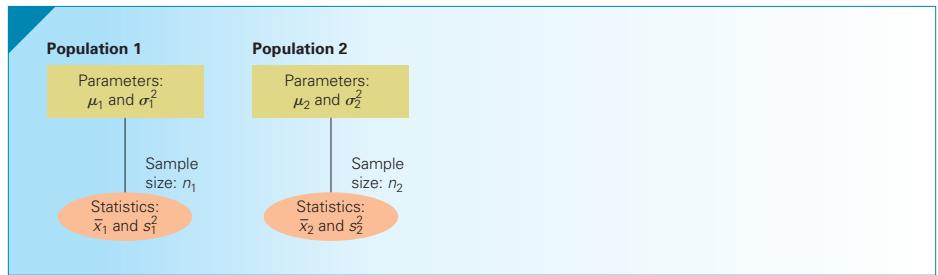
Section 13-4 presents the procedures employed to infer whether two population variances differ. The parameter is the ratio σ_1^2/σ_2^2 . (When comparing two variances, we use the ratio rather than the difference because of the nature of the sampling distribution.)

Section 13-5 addresses the problem of comparing two populations of nominal data. The parameter to be tested and estimated is the difference between two proportions.

13-1 / INFERENCE ABOUT THE DIFFERENCE BETWEEN TWO MEANS: INDEPENDENT SAMPLES

In order to test and estimate the difference between two population means, the statistics practitioner draws random samples from each of two populations. In this section, we discuss independent samples. In Section 13-3, where we present the matched pairs experiment, the distinction between independent samples and matched pairs will be made clear. For now, we define independent samples as samples completely unrelated to one another.

Figure 13.1 depicts the sampling process. Observe that we draw a sample of size n_1 from population 1 and a sample of size n_2 from population 2. For each sample, we compute the sample means and sample variances.

FIGURE 13.1 Independent Samples from Two Populations

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The best estimator of the difference between two population means, $\mu_1 - \mu_2$, is the difference between two sample means, $\bar{x}_1 - \bar{x}_2$. In Section 9-3 we presented the sampling distribution of $\bar{x}_1 - \bar{x}_2$.

Sampling Distribution of $\bar{x}_1 - \bar{x}_2$

- $\bar{x}_1 - \bar{x}_2$ is normally distributed if the populations are normal and approximately normal if the populations are nonnormal and the sample sizes are large.
- The expected value of $\bar{x}_1 - \bar{x}_2$ is

$$E(\bar{x}_1 - \bar{x}_2) = \mu_1 - \mu_2$$

- The variance of $\bar{x}_1 - \bar{x}_2$ is

$$V(\bar{x}_1 - \bar{x}_2) = \frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}$$

The standard error of $\bar{x}_1 - \bar{x}_2$ is

$$\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

Thus,

$$z = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$$

is a standard normal (or approximately normal) random variable. It follows that the test statistic is

$$z = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}}$$

The interval estimator is

$$(\bar{x}_1 - \bar{x}_2) \pm z_{\alpha/2} \sqrt{\frac{\sigma_1^2}{n_1} + \frac{\sigma_2^2}{n_2}}$$

However, these formulas are rarely used because the population variances σ_1^2 and σ_2^2 are virtually always unknown. Consequently, it is necessary to estimate the standard error

of the sampling distribution. The way to do this depends on whether the two unknown population variances are equal. When they are equal, the test statistic is defined in the following way.

Test Statistic for $\mu_1 - \mu_2$ when $\sigma_1^2 = \sigma_2^2$

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}} \quad v = n_1 + n_2 - 2$$

where

$$s_p^2 = \frac{(n_1 - 1)s_1^2 + (n_2 - 1)s_2^2}{n_1 + n_2 - 2}$$

The quantity s_p^2 is called the **pooled variance estimator**. It is the weighted average of the two sample variances with the number of degrees of freedom in each sample used as weights. The requirement that the population variances be equal makes this calculation feasible because we need only one estimate of the common value of σ_1^2 and σ_2^2 . It makes sense for us to use the pooled variance estimator because, in combining both samples, we produce a better estimate.

The test statistic is Student t distributed with $n_1 + n_2 - 2$ degrees of freedom, provided that the two populations are normal. The confidence interval estimator is derived by mathematics that by now has become routine.

Confidence Interval Estimator of $\mu_1 - \mu_2$ When $\sigma_1^2 = \sigma_2^2$

$$(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)} \quad v = n_1 + n_2 - 2$$

We will refer to these formulas as the **equal-variances test statistic** and **confidence interval estimator**, respectively.

When the population variances are unequal, we cannot use the pooled variance estimate. Instead, we estimate each population variance with its sample variance. Unfortunately, the sampling distribution of the resulting statistic

$$\frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}}}$$

is neither normally nor Student t distributed. However, it can be approximated by a Student t distribution with degrees of freedom equal to

$$\nu = \frac{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}}$$

(It is usually necessary to round this number to the nearest integer.) The test statistic and confidence interval estimator are easily derived from the sampling distribution.

Test Statistic for $\mu_1 - \mu_2$ When $\sigma_1^2 \neq \sigma_2^2$

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}\right)}} \quad \nu = \frac{(s_1^2/n_1 + s_2^2/n_2)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}}$$

Confidence Interval Estimator of $\mu_1 - \mu_2$ When $\sigma_1^2 \neq \sigma_2^2$

$$(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}\right)} \quad \nu = \frac{(s_1^2/n_1 + s_2^2/n_2)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}}$$

We will refer to these formulas as the **unequal-variances test statistic** and **confidence interval estimator**, respectively.

The question naturally arises, How do we know when the population variances are equal? The answer is that because σ_1^2 and σ_2^2 are unknown, we can't know for certain whether they're equal. However, we can perform a statistical test to determine whether there is evidence to infer that the population variances differ. We conduct the *F*-test of the ratio of two variances, which we briefly present here and save the details for Section 13-4.

Testing the Population Variances

The hypotheses to be tested are

$$H_0: \sigma_1^2/\sigma_2^2 = 1$$

$$H_1: \sigma_1^2/\sigma_2^2 \neq 1$$

The test statistic is the ratio of the sample variances s_1^2/s_2^2 , which is *F*-distributed with degrees of freedom $v_1 = n_1 - 1$ and $v_2 = n_2 - 1$. Recall that we introduced the *F*-distribution in Section 8-4. The required condition is the same as that for the *t*-test of $\mu_1 - \mu_2$, which is that both populations are normally distributed.

This is a two-tail test so that the rejection region is

$$F > F_{\alpha/2, v_1, v_2} \quad \text{or} \quad F < F_{1-\alpha/2, v_1, v_2}$$

Put simply, we will reject the null hypothesis that states that the population variances are equal when the ratio of the sample variances is large or if it is small. Table 6 in Appendix B, which lists the critical values of the *F*-distribution, defines "large" and "small."

13-1a Decision Rule: Equal-Variances or Unequal-Variances *t*-Tests and Estimators

Recall that we can never have enough statistical evidence to conclude that the null hypothesis is true. This means that we can only determine whether there is enough evidence to infer that the population variances *differ*. Accordingly, we adopt the following rule: We will use the equal-variances test statistic and confidence interval estimator unless there is evidence (based on the *F*-test of the population variances) to indicate that the population variances are unequal, in which case we will apply the unequal-variances test statistic and confidence interval estimator.

EXAMPLE 13.1*

DATA

Xm13-01

Direct and Broker-Purchased Mutual Funds

Millions of investors buy mutual funds (see page 178 for a description of mutual funds), choosing from thousands of possibilities. Some funds can be purchased directly from banks or other financial institutions whereas others must be purchased through brokers, who charge a fee for this service. This raises the question, Can investors do better by buying mutual funds directly than by purchasing mutual funds through brokers? To help answer this question, a group of researchers randomly sampled the annual returns from mutual funds that can be acquired directly and mutual funds that are bought through brokers and recorded the net annual returns, which are the returns on investment after deducting all relevant fees. These are listed next.

Direct					Broker					
9.33	4.68	4.23	14.69	10.29	3.24	3.71	16.4	4.36	9.43	
6.94	3.09	10.28	-2.97	4.39	-6.76	13.15	6.39	-11.07	8.31	
16.17	7.26	7.1	10.37	-2.06	12.8	11.05	-1.9	9.24	-3.99	
16.97	2.05	-3.09	-0.63	7.66	11.1	-3.12	9.49	-2.67	-4.44	
5.94	13.07	5.6	-0.15	10.83	2.73	8.94	6.7	8.97	8.63	
12.61	0.59	5.27	0.27	14.48	-0.13	2.74	0.19	1.87	7.06	
3.33	13.57	8.09	4.59	4.8	18.22	4.07	12.39	-1.53	1.57	
16.13	0.35	15.05	6.38	13.12	-0.8	5.6	6.54	5.23	-8.44	
11.2	2.69	13.21	-0.24	-6.54	-5.75	-0.85	10.92	6.87	-5.72	
1.14	18.45	1.72	10.32	-1.06	2.59	-0.28	-2.15	-1.69	6.95	

Can we conclude at the 5% significance level that directly purchased mutual funds outperform mutual funds bought through brokers?

SOLUTION:

IDENTIFY

To answer the question, we need to compare the population of returns from direct and the returns from broker-bought mutual funds. The data are obviously interval (we've recorded real numbers). This problem objective–data type combination tells us that the parameter to be tested is the difference between two means, $\mu_1 - \mu_2$. The hypothesis

*Source: D. Bergstresser, J. Chalmers, and P. Tufano, "Assessing the Costs and Benefits of Brokers in the Mutual Fund Industry."

to be tested is that the mean net annual return from directly purchased mutual funds (μ_1) is larger than the mean of broker-purchased funds (μ_2). Hence, the alternative hypothesis is

$$H_1: (\mu_1 - \mu_2) > 0$$

As usual, the null hypothesis automatically follows:

$$H_0: (\mu_1 - \mu_2) = 0$$

To decide which of the t -tests of $\mu_1 - \mu_2$ to apply, we conduct the F -test of σ_1^2/σ_2^2 .

$$H_0: \sigma_1^2/\sigma_2^2 = 1$$

$$H_1: \sigma_1^2/\sigma_2^2 \neq 1$$

COMPUTE

M A N U A L LY :

From the data, we calculated the following statistics:

$$s_1^2 = 37.49 \text{ and } s_2^2 = 43.34$$

$$\text{Test statistic: } F = s_1^2/s_2^2 = 37.49/43.34 = 0.86$$

$$\text{Rejection region: } F > F_{\alpha/2, \nu_1, \nu_2} = F_{.025, 49, 49} \approx F_{.025, 50, 50} = 1.75$$

or

$$F < F_{1-\alpha/2, \nu_1, \nu_2} = F_{.975, 49, 49} = 1/F_{.025, 49, 49} \approx 1/F_{.025, 50, 50} = 1/1.75 = .57$$

Because $F = .86$ is not greater than 1.75 or smaller than $.57$, we cannot reject the null hypothesis.

E X C E L

	A	B	C
1	F-Test: Two-Sample for Variances		
2			
3		Direct	Broker
4	Mean	6.63	3.72
5	Variance	37.49	43.34
6	Observations	50	50
7	df	49	49
8	F	0.8650	
9	P(F<=f) one-tail	0.3068	
10	F Critical one-tail	0.6222	

The value of the test statistic is $F = .8650$. Excel outputs the one-tail p -value. Because we're conducting a two-tail test, we double that value. Thus, the p -value of the test we're conducting is $2 \times .3068 = .6136$.

I N S T R U C T I O N S

1. Type or import the data into two columns*. (Open Xm13-01.)
2. Click **Data, Data Analysis**, and **F-test Two-Sample for Variances**.
3. Specify the **Variable 1 Range** (A1:A51) and the **Variable 2 Range** (B1:B51). Type a value for α (.05).

*If a cell is empty (representing missing data), it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

MINITAB**Test for Equal Variances: Direct, Broker**

F-Test (Normal Distribution)
Test statistic = 0.86, p-value = 0.614

INSTRUCTIONS

(Note: Some of the printout has been omitted.)

1. Type or import the data into two columns. (Open Xm13-01.)
2. Click **Stat**, **Basic Statistics**, and **2 Variances . . .**
3. In the **Samples in different columns** box, select the **First** (Direct) and **Second** (Broker) variables.

INTERPRET

There is not enough evidence to infer that the population variances differ. It follows that we must apply the equal-variances *t*-test of $\mu_1 - \mu_2$.

The hypotheses are

$$\begin{aligned} H_0: & (\mu_1 - \mu_2) = 0 \\ H_1: & (\mu_1 - \mu_2) > 0 \end{aligned}$$

COMPUTE**MANUALLY:**

From the data, we calculated the following statistics:

$$\bar{x}_1 = 6.63$$

$$\bar{x}_2 = 3.72$$

$$s_1^2 = 37.49$$

$$s_2^2 = 43.34$$

The pooled variance estimator is

$$\begin{aligned} s_p^2 &= \frac{(n_1 - 1)s_1^2 + (n_2 - 1)s_2^2}{n_1 + n_2 - 2} \\ &= \frac{(50 - 1)37.49 + (50 - 1)43.34}{50 + 50 - 2} \\ &= 40.42 \end{aligned}$$

The number of degrees of freedom of the test statistic is

$$\nu = n_1 + n_2 - 2 = 50 + 50 - 2 = 98$$

The rejection region is

$$t > t_{\alpha, \nu} = t_{.05, 98} \approx t_{.05, 100} = 1.660$$

We determine that the value of the test statistic is

$$\begin{aligned} t &= \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}} \\ &= \frac{(6.63 - 3.72) - 0}{\sqrt{40.42 \left(\frac{1}{50} + \frac{1}{50} \right)}} \\ &= 2.29 \end{aligned}$$

EXCEL

	A	B	C
1	t-Test: Two-Sample Assuming Equal Variances		
2			
3		Direct	Broker
4	Mean	6.63	3.72
5	Variance	37.49	43.34
6	Observations	50	50
7	Pooled Variance	40.41	
8	Hypothesized Mean Difference	0	
9	df	98	
10	t Stat	2.29	
11	P(T<=t) one-tail	0.0122	
12	t Critical one-tail	1.6606	
13	P(T<=t) two-tail	0.0243	
14	t Critical two-tail	1.9845	

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm13-01.)
2. Click **Data**, **Data Analysis**, and **t-Test: Two-Sample Assuming Equal Variances**.
3. Specify the **Variable 1 Range** (A1:A51) and the **Variable 2 Range** (B1:B51). Type the value of the **Hypothesized Mean Difference*** (0) and type a value for α (.05).

MINITAB

Two-Sample T-Test and CI: Direct, Broker

Two-sample T for Direct vs Broker

	N	Mean	StDev	SE Mean
Direct	50	6.63	6.12	0.87
Broker	50	3.72	6.58	0.93

Difference = mu (Direct) – mu (Broker)

Estimate for difference: 2.91

95% lower bound for difference: 0.80

T-Test of difference = 0 (vs >): T-Value = 2.29 P-Value = 0.012 DF = 98

Both use Pooled StDev = 6.3572

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm13-01.)
2. Click **Stat**, **Basic Statistics**, and **2-Sample t . . .**

*This term is technically incorrect. Because we're testing $\mu_1 - \mu_2$, Excel should ask for and output the "Hypothesized Difference between Means."

3. If the data are stacked, use the **Samples in one column** box to specify the names of the variables. If the data are unstacked (as in Example 13.1), specify the **First** and **Second** variables in the **Samples in different columns** box (**Direct, Broker**). (See the discussion on Data Formats on page 454 for a discussion of stacked and unstacked data.) Click **Assume equal variances**. Click **Options . . .**
4. In the **Test difference** box, type the value of the parameter under the null hypothesis (**0**) and select one of **less than**, **not equal**, or **greater than** for the **Alternative hypothesis** (**greater than**).

INTERPRET

The value of the test statistic is 2.29. The one-tail *p*-value is .0122. We observe that the *p*-value of the test is small (and the test statistic falls into the rejection region). As a result, we conclude that there is sufficient evidence to infer that on average directly purchased mutual funds outperform broker-purchased mutual funds.

Estimating $\mu_1 - \mu_2$: Equal-Variances

In addition to testing a value of the difference between two population means, we can also estimate the difference between means. Next we compute the 95% confidence interval estimate of the difference between the mean return for direct and broker mutual funds.

COMPUTE

MANUALLY:

The confidence interval estimator of the difference between two means with equal population variances is

$$(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}$$

The 95% confidence interval estimate of the difference between the return for directly purchased mutual funds and the mean return for broker-purchased mutual funds is

$$\begin{aligned} (\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)} &= (6.63 - 3.72) \pm 1.984 \sqrt{40.42 \left(\frac{1}{50} + \frac{1}{50} \right)} \\ &= 2.91 \pm 2.52 \end{aligned}$$

The lower and upper limits are .39 and 5.43.

EXCEL

A	B	C	D	E	F
1 t-Estimate : Two Means (Equal Variances)					
2					
3			<i>Direct</i>	<i>Broker</i>	
4 Mean			6.63	3.72	
5 Variance			3749	43.34	
6 Observations			50	50	
7					
8 Pooled Variance			40.41		
9 Degrees of Freedom			98		
10 Confidence Level			0.95		
11 Confidence Interval Estimate			2.91	±	2.52
12 LCL			0.38		
13 UCL			5.43		

(Continued)

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm13-01.)
2. Click **Add-Ins**, **Data Analysis Plus**, and **t-Estimate: Two Means**.
3. Specify the **Variable 1 Range** (A1:A51) and the **Variable 2 Range** (B1:B51). Click **Independent Samples with Equal Variances** and the value for α (.05).

MINITAB**Two-Sample T-Test and CI: Direct, Broker**

Two-sample T for Direct vs Broker

	N	Mean	StDev	SE Mean
Direct	50	6.63	6.12	0.87
Broker	50	3.72	6.58	0.93

Difference = mu (Direct) - mu (Broker)

Estimate for difference: 2.91

95% CI for difference: (0.38, 5.43)

T-Test of difference = 0 (vs not =): T-Value = 2.29 P-Value = 0.024 DF = 98

Both use Pooled StDev = 6.3572

INSTRUCTIONS

To produce a confidence interval estimate, follow the instructions for the test, but specify **not equal** for the **Alternative**. Minitab will conduct a two-tail test and produce the confidence interval estimate.

INTERPRET

We estimate that the return on directly purchased mutual funds is on average between .38 and 5.43 percentage points larger than broker-purchased mutual funds.

EXAMPLE 13.2†DATA
Xm13-02**Effect of New CEO in Family-Run Businesses**

What happens to the family-run business when the boss's son or daughter takes over? Does the business do better after the change if the new boss is the offspring of the owner or does the business do better when an outsider is made chief executive officer (CEO)? In pursuit of an answer, researchers randomly selected 140 firms between 1994 and 2002, 30% of which passed ownership to an offspring and 70% of which appointed an outsider as CEO. For each company, the researchers calculated the operating income as a proportion of assets in the year before and the year after the new CEO took over. The change (operating income after—operating income before) in this variable

*If a cell is empty (representing missing data), it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

†Source: M. Bennedsen and K. Nielsen, Copenhagen Business School and D. Wolfenzon, New York University.

was recorded and is listed next. Do these data allow us to infer that the effect of making an offspring CEO is different from the effect of hiring an outsider as CEO?

Offspring	Outsider
-1.95	0.69
0	-1.05
0.56	-0.95
1.44	-4.23
1.5	-0.16
1.41	1.58
-0.32	-1.98
-1.7	4.41
-1.66	-2.03
-1.87	0.55
-1.38	-1.49
0.57	-0.45
3.05	-0.45
2.98	-0.45
-2.16	1.32
1.22	5.93
2.61	8.68
1.55	1.43
-1.43	-0.45
-1.91	-3.2
1.01	-0.37
2.97	-3.2
-1.62	-0.08
-5.25	-1.16
0.14	-0.08
2.12	1.04
2.75	1.28
0.3	1.74
-1.37	0.53
0.3	1.04
-0.89	0.49
2.07	0.49
-5.96	0.49
3.04	0.49
0.46	0.49
-1.16	0.49
2.68	0.49

SOLUTION:

IDENTIFY

The objective is to compare two populations, and the data are interval. It follows that the parameter of interest is the difference between two population means $\mu_1 - \mu_2$, where μ_1 is the mean difference for companies where the owner's son or daughter became CEO and μ_2 is the mean difference for companies who appointed an outsider as CEO.

To determine whether to apply the equal or unequal variances *t*-test, we use the *F*-test of two variances.

$$\begin{aligned} H_0: \sigma_1^2/\sigma_2^2 &= 1 \\ H_1: \sigma_1^2/\sigma_2^2 &\neq 1 \end{aligned}$$

COMPUTE

MANUALLY:

From the data, we calculated the following statistics:

$$s_1^2 = 3.79 \text{ and } s_2^2 = 8.03$$

$$\text{Test statistic: } F = s_1^2/s_2^2 = 3.79/8.03 = 0.47$$

The degrees of freedom are $\nu_1 = n_1 - 1 = 42 - 1 = 41$ and

$$\nu_2 = n_2 - 1 = 98 - 1 = 97$$

$$\text{Rejection region: } F > F_{\alpha/2, \nu_1, \nu_2} = F_{.025, 41, 97} \approx F_{.025, 40, 100} = 1.64$$

or

$$F > F_{1-\alpha/2, \nu_1, \nu_2} = F_{.975, 41, 97} \approx 1/F_{.025, 97, 41} \approx 1/F_{.025, 100, 40} = 1/1.74 = .57$$

Because $F = .47$ is less than $.57$, we reject the null hypothesis.

EXCEL

	A	B	C
1	F-Test: Two-Sample for Variances		
2			
3		Offspring	Outsider
4	Mean	-0.10	1.24
5	Variance	3.79	8.03
6	Observations	42	98
7	df	41	97
8	F	0.47	
9	P(F<=f) one-tail	0.0040	
10	F Critical one-tail	0.6314	

The value of the test statistic is $F = .47$, and the p -value = $2 \times .0040 = .0080$.

MINITAB**Test for Equal Variances: Offspring, Outsider**

F-Test (Normal Distribution)
Test statistic = 0.47, p-value = 0.008

INTERPRET

There is enough evidence to infer that the population variances differ. The appropriate technique is the unequal-variances t -test of $\mu_1 - \mu_2$.

Because we want to determine whether there is a *difference* between means, the alternative hypothesis is

$$H_1: (\mu_1 - \mu_2) \neq 0$$

and the null hypothesis is

$$H_0: (\mu_1 - \mu_2) = 0$$

COMPUTE**M A N U A L L Y :**

From the data, we calculated the following statistics:

$$\bar{x}_1 = -.10$$

$$\bar{x}_2 = 1.24$$

$$s_1^2 = 3.79$$

$$s_2^2 = 8.03$$

The number of degrees of freedom of the test statistic is

$$\begin{aligned}\nu &= \frac{(s_1^2/n_1 + s_2^2/n_2)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}} \\ &= \frac{(3.79/42 + 8.03/98)^2}{\frac{(3.79/42)^2}{42 - 1} + \frac{(8.03/98)^2}{98 - 1}} \\ &= 110.69 \text{ rounded to } 111\end{aligned}$$

The rejection region is

$$t < -t_{\alpha/2, \nu} = -t_{.025, 111} \approx -t_{.025, 110} = -1.982 \quad \text{or} \quad t > t_{\alpha/2, \nu} = t_{.025, 111} \approx 1.982$$

The value of the test statistic is computed next:

$$\begin{aligned}t &= \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}\right)}} \\ &= \frac{(-.10 - 1.24) - (0)}{\sqrt{\left(\frac{3.79}{42} + \frac{8.03}{98}\right)}} = -3.22\end{aligned}$$

EXCEL

	A	B	C
1	t-Test: Two-Sample Assuming Unequal Variances		
2			
3		Offspring	Outsider
4 Mean		-0.10	1.24
5 Variance		3.79	8.03
6 Observations		42	98
7 Hypothesized Mean Difference		0	
8 df		111	
9 t Stat		-3.22	
10 P(T<=t) one-tail		0.0008	
11 t Critical one-tail		1.6587	
12 P(T<=t) two-tail		0.0017	
13 t Critical two-tail		1.9816	

INSTRUCTIONS

Follow the instructions for Example 13.1, except at step 2 click **Data**, **Data Analysis**, and **t-Test: Two-Sample Assuming Unequal Variances**.

MINITAB**Two-Sample T-Test and CI: Offspring, Outsider**

Two-sample T for Offspring vs Outsider

	N	Mean	StDev	SE Mean
Offspring	42	-0.10	1.95	0.30
Outsider	98	1.24	2.83	0.29

Difference = mu (Offspring) – mu (Outsider)

Estimate for difference: -1.336

95% CI for difference: (-2.158, -0.514)

T-Test of difference = 0 (vs not =): T-Value = -3.22 P-Value = 0.002 DF = 110

INSTRUCTIONS

Follow the instructions for Example 13.1 except at step 3 do not click **Assume equal variances**.

INTERPRET

The t -statistic is -3.22 , and its p -value is $.0017$. Accordingly, we conclude there is sufficient evidence to infer that the mean changes in operating income differ.

Estimating $\mu_1 - \mu_2$: Unequal-Variances

We can also draw inferences about the difference between the two population means by calculating the confidence interval estimator. We use the unequal-variances confidence interval estimator of $\mu_1 - \mu_2$ and a 95% confidence level.

COMPUTE**MANUALLY:**

$$\begin{aligned}
 & (\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right)} \\
 & = (-.10 - 1.24) \pm 1.982 \sqrt{\left(\frac{3.79}{42} + \frac{8.03}{98} \right)} \\
 & = -1.34 \pm .82
 \end{aligned}$$

$$\text{LCL} = -2.16 \quad \text{and} \quad \text{UCL} = -.52$$

EXCEL

	A	B	C	D
1	t-Estimate : Two Means (Unequal Variances)			
2				
3		Offspring	Outsider	
4	Mean	-0.10	1.24	
5	Variance	3.79	8.03	
6	Observations	42	98	
7				
8	Degrees of Freedom	110.75		
9	Confidence Level	0.95		
10	Confidence Interval Estimate	-1.34	± 0.82	
11	LCL	-2.16		
12	UCL	-0.51		

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm13-02.)
2. Click Add-Ins, Data Analysis Plus, and t-Estimate: Two Means.
3. Specify the Variable 1 Range (A1:A43) and the Variable 2 Range (B1:B99). Click Independent Samples with Unequal Variances and the value for α (.05).

MINITAB

Minitab prints the confidence interval estimate as part of the output of the test statistic. However, you must specify the Alternative hypothesis as **not equal** to produce a two-sided interval.

INTERPRET

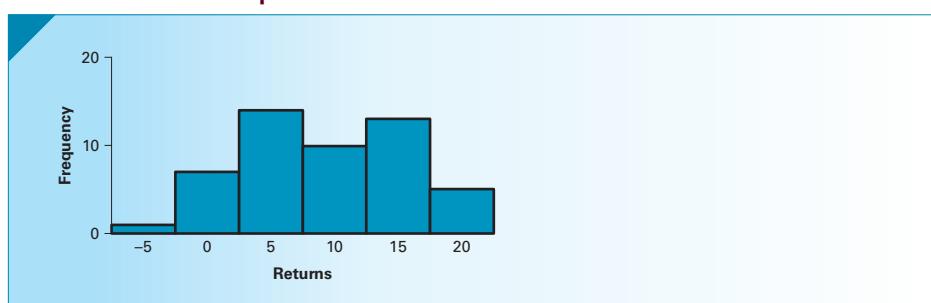
We estimate that the mean change in operating incomes for outsiders exceeds the mean change in the operating income for offspring lies between .51 and 2.16 percentage points.

13-1b Checking the Required Condition

Both the equal-variances and unequal-variances techniques require that the populations be normally distributed.[†] As before, we can check to see whether the requirement is satisfied by drawing the histograms of the data.

To illustrate, we used Excel (Minitab histograms are almost identical) to create the histograms for Example 13.1 (Figures 13.2 and 13.3) and Example 13.2 (Figures 13.4 and 13.5).

FIGURE 13.2 Histogram of Rates of Return for Directly Purchased Mutual Funds in Example 13.1



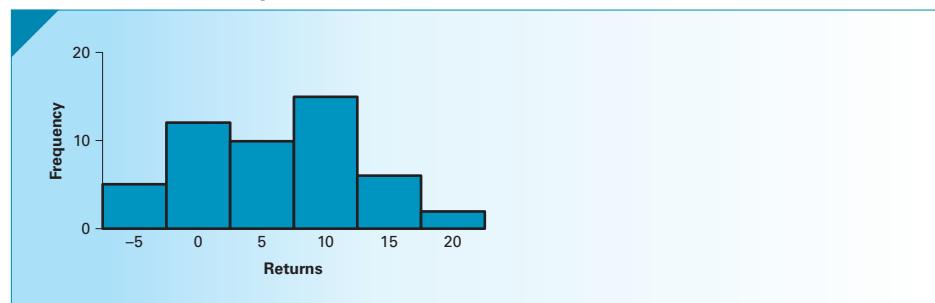
© Cengage Learning

*If a cell is empty (representing missing data), it must be removed. See Keller's website appendix Removing Empty Cells in Excel.

[†]As we pointed out in Chapter 12 large sample sizes can overcome the effects of extreme nonnormality.

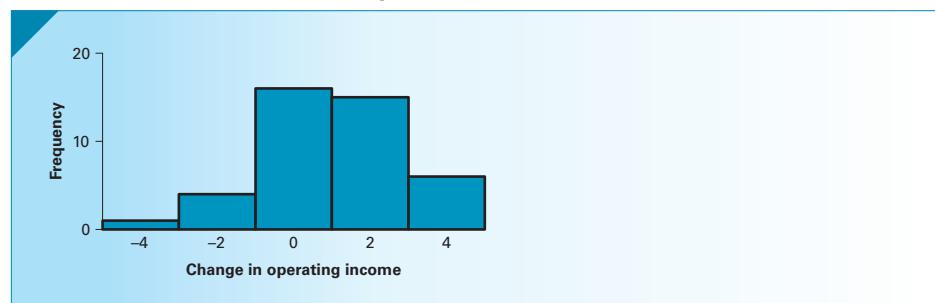
Although the histograms are not perfectly bell shaped, it appears that in both examples the data are at least approximately normal. Because this technique is robust, we can be confident in the validity of the results.

FIGURE 13.3 Histogram of Rates of Return for Broker-Purchased Mutual Funds in Example 13.1



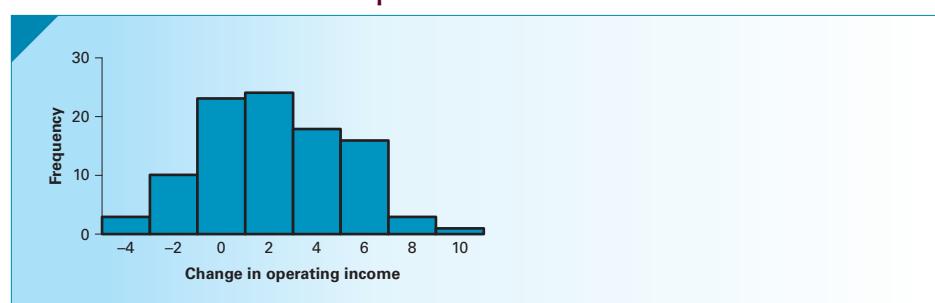
© Cengage Learning

FIGURE 13.4 Histogram of Change in Operating Income for Offspring-Run Businesses in Example 13.2



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FIGURE 13.5 Histogram of Change in Operating Income for Outsider-Run Businesses in Example 13.2



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13-1c Violation of the Required Condition

When the normality requirement is unsatisfied, we can use a nonparametric technique: the Wilcoxon rank sum test (Chapter 19*) to replace the equal-variances test of $\mu_1 - \mu_2$. We have no alternative to the unequal-variances test of $\mu_1 - \mu_2$ when the populations are very nonnormal.

13-1d Data Formats

There are two formats for storing the data when drawing inferences about the difference between two means. The first, which you have seen demonstrated in both Examples 13.1 and 13.2, is called *unstacked*, wherein the observations from sample 1 are stored in one column and the observations from sample 2 are stored in a second column. We may also store the data in stacked format. In this format, all the observations are stored in one column. A second column contains the codes, usually 1 and 2, that indicate from which sample the corresponding observation was drawn. Here is an example of unstacked data.

Column 1 (Sample 1)	Column 2 (Sample 2)
12	18
19	23
13	25

Here are the same data in stacked form.

Column 1	Column 2
12	1
19	1
13	1
18	2
23	2
25	2

It should be understood that the data need not be in order. Hence, they could have been stored in this way:

Column 1	Column 2
18	2
25	2
13	1
12	1
23	2
19	1

If there are two populations to compare and only one variable, then it is probably better to record the data in unstacked form. However, it is frequently the case that we want to observe several variables and compare them. For example, suppose that we survey male and female MBAs and ask each to report his or her age, income, and number of years of experience. These data are usually stored in stacked form using the following format.

*Instructors who wish to teach the use of nonparametric techniques for testing the difference between two means when the normality requirement is not satisfied should use Keller's website Appendix Introduction to Nonparametric Techniques and Keller's website Appendix Wilcoxon Rank Sum Test and Wilcoxon Signed Rank Sum Test.

- Column 1: Code identifying female (1) and male (2)
- Column 2: Age
- Column 3: Income
- Column 4: Years of experience

To compare ages, we would use columns 1 and 2. Columns 1 and 3 are used to compare incomes, and columns 1 and 4 are used to compare experience levels.

Most statistical software requires one format or the other. Some but not all of Excel's techniques require unstacked data. Some of Minitab's procedures allow either format, whereas others specify only one. Fortunately, both of our software packages allow the statistics practitioner to alter the format. (See Keller's website Appendix Excel and Minitab Instructions for Stacking and Unstacking Data.) We say "fortunately" because this allowed us to store the data in either form on our website. In fact, we've used both forms to allow you to practice your ability to manipulate the data as necessary. You will need this ability to perform statistical techniques in this and other chapters in this book.

13-1e Developing an Understanding of Statistical Concepts 1

The formulas in this section are relatively complicated. However, conceptually both test statistics are based on the techniques we introduced in Chapter 11 and repeated in Chapter 12: The value of the test statistic is the difference between the statistic $\bar{x}_1 - \bar{x}_2$ and the hypothesized value of the parameter $\mu_1 - \mu_2$ measured in terms of the standard error.

13-1f Developing an Understanding of Statistical Concepts 2

The standard error must be estimated from the data for all inferential procedures introduced here. The method we use to compute the standard error of $\bar{x}_1 - \bar{x}_2$ depends on whether the population variances are equal. When they are equal we calculate and use the pooled variance estimator s_p^2 . We are applying an important principle here, and we will do so again in Section 13-5 and in later chapters. The principle can be loosely stated as follows: Where possible, it is advantageous to pool sample data to estimate the standard error. In Example 13.1, we are able to pool because we assume that the two samples were drawn from populations with a common variance. Combining both samples increases the accuracy of the estimate. Thus, s_p^2 is a better estimator of the common variance than either s_1^2 or s_2^2 separately. When the two population variances are unequal, we cannot pool the data and produce a common estimator. We must compute s_1^2 and s_2^2 and use them to estimate σ_1^2 and σ_2^2 , respectively.

Here is a summary of how we recognize the techniques presented in this section.

Factors that Identify the Equal-Variances *t*-Test and Estimator of $\mu_1 - \mu_2$

1. **Problem objective:** Compare two populations
2. **Data type:** Interval
3. **Descriptive measurement:** Central location
4. **Experimental design:** Independent samples
5. **Population variances:** Equal

Factors that Identify the Unequal-Variances *t*-Test and Estimator of $\mu_1 - \mu_2$

1. **Problem objective:** Compare two populations
2. **Data type:** Interval
3. **Descriptive measurement:** Central location
4. **Experimental design:** Independent samples
5. **Population variances:** Unequal



EXERCISES

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DO IT YOURSELF EXCEL

Construct Excel spreadsheets for each of the following:

- 13.1** Equal-variance *t*-test of $\mu_1 - \mu_2$. Inputs: Sample means, sample standard deviations, sample sizes, hypothesized difference between means. Outputs: Test statistic, critical values, and one- and two-tail *p*-values. Tools: **TINV, TDIST**
- 13.2** Equal-variance *t*-estimator of $\mu_1 - \mu_2$. Inputs: Sample means, sample standard deviations, sample sizes, and confidence level. Outputs: Upper and lower confidence limits. Tools: **TINV**

13.3 Unequal-variance *t*-test of $\mu_1 - \mu_2$. Inputs: Sample means, sample standard deviations, sample sizes, hypothesized difference between means. Outputs: Test statistic, critical values, and one- and two-tail *p*-values. Tools: **TINV, TDIST**

13.4 Unequal-variance *t*-estimator of $\mu_1 - \mu_2$. Inputs: Sample means, sample standard deviations, sample sizes, and confidence level. Outputs: Upper and lower confidence limits. Tools: **TINV**

Developing an Understanding of Statistical Concepts

Exercises 13.5–13.10 are “what-if” analyses designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually, using the Excel spreadsheets you created or Minitab.

- 13.5** In random samples of 25 from each of two normal populations, we found the following statistics:

$$\begin{array}{ll} \bar{x}_1 = 524 & s_1 = 129 \\ \bar{x}_2 = 469 & s_2 = 141 \end{array}$$

- a. Estimate the difference between the two population means with 95% confidence.
- b. Repeat part (a) increasing the standard deviations to $s_1 = 255$ and $s_2 = 260$.
- c. Describe what happens when the sample standard deviations get larger.
- d. Repeat part (a) with samples of size 100.
- e. Discuss the effects of increasing the sample size.

- 13.6** In random samples of 12 from each of two normal populations, we found the following statistics:

$$\begin{array}{ll} \bar{x}_1 = 74 & s_1 = 18 \\ \bar{x}_2 = 71 & s_2 = 16 \end{array}$$

- a. Test with $\alpha = .05$ to determine whether we can infer that the population means differ.
- b. Repeat part (a) increasing the standard deviations to $s_1 = 210$ and $s_2 = 198$.
- c. Describe what happens when the sample standard deviations get larger.
- d. Repeat part (a) with samples of size 150.
- e. Discuss the effects of increasing the sample size.
- f. Repeat part (a) changing the mean of sample 1 to $\bar{x}_1 = 76$.
- g. Discuss the effect of increasing \bar{x}_1 .

- 13.7** Random sampling from two normal populations produced the following results:

$$\begin{array}{lll} \bar{x}_1 = 63 & s_1 = 18 & n_1 = 50 \\ \bar{x}_2 = 60 & s_2 = 7 & n_2 = 45 \end{array}$$

- a. Estimate with 90% confidence the difference between the two population means.
 - b. Repeat part (a) changing the sample standard deviations to 41 and 15, respectively.
 - c. What happens when the sample standard deviations increase?
 - d. Repeat part (a) doubling the sample sizes.
 - e. Describe the effects of increasing the sample sizes.
- 13.8** Random sampling from two normal populations produced the following results:
- | | | |
|-------------------|-------------|-------------|
| $\bar{x}_1 = 412$ | $s_1 = 128$ | $n_1 = 150$ |
| $\bar{x}_2 = 405$ | $s_2 = 54$ | $n_2 = 150$ |
- a. Can we infer at the 5% significance level that μ_1 is greater than μ_2 ?
 - b. Repeat part (a) decreasing the standard deviations to $s_1 = 31$ and $s_2 = 16$.
 - c. Describe what happens when the sample standard deviations get smaller.
 - d. Repeat part (a) with samples of size 20.
 - e. Discuss the effects of decreasing the sample size.
 - f. Repeat part (a) changing the mean of sample 1 to $\bar{x}_1 = 409$
 - g. Discuss the effect of decreasing \bar{x}_1 .
- 13.9** For each of the following, determine the number of degrees of freedom assuming equal population variances and unequal population variances.
- a. $n_1 = 15, n_2 = 15, s_1^2 = 25, s_2^2 = 15$
 - b. $n_1 = 10, n_2 = 16, s_1^2 = 100, s_2^2 = 15$
 - c. $n_1 = 50, n_2 = 50, s_1^2 = 8, s_2^2 = 14$
 - d. $n_1 = 60, n_2 = 45, s_1^2 = 75, s_2^2 = 10$
- 13.10** Refer to Exercise 13.9.
- a. Confirm that in each case the number of degrees of freedom for the equal-variances test statistic and confidence interval estimator is larger than that for the unequal-variances test statistic and confidence interval estimator.
 - b. Try various combinations of sample sizes and sample variances to illustrate that the number of degrees of freedom for the equal-variances test statistic and confidence interval estimator is larger than that for the unequal-variances test statistic and confidence interval estimator.

Applications

For Exercises 13.11 to 13.16 use a 10% significance level.

- 13.11** **Xr13-11** Every month a clothing store conducts an inventory and calculates losses from theft. The store would like to reduce these losses and is considering two methods. The first is to hire a security guard, and the second is to install cameras. To help decide which method to choose, the manager hired a security guard for 6 months. During the next 6-month period, the store installed cameras. The monthly losses were recorded and are listed here.

The manager decided that because the cameras were cheaper than the guard, he would install the cameras unless there was enough evidence to infer that the guard was better. What should the manager do?

Security guard 355 284 401 398 477 254

Cameras 486 303 270 386 411 435

- 13.12** **Xr13-12** A men's softball league is experimenting with a yellow baseball that is easier to see during night games. One way to judge the effectiveness is to count the number of errors. In a preliminary experiment, the yellow baseball was used in 10 games and the traditional white baseball was used in another 10 games. The number of errors in each game was recorded and is listed here. Can we infer that there are fewer errors on average when the yellow ball is used?

Yellow 5 2 6 7 2 5 3 8 4 9

White 7 6 8 5 9 11 8 3 6 10

- 13.13** **Xr13-13** A number of restaurants feature a device that allows credit card users to swipe their cards at the table. It allows the user to specify a percentage or a dollar amount to leave as a tip. In an experiment to see how it works, a random sample of credit card users was drawn. Some paid the usual way, and some used the new device. The percent left as a tip was recorded and listed below. Can we infer that users of the device leave larger tips?

Usual 10.3 15.2 13.0 9.9 12.1 13.4 12.2 14.9 13.2 12.0

Device 13.6 15.7 12.9 13.2 12.9 13.4 12.1 13.9 15.7 15.4 17.4

- 13.14** **Xr13-14** Who spends more on their vacations, golfers or skiers? To help answer this question, a travel agency surveyed 15 customers who regularly take their spouses on either a skiing or a golfing vacation. The amounts spent on vacations last year are shown here. Can we infer that golfers and skiers differ in their vacation expenses?

Golfer 2,450 3,860 4,528 1,944 3,166 3,275

4,490 3,685 2,950

Skier 3,805 3,725 2,990 4,357 5,550 4,130

- 13.15** **Xr13-15** A growing concern among fans and owners is the amount of time to complete a major league baseball game. To assess the extent of the problem, a statistician recorded the amount of time (in minutes) to complete a random sample of games 5 years ago and this year. Can we conclude that games take longer to complete this year than 5 years ago?

5 Years Ago

169 160 174 161 187 172 177 187 153 169 161 194

This Year

153 182 162 190 163 189 171 197 159 180 197 178

- 13.16** **Xr13-16** How do drivers react to sudden large increases in the price of gasoline? To help answer the question, a statistician recorded the speeds of cars as they passed a large service station. He recorded the speeds (mph) in the same location after the service station sign showed that the price of gasoline had risen by 15 cents. Can we conclude that the speeds differ?

Speeds Before Price Increase

43	36	31	30	28	36	27	36	35	30	32	36
----	----	----	----	----	----	----	----	----	----	----	----

Speeds After Price Increase

32	33	36	31	32	29	28	39	26	30	32	30
----	----	----	----	----	----	----	----	----	----	----	----

Exercises 13.17–13.41 require the use of a computer and software. The answers to may be calculated manually using the sample statistics listed in Appendix A. Use a 5% significance level unless specified otherwise.

- 13.17** **Xr13-17** The president of Tastee Inc., a baby-food producer, claims that her company's product is superior to that of her leading competitor because babies gain weight faster with her product. (This is a good thing for babies.) To test this claim, a survey was undertaken. Mothers of newborn babies were asked which baby food they intended to feed their babies. Those who responded Tastee or the leading competitor were asked to keep track of their babies' weight gains over the next 2 months. There were 15 mothers who indicated that they would feed their babies Tastee and 25 who responded that they would feed their babies the product of the leading competitor. Each baby's weight gain (in ounces) was recorded.

- Can we conclude, using weight gain as our criterion, that Tastee baby food is indeed superior?
- Estimate with 95% confidence the difference between the mean weight gains of the two products.
- Check to ensure that the required condition(s) is satisfied.

- 13.18** **Xr13-18** Is eating oat bran an effective way to reduce cholesterol? Early studies indicated that eating oat bran daily reduces cholesterol levels by 5% to 10%. Reports of this study resulted in the introduction of many new breakfast cereals with various percentages of oat bran as an ingredient. However, an experiment performed by medical researchers in Boston cast doubt on the effectiveness of oat bran. In that study, 120 volunteers ate oat bran for breakfast, and another 120 volunteers ate another grain cereal for breakfast. At the end of 6 weeks, the percentage of cholesterol reduction was computed for both groups. Can we infer that oat bran is different from other cereals in terms of cholesterol reduction?

- 13.19** **Xr13-19*** In assessing the value of radio advertisements, sponsors consider not only the total number of listeners but also their ages. The 18 to 34 age group is considered to spend the most money. To examine the issue, the manager of an FM station commissioned a survey. One objective was to measure the difference in listening habits between the 18 to 34 age and 35 to 50 age groups. The survey asked 250 people in each age category how much time they spent listening to FM radio per day. The results (in minutes) were recorded and stored in stacked format (column 1 = Age group and column 2 = Listening times).

- Can we conclude that a difference exists between the two groups?
- Estimate with 95% confidence the difference in mean time listening to FM radio between the two age groups.
- Are the required conditions satisfied for the techniques you used in parts (a) and (b)?

- 13.20** **Xr13-20** The cruise ship business is rapidly increasing. Although cruises have long been associated with seniors, it now appears that younger people are choosing a cruise as their vacations. To determine whether this is true, an executive for a cruise line sampled passengers 2 years ago and this year and determined their ages.

- Do these data allow the executive to infer that cruise ships are attracting younger customers?
- Estimate with 99% confidence the difference in ages between this year and 2 years ago.

- 13.21** **Xr13-21*** Automobile insurance companies take many factors into consideration when setting rates. These factors include age, marital status, and miles driven per year. To determine the effect of gender, a random sample of young (under 25, with at least 2 years of driving experience) male and female drivers was surveyed. Each was asked how many miles he or she had driven in the past year. The distances (in thousands of miles) are stored in stacked format (column 1 = driving distances and column 2 identifies the gender where 1 = male and code 2 = female).

- Can we conclude that male and female drivers differ in the numbers of miles driven per year?
- Estimate with 95% confidence the difference in mean distance driven by male and female drivers.
- Check to ensure that the required condition(s) of the techniques used in parts (a) and (b) is satisfied.

- 13.22** **Xr13-22** The president of a company that manufactures automobile air conditioners is considering switching his supplier of condensers. Supplier A, the current producer of condensers for the manufacturer, prices its product 5% higher than supplier B. Because the president wants to maintain his company's

reputation for quality, he wants to be sure that supplier B's condensers last at least as long as supplier A's. After a careful analysis, the president decided to retain supplier A if there is sufficient statistical evidence that supplier A's condensers last longer on average than supplier B's. In an experiment, 30 midsize cars were equipped with air conditioners using type A condensers while another 30 midsize cars were equipped with type B condensers. The number of miles (in thousands) driven by each car before the condenser broke down was recorded. Should the president retain supplier A?

- 13.23** **Xr13-23** An important function of a firm's human resources manager is to track worker turnover. As a general rule, companies prefer to retain workers. New workers frequently need to be trained, and it often takes time for new workers to learn how to perform their jobs. To investigate nationwide results, a human resources manager organized a survey wherein a random sample of men and women was asked how long they had worked for their current employers. Can we infer that men and women have different job tenures? (Adapted from the *Statistical Abstract of the United States, 2000*, Table 664).
- 13.24** **Xr13-24** A statistics professor is about to select a statistical software package for her course. One of the most important features, according to the professor, is the ease with which students learn to use the software. She has narrowed the selection to two possibilities: software A, a menu-driven statistical package with some high-powered techniques, and software B, a spreadsheet that has the capability of performing most techniques. To help make her decision, she asks 40 statistics students selected at random to choose one of the two packages. She gives each student a statistics problem to solve by computer and the appropriate manual. The amount of time (in minutes) each student needed to complete the assignment was recorded.
- Can the professor conclude from these data that the two software packages differ in the amount of time needed to learn how to use them? (Use a 1% significance level.)
 - Estimate with 95% confidence the difference in the mean amount of time needed to learn to use the two packages.
 - What are the required conditions for the techniques used in parts (a) and (b)?
 - Check to see whether the required conditions are satisfied.
- 13.25** **Xr13-25** One factor in low productivity is the amount of time wasted by workers. Wasted time includes time spent cleaning up mistakes, waiting for more material and equipment, and performing any other activity not related to production.

In a project designed to examine the problem, an operations-management consultant took a survey of 200 workers in companies that were classified as successful (on the basis of their latest annual profits) and another 200 workers from unsuccessful companies. The amount of time (in hours) wasted during a standard 40-hour workweek was recorded for each worker.

- Do these data provide enough evidence at the 1% significance level to infer that the amount of time wasted in unsuccessful firms exceeds that of successful ones?
- Estimate with 95% confidence how much more time is wasted in unsuccessful firms than in successful ones.

- 13.26** **Xr13-26** Recent studies seem to indicate that using a cell phone while driving is dangerous. One reason for this is that a driver's reaction time may slow while he or she is talking on the phone. Researchers at Miami (Ohio) University measured the reaction times of a sample of drivers who owned a cell phone. Half the sample was tested while on the phone and the other half was tested while not on the phone. Can we conclude that reaction times are slower for drivers using cell phones?
- 13.27** **Xr13-27** Refer to Exercise 13.26. To determine whether the type of phone usage affects reaction times, another study was launched. A group of drivers was asked to participate in a discussion. Half the group engaged in simple chitchat, and the other half participated in a political discussion. Once again, reaction times were measured. Can we infer that the type of telephone discussion affects reaction times?

- 13.28** **Xr13-28** Most consumers who require someone to perform various professional services undertake research before making their selection. A random sample of people who recently selected a financial planner and a random sample of individuals who chose a stockbroker were asked to report the amount of time they spent researching before deciding. Can we infer that people spend more time researching for a financial planner than they do for a stockbroker? (Source: Yankelovich Partners.)

- 13.29** **Xr13-29 Xr13-23** A recent study by researchers at North Carolina State University found thousands of errors in 12 of the most widely used high school science texts. For example, the Statue of Liberty is left-handed; volume is equal to length multiplied by depth (*Time Magazine*, February 12, 2001). The books are so bad that Philip Sadler, director of science education at the Harvard-Smithsonian Center for Astrophysics, decided to conduct a study of their

effects. He recorded the physics marks of college students who had used a textbook in high school and the marks of students who did not have a high school textbook. Do these data allow us to infer that students without high school textbooks in science outperform students who used textbooks?

- 13.30** **Xr13-30** Between Wendy's and McDonald's, which fast-food drive-through window is faster? To answer the question, a random sample of service times for each restaurant was measured. Can we infer from these data that there are differences in service times between the two chains?

(Source: 2000 QSR Drive-Thru Time Study.)

- 13.31** **Xr13-31** Lack of sleep is a serious medical problem. It has been linked to heart attacks and automobile collisions. A Statistics Canada study asked a random sample of Canadian adults to report the amount of sleep they normally get. Can we conclude from the data that men and women differ in the amount of sleep?

- 13.32** **Xr13-32** It is often useful for companies to know who their customers are and how they became customers. In a study of credit card use, random samples were drawn of cardholders who applied for the credit card and credit cardholders who were contacted by telemarketers or by mail. The total purchases made by each last month were recorded. Can we conclude from these data that differences exist on average between the two types of customers?

- 13.33** **Xr13-33** Tire manufacturers are constantly researching ways to produce tires that last longer. New innovations are tested by professional drivers on racetracks. However, any promising inventions are also test-driven by ordinary drivers. The latter tests are closer to what the tire company's customers will actually experience. Suppose that to determine whether a new steel-belted radial tire lasts longer than the company's current model, two new-design tires were installed on the rear wheels of 20 randomly selected cars and two existing-design tires were installed on the rear wheels of another 20 cars. All drivers were told to drive in their usual way until the tires wore out. The number of miles driven by each driver was recorded. Can the company infer that the new tire will last longer on average than the existing tire?

- 13.34** **Xr13-34** It is generally believed that salespeople who are paid on a commission basis outperform salespeople who are paid a fixed salary. Some management

consultants argue, however, that in certain industries the fixed-salary salesperson may sell more because the consumer will feel less sales pressure and respond to the salesperson less as an antagonist. In an experiment to study this, a random sample of 180 salespeople from a retail clothing chain was selected. Of these, 90 salespeople were paid a fixed salary, and the remaining 90 were paid a commission on each sale. The total dollar amount of 1 month's sales for each was recorded. Can we conclude that the commission salesperson outperforms the fixed-salary salesperson?

- 13.35** **Xr13-35** Credit scorecards were designed to be used to help financial institutions make decisions about loan applications (see page 63). However, some insurance companies have suggested that credit scores could also be used to determine insurance premiums, particularly car insurance. The Massachusetts Public Interest Research Group has come out against this proposal. To acquire more information, an executive for a car-insurance company gathered data about a random sample of the company's customers. She recorded whether the individual was involved in an accident in the last 3 years and determined the credit score. Can the executive infer that there is a difference in scores between those who did and those who did not have accidents in a 3-year period?

- 13.36** **Xr13-36*** Traditionally, wine has been sold in glass bottles with cork stoppers. The stoppers are supposed to keep air out of the bottle because oxygen is the enemy of wine, particularly red wine. Recent research appears to indicate that metal screw caps are more effective in keeping air out of the bottle. However, metal caps are perceived to be inferior and usually associated with cheaper brands of wine. To determine if this perception is wrong, a random sample of 130 people who drink at least one bottle per week on average was asked to participate in an experiment. All were given the same wine in two types of bottles. One group was given a corked bottle, and the other was given a bottle with a metal cap and asked to taste the wine and indicate what they think the retail price of the wine should be. Determine whether there is enough evidence to conclude that bottles of wine with metal caps are perceived to be cheaper.

- 13.37** **Xr13-37** Studies have shown that tired children have trouble learning because neurons become incapable of forming new synaptic connections that are necessary to encode memory.

The problem is that the school day starts too early. Awakened at dawn, teenage brains are still releasing melatonin, which makes them sleepy. Several years ago, Edina, Minnesota, changed its high school start from 7:25 A.M. to 8:30 A.M. The SAT scores for a random sample of students taken before the change and a random sample of SAT scores after the change were recorded. Can we infer from the data that SAT scores increased after the change in the school start time?

Overeating Experiments

Obesity is not only a health problem but it is a financial one as well. Obesity leads to health problems such as diabetes, heart disease, and strokes. These result in increased medical costs to individuals and employers. About one-third of North Americans are obese. Why do we overeat? The reasons are complicated. However, a number of experiments have shed some light on the subject. In most of the experiments, subjects were not aware that an experiment was being conducted. Conduct all tests at the 5% significance level.

13.38 [Xr13-38](#) Stale Popcorn Experiment

Students were invited to watch a newly released movie shortly after lunch. Half the students were given a medium-sized bucket of popcorn and the other half a large-sized bucket. The popcorn was not fresh. In fact, it was five days old and very stale. Both sizes of containers were large enough so that none of the students could finish. At the end of the movie the buckets were weighed and the results recorded. Do these data allow researchers to conclude that the larger the bucket the more people will eat?

(Source: Adapted from Brian Wansink and Seabum Park, "At the Movies: How External Cues and Perceived Taste Impact Consumption Volume, *Food Quality and Preference* 12:1 (January 2001): 69–74.)

13.39 [Xr13-39](#) Fake Wine Experiment

Diners at a restaurant were informed on entering that they would be receiving a free glass of wine, which they were told was Cabernet Sauvignon. However, it was not. It was a cheap wine sold for \$2 a bottle, popularly known as Two Buck Chuck. Half of the diners were told that the wine was from a new California winery. The other half of diners were informed that the wine they would receive was from a new North Dakota winery. (There are no wineries in North Dakota and even if there were the wine produced would not be considered excellent.) The restaurant featured a fixed menu so that all diners had exactly the same meal. The goal of the experiment was to determine whether

the perceived quality of the wine affected their dining experience. The amount of food consumed (measured as a percentage of the amount originally served that was consumed by the diner, so that 100 represents a diner who cleaned his or her plate) and the amount of time spent in the restaurant were recorded.

- Is there enough statistical evidence to infer that diners who believe they are drinking a fine wine (California wine) eat more than diners who believe they are drinking an inferior wine?
- Can we conclude that diners who believe they are drinking a fine wine (California wine) spend more time in the restaurant than diners who believe they are drinking an inferior wine?

(Source: Adapted from Brian Wansink, Collin Payne, and Jill North, "Fine as North Dakota Wine: Sensory Experiences and the Intake of Companion Foods," *Physiology and Behavior* 90:5 (2007): 712–16.)

13.40 [Xr13-40](#) Super Bowl Chicken Wings Experiment

A group of MBA students was invited to watch a Super Bowl game at a local sports bar. They were promised free chicken wings and free soda drinks. The students loaded up on the wings and when they were eaten could refill their plates. Waitresses were part of the experiment. For half the students they cleared the plates loaded with bones. The other half did not have their bone plates picked up. After the Super Bowl was over the number of wings consumed by each group of students was recorded. Is there sufficient statistical evidence to infer that people eat more when they are not aware of how much they have already eaten?

(Source: Adapted from Brian Wansink and Collin Payne, "Counting Bones: Environmental Cues that Decrease Food Intake," *Perceptual and Motor Skills* 104 (2007): 273–77.)

13.41 [Xr13-41](#) Bags of M&M's Experiment

A researcher recruited 40 adults at a PTA meeting and asked them to view a video. To thank them for their participation, 20 adults were given a one-pound bag of M&Ms and the other half a half pound. All were told that they can snack on the M&Ms while they watched the video. The numbers of M&Ms eaten was recorded. Is there sufficient evidence to conclude that more M&M's would be eaten by people who were given the full pound?

(Source: Adapted from Brian Wansink, "Can Package Size Accelerate Usage Volume?" *Journal of Marketing* 60:3 (July 1996): 1–14.)



GENERAL SOCIAL SURVEY EXERCISES

Exercises 13.42–13.63 are based on the 2012 survey. Use a 5% significance level for all tests. The following four exercises compare male and female American adults (SEX: 1 = Male, 2 = Female).

- 13.42 **GSS2012*** Study after study indicate that men earn higher incomes than women. To determine the extent of the differential in 2012 estimate with 95% confidence the difference between male and female annual incomes (INCOME).
- 13.43 **GSS2012*** In recent years, women have made up an increasing proportion of university students. Is there sufficient evidence to conclude that females and males differ in their years of education (EDUC)?
- 13.44 **GSS2012*** Estimate with 95% confidence the difference in the amount of television (TVHOURS) watched by males and females.
- 13.45 **GSS2012*** Some economists have theorized that one of the reasons that men earn higher incomes than women is that men work longer hours (HRS1). Conduct a statistical test to determine whether this contention is true.

The next four exercises compare American residents who were born in the United States and those who were born elsewhere (BORN: 1 = In the United States, 2 = Elsewhere).

- 13.46 **GSS2012*** Estimate with 95% confidence how much more education (EDUC) American-born residents have over their foreign-born counterparts.
- 13.47 **GSS2012*** Is there sufficient evidence to infer that Americans born in the United States and those born elsewhere have different incomes (INCOME)?
- 13.48 **GSS2012*** Who works longer hours (HRS1), American-born residents or foreign-born? Conduct a test to determine whether American-born residents work longer hours.
- 13.49 **GSS2012*** Conduct a test to determine whether American-born residents watch more television (TVHOURS) than foreign-born residents.

Exercises 13.50–13.53 compare Democratic and Republican Party supporters (PARTYID: 0, 1 = Democrat; 5, 6 = Republican).

- 13.50 **GSS2012*** Republican Party supporters tend to prefer smaller less intrusive government and lower taxes. Is this because Republicans have higher incomes? Do the data allow us to conclude that Republican supporters earn more income (INCOME) than Democrat supporters?

- 13.51 **GSS2012*** Estimate with 95% confidence the difference years of education (EDUC) between Democrats and Republicans.

- 13.52 **GSS2012*** Estimate with 95% confidence the difference between the number of hours of television watched (TVHOURS) by Democrats and Republicans.

- 13.53 **GSS2012*** Can we conclude that Republican and party supporters work longer hours than do Democratic Party supporters (HRS1)?

The following four exercises compare conservative and liberal Americans (POLVIEWS: 1, 2, 3 = Liberal; 5, 6, 7 = Conservative).

- 13.54 **GSS2012*** Estimate with 99% confidence the difference in incomes (INCOME) between conservatives and liberals.

- 13.55 **GSS2012*** Test to determine whether conservatives and liberals differ in the amount of education (EDUC).

- 13.56 **GSS2012*** Do conservatives work more hours (HRS1) than do liberals? Conduct a test to answer the question.

- 13.57 **GSS2012*** Estimate with 99% confidence the difference in the amount of television (TVHOURS) between conservatives and liberals.

The next three exercises compare Americans who work for the government and those who do not (WRKGOMT: 1 = Government, 2 = Private).

- 13.58 **GSS2012*** Is there enough evidence to infer that government workers have higher incomes (INCOME) than do private-sector workers?

- 13.59 **GSS2012*** Test to determine whether government and private-sector workers work different numbers of hours per week (HRS1).

- 13.60 **GSS2012*** Can we infer that government workers and private-sector workers differ in the amount of education (EDUC)?

Exercises 13.61–13.64 compare Americans who work for themselves versus those who do not (WRKSLF: 1 = Self-employed, 2 = Someone else).

- 13.61 **GSS2012*** Do the data allow us to conclude that people who work for themselves work fewer hours (HRS1) than do people who work for someone else?

- 13.62** **GSS2012*** Is there enough evidence to infer that people who work for themselves earn more money (INCOME) than do other workers?

- 13.63** **GSS2012*** Estimate with 95% confidence the difference in the amount of education (EDUC) between workers who work for themselves and other workers.

Exercises 13.64–13.85 are based on the 2010 survey. Use a 5% significance level for all tests. Exercises 13.64–13.67 compare Democratic and Republican Party supporters (PARTYID: 0, 1 = Democrat; 5, 6 = Republican).

- 13.64** **GSS2010*** Is there sufficient evidence to conclude that Republican Party supporters have more years of education (EDUC) than do Democratic Party supporters?

- 13.65** **GSS2010*** Estimate with 95% confidence the difference in the number of hours (HRS1) worked between Democratic and Republican Party supporters.

- 13.66** **GSS2010*** Can we infer that Republican Party supporters earn more income (INCOME) than do Democratic Party supporters?

- 13.67** **GSS2010*** Estimate with 95% confidence the difference in the amount of television (TVHOURS) between Democratic and Republican Party supporters.

The following four exercises compare conservative and liberal Americans (POLVIEWS: 1, 2, 3 = Liberal; 5, 6, 7 = Conservative).

- 13.68** **GSS2010*** Conduct a test to determine whether conservatives have higher incomes (INCOME) than do liberals.

- 13.69** **GSS2010*** Estimate with 95% confidence the difference in hours of work (HRS1) between conservatives and liberals.

- 13.70** **GSS2010*** Is there sufficient evidence to conclude that liberals and conservatives differ in the years of education (EDUC)?

- 13.71** **GSS2010*** Who watches more television (TVHOURS) conservatives or liberals? Conduct a test to determine whether liberals watch more television than conservatives.

The following four exercises compare male and female American adults (SEX: 1 = Male, 2 = Female).

- 13.72** **GSS2010*** Is there enough statistical evidence to infer that females are more educated (EDUC) than males?

- 13.73** **GSS2010*** Estimate with 95% confidence the difference in incomes (INCOME) between men and women.

- 13.74** **GSS2010*** Can we infer that men work longer hours (HRS1) than do women?

- 13.75** **GSS2010*** Estimate with 95% confidence the difference in the amount of television (TVHOURS) between men and women.

The next four exercises compare American residents who were born in the United States and those who were born elsewhere (BORN: 1 = In the United States, 2 = Elsewhere).

- 13.76** **GSS2010*** Is there enough evidence to infer that the incomes (INCOME) of American-born and foreign-born residents differ?

- 13.77** **GSS2010*** Estimate with 95% confidence the difference in the amount of education (EDUC) between American-born and foreign-born residents.

- 13.78** **GSS2010*** Is there sufficient evidence to conclude that American-born residents work longer hours (HRS1) than do foreign-born residents?

- 13.79** **GSS2010*** Estimate with 95% confidence the difference in television watching (TVHOURS) between American-born and foreign-born residents.

The next three exercises compare Americans who work for the government and those who do not (WRKGOWT: 1 = Government, 2 = Private).

- 13.80** **GSS2010*** Can we infer that private-sector workers work longer hours (HRS1) than do government workers?

- 13.81** **GSS2010*** Is there sufficient statistical evidence to conclude that government workers earn higher incomes (INCOME) than do private-sector workers?

- 13.82** **GSS2010*** Estimate with 95% confidence the difference in years of education (EDUC) between government and private-sector workers.

Exercises 13.61–13.64 compare Americans who work for themselves versus those who do not (WRKSLF: 1 = Self-employed, 2 = Someone else).

- 13.83** **GSS2010*** Can we infer that people who work for themselves earn higher incomes (INCOME) than do workers who work for someone else?

- 13.84** **GSS2010*** Is there enough evidence to infer that people who work for themselves work longer hours (HRS1) than do workers who work for others?

- 13.85** **GSS2010*** Estimate with 95% confidence the difference in education (EDUC) between self-employed individuals and people who work for someone else.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 13.86 **ANES2008*** Conduct a test at the 5% significance level to determine whether Republicans have more years of education (EDUC) than do Democrats (PARTY: 1 = Democrat, 2 = Republicans)?
- 13.87 **ANES2008*** Do the data from the American National Election Survey in 2008 allow us to infer at the 5%

significance level that males (GENDER: 1 = Male, 2 = Female) have higher incomes than females (INCOME)?

- 13.88 **ANES2004*** Repeat Exercise 13.87 using the ANES data from 2004.

13-2 OBSERVATIONAL AND EXPERIMENTAL DATA

As we've pointed out several times, the ability to properly interpret the results of a statistical technique is a crucial skill for students to develop. This ability is dependent on your understanding of Type I and Type II errors and the fundamental concepts that are part of statistical inference. However, there is another component that must be understood: the difference between **observational data** and **experimental data**. The difference results from the way the data are generated. The following example will demonstrate the difference between the two types.

EXAMPLE 13.3

DATA

Xm13-03

Dietary Effects of High-Fiber Breakfast Cereals

Despite some controversy, scientists generally agree that high-fiber cereals reduce the likelihood of various forms of cancer. However, one scientist claims that people who eat high-fiber cereal for breakfast will consume, on average, fewer calories for lunch than people who don't eat high-fiber cereal for breakfast. If this is true, high-fiber cereal manufacturers will be able to claim another advantage of eating their product—potential weight reduction for dieters. As a preliminary test of the claim, 150 people were randomly selected and asked what they regularly eat for breakfast and lunch. Each person was identified as either a consumer or a nonconsumer of high-fiber cereal, and the number of calories consumed at lunch was measured and recorded. These data are listed here. Can the scientist conclude at the 5% significance level that his belief is correct?

Calories Consumed at Lunch by Consumers of High-Fiber Cereal

568	646	607	555	530	714	593	647	650
498	636	529	565	566	639	551	580	629
589	739	637	568	687	693	683	532	651
681	539	617	584	694	556	667	467	
540	596	633	607	566	473	649	622	

Calories Consumed at Lunch by Nonconsumers of High-Fiber Cereal

705	754	740	569	593	637	563	421	514	536
819	741	688	547	723	553	733	812	580	833
706	628	539	710	730	620	664	547	624	644
509	537	725	679	701	679	625	643	566	594

Calories Consumed at Lunch by Nonconsumers of High-Fiber Cereal

613	748	711	674	672	599	655	693	709	596
582	663	607	505	685	566	466	624	518	750
601	526	816	527	800	484	462	549	554	582
608	541	426	679	663	739	603	726	623	788
787	462	773	830	369	717	646	645	747	
573	719	480	602	596	642	588	794	583	
428	754	632	765	758	663	476	490	573	

SOLUTION:

The appropriate technique is the unequal-variances t -test of $\mu_1 - \mu_2$, where μ_1 is the mean of the number of calories for lunch by consumers of high-fiber cereal for breakfast and μ_2 is the mean of the number of calories for lunch by nonconsumers of high-fiber cereal for breakfast. [The F -test of the ratio of two variances (not shown here) yielded $F = .3845$ and p -value = .0008.]

The hypotheses are

$$\begin{aligned} H_0: (\mu_1 - \mu_2) &= 0 \\ H_1: (\mu_1 - \mu_2) &< 0 \end{aligned}$$

The Excel printout is shown next. The manually calculated and Minitab-produced results are identical.

	A	B	C
1	t-Test: Two-Sample Assuming Unequal Variances		
2			
3		Consumers	Nonconsumers
4	Mean	604.02	633.23
5	Variance	4103	10670
6	Observations	43	107
7	Hypothesized Mean Difference	0	
8	df	123	
9	t Stat	-2.09	
10	P(T<=t) one-tail	0.0193	
11	t Critical one-tail	1.6573	
12	P(T <=t) two-tail	0.0386	
13	t Critical two-tail	1.9794	

INTERPRET

The value of the test statistic is -2.09 . The one-tail p -value is $.0193$. We observe that the p -value of the test is small (and the test statistic falls into the rejection region). As a result, we conclude that there is sufficient evidence to infer that consumers of high-fiber cereal do eat fewer calories at lunch than do nonconsumers. From this result, we're inclined to believe that eating a high-fiber cereal at breakfast may be a way to reduce weight. However, other interpretations are plausible. For example, people who eat fewer calories are probably more health conscious, and such people are more likely to eat high-fiber cereal as part of a healthy breakfast. In this interpretation, high-fiber cereals do not necessarily lead to fewer calories at lunch. Instead, another factor, general health consciousness, leads to both fewer calories at lunch and high-fiber cereal for breakfast. Notice that the conclusion of the statistical procedure is unchanged. On average, people who eat high-fiber cereal consume fewer calories at lunch. However, because of the way the data were gathered, we have more difficulty interpreting this result.

Suppose that we redo Example 13.3 using the experimental approach. We randomly select 150 people to participate in the experiment. We randomly assign 75 to eat high-fiber cereal for breakfast and the other 75 to eat something else. We then record the number of calories each person consumes at lunch. Ideally, in this experiment both groups will be similar in all other dimensions, including health consciousness. (Larger sample sizes increase the likelihood that the two groups will be similar.) If the statistical result is about the same as in Example 13.3, we may have some valid reason to believe that high-fiber cereal at breakfast leads to a decrease in caloric intake at lunch.

Experimental data are usually more expensive to obtain because of the planning required to set up the experiment; observational data usually require less work to gather. Furthermore, in many situations it is impossible to conduct a controlled experiment. For example, suppose that we want to determine whether an undergraduate degree in engineering better prepares students for an MBA than does an arts degree. In a controlled experiment, we would randomly assign some students to achieve a degree in engineering and other students to obtain an arts degree. We would then make them sign up for an MBA program where we would record their grades. Unfortunately for statistical despots (and fortunately for the rest of us), we live in a democratic society, which makes the coercion necessary to perform this controlled experiment impossible.

To answer our question about the relative performance of engineering and arts students, we have no choice but to obtain our data by observational methods. We would take a random sample of engineering students and arts students who have already entered MBA programs and record their grades. If we find that engineering students do better, we may tend to conclude that an engineering background better prepares students for an MBA program. However, it may be true that better students tend to choose engineering as their undergraduate major and that better students achieve higher grades in all programs, including the MBA program.

Although we've discussed observational and experimental data in the context of the test of the difference between two means, you should be aware that the issue of how the data are obtained is relevant to the interpretation of all the techniques that follow.



EXERCISES

- 13.89** Refer to Exercise 13.17. If the data are observational, describe another conclusion other than the one that infers that Tastee is better for babies.
- 13.90** Are the data in Exercise 13.18 observational or experimental? Explain. If the data are observational, describe a method of producing experimental data.
- 13.91** Refer to Exercise 13.24.
- Are the data observational or experimental?
 - If the data are observational, describe a method of answering the question with experimental data?
 - If the data are observational, produce another explanation for the statistical outcome.
- 13.92** Suppose that you wish to test to determine whether one method of teaching statistics is better than another.
- Describe a data-gathering process that produces observational data.
 - Describe a data-gathering process that produces experimental data.
- 13.93** Put yourself in place of the director of research and development for a pharmaceutical company. When a new drug is developed it undergoes a number of tests. One of the tests is designed to determine whether the drug is safe and effective. Your company has just developed a drug that is designed to alleviate the symptoms of degenerative diseases such as multiple sclerosis. Design an experiment that tests the new drug.

- 13.94** You wish to determine whether MBA graduates who majored in finance attract higher starting salaries than MBA graduates who majored in marketing.
- Describe a data-gathering process that produces observational data.
 - Describe a data-gathering process that produces experimental data.
 - If observational data indicate that finance majors attract higher salaries than do marketing majors, provide two explanations for this result.
- 13.95** Suppose that you are analyzing one of the hundreds of statistical studies linking smoking with lung cancer. The study analyzed thousands of randomly selected people, some of whom had lung cancer.

The statistics indicate that those who have lung cancer smoked on average significantly more than those who did not have lung cancer.

- Explain how you know that the data are observational.
- Is there another interpretation of the statistics other than the obvious one that smoking causes lung cancer? If so, what is it? (Students who produce the best answers will be eligible for a job in the public relations department of a tobacco company.)
- Is it possible to conduct a controlled experiment to produce data that address the question of the relationship between smoking and lung cancer? If so, describe the experiment.

13-3 / INFERENCE ABOUT THE DIFFERENCE BETWEEN TWO MEANS: MATCHED PAIRS EXPERIMENT

We continue our presentation of statistical techniques that address the problem of comparing two populations of interval data. In Section 13-1, the parameter of interest was the difference between two population means, where the data were generated from independent samples. In this section, the data are gathered from a matched pairs experiment. To illustrate why matched pairs experiments are needed and how we deal with data produced in this way, consider the following example.

EXAMPLE 13.4

DATA
Xm13-04

Comparing Salary Offers for Finance and Marketing MBA Majors, Part 1

In the last few years, a number of web-based companies that offer job placement services have been created. The manager of one such company wanted to investigate the job offers recent MBAs were obtaining. In particular, she wanted to know whether finance majors were being offered higher salaries than marketing majors. In a preliminary study, she randomly sampled 50 recently graduated MBAs, half of whom majored in finance and half in marketing. From each she obtained the highest salary offer (including benefits). These data are listed here. Can we infer that finance majors obtain higher salary offers than do marketing majors among MBAs?

Highest salary offer made to finance majors

61,228	51,836	20,620	73,356	84,186	79,782	29,523	80,645	76,125
62,531	77,073	86,705	70,286	63,196	64,358	47,915	86,792	75,155
65,948	29,392	96,382	80,644	51,389	61,955	63,573		

Highest salary offer made to marketing majors

73,361	36,956	63,627	71,069	40,203	97,097	49,442	75,188	59,854
79,816	51,943	35,272	60,631	63,567	69,423	68,421	56,276	47,510
58,925	78,704	62,553	81,931	30,867	49,091	48,843		

SOLUTION:**IDENTIFY**

The objective is to compare two populations of interval data. The parameter is the difference between two means $\mu_1 - \mu_2$ (where μ_1 = mean highest salary offer to finance majors and μ_2 = mean highest salary offer to marketing majors). Because we want to determine whether finance majors are offered higher salaries, the alternative hypothesis will specify that μ_1 is greater than μ_2 . The *F*-test for variances was conducted, and the results indicate that there is not enough evidence to infer that the population variances differ. Hence we use the equal-variances test statistic:

$$\begin{aligned} H_0: (\mu_1 - \mu_2) &= 0 \\ H_1: (\mu_1 - \mu_2) &> 0 \end{aligned}$$

$$\text{Test statistic: } t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}}$$

COMPUTE**MANUALLY:**

From the data, we calculated the following statistics:

$$\begin{aligned} \bar{x}_1 &= 65,624 \\ \bar{x}_2 &= 60,423 \\ s_1^2 &= 360,433,294 \\ s_2^2 &= 262,228,559 \\ s_p^2 &= \frac{(n_1 - 1)s_1^2 + (n_2 - 1)s_2^2}{n_1 + n_2 - 2} \\ &= \frac{(25 - 1)(360,433,294) + (25 - 1)(262,228,559)}{25 + 25 - 2} \\ &= 311,330,926 \end{aligned}$$

The value of the test statistic is computed next:

$$\begin{aligned} t &= \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}} \\ &= \frac{(65,624 - 60,423) - (0)}{\sqrt{311,330,926 \left(\frac{1}{25} + \frac{1}{25} \right)}} \\ &= 1.04 \end{aligned}$$

The number of degrees of freedom of the test statistic is

$$\nu = n_1 + n_2 - 2 = 25 + 25 - 2 = 48$$

The rejection region is

$$t > t_{\alpha, \nu} = t_{.05, 48} \approx 1.676$$

EXCEL

	A	B	C
1	t-Test: Two-Sample Assuming Equal Variances		
2			
3		Finance	Marketing
4	Mean	65,624	60,423
5	Variance	360,433,294	262,228,559
6	Observations	25	25
7	Pooled Variance	311,330,926	
8	Hypothesized Mean Difference	0	
9	df	48	
10	t Stat	1.04	
11	P(T<=t) one-tail	0.1513	
12	t Critical one-tail	1.6772	
13	P(T<=t) two-tail	0.3026	
14	t Critical two-tail	2.0106	

MINITAB**Two-Sample T-Test and CI: Finance, Marketing**

Two-sample T for Finance vs Marketing

	N	Mean	StDev	SE Mean
Finance	25	65624	18985	3797
Marketing	25	60423	16193	3239

Difference = mu (Finance) - mu (Marketing)

Estimate for difference: 5201.00

95% lower bound for difference: -3169.42

T-Test of difference = 0 (vs >): T-Value = 1.04 P-Value = 0.151 DF = 48
Both use Pooled StDev = 17644.5722**INTERPRET**

The value of the test statistic ($t = 1.04$) and its p -value (.1513) indicate that there is very little evidence to support the hypothesis that finance majors receive higher salary offers than marketing majors.

Notice that we have some evidence to support the alternative hypothesis. The difference in sample means is

$$(\bar{x}_1 - \bar{x}_2) = (65,624 - 60,423) = 5,201$$

However, we judge the difference between sample means in relation to the standard error of $\bar{x}_1 - \bar{x}_2$. As we've already calculated,

$$s_p^2 = 311,330,926$$

and

$$\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)} = 4,991$$

Consequently, the value of the test statistic is $t = 5,201/4,991 = 1.04$, a value that does not allow us to infer that finance majors attract higher salary offers. We can see that although the difference between the sample means was quite large, the variability of the data as measured by s_p^2 was also large, resulting in a small test statistic value.

EXAMPLE 13.5

DATA

Xm13-05

Comparing Salary Offers for Finance and Marketing MBA Majors, Part 2

Suppose now that we redo the experiment in the following way. We examine the transcripts of finance and marketing MBA majors. We randomly select a finance and a marketing major whose grade point average (GPA) falls between 3.92 and 4 (based on a maximum of 4). We then randomly select a finance and a marketing major whose GPA is between 3.84 and 3.92. We continue this process until the 25th pair of finance and marketing majors is selected whose GPA fell between 2.0 and 2.08. (The minimum GPA required for graduation is 2.0.) As we did in Example 13.4, we recorded the highest salary offer. These data, together with the GPA group, are listed here. Can we conclude from these data that finance majors draw larger salary offers than do marketing majors?

Group	Finance	Marketing
1	95,171	89,329
2	88,009	92,705
3	98,089	99,205
4	106,322	99,003
5	74,566	74,825
6	87,089	77,038
7	88,664	78,272
8	71,200	59,462
9	69,367	51,555
10	82,618	81,591
11	69,131	68,110
12	58,187	54,970
13	64,718	68,675
14	67,716	54,110
15	49,296	46,467
16	56,625	53,559
17	63,728	46,793
18	55,425	39,984
19	37,898	30,137
20	56,244	61,965
21	51,071	47,438
22	31,235	29,662
23	32,477	33,710
24	35,274	31,989
25	45,835	38,788

SOLUTION:

The experiment described in Example 13.4 is one in which the samples are independent. In other words, there is no relationship between the observations in one sample and the observations in the second sample. However, in this example the experiment

was designed in such a way that each observation in one sample is matched with an observation in the other sample. The matching is conducted by selecting finance and marketing majors with similar GPAs. Thus, it is logical to compare the salary offers for finance and marketing majors in each group. This type of experiment is called **matched pairs**. We now describe how we conduct the test.

For each GPA group, we calculate the matched pair difference between the salary offers for finance and marketing majors.

Group	Finance	Marketing	Difference
1	95,171	89,329	5,842
2	88,009	92,705	-4,696
3	98,089	99,205	-1,116
4	106,322	99,003	7,319
5	74,566	74,825	-259
6	87,089	77,038	10,051
7	88,664	78,272	10,392
8	71,200	59,462	11,738
9	69,367	51,555	17,812
10	82,618	81,591	1,027
11	69,131	68,110	1,021
12	58,187	54,970	3,217
13	64,718	68,675	-3,957
14	67,716	54,110	13,606
15	49,296	46,467	2,829
16	56,625	53,559	3,066
17	63,728	46,793	16,935
18	55,425	39,984	15,441
19	37,898	30,137	7,761
20	56,244	61,965	-5,721
21	51,071	47,438	3,633
22	31,235	29,662	1,573
23	32,477	33,710	-1,233
24	35,274	31,989	3,285
25	45,835	38,788	7,047

In this experimental design, the parameter of interest is the **mean of the population of differences**, which we label μ_D . Note that μ_D does in fact equal $\mu_1 - \mu_2$, but we test μ_D because of the way the experiment was designed. Hence, the hypotheses to be tested are

$$\begin{aligned} H_0: \mu_D &= 0 \\ H_1: \mu_D &> 0 \end{aligned}$$

We have already presented inferential techniques about a population mean. Recall that in Chapter 12 we introduced the *t*-test of μ . Thus, to test hypotheses about μ_D , we use the following test statistic.

Test Statistic for μ_D

$$t = \frac{\bar{x}_D - \mu_D}{s_D / \sqrt{n_D}}$$

which is Student t distributed with $v = n_D - 1$ degrees of freedom, provided that the differences are normally distributed.

Aside from the subscript D , this test statistic is identical to the one presented in Chapter 12. We conduct the test in the usual way.

COMPUTE**M A N U A L L Y:**

Using the differences computed above, we find the following statistics:

$$\bar{x}_D = 5,065$$

$$s_D = 6,647$$

from which we calculate the value of the test statistic:

$$t = \frac{\bar{x}_D - \mu_D}{s_D / \sqrt{n_D}} = \frac{5,065 - 0}{6,647 / \sqrt{25}} = 3.81$$

The rejection region is

$$t > t_{\alpha, \nu} = t_{.05, 24} = 1.711$$

EXCEL

	A	B	C
1	t-Test: Paired Two Sample for Means		
2			
3		Finance	Marketing
4	Mean	65,438	60,374
5	Variance	444,981,810	469,441,785
6	Observations	25	25
7	Pearson Correlation	0.9520	
8	Hypothesized Mean Difference	0	
9	df	24	
10	t Stat	3.81	
11	P(T<=t) one-tail	0.0004	
12	t Critical one-tail	1.7109	
13	P(T<=t) two-tail	0.0009	
14	t Critical two-tail	2.0639	

Excel prints the sample means, variances, and sample sizes for each sample (as well as the coefficient of correlation), which implies that the procedure uses these statistics. It doesn't. The technique is based on computing the paired differences from which the mean, variance, and sample size are determined. Excel should have printed these statistics.

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm13-05.)
2. Click **Data, Data Analysis**, and **t-Test: Paired Two-Sample for Means**.

*If one or both columns contain an empty cell (representing missing data) the entire row must be removed. See Keller's website appendix Removing Cells in Excel.

3. Specify the **Variable 1 Range** (B1:B26) and the **Variable 2 Range** (C1:C26). Type the value of the **Hypothesized Mean Difference** (0) and specify a value for α (.05).

MINITAB

Paired T-Test and CI: Finance, Marketing

Paired T for Finance - Marketing

	N	Mean	StDev	SE Mean
Finance	25	65438.2	21094.6	4218.9
Marketing	25	60373.7	21666.6	4333.3
Difference	25	5064.52	6646.90	1329.38

95% lower bound for mean difference: 2790.11
T-Test of mean difference = 0 (vs > 0): T-Value = 3.81 P-Value = 0.000

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm13-05.)
2. Click **Stat**, **Basic Statistics**, and **Paired t . . .**
3. Select the variable names of the **First sample** (Finance) and **Second sample** (Marketing). Click **Options . . .**.
4. In the **Test Mean** box, type the hypothesized mean of the paired difference (0), and specify the **Alternative** (greater than).

INTERPRET

The value of the test statistic is $t = 3.81$ with a p -value of .0004. There is now overwhelming evidence to infer that finance majors obtain higher salary offers than marketing majors. By redoing the experiment as matched pairs, we were able to extract this information from the data.

13-3a Estimating the Mean Difference

We derive the confidence interval estimator of μ_D using the usual form for the confidence interval.

Confidence Interval Estimator of μ_D

$$\bar{x}_D \pm t_{\alpha/2} \frac{s_D}{\sqrt{n_D}}$$

EXAMPLE 13.6

DATA

Xm13-05

Comparing Salary Offers for Finance and Marketing MBA Majors, Part 3

Compute the 95% confidence interval estimate of the mean difference in salary offers between finance and marketing majors in Example 13.5.

SOLUTION:**COMPUTE****MANUALLY:**

The 95% confidence interval estimate of the mean difference is

$$\bar{x}_D \pm t_{\alpha/2} \frac{s_D}{\sqrt{n_D}} = 5,065 \pm 2.064 \frac{6,647}{\sqrt{25}} = 5,065 \pm 2,744$$

$$\text{LCL} = 2,321 \quad \text{and} \quad \text{UCL} = 7,809$$

EXCEL

	A	B	C	D
1	t-Estimate : Two Means (Matched Pairs)			
2				
3		Difference		
4	Mean	5065		
5	Variance	44181217		
6	Observations	25		
7	Degrees of Freedom	24		
8	Confidence Level	0.95		
9	Confidence Interval Estimate	5065	±	2744
10	LCL	2321		
11	UCL	7809		

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm13-05.)
2. Click Add-Ins, Data Analysis Plus, and t-Estimate: Two Means.
3. Specify the Variable 1 Range (B1:B51) and the Variable 2 Range (C1:C51). Click Matched Pairs and the value for α (.05).

MINITAB**Paired T-Test and CI: Finance, Marketing**

Paired T for Finance - Marketing

	N	Mean	StDev	SE Mean
Finance	25	65438.2	21094.6	4218.9
Marketing	25	60373.7	21666.6	4333.3
Difference	25	5064.52	6646.90	1329.38

95% CI for mean difference: (2320.82, 7808.22)

T-Test of mean difference = 0 (vs not = 0): T-Value = 3.81 P-Value = 0.001

*If one or both columns contain an empty cell (representing missing data) the entire row must be removed. See Keller's website appendix Removing Empty Cells in Excel.

INSTRUCTIONS

Follow the instructions to test the paired difference. However, you must specify **not equal** for the **Alternative** hypothesis to produce the two-sided confidence interval estimate of the mean difference.

INTERPRET

We estimate that the mean salary offer to finance majors exceeds the mean salary offer to marketing majors by an amount that lies between \$2,321 and \$7,808 (using the computer output).

13-3b Independent Samples or Matched Pairs: Which Experimental Design Is Better?

Examples 13.4 and 13.5 demonstrated that the experimental design is an important factor in statistical inference. However, these two examples raise several questions about experimental designs.

- 1.** Why does the matched pairs experiment result in concluding that finance majors receive higher salary offers than do marketing majors, whereas the independent samples experiment could not?
- 2.** Should we always use the matched pairs experiment? In particular, are there disadvantages to its use?
- 3.** How do we recognize when a matched pairs experiment has been performed?

Here are our answers.

1. The matched pairs experiment worked in Example 13.5 by reducing the variation in the data. To understand this point, examine the statistics from both examples. In Example 13.4, we found $\bar{x}_1 - \bar{x}_2 = 5,201$. In Example 13.5, we computed $\bar{x}_D = 5,065$. Thus, the numerators of the two test statistics were quite similar. However, the test statistic in Example 13.5 was much larger than the test statistic in Example 13.4 because of the standard errors. In Example 13.4, we calculated

$$s_p^2 = 311,330,926 \quad \text{and} \quad \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)} = 4,991$$

Example 13.5 produced

$$s_D = 6,647 \quad \text{and} \quad \frac{s_D}{\sqrt{n_D}} = 1,329$$

As you can see, the difference in the test statistics was caused not by the numerator, but by the denominator. This raises another question: Why was the variation in the data of Example 13.4 so much greater than the variation in the data of Example 13.5? If you examine the data and statistics from Example 13.4, you will find that there was a great deal of variation *between* the salary offers in each sample. In other words, some MBA graduates received high salary offers and others relatively low ones. This high level of variation, as expressed by s_p^2 , made the difference

between the sample means appear to be small. As a result, we could not conclude that finance majors attract higher salary offers.

Looking at the data from Example 13.5, we see that there is very little variation between the observations of the paired differences. The variation caused by different GPAs has been decreased markedly. The smaller variation causes the value of the test statistic to be larger. Consequently, we conclude that finance majors obtain higher salary offers.

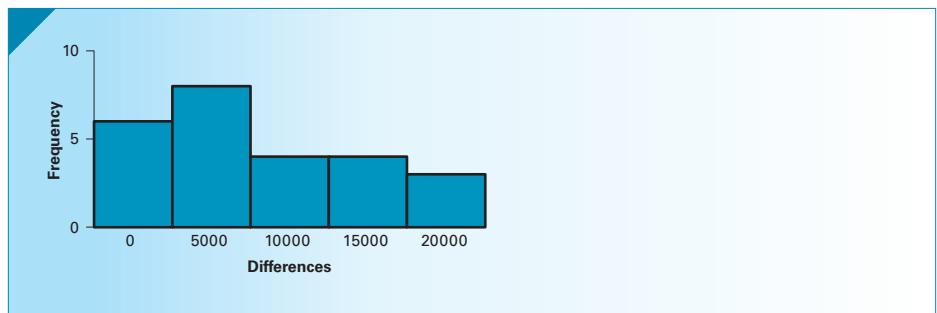
2. Will the matched pairs experiment always produce a larger test statistic than the independent samples experiment? The answer is, not necessarily. Suppose that in our example we found that companies did not consider GPAs when making decisions about how much to offer the MBA graduates. In such circumstances, the matched pairs experiment would result in no significant decrease in variation when compared to independent samples. It is possible that the matched pairs experiment may be less likely to reject the null hypothesis than the independent samples experiment. The reason can be seen by calculating the degrees of freedom. In Example 13.4, the number of degrees of freedom was 48, whereas in Example 13.5, it was 24. Even though we had the same number of observations (25 in each sample), the matched pairs experiment had half the number of degrees of freedom as the equivalent independent samples experiment. For exactly the same value of the test statistic, a smaller number of degrees of freedom in a Student t distributed test statistic yields a larger p -value. What this means is that if there is little reduction in variation to be achieved by the matched pairs experiment, the statistics practitioner should choose instead to conduct the experiment with independent samples.
3. As you've seen, in this book we deal with questions arising from experiments that have already been conducted. Consequently, one of your tasks is to determine the appropriate test statistic. In the case of comparing two populations of interval data, you must decide whether the samples are independent (in which case the parameter is $\mu_1 - \mu_2$) or matched pairs (in which case the parameter is μ_D) to select the correct test statistic. To help you do so, we suggest you ask and answer the following question: Does some natural relationship exist between each pair of observations that provides a logical reason to compare the first observation of sample 1 with the first observation of sample 2, the second observation of sample 1 with the second observation of sample 2, and so on? If so, the experiment was conducted by matched pairs. If not, it was conducted using independent samples.

13-3c Observational and Experimental Data

The points we made in Section 13-2 are also valid in this section: We can design a matched pairs experiment where the data are gathered using a controlled experiment or by observation. The data in Examples 13.4 and 13.5 are observational. As a consequence, when the statistical result provided evidence that finance majors attracted higher salary offers, it did not necessarily mean that students educated in finance are more attractive to prospective employers. It may be, for example, that better students major in finance and better students achieve higher starting salaries.

13-3d Checking the Required Condition

The validity of the results of the t -test and estimator of μ_D depends on the normality of the differences (or large enough sample sizes). The histogram of the differences (Figure 13.6) is positively skewed but not enough so that the normality requirement is violated.

FIGURE 13.6 Histogram of Differences in Example 13.5

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13-3e Violation of Required Condition

If the differences are very nonnormal, we cannot use the t -test of μ_D . We can, however, employ a nonparametric technique—the Wilcoxon signed rank sum test for matched pairs, which we present in Chapter 19.*

13-3f Developing an Understanding of Statistical Concepts 1

Two of the most important principles in statistics were applied in this section. The first is the concept of analyzing sources of variation. In Examples 13.4 and 13.5, we showed that by reducing the variation between salary offers in each sample we were able to detect a real difference between the two majors. This was an application of the more general procedure of analyzing data and attributing some fraction of the variation to several sources. In Example 13.5, the two sources of variation were the GPA and the MBA major. However, we were not interested in the variation between graduates with differing GPAs. Instead, we only wanted to eliminate that source of variation, making it easier to determine whether finance majors draw larger salary offers.

In Chapter 14, we will introduce a technique called the *analysis of variance* that does what its name suggests: It analyzes sources of variation in an attempt to detect real differences. In most applications of this procedure, we will be interested in each source of variation and not simply in reducing one source. We refer to the process as *explaining the variation*. The concept of explained variation is also applied in Chapters 16–18, where we introduce regression analysis.

13-3g Developing an Understanding of Statistical Concepts 2

The second principle demonstrated in this section is that statistics practitioners can design data-gathering procedures in such a way that they can analyze sources of variation. Before conducting the experiment in Example 13.5, the statistics practitioner suspected that there were large differences between graduates with different GPAs. Consequently, the experiment was organized so that the effects of those differences were mostly eliminated. It is also possible to design experiments that allow for easy detection

*Instructors who wish to teach the use of nonparametric techniques for testing the mean difference when the normality requirement is not satisfied should use Keller's website Appendix Introduction to Nonparametric Techniques and Keller's website Appendix Wilcoxon Rank Sum Test and Wilcoxon Signed Rank Sum Test.

of real differences and minimize the costs of data gathering. Unfortunately, we will not present this topic. However, you should understand that the entire subject of the design of experiments is an important one, because statistics practitioners often need to be able to analyze data to detect differences, and the cost is almost always a factor.

Here is a summary of how we determine when to use these techniques.

Factors that Identify the *t*-Test and Estimator of μ_D

1. **Problem objective:** Compare two populations
2. **Data type:** Interval
3. **Descriptive measurement:** Central location
4. **Experimental design:** Matched pairs



EXERCISES

Applications

Conduct all tests at the 5% significance level.

- 13.96** [Xr13-96](#) Many people use scanners to read documents and store them in a Word (or some other software) file. To help determine which brand of scanner to buy, a student conducts an experiment wherein eight documents are scanned by each of the two scanners in which he is interested. He records the number of errors made by each. These data are listed here. Can he infer that Brand A (the more expensive scanner) is better than Brand B?

Document	1	2	3	4	5	6	7	8
Brand A	17	29	18	14	21	25	22	29
Brand B	21	38	15	19	22	30	31	37

- 13.97** [Xr13-97](#) How effective are antilock brakes, which pump very rapidly rather than lock and thus avoid skids? As a test, a car buyer organized an experiment. He hit the brakes and, using a stopwatch, recorded the number of seconds it took to stop an ABS-equipped car and another identical car without ABS. The speeds when the brakes were applied and the number of seconds each took to stop on dry pavement are listed here. Can we infer that ABS is better?

Speeds	20	25	30	35	40	45	50	55
ABS	3.6	4.1	4.8	5.3	5.9	6.3	6.7	7.0
Non-ABS	3.4	4.0	5.1	5.5	6.4	6.5	6.9	7.3

- 13.98** [Xr13-98](#) In a preliminary study to determine whether the installation of a camera designed to catch cars that go through red lights affects the number of violators, the number of red-light

runners was recorded for each day of the week before and after the camera was installed. These data are listed here. Can we infer that the camera reduces the number of red-light runners?

Day	Sunday	Monday	Tuesday	Wednesday
Before	7	21	27	18
After	8	18	24	19

Day	Thursday	Friday	Saturday
Before	20	24	16
After	16	19	16

- 13.99** [Xr13-99](#) In an effort to determine whether a new type of fertilizer is more effective than the type currently in use, researchers took 12 two-acre plots of land scattered throughout the county. Each plot was divided into two equal-size subplots, one of which was treated with the current fertilizer and the other of which was treated with the new fertilizer. Wheat was planted, and the crop yields were measured.

Plot	1	2	3	4	5	6	7	8	9	10	11	12
Current fertilizer	56	45	68	72	61	69	57	55	60	72	75	66
New fertilizer	60	49	66	73	59	67	61	60	58	75	72	68

- a. Can we conclude at the 5% significance level that the new fertilizer is more effective than the current one?
- b. Estimate with 95% confidence the difference in mean crop yields between the two fertilizers.
- c. What is the required condition(s) for the validity of the results obtained in parts (a) and (b)?

- d. Is the required condition(s) satisfied?
- e. Are these data experimental or observational? Explain.
- f. How should the experiment be conducted if the researchers believed that the land throughout the county was essentially the same?

- 13.100** *Xr13-100* The president of a large company is in the process of deciding whether to adopt a lunch-time exercise program. The purpose of such programs is to improve the health of workers and, in so doing, reduce medical expenses. To get more information, he instituted an exercise program for the employees in one office. The president knows that during the winter months medical expenses are relatively high because of the incidence of colds and flu. Consequently, he decides to use a matched pairs design by recording medical expenses for the 12 months before the program and for 12 months after the program. The “before” and “after” expenses (in thousands of dollars) are compared on a month-to-month basis and shown here.
- a. Do the data indicate that exercise programs reduce medical expenses? (Test with $\alpha = .05$.)
 - b. Estimate with 95% confidence the mean savings produced by exercise programs.
 - c. Was it appropriate to conduct a matched pairs experiment? Explain.

Month	Jan	Feb	Mar	Apr	May	Jun
Before program	68	44	30	58	35	33
After program	59	42	20	62	25	30
Month	Jul	Aug	Sep	Oct	Nov	Dec
Before program	52	69	23	69	48	30
After program	56	62	25	75	40	26

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level unless specified otherwise.

- 13.101** *Xr13-101* One measure of the state of the economy is the amount of money homeowners pay on their mortgage each month. To determine the extent of change between this year and 5 years ago, a random sample of 150 homeowners was drawn. The monthly mortgage payments for each homeowner for this year and for 5 years ago were recorded. (The amounts have been adjusted so that we’re comparing constant dollars.) Can we infer that mortgage payments have risen over the past 5 years?

- 13.102** *Xr13-102* Do waiters or waitresses earn larger tips? To answer this question, a restaurant consultant undertook a preliminary study. The study involved measuring the percentage of the total bill left as a

tip for one randomly selected waiter and one randomly selected waitress in each of 50 restaurants during a 1-week period. What conclusions can be drawn from these data?

- 13.103** *Xr13-103* To determine the effect of advertising in the Yellow Pages, Bell Telephone took a sample of 40 retail stores that did not advertise in the Yellow Pages last year but did so this year. The annual sales (in thousands of dollars) for each store in both years were recorded.
- a. Estimate with 90% confidence the improvement in sales between the two years.
 - b. Can we infer that advertising in the Yellow Pages improves sales?
 - c. Check to ensure that the required condition(s) of the techniques used in parts (a) and (b) is satisfied.
 - d. Would it be advantageous to perform this experiment with independent samples? Explain why or why not.

- 13.104** *Xr13-104* Because of the high cost of energy, homeowners in northern climates need to find ways to cut their heating costs. A building contractor wanted to investigate the effect on heating costs of increasing the insulation. As an experiment, he located a large subdevelopment built around 1970 with minimal insulation. His plan was to insulate some of the houses and compare the heating costs in the insulated homes with those that remained uninsulated. However, it was clear to him that the size of the house was a critical factor in determining heating costs. Consequently, he found 16 pairs of identical-sized houses ranging from about 1,200 to 2,800 square feet. He insulated one house in each pair (levels of R20 in the walls and R32 in the attic) and left the other house unchanged. The heating cost for the following winter season was recorded for each house.
- a. Do these data allow the contractor to infer at the 10% significance level that the heating cost for insulated houses is less than that for the uninsulated houses?
 - b. Estimate with 95% confidence the mean savings due to insulating the house.
 - c. What is the required condition for the use of the techniques in parts (a) and (b)?

- 13.105** *Xr13-105* The cost of health care is rising faster than most other items. To learn more about the problem a survey was undertaken to determine whether differences in health care expenditures exist between men and women. The survey randomly sampled men and women aged 21, 22, ..., 65 and determined the total amount spent on health care. Do these data allow us to infer that men and women spend different amounts on health care? (Source: Bureau of Labor Statistics, Consumer Expenditure Survey.)

13.106 *Xr13-106* The fluctuations in the stock market induce some investors to sell and move their money into more stable investments. To determine the degree to which recent fluctuations affected ownership, a random sample of 170 people who confirmed that they owned some stock was surveyed. The values of the holdings were recorded at the end of last year and at the end of the year before. Can we infer that the value of the stock holdings has decreased?

13.107 *Xr13-107* Are Americans more deeply in debt this year compared to last year? To help answer this question a statistics practitioner randomly sampled Americans this year and last year. The sampling was conducted so that the samples were matched by the age of the head of the household. For each, the ratio of debt payments to household income was recorded. Can we infer that the ratios are higher this year than last?

13.108 *Xr13-108* Every April Americans and Canadians fill out their tax return forms. Many turn to tax preparation companies to do this tedious job. The question arises, Are there differences between companies? In an experiment two of the largest companies were asked to prepare the tax returns of a sample of 55 taxpayers. The amounts of tax payable were recorded. Can we conclude that company 1's service results in higher tax payable?

13.109 *Xr13-109* Refer to Exercise 13.33. Suppose now we redo the experiment in the following way. On 20

randomly selected cars, one of each type of tire is installed on the rear wheels and as before, the cars are driven until the tires wear out. The number of miles until wear-out occurred was recorded. Can we conclude from these data that the new tire is superior?

13.110 Refer to Exercises 13.33 and 13.109. Explain why the matched pairs experiment produced significant results whereas the independent samples *t*-test did not.

13.111 *Xr13-111* Refer to Examples 13.4 and 13.5. Suppose that another experiment is conducted. Finance and marketing MBA majors were matched according to their undergraduate GPA. As in the previous examples, the highest starting salary offers were recorded. Can we infer from these data that finance majors attract higher salary offers than marketing majors?

13.112 Discuss why the experiment in Example 13.5 produced a significant test result whereas the one in Exercise 13.111 did not.

13.113 *Xr13-113* Refer to Example 13.2. The actual after and before operating incomes were recorded.

- a. Test to determine whether there is enough evidence to infer that for companies where an offspring takes the helm there is a decrease in operating income.
- b. Is there sufficient evidence to conclude that when an outsider becomes CEO the operating income increases?



GENERAL SOCIAL SURVEY EXERCISES

Excel users should note that there may be rows with empty cells (representing missing data) that must be removed. Use a 5% significance level.

13.114 *GSS2012** The general trend over the last century is that each generation is more educated than its predecessor. Has this trend continued? To answer

this question determine whether there is sufficient evidence that Americans are more educated than their fathers (EDUC and PAEDUC)?

13.115 *GSS2012** Is there sufficient evidence to infer that Americans are more educated than their mothers (EDUC and MAEDUC)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISE

Excel users should note that there may be rows with empty cells (representing missing data) that must be removed.

13.116 *ANES2008** Estimate with 95% confidence the average difference between the amount of time spent watching or reading news on the Internet (TIME1) and the amount of time spent reading news in a printed newspaper (TIME3) during a typical day.

13.117 *ANES2008** Estimate with 95% confidence the average difference between the amount of time spent watching news on television (not including sports) (TIME2) and the amount of time spent reading news in a printed newspaper (TIME3) during a typical day.

13-4 / INFERENCE ABOUT THE RATIO OF TWO VARIANCES

In Sections 13-1 and 13-3, we dealt with statistical inference concerning the difference between two population means. The problem objective in each case was to compare two populations of interval data, and our interest was in comparing measures of central location. This section discusses the statistical technique to use when the problem objective and the data type are the same as in Sections 13-1 and 13-3, but our interest is in comparing variability. Here we will study the ratio of two population variances. We make inferences about the ratio because the sampling distribution is based on ratios rather than differences.

We have already encountered this technique when we used the *F*-test of two variances to determine which *t*-test and estimator of the difference between two means to use. In this section, we apply the technique to other problems where our interest is in comparing the variability in two populations.

In the previous chapter, we presented the procedures used to draw inferences about a single population variance. We pointed out that variance can be used to address problems where we need to judge the consistency of a production process. We also use variance to measure the risk associated with a portfolio of investments. In this section, we compare two variances, enabling us to compare the consistency of two production processes. We can also compare the relative risks of two sets of investments.

We will proceed in a manner that is probably becoming quite familiar.

13-4a Parameter

As you will see shortly, we compare two population variances by determining the ratio. Consequently, the parameter is σ_1^2/σ_2^2 .

13-4b Statistic and Sampling Distribution

We have previously noted that the sample variance (defined in Chapter 4) is an unbiased and consistent estimator of the population variance. Not surprisingly, the estimator of the parameter σ_1^2/σ_2^2 is the ratio of the two sample variances drawn from their respective populations s_1^2/s_2^2 .

The sampling distribution of s_1^2/s_2^2 is said to be *F*-distributed provided that we have independently sampled from two normal populations. (The *F*-distribution was introduced in Section 8-4.)

Statisticians have shown that the ratio of two independent chi-squared variables divided by their degrees of freedom is *F*-distributed. The degrees of freedom of the *F*-distribution are identical to the degrees of freedom for the two chi-squared distributions. In Section 12-2, we pointed out that $(n - 1)s^2/\sigma^2$ is chi-squared distributed, provided that the sampled population is normal. If we have independent samples drawn from two normal populations, then both $(n_1 - 1)s_1^2/\sigma_1^2$ and $(n_2 - 1)s_2^2/\sigma_2^2$ are chi-squared distributed. If we divide each by their respective number of degrees of freedom and take the ratio, we produce

$$\frac{\frac{(n_1 - 1)s_1^2/\sigma_1^2}{(n_1 - 1)}}{\frac{(n_2 - 1)s_2^2/\sigma_2^2}{(n_2 - 1)}}$$

which simplifies to

$$\frac{s_1^2/\sigma_1^2}{s_2^2/\sigma_2^2}$$

This statistic is F -distributed with $\nu_1 = n_1 - 1$ and $\nu_2 = n_2 - 1$ degrees of freedom. Recall that ν_1 is called the **numerator degrees of freedom** and ν_2 is called the **denominator degrees of freedom**.

13-4c Testing and Estimating a Ratio of Two Variances

In this book, our null hypothesis will always specify that the two variances are equal. As a result, the ratio will equal 1. Thus, the null hypothesis will always be expressed as

$$H_0: \sigma_1^2/\sigma_2^2 = 1$$

The alternative hypothesis can state that the ratio σ_1^2/σ_2^2 is either not equal to 1, greater than 1, or less than 1. Technically, the test statistic is

$$F = \frac{s_1^2/\sigma_1^2}{s_2^2/\sigma_2^2}$$

However, under the null hypothesis, which states that $\sigma_1^2/\sigma_2^2 = 1$, the test statistic becomes as follows.

Test Statistic for σ_1^2/σ_2^2

The test statistic employed to test that σ_1^2/σ_2^2 is equal to 1 is

$$F = \frac{s_1^2}{s_2^2}$$

which is F -distributed with $\nu_1 = n_1 - 1$ and $\nu_2 = n_2 - 1$ degrees of freedom provided that the populations are normal.

With the usual algebraic manipulation, we can derive the confidence interval estimator of the ratio of two population variances.

Confidence Interval Estimator of σ_1^2/σ_2^2

$$\text{LCL} = \left(\frac{s_1^2}{s_2^2} \right) \frac{1}{F_{\alpha/2, \nu_1, \nu_2}}$$

$$\text{UCL} = \left(\frac{s_1^2}{s_2^2} \right) F_{\alpha/2, \nu_2, \nu_1}$$

where $\nu_1 = n_1 - 1$ and $\nu_2 = n_2 - 1$

EXAMPLE 13.7

DATA

Xm13-07

Testing the Quality of Two-Bottle Filling Machines

In Example 12.3, we applied the chi-squared test of a variance to determine whether there was sufficient evidence to conclude that the population variance was less than 1.0. Suppose that the statistics practitioner also collected data from another container-filling machine and recorded the fills of a randomly selected sample. Can we infer at the 5% significance level that the second machine is superior in its consistency?

SOLUTION:**IDENTIFY**

The problem objective is to compare two populations where the data are interval. Because we want information about the consistency of the two machines, the parameter we wish to test is σ_1^2/σ_2^2 , where σ_1^2 is the variance of machine 1 and σ_2^2 is the variance for machine 2. We need to conduct the *F*-test of σ_1^2/σ_2^2 to determine whether the variance of population 2 is less than that of population 1. Expressed differently, we wish to determine whether there is enough evidence to infer that σ_1^2 is larger than σ_2^2 . Hence, the hypotheses we test are

$$\begin{aligned} H_0: \quad & \sigma_1^2/\sigma_2^2 = 1 \\ H_1: \quad & \sigma_1^2/\sigma_2^2 > 1 \end{aligned}$$

COMPUTE**MANUALLY:**

The sample variances are $s_1^2 = .6333$ and $s_2^2 = .4528$.

The value of the test statistic is

$$F = \frac{s_1^2}{s_2^2} = \frac{.6333}{.4528} = 1.40$$

The rejection region is

$$F > F_{\alpha, \nu_1, \nu_2} = F_{.05, 24, 24} = 1.98$$

Because the value of the test statistic is not greater than 1.98, we cannot reject the null hypothesis.

EXCEL

	A	B	C
1	F-Test Two-Sample for Variances		
2			
3		Machine 1	Machine 2
4	Mean	999.7	999.8
5	Variance	0.6333	0.4528
6	Observations	25	25
7	df	24	24
8	F	1.3988	
9	P(F<=f) one-tail	0.2085	
10	F Critical one-tail	1.9838	

The value of the test statistic is $F = 1.3988$. Excel outputs the one-tail p -value, which is .2085.

(Continued)

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm13-07.)
2. Click **Data, Data Analysis**, and **F-test Two-Sample for Variances**.
3. Specify the **Variable 1 Range** (A1:A26) and the **Variable 2 Range** (B1:B26). Type a value for α (.05).

MINITAB**Test for Equal Variances: Machine 1, Machine 2**

F-Test (Normal Distribution)
Test statistic = 1.40, p-value = 0.417

Note that Minitab conducts a two-tail test only. Thus, the p -value = .417/2 = .2085.

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm13-07.)
2. Click **Stat, Basic Statistics, and 2 Variances . . .**.
3. In the **Samples in different columns** box, select the **First** (Machine 1) and **Second** (Machine 2) variables.

INTERPRET

There is not enough evidence to infer that the variance of machine 2 is less than the variance of machine 1.

The histograms (not shown) appear to be sufficiently bell shaped to satisfy the normality requirement.

EXAMPLE 13.8

DATA
Xm13-07

Estimating the Ratio of the Variances in Example 13.7

Determine the 95% confidence interval estimate of the ratio of the two population variances in Example 13.7.

SOLUTION:**COMPUTE****MANUALLY:**

We find

$$F_{\alpha/2, \nu_1, \nu_2} = F_{.025, 24, 24} = 2.27$$

Thus,

$$\text{LCL} = \left(\frac{s_1^2}{s_2^2} \right) F_{\alpha/2, \nu_1, \nu_2} = \left(\frac{.6333}{.4528} \right) 2.27 = .616$$

$$\text{UCL} = \left(\frac{s_1^2}{s_2^2} \right) F_{\alpha/2, \nu_2, \nu_1} = \left(\frac{.6333}{.4528} \right) 2.27 = 3.17$$

We estimate that σ_1^2 / σ_2^2 lies between .616 and 3.17.

EXCEL

	A	B	C
1	F-Estimate : Two Variances		
2			
3		Machine 1	Machine 2
4	Mean	999.7	999.8
5	Variance	0.6333	0.4528
6	Observations	25	25
7	df	24	24
8	LCL	0.6164	
9	UCL	3.1743	

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm13-07.)
2. Click **Add-ins**, **Data Analysis Plus**, and **F Estimate 2 Variances**.
3. Specify the **Variable 1 Range** (A1:A26) and the **Variable 2 Range** (B1:B26). Type a value for α (.05).

MINITAB

Minitab does not compute the estimate of the ratio of two variances.

INTERPRET

As we pointed out in Chapter 11, we can often use a confidence interval estimator to test hypotheses. In this example, the interval estimate excludes the value of 1. Consequently, we can draw the same conclusion as we did in Example 13.7.

Factors that Identify the *F*-Test and Estimator of σ_1^2 / σ_2^2

1. **Problem objective:** Compare two populations
2. **Data type:** Interval
3. **Descriptive measurement:** Variability

*If one or both columns contains an empty cell (representing missing data) it must be removed. See Keller's website appendix Removing Empty Cells in Excel.



EXERCISES

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DO IT YOURSELF EXCEL

Construct Excel spreadsheets for each of the following:

- 13.118** *F*-test of σ_1^2/σ_2^2 . Inputs: sample variances, sample sizes, and hypothesized ratio of population variances. Outputs: Test statistic, critical values, and one-and two-tail *p*-values. Tools: **FINV**, **FDIST**

- 13.119** *F*-estimate of σ_1^2/σ_2^2 . Inputs: sample variances, sample sizes, and confidence level. Outputs: Upper and lower confidence limits, Tools: **FINV**

Developing an Understanding of Statistical Concepts

Exercises 13.120 and 13.121 are "what-if analyses" designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually, using Excel's Do-It-Yourself Excel spreadsheets you just created, or Minitab.

- 13.120** Random samples from two normal populations produced the following statistics:

$$s_1^2 = 350 \quad n_1 = 30 \quad s_2^2 = 700 \quad n_2 = 30$$

- Can we infer at the 10% significance level that the two population variances differ?
- Repeat part (a) changing the sample sizes to $n_1 = 15$ and $n_2 = 15$.
- Describe what happens to the test statistic and the conclusion when the sample sizes decrease.

- 13.121** Random samples from two normal populations produced the following statistics:

$$s_1^2 = 28 \quad n_1 = 10 \quad s_2^2 = 19 \quad n_2 = 10$$

- Estimate with 95% confidence the ratio of the two population variances.
- Repeat part (a) changing the sample sizes to $n_1 = 25$ and $n_2 = 25$.
- Describe what happens to the width of the confidence interval estimate when the sample sizes increase.

Applications

Use a 5% significance level in all tests, unless specified otherwise.

- 13.122** *Xr13-122* The manager of a dairy is in the process of deciding which of two new carton-filling machines

to use. The most important attribute is the consistency of the fills. In a preliminary study she measured the fills in the 1-liter carton and listed them here. Can the manager infer that the two machines differ in their consistency of fills?

Machine 1	.998	.997	1.003	1.000	.999
	1.000	.998	1.003	1.004	1.000
Machine 2	1.003	1.004	.997	.996	.999
	1.000	1.005	1.002	1.004	.996

- 13.123** *Xr13-123* An operations manager who supervises an assembly line has been experiencing problems with the sequencing of jobs. The problem is that bottlenecks are occurring because of the inconsistency of sequential operations. He decides to conduct an experiment wherein two different methods are used to complete the same task. He measures the times (in seconds). The data are listed here. Can he infer that the second method is more consistent than the first method?

Method 1 8.8 9.6 8.4 9.0 8.3 9.2 9.0 8.7 8.5 9.4

Method 2 9.2 9.4 8.9 9.6 9.7 8.4 8.8 8.9 9.0 9.7

- 13.124** *Xr13-124* A statistics professor hypothesized that not only would the means vary, but also so would the variances if the business statistics course was taught in two different ways but had the same final exam. He organized an experiment wherein one section of the course was taught using detailed PowerPoint slides whereas the other required students to read the book and answer questions in class discussions. A sample of the marks was recorded and listed next. Can we infer that the variances of the marks differ between the two sections?

Class 1	64	85	80	64	48	62	75	77	50	81	90
Class 2	73	78	66	69	79	81	74	59	83	79	84

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level for all tests unless specified otherwise.

13.125 [Xr13-125](#) A new highway has just been completed and the government must decide on speed limits. There are several possible choices. However, on advice from police who monitor traffic the objective was to reduce the variation in speeds, which it is thought to contribute to the number of collisions. It has been acknowledged that speed contributes to the severity of collisions. It is decided to conduct an experiment to acquire more information. Signs are posted for 1 week indicating that the speed limit is 70 mph. A random sample of cars' speeds is measured. During the second week, signs are posted indicating that the maximum speed is 70 mph and that the minimum speed is 60 mph. Once again a random sample of speeds is measured. Can we infer that limiting the minimum and maximum speeds reduces the variation in speeds?

13.126 [Xr13-126](#) In Exercise 12.78 we described the problem of whether to change all the light bulbs at Yankee Stadium or change them one by one as they burn out. There are two brands of bulbs that can be used. Because both the mean and the variance of the lengths of life are important, it was decided to test the two brands. A random sample of both brands was drawn and left on until they burned out. The times were recorded. Can the Yankee Stadium management conclude that the variances differ?

13.127 [Xr13-127](#) In deciding where to invest her retirement fund, an investor recorded the weekly returns of two portfolios for 1 year. Can we conclude that portfolio 2 is riskier than portfolio 1?

13.128 [Xr13-128](#) An important statistical measurement in service facilities (such as restaurants and banks) is the variability in service times. As an experiment, two bank tellers were observed, and the service times for each of 100 customers were recorded. Do these data allow us to infer at the 10% significance level that the variance in service times differs between the two tellers?

13-5 / INFERENCE ABOUT THE DIFFERENCE BETWEEN TWO POPULATION PROPORTIONS

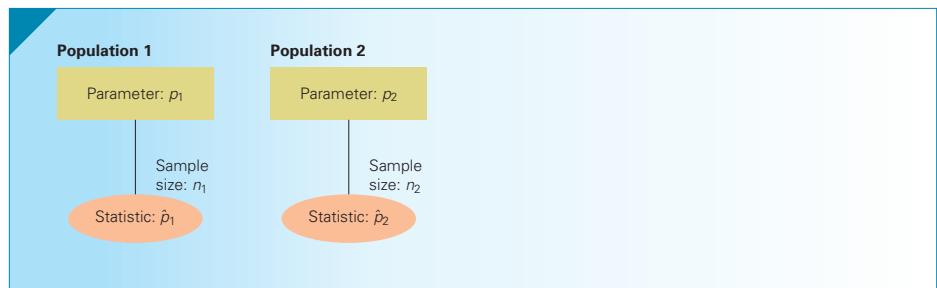
In this section, we present the procedures for drawing inferences about the difference between populations whose data are nominal. The number of applications of these techniques is almost limitless. For example, pharmaceutical companies test new drugs by comparing the new and old or the new versus a placebo. Marketing managers compare market shares before and after advertising campaigns. Operations managers compare defective rates between two machines. Political pollsters measure the difference in popularity before and after an election.

13-5a Parameter

When data are nominal, the only meaningful computation is to count the number of occurrences of each type of outcome and calculate proportions. Consequently, the parameter to be tested and estimated in this section is the difference between two population proportions $p_1 - p_2$.

13-5b Statistic and Sampling Distribution

To draw inferences about $p_1 - p_2$, we take a sample of size n_1 from population 1 and a sample of size n_2 from population 2 (Figure 13.7 depicts the sampling process).

FIGURE 13.7 Sampling from Two Populations of Nominal Data

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For each sample, we count the number of successes (recall that we call anything we're looking for a success), which we label x_1 and x_2 , respectively. The sample proportions are then computed:

$$\hat{p}_1 = \frac{x_1}{n_1} \text{ and } \hat{p}_2 = \frac{x_2}{n_2}$$

Statisticians have proven that the statistic $\hat{p}_1 - \hat{p}_2$ is an unbiased consistent estimator of the parameter $p_1 - p_2$. Using the same mathematics as we did in Chapter 9 to derive the sampling distribution of the sample proportion \hat{p} , we determine the sampling distribution of the difference between two sample proportions.

Sampling Distribution of $\hat{p}_1 - \hat{p}_2$

1. The statistic $\hat{p}_1 - \hat{p}_2$ is approximately normally distributed provided that the sample sizes are large enough so that $n_1 p_1, n_1(1 - p_1), n_2 p_2$, and $n_2(1 - p_2)$ are all greater than or equal to 5. [Because p_1 and p_2 are unknown, we express the sample size requirement as $n_1 \hat{p}_1, n_1(1 - \hat{p}_1), n_2 \hat{p}_2$, and $n_2(1 - \hat{p}_2)$ are greater than or equal to 5.]
2. The mean of $\hat{p}_1 - \hat{p}_2$ is

$$E(\hat{p}_1 - \hat{p}_2) = p_1 - p_2$$

3. The variance of $\hat{p}_1 - \hat{p}_2$ is

$$V(\hat{p}_1 - \hat{p}_2) = \frac{p_1(1 - p_1)}{n_1} + \frac{p_2(1 - p_2)}{n_2}$$

The standard error is

$$\sigma_{\hat{p}_1 - \hat{p}_2} = \sqrt{\frac{p_1(1 - p_1)}{n_1} + \frac{p_2(1 - p_2)}{n_2}}$$

Thus, the variable

$$z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\frac{p_1(1 - p_1)}{n_1} + \frac{p_2(1 - p_2)}{n_2}}}$$

is approximately standard normally distributed.

13-5c Testing and Estimating the Difference between Two Proportions

We would like to use the z -statistic just described as our test statistic; however, the standard error of $\hat{p}_1 - \hat{p}_2$, which is

$$\sigma_{\hat{p}_1 - \hat{p}_2} = \sqrt{\frac{p_1(1-p_1)}{n_1} + \frac{p_2(1-p_2)}{n_2}}$$

is unknown because both p_1 and p_2 are unknown. As a result, the standard error of $\hat{p}_1 - \hat{p}_2$ must be estimated from the sample data. There are two different estimators of this quantity, and the determination of which one to use depends on the null hypothesis. If the null hypothesis states that $p_1 - p_2 = 0$, the hypothesized equality of the two population proportions allows us to pool the data from the two samples to produce an estimate of the common value of the two proportions p_1 and p_2 . The **pooled proportion estimate** is defined as

$$\hat{p} = \frac{x_1 + x_2}{n_1 + n_2}$$

Thus, the estimated standard error of $\hat{p}_1 - \hat{p}_2$ is

$$\sqrt{\frac{\hat{p}(1-\hat{p})}{n_1} + \frac{\hat{p}(1-\hat{p})}{n_2}} = \sqrt{\hat{p}(1-\hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}$$

The principle used in estimating the standard error of $\hat{p}_1 - \hat{p}_2$ is analogous to that applied in Section 13-1 to produce the pooled variance estimate s_p^2 , which is used to test $\mu_1 - \mu_2$ with σ_1^2 and σ_2^2 unknown but equal. The principle roughly states that, where possible, pooling data from two samples produces a better estimate of the standard error. Here, pooling is made possible by hypothesizing (under the null hypothesis) that $p_1 = p_2$. (In Section 13-1, we used the pooled variance estimate because we assumed that $\sigma_1^2 = \sigma_2^2$.) We will call this application Case 1.

Test Statistic for $p_1 - p_2$: Case 1

If the null hypothesis specifies

$$H_0: (p_1 - p_2) = 0$$

the test statistic is

$$z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\hat{p}(1-\hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}}$$

Because we hypothesize that $p_1 - p_2 = 0$, we simplify the test statistic to

$$z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1-\hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}}$$

The second case applies when, under the null hypothesis, we state that $p_1 - p_2 = D$, where D is some value other than 0. Under such circumstances, we cannot pool the sample data to estimate the standard error of $\hat{p}_1 - \hat{p}_2$. The appropriate test statistic is described next as Case 2.

Test Statistic for $p_1 - p_2$: Case 2

If the null hypothesis specifies

$$H_0: (p_1 - p_2) = D \quad (D \neq 0)$$

the test statistic is

$$z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}}$$

which can also be expressed as

$$z = \frac{(\hat{p}_1 - \hat{p}_2) - D}{\sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}}$$

Notice that this test statistic is determined by simply substituting the sample statistics \hat{p}_1 and \hat{p}_2 in the standard error of $\hat{p}_1 - \hat{p}_2$.

You will find that, in most practical applications (including the exercises in this book), Case 1 applies—in most problems, we want to know whether the two population proportions differ: that is,

$$H_1: (p_1 - p_2) \neq 0$$

or if one proportion exceeds the other; that is,

$$H_1: (p_1 - p_2) > 0 \quad \text{or} \quad H_1: (p_1 - p_2) < 0$$

In some other problems, however, the objective is to determine whether one proportion exceeds the other by a specific nonzero quantity. In such situations, Case 2 applies.

We derive the interval estimator of $p_1 - p_2$ in the same manner we have been using since Chapter 10.

Confidence Interval Estimator of $p_1 - p_2$

$$(\hat{p}_1 - \hat{p}_2) \pm z_{\alpha/2} \sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}$$

This formula is valid when $n_1\hat{p}_1$, $n_1(1 - \hat{p}_1)$, $n_2\hat{p}_2$, and $n_2(1 - \hat{p}_2)$ are greater than or equal to 5.

Notice that the standard error is estimated using the individual sample proportions rather than the pooled proportion. In this procedure we cannot assume that the population proportions are equal as we did in the Case 1 test statistic.

APPLICATIONS in MARKETING

White Packert/The Image Bank/Getty Images



Test Marketing

Marketing managers frequently make use of test marketing to assess consumer reaction to a change in a characteristic (such as price or packaging) of an existing product, or to assess consumers' preferences regarding a proposed new product. *Test marketing* involves experimenting with changes to the marketing mix in a small, limited test market and assessing consumers' reaction in the test market before undertaking costly changes in production and distribution for the entire market.

EXAMPLE 13.9

DATA

Xm13-09

Test Marketing of Package Designs, Part 1

The General Products Company produces and sells a variety of household products. Because of stiff competition, one of its products, a bath soap, is not selling well. Hoping to improve sales, General Products decided to introduce more attractive packaging. The company's advertising agency developed two new designs. The first design features several bright colors to distinguish it from other brands. The second design is light green in color with just the company's logo on it. As a test to determine which design is better, the marketing manager selected two supermarkets. In one supermarket, the soap was packaged in a box using the first design; in the second supermarket, the second design was used. The product scanner at each supermarket tracked every buyer of soap over a 1-week period. The supermarkets recorded the last four digits of the scanner code for each of the five brands of soap the supermarket sold. The code for the General Products brand of soap is 9077 (the other codes are 4255, 3745, 7118, and 8855). After the trial period, the scanner data were transferred to a computer file. Because the first design is more expensive, management has decided to use this design only if there is sufficient evidence to allow it to conclude that design is better. Should management switch to the brightly colored design or the simple green one?

SOLUTION:

IDENTIFY

The problem objective is to compare two populations. The first is the population of soap sales in supermarket 1, and the second is the population of soap sales in supermarket 2. The data are nominal because the values are "buy General Products soap" and "buy other companies' soap." These two factors tell us that the parameter to be tested is the difference between two population proportions $p_1 - p_2$ (where p_1 and p_2 are the proportions of soap sales that are a General Products brand in supermarkets 1 and 2, respectively). Because we want to know whether there is enough evidence to adopt the brightly colored design, the alternative hypothesis is

$$H_1: (p_1 - p_2) > 0$$

The null hypothesis must be

$$H_0: (p_1 - p_2) = 0$$

which tells us that this is an application of Case 1. Thus, the test statistic is

$$z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1 - \hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}}$$

COMPUTE

M A N U A L L Y:

To compute the test statistic manually requires the statistics practitioner to tally the number of successes in each sample, where success is represented by the code 9077. Reviewing all the sales reveals that

$$x_1 = 180 \quad n_1 = 904 \quad x_2 = 155 \quad n_2 = 1,038$$

The sample proportions are

$$\hat{p}_1 = \frac{180}{904} = .1991$$

and

$$\hat{p}_2 = \frac{155}{1,038} = .1493$$

The pooled proportion is

$$\hat{p} = \frac{180 + 155}{904 + 1,038} = \frac{335}{1,942} = .1725$$

The value of the test statistic is

$$z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1 - \hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}} = \frac{(.1991 - .1493)}{\sqrt{(.1725)(1 - .1725)\left(\frac{1}{904} + \frac{1}{1,038}\right)}} = 2.90$$

A 5% significance level seems to be appropriate. Thus, the rejection region is

$$z > z_{\alpha} = z_{.05} = 1.645$$

E X C E L

	A	B	C	D
1	z-Test: Two Proportions			
2				
3			<i>Supermarket 1</i>	<i>Supermarket 2</i>
4	Sample Proportions		0.1991	0.1493
5	Observations		904	1038
6	Hypothesized Difference		0	
7	z Stat		2.90	
8	P(Z<=z) one tail		0.0019	
9	z Critical one-tail		1.6449	
10	P(Z<=z) two-tail		0.0038	
11	z Critical two-tail		1.96	

INSTRUCTIONS

- Type or import the data into two adjacent columns*. (Open Xm13-09.)
- Click Add-Ins, Data Analysis Plus, and Z-Test: 2 Proportions.
- Specify the Variable 1 Range (A1:A905) and the Variable 2 Range (B1:B1039). Type the Code for Success (9077), the Hypothesized Difference (0), and a value for α (.05).

*If one or both columns contain an empty cell (representing missing data) the row will have to be removed. See Keller's website appendix Removing Empty Cells in Excel.

MINITAB**Test and CI for Two Proportions: Supermarket 1, Supermarket 2**

Event = 9077

Variable	X	N	Sample p
Supermarket 1	180	904	0.199115
Supermarket 2	155	1038	0.149326

Difference = p (Supermarket 1) – p (Supermarket 2)
 Estimate for difference: 0.0497894
 95% lower bound for difference: 0.0213577
 Test for difference = 0 (vs > 0): Z = 2.90 P-Value = 0.002

INSTRUCTIONS

1. Type or import the data into two adjacent columns. (Open Xm13-09.) Recode the data if necessary. (Minitab requires that there be only two codes and the higher value is deemed to be a success. See Keller's website Appendix Excel and Minitab Instructions for Missing Data and Recoding data.)
2. Click **Stat**, **Basic Statistics**, and **2 Proportions**
3. In the **Samples in different columns** specify the **First** (Supermarket 1) and **Second** (Supermarket 2) samples. Click **Options**
4. Type the value of the **Test difference** (0), specify the **Alternative hypothesis** (greater than), and click **Use pooled estimate of p for test**.

Warning: If there are asterisks representing missing data, Minitab will be unable to conduct either the test or the estimate of the difference between two proportions. Click **Data** and **Sort**, which will eliminate the asterisks.

INTERPRET

The value of the test statistic is $z = 2.90$; its p -value is .0019. There is enough evidence to infer that the brightly colored design is more popular than the simple design. As a result, it is recommended that management switch to the first design.

EXAMPLE 13.10

DATA
Xm13-09

Test Marketing of Package Designs, Part 2

Suppose that in Example 13.9 the additional cost of the brightly colored design requires that it outsell the simple design by more than 3%. Should management switch to the brightly colored design?

SOLUTION:**IDENTIFY**

The alternative hypothesis is

$$H_1: (p_1 - p_2) > .03$$

and the null hypothesis follows as

$$H_0: (p_1 - p_2) = .03$$

Because the null hypothesis specifies a nonzero difference, we would apply the Case 2 test statistic.

COMPUTE

M A N U A L L Y:

The value of the test statistic is

$$z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}} = \frac{(.1991 - .1493) - (.03)}{\sqrt{\frac{.1991(1 - .1991)}{904} + \frac{.1493(1 - .1493)}{1,038}}} = 1.15$$

EXCEL

	A	B	C	D
1	z-Test: Two Proportions			
2				
3			<i>Supermarket 1</i>	<i>Supermarket 2</i>
4	Sample Proportions		0.1991	0.1493
5	Observations		904	1038
6	Hypothesized Difference		0.03	
7	z Stat		1.14	
8	P(Z<=z) one tail		0.1261	
9	z Critical one-tail		1.6449	
10	P(Z<=z) two-tail		0.2522	
11	z Critical two-tail		1.96	

INSTRUCTIONS

Use the same commands we used previously, except specify that the **Hypothesized Difference** is .03. Excel will apply the Case 2 test statistic when a nonzero value is typed.

MINITAB

Test and CI for Two Proportions: Supermarket 1, Supermarket 2

Event = 9077

Variable	X	N	Sample p
Supermarket 1	180	904	0.199115
Supermarket 2	155	1038	0.149326

Difference = p (Supermarket 1) – p (Supermarket 2)

Estimate for difference: 0.0497894

95% lower bound for difference: 0.0213577

Test for difference = 0.03 (vs > 0.03): Z = 1.14 P-Value = 0.126

INSTRUCTIONS

Use the same commands detailed previously except at step 4, specify that the **Test difference** is .03 and do not click **Use pooled estimate of p for test**.

INTERPRET

There is not enough evidence to infer that the proportion of soap customers who buy the product with the brightly colored design is more than 3 % higher than the proportion of soap customers who buy the product with the simple design. In the absence of sufficient evidence, the analysis suggests that the product should be packaged using the simple design.

EXAMPLE 13.11

DATA
Xm13-09

Test Marketing of Package Designs, Part 3

To help estimate the difference in profitability, the marketing manager in Examples 13.9 and 13.10 would like to estimate the difference between the two proportions. A confidence level of 95 % is suggested.

SOLUTION:**IDENTIFY**

The parameter is $p_1 - p_2$, which is estimated by the following confidence interval estimator:

$$(\hat{p}_1 - \hat{p}_2) \pm z_{\alpha/2} \sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}$$

COMPUTE**MANUALLY:**

The sample proportions have already been computed. They are

$$\hat{p}_1 = \frac{180}{904} = .1991$$

and

$$\hat{p}_2 = \frac{155}{1038} = .1493$$

The 95% confidence interval estimate of $p_1 - p_2$ is

$$\begin{aligned} & (\hat{p}_1 - \hat{p}_2) \pm z_{\alpha/2} \sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}} \\ &= (.1991 - .1493) \pm 1.96 \sqrt{\frac{.1991(1 - .1991)}{904} + \frac{.1493(1 - .1493)}{1,038}} \\ &= .0498 \pm .0339 \end{aligned}$$

$$\text{LCL} = .0159 \quad \text{and} \quad \text{UCL} = .0837$$

EXCEL

	A	B	C	D
1	z-Estimate: Two Proportions			
2				
3		<i>Supermarket 1</i>	<i>Supermarket 2</i>	
4	Sample Proportions		0.1991	0.1493
5	Observations		904	1038
6				
7	LCL		0.0159	
8	UCL		0.0837	

INSTRUCTIONS

1. Type or import the data into two adjacent columns*. (Open Xm13-09.)
2. Click **Add-Ins**, **Data Analysis Plus**, and **Z-Estimate: 2 Proportions**.
3. Specify the **Variable 1 Range** (**A1:A905**) and the **Variable 2 Range** (**B1:B1039**). Specify the **Code for Success** (**9077**) and a value for α (**.05**).

MINITAB**Test and CI for Two Proportions: Supermarket 1, Supermarket 2**

Event = 9077

Variable	X	N	Sample p
Supermarket 1	180	904	0.199115
Supermarket 2	155	1038	0.149326

Difference = p (Supermarket 1) – p (Supermarket 2)
 Estimate for difference: 0.0497894
 95% CI for difference: (0.0159109, 0.0836679)
 Test for difference = 0 (vs not = 0): Z = 2.88 P-Value = 0.004

INSTRUCTIONS

Follow the commands to test hypotheses about two proportions. Specify the alternative hypothesis as **not equal** and do not click **Use pooled estimate of p for test**.

INTERPRET

We estimate that the market share for the brightly colored design is between 1.59% and 8.37% larger than the market share for the simple design.

*If one or both columns contain an empty cell (representing missing data) the row must be removed. See Keller's website appendix Removing Empty Cells in Excel.

General Social Survey

Comparing Democrats and Republicans: Who is more Likely to Have Completed a University Degree?

The problem objective is to compare two populations, Democrats and Republicans. (Categories 0 and 1 of PARTYID are identified as Democrats and categories 5 and 6 are Republicans.) The variable DEGREE is nominal. We've recoded the data so that all categories 3 and 4 are represented by 5, which will be our definition of success. The parameter is $p_1 - p_2$ where p_1 = proportion of Democrats with at least a Bachelor's degree and p_2 = proportion of Republicans with at least a Bachelor's degree. The hypotheses are:

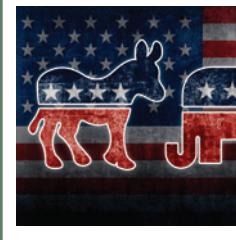
$$H_0: (p_1 - p_2) = 0$$

$$H_1: (p_1 - p_2) < 0$$

The null hypothesis tells us that this is an application of Case 1. Thus, the test statistic is:

$$z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1 - \hat{p})\left(\frac{1}{n_1} + \frac{1}{n_2}\right)}}$$

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EXCEL

	A	B	C	D
1	z-Test: Two Proportions			
2				
3		Democrats		Republicans
4	Sample Proportions	0.3062		0.3258
5	Observations	699		442
6	Hypothesized Difference	0		
7	z Stat	-0.697		
8	P(Z<=z) one tail	0.2431		
9	z Critical one-tail	1.6449		
10	P(Z<=z) two-tail	0.4862		
11	z Critical two-tail	1.96		

MINITAB

```
Test and CI for Two Proportions: Democrat, Republican
Event = 5

Variable      X     N   Sample p
Democrat     214   699  0.306152
Republican   144   442  0.325792

Difference = p (Democrat) - p (Republican)
Estimate for difference: -0.0196402
95% CI for difference: (-0.0751056, 0.0358252)
Test for difference = 0 (vs not = 0): Z = -0.70 P-Value = 0.486
Fisher's exact test: P-Value = 0.513
```

INTERPRET

Although there is some evidence, there is not enough evidence at the 5% significance level to infer that the proportion of Republicans with at least a Bachelor's degree is greater than the proportion of Democrats with at least a Bachelor's degree.

The factors that identify the inference about the difference between two proportions are listed below.

Factors That Identify the z -Test and Estimator of $p_1 - p_2$

1. **Problem objective:** Compare two populations
2. **Data type:** Nominal

**EXERCISES**

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**DO IT YOURSELF EXCEL**

Construct Excel spreadsheets for each of the following:

- 13.129** z -test of $p_1 - p_2$. Inputs: sample proportions, sample sizes, and hypothesized difference between two populations. Outputs: Test statistic, critical values, and one- and two-tail p -values. Tools, **NORMSINV**, **NORMSDIST**

- 13.130** z -estimate of $p_1 - p_2$. Inputs: sample proportions, sample sizes, and confidence level. Outputs: Test statistic, one- and two-tail p -values. Tools, **NORMSINV**

Developing an Understanding of Statistical Concepts

Exercises 13.131–13.133 are “what-if analyses” designed to determine what happens to the test statistics and interval estimates when elements of the statistical inference change. These problems can be solved manually, using Do-It-Yourself Excel spreadsheets you created, or using Minitab.

- 13.131** Random samples from two binomial populations yielded the following statistics:

$$\hat{p}_1 = .45 \quad n_1 = 100 \quad \hat{p}_2 = .40 \quad n_2 = 100$$

- a. Calculate the p -value of a test to determine whether we can infer that the population proportions differ.

- b. Repeat part (a) increasing the sample sizes to 400.
c. Describe what happens to the p -value when the sample sizes increase.

- 13.132** These statistics were calculated from two random samples:

$$\hat{p}_1 = .60 \quad n_1 = 225 \quad \hat{p}_2 = .55 \quad n_2 = 225$$

- a. Calculate the p -value of a test to determine whether there is evidence to infer that the population proportions differ.
b. Repeat part (a) with $\hat{p}_1 = .95$ and $\hat{p}_2 = .90$.
c. Describe the effect on the p -value of increasing the sample proportions.

- d. Repeat part (a) with $\hat{p}_1 = .10$ and $\hat{p}_2 = .05$.
- e. Describe the effect on the p -value of decreasing the sample proportions.

13.133 After sampling from two binomial populations we found the following.

$$\hat{p}_1 = .18 \quad n_1 = 100 \quad \hat{p}_2 = .22 \quad n_2 = 100$$

- a. Estimate with 90% confidence the difference in population proportions.
- b. Repeat part (a) increasing the sample proportions to .48 and .52, respectively.
- c. Describe the effects of increasing the sample proportions.

Applications

13.134 Many stores sell extended warranties for products they sell. These are very lucrative for store owners. To learn more about who buys these warranties a random sample of a store's customers who recently purchased a product for which an extended warranty was available was drawn. Among other variables each respondent reported whether they paid the regular price or a sale price and whether they purchased an extended warranty.

	Regular price	Sale price
Sample size	229	178
Number who bought extended warranty	47	25

Can we conclude at the 10% significance level that those who paid the regular price are more likely to buy an extended warranty?

13.135 A firm has classified its customers in two ways:

- (1) according to whether the account is overdue and
- (2) whether the account is new (less than 12 months) or old. To acquire information about which customers are paying on time and which are overdue, a random sample of 292 customer accounts was drawn. Each was categorized as a new account (less than 12 months) and old, and whether the customer has paid or is overdue. The results are summarized next.

	New Account	Old Account
Sample size	83	209
Overdue account	12	49

Is there enough evidence at the 5% significance level to infer that new and old accounts are different with respect to overdue accounts?

Overeating Experiment (See page 461 for description.)

13.136 *Xr13-136* Chop Stick Experiment

One hundred normal-weight people and 100 obese people were observed at several Chinese-food buffets. For each researchers recorded whether the diner used chopsticks or knife and fork. The table shown here was created.

	Normal Weight	Obese
Used chop sticks	26	7
Used knife and fork	74	93

Is there sufficient evidence at the 10% significance level to conclude that obese Chinese food eaters are less likely to use chop sticks?

(Source: Brian Wansink and Collin R. Payne, "The Cues and Correlates of Overeating at the Chinese Buffet," Cornell University Food and Brand Lab working paper.

13.137 Surveys have been widely used by politicians around the world as a way of monitoring the opinions of the electorate. Six months ago, a survey was undertaken to determine the degree of support for a national party leader. Of a sample of 1,100, 56% indicated that they would vote for this politician. This month, another survey of 800 voters revealed that 46% now support the leader.

- a. At the 5% significance level, can we infer that the national leader's popularity has decreased?
- b. At the 5% significance level, can we infer that the national leader's popularity has decreased by more than 5%?
- c. Estimate with 95% confidence the decrease in percentage support between now and 6 months ago.

13.138 The process that is used to produce a complex component used in medical instruments typically results in defective rates in the 40% range. Recently, two innovative processes have been developed to replace the existing process. Process 1 appears to be more promising, but it is considerably more expensive to purchase and operate than process 2. After a thorough analysis of the costs, management decides that it will adopt process 1 only if the proportion of defective components it produces is more than 8% smaller than that produced by process 2. In a test to guide the decision, both processes were used to produce 300 components. Of the 300 components produced by process 1, 33 were found to be defective, whereas 84 out of the 300 produced by process 2 were defective. Conduct a test using a significance level of 1% to help management make a decision.

APPLICATIONS in OPERATIONS MANAGEMENT

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Pharmaceutical and Medical Experiments

When new products are developed, they are tested in several ways. First, does the new product work? Second, is it better than the existing product? Third, will customers buy it at a price that is profitable? Performing a customer survey or some other experiment that yields the information needed often tests the last question. This experiment is usually the domain of the marketing manager.

The other two questions are dealt with by the developers of the new product, which usually means the research department or the operations manager. When the product is a new drug, there are particular ways in which the data are gathered. The sample is divided into two groups. One group is assigned the new drug and the other is assigned a placebo, a pill that contains no medication. The experiment is often called "double-blind" because neither the subjects who take the drug nor the physician/scientist who provides the drug knows whether any individual is taking the drug or the placebo. At the end of the experiment the data that are compiled allow statistics practitioners to do their work. Exercises 13.99–13.104 are examples of this type of statistical application. Exercise 13.80 describes a health-related problem where the use of a placebo is not possible.

13.139 Cold and allergy medicines have been available for a number of years. One serious side effect of these medications is that they cause drowsiness, which makes them dangerous for industrial workers. In recent years, a nondrowsy cold and allergy medicine has been developed. One such product, Hismanal, is claimed by its manufacturer to be the first once-a-day nondrowsy allergy medicine. The nondrowsy part of the claim is based on a clinical experiment in which 1,604 patients were given Hismanal and 1,109 patients were given a placebo. Of the first group 7.1% reported drowsiness; of the second group, 6.4% reported drowsiness. Do these results allow us to infer at the 5% significance level that Hismanal's claim is false?

13.140 Plavix is a drug that is given to angioplasty patients to help prevent blood clots. A researcher at McMaster University organized a study that involved 12,562 patients in 482 hospitals in 28 countries. All the patients had acute coronary syndrome, which produces mild heart attacks or unstable angina, chest pain that may precede a heart attack. The patients were divided into two equal groups. Group 1 received daily Plavix pills, while group 2 received a placebo. After 1 year 9.3% of patients on Plavix suffered a stroke or new heart attack, or had died of cardiovascular disease, compared with 11.5% of those who took the placebo.

- Can we infer that Plavix is effective?
- Describe your statistical analysis in a report to the marketing manager of the pharmaceutical company.

13.140 In a study that was highly publicized, doctors discovered that aspirin seems to help prevent heart attacks. The research project, which was scheduled to last for 5 years, involved 22,000 American physicians (all male). Half took an aspirin tablet three times per week, while the other half took a placebo on the same schedule.

The researchers tracked each of the volunteers and updated the records regularly. Among the physicians who took aspirin, 104 suffered a heart attack; 189 physicians who took the placebo had a heart attack.

- Determine whether these results indicate that aspirin is effective in reducing the incidence of heart attacks.
- Write a report that describes the results of this experiment.

13.142 Exercise 13.141 described the experiment that determined that taking aspirin daily reduces one's probability of suffering a heart attack. The study was conducted in 1982 and at that time the mean age of the physicians was 50. In the years following the experiment the physicians were monitored for other medical conditions. One of these was the incidence of cataracts. There were 1,084 cataracts in the aspirin group and 997 in the placebo group. Do these statistics allow researchers to conclude that aspirin leads to more cataracts?

13.143 According to the Canadian Cancer Society more than 21,000 women will be diagnosed with breast cancer every year and more than 5,000 will die. (U.S. figures are more than 10 times those in Canada.) Surgery is generally considered the first method of treatment. However, many women suffer recurrences of cancer. For this reason many women are treated with Tamoxifen. But after 5 years, tumors develop a resistance to Tamoxifen. A new drug called Letrozole was developed by Novartis Pharmaceuticals to replace Tamoxifen. To determine its effectiveness, a study involving 5,187 breast cancer survivors from Canada, the United States, and Europe was undertaken. Half the sample received Letrozole and the other half a placebo. The study was to run for 5 years. However, after only 2.5 years it was determined that 132 women receiving the placebo and 75 taking the drug had recurrences of their cancers. The study was published in the *New England Journal of Medicine*.

- Do these results provide sufficient evidence to infer that Letrozole works?
- Prepare a presentation to the board of directors of Novartis describing your analysis.

13.144 A study described in the *British Medical Journal* (January 2004) sought to determine whether exercise would help extend the lives of patients with heart failure. A sample of 801 patients with heart failure was recruited; 395 received exercise training and 406 did not. There were 88 deaths among the exercise group and 105 among those who did not exercise. Can researchers infer that exercise training reduces mortality?

The following exercises are based on the following experiment.

In attempt to understand the frustrations of driving in large cities an experiment was conducted. At a red light in a busy intersection the lead car hesitated for 2 seconds. The researchers recorded several variables and whether the driver in the following car honked his or her horn. The following tables were created from the recorded data. **Conduct all tests at the 5% significance level.**

13.145 Cell Phone Experiment 1

(Source: Statistics adapted from *Traffic*, Tom Vanderbilt.)

Driver in following car was female	Lead car driver using cell phone	Lead car driver not using cell phone
Honked horn	18	27
Did not honk horn	77	162

Is there enough evidence to infer that women drivers in a following car are more likely to honk when the lead car driver is using a cell phone?

13.146 Cell Phone Experiment 2

Driver in following car was male	Lead car driver used cell phone	Lead car driver did not use cell phone
Honked horn	35	34
Did not honk horn	103	170

Can we conclude that male drivers are more likely to honk when the lead car driver is using a cell phone?

13.147 Expensive Car Experiment

	Lead car was expensive (over \$50,000)	Lead car was not expensive
Honked horn	33	49
Did not honk horn	122	118

Do these figures allow us to conclude that drivers behind expensive cars are less likely to honk?

13.148 Gender Experiment 1

	Lead car driver was female	Lead car driver was male
Honked horn	64	47
Did not honk horn	123	136

Is there sufficient evidence to infer that drivers behind a male driver are more likely to honk?

13.149 Gender Experiment 2

	Following car driver was female	Following car driver was male
Honked horn	68	105
Did not honk horn	143	135

Can we conclude from these statistics that women are less likely to honk?

13.150 Convertible Experiment

	Following car was a convertible	Following car was not a convertible
Honked horn	21	86
Did not honk horn	92	210

Is there enough evidence to draw the inference that drivers of convertibles are less likely to honk?

The following exercises require the use of a computer and software. The answers to Exercises 13.151–13.162 may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level, unless specified otherwise.

13.151 *Xr13-151* Automobile magazines often compare models and rate them in various ways. One question that is often asked of car owners, Would you buy the same model again? Suppose that a researcher for one magazine asked a random sample of Lexus owners and a random sample of Acura owners whether they plan to buy another Lexus/Acura the next time they shop for a new car. The responses (1 = No, 2 = Yes)

were recorded. Do these data allow the researcher to infer that the two populations of car owners differ in their satisfaction levels?

13.152 *Xr13-152* An insurance company is thinking about offering discounts on its life insurance policies to nonsmokers. As part of its analysis, the company randomly selects 200 men who are 60 years old and asks them whether they smoke at least one pack of cigarettes per day and if they have ever suffered from heart disease. (2 = Suffer from heart disease, 1 = Do not suffer from heart disease).

- Can the company conclude at the 10% significance level that smokers have a higher incidence of heart disease than nonsmokers?
- Estimate with 90% confidence the difference in the proportions of men suffering from heart disease between smokers and nonsmokers.

13.153 *Xr13-153* Has the illicit use of drugs decreased over the past 10 years? Government agencies have undertaken surveys of Americans 12 years of age and older. Each was asked whether he or she used drugs at least once in the previous month. The results of this year's survey and the results of the survey completed 10 years ago were recorded as 1 = No and 2 = Yes. Can we infer that the use of illicit drugs in the United States has increased in the past decade? (*Source:* Adapted from the U.S. Substance Abuse and Mental Health Services Administration, National Household Survey on Drug Abuse.)

13.154 *Xr13-154* It has been estimated that the oil sands in Alberta Canada contains 2 trillion barrels of oil. However, recovering the oil damages the environment. A survey of Canadians and Americans was asked, What is more important to you with regard to the oilsands, environmental concerns (1), or the potential as a secure non-foreign supply of oil to North America(2)? Do these data allow you to conclude that Canadians and Americans differ in their responses to this question? (*Source:* Flieshman-Hillard Oilsands Survey.)

13.155 *Xr13-155* An operations manager of a computer chip maker is in the process of selecting a new machine to replace several older ones. Although technological innovations have improved the production process it is quite common for the machines to produce defective chips. The operations manager must choose between two machines. The cost of machine A is several thousand dollars greater than the cost of machine B. After an analysis of the costs it was determined that machine A is warranted provided that its defective rate is more than 2% less than that of machine B. To help decide both machines are used to produce 200 chips each. Each chip was examined and whether it was defective

(code = 2) or not (code = 1) was recorded. Should the operations manager select machine A?

- 13.156** *Xr13-156* Parents often urge their children to get more education, not only for the increased income but to perhaps work less hard. In a survey asked a random sample of Canadians whether they work 11 or more hours a day (1 = No, 2 = Yes) and whether they completed high school only or completed post-secondary education. Can we infer that those with more education are less likely to work 11 hours or more per day? (*Source:* Harris/Decima survey.)

- 13.157** *Xr13-157* Are Americans becoming more unhappy at work? A survey of Americans in 2008 and again this year asked whether he or she was satisfied with their jobs (1 = No, 2 = Yes). Can we infer that more Americans are unhappy compared to 2008?

- 13.158** *Xr13-158* In Chapters 3 and 4, we described the issue of global warming pointing out that the Earth has not warmed since 1998, explaining why the media now refer to the problem as climate change, and that there is a weak linear relationship between temperature anomalies and CO₂ levels. In the last few years news stories have appeared that seem to cast doubt on the entire theory. To measure the

effect on public opinion several surveys have been conducted by Pew Research Center. Approximately 1,000 American adults were asked the following question in March 2012 and March 2013.

How serious a problem is global warming? The responses are:

1. Very serious
2. Somewhat serious
3. Not too serious
4. Not a problem

Is there sufficient evidence to infer that the proportion of American adults who believe that global warming is a very serious problem decreased between 2012 and 2013?

- 13.159** *Xr13-159* One of the issues in the U.S. presidential election in 2012 was the Keystone XL pipeline, which would send Canadian oil to the refineries in Texas. Pew Research Center conducted a survey of American adults and asked each whether he or she was in favor (1) or opposed (2) to the pipeline. The survey identified each respondent as either male or female. Is there sufficient evidence to infer that men and women differ in their support of the pipeline?

APPLICATIONS in MARKETING



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Market Segmentation

In Section 12-4 we introduced market segmentation and described how the size of market segments can be estimated. Once the segments have been defined we can use statistical techniques to determine whether members of the segments differ in their purchases of a firm's products.

13.160 *Xr13-160** The market for breakfast cereals has been divided into several segments related to health. One company identified a segment as those adults who are health conscious. The marketing manager would like to know whether this segment is more likely to purchase its Special X cereal that is pitched toward the health conscious segment. A survey of adults was undertaken. On the basis of several probing questions each was classified as either a member of the health-conscious group (code = 1) or not (code = 2). Each respondent was also asked whether he or she buys Special X (1 = No, 2 = Yes). The data were recorded in stacked format. Can we infer from these data that health-conscious adults are more likely to buy Special X?

13.161 *XR13-161** Quik Lube is a company that offers oil change service while the customer waits. Its market has been broken down into the following segments:

1. Working men and women too busy to wait at a dealer or service center
2. Spouses who work in the home
3. Retired persons
4. Other

(Continued)

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A random sample of car owners was drawn. Each owner classified his or her market segment and also reported whether they usually use the services like Quik Lube (1 = Yes, 2 = No). These data are stored in stacked format.

- Determine whether members of segment 1 are more likely than members of segment 4 to respond that they usually use the service?
- Can we infer that retired persons and spouses who work in the home differ in their use of services such as Quik Lube?

13.162 XR13-162 Telemarketers obtain names and telephone numbers from several sources. To determine whether one particular source is better than a second, a random sample of names and numbers from the two different sources was obtained. For each potential customer, a statistics practitioner recorded whether that individual made a purchase (code = 2) or not (code = 1). Can we infer that differences exist between the two sources?



GENERAL SOCIAL SURVEY EXERCISES

Excel users should note that empty cells (representing missing data) must be removed. Conduct all tests at the 5% significance level.

Exercises 13.163–13.176 are based on the 2012 survey. The following four exercises compare male and female American adults (SEX: 1 = Male, 2 = Female).

13.163 GSS2012* A generation ago men were more likely to attend university and acquire a graduate degree than women. However, women now appear to be attending university in greater numbers than men. To gauge the extent of the difference test to determine whether men and women differ in completing a graduate degree (DEGREE: 4 = Graduate).

13.164 GSS2012* The deep recession of 2008–2010 may have changed patterns of employment. Because of the large number of layoffs an increasing number of individuals have chosen to work for themselves. The question arises; do men and women differ in their decision to work for themselves (WRKSLF: 1 = Self-employed, 2 = Someone else)? Conduct a test to answer the question.

13.165 GSS2012* Is there enough statistical evidence to infer that women more likely to work for the government (WRKGGOVT: 1 = Government, 2 = Private enterprise) than men?

13.166 GSS2012* Half a century ago men were far more likely to be the breadwinner and women were far more likely to be homemakers. Has this changed or are men still more likely than women to work full time outside the home (WRKSTAT: 1 = Working

full time, 2–8 = Other)? Perform a statistical test to answer the question.

Exercises 13.167–13.169 compare Democrats and Republicans (PARTYID: 0, 1 = Democrat; 5, 6 = Republican).

13.167 GSS2012* Is there sufficient evidence to conclude that Republican Party supporters are more likely to be working full time (WRKSTAT: 1 = Full time, 2–8 = Other) than Democratic Party supporters?

13.168 GSS2012* In theory, Democrats support larger government. Can we infer from the data that Democratic Party supporters are more likely to work for the government (WRKGGOVT: 1 = Government, 2 = Private enterprise)?

13.169 GSS2012* In theory, Republicans are more supportive of free enterprise. Do the data allow us to infer that Republican Party supporters are more likely to work for themselves (WRKSLF: 1 = Work for themselves, 2 = Other) than Democratic Party supporters?

The following four exercises compare married and single, never married American adults (MARITAL: 1 = Married, 5 = Never married).

13.170 GSS2012* Who is more likely to be working full time (WRKSTAT: 1 = Full time, 2–8 = Other)? Conduct a test to determine whether there are differences between married and never married American adults.

13.171 GSS2012* Is there enough statistical evidence to conclude that married people are more likely to

work for themselves (WRKSLF: 1 = Work for themselves, 2 = Work for someone else) than married people?

- 13.172 GSS2012*** Can we infer from the data that married and never married people differ in their completion of a graduate degree (DEGREE: 4 = Graduate degree, 1-3 = Other)?

- 13.173 GSS2012*** In theory working for the government means that job security is greater than working for private enterprise. Are married people more likely to work for the government (WRKGVT: 1 = Government, 2 = Other) than do never married people?

The next three exercises compare American residents who were born in the United States and those who were born elsewhere (BORN: 1 = In the United States, 2 = Elsewhere).

- 13.174 GSS2012*** Is there enough statistical evidence to conclude that people born in the United States are more likely to work for the government (WRKGVT: 1 = Government, 2 = Other) than people born outside the United States?

- 13.175 GSS2012*** Are foreign-born people more likely to work for themselves (WRKSLF: 1 = Work for themselves, 2 = Work for someone else) than Americans born in the United States? Conduct a test to answer the question.

- 13.176 GSS2012*** Is there sufficient evidence to conclude that foreign-born people are more likely to have a graduate degree (DEGREE: 4 = Graduate, 1-3 = Other) than people born in the United States?

For each of the following four exercises, determine whether men and women are likely to differ in answering each question correctly.

- 13.177 GSS2012*** A doctor tells a couple that there is one chance in four that their child will have an inherited disease. Does this mean that if the first child has the illness, the next three will not (ODDS1: 1 = Yes, 2 = No)? Correct answer: No.

- 13.178 GSS2012*** A doctor tells a couple that there is one chance in four that their child will have an inherited disease. Does this mean that each of the couple's children will have the same risk of suffering the illness (ODDS2: 1 = Yes, 2 = No)? Correct answer: Yes.

- 13.179 GSS2012*** True or false, the center of the earth is very hot (HOTCORE: 1 = True, 2 = False)? Correct answer: True.

- 13.180 GSS2012*** Does the Earth go around the Sun, or does the Sun go around the Earth (EARTHSUN: 1 = Earth around Sun, 2 = Sun around Earth)? Correct answer: Earth around Sun.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users should note that empty cells (representing missing data) must be removed.

For each of the following variables conduct a test at the 5% significance level to determine whether Democrats and Republicans (PARTY: 1 = Democrat, 2 = Republicans) differ.

- 13.181 ANES2008*** Likely to be employed (EMPLOY: 1 = Working now, 2- 8 = Other categories).

- 13.182 ANES2008*** Have health insurance (HEALTH 1 = Yes, 5 = No).

- 13.183 ANES2008*** Always vote (OFTEN: 1 = Always; 2, 3, 4 = Other categories).

CHAPTER SUMMARY

In this chapter, we presented a variety of techniques that allow statistics practitioners to compare two populations. When the data are interval and we are interested in measures of central location, we encountered two more factors that must be considered when choosing the appropriate technique. When the samples are independent, we can use either the **equal-variances** or **unequal-variances formulas**. When the samples are **matched pairs**, we have

only one set of formulas. We introduced the **F-statistic**, which is used to make inferences about two population variances. When the data are nominal, the parameter of interest is the difference between two proportions. For this parameter, we had two test statistics and one interval estimator. Finally, we discussed **observational** and **experimental data**, important concepts in attempting to interpret statistical findings.

IMPORTANT TERMS:

Pooled variance estimator 440
 Equal-variances test statistic 440
 Equal-variances confidence interval estimator 440
 Unequal-variances test statistic 441
 Unequal-variances confidence interval estimator 441
 Observational data 464

Experimental data 464
 Matched pairs experiment 471
 Mean of the population of differences 471
 Numerator degrees of freedom 482
 Denominator degrees of freedom 482
 Pooled proportion estimate 489

S Y M B O L S :

Symbol	Pronounced	Represents
s_p^2	s sub p squared	Pooled variance estimator
μ_D	mu sub D or mu D	Mean of the paired differences
\bar{x}_D	x bar sub D or x bar D	Sample mean of the paired differences
s_D	s sub D or $s D$	Sample standard deviation of the paired differences
n_D	n sub D or $n D$	Sample size of the paired differences
\hat{p}	p hat	Pooled proportion

F O R M U L A S :

Equal-variances t -test of $\mu_1 - \mu_2$

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}} \quad \nu = n_1 + n_2 - 2$$

Equal-variances interval estimator of $(\mu_1 - \mu_2)$

$$(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)} \quad \nu = n_1 + n_2 - 2$$

Unequal-variances t -test of $\mu_1 - \mu_2$

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right)}} \quad \nu = \frac{(s_1^2/n_1 + s_2^2/n_2)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}}$$

Unequal-variances interval estimator of $\mu_1 - \mu_2$

$$(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2}} \quad \nu = \frac{(s_1^2/n_1 + s_2^2/n_2)^2}{\frac{(s_1^2/n_1)^2}{n_1 - 1} + \frac{(s_2^2/n_2)^2}{n_2 - 1}}$$

t -test of μ_D

$$t = \frac{\bar{x}_D - \mu_D}{s_D / \sqrt{n_D}} \quad \nu = n_D - 1$$

t -estimator of μ_D

$$t = \frac{\bar{x}_D - \mu_D}{s_D / \sqrt{n_D}} \quad \nu = n_D - 1$$

F -test of σ_1^2/σ_2^2

$$F = \frac{s_1^2}{s_2^2} \quad \nu_1 = n_1 - 1 \text{ and } \nu_2 = n_2 - 1$$

F -estimator of σ_1^2/σ_2^2

$$\text{LCL} = \left(\frac{s_1^2}{s_2^2} \right) \frac{1}{F_{\alpha/2, \nu_1, \nu_2}}$$

$$\text{UCL} = \left(\frac{s_1^2}{s_2^2} \right) F_{\alpha/2, \nu_1, \nu_2}$$

z -test and estimator of $p_1 - p_2$

$$\text{Case 1: } z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1 - \hat{p}) \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}}$$

$$\text{Case 2: } z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}}$$

z -estimator of $p_1 - p_2$

$$(\hat{p}_1 - \hat{p}_2) \pm z_{\alpha/2} \sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Unequal-variances t -test of $\mu_1 - \mu_2$	450	451
Unequal-variances estimator of $\mu_1 - \mu_2$	452	452
Equal-variances t -test of $\mu_1 - \mu_2$	445	445
Equal-variances estimator of $\mu_1 - \mu_2$	446	447
t -test of μ_D	469	470
t -estimator of μ_D	471	471
F -test of σ_1^2/σ_2^2	480	481
F -estimator of σ_1^2/σ_2^2	482	482
z -test of $p_1 - p_2$ (Case 1)	489	490
z -test of $p_1 - p_2$ (Case 2)	491	491
z -estimator of $p_1 - p_2$	493	493

CHAPTER EXERCISES

The following exercises require the use of a computer and software. Use a 5% significance level unless specified otherwise.

13.184 *Xr13-184* Obesity among children is quickly becoming an epidemic across North America. Television and video games are part of the problem. To gauge to what extent nonparticipation in organized sports contributes to the crisis surveys of children 5 to 14 years old were conducted this year and 10 years ago. The gender of the child and whether he or she participated in organized sports (1 = No, 2 = Yes) were recorded.

- Can we conclude that there has been a decrease in participation among boys over the past 10 years?
- Repeat part (a) for girls.
- Can we infer that girls are less likely to participate than boys this year?

13.185 *Xr13-185* A restaurant located in an office building decides to adopt a new strategy for attracting customers to the restaurant. Every week it advertises in the city newspaper. To assess how well the advertising is working, the restaurant owner recorded the weekly gross sales for the 15 weeks after the campaign began and the weekly gross sales for the 24 weeks immediately prior to the campaign. Can the restaurateur conclude that the advertising campaign is successful?

13.186 *Xr13-186* Every year, the Bureau of Labor Statistics administers a survey of American households called the American Time Use Survey. Respondents are asked to report their activities during an entire 24-hour day. The results are used to determine the number of hours respondents work in a typical week. The results for government and private-sector

workers were recorded. Is there sufficient evidence to infer that government employees work less than private-sector workers?

13.187 *Xr13-187* How important to your health are regular vacations? In a study a random sample of men and women were asked how frequently they take vacations. The men and women were divided into two groups each. The members of group 1 had suffered a heart attack; the members of group 2 had not. The number of days of vacation last year was recorded for each person. Can we infer that men and women who suffer heart attacks vacation less than those who did not suffer a heart attack?

13.188 *Xr13-188* Research scientists at a pharmaceutical company have recently developed a new nonprescription sleeping pill. They decide to test its effectiveness by measuring the time it takes for people to fall asleep after taking the pill. Preliminary analysis indicates that the time to fall asleep varies considerably from one person to another. Consequently, they organize the experiment in the following way. A random sample of 100 volunteers who regularly suffer from insomnia is chosen. Each person is given one pill containing the newly developed drug and one placebo. (They do not know whether the pill they are taking is the placebo or the real thing, and the order of use is random.) Each participant is fitted with a device that measures the time until sleep occurs. Can we conclude that the new drug is effective?

13.189 *Xr13-189* The city of Toronto boasts four daily newspapers. Not surprisingly, competition is keen. To help learn more about newspaper readers, an advertiser selected a random sample of people who

bought their newspapers from a street vendor and people who had the newspaper delivered to their homes. Each was asked how many minutes they spent reading their newspapers. Can we infer that the amount of time reading differs between the two groups?

- 13.190** *Xr13-190* In recent years, a number of state governments have passed mandatory seat-belt laws. Although the use of seat belts is known to save lives and reduce serious injuries, compliance with seat-belt laws is not universal. In an effort to increase the use of seat belts, a government agency sponsored a 2-year study. Among its objectives was to determine whether there was enough evidence to infer that seat-belt usage increased between last year and this year. To test this belief, random samples of drivers last year and this year were asked whether they always use their seat belts (2 = Wear seat belt, 1 = Do not wear seat belt). Can we infer that seat belt usage has increased over the last year?

- 13.191** *Xr13-191* An important component of the cost of living is the amount of money spent on housing. Housing costs include rent (for tenants), mortgage payments and property tax (for home owners), heating, electricity, and water. An economist undertook a 5-year study to determine how housing costs have changed. Five years ago, he took a random sample of 200 households and recorded the percentage of total income spent on housing. This year, he took another sample of 200 households.

- Conduct a test (with $\alpha = .10$) to determine whether the economist can infer that housing cost as a percentage of total income has increased over the last 5 years.
- Use whatever statistical method you deem appropriate to check the required condition(s) of the test used in part (a).

- 13.192** *Xr13-192* In designing advertising campaigns to sell magazines, it is important to know how much time each of a number of demographic groups spends reading magazines. In a preliminary study, 40 people were randomly selected. Each was asked how much time per week he or she spends reading magazines; additionally, each was categorized by gender and by income level (high or low). The data are stored in the following way: column 1 = Time spent reading magazines per week in minutes for all respondents; column 2 = Gender (1 = Male, 2 = Female); column 3 = Income level (1 = Low, 2 = High).

- Is there sufficient evidence at the 10% significance level to conclude that men and women differ in the amount of time spent reading magazines?

- Is there sufficient evidence at the 10% significance level to conclude that high-income individuals devote more time to reading magazines than low-income people?

- 13.193** *Xr13-193* In a study to determine whether gender affects salary offers for graduating MBA students, 25 pairs of students were selected. Each pair consisted of a female and a male student who were matched according to their GPAs, courses taken, ages, and previous work experience. The highest salary offered (in thousands of dollars) to each graduate was recorded.

- Is there enough evidence at the 10% significance level to infer that gender is a factor in salary offers?
- Discuss why the experiment was organized in the way it was.
- Is the required condition for the test in part (a) satisfied?

- 13.194** *Xr13-194* Have North Americans grown to distrust television and newspaper journalists? A study was conducted this year to compare what Americans currently think of the press versus what they said 3 years ago. The survey asked respondents whether they agreed that the press tends to favor one side when reporting on political and social issues. A random sample of people was asked to participate in this year's survey. The results of a survey of another random sample taken 3 years ago are also available. The responses are 2 = Agree and 1 = Disagree. Can we conclude at the 10% significance level that Americans have become more distrustful of television and newspaper reporting this year than they were 3 years ago?

- 13.195** *Xr13-195* Before deciding which of two types of stamping machines should be purchased, the plant manager of an automotive parts manufacturer wants to determine the number of units that each produces. The two machines differ in cost, reliability, and productivity. The firm's accountant has calculated that machine A must produce 25 more non-defective units per hour than machine B to warrant buying machine A. To help decide, both machines were operated for 24 hours. The total number of units and the number of defective units produced by each machine per hour were recorded. These data are stored in the following way. Column 1 = Total number of units produced by machine A and column 2 = Number of defectives produced by machine A; column 3 = Total number of units produced by machine B; column 4 = Number of defectives produced by machine B. Determine which machine should be purchased.

13.196 Refer to Exercise 13.195. Can we conclude that the defective rate differs between the two machines?

13.197 *Xr13-197* The growing use of bicycles to commute to work has caused many cities to create exclusive bicycle lanes. These lanes are usually created by disallowing parking on streets that formerly allowed curbside parking. Merchants on such streets complain that the removal of parking will cause their businesses to suffer. To examine this problem, the mayor of a large city decided to launch an experiment on one busy street that had 1-hour parking meters. The meters were removed and a bicycle lane was created. The mayor asked the three businesses (a dry cleaner, a doughnut shop, and a convenience store) in one block to record daily sales for two complete weeks (Sunday to Saturday) prior to the change and two complete weeks after the change. The data are stored as follows: column 1 = Day of the week; column 2 = Sales before change for dry cleaner; column 3 = Sales after change for dry cleaner; column 4 = Sales before change for doughnut shop; column 5 = Sales after change for doughnut shop; column 6 = Sales before change for convenience store; and column 7 = Sales after change for convenience store. What conclusions can you draw from these data?

13.198 *Xr13-198* Researchers at the University of Ohio surveyed 219 students and found that 148 had Facebook accounts. All students were asked how for their current GPA. Do the data allow us to infer that Facebook users have lower GPAs?

13.199 *Xr13-199* Clinical depression is linked to several other diseases. Scientists at Johns Hopkins University undertook a study to determine whether heart disease is one of these. A group of 1190 male medical students was tracked over a 40-year period. Of these, 132 had suffered clinically diagnosed depression. For each student, the scientists recorded whether the student died of a heart attack (code = 2) or did not (code = 1).

- Can we infer at the 1% significance level that men who are clinically depressed are more likely to die from heart diseases?
- If the answer to part (a) is "yes" can you interpret this to mean that depression causes heart disease? Explain.

13.200 *Xr13-200* High blood pressure (hypertension) is a leading cause of strokes. Medical researchers are constantly seeking ways to treat patients suffering from this condition. A specialist in hypertension claims that regular aerobic exercise can reduce high blood pressure just as successfully as drugs, with none of the adverse side effects. To test the claim, 50 patients who suffer from high blood pressure

were chosen to participate in an experiment. For 60 days, half the sample exercised three times per week for 1 hour and did not take medication; the other half took the standard medication. The percentage reduction in blood pressure was recorded for each individual.

- Can we conclude at the 1% significance level that exercise is more effective than medication in reducing hypertension?
- Estimate with 95% confidence the difference in mean percentage reduction in blood pressure between drugs and exercise programs.
- Check to ensure that the required condition(s) of the techniques used in parts (a) and (b) is satisfied.

13.201 *Xr13-201* Most people exercise in order to lose weight. To determine better ways to lose weight, a random sample of male and female exercisers was divided into groups. The first group exercised vigorously twice a week. The second group exercised moderately four times per week. The weight loss for each individual was recorded. Can we infer that people who exercise moderately more frequently lose more weight than people who exercise vigorously?

13.202 *Xr13-202* After observing the results of the test in Exercise 13.201, a statistics practitioner organized another experiment. People were matched according to gender, height, and weight. One member of each matched pair then exercised vigorously twice a week and the other member exercised moderately four times per week. The weight losses were recorded. Can we infer that people who exercise moderately lose more weight?

13.203 *Xr13-203* Pass the Lotion, a long-running television commercial for Special K cereal, features a flabby sunbather who asks his wife to smear sun lotion on his back. A random sample of Special K customers and a random sample of people who do not buy Special K were asked to indicate whether they liked (code = 1) or disliked (code = 2) the ad. Can we infer that Special K buyers like the ad more than nonbuyers?

13.204 *Xr13-204* Refer to Exercise 13.203. The respondents were also asked whether they thought the ad would be effective in selling the product. The responses (1 = Yes, 2 = No) were recorded. Can we infer that Special K buyers are more likely to respond yes than nonbuyers?

13.205 *Xr13-205* Most English professors complain that students don't write very well. In particular they point out that students often confuse quality and quantity. A study at the University of Texas

examined this claim. In the study undergraduate students were asked to compare the cost benefits of Japanese and American cars. All wrote their analyses on computers. Unbeknownst to the students, the computers were rigged so that some students would have to type twice as many words to fill a single page. The number of words used by each student was recorded. Can we conclude that students write in such a way as to fill the allotted space?

- 13.206** *Xr13-206* Approximately 20 million Americans work for themselves. Most run single-person businesses out of their homes. One-quarter of these individuals use personal computers in their businesses. A market research firm, Computer Intelligence InfoCorp wanted to know whether single-person businesses that use personal computers are more successful than those with no computer. They surveyed 150 single-person firms and recorded their annual incomes. Can we infer at the 10% significance level that single-person businesses that use a personal computer earn more than those that do not?

- 13.207** *Xr13-207* Many small retailers advertise in their neighborhoods by sending out flyers. People deliver these to homes and are paid according to the number of flyers delivered. Each deliverer is given several streets whose homes become their responsibility. One of the ways retailers use to check the performance of deliverers is to randomly sample some of the homes and ask the home owner whether he or she received the flyer. Recently university students started a new delivery service. They have promised better service at a competitive price. A retailer wanted to know whether the new company's delivery rate is better than that of the existing firm. She had both companies deliver her flyers. Random samples of homes were drawn and each was asked whether he or she received the flyer ($2 = \text{Yes}$, $1 = \text{No}$). Can the retailer conclude that the new company is better? (Test with $\alpha = .10$.)

- 13.208** *Xr13-208* Medical experts advocate the use of vitamin and mineral supplements to help fight infections. A study undertaken by researchers at Memorial University (reported in the British journal *The Lancet*, November 1992) recruited 96 men and women age 65 and older. One-half of them received daily supplements of vitamins and minerals, whereas the other half received placebos. The supplements contained the daily recommended amounts of 18 vitamins and minerals, including vitamins B-6, B-12, C, and D, thiamine, riboflavin, niacin, calcium, copper, iodine, iron, selenium, magnesium, and zinc. The doses of vitamins A and E were slightly less than the daily requirements. The supplements included four times the amount of beta-carotene than the

average person ingests daily. The number of days of illness from infections (ranging from colds to pneumonia) was recorded for each person. Can we infer that taking vitamin and mineral supplements daily increases the body's immune system?

- 13.209** *Xr13-209* An inspector for the Atlantic City Gaming Commission suspects that a particular blackjack dealer may be cheating (in favor of the casino) when he deals at expensive tables. To test her belief, she observed 500 hands each at the \$100-limit table and the \$3,000-limit table. For each hand, she recorded whether the dealer won (code = 2) or lost (code = 1). When a tie occurs, there is no winner or loser. Can the inspector conclude at the 10% significance level that the dealer is cheating at the more expensive table?
- 13.210** *Xr13-210* In 2005 Larry Summers, then president of Harvard University received an avalanche of criticism for his attempt to explain why in mathematics there are more male professors than female professors. His suggested that there were innate differences that might permanently thwart the search for a more perfect gender balance. In an attempt to refute Dr Summers' hypothesis several researchers conducted large-scale mathematics tests of male and female students. Suppose the results were recorded. Conduct whatever tests you deem necessary to draw conclusions from these data. (Note that the data are simulated but represent actual results.)
- 13.211** *Xr13-211* Refer to Exercise 12.149. The researchers also took a random sample of 702 cars last year. Is there sufficient evidence to conclude that American cars this year are on average older than cars last year?
- 13.212** *Xr13-212* Are Americans more generous than Canadians? Random samples of American and Canadian tax returns were examined and whether it included a charitable donation were recorded ($2 = \text{Yes}$, $1 = \text{No}$). Conduct a statistical test to answer the question. (Source: Adapted from a Fraser Institute study.)

Overeating Experiments (See page 461.)

- 13.213** *Xr13-213* Music Experiment

A researcher convinced a restaurant to experiment with two different kinds of music. One was faster upbeat music and the second was soft relaxing music. A random sample of diners was drawn and the type of music, the amount of time spent in the restaurant, and the amount spent on drinks were recorded. Is there sufficient evidence to conclude that when the soft relaxing music was played diners spent more time in the restaurant and spent more money on drinks? (Source: Adapted from Ronald

E. Milliman, "The Influence of Background Music on the Behavior of Restaurant Patrons," *Journal of Consumer Research* 13:1 (1986): 286–89.)

13.214 *Xr13-214* Cinderella Makeover Experiment

A television program in conjunction with a researcher conducted a makeover of a Hardee's Restaurant. The main room had bright lights and loud music. In a separate room, the renovation brought in plants, paintings, indirect lighting, and white tablecloths and candles on the tables. The amount of time a random sample of patrons spent in the restaurant for each room was recorded. Is there enough evidence to infer that when the restaurant features bright lights and loud music customers spend less time in the restaurant?

13.215 *Xr13-215* Refer to Exercise 13.214. Customers were also asked how likely they would return to the restaurant (2 = Likely, 1 = Unlikely). Is there enough evidence to infer that when the restaurant features bright lights and loud music customers are less likely to return?

13.216 *Xr13-216* Glass Size Experiment

At a camp cafeteria teenagers were randomly given a tall skinny glass or a short wide glass. As they

proceeded through the line they loaded up on the food they wanted and poured whatever drink they chose. At the end of the line the amount of drink they had in their glasses were recorded. Can we infer that the amounts in the short wide glass contained were greater than the amounts in the tall skinny glasses? (*Source:* Adapted from Abby Ellin, "For Overweight Children, Are 'Fat Camps' a Solution?" *New York Times*, June 2005.)

Exercises 13.217 and 13.218 require access to the data files introduced in previous exercises.

13.217 *Xr12-31** Exercise 12.31 dealt with the amount of time high school students spend per week at part-time jobs. In addition to the hours of part-time work the school guidance counselor recorded the gender of the student surveyed (1 = Female, 2 = Male). Can we conclude that female and male high school students differ in the amount of time spent at part-time jobs?

13.218 *Xm12-01** The company that organized the survey to determine the amount of discarded newspaper (Example 12.1) kept track of the type of neighborhood (1 = City, 2 = Suburbs). Do these data allow the company management to infer that city households discard more newspaper than do suburban households?

APPLICATIONS in MARKETING

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Getty Images



Market Segmentation

In Section 12-4 we introduced market segmentation. The following exercises address the problem of determining whether two market segments differ in their pattern of purchases of a particular product or service.

13.219 *Xr13-219* Movie studios segment their markets by age. Two segments that are particularly important to this industry are teenagers and 20- to 30-year-olds. To assess markets and guide the making of movies, a random sample of teenagers and 20- to 30-year-olds was drawn. Each was asked to report the number of movies they saw in theaters last year. Do these data allow us to infer that teenagers see more movies than 20- to 30-year-olds?

The following exercises employ data files associated with examples and exercises seen previously in this book.

13.220 *Xr12-137** In addition to asking about educational attainment the survey conducted in Exercise 12.137 also asked whether the respondent had plans in the next 2 years to take a course (1 = No, 2 = Yes). Can we conclude that Californians who did not complete high school are less likely to take a course in the university's evening program?

(Continued)

13.221 Xm12-06* The objective in the survey conducted in Example 12.6 was to estimate the size of the market segment of adults who are concerned about eating healthy foods. As part of the survey each respondent was asked how much they spend on breakfast cereal in an average month. The marketing manager of a company that produces several breakfast cereals would like to know whether on average the market segment concerned about eating health foods outspends the other market segments. Write a brief report detailing your findings.

13.222 Xr12-35* In Exercise 12.35, we described how the office equipment chain OfficeMax offers rebates on some products. The goal in that exercise was to estimate the total amount spent by customers who bought the package of 100 CD-ROMS. In addition to tracking these amounts an executive also determined the amounts spent in the store by another sample of customers who purchased a fax machine/copier (regular price \$89.99 minus \$40 manufacturer's rebate and \$10 OfficeMax mail-in rebate). Can OfficeMax conclude that those who buy the fax/copier outspend those who buy the package of CD-ROMS? Write a brief memo to the executives of OfficeMax describing your findings and any possible recommendations.

13.223 Xr12-105* In addition to recording whether faculty members who are between 55 and 64 plan to retire before they reach 65 in Exercise 12.105, the consultant asked each to report his or her annual salary. Can the president infer that professors aged 55 to 64 who plan to retire early have higher salaries than those who don't plan to retire early?

13.224 Xr12-110* In Exercise 12.110, the statistics practitioner also recorded the gender of the respondents, where 1 = Female and 2 = Male. Can we infer that men and women differ in their choices of Christmas trees?



GENERAL SOCIAL SURVEY EXERCISES

Excel users should note that empty cells (representing missing data) must be removed. The following exercises compare 2010 and 2012. Use a 5% significance level for any tests.

13.225 GSS2010* GSS2012* Can we infer from the data that the Americans were more educated (EDUC) in 2012 than they were in 2010?

13.226 GSS2010* GSS2012* Estimate with 95% confidence the difference in income (INCOME) between 2012 and 2010.

13.227 GSS2010* GSS2012* Is there enough statistical evidence to conclude that the fraction of Americans working for the government (WRKGVT) increased between 2010 and 2012?

13.228 GSS2010* GSS2012* Estimate with 95% confidence the change in the percentage of American who were

working for themselves (WRKSLF) between 2010 and 2012.

13.229 GSS2010* GSS2012* Were American adults watching more television (TVHOURS) in 2012 than they were in 2010? Conduct a test to answer the question.

13.230 GSS2010* GSS2012* Is there enough statistical evidence to conclude that the percentage of American adults with graduate degrees (DEGREE = 4) changed between 2010 and 2012?

13.231 GSS2010* GSS2012* Were Americans working longer hours (HRS1) in 2010 than they did in 2012? Conduct an appropriate test.

APPENDIX 13 / REVIEW OF CHAPTERS 12 AND 13

As you may have already discovered, the ability to identify the correct statistical technique is critical; any calculation performed without it is useless. When you solved problems at the end of each section in the preceding chapters (you *have* been solving problems at the end of each section covered, haven't you?), you probably had no great difficulty identifying the correct technique to use. You used the statistical technique introduced in that section. Although those exercises provided practice in setting up hypotheses, producing computer output of tests of hypothesis and confidence interval estimators, and interpreting the results, you did not address a fundamental question faced by statistics practitioners: Which technique should I use? If you still do not appreciate the dimension of this problem, examine Table A13.1, which lists all the inferential methods covered thus far.

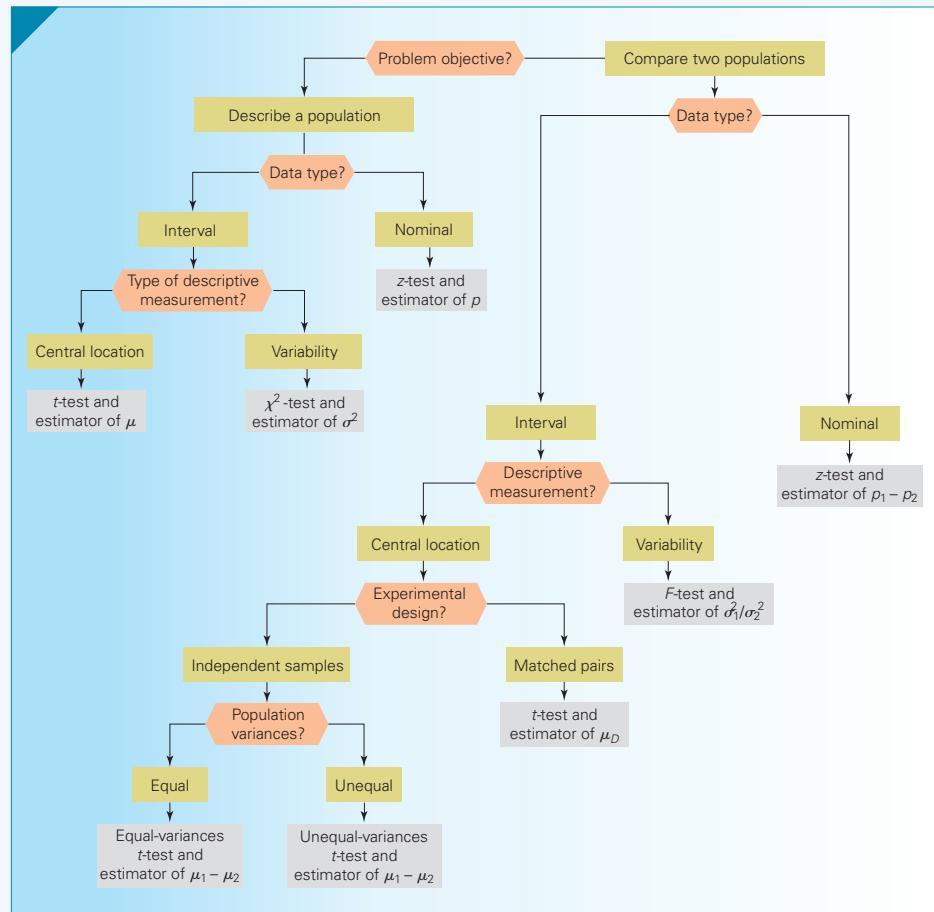
TABLE A13.1 Summary of Statistical Techniques in Chapters 12 and 13

<i>t</i> -test of μ
Estimator of μ (including estimator of $N\mu$)
<i>z</i> -test of p
Estimator of p (including estimator of Np)
χ^2 -test of σ^2
Estimator of σ^2
Equal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
<i>t</i> -test of μ_D
Estimator of μ_D
<i>F</i> -test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
<i>z</i> -test of $p_1 - p_2$ (Case 1)
<i>z</i> -test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$

Counting tests and confidence interval estimators of a parameter as two different techniques, a total of 17 statistical procedures have been presented thus far, and there is much left to be done. Faced with statistical problems that require the use of some of these techniques (such as in real-world applications or on a quiz or midterm test), most students need some assistance in identifying the appropriate method. In this appendix and the appendixes of five more chapters, you will have the opportunity to practice your decision skills; we've provided exercises and cases that require all the inferential techniques introduced in Chapters 12 and 13. Solving these problems will require you to do what statistics practitioners must do: analyze the problem, identify the technique or techniques, employ statistical software and a computer to yield the required statistics, and interpret the results.

The flowchart in Figure A13.1 represents the logical process that leads to the identification of the appropriate method. Of course, it only shows the techniques covered to this point. Chapters 14, 15, 16, 17, and 19 will include appendixes that review all the techniques introduced up to that chapter. The list and the flowchart will be expanded in each appendix, and all appendixes will contain review exercises. (Some will contain cases.)

FIGURE A13.1 Flowchart of Techniques in Chapters 12 and 13



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As we pointed out in Chapter 11, the two most important factors in determining the correct statistical technique are the problem objective and the data type. In some situations, once these have been recognized, the technique automatically follows. In other cases, however, several additional factors must be identified before you can proceed. For example, when the problem objective is to compare two populations and the data are interval, three other significant issues must be addressed: the descriptive measurement (central location or variability), whether the samples are independently drawn, and, if so, whether the unknown population variances are equal.



EXERCISES

The purpose of the exercises that follow is twofold. First, the exercises provide you with practice in the critical skill of identifying the correct technique. Second, they allow you to improve your ability to determine the statistics needed to answer the question and interpret the results. We believe that the first skill is underdeveloped because up to now you have had little practice. The exercises you've worked on have appeared at the end of sections and chapters where the correct techniques have just been presented. Determining the correct technique should not have been difficult. Because the exercises that follow were selected from the types that you have already encountered in Chapters 12 and 13, they will help you develop your technique-identification skills.

You will note that in the exercises that require a test of hypothesis, we do not specify a significance level. We have left this decision to you. After analyzing the issues raised in the exercise, use your own judgment to determine whether the p-value is small enough to reject the null hypothesis.

A13.1 **XrA13-01** Shopping malls are more than places where we buy things. We go to malls to watch movies; buy breakfast, lunch, and dinner; exercise; meet friends; and, in general, to socialize. To study the trends, a sociologist took a random sample of 100 mall shoppers and asked a variety of questions. This survey was first conducted 3 years ago with another sample of 100 shoppers. In both surveys, respondents were asked to report the number of hours they spend in malls during an average week. Can we conclude that the amount of time spent at malls has decreased over the past 3 years?

A13.2 **XrA13-02** It is often useful for retailers to determine why their potential customers choose to visit their store. Possible reasons include advertising, advice from a friend, or previous experience. To determine the effect of full-page advertisements in the local newspaper, the owner of an electronic-equipment store asked 200 randomly selected people who visited the store whether they had seen the ad. He also determined whether the customers had bought anything, and, if so, how much they spent. There were 113 respondents who saw the ad. Of these, 49 made a purchase. Of the 87 respondents who did not see the ad, 21 made a purchase. The amounts spent were recorded.

- Can the owner conclude that customers who see the ad are more likely to make a purchase than those who do not see the ad?
- Can the owner conclude that customers who see the ad spend more than those who do not see the ad (among those who make a purchase)?

- Estimate with 95% confidence the proportion of all customers who see the ad who then make a purchase.
- Estimate with 95% confidence the mean amount spent by customers who see the ad and make a purchase.

A13.3 **XrA13-03** In an attempt to reduce the number of person-hours lost as a result of industrial accidents, a large multiplant corporation installed new safety equipment in all departments and all plants. To test the effectiveness of the equipment, a random sample of 25 plants was drawn. The number of person-hours lost in the month before installation of the safety equipment and in the month after installation was recorded. Can we conclude that the equipment is effective?

A13.4 **XrA13-04** Is the antilock braking system (ABS) now available as a standard feature on many cars really effective? The ABS works by automatically pumping brakes extremely quickly on slippery surfaces so the brakes do not lock and thus avoiding an uncontrollable skid. If ABS is effective, we would expect that cars equipped with ABS would have fewer accidents, and the costs of repairs for the accidents that do occur would be smaller. To investigate the effectiveness of ABS, the Highway Loss Data Institute gathered data on a random sample of 500 General Motors cars that did not have ABS and 500 GM cars that were equipped with ABS. For each year, the institute recorded whether the car was involved in an accident and, if so, the cost of making repairs. Forty-two cars without ABS and 38 ABS-equipped cars were involved in accidents. The costs of repairs were recorded. Using frequency of accidents and cost of repairs as measures of effectiveness, can we conclude that ABS is effective? If so, estimate how much better are cars equipped with ABS compared to cars without ABS.

A13.5 **XrA13-05** The electric company is considering an incentive plan to encourage its customers to pay their bills promptly. The plan is to discount the bills 1% if the customer pays within 5 days as opposed to the usual 25 days. As an experiment, 50 customers are offered the discount on their September bill. The amount of time each takes to pay his or her bill is recorded. The amount of time a random sample of 50 customers not offered the discount take to pay their bills is also recorded. Do these data allow us to infer that the discount plan works?

A13.6 **XrA13-06** Traffic experts are always looking for ways to control automobile speeds. Some communities have experimented with “traffic-calming” techniques. These include speed bumps and various obstructions that force cars to slow down to drive around them. Critics point out that the techniques are counterproductive because they cause drivers to speed on other parts of these roads. In an analysis of the effectiveness of speed bumps, a statistics practitioner organized a study over a 1-mile stretch of city road that had 10 stop signs. He then took a random sample of 100 cars and recorded their average speed (the speed limit was 30 mph) and the number of proper stops at the stop signs. He repeated the observations for another sample of 100 cars after speed bumps were placed on the road. Do these data allow the statistics practitioner to conclude that the speed bumps are effective?

A13.7 **XrA13-07** The proliferation of self-serve pumps at gas stations has generally resulted in poorer automobile maintenance. One feature of poor maintenance is low tire pressure, which results in shorter tire life and higher gasoline consumption. To examine this problem, an automotive expert took a random sample of cars across the country and measured the tire pressure. The difference between the recommended tire pressure and the observed tire pressure was recorded. [A recording of 8 means that the pressure of the tire is 8 pounds per square inch (psi) less than the amount recommended by the tire manufacturer.] Suppose that for each psi below recommendation, tire life decreases by 100 miles and gasoline consumption increases by 0.1 gallon per mile. Estimate with 95% confidence the effect on tire life and gasoline consumption.

A13.8 **XrA13-08** Many North American cities encourage the use of bicycles as a way to reduce pollution and traffic congestion. So many people now regularly use bicycles to get to work and for exercise that some jurisdictions have enacted bicycle helmet laws that specify that all bicycle riders must wear helmets to protect against head injuries. Critics of these laws complain that it is a violation of individual freedom and that helmet laws tend to discourage bicycle usage. To examine this issue, a researcher randomly sampled 50 bicycle users and asked each to record the number of miles he or she rode weekly. Several weeks later, the helmet law was enacted. The number of miles each of the 50 bicycle riders rode weekly was recorded for the week after the law was passed. Can we infer from these data that the law discourages bicycle usage?

A13.9 **XrA13-09** Cardizem CD is a prescription drug that is used to treat high blood pressure and angina.

One common side effect of such drugs is the occurrence of headaches and dizziness. To determine whether its drug has the same side effects, the drug's manufacturer, Marion Merrell Dow, Inc., undertook a study. A random sample of 908 high-blood-pressure sufferers was recruited; 607 took Cardizem CD and 301 took a placebo. Each reported whether they suffered from headaches or dizziness (2 = yes, 1 = no). Can the pharmaceutical company scientist infer that Cardizem CD users are more likely to suffer headache and dizziness side effects than nonusers?

A13.10 **XrA13-10** A fast-food franchiser is considering building a restaurant at a downtown location. Based on a financial analysis, a site is acceptable only if the number of pedestrians passing the location during the work day averages more than 200 per hour. To help decide whether to build on the site, a statistics practitioner observes the number of pedestrians who pass the site each hour over a 40-hour work-week. Should the franchiser build on this site?

A13.11 **XrA13-11** Most people who quit smoking cigarettes do so for health reasons. However, some quitters find that they gain weight after quitting, and scientists estimate that the health risks of smoking two packs of cigarettes per day or carrying 65 extra pounds of weight are about equivalent. In an attempt to learn more about the effects of quitting smoking, the U.S. Centers for Disease Control conducted a study (reported in *Time*, March 25, 1991). A sample of 1,885 smokers was taken. During the course of the experiment, some of the smokers quit their habit. The amount of weight gained by all the subjects was recorded. Do these data allow us to conclude that quitting smoking results in weight gains?

A13.12 **XrA13-12** Golf-equipment manufacturers compete against one another by offering a bewildering array of new products and innovations. Oversized clubs, square grooves, and graphite shafts are examples of such innovations. The effect of these new products on the average golfer is, however, much in doubt. One product, a perimeter-weighted iron, was designed to increase the consistency of distance and accuracy. The most important aspect of irons is consistency, which means that ideally there should be no variation in distance from shot to shot. To examine the relative merits of two brands of perimeter-weighted irons, an average golfer used the 7-iron, hitting 100 shots using each of two brands. The distance in yards was recorded. Can the golfer conclude that brand B is superior to brand A?

A13.13 **XrA13-13** Managers are frequently called on to negotiate in a variety of settings. This calls for an

ability to think logically, which requires an ability to concentrate and ignore distractions. In a study of the effect of distractions, a random sample of 208 students was drawn by psychologists at McMaster University (reported in the *National Post*, December 11, 2003). The male students were shown pictures of women of varying attractiveness. The female students were shown pictures of men of varying attractiveness. All students were then offered a choice of an immediate reward of \$15 or a wait of 8 months for a reward of \$75. The choices of the male and of the female students (1 = immediate reward, 2 = larger reward 8 months later) were recorded. The results are stored in the following way:

Column 1: Choices of males shown most attractive women

Column 2: Choices of males shown less attractive women

Column 3: Choices of females shown most attractive men

Column 4: Choices of females shown less attractive men

- Can we infer that men's choices are affected by the attractiveness of women's pictures?
- Can we infer that women's choices are affected by the attractiveness of men's pictures?

A13.14 *XrA13-14* Throughout the day, many exercise shows appear on television. These usually feature attractive and fit men and women performing various exercises and urging viewers to duplicate the activity at home. Some viewers are exercisers. However, some people like to watch the shows without exercising (which explains why attractive people are used as demonstrators). Various companies sponsor the shows, and there are commercial breaks. One sponsor wanted to determine whether there are differences between exercisers and nonexercisers in terms of how well they remember the sponsor's name. A random sample of viewers was selected and called after the exercise show was over. Each was asked to report whether he or she exercised or only watched. They were also asked to name the sponsor's brand name (2 = yes, they could; 1 = no, they couldn't). Can the sponsor conclude that exercisers are more likely to remember the sponsor's brand name than those who only watch?

A13.15 *XrA13-15* According to the latest census, the number of households in a large metropolitan area is

425,000. The home-delivery department of the local newspaper reports that 104,320 households receive daily home delivery. To increase home-delivery sales, the marketing department launches an expensive advertising campaign. A financial analyst tells the publisher that for the campaign to be successful, home-delivery sales must increase to more than 110,000 households. Anxious to see whether the campaign is working, the publisher authorizes a telephone survey of 400 households within 1 week of the beginning of the campaign and asks each household head whether he or she has the newspaper delivered. The responses were recorded where 2 = yes and 1 = no.

- Do these data indicate that the campaign will increase home-delivery sales?
- Do these data allow the publisher to conclude that the campaign will be successful?

A13.16 *XrA13-16* The Scholastic Aptitude Test (SAT), which is organized by the Educational Testing Service (ETS), is important to high school students seeking admission to colleges and universities throughout the United States. A number of companies offer courses to prepare students for the SAT. The Stanley H. Kaplan Educational Center claims that its students gain, on average, more than 110 points by taking its course. ETS, however, insists that preparatory courses can improve a score by no more than 40 points. (The minimum and maximum scores of the SAT are 400 and 1,600, respectively.) Suppose a random sample of 40 students wrote the exam, then took the Kaplan preparatory course, and then took the exam again.

- Do these data provide sufficient evidence to refute the ETS claim?
- Do these data provide sufficient evidence to refute Kaplan's claim?

A13.17 *XrA13-17* A potato chip manufacturer has contracted for the delivery of 15,000,000 kilograms of potatoes. The supplier agrees to deliver the potatoes in 15,000 equal truckloads. The manufacturer suspects that the supplier will attempt to cheat him. He has the weight of the first 50 truckloads recorded.

- Can the manufacturer conclude from these data that the supplier is cheating him?
- Estimate with 95% confidence the total weight of potatoes for all 15,000 truckloads.



GENERAL SOCIAL SURVEY EXERCISES

A13.18 GSS2008* Is there sufficient evidence to conclude that people who work for the government (WRKGVT: 1 = Government, 2 = Private) work fewer hours (HRS)?

For each of the following variables, conduct a test to determine whether Democrats and Republicans (PARTY 1 = Democrat, 3 = Republican) differ in their correct answers to the following questions.

A13.19 GSS2008* Correct answers to ODDS1: A doctor tells a couple that there is one chance in four that their child will have an inherited disease. Does this mean that if the first child has the illness, the next three will not? 1 = Yes, 2 = No. Correct answer: No.

A13.20 GSS2008* Correct answers to ODDS2: A doctor tells a couple that there is one chance in four that their child will have an inherited disease. Does this mean that each of the couple's children will have the same risk of suffering the illness? 1 = Yes, 2 = No. Correct answer: Yes.

A13.21 GSS2008* Correct answers to HOTCORE: The center of the earth is very hot. 1 = True, 2 = False. Correct answer: True.

A13.22 GSS2008* Correct answers to EARTHSUN: Does Earth go around the Sun or does the Sun go around Earth? 1 = Earth around Sun, 2 = Sun around Earth. Correct answer: Earth around Sun.

A13.23 GSS2008* Estimate with 95% confidence Americans mean position on the following question: Should government reduce income differences between rich and poor (EQWLTH: 1 = government should reduce differences, 2, 3, 4, 5, 6, 7 = No government action?).

A13.24 Estimate with 95% confidence the mean number of years with current employer (CUREMPYR).

A13.25 Estimate with 90% confidence the proportion of Americans whose income is at least \$75,000 (INCOME06).

A13.26 GSS2006* GSS2008* Can we infer from the data that the proportion of Americans earning at least \$75,000 is greater in 2008 than in 2006 (INCOME06)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

A13.27 ANES2008* Conduct a test to determine whether Democrats and Republicans (PARTY: 1 = Democrat and 2 = Republican) differ in their intention to vote (DEFINITE: 1 = Definitely will not vote, 2, 3, 4, 5, 6, 7, 8, 9, 10 = Definitely will vote).

A13.28 ANES2008* Estimate with 99% confidence the mean amount of time in a typical day spent by American adults watching news on television, not including sports (TIME2).

A13.29 ANES2008* Conduct a test to determine whether Democrats and Republicans (PARTY: 1 = Democrat and 2 = Republican) differ in how much they thought about the upcoming election for president (THOUGHT: 1 = Quite a lot, 5 = Only a little).

A13.30 ANES2008* Estimate with 95% confidence the proportion of Americans earning at least \$100,000.

14



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ANALYSIS OF VARIANCE

- 14-1 *One-Way Analysis of Variance*
 - 14-2 *Multiple Comparisons*
 - 14-3 *Analysis of Variance Experimental Designs*
 - 14-4 *Randomized Block (Two-Way) Analysis of Variance*
 - 14-5 *Two-Factor Analysis of Variance*
 - 14-6 *(Optional) Applications in Operations Management: Finding and Reducing Variation*
- Appendix 14 *Review of Chapters 12 to 14*

General Social Survey: Liberal–Conservative Spectrum and Income

DATA
GSS2012*

Are Americans' political views affected by their incomes, or perhaps vice versa? If so, we would expect that incomes would differ between groups who define themselves somewhere on the following scale (POLVIEW).

- 1 = Extremely liberal
- 2 = Liberal
- 3 = Slightly liberal
- 4 = Moderate
- 5 = Slightly conservative
- 6 = Conservative
- 7 = Extremely conservative



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The question to be answered (on page 531) is, Are there differences in income between the seven groups of political views?

INTRODUCTION

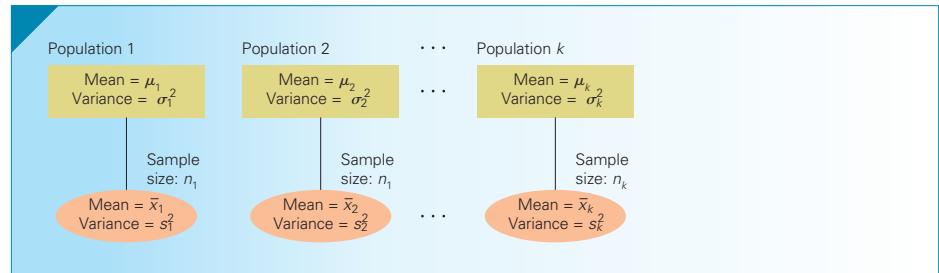
The technique presented in this chapter allows statistics practitioners to compare two or more populations of interval data. The technique is called the **analysis of variance**, and it is an extremely powerful and commonly used procedure. The analysis of variance technique determines whether differences exist between population means. Ironically, the procedure works by analyzing the sample variance, hence the name. We will examine several different forms of the technique.

One of the first applications of the analysis of variance was conducted in the 1920s to determine whether different treatments of fertilizer produced different crop yields. The terminology of that original experiment is still used. No matter what the experiment, the procedure is designed to determine whether there are significant differences between the **treatment means**.

14-1 / ONE-WAY ANALYSIS OF VARIANCE

The analysis of variance is a procedure that tests to determine whether differences exist between two or more population means. The name of the technique derives from the way in which the calculations are performed; that is, the technique analyzes the variance of the data to determine whether we can infer that the population means differ. As in Chapter 13, the experimental design is a determinant in identifying the proper method to use. In this section, we describe the procedure to apply when the samples are independently drawn. The technique is called the **one-way analysis of variance**. Figure 14.1 depicts the sampling process for drawing independent samples. The mean and variance of population j ($j = 1, 2, \dots, k$) are labeled μ_j and σ_j^2 , respectively. Both parameters are unknown. For each population, we draw independent random samples. For each sample, we can compute the mean \bar{x}_j and the variance s_j^2 .

FIGURE 14.1 Sampling Scheme for Independent Samples



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EXAMPLE 14.1*

DATA

Xm14-01

Proportion of Total Assets Invested in Stocks

In the last decade, stockbrokers have drastically changed the way they do business. Internet trading has become quite common, and online trades can cost as little as \$7. It is now easier and cheaper to invest in the stock market than ever before. What are the effects of these changes? To help answer this question, a financial analyst randomly sampled 366 American households and asked each to report the age category of the

*Adapted from U.S. Census Bureau, "Asset Ownership of Households, May 2003," *Statistical Abstract of the United States*, 2006, Table 700.

head of the household and the proportion of its financial assets that are invested in the stock market. The age categories are

- Young (less than 35)
- Early middle age (35 to 49)
- Late middle age (50 to 65)
- Senior (older than 65)

The analyst was particularly interested in determining whether the ownership of stocks varied by age. Some of the data are listed next. Do these data allow the analyst to determine that there are differences in stock ownership between the four age groups?

Young	Early Middle Age	Late Middle Age	Senior
24.8	28.9	81.5	66.8
35.5	7.3	0.0	77.4
68.7	61.8	61.3	32.9
42.2	53.6	0.0	74.0
:	:	:	:

SOLUTION:

You should confirm that the data are interval (percentage of total assets invested in the stock market) and that the problem objective is to compare four populations (age categories). The parameters are the four population means: μ_1, μ_2, μ_3 , and μ_4 . The null hypothesis will state that there are no differences between the population means. Hence,

$$H_0: \mu_1 = \mu_2 = \mu_3 = \mu_4$$

The analysis of variance determines whether there is enough statistical evidence to show that the null hypothesis is false. Consequently, the alternative hypothesis will always specify the following:

$$H_1: \text{At least two means differ}$$

The next step is to determine the test statistic, which is somewhat more involved than the test statistics we have introduced thus far. The process of performing the analysis of variance is facilitated by the notation in Table 14.1.

TABLE 14.1 Notation for the One-Way Analysis of Variance

TREATMENT					
1	2	<i>j</i>		<i>k</i>	
x_{11}	x_{12}	\dots	x_{1j}	\dots	x_{1k}
x_{21}	x_{22}	\dots	x_{2j}	\dots	x_{2k}
\vdots	\vdots		\vdots		\vdots
x_{n_11}	x_{n_22}		x_{n_jj}		x_{n_kk}
Sample size	n_1		n_j		n_k
Sample mean	\bar{x}_1		\bar{x}_j		\bar{x}_k

x_{ij} = *i*th observation of the *j*th sample

n_j = number of observations in the sample taken from the *j*th population

\bar{x}_j = mean of the *j*th sample =
$$\frac{\sum_{i=1}^{n_j} x_{ij}}{n_j}$$

\bar{x} = grand mean of all the observations =
$$\frac{\sum_{j=1}^k \sum_{i=1}^{n_j} x_{ij}}{n}$$
 where $n = n_1 + n_2 + \dots + n_k$, and *k* is the number of populations

The variable X is called the **response variable**, and its values are called **responses**. The unit that we measure is called an **experimental unit**. In this example, the response variable is the percentage of assets invested in stocks, and the experimental units are the heads of households sampled. The criterion by which we classify the populations is called a **factor**. Each population is called a **factor level**. The factor in Example 14.1 is the age category of the head of the household and there are four levels. Later in this chapter, we'll discuss an experiment where the populations are classified using two factors. In this section, we deal with single-factor experiments only.

Test Statistic

The test statistic is computed in accordance with the following rationale. If the null hypothesis is true, the population means would all be equal. We would then expect that the sample means would be close to one another. If the alternative hypothesis is true, however, there would be large differences between some of the sample means. The statistic that measures the proximity of the sample means to each other is called the **between-treatments variation**; it is denoted **SST**, which stands for **sum of squares for treatments**.

Sum of Squares for Treatments

$$SST = \sum_{j=1}^k n_j (\bar{x}_j - \bar{\bar{x}})^2$$

As you can deduce from this formula, if the sample means are close to each other, all of the sample means would be close to the grand mean; as a result, SST would be small. In fact, SST achieves its smallest value (zero) when all the sample means are equal. In other words, if

$$\bar{x}_1 = \bar{x}_2 = \cdots = \bar{x}_k$$

then

$$SST = 0$$

It follows that a small value of SST supports the null hypothesis. In this example, we compute the sample means and the grand mean as

$$\begin{aligned}\bar{x}_1 &= 44.40 \\ \bar{x}_2 &= 52.47 \\ \bar{x}_3 &= 51.14 \\ \bar{x}_4 &= 51.84 \\ \bar{\bar{x}} &= 50.18\end{aligned}$$

The sample sizes are

$$\begin{aligned}n_1 &= 84 \\ n_2 &= 131 \\ n_3 &= 93 \\ n_4 &= 58 \\ n &= n_1 + n_2 + n_3 + n_4 = 84 + 131 + 93 + 58 = 366\end{aligned}$$

Then

$$\begin{aligned} SST &= \sum_{j=1}^k n_j (\bar{x}_j - \bar{\bar{x}})^2 \\ &= 84(44.40 - 50.18)^2 + 131(52.47 - 50.18)^2 \\ &\quad + 93(51.14 - 50.18)^2 + 58(51.84 - 50.18)^2 \\ &= 3,738.8 \end{aligned}$$

If large differences exist between the sample means, at least some sample means differ considerably from the grand mean, producing a large value of SST. It is then reasonable to reject the null hypothesis in favor of the alternative hypothesis. The key question to be answered in this test (as in all other statistical tests) is, How large does the statistic have to be for us to justify rejecting the null hypothesis? In our example, $SST = 3,738.8$. Is this value large enough to indicate that the population means differ? To answer this question, we need to know how much variation exists in the percentage of assets, which is measured by the **within-treatments variation**, which is denoted by **SSE (sum of squares for error)**. The within-treatments variation provides a measure of the amount of variation in the response variable that is not caused by the treatments. In this example, we are trying to determine whether the percentages of total assets invested in stocks vary by the age of the head of the household. However, other variables also affect the responses variable. We would expect that variables such as household income, occupation, and the size of the family would play a role in determining how much money families invest in stocks. All of these (as well as others we may not even be able to identify) are sources of variation, which we would group together and call the error. This source of variation is measured by the sum of squares for error.

Sum of Squares for Error

$$SSE = \sum_{j=1}^k \sum_{i=1}^{n_j} (x_{ij} - \bar{x}_j)^2$$

When SSE is partially expanded, we get

$$SSE = \sum_{i=1}^{n_1} (x_{i1} - \bar{x}_1)^2 + \sum_{i=1}^{n_2} (x_{i2} - \bar{x}_2)^2 + \cdots + \sum_{i=1}^{n_k} (x_{ik} - \bar{x}_k)^2$$

If you examine each of the k components of SSE, you'll see that each is a measure of the variability of that sample. If we divide each component by $n_j - 1$, we obtain the sample variances. We can express this by rewriting SSE as

$$SSE = (n_1 - 1)s_1^2 + (n_2 - 1)s_2^2 + \cdots + (n_k - 1)s_k^2$$

where s_j^2 is the sample variance of sample j . SSE is thus the combined or pooled variation of the k samples. This is an extension of a calculation we made in Section 13-1, where we tested and estimated the difference between two means using the pooled estimate of the common population variance (denoted s_p^2). One of the required conditions for that statistical technique is that the population variances are equal. That same condition is now necessary for us to use SSE; that is, we require that

$$s_1^2 = s_2^2 = \cdots = s_k^2$$

Returning to our example, we calculate the sample variances as follows:

$$\begin{aligned}s_1^2 &= 386.55 \\ s_2^2 &= 469.44 \\ s_3^2 &= 471.82 \\ s_4^2 &= 444.79\end{aligned}$$

Thus,

$$\begin{aligned}\text{SSE} &= (n_1 - 1)s_1^2 + (n_2 - 1)s_2^2 + (n_3 - 1)s_3^2 + (n_4 - 1)s_4^2 \\ &= (84 - 1)(386.55) + (131 - 1)(469.44) \\ &\quad + (93 - 1)(471.82) + (58 - 1)(444.79) \\ &= 161,871.3\end{aligned}$$

The next step is to compute quantities called the **mean squares**. The **mean square for treatments** is computed by dividing SST by the number of treatments minus 1.

Mean Square for Treatments

$$\text{MST} = \frac{\text{SST}}{k - 1}$$

The **mean square for error** is determined by dividing SSE by the total sample size (labeled n) minus the number of treatments.

Mean Square for Error

$$\text{MSE} = \frac{\text{SSE}}{n - k}$$

Finally, the test statistic is defined as the ratio of the two mean squares.

Test Statistic

$$F = \frac{\text{MST}}{\text{MSE}}$$

Sampling Distribution of the Test Statistic

The test statistic is F -distributed with $k - 1$ and $n - k$ degrees of freedom, provided that the response variable is normally distributed. In Section 8-4, we introduced the F -distribution, and in Section 13-4 we used it to test and estimate the ratio of two population variances. The test statistic in that application was the ratio of two sample variances s_1^2 and s_2^2 . If you examine the definitions of SST and SSE, you will see that both measure variation similar to the numerator in the formula used to calculate the sample variance s^2 used throughout this book. When we divide SST by $k - 1$ and SSE by $n - k$

to calculate MST and MSE , respectively, we're actually computing unbiased estimators of the common population variance, assuming (as we do) that the null hypothesis is true. Thus, the ratio $F = MST/MSE$ is the ratio of two sample variances. The degrees of freedom for this application are the denominators in the mean squares; that is, $\nu_1 = k - 1$ and $\nu_2 = n - k$. For Example 14.1, the degrees of freedom are

$$\begin{aligned}\nu_1 &= k - 1 = 4 - 1 = 3 \\ \nu_2 &= n - k = 366 - 4 = 362\end{aligned}$$

In our example, we found

$$\begin{aligned}MST &= \frac{SST}{k - 1} = \frac{3,738.8}{3} = 1,246.27 \\ MSE &= \frac{SSE}{n - k} = \frac{161,871.3}{362} = 447.16 \\ F &= \frac{MST}{MSE} = \frac{1,246.27}{447.16} = 2.79\end{aligned}$$

Rejection Region and p -Value

The purpose of calculating the **F -statistic** is to determine whether the value of SST is large enough to reject the null hypothesis. As you can see, if SST is large, F will be large. Hence, we reject the null hypothesis only if

$$F > F_{\alpha, k-1, n-k}$$

If we let $\alpha = .05$, the rejection region for Example 14.1 is

$$F > F_{\alpha, k-1, n-k} = F_{.05, 3, 362} \approx F_{.05, 3, \infty} = 2.61$$

We found the value of the test statistic to be $F = 2.79$. Thus, there is enough evidence to infer that the mean percentage of total assets invested in the stock market differs between the four age groups.

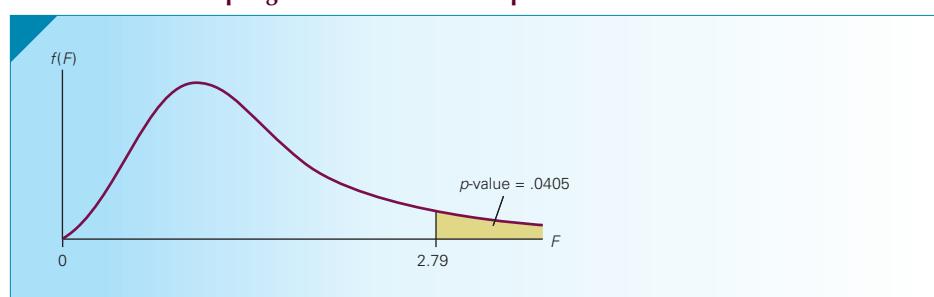
The p -value of this test is

$$P(F > 2.79)$$

A computer is required to calculate this value, which is $.0405$.

Figure 14.2 depicts the sampling distribution for Example 14.1.

FIGURE 14.2 Sampling Distribution for Example 14.1



The results of the analysis of variance are usually reported in an **analysis of variance (ANOVA) table**. Table 14.2 shows the general organization of the ANOVA table, and Table 14.3 shows the ANOVA table for Example 14.1.

TABLE 14.2 ANOVA Table for the One-Way Analysis of Variance

SOURCE OF VARIATION	DEGREES OF FREEDOM	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Treatments	$k - 1$	SST	$MST = SST/(k - 1)$	$F = MST/MSE$
Error	$n - k$	SSE	$MSE = SSE/(n - k)$	
Total	$n - 1$	SS(Total)		

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TABLE 14.3 ANOVA Table for Example 14.1

SOURCE OF VARIATION	DEGREES OF FREEDOM	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Treatments	3	3,738.8	1,246.27	2.79
Error	362	161,871.3	447.16	
Total	365	165,610.1		

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The terminology used in the ANOVA table (and for that matter, in the test itself) is based on the partitioning of the sum of squares. Such partitioning is derived from the following equation (whose validity can be demonstrated by using the rules of summation):

$$\sum_{j=1}^k \sum_{i=1}^{n_j} (x_{ij} - \bar{x})^2 = \sum_{j=1}^k n_j (\bar{x}_j - \bar{x})^2 + \sum_{j=1}^k \sum_{i=1}^{n_j} (x_{ij} - \bar{x}_j)^2$$

The term on the left represents the **total variation** of all the data. This expression is denoted **SS(Total)**. If we divide SS(Total) by the total sample size minus 1 (that is, by $n - 1$), we would obtain the sample variance (assuming that the null hypothesis is true). The first term on the right of the equal sign is SST, and the second term is SSE. As you can see, the total variation SS(Total) is partitioned into two sources of variation. The sum of squares for treatments (SST) is the variation attributed to the differences between the treatment means, whereas the sum of squares for error (SSE) measures the variation within the samples. The preceding equation can be restated as

$$SS(\text{Total}) = SST + SSE$$

The test is then based on the comparison of the mean squares of SST and SSE.

Recall that in discussing the advantages and disadvantages of the matched pairs experiment in Section 13-3, we pointed out that statistics practitioners frequently seek ways to reduce or explain the variation in a random variable. In the analysis of variance introduced in this section, the sum of squares for treatments explains the variation attributed to the treatments (age categories). The sum of squares for error measures the amount of variation that is unexplained by the different treatments. If SST explains a significant portion of the total variation, we conclude that the population means differ. In Sections 14-4 and 14-5, we will introduce other experimental designs of the analysis of variance—designs that attempt to reduce or explain even more of the variation.

If you've felt some appreciation of the computer and statistical software sparing you the need to manually perform the statistical techniques in earlier chapters, your appreciation should now grow, because the computer will allow you to avoid the

incredibly time-consuming and boring task of performing the analysis of variance by hand. As usual, we've solved Example 14.1 using Excel and Minitab, whose outputs are shown here.

COMPUTE

EXCEL

	A	B	C	D	E	F	G
1	Anova: Single Factor						
2							
3	SUMMARY						
4	Groups	Count	Sum	Average	Variance		
5	Young	84	3729.5	44.40	386.55		
6	Early Middle Age	131	6873.9	52.47	469.44		
7	Late Middle Age	93	4755.9	51.14	471.82		
8	Senior	58	3006.6	51.84	444.79		
9							
10							
11	ANOVA						
12	Source of Variation	SS	df	MS	F	P-value	F crit
13	Between Groups	3741.4	3	1247.12	2.79	0.0405	2.6296
14	Within Groups	161871.0	362	447.16			
15							
16	Total	165612.3	365				

INSTRUCTIONS

1. Type or import the data into adjacent columns. ([Open Xm14-01](#).)
2. Click **Data**, **Data Analysis**, and **Anova: Single Factor**.
3. Specify the **Input Range** ([A1:D132](#)) and a value for α (.05).

MINITAB

One-way ANOVA: Young, Early Middle Age, Late Middle Age, Senior					
Source	DF	SS	MS	F	P
Factor	3	3741	1247	2.79	0.041
Error	362	161871	447		
Total	365	165612			

S = 21.15 R-Sq = 2.26% R-Sq(adj) = 1.45%

Level	N	Mean	StDev
Young	84	44.40	19.66
Early Middle Age	131	52.47	21.67
Late Middle Age	93	51.14	21.72
Senior	58	51.84	21.09

Individual 95% CIs For Mean Based on Pooled StDev

Level	40.0	45.0	50.0	55.0	
Young	(-----*	-----)			
Early Middle Age		(-----*	-----)		
Late Middle Age			(-----*	-----)	
Senior				(-----*	-----)

Pooled StDev = 21.15

(Continued)

INSTRUCTIONS

If the data are unstacked:

1. Type or import the data. ([Open Xm14-01](#).)
2. Click **Stat**, **ANOVA**, and **Oneway (Unstacked)**
3. In the **Responses (in separate columns)** box, type or select the variable names of the treatments ([Young](#), [Early Middle Age](#), [Late Middle Age](#), [Senior](#)).

If the data are stacked:

1. Type or import the data in two columns.
2. Click **Stat**, **ANOVA**, and **Oneway**
3. Type the variable name of the response variable and the name of the factor variable.

INTERPRET

The value of the test statistic is $F = 2.79$, and its p -value is .0405, which means there is evidence to infer that the percentage of total assets invested in stocks are different in at least two of the age categories.

Note that in this example the data are observational. We cannot conduct a controlled experiment. To do so would require the financial analyst to randomly assign households to each of the four age groups, which is impossible.

Incidentally, when the data are obtained through a controlled experiment in the one-way analysis of variance, we call the experimental design the **completely randomized design** of the analysis of variance.

14-1a Checking the Required Conditions

The F -test of the analysis of variance requires that the random variable be normally distributed with equal variances. The normality requirement is easily checked graphically by producing the histograms for each sample. From the Excel histograms in Figure 14.3, we can see that there is no reason to believe that the requirement is not satisfied.

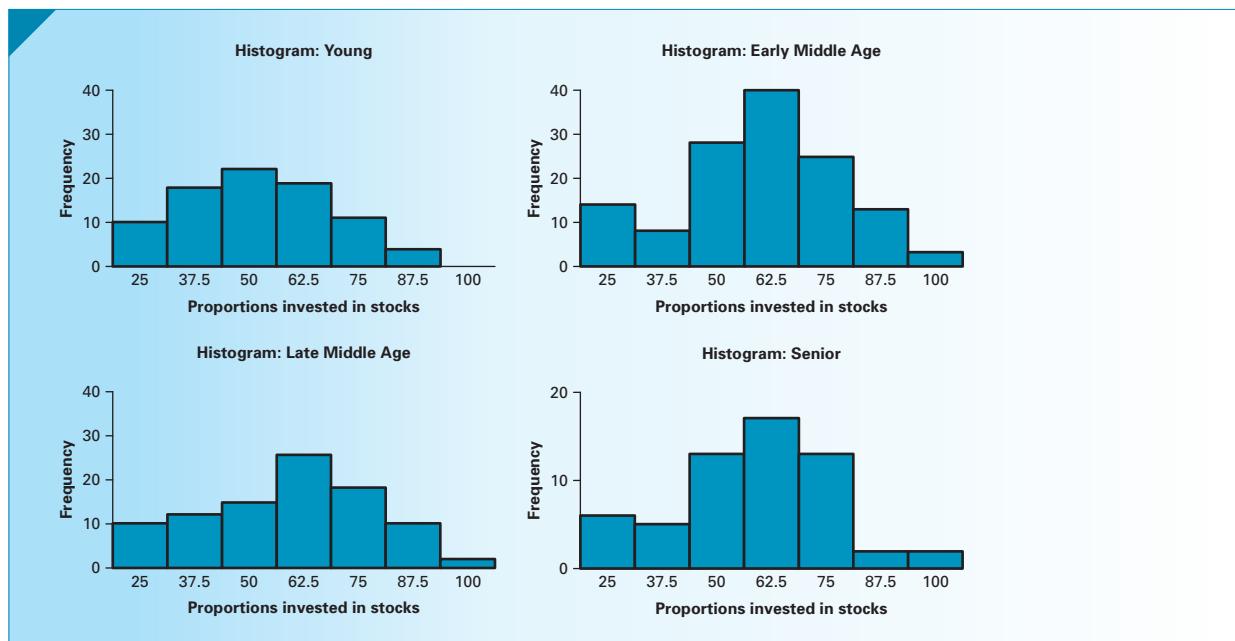
The equality of variances is examined by printing the sample standard deviations or variances. Excel output includes the variances, and Minitab calculates the standard deviations. The similarity of sample variances allows us to assume that the population variances are equal. In Keller's website Appendix Bartlett's Test, we present a statistical procedure designed to test for the equality of variances.

14-1b Violation of the Required Conditions

If the data are not normally distributed, we can replace the one-way analysis of variance with its nonparametric counterpart, which is the Kruskal–Wallis Test. (See Section 19-3.*). If the population variances are unequal, we can use several methods to correct the problem. However, these corrective measures are beyond the level of this book.

*Instructors who wish to teach the use of nonparametric techniques for testing the difference between two or more means when the normality requirement is not satisfied should use Keller's website Appendix Kruskal–Wallis Test and Friedman Test.

FIGURE 14.3 Histograms for Example 14.1



14-1c Can We Use the *t*-Test of the Difference between Two Means Instead of the Analysis of Variance?

The analysis of variance tests to determine whether there is evidence of differences between two or more population means. The *t*-test of $\mu_1 - \mu_2$ determines whether there is evidence of a difference between two population means. The question arises, Can we use *t*-tests instead of the analysis of variance? In other words, instead of testing all the means in one test as in the analysis of variance, why not test each pair of means? In Example 14.1, we would test $(\mu_1 - \mu_2)$, $(\mu_1 - \mu_3)$, $(\mu_1 - \mu_4)$, $(\mu_2 - \mu_3)$, $(\mu_2 - \mu_4)$, and $(\mu_3 - \mu_4)$. If we find no evidence of a difference in each test, we would conclude that none of the means differ. If there was evidence of a difference in at least one test, we would conclude that some of the means differ.

There are two reasons why we don't use multiple *t*-tests instead of one *F*-test. First, we would have to perform many more calculations. Even with a computer, this extra work is tedious. Second, and more important, conducting multiple tests increases the probability of making Type I errors. To understand why, consider a problem where we want to compare six populations, all of which are identical. If we conduct an analysis of variance where we set the significance level at 5%, there is a 5% chance that we would reject the true null hypothesis; that is, there is a 5% chance that we would conclude that differences exist when, in fact, they don't.

To replace the *F*-test, we would perform 15 *t*-tests. [This number is derived from the number of combinations of pairs of means to test, which is $C_2^6 = (6 \times 5)/2 = 15$.] Each test would have a 5% probability of erroneously rejecting the null hypothesis. The probability of committing one or more Type I errors is about 54%.*

*The probability of committing at least one Type I error is computed from a binomial distribution with $n = 15$ and $p = .05$. Thus, $P(X \geq 1) = 1 - P(X = 0) = 1 - .463 = .537$.

One remedy for this problem is to decrease the significance level. In this illustration, we would perform the *t*-tests with $\alpha = .05/15$, which is equal to .0033. (We will use this procedure in Section 14-2 when we discuss multiple comparisons.) Unfortunately, this would increase the probability of a Type II error. Regardless of the significance level, performing multiple *t*-tests increases the likelihood of making mistakes. Consequently, when we want to compare more than two populations of interval data, we use the analysis of variance.

Now that we've argued that the *t*-tests cannot replace the analysis of variance, we need to argue that the analysis of variance cannot replace the *t*-test.

14-1d Can We Use the Analysis of Variance Instead of the *t*-Test of $\mu_1 - \mu_2$?

The analysis of variance is the first of several techniques that allow us to compare two or more populations. Most of the examples and exercises deal with more than two populations. However, it should be noted that, like all other techniques whose objective is to compare two or more populations, the analysis of variance can be used to compare only two populations. If that's the case, then why do we need techniques to compare exactly two populations? Specifically, why do we need the *t*-test of $\mu_1 - \mu_2$ when the analysis of variance can be used to test two population means?

To understand why, we still need the *t*-test to make inferences about $\mu_1 - \mu_2$. Suppose that we plan to use the analysis of variance to test two population means. The null and alternative hypotheses are

$$\begin{aligned} H_0: \quad & \mu_1 = \mu_2 \\ H_1: \quad & \text{At least two means differ} \end{aligned}$$

Of course, the alternative hypothesis specifies that $\mu_1 \neq \mu_2$. However, if we want to determine whether μ_1 is greater than μ_2 (or vice versa), we cannot use the analysis of variance because this technique allows us to test for a difference only. Thus, if we want to test to determine whether one population mean exceeds the other, we must use the *t*-test of $\mu_1 - \mu_2$ (with $\sigma_1^2 = \sigma_2^2$). Moreover, the analysis of variance requires that the population variances are equal. If they are not, we must use the unequal variances test statistic.

14-1e Relationship between the *F*-Statistic and the *t*-Statistic

It is probably useful for you to understand the relationship between the *t*-statistic and the *F*-statistic. The test statistic for testing hypotheses about $\mu_1 - \mu_2$ with equal variances is

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}}$$

If we square this quantity, the result is the *F*-statistic: $F = t^2$. To illustrate this point, we'll redo the calculation of the test statistic in Example 13.1 using the analysis of variance. Recall that because we were able to assume that the population variances were equal, the test statistic was as follows:

$$t = \frac{(6.63 - 3.72) - 0}{\sqrt{40.42 \left(\frac{1}{50} + \frac{1}{50} \right)}} = 2.29$$

Using the analysis of variance (the Excel output is shown here; Minitab's is similar), we find that the value of the test statistic is $F = 5.23$, which is $(2.29)^2$. Notice though that the analysis of variance p -value is .0243, which is twice the t -test p -value, which is .0122. The reason: The analysis of variance is conducting a test to determine whether the population means *differ*. If Example 13.1 had asked to determine whether the means differ, we would have conducted a two-tail test and the p -value would be .0243, the same as the analysis of variance p -value.

Excel Analysis of Variance Output for Example 13.1

	A	B	C	D	E	F	G
1	Anova: Single Factor						
2							
3	SUMMARY						
4	Groups	Count	Sum	Average	Variance		
5	Direct	50	331.6	6.63	37.49		
6	Broker	50	186.2	3.72	43.34		
7							
8							
9	ANOVA						
10	Source of Variation	SS	df	MS	F	P-value	F crit
11	Between Groups	211.4	1	211.41	5.23	0.0243	3.9381
12	Within Groups	3960.5	98	40.41			
13							
14	Total	4172.0	99				

14-1f Developing an Understanding of Statistical Concepts

Conceptually and mathematically, the F -test of the independent samples' single-factor analysis of variance is an extension of the t -test of $\mu_1 - \mu_2$. Moreover, if we simply want to determine whether a difference between two means exists, we can use the analysis of variance. The advantage of using the analysis of variance is that we can partition the total sum of squares, which enables us to measure how much variation is attributable to differences between populations and how much variation is attributable to differences within populations. As we pointed out in Section 13-3, explaining the variation is an extremely important topic, one that we will see again in other experimental designs of the analysis of variance and in regression analysis (Chapters 16, 17, and 18).

General Social Survey: Liberal–Conservative Spectrum and Income: Solution

IDENTIFY

The variable is income of American adults, which is interval. The problem objective is to compare seven populations (the political views) and the experimental design is independent samples. Thus, we apply the one-way analysis of variance.



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COMPUTE**EXCEL**

A	B	C	D	E	F	G
1	Anova: Single Factor					
2						
3	SUMMARY					
4	Groups	Count	Sum	Average	Variance	
5	E Liberal	49	2,032,250	41,474	985,586,575	
6	Liberal	146	5,676,000	38,877	1,160,079,523	
7	S Liberal	138	5,662,250	41,031	1,311,446,581	
8	Moderate	402	14,619,500	36,367	1,236,859,115	
9	S Conservative	163	8,276,500	50,776	1,865,369,301	
10	Conservative	167	7,284,750	43,621	1,628,709,982	
11	E Conservative	35	1,535,500	43,871	1,944,898,424	
12						
13						
14	ANOVA					
15	Source of Variation	SS	df	MS	F	P-value
16	Between Groups	26,312,549,725	6	4,385,424,954	3.13	0.0048
17	Within Groups	1,529,850,603,173	1093	1,399,680,332		2.11
18						
19	Total	1,556,163,152,898	1099			

MINITAB**One-way ANOVA: E Liberal, Libearl, S Liberal, Moderate, S Conservati...**

Source	DF	SS	MS	F	P
Factor	6	26312549725	4385424954	3.13	0.005
Error	1093	1.52985E+12	1399680332		
Total	1099	1.55646E+12			

S = 37412 R-Sq = 1.69% R-Sq(adj) = 1.15%

Individual 95% CIs For Mean Based on Pooled StDev

Level	N	Mean	StDev	(-----*-----)
E Liberal	49	41474	31394	(-----*-----)
Liberal	146	38877	34060	(-----*-----)
S Liberal	138	41031	36214	(-----*-----)
Moderate	402	36367	35169	(-----*-----)
S Conservative	163	50776	43190	(-----*-----)
Conservative	167	43621	40357	(-----*-----)
E Conservative	35	43871	44101	(-----*-----)

35000 42000 49000 56000

Pooled StDev = 37412

INTERPRET

The *p*-value is .0048. There is sufficient evidence to infer that the incomes differ between the seven political views. It appears that conservatives have higher incomes than liberals.

Factors That Identify the One-Way Analysis of Variance

1. **Problem objective:** Compare two or more populations
2. **Data type:** Interval
3. **Experimental design:** Independent samples



EXERCISES

Developing an Understanding of Statistical Concepts

Exercises 14.1–14.3 are “what-if” analyses designed to determine what happens to the test statistic when the means, variances, and sample sizes change. These problems can be solved manually or by creating an Excel worksheet.

- 14.1** A statistics practitioner calculated the following statistics:

Statistic	Treatment		
	1	2	3
n	5	5	5
\bar{x}	10	15	20
s^2	50	50	50

- a. Complete the ANOVA table.
- b. Repeat part (a) changing the sample sizes to 10 each.
- c. Describe what happens to the F -statistic when the sample sizes increase.

- 14.2** You are given the following statistics:

Statistic	Treatment		
	1	2	3
n	4	4	4
\bar{x}	20	22	25
s^2	10	10	10

- a. Complete the ANOVA table.
- b. Repeat part (a) changing the variances to 25 each.
- c. Describe the effect on the F -statistic of increasing the sample variances.

- 14.3** The following statistics were calculated:

Statistic	Treatment			
	1	2	3	4
n	10	14	11	18
\bar{x}	30	35	33	40
s^2	10	10	10	10

- a. Complete the ANOVA table.
- b. Repeat part (a) changing the sample means to 130, 135, 133, and 140.

- c. Describe the effect on the F -statistic of increasing the sample means by 100.

Applications

- 14.4 Xr14-04** How does an MBA major affect the number of job offers received? An MBA student randomly sampled four recent graduates, one each in finance, marketing, and management, and asked them to report the number of job offers. Can we conclude at the 5% significance level that there are differences in the number of job offers between the three MBA majors?

Finance	Marketing	Management
3	1	8
1	5	5
4	3	4
1	4	6

- 14.5 Xr14-05** A consumer organization was concerned about the differences between the advertised sizes of containers and the actual amount of product. In a preliminary study, six packages of three different brands of margarine that are supposed to contain 500 ml were measured. The differences from 500 ml are listed here. Do these data provide sufficient evidence to conclude that differences exist between the three brands? Use $\alpha = .01$.

Brand 1	Brand 2	Brand 3
1	2	1
3	2	2
3	4	4
0	3	2
1	0	3
0	4	4

- 14.6 Xr14-06** Many college and university students obtain summer jobs. A statistics professor wanted to determine whether students in different degree programs earn different amounts. A random sample of 5 students in the BA, BSc, and BBA programs were asked to report what they earned the previous summer. The results (in \$1,000s) are listed here.

Can the professor infer at the 5% significance level that students in different degree programs differ in their summer earnings?

B.A.	B.Sc.	B.B.A.
3.3	3.9	4.0
2.5	5.1	6.2
4.6	3.9	6.3
5.4	6.2	5.9
3.9	4.8	6.4

- 14.7 **Xr14-07** Spam is the price we pay for being able to easily communicate by e-mail. Does spam affect everyone equally? In a preliminary study, university professors, administrators, and students were randomly sampled. Each person was asked to count the number of spam messages received that day. The results follow. Can we infer at the 2.5% significance level that the differing university communities differ in the amount of spam they receive in their e-mails?

Professors	Administrators	Students
7	5	12
4	9	4
0	12	5
3	16	18
18	10	15

- 14.8 **Xr14-08** A management scientist believes that one way of judging whether a computer came equipped with enough memory is to determine the age of the computer. In a preliminary study, random samples of computer users were asked to identify the brand of computer and its age (in months). The categorized responses are shown here. Do these data provide sufficient evidence to conclude that there are differences in age between the computer brands? (Use $\alpha = .05$.)

IBM	Dell	Hewlett-Packard	Other
17	8	6	24
10	4	15	12
13	21	8	15

Exercises 14.9–14.22 require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level unless specified otherwise.

- 14.9 **Xr14-09** Because there are no national or regional standards, it is difficult for university admission committees to compare graduates of different high schools. University administrators have noted that an 80% average at a high school with low standards may be equivalent to a 70% average at another school with higher standards of grading. In an

effort to more equitably compare applications, a pilot study was initiated. Random samples of students who were admitted the previous year from four local high schools were drawn. All the students entered the business program with averages between 70% and 80%. Their average grades in the first year at the university were computed.

- Can the university admissions officer conclude that there are differences in grading standards between the four high schools?
- What are the required conditions for the test conducted in part (a)?
- Does it appear that the required conditions of the test in part (a) are satisfied?

- 14.10 **Xr14-10** The friendly folks at the Internal Revenue Service (IRS) in the United States and Canada Revenue Agency (CRA) are always looking for ways to improve the wording and format of its tax return forms. Three new forms have been developed recently. To determine which, if any, are superior to the current form, 120 individuals were asked to participate in an experiment. Each of the three new forms and the currently used form were filled out by 30 different people. The amount of time (in minutes) taken by each person to complete the task was recorded.
- What conclusions can be drawn from these data?
 - What are the required conditions for the test conducted in part (a)?
 - Does it appear that the required conditions of the test in part (a) are satisfied?

- 14.11 **Xr14-11** Are proficiency test scores affected by the education of the child's parents? (Proficiency tests are administered to a sample of students in private and public schools. Test scores can range from 0 to 500.) To answer this question, a random sample of 9-year-old children was drawn. Each child's test score and the educational level of the parent with the higher level were recorded. The education categories are less than high school, high school graduate, some college, and college graduate. Can we infer that there are differences in test scores between children whose parents have different educational levels? (Adapted from the *Statistical Abstract of the United States*, 2000, Table 286.)

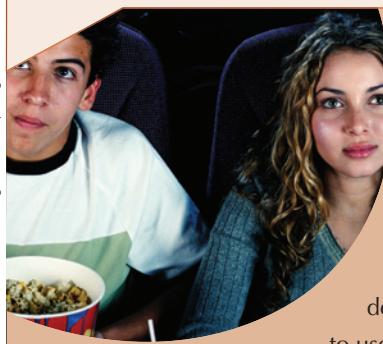
- 14.12 **Xr14-12** A manufacturer of outdoor brass lamps and mailboxes has received numerous complaints about premature corrosion. The manufacturer has identified the cause of the problem as the low-quality lacquer used to coat the brass. He decides to replace his current lacquer supplier with one of five possible alternatives. To judge which is best, he uses each of the five lacquers to coat 25 brass mailboxes and puts all 125 mailboxes outside. He records, for each, the number of days until the first sign of corrosion is observed.

- a. Is there sufficient evidence at the 1% significance level to allow the manufacturer to conclude that differences exist between the five lacquers?
- b. What are the required conditions for the test conducted in part (a)?
- c. Does it appear that the required conditions of the test in part (a) are satisfied?
- 14.13 Xr14-13** In early 2001, the economy was slowing down and companies were laying off workers. A Gallup poll asked a random sample of workers how long it would be before they had significant financial hardships if they lost their jobs and couldn't find new ones. They also classified their income. The classifications are
- More than \$50,000
 - \$30,000 to \$50,000
 - \$20,000 to \$30,000
 - Less than \$20,000
- Can we infer that differences exist between the four groups?
- 14.14 Xr14-14** In the introduction to this chapter, we mentioned that the first use of the analysis of variance was in the 1920s. It was employed to determine whether different amounts of fertilizer yielded different amounts of crop. Suppose that a scientist at an agricultural college wanted to redo the original experiment using three different types of fertilizer. Accordingly, she applied fertilizer A to 20 1-acre plots of land, fertilizer B to another 20 plots, and fertilizer C to yet another 20 plots of land. At the end of the growing season, the crop yields were recorded. Can the scientist infer that differences exist between the crop yields?
- 14.15 Xr14-15** A study performed by a Columbia University professor (described in *Report on Business*, August 1991) counted the number of times per minute professors from three different departments said “uh” or “ah” during lectures to fill gaps between words. The data derived from observing 100 minutes from each of the three departments were recorded. If we assume that the more frequent use of “uh” and “ah” results in more boring lectures, can we conclude that some departments’ professors are more boring than others?
- 14.16 Xr14-16** Does the level of success of publicly traded companies affect the way their board members are paid? Publicly traded companies were divided into four quarters using the rate of return in their stocks to differentiate among the companies. The annual payment (in \$1,000s) to their board members was recorded. Can we infer that the amount of payment differs between the four groups of companies?
- 14.17 Xr14-17** In 1994, the chief executive officers of the major tobacco companies testified before a U.S. Senate subcommittee. One of the accusations made was that tobacco firms added nicotine to their cigarettes, which made them even more addictive to smokers. Company scientists argued that the amount of nicotine in cigarettes depended completely on the size of the tobacco leaf. During poor growing seasons, the tobacco leaves would be smaller than in normal or good growing seasons. However, because the amount of nicotine in a leaf is a fixed quantity, smaller leaves would result in cigarettes having more nicotine (because a greater fraction of the leaf would be used to make a cigarette). To examine the issue, a university chemist took random samples of tobacco leaves that were grown in greenhouses where the amount of water was allowed to vary. Three different groups of tobacco leaves were grown. Group 1 leaves were grown with about an average season’s rainfall. Group 2 leaves were given about 67% of group 1’s water, and group 3 leaves were given 33% of group 1’s water. The size of the leaf (in grams) and the amount of nicotine in each leaf were measured.
- a. Test to determine whether the leaf sizes differ between the three groups.
 - b. Test to determine whether the amounts of nicotine differ in the three groups.
- 14.18 Xr14-18** There is a bewildering number of breakfast cereals on the market. Each company produces several different products in the belief that there are distinct markets. For example, there is a market composed primarily of children, another for diet-conscious adults, and another for health-conscious adults. Each cereal the companies produce has at least one market as its target. However, consumers make their own decisions, which may or may not match the target predicted by the cereal maker. In an attempt to distinguish between consumers, a survey of adults between the ages of 25 and 65 was undertaken. Each was asked several questions, including age, income, and years of education, as well as which brand of cereal they consumed most frequently. The cereal choices are
1. Sugar Smacks, a children’s cereal
 2. Special K, a cereal aimed at dieters
 3. Fiber One, a cereal that is designed and advertised as healthy
 4. Cheerios, a combination of healthy and tasty
- The results of the survey were recorded using the following format:
- Column 1: Cereal choice
 - Column 2: Age of respondent
 - Column 3: Annual household income
 - Column 4: Years of education

- Determine whether there are differences between the ages of the consumers of the four cereals.
- Determine whether there are differences between the incomes of the consumers of the four cereals.
- Determine whether there are differences between the educational levels of the consumers of the four cereals.
- Summarize your findings in parts (a) through (c) and prepare a report describing the differences between the four groups of cereal consumers.

John Eder/The Image Bank/Getty Images

APPLICATIONS in MARKETING



Marketing Segmentation

Section 12-4 introduced market segmentation. In Chapter 13 we demonstrated how

to use statistical analyses to determine whether two segments differ in their buying behavior. The next exercise requires you to apply the analysis of variance to determine whether several segments differ.

- 14.20** *Xr14-20* After determining in Exercise 13.155 that teenagers watch more movies than do 20 to 30 year olds, teenagers were further segmented into three age groups: 12 to 14, 15 to 16, and 17 to 19. Random samples were drawn from each segment, and the number of movies each teenager saw last year was recorded. Do these data allow a marketing manager of a movie studio to conclude that differences exist between the three segments?

APPLICATIONS in MARKETING



Test Marketing

In Chapter 13, we introduced test marketing, which allows us to determine whether changing some of the elements

of the marketing mix

yields different sales. In the next exercise, we apply the technique to discover the effect of different prices.

- 14.19** *Xr14-19* A manufacturer of novelty items is undecided about the price to charge for a new product. The marketing manager knows that it should sell for about \$10 but is unsure of whether sales will vary significantly if it is priced at either \$9 or \$11. To conduct a pricing experiment, she distributes the new product to a sample of 60 stores belonging to a certain chain of variety stores. These 60 stores are all located in similar neighborhoods. The manager randomly selects 20 stores in which to sell the item at \$9, 20 stores to sell it at \$10, and the remaining 20 stores to sell it at \$11. Sales at the end of the trial period were recorded. What should the manager conclude?

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- 14.21** *Xr14-21* As large cities grow larger, traffic congestion also increases. To measure how commuting time differs between California, New York, and Texas, random samples of commuters in each state were drawn. Is there sufficient evidence to infer that differences in commuting time exists between the three states?

Source: Adapted from *Statistical Abstract of the United States* 2012, Table 1100.

- 14.22** *Xr14-22* The Program for International Student Assessment (PISA) conducts tests of 15-year-olds. The tests jointly developed by the participating countries are tests for reading literary test, mathematical literacy test, and scientific literacy test. Random samples from the United States, Canada, and the United Kingdom were recorded. For each test, determine whether there are differences between the three countries.

Source: Adapted from *Statistical Abstract of the United States* 2012, Table 1371.



GENERAL SOCIAL SURVEY EXERCISES

Conduct all statistical tests at the 5% significance level.
The next four exercises compare Democrats, Independents, and Republicans (PARTYID: 0, 1 = Democrat, 2, 3, 4 = Independent, 5, 6 = Republican.)

- 14.23 **GSS2012*** Is it a myth that Democratic Party supporters are more educated than Independents and Republicans? Conduct a test to determine whether differences in education (EDUC) actually exist.
- 14.24 **GSS2012*** Does income affect the way Americans choose which party to support? Conduct a statistical procedure to determine whether there are differences in income (INCOME) between Democrats, Independents, and Republicans.
- 14.25 **GSS2012*** Refer to Exercise 14.24. If differences in income exist, is it because higher-income Americans work harder? Can we conclude from the data that there are differences in the hours worked (HRS1) between the three political groups?
- 14.26 **GSS2012*** Who watches more television (TVHOURS), Democrats, Independents, or Republicans? To help answer this question, test to determine whether differences exist.
- Exercises 14.27 to 14.31 compare liberals, moderates, and conservatives (POLVIEWS: 1, 2, 3 = Liberal, 4 = Moderate, 5, 6, 7 = Conservatives.)*
- 14.27 **GSS2012*** Are liberals, moderates, and conservatives all equally educated? Test to determine whether differences exist in the amount of education (EDUC).
- 14.28 **GSS2012*** Can we infer from the data that there are differences in the amount of television watched (TVHOURS)?
- 14.29 **GSS2012*** Is it a myth that conservatives work harder than do liberals and moderates? Test to determine whether there are differences in number of hours of work per week (HRS1).
- 14.30 **GSS2012*** Is there sufficient evidence to infer that there are differences in the number of children (CHILDS) between adherents of the three political viewpoints?
- 14.31 **GSS2012*** Is it true that younger Americans tend to be liberal and older Americans more conservative? To help discover the truth, start by determining whether there is enough statistical evidence to conclude that there are differences in age (AGE) between liberals, moderates, and conservatives.
- 14.32 **GSS2012*** How does acquiring additional degrees contribute to higher incomes? Conduct a test to determine whether the degree holders (DEGREE: 0 = Left high school, 1 = High school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree) differ in income (INCOME).
- 14.33 **GSS2012*** Television networks and their advertisers are constantly measuring viewers to determine their likes and dislikes and how much time adults spend watching television per day. Do the data allow us to infer that the amount of television (TVHOURS) differs by race (RACE)?
- 14.34 **GSS2006* GSS2008* GSS2010* GSS2012*** Has educational levels kept uniform over the years 2006, 2008, 2010, and 2012? Conduct a test to determine whether the number of years of education (EDUC) differs in the four years.
- 14.35 **GSS2006* GSS2008* GSS2010* GSS2012*** Has the amount of time Americans devote to work weekly (HRS1) changed over the years 2006, 2008, 2010, and 2012? Perform a statistical analysis to answer the question.
- 14.36 **GSS2006* GSS2008* GSS2010* GSS2012*** Has the amount of television American adults watch been constant over the years 2006, 2008, 2010, and 2012 or has the amount varied. Test to determine whether the number of hours of television per day (TVHOURS) changed over the 8-year span.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 14.37 **ANES2008*** Repeat the chapter-opening example using the data from the American National Election Survey of 2008. That is, test to determine whether annual incomes (INCOME) differ between the seven political views (LIBCON). **Use a 5% significance level.**
- 14.38 **ANES2008*** Who has the most and least education among Democrats, Independents, and Republicans? Conduct a statistical test to determine if there is evidence of a difference in education (EDUC) between the three political affiliations (PARTY3).

14.39 ANES2008* Who reads newspapers more, Democrat, Independents, or Republicans? Test to determine whether differences exist in the number of days reading a newspaper (DAYS9) between the three political affiliations (PARTY3).

14.40 ANES2008* How are income and degree related? The American National Election Survey asked respondents who reported at least 13 years of education to identify the highest degree completed (DEGREE: 0 = No degree earned, 1 = Bachelor's degree, 2 = Master's degree, 3 = Ph.D., etc., 4 = LLB, JD, 5 = MD, DDS, etc., 6 = JDC, STD, THD, 7 = Associate's degree. Is there enough statistical evidence to conclude that there are differences in income (INCOME) between people with different completed degrees?

14.41 ANES2008* Are marital status and education related? If so, we would expect the amount of education in at least two of the marital status categories to be different. Conduct a statistical procedure to determine whether there is enough evidence to infer that the amount of education (EDUC) differs between marital status (MARITAL) categories.

14.42 ANES2008* How definite is one's intention to vote in the presidential election and is that intention related to party affiliation? To answer this question, conduct a test to determine whether the intention to vote (DEFINITE) varies between Democrats, Independents, and Republicans (PARTY3).

14-2 / MULTIPLE COMPARISONS

When we conclude from the one-way analysis of variance that at least two treatment means differ, we often need to know which treatment means are responsible for these differences. For example, if an experiment is undertaken to determine whether different locations within a store produce different mean sales, the manager would be keenly interested in determining which locations result in significantly higher sales and which locations result in lower sales. Similarly, a stockbroker would like to know which one of several mutual funds outperforms the others, and a television executive would like to know which television commercials hold the viewers' attention and which are ignored.

Although it may appear that all we need to do is examine the sample means and identify the largest or the smallest to determine which population means are largest or smallest, this is not the case. To illustrate, suppose that in a five-treatment analysis of variance, we discover that differences exist and that the sample means are as follows:

$$\bar{x}_1 = 20 \quad \bar{x}_2 = 19 \quad \bar{x}_3 = 25 \quad \bar{x}_4 = 22 \quad \bar{x}_5 = 17$$

The statistics practitioner wants to know which of the following conclusions are valid:

- 1.** μ_3 is larger than the other means.
- 2.** μ_3 and μ_4 are larger than the other means.
- 3.** μ_5 is smaller than the other means.
- 4.** μ_5 and μ_2 are smaller than the other means.
- 5.** μ_3 is larger than the other means, and μ_5 is smaller than the other means.

From the information we have, it is impossible to determine which, if any, of the statements are true. We need a statistical method to make this determination. The technique is called **multiple comparisons**.

EXAMPLE 14.2

DATA
Xm14-02

Comparing the Costs of Repairing Car Bumpers

Because of foreign competition, North American automobile manufacturers have become more concerned with quality. One aspect of quality is the cost of repairing damage caused by accidents. A manufacturer is considering several new types of bumpers. To test how well they react to low-speed collisions, 10 bumpers of each of four different types were installed on mid-size cars, which were then driven into a wall at 5 miles per hour. The cost of repairing the damage in each case was assessed. The data are shown below.

- Is there sufficient evidence at the 5% significance level to infer that the bumpers differ in their reactions to low-speed collisions?
- If differences exist, which bumpers differ?

Bumper 1	Bumper 2	Bumper 3	Bumper 4
610	404	599	272
354	663	426	405
234	521	429	197
399	518	621	363
278	499	426	297
358	374	414	538
379	562	332	181
548	505	460	318
196	375	494	412
444	438	637	499

SOLUTION:**IDENTIFY**

The problem objective is to compare four populations. The data are interval, and the samples are independent. The correct statistical method is the one-way analysis of variance, which we perform using Excel and Minitab.

COMPUTE**EXCEL**

	A	B	C	D	E	F	G
1	Anova: Single Factor						
2							
3	SUMMARY						
4	Groups	Count	Sum	Average	Variance		
5	Bumper 1	10	3800	380.0	16,924		
6	Bumper 2	10	4859	485.9	8,197		
7	Bumper 3	10	4838	483.8	10,426		
8	Bumper 4	10	3482	348.2	14,049		
9							
10							
11	ANOVA						
12	Source of Variation	SS	df	MS	F	P-value	F crit
13	Between Groups	150,884	3	50,295	4.06	0.0139	2.8663
14	Within Groups	446,368	36	12,399			
15							
16	Total	597,252	39				

MINITAB**One-way ANOVA: Bumper 1, Bumper 2, Bumper 3, Bumper 4**

Source	DF	SS	MS	F	P
Factor	3	150884	50295	4.06	0.014
Error	36	446368	12399		
Total	39	597252			

S = 111.4 R-Sq = 25.26% R-Sq(adj) = 19.03%

Individual 95% CIs For Mean Based on Pooled StDev

Level	N	Mean	StDev
Bumper 1	10	380.0	130.1
Bumper 2	10	485.9	90.5
Bumper 3	10	483.8	102.1
Bumper 4	10	348.2	118.5

**INTERPRET**

The test statistic is $F = 4.06$ and the p -value = .0139. There is enough statistical evidence to infer that there are differences between some of the bumpers. The question is now, Which bumpers differ?

There are several statistical inference procedures that deal with this problem. We will present three methods that allow us to determine which population means differ. All three methods apply to the one-way experiment only.

14-2a Fisher's Least Significant Difference Method

The **least significant difference (LSD)** method was briefly introduced in Section 14-1 (page 529). To determine which population means differ, we could perform a series of t -tests of the difference between two means on all pairs of population means to determine which are significantly different. In Chapter 13, we introduced the equal-variances t -test of the difference between two means. The test statistic and confidence interval estimator are, respectively,

$$t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}} \\ (\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}$$

with degrees of freedom $\nu = n_1 + n_2 - 2$.

Recall that s_p^2 is the pooled variance estimate, which is an unbiased estimator of the variance of the two populations. (Recall that the use of these techniques requires that the population variances be equal.) In this section, we modify the test statistic and interval estimator.

Earlier in this chapter, we pointed out that MSE is an unbiased estimator of the common variance of the populations we're testing. Because MSE is based on all the observations in the k samples, it will be a better estimator than s_p^2 (which is based on only two samples). Thus, we could draw inferences about every pair of means by substituting MSE for s_p^2 in the formulas for test statistic and confidence interval estimator shown previously. The number of degrees of freedom would also change to $\nu = n - k$ (where n is the total sample size). The test statistic to determine whether μ_i and μ_j differ is

$$t = \frac{(\bar{x}_i - \bar{x}_j) - (\mu_i - \mu_j)}{\sqrt{MSE\left(\frac{1}{n_i} + \frac{1}{n_j}\right)}}$$

The confidence interval estimator is

$$(\bar{x}_i - \bar{x}_j) \pm t_{\alpha/2} \sqrt{MSE\left(\frac{1}{n_i} + \frac{1}{n_j}\right)}$$

with degrees of freedom $\nu = n - k$.

We define the least significant difference LSD as

$$LSD = t_{\alpha/2} \sqrt{MSE\left(\frac{1}{n_i} + \frac{1}{n_j}\right)}$$

A simple way of determining whether differences exist between each pair of population means is to compare the absolute value of the difference between their two sample means and LSD. In other words, we will conclude that μ_i and μ_j differ if

$$| \bar{x}_i - \bar{x}_j | > LSD$$

LSD will be the same for all pairs of means if all k sample sizes are equal. If some sample sizes differ, LSD must be calculated for each combination.

In Section 14-1 we argued that this method is flawed because it will increase the probability of committing a Type I error. That is, it is more likely than the analysis of variance to conclude that a difference exists in some of the population means when in fact none differ. On page 529, we calculated that if $k = 6$ and all population means are equal, the probability of erroneously inferring at the 5% significance level that at least two means differ is about 54%. The 5% figure is now referred to as the *comparisonwise Type I error rate*. The true probability of making at least one Type I error is called the *experimentwise Type I error rate*, denoted α_E . The experimentwise Type I error rate can be calculated as

$$\alpha_E = 1 - (1 - \alpha)^C$$

Here C is the number of pairwise comparisons, which can be calculated by $C = k(k - 1)/2$. Mathematicians have proven that

$$\alpha_E \leq C\alpha$$

which means that if we want the probability of making at least one Type I error to be no more than α_E , we simply specify $\alpha = \alpha_E/C$. The resulting procedure is called the **Bonferroni adjustment**.

14-2b Bonferroni Adjustment to LSD Method

The adjustment is made by dividing the specified experimentwise Type I error rate by the number of combinations of pairs of population means. For example, if $k = 6$, then

$$C = \frac{k(k - 1)}{2} = \frac{6(5)}{2} = 15$$

If we want the true probability of a Type I error to be no more than 5%, we divide this probability by C . Thus, for each test we would use a value of α equal to

$$\alpha = \frac{\alpha_E}{C} = \frac{.05}{15} = .0033$$

We use Example 14.2 to illustrate Fisher's LSD method and the Bonferroni adjustment. The four sample means are

$$\begin{aligned}\bar{x}_1 &= 380.0 \\ \bar{x}_2 &= 485.9 \\ \bar{x}_3 &= 483.8 \\ \bar{x}_4 &= 348.2\end{aligned}$$

The pairwise absolute differences are

$$\begin{aligned}|\bar{x}_1 - \bar{x}_2| &= |380.0 - 485.9| = |-105.9| = 105.9 \\ |\bar{x}_1 - \bar{x}_3| &= |380.0 - 483.8| = |-103.8| = 103.8 \\ |\bar{x}_1 - \bar{x}_4| &= |380.0 - 348.2| = |31.8| = 31.8 \\ |\bar{x}_2 - \bar{x}_3| &= |485.9 - 483.8| = |2.1| = 2.1 \\ |\bar{x}_2 - \bar{x}_4| &= |485.9 - 348.2| = |137.7| = 137.7 \\ |\bar{x}_3 - \bar{x}_4| &= |483.8 - 348.2| = |135.6| = 135.6\end{aligned}$$

From the computer output, we learn that $MSE = 12,399$ and $\nu = n - k = 40 - 4 = 36$. If we conduct the LSD procedure with $\alpha = .05$ we find $t_{\alpha/2, n-k} = t_{.025, 36} \approx t_{.025, 35} = 2.030$. Thus,

$$t_{\alpha/2} \sqrt{MSE \left(\frac{1}{n_i} + \frac{1}{n_j} \right)} = 2.030 \sqrt{12,399 \left(\frac{1}{10} + \frac{1}{10} \right)} = 101.09$$

We can see that four pairs of sample means differ by more than 101.09. In other words, $|\bar{x}_1 - \bar{x}_2| = 105.9$, $|\bar{x}_1 - \bar{x}_3| = 103.8$, $|\bar{x}_2 - \bar{x}_4| = 137.7$, and $|\bar{x}_3 - \bar{x}_4| = 135.6$. Hence, μ_1 and μ_2 , μ_1 and μ_3 , μ_2 and μ_4 , and μ_3 and μ_4 differ. The other two pairs— μ_1 and μ_4 , and μ_2 and μ_3 —do not differ.

If we perform the LSD procedure with the Bonferroni adjustment, the number of pairwise comparisons is 6 (calculated as $C = k(k - 1)/2 = 4(3)/2$). We set $\alpha = .05/6 = .0083$. Thus $t_{\alpha/2, 36} = t_{.0042, 36} = 2.794$ (available from Excel and difficult to approximate manually) and

$$LSD = t_{\alpha/2} \sqrt{MSE \left(\frac{1}{n_i} + \frac{1}{n_j} \right)} = 2.794 \sqrt{12,399 \left(\frac{1}{10} + \frac{1}{10} \right)} = 139.13$$

Now no pair of means differ because all the absolute values of the differences between sample means are less than 139.19.

The drawback to the LSD procedure is that we increase the probability of at least one Type I error. The Bonferroni adjustment corrects this problem. However, recall that the probabilities of Type I and Type II errors are inversely related. The Bonferroni adjustment uses a smaller value of α , which results in an increased probability of a Type II error. A Type II error occurs when a difference between population means exists, yet we cannot detect it. This may be the case in this example. The next multiple comparison method addresses this problem.

14-2c Tukey's Multiple Comparison Method

A more powerful test is **Tukey's multiple comparison method**. This technique determines a critical number similar to LSD for Fisher's test, denoted by ω (Greek letter *omega*) such that, if any pair of sample means has a difference greater than ω , we conclude that the pair's two corresponding population means are different.

The test is based on the Studentized range, which is defined as the variable

$$q = \frac{\bar{x}_{\max} - \bar{x}_{\min}}{s/\sqrt{n}}$$

where \bar{x}_{\max} and \bar{x}_{\min} are the largest and smallest sample means, respectively, assuming that there are no differences between the population means. We define ω as follows.

Critical Number ω

$$\omega = q_\alpha(k, \nu) \sqrt{\frac{\text{MSE}}{n_g}}$$

where

k = Number of treatments

n = Number of observations ($n = n_1 + n_2 + \dots + n_k$)

ν = Number of degrees of freedom associated with MSE ($\nu = n - k$)

n_g = Number of observations in each of k samples

α = Significance level

$q_\alpha(k, \nu)$ = Critical value of the Studentized range

Theoretically, this procedure requires that all sample sizes be equal. However, if the sample sizes are different, we can still use this technique provided that the sample sizes are at least similar. The value of n_g used previously is the *harmonic mean* of the sample sizes; that is,

$$n_g = \frac{k}{\frac{1}{n_1} + \frac{1}{n_2} + \dots + \frac{1}{n_k}}$$

Table 7 in Appendix B provides values of $q_\alpha(k, \nu)$ for a variety of values of k and ν , and for $\alpha = .01$ and $.05$. Applying Tukey's method to Example 14.2, we find

$$\begin{aligned} k &= 4 \\ n_1 &= n_2 = n_3 = n_4 = n_g = 10 \\ \nu &= n - k = 40 - 4 = 36 \\ \text{MSE} &= 12,399 \\ q_{.05}(4, 37) &\approx q_{.05}(4, 40) = 3.79 \end{aligned}$$

Thus,

$$\omega = q_\alpha(k, \nu) \sqrt{\frac{\text{MSE}}{n_g}} = (3.79) \sqrt{\frac{12,399}{10}} = 133.45$$

There are two absolute values larger than 133.45. Hence, we conclude that μ_2 and μ_4 , and μ_3 and μ_4 differ. The other four pairs do not differ.

EXCEL

	A	B	C	D	E
1	Multiple Comparisons				
2					
3					
4	Treatment	Treatment	Difference	Alpha = 0.05	Alpha = 0.05
5	Bumper 1	Bumper 2	-105.9	100.99	133.45
6		Bumper 3	-103.8	100.99	133.45
7		Bumper 4	31.8	100.99	133.45
8	Bumper 2	Bumper 3	2.1	100.99	133.45
9		Bumper 4	137.7	100.99	133.45
10	Bumper 3	Bumper 4	135.6	100.99	133.45

Tukey and Fisher's LSD with the Bonferroni Adjustment ($\alpha = .05/6 = 0.083$)

	A	B	C	D	E
1	Multiple Comparisons				
2					
3					
4	Treatment	Treatment	Difference	Alpha = 0.0083	Alpha = 0.05
5	Bumper 1	Bumper 2	-105.9	139.11	133.45
6		Bumper 3	-103.8	139.11	133.45
7		Bumper 4	31.8	139.11	133.45
8	Bumper 2	Bumper 3	2.1	139.11	133.45
9		Bumper 4	137.7	139.11	133.45
10	Bumper 3	Bumper 4	135.6	139.11	133.45

The printout includes ω (Tukey's method), the differences between sample means for each combination of populations, and Fisher's LSD. (The Bonferroni adjustment is made by specifying another value for α .)

INSTRUCTIONS

- Type or import the data into adjacent columns. (Open Xm14-02.)
- Click Add-Ins, Data Analysis Plus, and Multiple Comparisons.
- Specify the Input Range (A1:D11). Type the value of α . To use the Bonferroni adjustment divide α by $C = k(k - 1)/2$. For Tukey, Excel computes ω only for $\alpha = .05$.

MINITABTukey 95% Simultaneous Confidence Intervals
All Pairwise Comparisons

Individual confidence level = 98.38%

Bumper 1 subtracted from:

	Lower	Center	Upper	
Bumper 2	-28.3	105.9	240.1	(-----*-----)
Bumper 3	-30.4	103.8	238.0	(-----*-----)
Bumper 4	-166.0	-31.8	102.4	(-----*-----)

Bumper 2 subtracted from:

	Lower	Center	Upper	
Bumper 3	-136.3	-2.1	132.1	(-----*-----)
Bumper 4	-271.9	-137.7	-3.5	(-----*-----)

Bumper 3 subtracted from:

	Lower	Center	Upper	
Bumper 4	-269.8	-135.6	-1.4	(-----*-----)

Fisher 99.17% Individual Confidence Intervals
All Pairwise Comparisons

Simultaneous confidence level = 96.04%

Bumper 1 subtracted from:

	Lower	Center	Upper	
Bumper 2	-33.2	105.9	245.0	(-----*-----)
Bumper 3	-35.3	103.8	242.9	(-----*-----)
Bumper 4	-170.9	-31.8	107.3	(-----*-----)

Bumper 2 subtracted from:

	Lower	Center	Upper	
Bumper 3	-141.2	-2.1	137.0	(-----*-----)
Bumper 4	-276.8	-137.7	1.4	(-----*-----)

Bumper 3 subtracted from:

	Lower	Center	Upper	
Bumper 4	-274.4	-135.6	3.5	(-----*-----)

Minitab reports the results of Tukey's multiple comparisons by printing interval estimates of the differences between each pair of means. The estimates are computed by calculating the pairwise difference between sample means minus ω for the lower limit and plus ω for the upper limit. The calculations are described in the following table.

Tukey's Method

Pair of Population Means Compared	Difference	Lower Limit	Upper Limit
Bumper 2-Bumper 1	105.9	-28.3	240.1
Bumper 3-Bumper 1	103.8	-30.4	238.0
Bumper 4-Bumper 1	-31.8	-166.0	102.4
Bumper 3-Bumper 2	-2.1	-136.3	132.1
Bumper 4-Bumper 2	-137.7	-271.9	-3.5
Bumper 4-Bumper 3	-135.6	-269.8	-1.4

A similar calculation is performed for Fisher's method replacing ω by LSD.

Fisher's Method	Pair of Population Means Compared	Difference	Lower Limit	Upper Limit
Bumper 2-Bumper 1		105.9	-33.2	245.0
Bumper 3-Bumper 1		103.8	-35.3	242.9
Bumper 4-Bumper 1		-31.8	-170.9	107.3
Bumper 3-Bumper 2		-2.1	-141.2	137.0
Bumper 4-Bumper 2		-137.7	-276.8	1.4
Bumper 4-Bumper 3		-135.6	274.7	3.5

We interpret the test results in the following way. If the interval includes 0, there is not enough evidence to infer that the pair of means differ. If the entire interval is above or the entire interval is below 0, we conclude that the pair of means differ.

INSTRUCTIONS

1. Type or import the data either in stacked or unstacked format. ([Open Xm14-02](#).)
2. Click Stat, ANOVA, and **Oneway (Unstacked)** . . .
3. Type or Select the variables in the **Responses (in separate columns)** box (Bumper 1, Bumper 2, Bumper 3, Bumper 4).
4. Click **Comparisons** . . . Select Tukey's method and specify α . Select Fisher's method and specify α . For the Bonferroni adjustment divide α by $C = k(k - 1)/2$.

INTERPRET

Using the Bonferroni adjustment of Fisher's LSD method, we discover that none of the bumpers differ. Tukey's method tells us that bumper 4 differs from both bumpers 2 and 3. Based on this sample, bumper 4 appears to have the lowest cost of repair. Because there was not enough evidence to conclude that bumpers 1 and 4 differ, we would consider using bumper 1 if it has other advantages over bumper 4.

14-2d Which Multiple Comparison Method to Use

Unfortunately, no one procedure works best in all types of problems. Most statisticians agree with the following guidelines:

If you have identified two or three pairwise comparisons that you wish to make before conducting the analysis of variance, use the Bonferroni method. This means that if there are 10 populations in a problem but you're particularly interested in comparing, say, populations 3 and 7 and populations 5 and 9, use Bonferroni with $C = 2$.

If you plan to compare all possible combinations, use Tukey.

When do we use Fisher's LSD? If the purpose of the analysis is to point to areas that should be investigated further, Fisher's LSD method is indicated.

Incidentally, to employ Fisher's LSD or the Bonferroni adjustment, you must perform the analysis of variance first. Tukey's method can be employed instead of the analysis of variance.



EXERCISES

Developing an Understanding of Statistical Concepts

- 14.43** a. Use Fisher's LSD method with $\alpha = .05$ to determine which population means differ in the following problem.

$$k = 3 \quad n_1 = 10 \quad n_2 = 10 \quad n_3 = 10 \\ \text{MSE} = 700 \quad \bar{x}_1 = 128.7 \quad \bar{x}_2 = 101.4 \quad \bar{x}_3 = 133.7$$

- b. Repeat Part a using the Bonferroni adjustment.
c. Repeat Part a using Tukey's multiple comparison method.
14.44 a. Use Fisher's LSD procedure with $\alpha = .05$ to determine which population means differ given the following statistics:

$$k = 5 \quad n_1 = 5 \quad n_2 = 5 \quad n_3 = 5 \\ \text{MSE} = 125 \quad \bar{x}_1 = 227 \quad \bar{x}_2 = 205 \quad \bar{x}_3 = 219 \\ n_4 = 5 \quad n_5 = 5 \\ \bar{x}_4 = 248 \quad \bar{x}_5 = 202$$

- b. Repeat Part a using the Bonferroni adjustment.
c. Repeat Part a using Tukey's multiple comparison method

Applications

Unless specified otherwise, use a 5% significance level.

- 14.45** Apply Tukey's method to determine which brands differ in Exercise 14.5.

- 14.46** Refer to Exercise 14.6.

- a. Employ Fisher's LSD method to determine which degrees differ (use $\alpha = .10$).
b. Repeat Part a using the Bonferroni adjustment.

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.

- 14.47** **Xr14-09** a. Apply Fisher's LSD method with the Bonferroni adjustment to determine which schools differ in Exercise 14.9.
b. Repeat Part a applying Tukey's method instead.

- 14.48** **Xr14-10** a. Apply Tukey's multiple comparison method to determine which forms differ in Exercise 14.10.
b. Repeat Part a applying the Bonferroni adjustment.

- 14.49** **Xr14-49** Police cars, ambulances, and other emergency vehicles are required to carry road flares. One of the most important features of flares is their burning times. To help decide which of four brands on the market to use, a police laboratory technician measured the burning time for a random sample of 10 flares of each brand. The results were recorded to the nearest minute.

- a. Can we conclude that differences exist between the burning times of the four brands of flares?
b. Apply Fisher's LSD method with the Bonferroni adjustment to determine which flares are better.
c. Repeat Part b using Tukey's method.

- 14.50** **Xr14-12** Refer to Exercise 14.12.

- a. Apply Fisher's LSD method with the Bonferroni adjustment to determine which lacquers differ.
b. Repeat Part a applying Tukey's method instead.

- 14.51** **Xr14-51** An engineering student who is about to graduate decided to survey various firms in Silicon Valley to see which offered the best chance for early promotion and career advancement. He surveyed 30 small firms (size level is based on gross revenues), 30 medium-sized firms, and 30 large firms, and determined how much time must elapse before an average engineer can receive a promotion.

- a. Can the engineering student conclude that speed of promotion varies between the three sizes of engineering firms?
b. If differences exist, which of the following is true? Use Tukey's method.
i. Small firms differ from the other two.
ii. Medium-sized firms differ from the other two.
iii. Large firms differ from the other two.
iv. All three firms differ from one another.
v. Small firms differ from large firms.

- 14.52** **Xr14-14** a. Apply Tukey's multiple comparison method to determine which fertilizers differ in Exercise 14.14.

- b. Repeat Part a applying the Bonferroni adjustment.



GENERAL SOCIAL SURVEY EXERCISES

Exercises 14.53 to 14.56 compare Democrats, Independents, and Republicans (PARTYID: 0, 1 = Democrat, 2, 3, 4 = Independent, 5, 6 = Republican). In all exercises, use a 5% significance level.

- 14.53** **GSS2012*** Refer to Exercise 14.23. Apply Tukey's multiple comparison method to determine whether there are differences in education (EDUC) between each pair of political groups.

- 14.54** **GSS2012*** Refer to Exercise 14.24. Suppose that all you want to know is whether there are statistically significant differences in income (INCOME) between Democrats and Independents and between Republicans and Independents. Perform the appropriate statistical procedure.
- 14.55** **GSS2012*** Refer to Exercise 14.25. Apply the Bonferroni adjustment method to determine whether each pair of political preferences differs in the number of hours worked per week (HRS1).
- 14.56** **GSS2012*** Refer to Exercise 14.26. Use Tukey's multiple comparison method to test each pair of differences with respect to the amount of television watched.
- The next five exercises compare liberals, moderates, and conservatives (POLVIEWS: 1, 2, 3 = liberal, 4 = moderate, 5, 6, 7 = conservative).*
- 14.57** **GSS2012*** Refer to Exercise 14.27. Use Tukey's multiple comparison method to determine which pairs of political views differ in the amount of education (EDUC).
- 14.58** **GSS2012*** Refer to Exercise 14.28. Suppose that you wish to determine whether moderates and conservatives differ in the amount of television watched (TVHOURS). Which multiple comparison method should you choose? Conduct the test.
- 14.59** **GSS2012*** Refer to Exercise 14.29. If you wanted to determine whether moderates and conservatives differ in the number of hours worked per week (HRS1), which multiple comparison method would you select? What value of α would you use? Perform the test.
- 14.60** **GSS2012*** Refer to Exercise 14.30. Use the Bonferroni adjustment multiple comparison method to determine whether differences in the number of children (CHILDS) exist between the three pairs of political views.
- 14.61** **GSS2012*** Refer to Exercise 14.31. Apply Tukey's multiple comparison method to test for differences in age (AGE) for each pair of political views.
- 14.62** **GSS2012*** Refer to Exercise 14.32. Use Tukey's multiple comparison method to test each pair of degree categories (DEGREE) with respect to income (INCOME).
- 14.63** **GSS2012*** Refer to Exercise 14.33. Apply Tukey's multiple comparison method to test which of the following pairs of races differ in the amount of television watched (TVHOUR). White & Black, White & Other, and Black & Other.
- 14.64** **GSS2006* GSS2008* GSS2010* GSS2012*** Refer to Exercise 14.34. Use an appropriate statistical technique to determine which years differ with respect to the amount of education (EDUC).



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users should note that empty cells (representing missing data) must be removed.

- 14.65** **ANES2008*** Refer to Exercise 14.37. Apply Tukey's Multiple Comparison Method to determine which positions on the Liberal-Conservative spectrum (LIBCON) differ with respect to income (INCOME).
- 14.66** **ANES2008*** Refer to Exercise 14.38. Use a multiple comparison method to determine which of the three parties (PARTY3) differ with respect to education (EDUC).

- 14.67** **ANES2008*** Refer to Exercise 14.41. Use Tukey's Multiple Comparison Method to find which categories of marital status (MARITAL) differ with respect to education (EDUC).
- 14.68** **ANES2008*** Refer to Exercise 14.42. Use an appropriate multiple comparison method to determine which of the three parties (PARTY3) differ with respect to intention to vote (DEFINITE).

14-3 ANALYSIS OF VARIANCE EXPERIMENTAL DESIGNS

Since we introduced the matched pairs experiment in Section 13-3, the experimental design has been one of the factors that determines which technique we use. Statistics practitioners often design experiments to help extract the information they need to assist them in making decisions. The one-way analysis of variance introduced in

Section 14-1 is only one of many different experimental designs of the analysis of variance. For each type of experiment, we can describe the behavior of the response variable using a mathematical expression or model. Although we will not exhibit the mathematical expressions in this chapter (we introduce models in Chapter 16), we think it is useful for you to be aware of the elements that distinguish one experimental design or model from another. In this section, we present some of these elements; in so doing, we introduce two of the experimental designs that will be presented later in this chapter.

14-3a Single-Factor and Multifactor Experimental Designs

As we pointed out in Section 14-1, the criterion by which we identify populations is called a *factor*. The experiment described in Section 14-1 is a single-factor analysis of variance because it addresses the problem of comparing two or more populations defined on the basis of only one factor. A **multifactor experiment** is one in which two or more factors define the treatments. The experiment described in Example 14.1 is a single-factor design because we had one treatment: age of the head of the household. In other words, the factor is the age, and the four age categories were the levels of this factor.

Suppose that we can also look at the gender of the household head in another study. We would then develop a two-factor analysis of variance in which the first factor, age, has four levels, and the second factor, gender, has two levels. We will discuss two-factor experiments in Section 14-5.

14-3b Independent Samples and Blocks

In Section 13-3, we introduced statistical techniques where the data were gathered from a matched pairs experiment. This type of experimental design reduces the variation within the samples, making it easier to detect differences between the two populations. When the problem objective is to compare more than two populations, the experimental design that is the counterpart of the matched pairs experiment is called the **randomized block design**. The term *block* refers to a matched group of observations from each population. Suppose that in Examples 13.4 and 13.5 we had wanted to compare the salary offers for finance, marketing, accounting, and operations management majors. To redo Example 13.5 we would conduct a randomized block experiment where the blocks are the 25 GPA groups and the treatments are the four MBA majors.

Once again, the experimental design should reduce the variation in each treatment to make it easier to detect differences.

We can also perform a blocked experiment by using the same subject (person, plant, and store) for each treatment. For example, we can determine whether sleeping pills are effective by giving three brands of pills to the same group of people to measure the effects. Such experiments are called **repeated measures** designs. Technically, this is a different design than the randomized block. However, the data are analyzed in the same way for both designs. Hence, we will treat repeated measures designs as randomized block designs.

The randomized block experiment is also called the **two-way analysis of variance**. In Section 14-4, we introduce the technique used to calculate the test statistic for this type of experiment.

14-3c Fixed and Random Effects

If our analysis includes all possible levels of a factor, the technique is called a **fixed-effects analysis of variance**. If the levels included in the study represent a random sample of all the levels that exist, the technique is called a **random-effects analysis of variance**. In Example 14.2, there were only four possible bumpers. Consequently, the study is a fixed-effects experiment. However, if there were other bumpers besides the four described in the example, and we wanted to know whether there were differences in repair costs between all bumpers, the application would be a random-effects experiment. Here's another example.

To determine whether there is a difference in the number of units produced by the machines in a large factory, 4 machines out of 50 in the plant are randomly selected for study. The number of units each produces per day for 10 days will be recorded. This experiment is a random-effects experiment because we selected a random sample of four machines and the statistical results thus allow us to determine whether there are differences between the 50 machines.

In some experimental designs, there are no differences in calculations of the test statistic between fixed and random effects. However, in others, including the two-factor experiment presented in Section 14-5, the calculations are different.

14-4 / RANDOMIZED BLOCK (TWO-WAY) ANALYSIS OF VARIANCE

The purpose of designing a randomized block experiment is to reduce the within-treatments variation to more easily detect differences between the treatment means. In the one-way analysis of variance, we partitioned the total variation into the between-treatments and the within-treatments variation; that is,

$$\text{SS(Total)} = \text{SST} + \text{SSE}$$

In the randomized block design of the analysis of variance, we partition the total variation into three sources of variation,

$$\text{SS(Total)} = \text{SST} + \text{SSB} + \text{SSE}$$

where **SSB**, the **sum of squares for blocks**, measures the variation between the blocks. When the variation associated with the blocks is removed, SSE is reduced, making it easier to determine whether differences exist between the treatment means.

At this point in our presentation of statistical inference, we will deviate from our usual procedure of solving examples in three ways: manually, using Excel, and using Minitab. The calculations for this experimental design and for the experiment presented in the next section are so time consuming that solving them by hand adds little to your understanding of the technique. Consequently, although we will continue to present the concepts by discussing how the statistics are calculated, we will solve the problems only by computer.

To help you understand the formulas, we will use the following notation:

$\bar{x}[T]_j$ = Mean of the observations in the j th treatment ($j = 1, 2, \dots, k$)

$\bar{x}[B]_i$ = Mean of the observations in the i th block ($i = 1, 2, \dots, b$)

b = Number of blocks

Table 14.4 summarizes the notation we use in this experimental design.

TABLE 14.4 Notation for the Randomized Block Analysis of Variance

BLOCK	TREATMENTS			BLOCK MEAN
	1	2	k	
1	x_{11}	x_{12}	...	x_{1k}
2	x_{21}	x_{22}	...	x_{2k}
:	:	:		:
b	x_{b1}	x_{b2}	...	x_{bk}
Treatment mean	$\bar{x}[T]_1$	$\bar{x}[T]_2$...	$\bar{x}[T]_k$

The definitions of SS(Total) and SST in the randomized block design are identical to those in the independent samples design. SSE in the independent samples design is equal to the sum of SSB and SSE in the randomized block design.

Sums of Squares in the Randomized Block Experiment

$$\text{SS(Total)} = \sum_{j=1}^k \sum_{i=1}^b (x_{ij} - \bar{x})^2$$

$$\text{SST} = \sum_{j=1}^k b(\bar{x}[T]_j - \bar{\bar{x}})^2$$

$$\text{SSB} = \sum_{i=1}^b k(\bar{x}[B]_i - \bar{\bar{x}})^2$$

$$\text{SSE} = \sum_{j=1}^k \sum_{i=1}^b (x_{ij} - \bar{x}[T]_j - \bar{x}[B]_i + \bar{\bar{x}})^2$$

The test is conducted by determining the mean squares, which are computed by dividing the sums of squares by their respective degrees of freedom.

Mean Squares for the Randomized Block Experiment

$$\text{MST} = \frac{\text{SST}}{k - 1}$$

$$\text{MSB} = \frac{\text{SSB}}{b - 1}$$

$$\text{MSE} = \frac{\text{SSE}}{n - k - b + 1}$$

Finally, the test statistic is the ratio of mean squares, as described in the box.

Test Statistic for the Randomized Block Experiment

$$F = \frac{MST}{MSE}$$

which is F -distributed with $\nu_1 = k - 1$ and $\nu_2 = n - k - b + 1$ degrees of freedom.

An interesting, and sometimes useful, by-product of the test of the treatment means is that we can also test to determine whether the block means differ. This will allow us to determine whether the experiment should have been conducted as a randomized block design. (If there are no differences between the blocks, the randomized block design is less likely to detect real differences between the treatment means.) Such a discovery could be useful in future similar experiments. The test of the block means is almost identical to that of the treatment means except the test statistic is

$$F = \frac{MSB}{MSE}$$

which is F -distributed with $\nu_1 = b - 1$ and $\nu_2 = n - k - b + 1$ degrees of freedom.

As with the one-way experiment, the statistics generated in the randomized block experiment are summarized in an ANOVA table, whose general form is exhibited in Table 14.5.

TABLE 14.5 ANOVA Table for the Randomized Block Analysis of Variance

SOURCE OF VARIATION	DEGREES OF FREEDOM	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Treatments	$k - 1$	SST	$MST = SST/(k - 1)$	$F = MST/MSE$
Blocks	$b - 1$	SSB	$MSB = SSB/(b - 1)$	$F = MSB/MSE$
Error	$n - k - b + 1$	SSE	$MSE = SSE/(n - k - b + 1)$	
Total	$n - 1$	SS(Total)		

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EXAMPLE 14.3

DATA
Xm14-03

Comparing Cholesterol-Lowering Drugs

Many North Americans suffer from high levels of cholesterol, which can lead to heart attacks. For those with very high levels (above 280), doctors prescribe drugs to reduce cholesterol levels. A pharmaceutical company has recently developed four such drugs. To determine whether any differences exist in their benefits, an experiment was organized. The company selected 25 groups of four men, each of whom had cholesterol levels in excess of 280. In each group, the men were matched according to age and weight. The drugs were administered over a 2-month period, and the reduction in cholesterol was recorded. Do these results allow the company to conclude that differences exist between the four new drugs?

Group	Drug 1	Drug 2	Drug 3	Drug 4
1	6.6	12.6	2.7	8.7
2	7.1	3.5	2.4	9.3
3	7.5	4.4	6.5	10
4	9.9	7.5	16.2	12.6
5	13.8	6.4	8.3	10.6
6	13.9	13.5	5.4	15.4
7	15.9	16.9	15.4	16.3
8	14.3	11.4	17.1	18.9
9	16	16.9	7.7	13.7
10	16.3	14.8	16.1	19.4
11	14.6	18.6	9	18.5
12	18.7	21.2	24.3	21.1
13	17.3	10	9.3	19.3
14	19.6	17	19.2	21.9
15	20.7	21	18.7	22.1
16	18.4	27.2	18.9	19.4
17	21.5	26.8	7.9	25.4
18	20.4	28	23.8	26.5
19	21.9	31.7	8.8	22.2
20	22.5	11.9	26.7	23.5
21	21.5	28.7	25.2	19.6
22	25.2	29.5	27.3	30.1
23	23	22.2	17.6	26.6
24	23.7	19.5	25.6	24.5
25	28.4	31.2	26.1	27.4

SOLUTION:**IDENTIFY**

The problem objective is to compare four populations, and the data are interval. Because the researchers recorded the cholesterol reduction for each drug for each member of the similar groups of men, we identify the experimental design as randomized block. The response variable is the cholesterol reduction, the treatments are the drugs, and the blocks are the 25 similar groups of men. The hypotheses to be tested are as follows.

$$H_0: \mu_1 = \mu_2 = \mu_3 = \mu_4$$

$H_1:$ At least two means differ

COMPUTE**EXCEL**

	A	B	C	D	E	F	G
36	ANOVA						
37	Source of Variation	SS	df	MS	F	P-value	F crit
38	Rows	3848.66	24	160.36	10.11	9.70E-15	1.6695
39	Columns	195.95	3	65.32	4.12	0.0094	2.7318
40	Error	1142.56	72	15.87			
41							
42	Total	5187.17	99				

Note the use of scientific notation for one of the *p*-values. The number 9.70E – 15 (E stands for *exponent*) is 9.70 multiplied by 10 raised to the power –15, that is, 9.70×10^{-15} . You can increase or decrease the number of decimal places, and you can convert the number into a regular number, but you would need many decimal places, which is why Excel uses scientific notation when the number is very small. (Excel also uses scientific notation for very large numbers.)

The output includes block and treatment statistics (sums, averages, and variances, which are not shown here), and the ANOVA table. The *F*-statistic to determine whether differences exist between the four drugs (**Columns**) is 4.12. Its *p*-value is .0094. The other *F*-statistic, 10.11 (*p*-value = 9.70×10^{-15} = virtually 0), indicates that there are differences between the groups of men (**Rows**).

INSTRUCTIONS

1. Type or import the data into adjacent columns*. (Open Xm14-03.)
2. Click **Data, Data Analysis . . .**, and **Anova: Two-Factor Without Replication**.
3. Specify the **Input Range** (A1:E26). Click **Labels** if applicable. If you do, both the treatments and blocks must be labeled (as in Xm14-03). Specify the value of α (.05).

MINITAB

Two-way ANOVA: Reduction versus Group, Drug

Analysis of Variance for Reduction					
Source	DF	SS	MS	F	P
Group	24	3848.7	160.4	10.11	0.000
Drug	3	196.0	65.3	4.12	0.009
Error	72	1142.6	15.9		
Total	99	5187.2			

The *F*-statistic for **Drug** is 4.12 with a *p*-value of .009. The *F*-statistic for the blocks (**Group**) is 10.11, with a *p*-value of 0.

INSTRUCTIONS

The data must be in stacked format in three columns. One column contains the responses, another contains codes for the levels of the blocks, and a third column contains codes for the levels of the treatments.

1. Click **Stat, ANOVA, and Twoway . . .**
2. Specify the **Responses**, **Row factor**, and **Column factor**

INTERPRET

A Type I error occurs when you conclude that differences exist when, in fact, they do not. A Type II error is committed when the test reveals no difference when at least two means differ. It would appear that both errors are equally costly. Accordingly, we judge the *p*-value against a standard of 5%. Because the *p*-value = .0094, we conclude that there is sufficient evidence to infer that at least two of the drugs differ. An examination reveals that cholesterol reduction is greatest using drugs 2 and 4. Further testing is recommended to determine which is better.

*If one or more columns contain an empty cell (representing missing data) the entire row must be removed. See Keller's website appendix Removing Empty Cells in Excel.

14-4a Checking the Required Conditions

The F -test of the randomized block design of the analysis of variance has the same requirements as the independent samples design. That is, the random variable must be normally distributed and the population variances must be equal. The histograms (not shown) appear to support the validity of our results; the reductions appear to be normal. The equality of variances requirement also appears to be met.

14-4b Violation of the Required Conditions

When the response is not normally distributed, we can replace the randomized block analysis of variance with the Friedman test, which is introduced in Section 19-4.

14-4c Criteria for Blocking

In Section 13-3, we listed the advantages and disadvantages of performing a matched pairs experiment. The same comments are valid when we discuss performing a blocked experiment. The purpose of blocking is to reduce the variation caused by differences between the experimental units. By grouping the experimental units into homogeneous blocks with respect to the response variable, the statistics practitioner increases the chances of detecting actual differences between the treatment means. Hence, we need to find criteria for blocking that significantly affect the response variable. For example, suppose that a statistics professor wants to determine which of four methods of teaching statistics is best. In a one-way experiment, he might take four samples of 10 students, teach each sample by a different method, grade the students at the end of the course, and perform an F -test to determine whether differences exist. However, it is likely that there are very large differences between the students within each class that may hide differences between classes. To reduce this variation, the statistics professor must identify variables that are linked to a student's grade in statistics. For example, overall ability of the student, completion of mathematics courses, and exposure to other statistics courses are all related to performance in a statistics course.

The experiment could be performed in the following way. The statistics professor selects four students at random whose average grade before statistics is 95–100. He then randomly assigns the students to one of the four classes. He repeats the process with students whose average is 90–95, 85–90, . . . , and 50–55. The final grades would be used to test for differences between the classes.

Any characteristics that are related to the experimental units are potential blocking criteria. For example, if the experimental units are people, we may block according to age, gender, income, work experience, intelligence, residence (country, county, or city), weight, or height. If the experimental unit is a factory and we're measuring number of units produced hourly, blocking criteria include workforce experience, age of the plant, and quality of suppliers.

14-4d Developing an Understanding of Statistical Concepts

As we explained previously, the randomized block experiment is an extension of the matched pairs experiment discussed in Section 13-3. In the matched pairs experiment, we simply remove the effect of the variation caused by differences between the experimental units. The effect of this removal is seen in the decrease in the value of the standard error (compared to the standard error in the test statistic produced from

independent samples) and the increase in the value of the t -statistic. In the randomized block experiment of the analysis of variance, we actually measure the variation between the blocks by computing SSB. The sum of squares for error is reduced by SSB, making it easier to detect differences between the treatments. In addition, we can test to determine whether the blocks differ—a procedure we were unable to perform in the matched pairs experiment.

To illustrate, let's return to Examples 13.4 and 13.5, which were experiments to determine whether there was a difference in starting salaries offered to finance and marketing MBA majors. (In fact, we tested to determine whether finance majors draw higher salary offers than do marketing majors. However, the analysis of variance can test only for differences.) In Example 13.4 (independent samples), there was insufficient evidence to infer a difference between the two types of majors. In Example 13.5 (matched pairs experiment), there was enough evidence to infer a difference. As we pointed out in Section 13-3, matching by grade point average allowed the statistics practitioner to more easily discern a difference between the two types of majors. If we repeat Examples 13.4 and 13.5 using the analysis of variance, we come to the same conclusion. The Excel outputs are shown here. (Minitab's printouts are similar.)

Excel Analysis of Variance Output for Example 13.4

	A	B	C	D	E	F	G
9	ANOVA						
10	Source of Variation	SS	df	MS	F	P-value	F crit
11	Between Groups	338,130,013	1	338,130,013	1.09	0.3026	4.0427
12	Within Groups	14,943,884,470	48	311,330,926			
13							
14	Total	15,282,014,483	49				

Excel Analysis of Variance Output for Example 13.5

	A	B	C	D	E	F	G
34	ANOVA						
35	Source of Variation	SS	df	MS	F	P-value	F crit
36	Rows	21,415,991,654	24	892,332,986	40.39	4.17E-14	1.9838
37	Columns	320,617,035	1	320,617,035	14.51	0.0009	4.2597
38	Error	530,174,605	24	22,090,609			
39							
40	Total	22,266,783,295	49				

In Example 13.4, we partition the total sum of squares [SS(Total) = 15,282,014,483] into two sources of variation: SST = 338,130,013 and SSE = 14,943,884,470. In Example 13.5, the total sum of squares is SS(Total) = 22,266,783,295, SST (sum of squares for majors) = 320,617,035, SSB (sum of squares for GPA) = 21,415,991,654, and SSE = 530,174,605. As you can see, the sums of squares for treatments are approximately equal (338,130,013 and 320,617,035). However, the two calculations differ in the sums of squares for error. SSE in Example 13.5 is much smaller than SSE in Example 13.4 because the randomized block experiment allows us to measure and remove the effect of the variation between MBA students with the same majors. The sum of squares for blocks (sum of squares for GPA groups) is 21,415,991,654, a statistic that measures how much variation exists between the salary offers within majors. As a result of removing this variation, SSE is small. Thus, we conclude in Example 13.5

that the salary offers differ between majors whereas there was not enough evidence in Example 13.4 to draw the same conclusion.

Notice that in both examples the t -statistic squared equals the F -statistic in Example 13.4, $t = 1.04$, which when squared equals 1.09, which is the F -statistic (rounded). In Example 13.5, $t = 3.81$, which when squared equals 14.51, the F -statistic for the test of the treatment means. Moreover, the p -values are also the same.

We now complete this section by listing the factors that we need to recognize to use this experiment of the analysis of variance.

Factors That Identify the Randomized Block of the Analysis of Variance

1. **Problem objective:** Compare two or more populations
2. **Data type:** Interval
3. **Experimental design:** Blocked samples



EXERCISES

Developing an Understanding of Statistical Concepts

- 14.69** The following statistics were generated from a randomized block experiment with $k = 3$ and $b = 7$:

$$SST = 100 \quad SSB = 50 \quad SSE = 25$$

- a. Test to determine whether the treatment means differ. (Use $\alpha = .05$.)
- b. Test to determine whether the block means differ. (Use $\alpha = .05$.)

- 14.70** A randomized block experiment produced the following statistics:

$$k = 5 \quad b = 12 \quad SST = 1,500 \quad SSB = 1,000 \quad SS(\text{Total}) = 3,500$$

- a. Test to determine whether the treatment means differ. (Use $\alpha = .01$.)
- b. Test to determine whether the block means differ. (Use $\alpha = .01$.)

- 14.71** Suppose the following statistics were calculated from data gathered from a randomized block experiment with $k = 4$ and $b = 10$:

$$SS(\text{Total}) = 1,210 \quad SST = 275 \quad SSB = 625$$

- a. Can we conclude from these statistics that the treatment means differ? (Use $\alpha = .01$.)
- b. Can we conclude from these statistics that the block means differ? (Use $\alpha = .01$.)

- 14.72** A randomized block experiment produced the following statistics.

$$k = 3 \quad b = 8 \quad SST = 1,500 \quad SS(\text{Total}) = 3,500$$

- a. Test at the 5% significance level to determine whether the treatment means differ given that $SSB = 500$.
- b. Repeat Part a with $SSB = 1,000$.
- c. Repeat Part a with $SSB = 1,500$.
- d. Describe what happens to the test statistic as SSB increases.

- 14.73** *Xr14-73* a. Assuming that the data shown here were generated from a randomized block experiment calculate $SS(\text{Total})$, SST , SSB , and SSE .
- b. Assuming that the data below were generated from a one-way (independent samples) experiment calculate $SS(\text{Total})$, SST , and SSE .
 - c. Why does $SS(\text{Total})$ remain the same for both experimental designs?
 - d. Why does SST remain the same for both experimental designs?
 - e. Why does $SSB + SSE$ in Part a equal SSE in Part b?

Treatment

1	2	3
7	12	8
10	8	9
12	16	13
9	13	6
12	10	11

- 14.74** a. Calculate $SS(\text{Total})$, SST , SSB , and SSE , assuming that the accompanying data were generated from a randomized block experiment.

- b. Calculate SS(Total), SST, and SSE, assuming that the data below were generated from a one-way (independent samples) experiment.
- c. Explain why SS(Total) remains the same for both experimental designs.
- d. Explain why SST remains the same for both experimental designs.
- e. Explain why SSB + SSE in Part a equals SSE in Part b.

Treatment			
1	2	3	4
6	5	4	4
8	5	5	6
7	6	5	6

Applications

- 14.75** *Xr14-75* As an experiment to understand measurement error, a statistics professor asks four students to measure the height of the professor, a male student, and a female student. The differences (in centimeters) between the correct dimension and the ones produced by the students are listed here. Can we infer that there are differences in the errors between the subjects being measured? (Use $\alpha = .05$.)

Student	Errors in Measuring Heights of		
	Professor	Male Student	Female Student
1	1.4	1.5	1.3
2	3.1	2.6	2.4
3	2.8	2.1	1.5
4	3.4	3.6	2.9

- 14.76** *Xr14-76* How well do diets work? In a preliminary study, 20 people who were more than 50 pounds overweight were recruited to compare four diets. The people were matched by age. The oldest four became block 1, the next oldest four became block 2, and so on. The number of pounds that each person lost is listed in the following table. Can we infer at the 1% significance level that there are differences between the four diets?

Block	Diet			
	1	2	3	4
1	5	2	6	8
2	4	7	8	10
3	6	12	9	2
4	7	11	16	7
5	9	8	15	14

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level, unless specified otherwise.

- 14.77** *Xr14-77* In recent years, lack of confidence in the Postal Service has led many companies to send all of their correspondence by private courier. A large company is in the process of selecting one of three possible couriers to act as its sole delivery method. To help in making the decision, an experiment was performed whereby letters were sent using each of the three couriers at 12 different times of the day to a delivery point across town. The number of minutes required for delivery was recorded.
- a. Can we conclude that there are differences in delivery times between the three couriers?
 - b. Did the statistics practitioner choose the correct design? Explain.

- 14.78** *Xr14-78* Refer to Exercise 14.14. Despite failing to show that differences in the three types of fertilizer exist, the scientist continued to believe that there were differences, and that the differences were masked by the variation between the plots of land. Accordingly, he conducted another experiment. In the second experiment he found 20 three-acre plots of land scattered across the county. He divided each into three plots and applied the three types of fertilizer on each of the one-acre plots. The crop yields were recorded.
- a. Can the scientist infer that there are differences between the three types of fertilizer?
 - b. What do these test results reveal about the variation between the plots?

- 14.79** *Xr14-79* A recruiter for a computer company would like to determine whether there are differences in sales ability between business, arts, and science graduates. She takes a random sample of 20 business graduates who have been working for the company for the past 2 years. Each is then matched with an arts graduate and a science graduate with similar educational and working experience. The commission earned by each (in \$1,000s) in the last year was recorded.
- a. Is there sufficient evidence to allow the recruiter to conclude that there are differences in sales ability between the holders of the three types of degrees?
 - b. Conduct a test to determine whether an independent samples design would have been a better choice.
 - c. What are the required conditions for the test in Part a?
 - d. Are the required conditions satisfied?

- 14.80** *Xr14-80* Exercise 14.10 described an experiment that involved comparing the completion times associated with four different income tax forms. Suppose the experiment is redone in the following way. Thirty people are asked to fill out all four forms. The completion times (in minutes) are recorded.

- a. Is there sufficient evidence at the 1% significance level to infer that differences in the completion times exist between the four forms?
- b. Comment on the suitability of this experimental design in this problem.
- 14.81** **Xr14-81** The advertising revenues commanded by a radio station depend on the number of listeners it has. The manager of a station that plays mostly hard rock music wants to learn more about its listeners—mostly teenagers and young adults. In particular, he wants to know whether the amount of time they spend listening to radio music varies by the day of the week. If the manager discovers that the mean time per day is about the same, he will schedule the most popular music evenly throughout the week. Otherwise, the top hits will be played mostly on the days that attract the greatest audience. An opinion survey company is hired, and it randomly selects 200 teenagers and asks them to record the amount of time spent listening to music on the radio for each day of the previous week. What can the manager conclude from these data?
- 14.82** **Xr14-82** Do medical specialists differ in the amount of time they devote to patient care? To answer this question a statistics practitioner organized a study. The numbers of hours of patient care per week were recorded for five specialists. The experimental design was randomized blocks. The physicians were blocked by age.
- Can we infer that there are differences in the amount of patient care between medical specialties?
 - Can we infer that blocking by age was appropriate?
- Source:* Adapted from the *Statistical Abstract of the United States*, 2000, Table 190.
- 14.83** **Xr14-83** Refer to Exercise 14.9. Another study was conducted in the following way. Students from each of the high schools who were admitted to the business program were matched according to their high school averages. The average grades in the first year were recorded. Can the university admissions officer conclude that there are differences in grading standards between the four high schools?



GENERAL SOCIAL SURVEY EXERCISES

Excel users should note that rows containing empty cells must be removed.

- 14.84** **GSS2012*** Is there sufficient evidence to conclude that there are differences in the years of education

between American adults and their fathers and mothers (EDUC, PAEDUC, MAEDUC)?

- 14.85** **GSS2010*** Repeat Exercise 14.84 for the 2010 General Social Survey.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users should note that rows with empty cells must be removed.

- 14.86** **ANES2008*** Is there sufficient evidence to infer that there are differences between the number of days Americans watch national news on television (DAYS1), watch local television news in the

afternoon or early evening (DAYS2), watch local television news in late evening (DAYS3), and read a daily newspaper (DAYS4)?

- 14.87** **ANES2004*** Repeat Exercise 14.66 for 2004.

14-5 / TWO-FACTOR ANALYSIS OF VARIANCE

In Section 14-1, we addressed problems where the data were generated from single-factor experiments. In Example 14.1, the treatments were the four age categories. Thus, there were four levels of a single factor. In this section, we address the problem where the experiment features two factors. The general term for such data-gathering procedures is **factorial experiment**. In factorial experiments, we can examine the effect on the response variable of two or more factors, although in this book we address the problem of only two factors. We can use the analysis of variance to determine whether the levels of each factor are different from one another.

We will present the technique for fixed effects only. That means we will address problems where all the levels of the factors are included in the experiment. As was the case with the randomized block design, calculating the test statistic in this type of experiment is quite time consuming. As a result, we will use Excel and Minitab to produce our statistics.

EXAMPLE 14.4*

DATA
Xm14-04

Comparing the Lifetime Number of Jobs by Educational Level

One measure of the health of a nation's economy is how quickly it creates jobs. One aspect of this issue is the number of jobs individuals hold. As part of a study on job tenure, a survey was conducted in which Americans aged between 37 and 45 were asked how many jobs they have held in their lifetimes. Also recorded were gender and educational attainment. The categories are

- Less than high school (E1)
- High school (E2)
- Some college/university but no degree (E3)
- At least one university degree (E4)

The data are shown for each of the eight categories of gender and education. Can we infer that differences exist between genders and educational levels?

Male E1	Male E2	Male E3	Male E4	Female E1	Female E2	Female E3	Female E4
10	12	15	8	7	7	5	7
9	11	8	9	13	12	13	9
12	9	7	5	14	6	12	3
16	14	7	11	6	15	3	7
14	12	7	13	11	10	13	9
17	16	9	8	14	13	11	6
13	10	14	7	13	9	15	10
9	10	15	11	11	15	5	15
11	5	11	10	14	12	9	4
15	11	13	8	12	13	8	11

SOLUTION:

IDENTIFY

We begin by treating this example as a one-way analysis of variance. Notice that there are eight treatments. However, the treatments are defined by two different factors. One factor is gender, which has two levels. The second factor is educational attainment, which has four levels.

We can proceed to solve this problem in the same way we did in Section 14-1: We test the following hypotheses.

$$H_0: \mu_1 = \mu_2 = \mu_3 = \mu_4 = \mu_5 = \mu_6 = \mu_7 = \mu_8$$

$$H_1: \text{At least two means differ}$$

*Adapted from the *Statistical Abstract of the United States, 2006*, Table 598.

COMPUTE

EXCEL

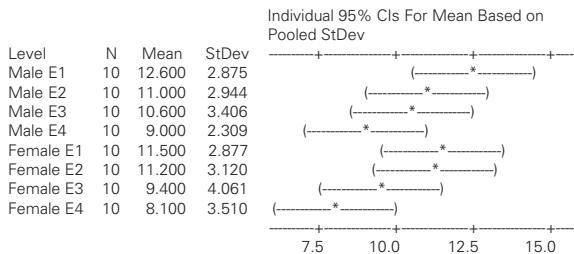
	A	B	C	D	E	F	G
1	Anova: Single Factor						
2							
3	SUMMARY						
4	Groups	Count	Sum	Average	Variance		
5	Male E1	10	126	12.60	8.27		
6	Male E2	10	110	11.00	8.67		
7	Male E3	10	106	10.60	11.60		
8	Male E4	10	90	9.00	5.33		
9	Female E1	10	115	11.50	8.28		
10	Female E2	10	112	11.20	9.73		
11	Female E3	10	94	9.40	16.49		
12	Female E4	10	81	8.10	12.32		
13							
14							
15	ANOVA						
16	Source of Variation	SS	df	MS	F	P-value	F crit
17	Between Groups	153.35	7	21.91	2.17	0.0467	2.1397
18	Within Groups	726.20	72	10.09			
19							
20	Total	879.55	79				

MINITAB

One-way ANOVA: Male E1, Male E2, Male E3, Male E4, Female E1, Female E2, ...

Source	DF	SS	MS	F	P
Factor	7	153.4	21.9	2.17	0.047
Error	72	726.2	10.1		
Total	79	879.5			

S = 3.176 R-Sq = 17.44% R-Sq(adj) = 9.41%



INTERPRET

The value of the test statistic is $F = 2.17$ with a p -value of .0467. We conclude that there are differences in the number of jobs between the eight treatments.

This statistical result raises more questions—namely, can we conclude that the differences in the mean number of jobs are caused by differences between males and females? Or are they caused by differences between educational levels? Or, perhaps, are there combinations, called **interactions**, of gender and education that result in especially high or low numbers? To show how we test for each type of difference, we need to develop some terminology.

A **complete factorial experiment** is an experiment in which the data for all possible combinations of the levels of the factors are gathered. That means that in Example 14.4 we measured the number of jobs for all eight combinations. This experiment is called a complete 2×4 factorial experiment.

In general, we will refer to one of the factors as factor A (arbitrarily chosen). The number of levels of this factor will be denoted by a . The other factor is called factor B, and its number of levels is denoted by b . This terminology becomes clearer when we present the data from Example 14.4 in another format. Table 14.6 depicts the layout for a *two-way classification*, which is another name for the complete factorial

TABLE 14.6 Two-Way Classification for Example 14.4

	MALE	FEMALE
Less than high school	10 9 12 16 14 17 13 9 11 15	7 13 14 6 11 14 13 11 14 12
High school	12 11 9 14 12 16 10 10 5 11	7 12 6 15 10 13 9 15 12 13
Less than bachelor's degree	15 8 7 7 9 14 15 11 13	5 13 12 3 13 11 15 9 8
At least one bachelor's degree	8 9 5 11 13 8 7 11 10	7 9 3 7 9 6 10 15 4
	8	11

experiment. The number of observations for each combination is called a **replicate**. The number of replicates is denoted by r . In this book, we address only problems in which the number of replicates is the same for each treatment. Such a design is called **balanced**.

Thus, we use a complete factorial experiment where the number of treatments is ab with r replicates per treatment. In Example 14.4, $a = 2$, $b = 4$, and $r = 10$. As a result, we have 10 observations for each of the eight treatments.

If you examine the ANOVA table, you can see that the total variation is $SS(\text{Total}) = 879.55$, the sum of squares for treatments is $SST = 153.35$, and the sum of squares for error is $SSE = 726.20$. The variation caused by the treatments is measured by SST . To determine whether the differences result from factor A, factor B, or some interaction between the two factors, we need to partition SST into three sources. These are $SS(A)$, $SS(B)$, and $SS(AB)$.

For those whose mathematical confidence is high, we have provided an explanation of the notation as well as the definitions of the sums of squares. Learning how the sums of squares are calculated is useful but hardly essential to your ability to conduct the tests. Uninterested readers should jump to the box on page 565 where we describe the individual F -tests.

14-4a How the Sums of Squares for Factors A and B and Interaction are Computed

To help you understand the formulas, we will use the following notation:

x_{ijk} = k th observation in the ij th treatment

$\bar{x}[\text{AB}]_{ij}$ = Mean of the response variable in the ij th treatment (mean of the treatment when the factor A level is i and the factor B level is j)

$\bar{x}[\text{A}]_i$ = Mean of the observations when the factor A level is i

$\bar{x}[\text{B}]_j$ = Mean of the observations when the factor B level is j

$\bar{\bar{x}}$ = Mean of all the observations

a = Number of factor A levels

b = Number of factor B levels

r = Number of replicates

In this notation, $\bar{x}[\text{AB}]_{11}$ is the mean of the responses for factor A level 1 and factor B level 1. The mean of the responses for factor A level 1 is $\bar{x}[\text{A}]_1$. The mean of the responses for factor B level 1 is $\bar{x}[\text{B}]_1$.

Table 14.7 describes the notation for the two-factor analysis of variance.

TABLE 14.7 Notation for Two-Factor Analysis of Variance

Factor B	Factor A				$\bar{x}[B]_1$
	1	2	...	a	
1	x_{111} x_{112} \vdots x_{11r}	$\bar{x}[AB]_{11}$	x_{211} x_{212} \vdots x_{21r}	$\bar{x}[AB]_{21}$	x_{a11} x_{a12} \vdots x_{a1r}
					$\bar{x}[AB]_{a1}$
					$\bar{x}[B]_1$
2	x_{121} x_{122} \vdots x_{12r}	$\bar{x}[AB]_{12}$	x_{221} x_{222} \vdots x_{22r}	$\bar{x}[AB]_{22}$	x_{a21} x_{a22} \vdots x_{a2r}
					$\bar{x}[AB]_{a2}$
					$\bar{x}[B]_2$
b	x_{1b1} x_{1b2} \vdots x_{1br}	$\bar{x}[AB]_{1b}$	x_{2b1} x_{2b2} \vdots x_{2br}	$\bar{x}[AB]_{2b}$	x_{ab1} x_{ab2} \vdots x_{abr}
					$\bar{x}[AB]_{ab}$
					$\bar{x}[B]_b$
	$\bar{x}[A]_1$		$\bar{x}[A]_2$		$\bar{x}[A]_a$
					\bar{x}

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The sums of squares are defined as follows.

Sums of Squares in the Two-Factor Analysis of Variance

$$SS(\text{Total}) = \sum_{i=1}^a \sum_{j=1}^b \sum_{k=1}^r (x_{ijk} - \bar{x})^2$$

$$SS(A) = rb \sum_{i=1}^a (\bar{x}[A]_i - \bar{\bar{x}})^2$$

$$SS(B) = ra \sum_{i=1}^b (\bar{x}[B]_j - \bar{\bar{x}})^2$$

$$SS(AB) = r \sum_{i=1}^a \sum_{j=1}^b (\bar{x}[AB]_{ij} - \bar{x}[A]_i - \bar{x}[B]_j + \bar{\bar{x}})^2$$

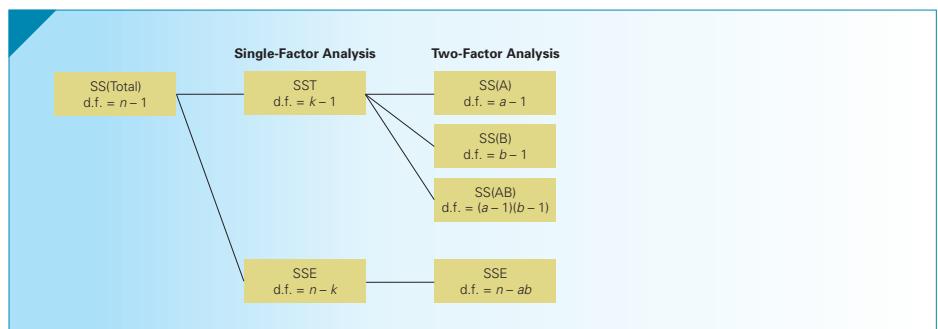
$$SSE = \sum_{i=1}^a \sum_{j=1}^b \sum_{k=1}^r (x_{ijk} - \bar{x}[AB]_{ij})^2$$

To compute $SS(A)$, we calculate the sum of the squared differences between the factor A level means, which are denoted $\bar{x}[A]_i$, and the grand mean, $\bar{\bar{x}}$. The sum of squares for factor B, $SS(B)$, is defined similarly. The interaction sum of squares, $SS(AB)$, is calculated by taking each treatment mean (a treatment consists of a combination of a level of factor A and a level of factor B), subtracting the factor A level mean, subtracting the factor B level mean, adding the grand mean, squaring this quantity, and adding.

The sum of squares for error, SSE, is calculated by subtracting the treatment means from the observations, squaring, and adding.

To test for each possibility, we conduct several F -tests similar to the one performed in Section 14.1. Figure 14.4 illustrates the partitioning of the total sum of squares that leads to the F -tests. We've included in this figure the partitioning used in the one-way study. When the one-way analysis of variance allows us to infer that differences between the treatment means exist, we continue our analysis by partitioning the treatment sum of squares into three sources of variation. The first is sum of squares for factor A, which we label SS(A), which measures the variation between the levels of factor A. Its degrees of freedom are $a - 1$. The second is the sum of squares for factor B, whose degrees of freedom are $b - 1$. SS(B) is the variation between the levels of factor B. The interaction sum of squares is labeled SS(AB), which is a measure of the amount of variation between the combinations of factors A and B; its degrees of freedom are $(a - 1) \times (b - 1)$. The sum of squares for error is SSE, and its degrees of freedom are $n - ab$. (Recall that n is the total sample size, which in this experiment is $n = abr$.) Notice that SSE and its number of degrees of freedom are identical in both partitions. As in the previous experiment, SSE is the variation within the treatments.

FIGURE 14.4 Partitioning SS(Total) in Single-Factor and Two-Factor Analysis of Variance



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***F*-Tests Conducted in Two-Factor Analysis of Variance**

Test for Differences between the Levels of Factor A

H_0 : The means of the a levels of factor A are equal

H_1 : At least two means differ

$$\text{Test statistic: } F = \frac{\text{MS}(A)}{\text{MSE}}$$

Test for Differences between the Levels of Factor B

H_0 : The means of the b levels of factor B are equal

H_1 : At least two means differ

$$\text{Test statistic: } F = \frac{\text{MS}(B)}{\text{MSE}}$$

Test for Interaction between Factors A and B

H_0 : Factors A and B do not interact to affect the mean responses

H_1 : Factors A and B do interact to affect the mean responses

$$\text{Test statistic: } F = \frac{\text{MS}(AB)}{\text{MSE}}$$

Required Conditions

1. The distribution of the response is normally distributed.
2. The variance for each treatment is identical.
3. The samples are independent.

As in the two previous experimental designs of the analysis of variance, we summarize the results in an ANOVA table. Table 14.8 depicts the general form of the table for the complete factorial experiment.

TABLE 14.8 ANOVA Table for the Two-Factor Experiment

SOURCE OF VARIATION	DEGREES OF FREEDOM	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Factor A	$a - 1$	SS(A)	$MS(A) = SS(A) / (a - 1)$	$F = MS(A)/MSE$
Factor B	$b - 1$	SS(B)	$MS(B) = SS(B) / (b - 1)$	$F = MS(B)/MSE$
Interaction	$(a - 1)(b - 1)$	SS(AB)	$MS(AB) = SS(AB) / [(a - 1)(b - 1)]$	$F = MS(AB)/MSE$
Error	$n - ab$	SSE	$MSE = SSE / (n - ab)$	
Total	$n - 1$	SS(Total)		

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We'll illustrate the techniques using the data in Example 14.4. All calculations will be performed by Excel and Minitab.

EXCEL

	A	B	C	D	E	F	G
1	Anova: Two-Factor with Replication						
2							
3	SUMMARY	Male	Female	Total			
4	<i>Less than HS</i>						
5	Count	10	10	20			
6	Sum	126	115	241			
7	Average	12.6	11.5	12.1			
8	Variance	8.27	8.28	8.16			
9							
10	<i>High School</i>						
11	Count	10	10	20			
12	Sum	110	112	222			
13	Average	11.0	11.2	11.1			
14	Variance	8.67	9.73	8.73			
15							
16	<i>Less than Bachelor's</i>						
17	Count	10	10	20			
18	Sum	106	94	200			
19	Average	10.6	9.4	10.0			
20	Variance	11.6	16.49	13.68			
21							
22	<i>Bachelor's or more</i>						
23	Count	10	10	20			
24	Sum	90	81	171			
25	Average	9.0	8.1	8.6			
26	Variance	5.33	12.32	8.58			
27							
28	<i>Total</i>						
29	Count	40	40				
30	Sum	432	402				
31	Average	10.8	10.1				
32	Variance	9.50	12.77				
33							
34	ANOVA						
35	Source of Variation	SS	df	MS	F	P-value	F crit
36	Sample	135.85	3	45.28	4.49	0.0060	2.7318
37	Columns	11.25	1	11.25	1.12	0.2944	3.9739
38	Interaction	6.25	3	2.08	0.21	0.8915	2.7318
39	Within	726.20	72	10.09			
40							
41	Total	879.55	79				

In the ANOVA table, **Sample** refers to factor B (educational level) and **Columns** refers to factor A (gender). Thus, $MS(B) = 45.28$, $MS(A) = 11.25$, $MS(AB) = 2.08$, and $MSE = 10.09$. The F -statistics are 4.49 (educational level), 1.12 (gender), and .21 (interaction).

INSTRUCTIONS

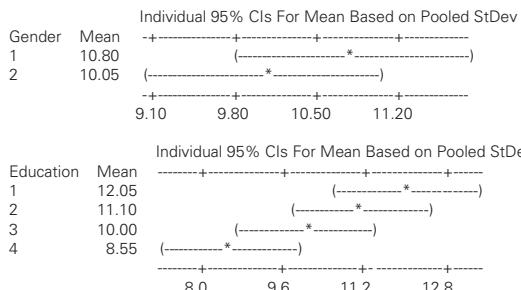
1. Type or import the data using the same format as Xm14-04a. (*Note:* You must label the rows and columns as we did.)
2. Click **Data**, **Data Analysis**, and **Anova: Two-Factor with Replication**.
3. Specify the **Input Range** (A1:C41). Type the number of replications in the **Rows per sample** box (10).
4. Specify a value for α (.05).

MINITAB

Two-way ANOVA: Jobs versus Gender, Education

Source	DF	SS	MS	F	P
Gender	1	11.25	11.2500	1.12	0.294
Education	3	135.85	45.2833	4.49	0.006
Interaction	3	6.25	2.0833	0.21	0.892
Error	72	726.20	10.0861		
Total	79	879.55			

S = 3.176 R-Sq = 17.44% R-Sq(adj) = 9.41%



INSTRUCTIONS

1. Type or import the data in stacked format in three columns. One column contains the responses, another contains codes for the levels of factor A, and a third column contains codes for the levels of factor B. ([Open Xm14-04b](#).)
2. Click **Stat**, **ANOVA**, and **TwoWay**
3. Specify the **Responses** (Jobs), **Row factor** (Gender), and **Column factor** (Education).
4. To produce the graphics check **Display means**.

14-5b Test for Differences in Number of Jobs between Men and Women

H_0 : The means of the two levels of factor A are equal

H_1 : At least two means differ

$$\text{Test statistic: } F = \frac{MS(A)}{MSE}$$

Value of the test statistic: From the computer output, we have

$$MS(A) = 11.25, MSE = 10.09, \text{ and } F = 11.25/10.09 = 1.12 \text{ (} p\text{-value} = .2944 \text{)}$$

There is no evidence at the 5% significance level to infer that differences in the number of jobs exist between men and women.

14-5c Test for Differences in Number of Jobs between Education Levels

H_0 : The means of the four levels of factor B are equal

H_1 : At least two means differ

$$\text{Test statistic: } F = \frac{MS(B)}{MSE}$$

Value of the test statistic: From the computer output, we find

$$MS(B) = 45.28 \text{ and } MSE = 10.09. \text{ Thus, } F = 45.28/10.09 = 4.49 \text{ (} p\text{-value} = .0060 \text{).}$$

There is sufficient evidence at the 5% significance level to infer that differences in the number of jobs exist between educational levels.

14-5d Test for Interaction between Factors A and B

H_0 : Factors A and B do not interact to affect the mean number of jobs

H_1 : Factors A and B do interact to affect the mean number of jobs

$$\text{Test statistic: } F = \frac{MS(AB)}{MSE}$$

Value of the test statistic: From the printouts,

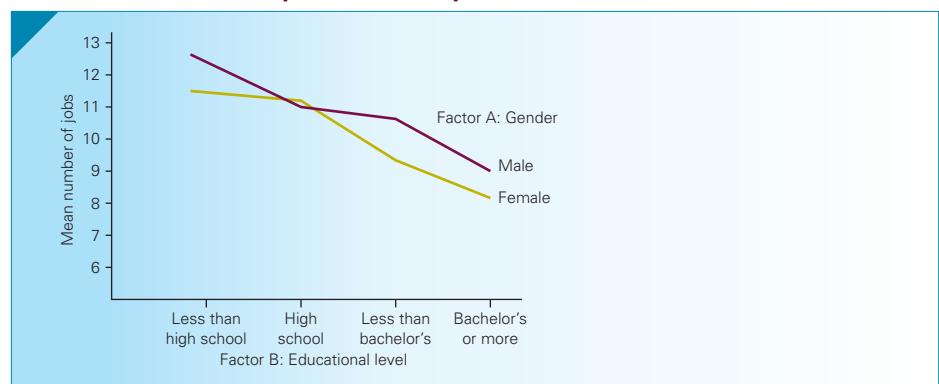
$$MS(AB) = 2.08, MSE = 10.09, \text{ and } F = 2.08/10.09 = .21 \text{ (} p\text{-value} = .8915 \text{).}$$

There is not enough evidence to conclude that there is an interaction between gender and education.

INTERPRET

Figure 14.5 is a graph of the mean responses for each of the eight treatments. As you can see, there are small (not significant) differences between males and females. There are significant differences between men and women with different educational backgrounds. Finally, there is no interaction.

FIGURE 14.5 Mean Responses for Example 14.4



14-5e What Is Interaction?

To more fully understand interaction we have changed the sample associated with men who have not finished high school (Treatment 1). We subtracted 6 from the original numbers so that the sample in treatment 1 is

4, 3, 6, 10, 8, 11, 7, 3, 5, 9

The new data are stored in Xm14-04c (Excel format) and Xm14-04d (Minitab format). The mean is 6.6. Here are the Excel and Minitab ANOVA tables.

EXCEL

	A	B	C	D	E	F	G
35	ANOVA						
36	Source of Variation	SS	df	MS	F	P-value	F crit
37	Sample	75.85	3	25.28	2.51	0.0657	2.7318
38	Columns	11.25	1	11.25	1.12	0.2944	3.9739
39	Interaction	120.25	3	40.08	3.97	0.0112	2.7318
40	Within	726.20	72	10.09			
41							
42	Total	933.55	79				

MINITAB

Two-way ANOVA: Jobs versus Gender, Education

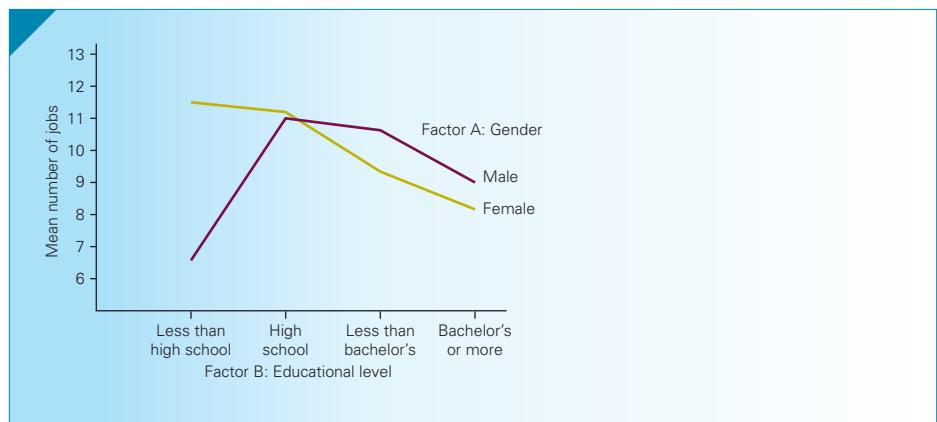
Source	DF	SS	MS	F	P
Gender	1	11.25	11.2500	1.12	0.294
Education	3	75.85	25.2833	2.51	0.066
Interaction	3	120.25	40.0833	3.97	0.011
Error	72	726.20	10.0861		
Total	79	933.55			

INTERPRET

In this example there is not enough evidence (at the 5% significance level) to infer that there are differences between men and women and between the educational levels. However, there is sufficient evidence to conclude that there is interaction between gender and education.

	Male	Female
Less than high school	6.6	11.5
High school	11.0	11.2
Less than bachelor's	10.6	9.4
Bachelor's or more	9.0	8.1

Compare Figures 14.5 and 14.6. In Figure 14.5, the lines joining the response means for males and females are quite similar. In particular we see that the lines are almost parallel. However, in Figure 14.6 the lines are no longer almost parallel. It is apparent that the

FIGURE 14.6 Mean Responses for Example 14.4a

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mean of treatment 1 is smaller; the pattern is different. For whatever reason, in this case men with less than high school have a smaller number of jobs.

14-5f Conducting the Analysis of Variance for the Complete Factorial Experiment

In addressing the problem outlined in Example 14.4, we began by conducting a one-way analysis of variance to determine whether differences existed between the eight treatment means. This was done primarily for pedagogical reasons to enable you to see that when the treatment means differ, we need to analyze the reasons for the differences. However, in practice, we generally do not conduct this test in the complete factorial experiment (although it should be noted that some statistics practitioners prefer this “two-stage” strategy). We recommend that you proceed directly to the two-factor analysis of variance.

In the two versions of Example 14.4, we conducted the tests of each factor and then the test for interaction.

However, if there is evidence of interaction, the tests of the factors are irrelevant. There may or may not be differences between the levels of factor A and the levels of factor B. Accordingly, we change the order of conducting the F -tests.

Order of Testing in the Two-Factor Analysis of Variance

Test for interaction first. If there is enough evidence to infer that there is interaction, do not conduct the other tests.

If there is not enough evidence to conclude that there is interaction, proceed to conduct the F -tests for factors A and B.

14-5g Developing an Understanding of Statistical Concepts

You may have noticed that there are similarities between the two-factor experiment and the randomized block experiment. In fact, when the number of replicates is one, the calculations are identical. (Minitab uses the same command.) This raises the question,

What is the difference between a factor in a multifactor study and a block in a randomized block experiment? In general, the difference between the two experimental designs is that in the randomized block experiment, blocking is performed specifically to reduce variation, whereas in the two-factor model the effect of the factors on the response variable is of interest to the statistics practitioner. The criteria that define the blocks are always characteristics of the experimental units. Consequently, factors that are characteristics of the experimental units will be treated not as factors in a multifactor study, but as blocks in a randomized block experiment.

Let's review how we recognize the need to use the procedure described in this section.

Factors That Identify the Independent Samples Two-Factor Analysis of Variance

1. **Problem objective:** Compare two or more populations (populations are defined as the combinations of the levels of two factors)
2. **Data type:** Interval
3. **Experimental design:** Independent samples



EXERCISES

- 14.88** A two-factor analysis of variance experiment was performed with $a = 3$, $b = 4$, and $r = 20$. The following sums of squares were computed:

$$SS(\text{Total}) = 42,450 \quad SS(A) = 1,560$$

$$SS(B) = 2,880 \quad SS(AB) = 7,605$$

Conduct whatever test you deem necessary at the 1% significance level to determine whether there are differences between the levels of factor A, the levels of factor B, or interaction between factors A and B.

- 14.89** A statistics practitioner conducted a two-factor analysis of variance experiment with $a = 4$, $b = 3$, and $r = 8$. The sums of squares are listed here:

$$SS(\text{Total}) = 9420 \quad SS(A) = 203 \quad SS(B) = 859$$

$$SS(AB) = 513$$

- a. Test at the 5% significance level to determine whether factors A and B interact.
- b. Test at the 5% significance level to determine whether differences exist between the levels of factor A.
- c. Test at the 5% significance level to determine whether differences exist between the levels of factor B.

- 14.90** **Xr14-90** The following data were generated from a 2×2 factorial experiment with 3 replicates:

Factor A	Factor B	
	1	2
1	6	12
	9	10
	7	11
2	9	15
	10	14
	5	10

- a. Test at the 5% significance level to determine whether factors A and B interact.
- b. Test at the 5% significance level to determine whether differences exist between the levels of factor A.
- c. Test at the 5% significance level to determine whether differences exist between the levels of factor B.

- 14.91** **Xr14-91** The data shown here were taken from a 2×3 factorial experiment with 4 replicates:

Factor A	Factor B	
	1	2
1	23	20
	18	17
	17	16
	20	19

Factor A	Factor B	
	1	2
2	27	29
	23	23
	20	27
	28	25
3	23	27
	21	19
	24	20
	16	22

- a. Test at the 5% significance level to determine whether factors A and B interact.
- b. Test at the 5% significance level to determine whether differences exist between the levels of factor A.
- c. Test at the 5% significance level to determine whether differences exist between the levels of factor B.

14.92 *Xr14-92* Refer to Example 14.4. We've revised the data by adding 2 to each of the numbers of the men. What do these data tell you?

14.93 *Xr14-93* Refer to Example 14.4. We've altered the data by subtracting 4 from the numbers of treatment 8. What do these data tell you?

Applications

The following exercises require the use of a computer and software.

14.94 *Xr14-94* Refer to Exercise 14.10. Suppose that the experiment is redone in the following way. Thirty taxpayers fill out each of the four forms. However, 10 taxpayers in each group are in the lowest income bracket, 10 are in the next income bracket, and the remaining 10 are in the highest bracket. The amount of time needed to complete the returns is recorded.

Column 1: Group number

Column 2: Times to complete form 1 (first 10 rows = low income, next 10 rows = next income bracket, and last 10 rows = highest bracket)

Column 3: Times to complete form 2 (same format as column 2)

Column 4: Times to complete form 3 (same format as column 2)

Column 5: Times to complete form 4 (same format as column 2)

- a. How many treatments are there in this experiment?
- b. How many factors are there? What are they?
- c. What are the levels of each factor?
- d. Is there evidence at the 5% significance level of interaction between the two factors?
- e. Can we conclude at the 5% significance level that differences exist between the four forms?
- f. Can we conclude at the 5% significance level that taxpayers in different brackets require different amounts of time to complete their tax forms?

14.95 *Xr14-95* Detergent manufacturers frequently make claims about the effectiveness of their products. A consumer-protection service decided to test the five best selling brands of detergent, where each manufacturer claims that its product produces the "whitest whites" in all water temperatures. The experiment was conducted in the following way. One hundred fifty white sheets were equally soiled. Thirty sheets were washed in each brand—10 with cold water, 10 with warm water, and 10 with hot water. After washing, the "whiteness" scores for each sheet were measured with laser equipment.

Column 1: Water temperature code

Column 2: Scores for detergent 1 (first 10 rows = cold water, middle 10 rows = warm, and last 10 rows = hot)

Column 2: Scores for detergent 2 (same format as column 2)

Column 3: Scores for detergent 3 (same format as column 2)

Column 4: Scores for detergent 4 (same format as column 2)

Column 5: Scores for detergent 5 (same format as column 2)

- a. What are the factors in this experiment?
- b. What is the response variable?
- c. Identify the levels of each factor.
- d. Perform a statistic analysis using a 5% significance level to determine whether there is sufficient statistical evidence to infer that there are differences in whiteness scores between the five detergents, differences in whiteness scores between the three water temperatures, or interaction between detergents and temperatures.

14.96 *Xr14-96* Headaches are one of the most common, but least understood, ailments. Most people get headaches several times per month; over-the-counter medication is usually sufficient to eliminate their pain. However, for a significant proportion of people, headaches are debilitating and make their lives almost unbearable. Many such people have investigated a wide spectrum of possible treatments, including narcotic drugs, hypnosis, biofeedback, and acupuncture, with little or no success. In the last few years, a promising new treatment has been developed. Simply described, the treatment involves a series of injections of a local anesthetic to the occipital nerve (located in the back of the neck). The current treatment procedure is to schedule the injections once a week for 4 weeks. However, it has been suggested that another procedure may be better—one that features one injection every other day for a total of four injections. Additionally, some physicians recommend other combinations of drugs that may increase the effectiveness of the injections. To analyze the problem, an experiment was organized. It was decided to test

for a difference between the two schedules of injection and to determine whether there are differences between four drug mixtures. Because of the possibility of an interaction between the schedule and the drug, a complete factorial experiment was chosen. Five headache patients were randomly selected for each combination of schedule and drug. Forty patients were treated and each was asked to report the frequency, duration, and severity of his or her headache prior to treatment and for the 30 days following the last injection. An index ranging from 0 to 100 was constructed for each patient, where 0 indicates no headache pain and 100 specifies the worst headache pain. The improvement in the headache index for each patient was recorded and reproduced in the accompanying table. (A negative value indicates a worsening condition.) (The author is grateful to Dr. Lorne Greenspan for his help in writing this example.)

- What are the factors in this experiment?
- What is the response variable?
- Identify the levels of each factor.
- Analyze the data and conduct whichever tests you deem necessary at the 5% significance level to determine whether there is sufficient statistical evidence to infer that there are differences in the improvement in the headache index between the two schedules, differences in the improvement in the headache index between the four drug mixtures, or interaction between schedules and drug mixtures.

Improvement in Headache Index

Schedule	Drug Mixture			
	1	2	3	4
One Injection	17	24	14	10
Every Week	6	15	9	-1
(Four Weeks)	10	10	12	0
	12	16	0	3
	14	14	6	-1
One Injection	18	-2	20	-2
Every Two Days	9	0	16	7
(Four Days)	17	17	12	10
	21	2	17	6
	15	6	18	7

- 14.97 Xr14-97** Most college instructors prefer to have their students participate actively in class. Ideally, students will ask their professor questions and answer their professor's questions, making the classroom experience more interesting and useful. Many professors seek ways to encourage their students to participate in class. A statistics professor at a community college in upper New York state believes that there are a number of external factors that affect student participation. He believes that the time of day and the configuration of seats are two such factors. Consequently, he organized the following experiment. Six classes of about 60 students each were scheduled for one semester. Two classes were scheduled at 9:00 A.M., two at 1:00 P.M., and two at 4:00 P.M. At each of the three times, one of the classes was assigned to a room where the seats were arranged in rows of 10 seats. The other class was a U-shaped, tiered room, where students not only face the instructor, but face their fellow students as well. In each of the six classrooms, over five days, student participation was measured by counting the number of times students asked and answered questions. These data are displayed in the accompanying table.

- How many factors are there in this experiment? What are they?
- What is the response variable?
- Identify the levels of each factor.
- What conclusions can the professor draw from these data?

Class Configuration	Time		
	9:00 A.M.	1:00 P.M.	4:00 P.M.
Rows	10	9	7
	7	12	12
	9	12	9
	6	14	20
	8	8	7
U-Shape	15	4	7
	18	4	4
	11	7	9
	13	4	8
	13	6	7

14-6 / (OPTIONAL) APPLICATIONS IN OPERATIONS MANAGEMENT: FINDING AND REDUCING VARIATION

In the introduction to Example 12.3, we pointed out that variation in the size, weight, or volume of a product's components causes the product to fail or not function properly. Unfortunately, it is impossible to eliminate all variation. Designers of products and the processes that make the products understand this phenomenon. Consequently, when they specify the length, weight, or some other measurable characteristic of the product,

they allow for some variation, which is called the *tolerance*. For example, the diameters of the piston rings of a car are supposed to be .826 millimeter (mm) with a tolerance of .006 mm; that is, the product will function provided that the diameter is between $.826 - .006 = .820$ and $.826 + .006 = .832$ mm. These quantities are called the *lower* and *upper specification limits* (LSL and USL), respectively.

Suppose that the diameter of the piston rings is actually a random variable that is normally distributed with a mean of .826 and a standard deviation of .003 mm. We can compute the probability that a piston ring's diameter is between the specification limits. Thus,

$$\begin{aligned} P(.820 < X < .832) &= P\left(\frac{.820 - .826}{.003} < \frac{X - \mu}{\sigma} < \frac{.832 - .826}{.003}\right) \\ &= P(-2.0 < Z < 2.0) \\ &= .9772 - .0228 \\ &= .9544 \end{aligned}$$

The probability that the diameter does not meet specifications is $1 - .9544 = .0456$. This probability is a measure of the process capability.

If we can decrease the standard deviation, a greater proportion of piston rings will have diameters that meet specification. Suppose that the operations manager has decreased the diameter's standard deviation to .002. The proportion of piston rings that do not meet specifications is .0026. When the probabilities are quite low, we express the probabilities as the number of defective units per million or per billion. Thus, if the standard deviation is .002, the number of defective piston rings is expected to be 2,600 per million. The goal of many firms is to reduce the standard deviation so that the lower specification and upper specification limits are at least 6 standard deviations away from the mean. If the standard deviation is .001, the proportion of nonconforming piston rings is $1 - P(-6 < Z < 6)$, which is 2 per billion. (Incidentally, this figure is often erroneously quoted as 3.4 per million.) The goal is called *six sigma*. Figure 14.7 depicts the proportion of conforming and nonconforming piston rings for $\sigma = .003$, .002, and .001.

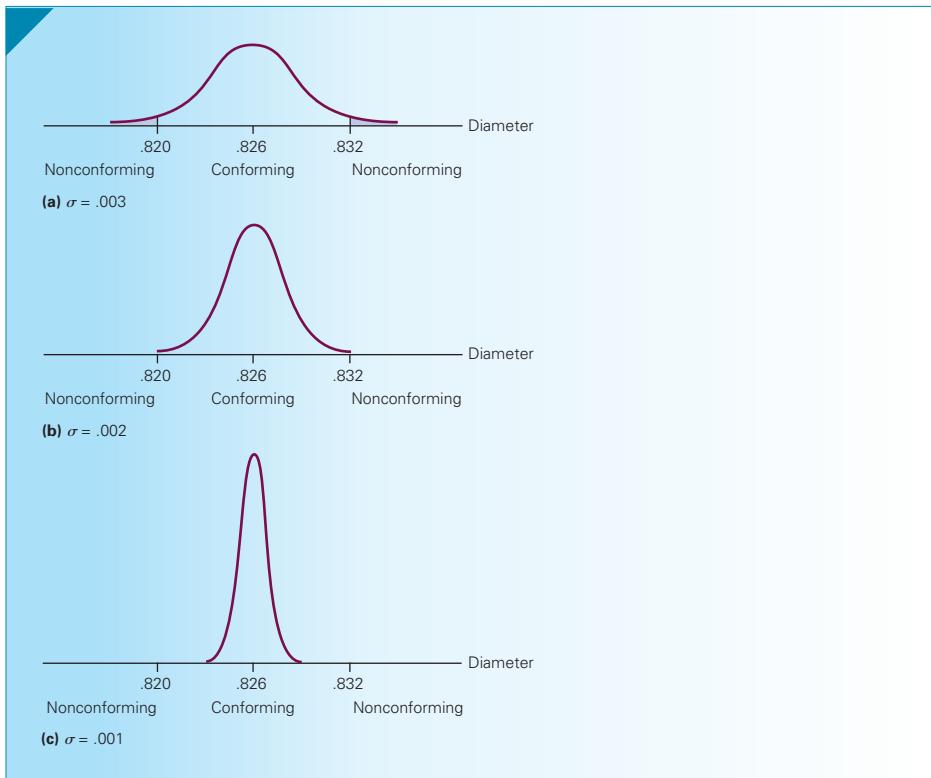
Another way to measure how well the process works is the process capability index, denoted by C_p , which is defined as

$$C_p = \frac{\text{USL} - \text{LSL}}{6\sigma}$$

Thus, in the illustration $\text{USL} = .832$ and $\text{LSL} = .820$. If the standard deviation is .002 then

$$C_p = \frac{\text{USL} - \text{LSL}}{6\sigma} = \frac{.832 - .820}{6(.002)} = 1.0$$

The larger the process capability index, the more capable is the process in meeting specifications. A value of 1.0 describes a production process where the specification limits are equal to 3 standard deviations above and below the mean. A process capability index of 2.0 means that the upper and lower limits are 6 standard deviations above and below the mean. This is the goal for many firms.

FIGURE 14.7 Proportion of Conforming and Nonconforming Piston Rings

In practice, the standard deviation must be estimated from the data. We will address this issue again in Chapter 21.

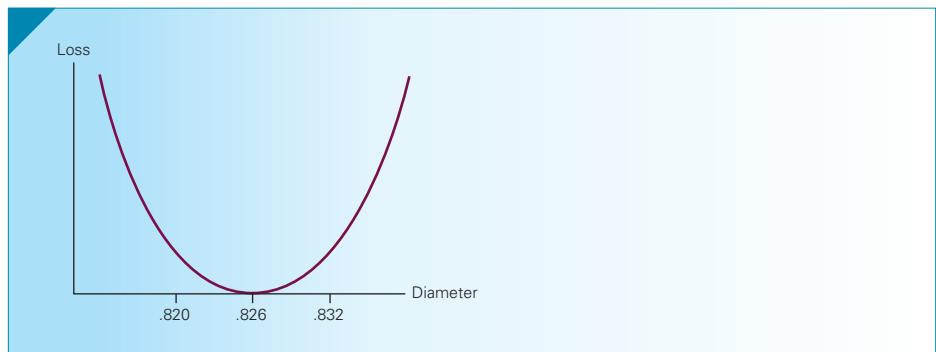
14-6a Taguchi Loss Function

Historically, operations managers applied the “goalpost” philosophy, a name derived from the game of football. If the ball is kicked *anywhere* between the goalposts, the kick is equally as successful as one that is in the center of the goalposts. Under this philosophy, a piston ring that has a diameter of .821 works as well as one that is exactly .826. In other words, the company sustains a loss only when the product falls outside the goalposts. Products that lie between the goalposts suffer no financial loss. For many firms, this philosophy has now been replaced by the Taguchi loss function (named for Genichi Taguchi, a Japanese statistician whose ideas and techniques permeate any discussion of statistical applications in quality management).

Products whose length or weight fall within the tolerances of their specifications do not all function in exactly the same way. There is a difference between a product that barely falls between the goalposts and one that is in the exact center. The Taguchi loss function recognizes that any deviation from the target value results in a financial loss. In addition, the farther the product’s variable is from the target value, the greater the loss. The piston ring described previously is specified to have a diameter of exactly .826 mm, an amount specified by the manufacturer to work at the optimum level. Any

deviation will cause that part and perhaps other parts to wear out prematurely. Although customers will not know the reason for the problem, they will know that the unit had to be replaced. The greater the deviation, the more quickly the part will wear and need replacing. If the part is under warranty, the company will incur a loss in replacing it. If the warranty has expired, customers will have to pay to replace the unit, causing some degree of displeasure that may result in them buying another company's product in the future. In either case, the company loses money. Figure 14.8 depicts the loss function. As you can see, any deviation from the target value results in some loss, with large deviations resulting in larger losses.

FIGURE 14.8 Taguchi Loss Function

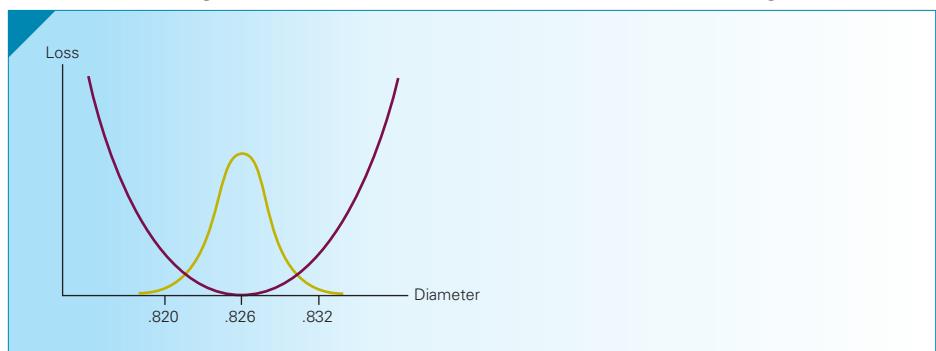


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Management scientists have shown that the loss function can be expressed as a function of the production process mean and variance. In Figure 14.9 we describe a normal distribution of the diameter of the machined part with a target value of .826 mm. When the mean of the distribution is .826, any loss is caused by the variance. The statistical techniques introduced in Chapter 21 are usually employed to center the distribution on the target value. However, reducing the variance is considerably more difficult. To reduce variation, it is necessary to first find the sources of variation. We do so by conducting experiments. The principles are quite straightforward, drawing on the concepts developed in the previous section.

An important function of operations management is production design in which decisions are made about how a product is manufactured. The objective is to produce the highest quality product at a reasonable cost. This objective is achieved by choosing the machines, materials, methods, and “manpower” (personnel), the so-called 4 Ms. By altering some or all of these elements, the operations manager can alter the size, weight, or volume and, ultimately, the quality of the product.

FIGURE 14.9 Taguchi Loss Function and the Distribution of Piston Rings



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EXAMPLE 14.5

DATA
Xm14-05

Causes of Variation

A critical component in an aircraft engine is a steel rod that must be 41.387 cm long. The operations manager has noted that there has been some variation in the lengths. In some cases, the steel rods had to be discarded or reworked because they were either too short or too long. The operations manager believes that some of the variation is caused by the way the production process has been designed. Specifically, he believes that the rods vary from machine to machine and from operator to operator. To help unravel the truth, he organizes an experiment. Each of the three operators produces five rods on each of the four machines. The lengths are measured and recorded. Determine whether the machines or the operators (or both) are indeed sources of variation.

SOLUTION:**IDENTIFY**

The response variable is the length of the rods. The two factors are the operators and the machines. There are three levels of operators and four levels of machines. The model we employ is the two-factor model with interaction. The computer output is shown here.

COMPUTE**EXCEL**

	A	B	C	D	E	F	G
1	Anova: Two-Factor with Replication						
2							
3	ANOVA						
4	Source of Variation	SS	df	MS	F	P-value	F crit
5	Sample	0.0151	2	0.0076	6.98	0.0022	3.1907
6	Columns	0.0034	3	0.0011	1.04	0.3856	2.7981
7	Interaction	0.0046	6	0.0008	0.71	0.6394	2.2946
8	Within	0.0520	48	0.0011			
9							
10	Total	0.0751	59				

MINITAB

Xm14-00a stores the data in Minitab format.

Two-way Analysis of Variance

Analysis of Variance for Rods

Source	DF	SS	MS	F	P
Machines	3	3363	1121	1.04	0.386
Operator	2	15133	7566	6.98	0.002
Interaction	6	4646	774	0.71	0.639
Error	48	51995	1083		
Total	59	75137			

INTERPRET

The test for interaction yields $F = .71$ and a p -value of .6394. There is not enough evidence to infer that the two factors interact. The F -statistic for the operator factor (Sample) is 6.98 (p -value = .0022). The F -statistic for the machine factor (Columns) is 1.04 (p -value = .3856). We conclude that there are differences only between the levels of the operators. Thus, the only source of variation here is the different operators. The operations manager can now focus on reducing or eliminating this variation. For example, the manager may use only one operator in the future or investigate why the operators differ.

The causes of variation example that opened this chapter illustrate this strategy. Because we have limited our discussion to the two-factor model, the example features this experimental design. It should be understood, however, that more complicated models are needed to fully investigate sources of variation.

14-6b Design of Experiments and Taguchi Methods

In the example just discussed, the experiment used only two factors. In practice, there are frequently many more factors. The problem is that the total number of treatments or combinations can be quite high, making any experimentation both time consuming and expensive. For example, if there are 10 factors each with 2 levels, the number of treatments is $2^{10} = 1,024$. If we measure each treatment with 10 replicates, the number of observations, 10,240, makes this experiment prohibitive. Fortunately, it is possible to reduce this number considerably. Through the use of *orthogonal arrays*, we can conduct *fractional factorial experiments* that can produce useful results at a small fraction of the cost. The experimental designs and statistical analyses are beyond the level of this book. Interested readers can find a variety of books at different levels of mathematical and statistical sophistication to learn more about this application.



EXERCISES

Applications

The following exercises require the use of a computer and software. Use a 5% significance level.

- 14.98** **Xr14-98** The headrests on a car's front seats are designed to protect the driver and front-seat passenger from whiplash when the car is hit from behind. The frame of the headrest is made from metal rods. A machine is used to bend the rod into a U-shape exactly 440 millimeters wide. The width is critical; too wide or too narrow and it won't fit into the holes drilled into the car seat frame. The company has experimented with several different metal alloys in the hope of finding a material that will result in more headrest frames that fit. Another possible source of variation is the machines used. To learn more about the process the operations

manager conducts an experiment. Both of the machines are used to produce 10 headrests from each of the five metal alloys now being used. Each frame is measured and the data (in millimeters) are recorded using the format shown here. Analyze the data to determine whether the alloys, machines, or both are sources of variation.

Column 1: Machine 1, rows 1 to 10 alloy A, rows 11 to 20, alloy B
 Column 2: Machine 2, rows 1 to 10 alloy A, rows 11 to 20, alloy B

- 14.99** **Xr14-99** A paint manufacturer is attempting to improve the process that fills the 1-gallon containers. The foreperson has suggested that the nozzle can be made from several different alloys. Furthermore, the way that the process "knows" when to stop the

flow of paint can be accomplished in two ways: by setting a predetermined amount or by measuring the amount of paint already in the can. To determine what factors lead to variation, an experiment is conducted. For each of the four alloys that could be used to make the nozzles and the two measuring devices, five cans are filled. The amount of paint in each container is precisely measured. The data in liters were recorded in the following way:

Column 1: Device 1, rows 1 to 5 alloy A, rows 6 to 10 alloy B, etc.

Column 2: Device 2, rows 1 to 5 alloy A, rows 6 to 10 alloy B, etc.

Can we infer that the alloys, the measuring devices, or both are sources of variation?

- 14.100 *Xr14-100*** The marketing department of a firm that manufactures office furniture has ascertained that there is a growing market for a specialized desk

that houses the various parts of a computer system. The operations manager is summoned to put together a plan that will produce high-quality desks at low cost. The characteristics of the desk have been dictated by the marketing department, which has specified the material that the desk will be made from and the machines used to produce the parts. However, there are three methods that can be utilized. Moreover, because of the complexity of the operation, the manager realizes that it is possible that different skill levels of the workers can yield different results. Accordingly, he organized an experiment. Workers from each of three skill levels were chosen. These groups were further divided into two subgroups. Each subgroup assembled the desks using methods A and B. The amount of time taken to assemble each of eight desks was recorded as follows. Columns 1 and 2 contain the times for methods A and B; rows 1 to 8, 9 to 16, and 17 to 24 store the times for the three skill levels. What can we infer from these data?

CHAPTER SUMMARY

The analysis of variance allows us to test for differences between populations when the data are interval. The analyses of the results of three different experimental designs were presented in this chapter. The one-way analysis of variance defines the populations on the basis of one factor. The second experimental design also defines the treatments on the basis of one factor. However, the randomized block design uses data gathered by observing the results of a matched or blocked experiment (two-way analysis of variance). The third design is the two-factor experiment

wherein the treatments are defined as the combinations of the levels of two factors. All the analyses of variance are based on partitioning the total sum of squares into sources of variation from which the mean squares and *F*-statistics are computed.

In addition, we introduced three multiple comparison methods that allow us to determine which means differ in the one-way analysis of variance.

Finally, we described an important application in operations management that employs the analysis of variance.

IMPORTANT TERMS:

Analysis of variance	520	<i>F</i> -statistic	525
Treatment means	520	Analysis of variance (ANOVA) table	525
One-way analysis of variance	520	Total variation	526
Response variable	522	SS(Total)	526
Responses	522	Completely randomized design	528
Experimental units	522	Multiple comparisons	538
Factor	522	Least significance difference (LSD)	540
Level	522	Bonferroni adjustment	541
Between-treatments variation	522	Tukey's multiple comparison method	543
Sum of squares for treatments (SST)	522	Multifactor experiment	549
Within-treatments variation	523	Randomized block design	549
Sum of squares for error (SSE)	523	Repeated measures	549
Mean squares	524	Two-way analysis of variance	549
Mean squares for treatments	524	Fixed-effects analysis of variance	550
Mean squares for error	524	Random-effects analysis of variance	550

Sum of squares for blocks 550
 Factorial experiment 559
 Interactions 561

Complete factorial experiment 562
 Replicate 563
 Balanced 563

S Y M B O L S :

Symbol	Pronounced	Represents
$\bar{\bar{x}}$	x double bar	Overall or grand mean
q		Studentized range
ω	Omega	Critical value of Tukey's multiple comparison method
$q_\alpha(k, \nu)$	q sub alpha $k \nu$	Critical value of the Studentized range
n_g		Number of observations in each of k samples
$\bar{x}[T]_j$	x bar T sub j	Mean of the j th treatment
$\bar{x}[B]_i$	x bar B sub i	Mean of the i th block
$\bar{x}[AB]_{ij}$	x bar A B sub ij	Mean of the ij th treatment
$\bar{x}[A]_i$	x bar A sub i	Mean of the observations when the factor A level is i
$\bar{x}[B]_j$	x bar B sub j	Mean of the observations when the factor B level is j

F O R M U L A S :

One-way analysis of variance

$$SST = \sum_{j=1}^k n_j (\bar{x}_j - \bar{\bar{x}})^2$$

$$SSE = \sum_{j=1}^k \sum_{i=1}^b (x_{ij} - \bar{x}_j)^2$$

$$MST = \frac{SST}{k-1}$$

$$MST = \frac{SSE}{n-k}$$

$$F = \frac{MST}{MSE}$$

Least significant difference comparison method

$$LSD = t_{\alpha/2} \sqrt{MSE \left(\frac{1}{n_i} + \frac{1}{n_j} \right)}$$

Tukey's multiple comparison method

$$\omega = q_\alpha(k, \nu) \sqrt{\frac{MSE}{n_g}}$$

Two-way analysis of variance (randomized block design of experiment)

$$SS(\text{Total}) = \sum_{j=1}^k \sum_{i=1}^b (x_{ij} - \bar{\bar{x}})^2$$

$$SST = \sum_{j=1}^k b(\bar{x}[T]_j - \bar{\bar{x}})^2$$

$$SSB = \sum_{j=1}^k k(\bar{x}[B]_j - \bar{\bar{x}})^2$$

$$SSE = \sum_{j=1}^k \sum_{i=1}^b (x_{ij} - \bar{x}[T]_j - \bar{x}[B]_j + \bar{\bar{x}})^2$$

$$MST' = \frac{SST}{k-1}$$

$$MSB = \frac{SSB}{b-1}$$

$$MSE = \frac{SSE}{n-k-b+1}$$

$$F = \frac{MST}{MSE}$$

$$F = \frac{MSB}{MSE}$$

Two-factor analysis of variance

$$SS(\text{Total}) = \sum_{i=1}^a \sum_{j=1}^b \sum_{k=1}^r (x_{ijk} - \bar{\bar{x}})^2$$

$$SS(A) = rb \sum_{j=1}^a (\bar{x}[A]_i - \bar{\bar{x}})^2$$

$$MS(B) = \frac{SS(B)}{b-1}$$

$$SS(B) = ra \sum_{j=1}^b (\bar{x}[B]_j - \bar{\bar{x}})^2$$

$$MS(AB) = \frac{SS(AB)}{(a-1)(b-1)}$$

$$SS(AB) = r \sum_{i=1}^a \sum_{j=1}^b (\bar{x}[AB]_{ij} - \bar{x}[A]_i - \bar{x}[B]_j + \bar{\bar{x}})^2$$

$$F = \frac{MS(A)}{MSE}$$

$$SSE = \sum_{i=1}^a \sum_{j=1}^b \sum_{k=1}^r (x_{ijk} - \bar{x}[AB]_{ij})^2$$

$$F = \frac{MS(B)}{MSE}$$

$$MS(A) = \frac{SS(A)}{a-1}$$

$$F = \frac{MS(AB)}{MSE}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
One-way ANOVA	527	527
Multiple comparisons (LSD, Bonferroni adjustment, and Tukey)	544	545
Two-way (randomized block) ANOVA	553	554
Two-factor ANOVA	566	567

CHAPTER EXERCISES

The following exercises require the use of a computer and software. Use a 5% significance level.

- 14.101** *Xr14-101* Each year billions of dollars are lost because of worker injuries on the job. Costs can be decreased if injured workers can be rehabilitated quickly. As part of an analysis of the amount of time taken for workers to return to work, a sample of male blue-collar workers aged 35 to 45 who suffered a common wrist fracture was taken. The researchers believed that the mental and physical condition of the individual affects recovery time. Each man was given a questionnaire to complete, which measured whether he tended to be optimistic or pessimistic. Their physical condition was also evaluated and categorized as very physically fit, average, or in poor condition. The number of days until the wrist returned to full function was measured for

each individual. These data were recorded in the following way:

Column 1: Time to recover for optimists ((columns 1–10) = very fit, rows 11–20 = in average condition, rows 21–30 = poor condition)

Column 2: Time to recover for pessimists (same format as column 1)

- What are the factors in this experiment? What are the levels of each factor?
- Can we conclude that pessimists and optimists differ in their recovery times?
- Can we conclude that physical condition affects recovery times?

- 14.102** *Xr14-102* To help high school students pick a major, a company called PayScale surveys graduates of a

variety of programs. In one such survey, graduates of the following degree programs were asked what their annual salaries were after working at least 10 years in the field.

Elementary Education
Human Development
Social Work
Special Education

Can we infer that there are differences in salary between the four college degrees?

- 14.103** *Xr14-103* The possible imposition of a residential property tax has been a sensitive political issue in a large city that consists of five boroughs. Currently, property tax is based on an assessment system that dates back to 1950. This system has produced numerous inequities whereby newer homes tend to be assessed at higher values than older homes. A new system based on the market value of the house has been proposed. Opponents of the plan argue that residents of some boroughs would have to pay considerably more on the average, while residents of other boroughs would pay less. As part of a study examining this issue, several homes in each borough were assessed under both plans. The percentage increase (a decrease is represented by a negative increase) in each case was recorded.

- Can we conclude that there are differences in the effect the new assessment system would have on the five boroughs?
- If differences exist, which boroughs differ? Use Tukey's multiple comparison method.
- What are the required conditions for your conclusions to be valid?
- Are the required conditions satisfied?

- 14.104** *Xr14-104* The editor of the student newspaper was in the process of making some major changes in the newspaper's layout. He was also contemplating changing the typeface of the print used. To help himself make a decision, he set up an experiment in which 20 individuals were asked to read four newspaper pages, with each page printed in a different typeface. If the reading speed differed, then the typeface that was read fastest would be used. However, if there was not enough evidence to allow the editor to conclude that such differences existed, the current typeface would be continued. The times (in seconds) to completely read one page were recorded. What should the editor do?

- 14.105** *Xr14-105* In marketing children's products, it is extremely important to produce television commercials that hold the attention of the children

who view them. A psychologist hired by a marketing research firm wants to determine whether differences in attention span exist between children watching advertisements for different types of products. One hundred fifty children under 10 years of age were recruited for an experiment. One-third watched a 60-second commercial for a new computer game, one-third watched a commercial for a breakfast cereal, and one-third watched a commercial for children's clothes. Their attention spans (in seconds) were measured and recorded. Do these data provide enough evidence to conclude that there are differences in attention span between the three products advertised?

- 14.106** *Xr14-106* On reconsidering the experiment in Exercise 14.105, the psychologist decides that the age of the child may influence the attention span. Consequently, the experiment is redone in the following way. Three 10-year-olds, three 9-year-olds, three 8-year-olds, three 7-year-olds, three 6-year-olds, three 5-year-olds, and three 4-year-olds are randomly assigned to watch one of the commercials, and their attention spans are measured. Do the results indicate that there are differences in the abilities of the products advertised to hold children's attention?

- 14.107** *Xr14-107* It is important for salespeople to be knowledgeable about how people shop for certain products. Suppose that a new car salesman believes that the age and gender of a car shopper affect the way he or she makes an offer on a car. He records the initial offers made by a group of men and women shoppers on a \$25,000 Ford Taurus. In addition to the gender of the shopper, the salesman also notes the age category. The amount of money below the asking price that each person offered initially for the car was recorded using the following format: Column 1 contains the data for the under 30 group; the first 25 rows store the results for female shoppers and the last 25 rows are the male shoppers. Columns 2 and 3 store the data for the 30–45 age category and over 45 category, respectively. What can we conclude from these data?

- 14.108** *Xr14-108* Many of you reading this page probably learned how to read using the whole-language method. This strategy maintains that the natural and effective way is to be exposed to whole words in context. Students learn how to read by recognizing words they have seen before. In the past generation this has been the dominant teaching strategy throughout North America. It replaced phonics, wherein children were taught to sound out the letters to form words. The whole language method

was instituted with little or no research and has been severely criticized in the past. A recent study may have resolved the question of which method should be employed. An educational psychologist at the University of Houston described the experiment at the annual meeting of the American Association for the Advancement of Science. The subjects were 375 low-achieving, poor, first-grade students in Houston schools. The students were divided into three groups. One was educated according to the whole-language philosophy, a second group was taught using a pure phonics strategy, and the third was taught employing a mixed or embedded phonics technique. At the end of the term students were asked to read words on a list of 50 words. The number of words each child could read was recorded.

- Can we infer that differences exist between the effects of the three teaching strategies?
- If differences exist, identify which method appears to be best.

- 14.109** **Xr14-109** Are babies who are exposed to music before their birth smarter than those who are not? And, if so, what kind of music is best? Researchers at the University of Wisconsin conducted an experiment with rats. The researchers selected a random sample of pregnant rats and divided the sample into three groups. Mozart works were played to one group, a second group was exposed to white noise (a steady hum with no musical elements) and the third group listened to Philip Glass music (very simple compositions). The researchers then trained the young rats to run a maze in search of food. The amount of time for the rats to complete the maze was measured for all three groups.
- Can we infer from these data that there are differences between the three groups?
 - If there are differences, determine which group is best.

- 14.110** **Xr14-110** Increasing tuition has resulted in some students being saddled with large debts on graduation. To examine this issue, a random sample of recent graduates was asked to report whether they had student loans, and if so, how much was the debt at graduation. Each person who reported that they owed money was also asked whether their degree was a B.A., B.Sc., B.B.A., or other. Can we conclude that debt levels differ between the four types of degree?

- 14.111** **Xr14-111** Studies indicate that single male investors tend to take the most risk, whereas married female investors tend to be conservative. This raises the question, which does best? The risk-adjusted returns for single and married men, and for single and married women were recorded. Can we infer

that differences exist between the four groups of investors?

- 14.112** **Xr14-112** Virtually all restaurants attempt to have three “seatings” on weekend nights. Three seatings means that each table gets three different sets of customers. Obviously, any group that lingers over dessert and coffee may result in the loss of one seating and profit for the restaurant. In an effort to determine which types of groups tend to linger a random sample of 150 groups was drawn. For each group, the number of members and the length of time that the group stayed were recorded in the following way:

Column A: Length of time for 2 people
 Column B: Length of time for 3 people
 Column C: Length of time for 4 people
 Column D: Length of time for more than 4 people

Do these data allow us to infer that the length of time in the restaurant depends on the size of the party?

- 14.113** **Xr14-113** When the stock market has a large 1-day decline, does it bounce back the next day or does the bad news endure? To answer this question, an economist examined a random sample of daily changes to the Toronto Stock Index (TSE). He recorded the percent change. He classified declines as:

Down by less than 0.5%
 Down by 0.5% to 1.5%
 Down by 1.5% to 2.5%
 Down by more than 2.5%

For each of these days, he recorded the percent loss the following day. Do these data allow us to infer that there are differences in changes to the TSE depending on the loss the previous day? (This exercise is based on a study undertaken by Tim Whitehead, an economist for Left Bank Economics, a consulting firm near Paris, Ontario.)

- 14.114** **Xr14-114** Stock market investors are always seeking the “Holy Grail,” a sign that tells them the market has bottomed out or achieved its highest level. There are several indicators. One is the buy signal developed by Gerald Appel, who believed that a bottom has been reached when the difference between the weekly close of the New York Stock Exchange (NYSE) index and the 10-week moving average (see Chapter 20) is -4.0 points or more. Another bottom indicator is based on identifying a certain pattern in the line chart of the stock market index. As an experiment, a financial analyst randomly selected 100 weeks. For each

week he determined whether there was an Appel buy, a chart buy, or no indication. For each type of week he recorded the percentage change over the next 4 weeks. Can we infer that the two buy indicators are not useful?

- 14.115 *Xr14-115*** Millions of North Americans spend up to several hours a day commuting to and from work. Other than the wasted time, are there other negative effects associated with fighting traffic? A study by Statistics Canada may shed light on the issue. A random sample of adults was surveyed. Among other questions each was asked how much time he or she slept and how much time was spent commuting. The categories for commuting time are 1 to 30 minutes, 31 to 60 minutes, and over 60 minutes. Is there sufficient evidence to conclude that the amount of sleep differs between commuting categories?

- 14.116 *Xr14-116*** A random sample of 500 teenagers were grouped in the following way: ages 13–14, 15–17, and 18–19. Each teenager was asked to record the number of Facebook friends each had. Is there sufficient evidence to infer that there are differences in the number of Facebook friends between the three teenage groups?

Overeating Experiments (See page 461.)

- 14.117 *Xr14-117*** Ice Cream Experiment

This experiment consisted of graduate students given either a medium-sized 17-ounce bowls or large-sized 34-ounce bowls. Each student was invited to take as much of four different flavors of ice cream as he or she wanted. The size of the scoop also varied. One held two ounces and the other held three ounces. The students were asked to fill out a survey; while doing so, the amount of ice cream was measured and recorded. Is there sufficient evidence to conclude that either the bowl size or the scoop size or some interaction affected the amount of ice cream?

Source: Adapted from Brian Wansink, Koert van Ittersum, and James E. Painter, "Ice Cream Illusions: Bowl Size, Spoon Size, and Serving Size," *American Journal of Preventive Medicine* (September 2006).

- 14.118 *Xr14-118*** Hershey's Kisses Experiment

Deskbound secretaries were employed in this experiment. Clear-lidded candy dishes filled with 30 Hershey's Kisses were placed in three different

locations. The first location was the secretary's desk, the second was the top-left drawer in the secretary's desk, and the third was on the top of a file cabinet 6 feet from the secretary's desk. After 1 week, the number of Kisses consumed was counted. Do the data allow us to infer that the number of Kisses differed by location?

Source: Adapted from James E. Painter, Brian Wansink, and Julie B. Hieggelke, "How Visibility and Convenience Influence Candy Consumption," *Appetite* 38:3 (June 2002), 237–38.

- 14.119 *Xr14-119*** Brownie Experiment

A random sample of 175 people who had lunch at a company cafeteria were offered a brownie. Some were handed the brownie on a fine piece of china, others were given the brownie on a paper plate, and others were given the brownie on a paper napkin. Each person was asked how much they would be willing to pay. Is there sufficient evidence to conclude that the prices differed according to the way the brownies were offered?

The following exercises use data files associated with three exercises seen previously in this book.

- 14.120 *XR12-138**** In Exercise 12.138 marketing managers for the JC Penney department store chain segmented the market for women's apparel on the basis of personal and family values. The segments are Conservative, Traditional, and Contemporary. Recall that the classification was done on the basis of questionnaires. Suppose that in addition to identifying the segment the questionnaire also asked each woman to report family income (in \$1,000s). Do these data allow us to infer that family incomes differ between the three market segments?

- 14.121 *Xr13-21**** Exercise 13.21 addressed the problem of determining whether the distances young (under 25) males and females drive annually differ. Included in the data is also the number of accidents that each person was involved in the past 2 years. Responses are 0, 1, or 2 or more. Do the data allow us to infer that the distances driven differ between the drivers who have had 0, 1, or 2 or more accidents?

- 14.122 *Xr13-161**** The objective in Exercise 13.161 was to determine whether various market segments were more likely to use the QuickLube service. Included with the data is also the age (in months) of the car. Do the data allow us to conclude that there are differences in the age between the four market segments?

CASE 14.1**DATA
C14-01**

Acute otitis media, an infection of the middle ear, is a common childhood illness. There are various ways to treat the problem. To help determine the best way, researchers conducted an experiment. One hundred and eighty children between 10 months and 2 years with recurrent acute otitis media were divided into three equal groups. Group 1 was treated by surgically removing the adenoids (adenoidectomy), the second was treated with the drug Sulfafurazole, and the third with a placebo.

Comparing Three Methods of Treating Childhood Ear Infections*

Each child was tracked for 2 years, during which time all symptoms and episodes of acute otitis media were recorded. The data were recorded in the following way:

- Column 1: ID number
- Column 2: Group number
- Column 3: Number of episodes of the illness
- Column 4: Number of visits to a physician because of any infection
- Column 5: Number of prescriptions
- Column 6: Number of days with symptoms of respiratory infection

Stephen Chang/Workbook Stock/Getty Images



- Are there differences between the three groups with respect to the number of episodes, number of physician visits, number of prescriptions, and number of days with symptoms of respiratory infection?
- Assume that you are working for the company that makes the drug Sulfafurazole. Write a report to the company's executives discussing your results.

*This case is adapted from the *British Medical Journal*, February 2004.

APPENDIX 14 / REVIEW OF CHAPTERS 12 TO 14

The number of techniques introduced in Chapters 12 to 14 is up to 20. As we did in Appendix 13, we provide a table of the techniques, a flowchart to help you identify the correct technique, and 25 exercises to give you practice in how to choose the appropriate method. The table and the flowchart have been amended to include the three analysis of variance techniques introduced in this chapter and the three multiple comparison methods.

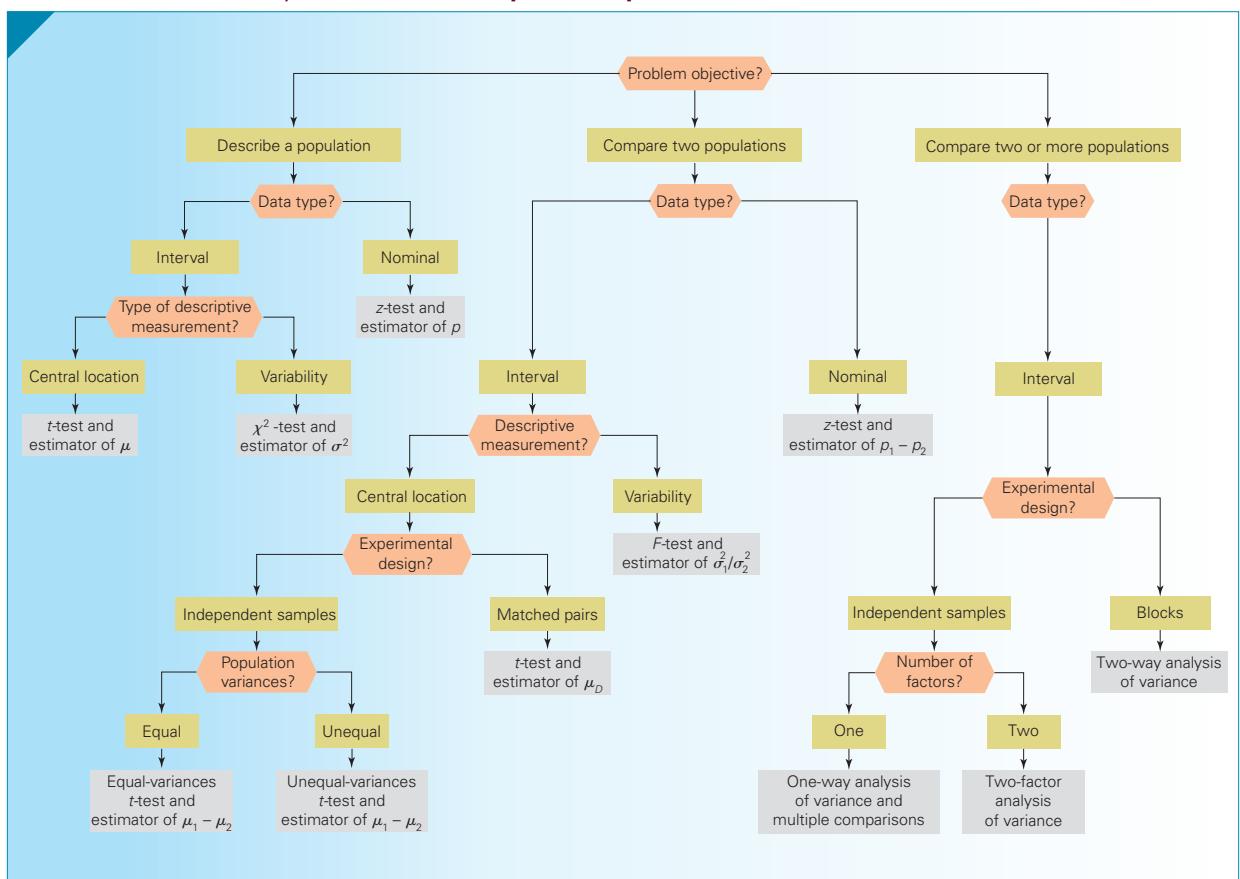
TABLE A14.1 Summary of Statistical Techniques in Chapters 12 to 14

- | |
|---|
| <i>t</i> -test of μ
Estimator of μ (including estimator of $N\mu$)
χ^2 test of σ^2
Estimator of σ^2
z -test of p
Estimator of p (including estimator of Np) |
|---|

(Continued)

TABLE A14.1 Summary of Statistical Techniques in Chapters 12 to 14 (*Continued*)

Equal-variances t -test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances t -test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
t -test of μ_D
Estimator of μ_D
F -test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
z -test of $p_1 - p_2$ (Case 1)
z -test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$
One-way analysis of variance (including multiple comparisons)
Two-way (randomized blocks) analysis of variance
Two-factor analysis of variance

FIGURE A14.1 Summary of Statistical Techniques in Chapters 12 to 14



EXERCISES

Note that as we did in Appendix 13, we do not specify a significance level in exercises requiring a test of hypothesis. We leave this decision to you. After analyzing the issues raised in the exercise, use your own judgment to determine whether the *p*-value is small enough to reject the null hypothesis.

- A14.1** **XrA14-01** Sales of a product may depend on its placement in a store. Candy manufacturers frequently offer discounts to retailers who display their products more prominently than competing brands. To examine this phenomenon more carefully, a candy manufacturer (with the assistance of a national chain of restaurants) planned the following experiment. In 20 restaurants, the manufacturer's brand was displayed behind the cashier's counter with all the other brands (this was called position 1). In another 20 restaurants, the brand was placed separately but close to the other brands (position 2). In a third group of 20 restaurants, the candy was placed in a special display next to the cash register (position 3). The number of packages sold during 1 week at each restaurant was recorded. Is there sufficient evidence to infer that sales of candy differ according to placement?
- A14.2** **XrA14-02** Advertising is critical in the residential real estate industry. Agents are always seeking ways to increase sales through improved advertising methods. A particular agent believes that he can increase the number of inquiries (and thus the probability of making a sale) by describing the house for sale without indicating its asking price. To support his belief, he conducted an experiment in which 100 houses for sale were advertised in two ways—with and without the asking price. The number of inquiries for each house was recorded as well as whether the customer saw the ad with or without the asking price shown. Do these data allow the real estate agent to infer that ads with no price shown are more effective in generating interest in a house?
- A14.3** **XrA14-03** A professor of statistics hands back his graded midterms in class by calling out the name of each student and personally handing the exam over to its owner. At the end of the process, he notes that there are several exams left over, the result of students missing that class. He forms the theory that the absence is caused by a poor performance by those students on the test. If the theory is correct, the leftover papers will have lower marks than those papers handed back. He recorded the marks (out of 100) for the leftover papers and the marks of the returned papers. Do the data support the professor's theory?

- A14.4** **XrA14-04** A study was undertaken to determine whether a drug commonly used to treat epilepsy could help alcoholics to overcome their addiction. The researchers took a sample of 103 hardcore alcoholics. Fifty-five drinkers were given topiramate and the remaining 48 were given a placebo. The following variables were recorded after 6 months:

Column 1: Identification number
 Column 2: 1 = Topiramate and 2 = placebo
 Column 3: Abstain from alcohol for one month
 (1 = no, 2 = yes)
 Column 4: Did not binge in final month (1 = no,
 2 = yes)

Do these data provide sufficient evidence to infer that topiramate is effective in

- causing abstinence for the first month?
- causing alcoholics to refrain from binge drinking in the final month?

- A14.5** **XrA14-05** Health-care costs in the United States and Canada are concerns for citizens and politicians. The question is, How can we devise a system wherein people's medical bills are covered but individuals attempt to reduce costs? An American company has come up with a possible solution. Golden Rule is an insurance company in Indiana with 1,300 employees. The company offered its employees a choice of programs. One choice was a medical savings account (MSA) plan. Here's how it works. To ensure that a major illness or accident does not financially destroy an employee, Golden Rule offers catastrophic insurance—a policy that covers all expenses above \$2,000 per year. At the beginning of the year, the company deposits \$1,000 (for a single employee) and \$2,000 (for an employee with a family) into the MSA. For minor expenses, the employee pays from his or her MSA. As an incentive for the employee to spend wisely, any money left in the MSA at the end of the year can be withdrawn by the employee. To determine how well it works, a random sample of employees who opted for the medical savings account plan was compared to employees who chose the regular plan. At the end of the year, the medical expenses for each employee were recorded. Critics of MSA say that the plan leads to poorer health care, and as a result employees are less likely to be in excellent health. To address this issue, each employee was examined. The results of the examination were recorded where 1 = excellent health and 2 = not in excellent health

- a. Can we infer from these data that MSA is effective in reducing costs?
- b. Can we infer that the critics of MSA are correct?

A14.6 XrA14-06 Discrimination in hiring has been illegal for many years. It is illegal to discriminate against any person on the basis of race, gender, or religion. It is also illegal to discriminate because of a person's handicap if it in no way prevents that person from performing that job. In recent years, the definition of "handicap" has widened. Several applicants have successfully sued companies because they were denied employment for no other reason than that they were overweight. A study was conducted to examine attitudes toward overweight people. The experiment involved showing a number of subjects videotape of an applicant being interviewed for a job. Before the interview, the subject was given a description of the job. Following the interview, the subject was asked to score the applicant in terms of how well the applicant was suited for the job. The score was out of 100, where higher scores described greater suitability. (The scores are interval data.) The same procedure was repeated for each subject. However, the gender and weight (average and overweight) of the applicant varied. The results were recorded using the following format:

Column 1: Score for average weight males
 Column 2: Score for overweight males
 Column 3: Score for average weight females
 Column 4: Score for overweight females

- a. Can we infer that the scores of the four groups of applicants differ?
- b. Are the differences detected in part (a) because of weight, gender, or some interaction?

A14.7 XrA14-07 Most automobile repair shops now charge according to a schedule that is claimed to be based on average times. This means that instead of determining the actual time to make a repair and multiplying this value by their hourly rate, repair shops determine the cost from a schedule that is calculated from average times. A critic of this policy is examining how closely this schedule adheres to the actual time to complete a job. He randomly selects five jobs. According to the schedule, these jobs should take 45 minutes, 60 minutes, 80 minutes, 100 minutes, and 125 minutes, respectively. The critic then takes a random sample of repair shops and records the actual times for each of 20 cars for each job. For each job, can we infer that the time specified by the schedule is greater than the actual time?

A14.8 XrA14-08 Automobile insurance appraisers examine cars that have been involved in accidental collisions and estimate the cost of repairs. An insurance executive claims that there are significant differences

in the estimates from different appraisers. To support his claim, he takes a random sample of 25 cars that have recently been damaged in accidents. Three appraisers then estimated the repair costs of each car. The estimates were recorded for each appraiser. From the data, can we conclude that the executive's claim is true?

A14.9 XrA14-09 The widespread use of salt on roads in Canada and the northern United States during the winter and acid precipitation throughout the year combine to cause rust on cars. Car manufacturers and other companies offer rustproofing services to help purchasers preserve the value of their cars. A consumer protection agency decides to determine whether there are any differences between the rust protection provided by automobile manufacturers and that provided by two competing types of rustproofing services. As an experiment, 60 identical new cars are selected. Of these, 20 are rustproofed by the manufacturer. Another 20 are rustproofed using a method that applies a liquid to critical areas of the car. The liquid hardens, forming a (supposedly) lifetime bond with the metal. The last 20 are treated with oil and are retreated every 12 months. The cars are then driven under similar conditions in a Minnesota city. The number of months until the first rust appears was recorded. Is there sufficient evidence to conclude that at least one rustproofing method is different from the others?

A14.10 XRA14-10 One of the ways in which advertisers measure the value of television commercials is by telephone surveys conducted shortly after commercials are aired. Respondents who watched a certain television station at a given time period, during which the commercial appeared, are asked whether they can recall the name of the product in the commercial. Suppose an advertiser wants to compare the recall proportions of two commercials. The first commercial is relatively inexpensive. A second commercial shown a week later is quite expensive to produce. The advertiser decides that the second commercial is viable only if its recall proportion is more than 15% higher than the recall proportion of the first commercial. Two surveys of 500 television viewers each were conducted after each commercial was aired. Each person was asked whether he or she remembered the product name. The results are stored in columns 1 (commercial 1) and 2 (commercial 2) (2 = remembered the product name, 1 = did not remember the product name). Can we infer that the second commercial is viable?

A14.11 XRA14-11 In the door-to-door selling of vacuum cleaners, various factors influence sales. The Birk Vacuum Cleaner Company considers its sales pitch and overall package to be extremely important. As

a result, it often thinks of new ways to sell its product. Because the company's management develops so many new sales pitches each year, there is a two-stage testing process. In stage 1, a new plan is tested with a relatively small sample. If there is sufficient evidence that the plan increases sales, a second, considerably larger, test is undertaken. In a stage 1 test to determine whether the inclusion of a "free" 10-year service contract increases sales, 100 sales representatives were selected at random from the company's list of several thousand. The monthly sales of these representatives were recorded for 1 month before the use of the new sales pitch and for 1 month after its introduction. Should the company proceed to stage 2?

A14.12 XrA14-12 The cost of workplace injuries is high for the individual worker, for the company, and for society. It is in everyone's interest to rehabilitate the injured worker as quickly as possible. A statistician working for an insurance company has investigated the problem. He believes that physical condition is a major determinant in how quickly a worker returns to his or her job after sustaining an injury. To help determine whether he is on the right track, he organized an experiment. He took a random sample of male and female workers who were injured during the preceding year. He recorded their gender, their physical condition, and the number of working days until they returned to their job. These data were recorded in the following way. Columns 1 and 2 store the number of working days until return to work for men and women, respectively. In each column, the first 25 observations relate to those who are physically fit, the next 25 rows relate to individuals who are moderately fit, and the last 25 observations are for those who are in poor physical shape. Can we infer that the six groups differ? If differences exist, determine whether the differences result from gender, physical fitness, or some combination of gender and physical fitness.

A14.13 XrA14-13 Does driving an ABS-equipped car change the behavior of drivers? To help answer this question, the following experiment was undertaken. A random sample of 200 drivers who currently operate cars without ABS were selected. Each person was given an identical car to drive for 1 year. Half the sample were given cars that had ABS, and the other half were given cars with standard-equipment brakes. Computers on the cars recorded the average speed (in miles per hour) during the year. Can we infer that operating an ABS-equipped car changes the behavior of the driver?

A14.14 XrA14-14 We expect the demand for a product depends on its price: The higher the price, the lower the demand. However, this may not be entirely

true. In an experiment conducted by professors at Northwestern University and MIT, a mail-order dress was available at the prices \$34, \$39, and \$44. The number of dresses sold weekly over a 20-week period was recorded. The prices were randomized over 60 weeks. Conduct a test to determine whether demand differed and, if so, which price elicited the highest sales.

A14.15 XrA14-15 Researchers at the University of Washington conducted an experiment to determine whether the herbal remedy Echinacea is effective in treating children's colds and other respiratory infection (*National Post*, December 3, 2003). A sample of 524 children were recruited. Half the sample treated their colds with Echinacea, and the other half was given a placebo. For each infection, the duration of the colds (in days) was measured and recorded. Can we conclude that Echinacea is effective?

A14.16 XrA14-16 The marketing manager of a large ski resort wants to advertise that his ski resort has the shortest lift lines of any resort in the area. To avoid the possibility of a false advertising liability suit, he collects data on the times skiers wait in line at his resort and at each of two competing resorts on each of 14 days.

- Can he conclude that there are differences in waiting times between the three resorts?
- What are the required conditions for these techniques?
- How would you check to determine that the required conditions are satisfied?

A14.17 XrA14-17 A popularly held belief about university professors is that they don't work very hard and that the higher their rank, the less work they do. A statistics student decided to determine whether the belief is true. She took a random sample of 20 university instructors in the faculties of business, engineering, arts, and sciences. In each sample of 20, 5 were instructors, 5 were assistant professors, 5 were associate professors, and 5 were full professors. Each professor was surveyed and asked to report confidentially the number of weekly hours of work. These data were recorded in the following way:

Column 1: hours of work for business professors (first 5 rows = instructors, next 5 rows = assistant professors, next 5 rows = associate professors, and last 5 rows = full professors)

Column 2: hours of work for engineering professors (same format as column 1)

Column 3: hours of work for arts professors (same format as column 1)

Column 4: hours of work for science professors (same format as column 1)

- If we conduct the test under the single-factor analysis of variance, how many levels are there? What are they?
- Test to determine whether differences exist using a single-factor analysis of variance.
- If we conduct tests using the two-factor analysis of variance, what are the factors? What are their levels?
- Is there evidence of interaction?
- Are there differences between the four ranks of instructor?
- Are there differences between the four faculties?

A14.18 XrA14-18 Billions of dollars are spent annually by Americans for the care and feeding of pets. A survey conducted by the American Veterinary Medical Association drew a random sample of 1,328 American households and asked whether they owned a pet and, if so, the type of animal. In addition, each was asked to report the veterinary

expenditures for the previous 12 months. Column 1 contains the expenditures for dogs, and column 2 stores the expenditures for cats. The results are that 474 households reported that they owned at least one dog and 419 owned at least one cat. The latest census indicates that there are 112 million households in the United States.

Source: Statistical Abstract of the United States, 2006, Table 1232.

- Estimate with 95% confidence the total number of households owning at least one dog.
- Repeat part (a) for cats.
- Assume that there are 40 million households with at least one dog and estimate with 95% confidence the total amount spent on veterinary expenditures for dogs.
- Assume that there are 35 million households with at least one cat and estimate with 95% confidence the total amount spent on veterinary expenditures for cats.



GENERAL SOCIAL SURVEY EXERCISES

A14.19 GSS2008* Can we infer from the data that the majority of Americans support capital punishment for murderers? (CAPPUN: 1 = Favor, 2 = Oppose)

A14.20 GSS2008* Test to determine whether Democrats and Republicans differ in their answers to the question, Have you ever taken any drugs by injection (heroin, cocaine, etc.)? (EVIDU: 1 = Yes, 2 = No)

A14.21 GSS2008* Is there enough evidence to infer that differences in the amount of television watched (TVHOURS) differ between classes (CLASS)?

A14.22 GSS2008* Do the data provide enough statistical evidence to conclude that differences in number of hours worked (HRS) exist between the three races (RACE)?

A14.23 GSS2006* GSS2008* Is there sufficient evidence to infer that on average Americans have aged (AGE) between 2006 and 2008?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

A14.24 ANES2008* Can we conclude that differences in having access to the Internet (ACCESS: 1 = Yes, 5 = No) differ between Republicans and Democrats (PARTY: 1 Democrat, 2 = Republican)?

A14.25 ANES2008* Can we conclude that differences in age (AGE) exist between liberals, moderates, and conservatives (LIBCON3)?

15



age fotostock/SuperStock

CHI-SQUARED TESTS

- 15-1 *Chi-Squared Goodness-of-Fit Test*
- 15-2 *Chi-Squared Test of a Contingency Table*
- 15-3 *Summary of Tests on Nominal Data*
- 15-4 *(Optional) Chi-Squared Test for Normality*
- Appendix 15 *Review of Chapters 12 to 15*

General Social Surveys

Has Support for Capital Punishment for Murderers Changed since 2006?

DATA

GSS2002*
GSS2004*
GSS2006*
GSS2008*

The issue of capital punishment for murderers in the United States has been argued for many years. A few states have abolished it, and others have kept their laws on the books but rarely use them. Where does the public stand on the issue, and has public support been constant or has it changed from year to year? One of the questions asked in the General Social Survey was

Do you favor capital punishment for murder (CAPPUN)? The responses are

1 = Favor, 2 = Oppose

Conduct a test to determine whether public support varies from year to year.



See Solution On
page 606

Bob Daemmrich/PhotoEdit

INTRODUCTION

We have seen a variety of statistical techniques that are used when the data are nominal. In Chapter 2, we introduced bar and pie charts, both graphical techniques to describe a set of nominal data. Later in Chapter 2, we showed how to describe the relationship between two sets of nominal data by producing a frequency table and a bar chart. However, these techniques simply describe the data, which may represent a sample or a population. In this chapter, we deal with similar problems, but the goal is to use statistical techniques to make inferences about populations from sample data.

This chapter develops two statistical techniques that involve nominal data. The first is a *goodness-of-fit test* applied to data produced by a *multinomial experiment*, a generalization of a binomial experiment. The second uses data arranged in a table (called a *contingency table*) to determine whether two classifications of a population of nominal data are statistically independent; this test can also be interpreted as a comparison of two or more populations. The sampling distribution of the test statistics in both tests is the chi-squared distribution introduced in Chapter 8.

15-1 / CHI-SQUARED GOODNESS-OF-FIT TEST

This section presents another test designed to describe a population of nominal data. The first such test was introduced in Section 12-3, where we discussed the statistical procedure employed to test hypotheses about a population proportion. In that case, the nominal variable could assume one of only two possible values: success or failure. Our tests dealt with hypotheses about the proportion of successes in the entire population. Recall that the experiment that produces the data is called a *binomial experiment*. In this section, we introduce the **multinomial experiment**, which is an extension of the binomial experiment, wherein there are two or more possible outcomes per trial.

Multinomial Experiment

A multinomial experiment is one that possesses the following properties.

1. The experiment consists of a fixed number n of trials.
2. The outcome of each trial can be classified into one of k categories, called *cells*.
3. The probability p_i that the outcome will fall into cell i remains constant for each trial. Moreover, $p_1 + p_2 + \dots + p_k = 1$
4. Each trial of the experiment is independent of the other trials.

When $k = 2$, the multinomial experiment is identical to the binomial experiment. Just as we count the number of successes (recall that we label the number of successes x) and failures in a binomial experiment, we count the number of outcomes falling into each of the k cells in a multinomial experiment. In this way, we obtain a set of observed frequencies f_1, f_2, \dots, f_k where f_i is the observed frequency of outcomes falling into cell i , for $i = 1, 2, \dots, k$. Because the experiment consists of n trials and an outcome must fall into some cell,

$$f_1 + f_2 + \dots + f_k = n$$

Just as we used the number of successes x (by calculating the sample proportion \hat{p} , which is equal to x/n) to draw inferences about p , so we use the observed frequencies to

draw inferences about the cell probabilities. We'll proceed in what by now has become a standard procedure. We will set up the hypotheses and develop the test statistic and its sampling distribution. We'll demonstrate the process with the following example.

EXAMPLE 15.1

Testing Market Shares

Company A has recently conducted aggressive advertising campaigns to maintain and possibly increase its share of the market (currently 45%) for fabric softener. Its main competitor, company B, has 40% of the market, and a number of other competitors account for the remaining 15%. To determine whether the market shares changed after the advertising campaign, the marketing manager for company A solicited the preferences of a random sample of 200 customers of fabric softener. Of the 200 customers, 102 indicated a preference for company A's product, 82 preferred company B's fabric softener, and the remaining 16 preferred the products of one of the competitors. Can the analyst infer at the 5% significance level that customer preferences have changed from their levels before the advertising campaigns were launched?

SOLUTION:

The population in question is composed of the brand preferences of the fabric softener customers. The data are nominal because each respondent will choose one of three possible answers: product A, product B, or other. If there were only two categories, or if we were interested only in the proportion of one company's customers (which we would label as successes and label the others as failures), we would identify the technique as the *z-test of p*. However, in this problem we're interested in the proportions of all three categories. We recognize this experiment as a multinomial experiment, and we identify the technique as the **chi-squared goodness-of-fit test**.

Because we want to know whether the market shares have changed, we specify those precampaign market shares in the null hypothesis.

$$H_0: p_1 = .45, p_2 = .40, p_3 = .15$$

The alternative hypothesis attempts to answer our question, Have the proportions changed? Thus,

$$H_1: \text{At least one } p_i \text{ is not equal to its specified value}$$

15-1a Test Statistic

If the null hypothesis is true, we would expect the number of customers selecting brand A, brand B, and other to be 200 times the proportions specified under the null hypothesis; that is,

$$e_1 = 200(.45) = 90$$

$$e_2 = 200(.40) = 80$$

$$e_3 = 200(.15) = 30$$

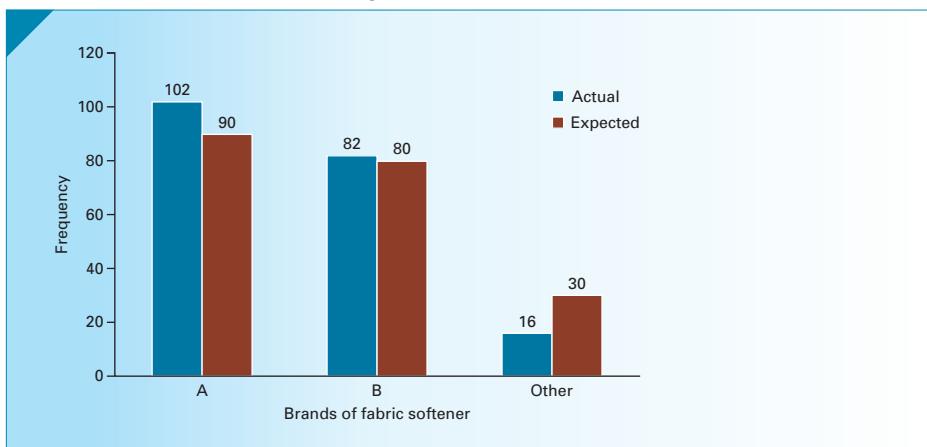
In general, the **expected frequency** for each cell is given by

$$e_i = np_i$$

This expression is derived from the formula for the expected value of a binomial random variable, introduced in Section 7-4.

Figure 15.1 is a bar chart (created by Excel) showing the comparison of actual and expected frequencies.

FIGURE 15.1 Bar Chart for Example 15.1



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If the expected frequencies e_i and the **observed frequencies** f_i are quite different, we would conclude that the null hypothesis is false, and we would reject it. However, if the expected and observed frequencies are similar, we would not reject the null hypothesis. The test statistic defined in the box measures the similarity of the expected and observed frequencies.

Chi-Squared Goodness-of-Fit Test Statistic

$$\chi^2 = \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i}$$

The sampling distribution of the test statistic is approximately chi-squared distributed with $v = k - 1$ degrees of freedom, provided that the sample size is large. We will discuss this required condition later. (The chi-squared distribution was introduced in Section 8-4.)

The following table demonstrates the calculation of the test statistic. Thus, the value $\chi^2 = 8.18$. As usual, we judge the size of this test statistic by specifying the rejection region or by determining the p -value.

Company	Observed Frequency f_i	Expected Frequency e_i	$(f_i - e_i)$	$\frac{(f_i - e_i)^2}{e_i}$
A	102	90	12	1.60
B	82	80	2	0.05
Other	16	30	-14	6.53
Total	200	200	$\chi^2 = 8.18$	

When the null hypothesis is true, the observed and expected frequencies should be similar, in which case the test statistic will be small. Thus, a small test statistic supports the null hypothesis. If the null hypothesis is untrue, some of the observed and expected

frequencies will differ and the test statistic will be large. Consequently, we want to reject the null hypothesis when χ^2 is greater than $\chi_{\alpha,k-1}^2$. In other words, the rejection region is

$$\chi^2 > \chi_{\alpha,k-1}^2$$

In Example 15.1, $k = 3$; the rejection region is

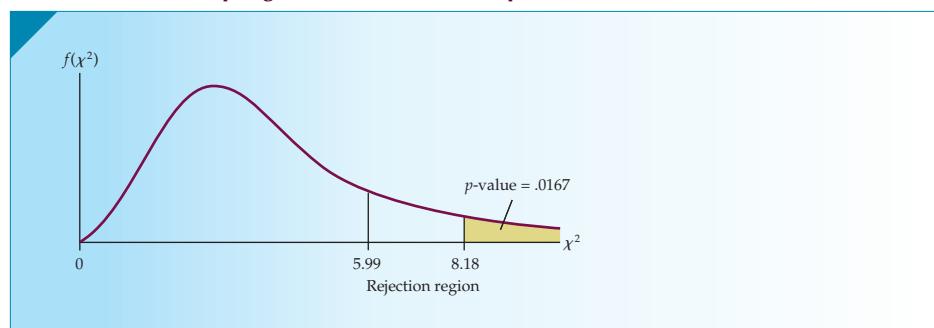
$$\chi^2 > \chi_{\alpha,k-1}^2 = \chi_{.05,2}^2 = 5.99$$

Because the test statistic is $\chi^2 = 8.18$, we reject the null hypothesis. The p -value of the test is

$$p\text{-value} = P(\chi^2 > 8.18)$$

Unfortunately, Table 5 in Appendix B does not allow us to perform this calculation (except for approximation by interpolation). The p -value must be produced by computer. Figure 15.2 depicts the sampling distribution, rejection region, and p -value.

FIGURE 15.2 Sampling Distribution for Example 15.1



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EXCEL

The output from the commands listed here is the p -value of the test. It is .0167.

INSTRUCTIONS

1. Type the observed values into one column and the expected values into another column. (If you wish, you can type the cell probabilities specified in the null hypothesis and let Excel convert these into expected values by multiplying by the sample size.)
2. Activate an empty cell and type

= CHITEST([Actual_range], [Expected_range])

where the ranges are the cells containing the actual observations and the expected values.

You can also perform what-if analyses to determine for yourself the effect of changing some of the observed values and the sample size.

If we have the raw data representing the nominal responses we must first determine the frequency of each category (the observed values) using the **COUNTIF** function described on page 20.

MINITAB**Chi-Square Goodness-of-Fit Test for Observed Counts in Variable: C1**

Category	Observed	Proportion	Test	Contribution
			Expected	to Chi-Sq
1	102	0.45	90	1.60000
2	82	0.40	80	0.05000
3	16	0.15	30	6.53333
N	200		DF	Chi-Sq
			2	8.18333
				P-Value
				0.017

INSTRUCTIONS

1. Click **Stat**, **Tables**, and **Chi-square Goodness-of-Fit Test (One Variable)**
2. Type the observed values into the **Observed counts:** box (102 82 16). If you have a column of data click **Categorical data:** and specify the column or variable name.
3. Click **Proportions specified by historical counts** and **Input constants.** Type the values of the proportions under the null hypothesis (.45 .40 .15).

INTERPRET

There is sufficient evidence at the 5% significance level to infer that the proportions have changed since the advertising campaigns were implemented. If the sampling was conducted properly, we can be quite confident in our conclusion. This technique has only one required condition, which is satisfied. (See the next subsection.) It is probably a worthwhile exercise to determine the nature and causes of the changes. The results of this analysis will determine the design and timing of other advertising campaigns.

15-1b Required Condition

The actual sampling distribution of the test statistic defined previously is discrete, but it can be approximated by the chi-squared distribution provided that the sample size is large. This requirement is similar to the one we imposed when we used the normal approximation to the binomial in the sampling distribution of a proportion. In that approximation we needed np and $n(1 - p)$ to be 5 or more. A similar rule is imposed for the chi-squared test statistic. It is called the *rule of five*, which states that the sample size must be large enough so that the expected value for each cell must be 5 or more. Where necessary, cells should be combined to satisfy this condition. We discuss this required condition and provide more details on its application in Keller's website Appendix Rule of Five.

Factors That Identify the Chi-Squared Goodness-of-Fit Test

1. **Problem objective:** Describe a single population
2. **Data type:** Nominal
3. **Number of categories:** 2 or more



EXERCISES

Developing an Understanding of Statistical Concepts

Exercises 15.1–15.6 are “what-if” analyses designed to determine what happens to the test statistic of the goodness-of-fit test when elements of the statistical inference change. These problems can be solved manually or using Excel’s CHITEST.

- 15.1** Consider a multinomial experiment involving $n = 300$ trials and $k = 5$ cells. The observed frequencies resulting from the experiment are shown in the accompanying table, and the null hypothesis to be tested is as follows:

$$H_0: p_1 = .1, p_2 = .2, p_3 = .3, p_4 = .2, p_5 = .2$$

Test the hypothesis at the 1% significance level.

Cell	1	2	3	4	5
Frequency	24	64	84	72	56

- 15.2** Repeat Exercise 15.1 with the following frequencies:

Cell	1	2	3	4	5
Frequency	12	32	42	36	28

- 15.3** Repeat Exercise 15.1 with the following frequencies:

Cell	1	2	3	4	5
Frequency	6	16	21	18	14

- 15.4** Review the results of Exercises 15.1–15.3. What is the effect of decreasing the sample size?

- 15.5** Consider a multinomial experiment involving $n = 150$ trials and $k = 4$ cells. The observed frequencies resulting from the experiment are shown in the accompanying table, and the null hypothesis to be tested is as follows:

$$H_0: p_1 = .3, p_2 = .3, p_3 = .2, p_4 = .2$$

Cell	1	2	3	4
Frequency	38	50	38	24

Test the hypotheses, using $\alpha = .05$.

- 15.6** For Exercise 15.5, retest the hypotheses, assuming that the experiment involved twice as many trials ($n = 300$) and that the observed frequencies were twice as high as before, as shown here.

Cell	1	2	3	4
Frequency	76	100	76	48

Exercises 15.7–15.21 require the use of a computer and software. Use a 5% significance level unless specified otherwise. The answers to Exercises 15.7–15.16 may be calculated manually. See Appendix A for the sample statistics.

- 15.7** *Xr15-07* The results of a multinomial experiment with $k = 5$ were recorded. Each outcome is identified by

the numbers 1 to 5. Test to determine whether there is enough evidence to infer that the proportions of outcomes differ.

- 15.8** *Xr15-08* A multinomial experiment was conducted with $k = 4$. Each outcome is stored as an integer from 1 to 4 and the results of a survey were recorded. Test the following hypotheses.

$$H_0: p_1 = .15, p_2 = .40, p_3 = .35, p_4 = .10$$

H_1 : At least one p_i is not equal to its specified value

- 15.9** *Xr15-09* To determine whether a single die is balanced, or fair, the die was rolled 600 times. Is there sufficient evidence to allow you to conclude that the die is not fair?

Applications

- 15.10** *Xr15-10* Grades assigned by an economics instructor have historically followed a symmetrical distribution: 5% A's, 25% B's, 40% C's, 25% D's, and 5% F's. This year, a sample of 150 grades was drawn and the grades (1 = A, 2 = B, 3 = C, 4 = D, and 5 = F) were recorded. Can you conclude, at the 10% level of significance, that this year's grades are distributed differently from grades in the past?

- 15.11** *Xr15-11* Pat Statsdud is about to write a multiple-choice exam but as usual knows absolutely nothing. Pat plans to guess one of the five choices. Pat has been given one of the professor's previous exams with the correct answers marked. The correct choices were recorded where 1 = (a), 2 = (b), 3 = (c), 4 = (d), and 5 = (e). Help Pat determine whether this professor does not randomly distribute the correct answer over the five choices? If this is true, how does it affect Pat's strategy?

- 15.12** *Xr15-12* Financial managers are interested in the speed with which customers who make purchases on credit pay their bills. In addition to calculating the average number of days that unpaid bills (called *accounts receivable*) remain outstanding, they often prepare an aging schedule. An aging schedule classifies outstanding accounts receivable according to the time that has elapsed since billing and records the proportion of accounts receivable belonging to each classification. A large firm has determined its aging schedule for the past 5 years. These results are shown in the accompanying table. During the past few months, however, the economy has taken a downturn. The company would like to know whether the recession has affected the

aging schedule. A random sample of 250 accounts receivable was drawn and each account was classified as follows:

- 1 = 0–14 days outstanding
- 2 = 15–29 days outstanding
- 3 = 30–59 days outstanding
- 4 = 60 or more days outstanding

Number of Days Outstanding	Proportion of Accounts Receivable Past 5 Years
0–14	.72
15–29	.15
30–59	.10
60 and more	.03

Determine whether the aging schedule has changed.

- 15.13** *Xr15-13* License records in a county reveal that 15% of cars are subcompacts (1), 25% are compacts (2), 40% are midsize (3), and the rest are an assortment of other styles and models (4). A random sample of accidents involving cars licensed in the county was drawn. The type of car was recorded using the codes in parentheses. Can we infer that certain sizes of cars are involved in a higher than expected percentage of accidents?

- 15.14** *Xr15-14* In an election held last year that was contested by three parties. Party A captured 31% of the vote, party B garnered 51%, and party C received the remaining votes. A survey of 1,200 voters asked each to identify the party that they would vote for in the next election. These results were recorded where 1 = party A, 2 = party B, and 3 = party C. Can we infer at the 10% significance level that voter support has changed since the election?

- 15.15** *Xr15-15* In a number of pharmaceutical studies volunteers who take placebos (but are told they have taken a cold remedy) report the following side effects:

Headache (1)	5%
Drowsiness (2)	7%
Stomach upset (3)	4%
No side effect (4)	84%

A random sample of 250 people who were given a placebo (but who thought they had taken an anti-inflammatory) reported whether they had experienced each of the side effects. These responses were recorded using the codes in parentheses. Do these data provide enough evidence to infer that the reported side effects of the placebo for an anti-inflammatory differ from that of a cold remedy?

APPLICATIONS in MARKETING

Paul Thomas/
The Image Bank/Getty Images



Market Segmentation

Market segmentation was introduced in Section 12-4, where a statistical technique was used to estimate the size of a segment. In Chapters 13 and 14, statistical procedures were applied to determine whether market segments differ in their purchases of products and services. Exercise 15.16 requires you to apply the chi-squared goodness-of-fit test to determine whether the relative sizes of segments have changed.

- 15.16** *Xr12-125** Refer to Exercise 12.125 where the statistics practitioner estimated the size of market segments based on education among California adults. Suppose that census figures from 10 years ago showed the education levels and the proportions of California adults, as follows:

LEVEL	PROPORTION
1. Did not complete high school	.23
2. Completed high school only	.40
3. Some college or university	.15
4. College or university graduate	.22

Determine whether there has been a change in these proportions.



AMERICAN NATIONAL ELECTION SURVEY EXERCISE

- 15.17 [ANES2008*] According to the *Statistical Abstract of the United States 2012*, Table 56, the proportions for each category of marital status in 2007 was:

Never married (including partnered, not married)	26.9%
Married (including separated, but not divorced)	56.6%

Widowed 6.2%
Divorced 10.3%

Can we infer that the American National Election Survey in 2012 overrepresented at least one category of marital status (MARITAL)?



GENERAL SOCIAL SURVEY EXERCISES

According to the *Statistical Abstract of the United States 2012*, Table 10, the racial mix in the United States in 2012 was:

White 79%
Black 13%
Other 8%

- 15.18 [GSS2012*] Test to determine whether there is sufficient evidence that the General Social Survey in 2012 overrepresented at least one race (RACE).

- 15.19 [GSS2010*] Is there sufficient evidence to conclude that the General Social Survey in 2010 overrepresented at least one race (RACE)?

According to the *Statistical Abstract of the United States 2012*, Table 56, the proportions for each category of marital status in 2012 was:

Never married (including partnered, not married) 26.9%
Married (including separated, but not divorced) 56.6%
Widowed 6.2%
Divorced 10.3%

- 15.20 [GSS2012*] Can we infer that the General Social Survey in 2012 overrepresented at least one category of marital status (MARITAL)?

- 15.21 [GSS2010*] Is there sufficient evidence to conclude that the General Social Survey in 2010 overrepresented at least one category of marital status (MARITAL)?

15-2 CHI-SQUARED TEST OF A CONTINGENCY TABLE

In Chapter 2, we developed the **cross-classification table** as a first step in graphing the relationship between two nominal variables (see page 32). Our goal was to determine whether the two variables were related. In this section we extend the technique to statistical inference. We introduce another chi-squared test, this one designed to satisfy two different problem objectives. The **chi-squared test of a contingency table** is used to determine whether there is enough evidence to infer that two nominal variables are related and to infer that differences exist between two or more populations of nominal variables. Completing both objectives entails classifying items according to two different criteria. To see how this is done, consider the following example.

EXAMPLE 15.2

DATA
Xm15-02

Relationship between Undergraduate Degree and MBA Major

The MBA program was experiencing problems scheduling its courses. The demand for the program's optional courses and majors was quite variable from one year to the next. In one year, students seem to want marketing courses; in other years, accounting or finance are the rage. In desperation, the dean of the business school turned to a

statistics professor for assistance. The statistics professor believed that the problem may be the variability in the academic background of the students and that the undergraduate degree affects the choice of major. As a start, he took a random sample of last year's MBA students and recorded the undergraduate degree and the major selected in the graduate program. The undergraduate degrees were BA, BEng, BBA, and several others. There are three possible majors for the MBA students: accounting, finance, and marketing. The results were summarized in a cross-classification table, which is shown here. Can the statistician conclude that the undergraduate degree affects the choice of major?

Undergraduate Degree	MBA Major			Total
	Accounting	Finance	Marketing	
BA	31	13	16	60
BEng	8	16	7	31
BBA	12	10	17	39
Other	10	5	7	22
Total	61	44	47	152

SOLUTION:

One way to solve the problem is to consider that there are two variables: undergraduate degree and MBA major. Both are nominal. The values of the undergraduate degree are BA, BEng, BBA, and other. The values of MBA major are accounting, finance, and marketing. The problem objective is to analyze the relationship between the two variables. Specifically, we want to know whether one variable is related to the other.

Another way of addressing the problem is to determine whether differences exist between BA's, BEng's, BBA's, and others. In other words, we treat the holders of each undergraduate degree as a separate population. Each population has three possible values represented by the MBA major. The problem objective is to compare four populations. (We can also answer the question by treating the MBA majors as populations and the undergraduate degrees as the values of the random variable.)

As you will shortly discover, both objectives lead to the same test. Consequently, we address both objectives at the same time.

The null hypothesis will specify that there is no relationship between the two variables. We state this in the following way:

$$H_0: \text{The two variables are independent}$$

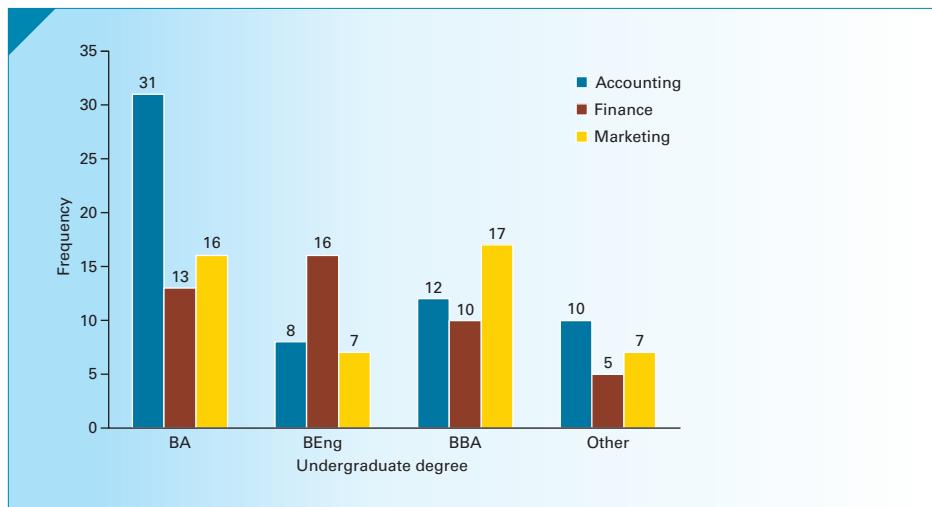
The alternative hypothesis specifies one variable affects the other, expressed as

$$H_1: \text{The two variables are dependent}$$

15-2a Graphical Technique

Figure 15.3 depicts the graphical technique introduced in Chapter 2 to show the relationship (if any) between the two nominal variables.

The bar chart displays the data from the sample. It does appear that there is a relationship between the two nominal variables in the sample. However, to draw inferences about the population of MBA students we need to apply an inferential technique.

FIGURE 15.3 Bar Chart for Example 15.2

15-2b Test Statistic

The test statistic is the same as the one used to test proportions in the goodness-of-fit test; that is, the test statistic is

$$\chi^2 = \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i}$$

where k is the number of cells in the cross-classification table. If you examine the null hypothesis described in the goodness-of-fit test and the one described above, you will discover a major difference. In the goodness-of-fit test, the null hypothesis lists values for the probabilities p_i . The null hypothesis for the chi-squared test of a contingency table only states that the two variables are independent. However, we need the probabilities to compute the expected values e_i , which in turn are needed to calculate the value of the test statistic. (The entries in the table are the observed values f_i .) The question immediately arises, From where do we get the probabilities? The answer is that they must come from the data after we assume that the null hypothesis is true.

In Chapter 6 we introduced independent events and showed that if two events A and B are independent, the joint probability $P(A \text{ and } B)$ is equal to the product of $P(A)$ and $P(B)$. That is,

$$P(A \text{ and } B) = P(A) \times P(B)$$

The events in this example are the values each of the two nominal variables can assume. Unfortunately, we do not have the probabilities of A and B. However, these probabilities can be estimated from the data. Using relative frequencies, we calculate the estimated probabilities for the MBA major.

$$P(\text{Accounting}) = \frac{61}{152} = .401$$

$$P(\text{Finance}) = \frac{44}{152} = .289$$

$$P(\text{Marketing}) = \frac{47}{152} = .309$$

We calculate the estimated probabilities for the undergraduate degree.

$$P(\text{BA}) = \frac{60}{152} = .395$$

$$P(\text{BEng}) = \frac{31}{152} = .204$$

$$P(\text{BBA}) = \frac{39}{152} = .257$$

$$P(\text{Other}) = \frac{22}{152} = .145$$

Assuming that the null hypothesis is true, we can compute the estimated joint probabilities. To produce the expected values, we multiply the estimated joint probabilities by the sample size, $n = 152$. The results are listed in a **contingency table**, the word *contingency* derived by calculating the expected values contingent on the assumption that the null hypothesis is true (the two variables are independent).

Undergraduate Degree	MBA Major			Total
	Accounting	Finance	Marketing	
BA	$152 \times \frac{60}{152} \times \frac{61}{152} = 24.08$	$152 \times \frac{60}{152} \times \frac{44}{152} = 17.37$	$152 \times \frac{60}{152} \times \frac{47}{152} = 18.55$	60
BEng	$152 \times \frac{31}{152} \times \frac{61}{152} = 12.44$	$152 \times \frac{31}{152} \times \frac{44}{152} = 8.97$	$152 \times \frac{31}{152} \times \frac{47}{152} = 9.59$	31
BBA	$152 \times \frac{39}{152} \times \frac{61}{152} = 15.65$	$152 \times \frac{39}{152} \times \frac{44}{152} = 11.29$	$152 \times \frac{39}{152} \times \frac{47}{152} = 12.06$	39
Other	$152 \times \frac{22}{152} \times \frac{61}{152} = 8.83$	$152 \times \frac{22}{152} \times \frac{44}{152} = 6.37$	$152 \times \frac{22}{152} \times \frac{47}{152} = 6.80$	22
Total	61	44	47	152

As you can see, the expected value for each cell is computed by multiplying the row total by the column total and dividing by the sample size. For example, the BA and Accounting cell expected value is

$$152 \times \frac{60}{152} \times \frac{61}{152} = \frac{60 \times 61}{152} = 24.08$$

All the other expected values would be determined similarly.

Expected Frequencies for a Contingency Table

The expected frequency of the cell in row i and column j is

$$e_{ij} = \frac{\text{row } i \text{ total} \times \text{column } j \text{ total}}{\text{sample size}}$$

The expected cell frequencies are shown in parentheses in the following table. As in the case of the goodness-of-fit test, the expected cell frequencies should satisfy the rule of five.

Undergraduate Degree	MBA Major		
	Accounting	Finance	Marketing
BA	31 (24.08)	13 (17.37)	16 (18.55)
BEng	8 (12.44)	16 (8.97)	7 (9.59)
BBA	12 (15.65)	10 (11.29)	17 (12.06)
Other	10 (8.83)	5 (6.37)	7 (6.80)

We can now calculate the value of the test statistic:

$$\begin{aligned}
 \chi^2 &= \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i} = \frac{(31 - 24.08)^2}{24.08} + \frac{(13 - 17.37)^2}{17.37} + \frac{(16 - 18.55)^2}{18.55} \\
 &\quad + \frac{(8 - 12.44)^2}{12.44} + \frac{(16 - 8.97)^2}{8.97} + \frac{(7 - 9.59)^2}{9.59} + \frac{(12 - 15.65)^2}{15.65} \\
 &\quad + \frac{(10 - 11.29)^2}{11.29} + \frac{(17 - 12.06)^2}{12.06} + \frac{(10 - 8.83)^2}{8.83} \\
 &\quad + \frac{(5 - 6.37)^2}{6.37} + \frac{(7 - 6.80)^2}{6.80} \\
 &= 14.70
 \end{aligned}$$

Notice that we continue to use a single subscript in the formula of the test statistic when we should use two subscripts, one for the rows and one for the columns. We believe that it is clear, that for each cell we must calculate the squared difference between the observed and expected frequencies divided by the expected frequency. We don't believe that the satisfaction of using the mathematically correct notation overcomes the unnecessary complication.

15-2c Rejection Region and *p*-Value

To determine the rejection region we must know the number of degrees of freedom associated with the chi-squared statistic. The number of degrees of freedom for a contingency table with r rows and c columns is $\nu = (r - 1)(c - 1)$. For this example, the number of degrees of freedom is $\nu = (r - 1)(c - 1) = (4 - 1)(3 - 1) = 6$.

If we employ a 5% significance level, the rejection region is

$$\chi^2 > \chi^2_{\alpha,\nu} = \chi^2_{0.05,6} = 12.6$$

Because $\chi^2 = 14.70$, we reject the null hypothesis and conclude that there is evidence of a relationship between undergraduate degree and MBA major.

The *p*-value of the test statistic is

$$P(\chi^2 > 14.70)$$

Unfortunately, we cannot determine the *p*-value manually.

Using the Computer

Excel and Minitab can produce the chi-squared statistic either from a cross-classification table whose frequencies have already been calculated or from raw data. The respective printouts are almost identical.

File Xm15-02 contains the raw data using the following codes:

Column1 (Undergraduate Degree)	Column 2 (MBA Major)
1 = BA	1 = Accounting
2 = BEng	2 = Finance
3 = BBA	3 = Marketing
4 = Other	

EXCEL

	A	B	C	D	E	F
1	Contingency Table					
2						
3		Degree				
4	MBA Major		1	2	3	TOTAL
5		1	31	13	16	60
6		2	8	16	7	31
7		3	12	10	17	39
8		4	10	5	7	22
9		TOTAL	61	44	47	152
10						
11						
12		chi-squared Stat			14.70	
13		df			6	
14		p-value			0.0227	
15		chi-squared Critical			12.5916	

INSTRUCTIONS (RAW DATA)

1. Type or import the data into two adjacent columns*. (Open Xm15-02.) The codes must be positive integers greater than 0.
2. Click **Add-Ins**, **Data Analysis Plus**, and **Contingency Table (Raw Data)**.
3. Specify the **Input Range** (**A1:B153**) and specify the value of α (.05).

INSTRUCTIONS (COMPLETED TABLE)

1. Type the frequencies into adjacent columns.
2. Click **Add-Ins**, **Data Analysis Plus**, and **Contingency Table**.
3. Specify the **Input Range**. Click **Labels** if the first row and first column of the input range contain the names of the categories. Specify the value for α .

MINITAB

Tabulated statistics: Degree, MBA Major						
Rows: Degree Columns: MBA Major						
1	2	3	All			
1	31	13	16	60		
2	8	16	7	31		
3	12	10	17	39		
4	10	5	7	22		
All	61	44	47	152		
Cell Contents:						
Count						
Pearson Chi-Square = 14.702, DF = 6, PValue = 0.023						
Likelihood Ratio Chi-Square = 13.781, DF = 6, PValue = 0.032						

INSTRUCTIONS (RAW DATA)

1. Type or import the data into two columns. (Open Xm15-02.)
2. Click **Stat**, **Tables**, and **Cross Tabulation and Chi-Square** . . .

(Continued)

* If one or both columns contain an empty cell (representing missing data), the entire row must be removed. See Keller's website appendix Removing Empty Cells in Excel.

3. In the **Categorical variables** box, select or type the variables **For rows** (**Degree**) and **For columns** (**MBA Major**). Click **Chi-Square . . .**.
4. Under **Display** click **Chi-Square analysis**. Specify **Chi-Square analysis**.

INSTRUCTIONS (COMPLETED TABLE)

1. Type the observed frequencies into adjacent columns.
2. Click **Stat, Tables**, and **Chi-Square Test (Table in Worksheet) . . .**
3. Select or type the names of the variables representing the columns.

INTERPRET

There is strong evidence to infer that the undergraduate degree and MBA major are related. This suggests that the dean can predict the number of optional courses by counting the number of MBA students with each type of undergraduate degree. We can see that BA's favor accounting courses, BEng's prefer finance, BBAs are partial to marketing, and others show no particular preference.

If the null hypothesis is true, undergraduate degree and MBA major are independent of one another. This means that whether an MBA student earned a BA, BEng, BBA, or other degree does not affect his or her choice of major program in the MBA. Consequently, there is no difference in major choice among the graduates of the undergraduate programs. If the alternative hypothesis is true, undergraduate degree does affect the choice of MBA major. Thus, there are differences between the four undergraduate degree categories.

15-2d Rule of Five

In the previous section, we pointed out that the expected values should be at least 5 to ensure that the chi-squared distribution provides an adequate approximation of the sampling distribution. In a contingency table where one or more cells have expected values of less than 5, we need to combine rows or columns to satisfy the rule of five. This subject is discussed in Keller's website Appendix Rule of Five.

15-2e Data Formats

In Example 15.2, the data were stored in two columns, one column containing the values of one nominal variable and the second column storing the values of the second nominal variable. The data can be stored in another way. In Example 15.2, we could have recorded the data in three columns, one column for each MBA major. The columns would contain the codes representing the undergraduate degree. Alternatively, we could have stored the data in four columns, one column for each undergraduate degree. The columns would contain the codes for the MBA majors. In either case, we have to count the number of each value and construct the cross-tabulation table using the counts. Both Excel and Minitab can calculate the chi-squared statistic and its *p*-value from the cross-tabulation table. We will illustrate this approach with the solution to the chapter-opening example.

General Social Survey

Has Support for Capital Punishment for Murderers Remained Constant Since 2006? Solution

IDENTIFY

The problem objective is to compare public opinion in four different years. The variable is nominal because its values are Favor and Oppose, represented by 1 and 2, respectively. The appropriate technique is the chi-squared test of a contingency table. The hypotheses are:

H_0 : The two variables are independent.

H_1 : The two variables are dependent.

In this application, the two variables are year (2006, 2008, 2010, and 2012) and the answer to the question posed by the General Social Survey (Favor and Oppose).

Unlike Example 15.2, the data are not stored in two columns. To produce the statistical result, we will need to count the number of Americans in favor and the number opposed in each of the four years. The following table was determined by counting the numbers of 1s and 2s for each year.

	YEAR				
	2006	2008	2010	2012	
Favor	1885	1263	1297	1183	
Oppose	930	639	624	641	

COMPUTE

A	B	C	D	E	F
1 Contingency Table					
2					
3	Year 2006	Year 2008	Year 2010	Year 2012	TOTAL
4 Favor	1885	1263	1297	1183	5628
5 Oppose	930	639	624	641	2834
6 TOTAL	2815	1902	1921	1824	8462
7					
8 chi-squared Stat			3.379		
9 df			3		
10 p-value			0.3368		
11 chi-squared Critical			7.8147		

INTERPRET

The p -value is .3368. There is not enough evidence to infer that the two variables are independent. Thus, there is not enough evidence to conclude that support for capital punishment for murder varies from year to year.



Bob Daemmrich/PhotoEdit

Here is a summary of the factors that tell us when to apply the chi-squared test of a contingency table. Note that there are two problem objectives satisfied by this statistical procedure.

Factors That Identify the Chi-Squared Test of a Contingency Table

1. **Problem objectives:** Analyze the relationship between two variables and compare two or more populations
2. **Data type:** Nominal



EXERCISES

Developing an Understanding of Statistical Concepts

- 15.22** Conduct a test to determine whether the two classifications L and M are independent, using the data in the accompanying cross-classification table. (Use $\alpha = .05$.)

	M₁	M₂
L₁	28	68
L₂	56	36

- 15.23** Repeat Exercise 15.22 using the following table:

	M₁	M₂
L₁	14	34
L₂	28	18

- 15.24** Repeat Exercise 15.22 using the following table:

	M₁	M₂
L₁	7	17
L₂	14	9

- 15.25** Review the results of Exercises 15.22–15.24. What is the effect of decreasing the sample size?

- 15.26** Conduct a test to determine whether the two classifications R and C are independent, using the data in the accompanying cross-classification table. (Use $\alpha = .10$.)

	C₁	C₂	C₃
R₁	40	32	48
R₂	30	48	52

Applications

Use a 5% significance level unless specified otherwise.

- 15.27** The trustee of a company's pension plan has solicited the opinions of a sample of the company's employees about a proposed revision of the plan.

A breakdown of the responses is shown in the accompanying table. Is there enough evidence to infer that the responses differ between the three groups of employees?

Responses	Blue-Collar Workers	White-Collar Workers	Managers
For	67	32	11
Against	63	18	9

- 15.28** The operations manager of a company that manufactures shirts wants to determine whether there are differences in the quality of workmanship among the three daily shifts. She randomly selects 600 recently made shirts and carefully inspects them. Each shirt is classified as either perfect or flawed, and the shift that produced it is also recorded. The accompanying table summarizes the number of shirts that fell into each cell. Do these data provide sufficient evidence to infer that there are differences in quality between the three shifts?

Shirt Condition	Shift		
	1	2	3
Perfect	240	191	139
Flawed	10	9	11

- 15.29** One of the issues that came up in a recent national election (and is likely to arise in many future elections) is how to deal with a sluggish economy. Specifically, should governments cut spending, raise taxes, inflate the economy (by printing more money) or do none of the above and let the deficit rise? And as with most other issues, politicians need to know which parts of the electorate support these options. Suppose that a random sample of 1,000 people was asked which option they support and their political affiliations. The possible responses to the question about political affiliation were Democrat, Republican, and Independent (which included a variety of political

persuasions). The responses are summarized in the accompanying table. Do these results allow us to conclude at the 1% significance level that political affiliation affects support for the economic options?

Economic Options	Political Affiliation		
	Democrat	Republican	Independent
Cut spending	101	282	61
Raise taxes	38	67	25
Inflate the economy	131	88	31
Let deficit increase	61	90	25

- 15.30** Econetics Research Corporation, a well-known Montreal-based consulting firm, wants to test how it can influence the proportion of questionnaires returned from surveys. In the belief that the inclusion of an inducement to respond may be important, the firm sends out 1,000 questionnaires: Two hundred promise to send respondents a summary of the survey results, 300 indicate that 20 respondents (selected by lottery) will be awarded gifts, and 500 are accompanied by no inducements. Of these, 80 questionnaires promising a summary, 100 questionnaires offering gifts, and 120 questionnaires offering no inducements are returned. What can you conclude from these results?

Exercises 15.31–15.46 require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level unless specified otherwise.

- 15.31** **Xm02-04** (Example 2.4 revisited) A major North American city has four competing newspapers: the *Globe and Mail* (G&M), *Post*, *Sun*, and *Star*. To help design advertising campaigns, the advertising managers of the newspapers need to know which segments of the newspaper market are reading their papers. A survey was conducted to analyze the relationship between newspapers read and occupation. A sample of newspaper readers was asked to report which newspaper they read: *Globe and Mail* (1) *Post* (2), *Star* (3), *Sun* (4), and to indicate whether they were blue-collar workers (1), white-collar workers (2), or professionals (3). Can we infer that occupation and newspaper are related?

- 15.32** **Xr15-32** An investor who can correctly forecast the direction and size of changes in foreign currency exchange rates is able to reap huge profits in the international currency markets. A knowledgeable reader of the *Wall Street Journal* (in particular, of the currency futures market quotations) can determine the direction of change in various exchange rates that is predicted by all investors, viewed collectively. Predictions from 216 investors, together with the subsequent actual directions of change, were recorded in the following way: Column 1: predicted

change where 1 = positive and 2 = negative; column 2: actual change where 1 = positive and 2 = negative.

- Can we infer at the 10% significance level that a relationship exists between the predicted and actual directions of change?
- To what extent would you make use of these predictions in formulating your forecasts of future exchange rate changes?

- 15.33** **Xr02-43** (Exercise 2.43 revisited) Is there brand loyalty among car owners in their purchases of gasoline? To help answer the question, a random sample of car owners was asked to record the brand of gasoline in their last two purchases: 1 = Exxon, 2 = Amoco, 3 = Texaco, 4 = Other. Can we conclude that there is brand loyalty in gasoline purchases?

- 15.34** **Xr15-34** During the past decade, many cigarette smokers have attempted to quit. Unfortunately, nicotine is highly addictive. Smokers use a large number of different methods to help them quit. These include nicotine patches, hypnosis, and various forms of therapy. A researcher for the Addiction Research Council wanted to determine why some people quit while others attempted to quit but failed. He surveyed 1,000 people who planned to quit smoking. He determined their educational level and whether they continued to smoke 1 year later. Educational level was recorded in the following way:

- 1 = Did not finish high school
- 2 = High school graduate
- 3 = University or college graduate
- 4 = Completed a postgraduate degree

A continuing smoker was recorded as 1; a quitter was recorded as 2. Can we infer that the amount of education is a factor in determining whether a smoker will quit?

- 15.35** **Xr15-35** Because television audiences of newscasts tend to be older (and because older people suffer from a variety of medical ailments), pharmaceutical companies' advertising often appears on national news on the three networks (ABC, CBS, and NBC). To determine how effective the ads are a survey was undertaken. Adults over 50 were asked about their primary sources of news. The responses are

1. ABC News
2. CBS News
3. NBC News
4. Newspapers
5. Radio
6. None of the above

Each person was also asked whether they suffer from heartburn, and if so, what remedy they take. The answers were recorded as follows:

1. Do not suffer from heartburn
2. Suffer from heartburn but take no remedy

3. Suffer from heartburn and take an over-the-counter remedy (e.g., Tums, Gavoscol)
4. Suffer from heartburn and take a prescription pill (e.g., Nexium)

Is there a relationship between an adult's source of news and his or her heartburn condition?

- 15.36** **Xr02-42** (Exercise 2.42 revisited) The associate dean of a business school was looking for ways to improve the quality of the applicants to its MBA program. In particular, she wanted to know whether the undergraduate degree of applicants differed among her school and the three nearby universities with MBA programs. She sampled 100 applicants of her program and an equal number from each of the other universities. She recorded their undergraduate degrees (1 = BA, 2 = BEng, 3 = BBA, 4 = other) as well as universities (codes 1, 2, 3, and 4). Do these data provide sufficient evidence to infer that undergraduate degree and the university each person applied are related?

- 15.37** **Xr15-37** The relationship between drug companies and medical researchers is under scrutiny because of possible conflict of interest. The issue that started the controversy was a 1995 case control study that suggested that the use of calcium-channel blockers to treat hypertension led to an increase risk of heart disease. This led to an intense debate both in technical journals and in the press. Researchers writing in the *New England Journal of Medicine* ("Conflict of Interest in the Debate over Calcium Channel Antagonists," January 8, 1998, p. 101) looked at the 70 reports that appeared during 1996–1997, classifying them as favorable, neutral, or critical toward the drugs. The researchers then contacted the authors of the reports and questioned them about financial ties to drug companies. The results were recorded in the following way:

Column 1: Results of the scientific study;
1 = favorable, 2 = neutral, 3 = critical

Column 2: 1 = financial ties to drug companies,
2 = no ties to drug companies

Do these data allow us to infer that the research findings for calcium-channel blockers are affected by whether the research is funded by drug companies?

- 15.38** **Xr15-38** After a thorough analysis of the market, a publisher of business and economics statistics books has divided the market into three general approaches to teach applied statistics. These are (1) use of a computer and statistical software with no manual calculations, (2) traditional teaching of concepts and solution of problems by hand, and (3) mathematical approach with emphasis on

derivations and proofs. The publisher wanted to know whether this market could be segmented on the basis of the educational background of the instructor. As a result, the statistics editor organized a survey that asked 195 professors of business and economics statistics to report their approach to teaching and which one of the following categories represents their highest degree:

1. Business (MBA or Ph.D. in business)
 2. Economics
 3. Mathematics or engineering
 4. Other
- a. Can the editor infer that there are differences in type of degree among the three teaching approaches? If so, how can the editor use this information?
 - b. Suppose that you work in the marketing department of a textbook publisher. Prepare a report for the editor that describes this analysis.

- 15.39** **Xr15-39** Every year, there are more than 300,000 robberies in the United States. A researcher took a random sample of robberies in 2000, 2005, and 2010, and recorded the weapon used (1 = Firearm, 2 = Knife or other cutting instrument, 3 = Other, 4 = No weapon). Is there sufficient evidence to infer that the frequency of the use of weapons in robberies differed over the three years?

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 321.

- 15.40** **Xr15-40** Refer to Exercise 12.145. The engineering team took samples of bridges in 2004, 2006, 2008, and 2010 and recorded whether each bridge was structurally deficient, functionally obsolete, or structurally sound. These three categories were recorded as 1, 2, and 3, respectively. Do these data allow us to conclude that the deteriorating condition of American bridges has changed over the years?

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 1090.

- 15.41** **Xr15-41** Household types are categorized in the following way: 1. Married couple with children, 2. Married couple without children, 3. Single parent, 4. One person, 5. Other. Random samples of families in the United States, Canada, and the United Kingdom were drawn and the household types recorded. Is the sufficient evidence to infer that there are differences in household types between the three countries?

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 1338.

- 15.42** **Xr15-42** Refer to Exercise 15.41. Random samples from Denmark, Ireland, the Netherlands, and Sweden were drawn. Is the sufficient evidence to

infer that there are differences in household types between the four countries?

Source: Adapted from *Statistical Abstract of the United States*, 2012, Table 1338.

- 15.43** **Xr15-43** A statistics practitioner took random samples from Canada, Australia, New Zealand, and the United Kingdom, and classified each person as either obese (2) or not (1). Can we conclude from these data that there are differences in obesity rates between the four Commonwealth nations?

Source: Adapted from *Statistical Abstract of the United States* 2012, Table 1342.

- 15.44** **Xr15-44** To measure the extent of cigarette smoking around the world, random samples of adults in Denmark, Finland, Norway, and Sweden were drawn. Each was asked whether he or she smoked (2 = Yes, 1 = No). Can we conclude that there are differences in smoking between the four Scandinavian countries?

Source: Adapted from *Statistical Abstract of the United States* 2012, Table 1343.

- 15.45** **Xr15-45** Refer to Exercise 15.44. The survey was performed in Canada, Australia, New Zealand, and

the United Kingdom. Is there enough evidence to infer that there are differences in adult cigarette smoking between the four Commonwealth countries?

Source: Adapted from *Statistical Abstract of the United States* 2012, Table 1343.

- 15.46** **Xr15-46** In 2013, the Supreme Court of the United States ruled on a California law that banned same-sex marriage. An important element of that decision was public opinion. In March, Public Policy Polling conducted a survey of Florida voters and asked each to identify themselves as either: 1. Democrat, 2. Republican, or 3. Independent, and to choose one of the following:

1. Gay couples should be allowed to marry legally.
2. Gay couples should be allowed to form civil unions but not marry.
3. There should be no legal recognition of a gay couple's relationship.

The results were recorded. Is there sufficient evidence to infer that the three political persuasions differ?



GENERAL SOCIAL SURVEY EXERCISES

Excel users should note that any row containing one or two empty cells must be removed. Use a 5% significance level.

- 15.47** **GSS2012*** An important element in the business of politics is to know who supports you and who doesn't. Is there sufficient evidence to infer that men and women (SEX: 1 = Male, 2 = Female) differ in their support of the political groups (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican)?

- 15.48** **GSS2012*** Do foreign-born Americans differ from Americans born in the United States (BORN: 1 = Born in the U.S., 2 = Born elsewhere) in their support of political groups (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican)?

- 15.49** **GSS2012*** Is it a myth that men are more conservative and women more liberal? Conduct a test to determine if men and women (SEX: 1 = Male, 2 = Female) differ in their political views (POLVIEWS3: 1 = Liberal, 2 = Moderate, 3 = Conservative).

- 15.50** **GSS2012*** Do Americans who work for themselves (WRKSLF: 1 = Self-employed, 2 = Someone else) support the same political groups (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican) as Americans who work for some else? Conduct a statistical test to answer the question.

- 15.51** **GSS2012*** Are government workers more or less conservative than people who work in the private sector? Is there sufficient evidence to conclude that government workers (WRKGGOVT: 1 = Government, 2 = Someone else) differ from private-sector workers in terms of their political views (POLVIEWS3: 1 = Liberal, 2 = Moderate, 3 = Conservative)?

- 15.52** **GSS2006* GSS2008* GSS2010* GSS2012*** The issue of gun control in the United States is one that often debated particularly during elections. The question arises, what does the public think about the issue and does support vary from year to year? Test to determine whether there is enough evidence to conclude that support for gun laws (GUNLAW: 1 = Favor, 2 = Oppose) varied from year to year.

- 15.53** **GSS2012*** In the last two decades, an increasing proportion of women have entered the workforce. Determine whether there is enough evidence to conclude that men and women (SEX) differ in their work status (WRKSTAT).

- 15.54** **GSS2012*** Is there sufficient evidence to infer that support for capital punishment (CAPPUN: 1 = Favor, 2 = Oppose) is related to political affiliation (PARTYID3: 1 = Democrat, 2 = Republican, 3 = Independent)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users should note that any row containing one or two empty cells must be removed. Use a 5% significance level.

For each of the following variables, conduct a test to determine whether there are differences between the three political party affiliations (PARTY3: 1 = Democrat, 2 = Republican, 3 = Independent).

- 15.55 [ANES2008*](#) Know where to vote (KNOW)
- 15.56 [ANES2008*](#) Read about campaign in newspaper (READ)
- 15.57 [ANES2008*](#) Have health insurance (HEALTH)
- 15.58 [ANES2008*](#) Have access to the Internet (ACCESS)

15-3 / SUMMARY OF TESTS ON NOMINAL DATA

At this point in the textbook, we've described four tests that are used when the data are nominal:

- z -test of p (Section 12-3)
- z -test of $p_1 - p_2$ (Section 13-5)
- Chi-squared goodness-of-fit test (Section 15-1)
- Chi-squared test of a contingency table (Section 15-2)

In the process of presenting these techniques, it was necessary to concentrate on one technique at a time and focus on the kinds of problems each addresses. However, this approach tends to conflict somewhat with our promised goal of emphasizing the "when" of statistical inference. In this section, we summarize the statistical tests on nominal data to ensure that you are capable of selecting the correct method.

There are two critical factors in identifying the technique used when the data are nominal. The first, of course, is the problem objective. The second is the number of categories that the nominal variable can assume. Table 15.1 provides a guide to help select the correct technique.

TABLE 15.1 Statistical Techniques for Nominal Data

PROBLEM OBJECTIVE	NUMBER OF CATEGORIES	STATISTICAL TECHNIQUE
Describe a population	2	z -test of p or the chi-squared goodness-of-fit test
Describe a population	More than 2	Chi-squared goodness-of-fit test
Compare two populations	2	z -test of $p_1 - p_2$ or chi-squared test of a contingency table
Compare two populations	More than 2	Chi-squared test of a contingency table
Compare two or more populations	2 or more	Chi-squared test of a contingency table
Analyze the relationship between two variables	2 or more	Chi-squared test of a contingency table

Notice that when we describe a population of nominal data with exactly two categories, we can use either of two techniques. We can employ the z -test of p or the chi-squared goodness-of-fit test. These two tests are equivalent because if there are only two categories, the multinomial experiment is actually a binomial experiment (one of the categorical outcomes is labeled *success*, and the other is labeled *failure*). Mathematical statisticians have established that if we square the value of z , the test statistic for the test of p , we produce the χ^2 -statistic; that is, $z^2 = \chi^2$. Thus, if we want to conduct a two-tail test of a population proportion, we can employ either technique. However, the chi-squared goodness-of-fit test can test only to determine whether the hypothesized values of p_1 (which we can label p) and p_2 (which we call $1 - p$) are not equal to their specified values. Consequently, to perform a one-tail test of a population proportion, we must use the z -test of p . (This issue was discussed in Chapter 14 when we pointed out that we can use either the t -test of $\mu_1 - \mu_2$ or the analysis of variance to conduct a test to determine whether two population means differ.)

When we test for differences between two populations of nominal data with two categories, we can also use either of two techniques: the z -test of $p_1 - p_2$ (Case 1) or the chi-squared test of a contingency table. Once again, we can use either technique to perform a two-tail test about $p_1 - p_2$. (Squaring the value of the z -statistic yields the value of the χ^2 -statistic.) However, one-tail tests must be conducted by the z -test of $p_1 - p_2$. The rest of the table is quite straightforward. Notice that when we want to compare two populations when there are more than two categories, we use the chi-squared test of a contingency table.

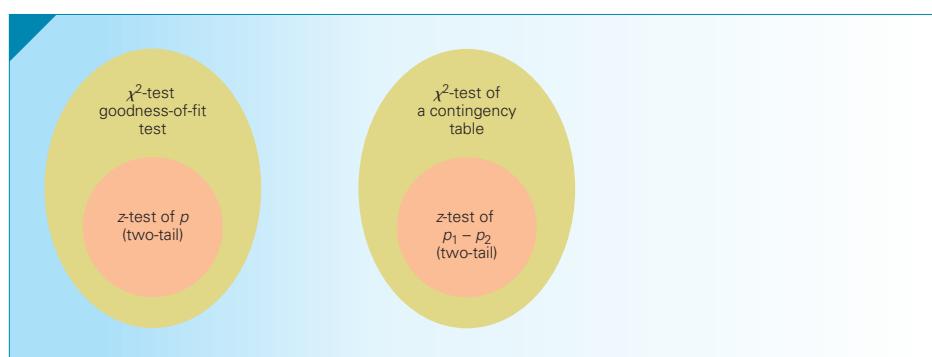
Figure 15.4 offers another summary of the tests that deal with nominal data introduced in this book. There are two groups of tests: those that test hypotheses about single populations and those that test either for differences or for independence. In the first set, we have the z -test of p , which can be replaced by the chi-squared test of a multinomial experiment. The latter test is employed when there are more than two categories.

To test for differences between two proportions, we apply the z -test of $p_1 - p_2$. Instead we can use the chi-squared test of a contingency table, which can be applied to a variety of other problems.

15-3a Developing an Understanding of Statistical Concepts

Table 15.1 and Figure 15.4 summarize how we deal with nominal data. We determine the frequency of each category and use these frequencies to compute test statistics. We can then compute proportions to calculate z -statistics or use the frequencies to calculate χ^2 -statistics. Because squaring a standard normal random variable produces a chi-squared variable, we can employ either statistic to test for differences. As a consequence, when you encounter nominal data in the problems described in this book (and other

FIGURE 15.4 Tests on Nominal Data



introductory applied statistics books), the most logical starting point in selecting the appropriate technique will be either a z -statistic or a χ^2 -statistic. However, you should know that there are other statistical procedures that can be applied to nominal data, techniques that are not included in this book.

15-4 / (OPTIONAL) CHI-SQUARED TEST FOR NORMALITY

We can use the goodness-of-fit test presented in Section 15-1 in another way. We can test to determine whether data were drawn from any distribution. The most common application of this procedure is a test of normality.

In the examples and exercises shown in Section 15-1, the probabilities specified in the null hypothesis were derived from the question. In Example 15.1, the probabilities p_1, p_2 , and p_3 were the market shares before the advertising campaign. To test for normality (or any other distribution), the probabilities must first be calculated using the hypothesized distribution. To illustrate, consider Example 12.1, where we tested the mean amount of discarded newspaper using the Student t distribution. The required condition for this procedure is that the data must be normally distributed. To determine whether the 148 observations in our sample were indeed taken from a normal distribution, we must calculate the theoretical probabilities assuming a normal distribution. To do so, we must first calculate the sample mean and standard deviation: $\bar{x} = 2.18$ and $s = .981$. Next, we find the probabilities of an arbitrary number of intervals. For example, we can find the probabilities of the following intervals:

- Interval 1: $X \leq .709$
- Interval 2: $.709 < X \leq 1.69$
- Interval 3: $1.69 < X \leq 2.67$
- Interval 4: $2.67 < X \leq 3.65$
- Interval 5: $X > 3.65$

We will discuss the reasons for our choices of intervals later.

The probabilities are computed using the normal distribution and the values of \bar{x} and s as estimators of μ and σ . We calculated the sample mean and standard deviation as $\bar{x} = 2.18$ and $s = .981$. Thus,

$$\begin{aligned} P(X \leq .709) &= P\left(\frac{X - \mu}{\sigma} \leq \frac{.709 - 2.18}{.981}\right) = P(Z \leq -1.5) = .0668 \\ P(.709 < X \leq 1.69) &= P\left(\frac{.709 - 2.18}{.981} < \frac{X - \mu}{\sigma} \leq \frac{1.69 - 2.18}{.981}\right) \\ &= P(-1.5 < Z \leq -.5) = .2417 \\ P(1.69 < X \leq 2.67) &= P\left(\frac{1.69 - 2.18}{.981} < \frac{X - \mu}{\sigma} \leq \frac{2.67 - 2.18}{.981}\right) \\ &= P(-.5 < Z \leq .5) = .3829 \\ P(2.67 < X \leq 3.65) &= P\left(\frac{2.67 - 2.18}{.981} < \frac{X - \mu}{\sigma} \leq \frac{3.65 - 2.18}{.981}\right) \\ &= P(.5 < Z \leq 1.5) = .2417 \\ P(X > 3.65) &= P\left(\frac{X - \mu}{\sigma} > \frac{3.65 - 2.18}{.981}\right) = P(Z > 1.5) = .0668 \end{aligned}$$

To test for normality is to test the following hypotheses:

$$H_0: p_1 = .0668, p_2 = .2417, p_3 = .3829, p_4 = .2417, p_5 = .0668$$

H_1 : At least two proportions differ from their specified values

We complete the test as we did in Section 15-1, except that the number of degrees of freedom associated with the chi-squared statistic is the number of intervals minus 1 minus the number of parameters estimated, which in this illustration is two. (We estimated the population mean μ and the population standard deviation σ .) Thus, in this case, the number of degrees of freedom is $k - 1 - 2 = 5 - 1 - 2 = 2$.

The expected values are

$$\begin{aligned} e_1 &= np_1 = 148(.0668) = 9.89 \\ e_2 &= np_2 = 148(.2417) = 35.78 \\ e_3 &= np_3 = 148(.3829) = 56.67 \\ e_4 &= np_4 = 148(.2417) = 35.78 \\ e_5 &= np_5 = 148(.0668) = 9.89 \end{aligned}$$

The observed values are determined manually by counting the number of values in each interval. Thus,

$$\begin{aligned} f_1 &= 10 \\ f_2 &= 36 \\ f_3 &= 54 \\ f_4 &= 39 \\ f_5 &= 9 \end{aligned}$$

The chi-squared statistic is

$$\begin{aligned} \chi^2 &= \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i} = \frac{(10 - 9.89)^2}{9.89} + \frac{(36 - 35.78)^2}{35.78} + \frac{(54 - 56.67)^2}{56.67} \\ &\quad + \frac{(39 - 35.78)^2}{35.78} + \frac{(9 - 9.89)^2}{9.89} \\ &= .50 \end{aligned}$$

The rejection region is

$$\chi^2 > \chi^2_{\alpha, k-3} = \chi^2_{.05, 2} = 5.99$$

There is not enough evidence to conclude that these data are not normally distributed.

15-4a Class Intervals

In practice you can use any intervals you like. We chose the intervals we did to facilitate the calculation of the normal probabilities. The number of intervals was chosen to comply with the rule of five, which requires that all expected values be at least equal to 5. Because the number of degrees of freedom is $k - 3$, the minimum number of intervals is $k = 4$.

Using the Computer

EXCEL

	A	B	C	D
1	Chi-Squared Test of Normality			
2				
3		Newspaper		
4	Mean	2.18		
5	Standard deviation	0.981		
6	Observations	148		
7				
8	Intervals	Probability	Expected	Observed
9	($z \leq -1.5$)	.0668	9.89	10
10	($-1.5 < z \leq -0.5$)	.2417	35.78	36
11	($-0.5 < z \leq 0.5$)	.3829	56.67	54
12	($0.5 < z \leq 1.5$)	.2417	35.78	39
13	($z > 1.5$)	.0668	9.89	9
14				
15				
16	chi-squared Stat	0.50		
17	df	2		
18	p-value	0.7792		
19	chi-squared Critical	5.9915		

We programmed Excel to calculate the value of the test statistic so that the expected values are at least 5 (where possible) and the minimum number of intervals is 4. Hence, if the number of observations is more than 220, the intervals and probabilities are

Interval	Probability
$Z \leq -2$.0228
$-2 < Z \leq -1$.1359
$-1 < Z \leq 0$.3413
$0 < Z \leq 1$.3413
$1 < Z \leq 2$.1359
$Z > 2$.0228

If the sample size is less than or equal to 220 and greater than 80, the intervals are

Interval	Probability
$Z \leq -1.5$.0668
$-1.5 < Z \leq -0.5$.2417
$-0.5 < Z \leq 0.5$.3829
$0.5 < Z \leq 1.5$.2417
$Z > 1.5$.0668

If the sample size is less than or equal to 80, we employ the minimum number of intervals, 4. When the sample size is less than 32, at least one expected value will be less than 5. The intervals are

Interval	Probability
$Z \leq -1$.1587
$-1 < Z \leq 0$.3413
$0 < Z \leq 1$.3413
$Z > 1$.1587

INSTRUCTIONS

- Type or import the data into one column. (Open Xm12-01.)
- Click **Add-Ins, Data Analysis Plus**, and **Chi-Squared Test of Normality**.
- Specify the **Input Range** (A1:A149) and the value of $\alpha(.05)$.

MINITAB

Minitab does not conduct this procedure.

15-4b Interpreting the Results of a Chi-Squared Test for Normality

In the example above, we found that there was little evidence to conclude that the weight of discarded newspaper is not normally distributed. However, had we found evidence of nonnormality, this would not necessarily invalidate the t -test we conducted in Example 12.1. As we pointed out in Chapter 12, the t -test of a mean is a robust procedure, which means that only if the variable is extremely nonnormal and the sample size is small can we conclude that the technique is suspect. The problem here is that if the sample size is large and the variable is only slightly nonnormal, the chi-squared test for normality will, in many cases, conclude that the variable is not normally distributed. However, if the variable is even quite nonnormal and the sample size is large, the t -test will still be valid. Although there are situations in which we need to know whether a variable is nonnormal, we continue to advocate that the way to decide if the normality requirement for almost all statistical techniques applied to interval data is satisfied is to draw histograms and look for shapes that are far from bell shaped (e.g., highly skewed or bimodal). We will use this approach in Chapter 19 when we introduce nonparametric techniques that are used when interval data are nonnormal.



EXERCISES

- 15.59** Suppose that a random sample of 100 observations was drawn from a population. After calculating the mean and standard deviation, each observation was standardized and the number of observations in each of the following intervals was counted. Can we infer at the 5% significance level that the data were not drawn from a normal population?

Interval	Frequency
$Z \leq 1.5$	10
$-1.5 < Z \leq -0.5$	18
$-0.5 < Z \leq 0.5$	48
$0.5 < Z \leq 1.5$	16
$Z > 1.5$	8

- 15.60** A random sample of 50 observations yielded the following frequencies for the standardized intervals:

Interval	Frequency
$Z \leq -1$	6
$-1 < Z \leq 0$	27
$0 < Z \leq 1$	14
$Z > 1$	3

Can we infer that the data are not normal? (Use $\alpha = .10$.)

The following exercises require the use of a computer and software.

- 15.61** [Xr12-31](#) Refer to Exercise 12.31. Test at the 10% significance level to determine whether the amount of time spent working at part-time jobs is normally distributed. If there is evidence of nonnormality, is the t -test invalid?
- 15.62** [Xr12-37](#) The t -test in Exercise 12.37 requires that the costs of prescriptions is normally distributed. Conduct a test with $\alpha = .05$ to determine whether the required condition is unsatisfied. If there is enough evidence to conclude that the requirement is not satisfied, does this indicate that the t -test is invalid?
- 15.63** [Xr13-25](#) Exercise 13.25 required you to conduct a t -test of the difference between two means. Each samples productivity data are required to be normally distributed. Is that required condition violated? Test with $\alpha = .05$.
- 15.64** [Xr13-26](#) Exercise 13.26 asked you to conduct a t -test of the difference between two means (reaction times). Test to determine whether there is enough evidence to infer that the reaction times are not normally distributed. A 5% significance level is judged to be suitable.
- 15.65** [Xr13-59](#) In Exercise 13.103, you performed a test of the mean matched pairs difference. Test with a 10% significance level to determine whether the normality requirement is violated.

CHAPTER SUMMARY

This chapter introduced three statistical techniques. The first is the chi-squared goodness-of-fit test, which is applied when the problem objective is to describe a single population of nominal data with two or more categories. The second is

the chi-squared test of a contingency table. This test has two objectives: to analyze the relationship between two nominal variables and to compare two or more populations of nominal data. The last procedure is designed to test for normality.

IMPORTANT TERMS:

Multinomial experiment	592
Chi-squared goodness-of-fit test	593
Expected frequency	593
Observed frequencies	594

Cross-classification table	599
Chi-squared test of a contingency table	599
Contingency table	602

SYMBOLS:

Symbol	Pronounced	Represents
f_i	f sub i	Frequency of the i th category
e_i	e sub i	Expected value of the i th category
χ^2	Chi squared	Test statistic

FORMULA:

Test statistic for all procedures

$$\chi^2 = \sum_{i=1}^k \frac{(f_i - e_i)^2}{e_i}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Chi-squared goodness-of-fit test	595	596
Chi-squared test of a contingency table (raw data)	604	604
Chi-squared test of a contingency table	604	604
Chi-squared test of normality	615	616

CHAPTER EXERCISES

Use a 5% significance level, unless specified otherwise.

- 15.66** An organization dedicated to ensuring fairness in television game shows is investigating *Wheel of Fortune*. In this show, three contestants are required to solve puzzles by selecting letters. Each contestant gets to select the first letter and continues selecting until he or she chooses a letter that is not in the hidden word, phrase, or name. The order of contestants is random. However, contestant 1 gets to start game 1, contestant 2 starts game 2, and so on. The contestant who wins the most money is declared the winner and he or she is given an opportunity to win

a grand prize. Usually, more than three games are played per show, and as a result it appears that contestant 1 has an advantage: contestant 1 will start two games, whereas contestant 3 will usually start only one game. To see whether this is the case, a random sample of 30 shows was taken and the starting position of the winning contestant for each show was recorded. These are shown in the following table:

Starting position	1	2	3
-------------------	---	---	---

Number of wins	14	10	6
----------------	----	----	---

Do the tabulated results allow us to conclude that the game is unfair?

- 15.67** It has been estimated that employee absenteeism costs North American companies more than \$100 billion per year. As a first step in addressing the rising cost of absenteeism, the personnel department of a large corporation recorded the weekdays during which individuals in a sample of 362 absentees were away over the past several months. Do these data suggest that absenteeism is higher on some days of the week than on others?

Day of the Week	Monday	Tuesday	Wednesday	Thursday	Friday
Number					
absent	87	62	71	68	74

- 15.68** Suppose that the personnel department in Exercise 15.42 continued its investigation by categorizing absentees according to the shift on which they worked, as shown in the accompanying table. Is there sufficient evidence at the 10% significance level of a relationship between the days on which employees are absent and the shift on which the employees work?

Shift	Monday	Tuesday	Wednesday	Thursday	Friday
Day	52	28	37	31	33
Evening	35	34	34	37	41

- 15.69** A management behavior analyst has been studying the relationship between male/female supervisory structures in the workplace and the level of employees' job satisfaction. The results of a recent survey are shown in the accompanying table. Is there sufficient evidence to infer that the level of job satisfaction depends on the boss/employee gender relationship?

BOSS/EMPLOYEE				
Level of Satisfaction	Female/ Male	Female/ Female	Male/ Male	Male/ Female
Satisfied	21	25	54	71
Neutral	39	49	50	38
Dissatisfied	31	48	10	11

The following exercises require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics. Use a 5% significance level, unless specified otherwise.

- 15.70** **Xr15-70** Stress is a serious medical problem that costs businesses and government billions of dollars annually. As a result, it is important to determine the causes and possible cures. It would be helpful to know whether the causes are universal or do they vary from country to country. In a survey, American and Canadian adults were asked to report their primary source of stress in their lives. The responses are:

1 = Job, 2 = Finances, 3 = Health
4 = Family life, 5 = Other

The data were recorded using these codes plus 1 = American and 2 = Canadian. Do these data provide sufficient evidence to conclude that Americans and Canadians differ in their sources of stress?

- 15.71** **Xr15-71** More than 3,000 Americans quit smoking each day. Because nicotine is one of the most addictive drugs, quitting smoking is a difficult and frustrating task. It usually takes several tries before success is achieved. There are various methods, including cold turkey, nicotine patch, hypnosis, and group therapy sessions. In an experiment to determine how these methods differ, a random sample of smokers who have decided to quit is selected. Each smoker has chosen one of the methods listed above. After one year, the respondents report whether they have quit (1 = Yes, 2 = No) and which method they used (1 = Cold turkey, 2 = Nicotine patch, 3 = Hypnosis, 4 = Group therapy sessions). Is there sufficient evidence to conclude that the four methods differ in their success?

- 15.72** **Xr15-72** A newspaper publisher trying to pinpoint his market's characteristics wondered whether the way people read a newspaper is related to the reader's educational level. A survey asked adult readers which section of the paper they read first and asked to report their highest educational level. These data were recorded (column 1 = First section read where 1 = Front page, 2 = Sports, 3 = Editorial, and 4 = Other) and column 2 = Educational level where 1 = Did not complete high school, 2 = High school graduate, 3 = University or college graduate, and 4 = Postgraduate degree). What do these data tell the publisher about how educational level affects the way adults read the newspaper?

- 15.73** Every week, the Florida Lottery draws six numbers between 1 and 49. Lottery ticket buyers are naturally interested in whether certain numbers are drawn more frequently than others. To assist players, the *Sun-Sentinel* publishes the number of times each of the 49 numbers has been drawn in the past 52 weeks. The numbers and the frequency with which each occurred were recorded.
- If the numbers are drawn from a uniform distribution, what is the expected frequency for each number?
 - Can we infer that the data were not generated from a uniform distribution?

In Section 15-4, we showed how to test for normality. However, we can use the same process to test for any other distribution.

- 15.74** **Xr15-74** A scientist believes that the gender of a child is a binomial random variable with probability = .5 for a boy and .5 for a girl. To help test her belief, she randomly samples 100 families with five children. She records the number of boys. Can the scientist infer that the number of boys in families with five children is not a binomial random variable with $p = .5$? (*Hint:* Find the probability of $X = 0, 1, 2, 3, 4$, and 5 from a binomial distribution with $n = 5$ and $p = .5$.)
- 15.75** **Xr15-75** Given the high cost of medical care, research that points the way to avoid illness is welcome. Previously performed research tells us that stress affects the immune system. Two scientists at Carnegie Mellon Hospital in Pittsburgh asked 114 healthy adults about their social circles; they were asked to list every group they had contact with at least once every 2 weeks—family, coworkers, neighbors, friends, religious groups, and community groups. Participants also reported negative life events over the past year, events such as death of a friend or relative, divorce, or job-related problems. The participants were divided into four groups:

- Group 1: Highly social and highly stressed
- Group 2: Not highly social and highly stressed
- Group 3: Highly social and not highly stressed
- Group 4: Not highly social and not highly stressed

Each individual was classified in this way. In addition, whether each person contracted a cold over the next 12 weeks was recorded (1 = Cold, 2 = No cold). Can we infer that there are differences between the four groups in terms of contracting a cold?

The following exercises employ data files associated with examples and exercises seen earlier in this book.

- 15.76** **Xr12-105*** Exercise 12.105 described the problem of a looming shortage of professors, possibly made worse by professors desiring to retire before the age of 65. A survey asked a random sample of professors whether he or she intended to retire before 65. The responses are 1 = No and 2 = Yes. In addition, the survey asked to which faculty did the professor belong (1 = Arts, 2 = Science, 3 = Business, 4 = Engineering, 5 = Other). Do

these provide sufficient evidence to infer that whether a professor wishes to retire is related to the faculty?

- 15.77** **Xr12-109*** Refer to Exercise 12.109. Determine whether there is enough evidence to infer that there are differences in the choice of Christmas tree between the three age categories.
- 15.78** **Xr12-111*** Exercise 12.111 described a study to determine whether viewers (older than 50) of the network news had contacted their physician to ask about one of the prescription drugs advertised during the newscast. The responses (1 = No, 2 = Yes) were recorded. Also recorded were which of the three networks they normally watch (1 = ABC, 2 = CBS, 3 = NBC). Can we conclude that there are differences in responses between the three network news shows?
- 15.79** **Xr13-160*** Exercise 13.160 described a survey of adults wherein, on the basis of several probing questions, each was classified as either a member of the health conscious group (code = 1) or not (code = 2) and whether he or she buys Special X (1 = No, 2 = Yes). Additionally, his or her educational attainment (1 = Did not finish high school, 2 = Finished high school, 3 = Finished college or university, 4 = Postgraduate degree) was recorded.
- Do the data allow the surveyor to conclude that there differences in educational attainment between those who do and those who do not belong to the health conscious group?
 - Can we infer that there is a relationship between the four educational groups and whether or not a person buys Special X?
- 15.80** **Xm12-05*** Example 12.5 described exit polls wherein people are asked whether they voted for the Democrat or Republican candidate for president. The surveyors also record gender (1 = Female, 2 = Male), educational attainment (1 = Did not finish high school, 2 = Completed high school, 3 = Completed college or university, 4 = Postgraduate degree), and income level (1 = Under \$25,000, 2 = \$25,000 to \$49,999, 3 = \$50,000 to \$75,000, 4 = over \$75,000).
- Is there sufficient evidence to infer that voting and gender are related?
 - Do the data allow the conclusion that voting and educational level are related?
 - Can we infer that voting and income are related?

APPLICATIONS in MARKETING

Richard Brown/Taxi/Getty Images

Market Segmentation

In Section 12-4 and in Chapters 13 and 14, we described how marketing managers use statistical analyses to estimate the size of market segments and to determine whether there are differences between segments.

The following exercises require the application of the chi-squared test of a contingency table to determine whether market segments differ with respect to some nominal variable.

- 15.81** *Xr12-138** Exercise 12.138 described the market segments defined by JC Penney. Another question included in the questionnaire that classified the women surveyed was asked whether each worked outside the home. The responses were:

1. No
2. Part-time job
3. Full-time job

These data plus the classifications (1 = Conservative, 2 = Traditional, 3 = Contemporary) were recorded. Can we infer from these data that there are differences in employment status between the three market segments?

- 15.82** *Xr12-138** Refer to Exercise 12.138. The women in the survey were also asked to define value by identifying what they considered to be the most important attribute of value. The responses are:

1. Price
2. Quality
3. Fashion

The responses and the classifications of segments (1 = Conservative, 2 = Traditional, 3 = Contemporary) were recorded. Do these data allow us to infer that there are differences in the definition of value between the three market segments?

- 15.83** *Xm12-06** Refer to Example 12.6. In segmenting the breakfast cereal market, a food manufacturer uses health and diet consciousness as the segmentation variable. Four segments are developed:

1. Concerned about eating healthy foods
2. Concerned primarily about weight
3. Concerned about health because of illness
4. Unconcerned

A survey was undertaken and each person was asked how often they ate a healthy breakfast (defined as cereal and/or fruit). The responses are:

1. Never
2. Seldom
3. Often
4. Always

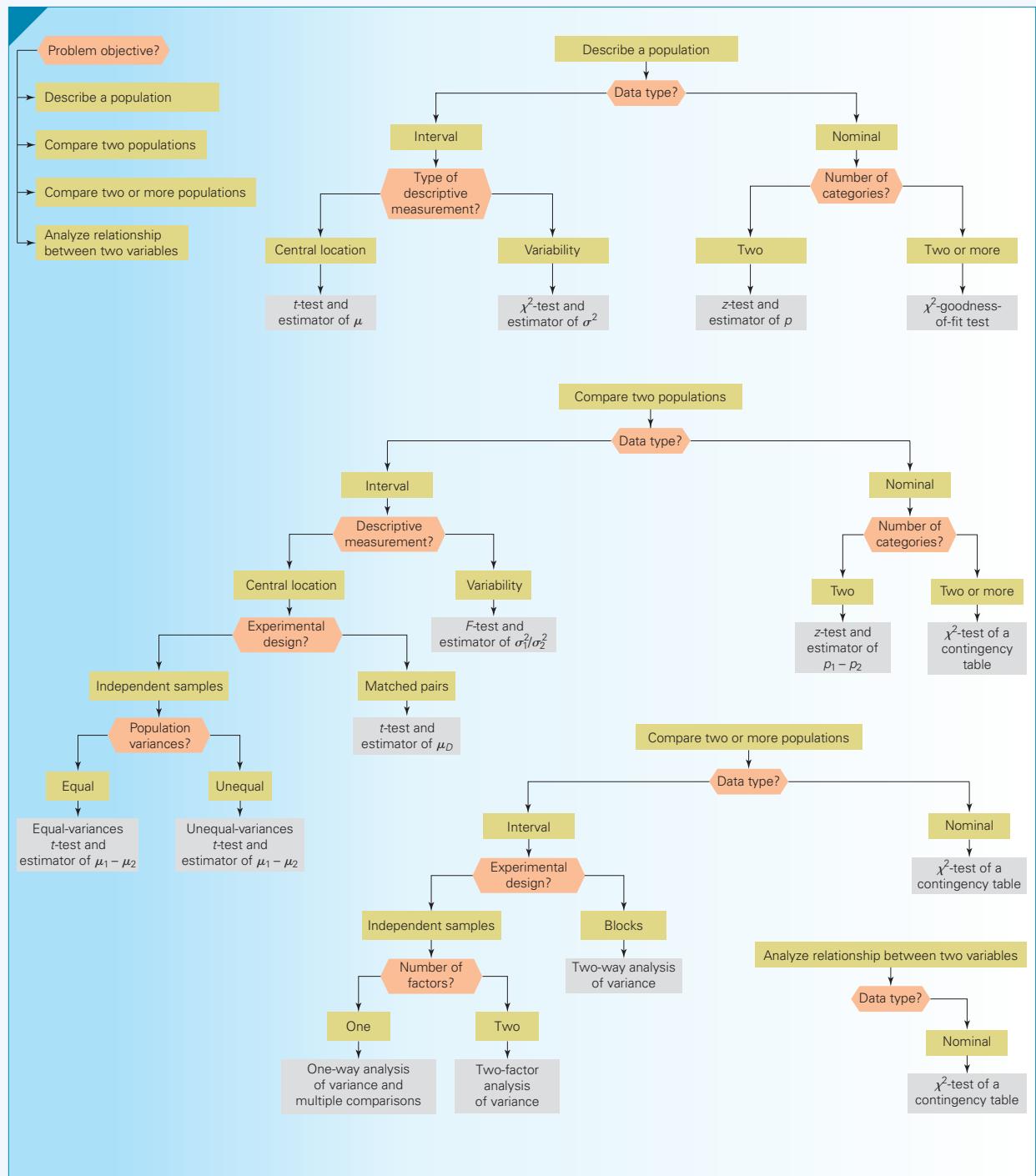
The responses and the market segments of each respondent were recorded. Can we infer that there are differences in frequency of healthy breakfasts between the market segments?

APPENDIX 15 / REVIEW OF CHAPTERS 12 TO 15

Here are the updated list of statistical techniques (Table A15.1) and the flowchart (Figure A15.1) for Chapters 12 to 15. Counting the two techniques of chi-squared tests introduced here (we do not include the chi-squared test for normality), we have covered 22 statistical methods.

TABLE A15.1 Summary of Statistical Techniques in Chapter 12 to 15

<i>t</i> -test of μ
Estimator of μ (including estimator of $N\mu$)
χ^2 -test of σ^2
Estimator of σ^2
<i>z</i> -test of p
Estimator of p (including estimator of Np)
Equal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
<i>t</i> -test of μ_D
Estimator of μ_D
<i>F</i> -test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
<i>z</i> -test of $p_1 - p_2$ (Case 1)
<i>z</i> -test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$
One-way analysis of variance (including multiple comparisons)
Two-way (randomized blocks) analysis of variance
Two-factor analysis of variance
χ^2 -goodness-of-fit test
χ^2 -test of a contingency table

FIGURE A15.1 Summary of Statistical Techniques in Chapters 12 to 15



EXERCISES

We remind you that we do not specify significance levels in the exercise that follow. Choose your own.

- A15.1** [XrA15-01](#) An analysis of the applicants of all MBA programs in North America reveals that the proportions of each type of undergraduate degree are as follows:

Undergraduate Degree	Proportion (%)
BA (1)	50
BBA (2)	20
BSc (3)	15
BEng (4)	10
Other (5)	5

The director of Wilfrid Laurier University's (WLU's) MBA program recorded the undergraduate degree of the applicants for this year using the codes in parentheses. Do these data indicate that applicants to WLU's MBA program are different in terms of their undergraduate degrees from the population of MBA applicants?

- A15.3** [XrA15-02](#) The experiment to determine the effect of taking a preparatory course to improve SAT scores in Exercise A13.16 was criticized by other statisticians. They argued that the first test would provide a valuable learning experience that would produce a higher test score from the second exam even without the preparatory course. Consequently, another experiment was performed. Forty students wrote the SAT without taking any preparatory course. At the next scheduled exam (3 months later), these same students took the exam again (again with no preparatory course). The scores for both exams were recorded in columns 1 (first test scores) and 2 (second test scores). Can we infer that repeating the SAT produces higher exam scores even without the preparatory course?

- A15.4** [XrA15-03](#) How does dieting affect the brain? This question was addressed by researchers in Australia. The experiment used 40 middle-age women in Adelaide, Australia; half were on a diet and half were not (*National Post*, December 1, 2003). The mental arithmetic part of the experiment required the participants to add two three-digit numbers. The amount of time taken to solve the 48 problems was recorded. The participants were given another test that required them to repeat a string of five letters they had been told 10 seconds earlier. They were asked to repeat the test with five words told to them

10 seconds earlier. The data were recorded in the following way:

Column 1: Identification number
 Column 2: 1 = dieting, 2 = not dieting
 Column 3: Time to solve 48 problems (seconds)
 Column 4: Repeat string of 5 letters (1 = no, 2 = yes)
 Column 5: Repeat string of 5 words (1 = no, 2 = yes)

Is there sufficient evidence to infer that dieting adversely affects the brain?

- A15.5** [XrA15-04](#) A small but important part of a university library's budget is the amount collected in fines on overdue books. Last year, a library collected \$75,652.75 in fine payments; however, the head librarian suspects that some employees are not bothering to collect the fines on overdue books. In an effort to learn more about the situation, she asked a sample of 400 students (out of a total student population of 50,000) how many books they had returned late to the library in the previous 12 months. They were also asked how many days overdue the books had been. The results indicated that the total number of days overdue ranged from 0 to 55 days. The number of days overdue was recorded.
- Estimate with 95% confidence the average number of days overdue for all 50,000 students at the university.
 - If the fine is 25 cents per day, estimate the amount that should be collected annually. Should the librarian conclude that not all the fines were collected?

- A15.6** [XrA15-05](#) An apple juice manufacturer has developed a new product—a liquid concentrate that produces 1 liter of apple juice when mixed with water. The product has several attractive features. First, it is more convenient than bottled apple juice, which is the way apple juice is currently sold. Second, because the apple juice that is sold in cans is actually made from concentrate, the quality of the new product is at least as high as that of bottled apple juice. Third, the cost of the new product is slightly lower than that of bottled apple juice. The marketing manager has to decide how to market the new product. She can create advertising that emphasizes convenience, quality, or price. To facilitate a decision, she conducts an experiment in three different small cities. In one city, she launches the product with advertising stressing the convenience of the liquid concentrate (e.g., easy to carry from store

to home and takes up less room in the freezer). In the second city, the advertisements emphasize the quality of the product (“average” shoppers are depicted discussing how good the apple juice tastes). Advertising that highlights the relatively low cost of the liquid concentrate is used in the third city. The number of packages sold weekly is recorded for the 20 weeks following the beginning of the campaign. The marketing manager wants to know whether differences in sales exist between the three advertising strategies. (We will assume that except for the type of advertising, the three cities are identical.)

- A15.7** **XrA15-06** Mutual funds are a popular way of investing in the stock market. A financial analyst wanted to determine the effect income had on ownership of mutual funds and whether the relationship had changed from four years earlier. She took a random sample of adults 25 years of age and older and asked each person whether he or she owned mutual funds (No = 1 and Yes = 2) and to report the annual household income. The categories are

1. Less than \$25,000
2. \$25,000 to \$34,999
3. \$35,000 to \$49,999
4. \$50,000 to \$74,999
5. \$75,000 to \$100,000
6. More than \$100,000

Can we infer from the data that household income and ownership of mutual funds are related?

Source: Adapted from the *Statistical Abstract of the United States, 2006*, Table 1200.

- A15.7** **XrA15-07** Refer to Exercise A15.5. Suppose that in addition to varying the marketing strategy, the manufacturer also decided to advertise in one of the two media that are available: television and newspapers. As a consequence, the experiment was repeated in the following way. Six different small cities were selected. In city 1, the marketing emphasized convenience, and all the advertising was conducted on television. In city 2, marketing also emphasized convenience, but all the advertising was conducted in the daily newspaper. Quality was emphasized in cities 3 and 4. City 3 learned about the product from television commercials, and city 4 saw newspaper advertising. Price was the marketing emphasis in cities 5 and 6. City 5 saw television commercials, and city 6 saw newspaper advertisements. In each city, the weekly sales for each of 10 weeks were recorded. What conclusions can be drawn from these data?

- A15.8** **XrA15-08** After a recent study, researchers reported on the effects of folic acid on the occurrence of spina bifida—a birth defect in which there is incomplete formation of the spine. A sample of 2,000 women who

gave birth to children with spina bifida and who were planning another pregnancy was recruited. Before attempting to get pregnant again, half the sample was given regular doses of folic acid, and the other half was given a placebo. After 18 months, researchers recorded the result for each woman: 1 = birth to normal baby, 2 = birth to baby with spina bifida, 3 = not pregnant or no baby yet delivered. Can we infer that folic acid reduces the incidence of spina bifida in newborn babies?

- A15.9** **XrA15-09** Slow play of golfers is a serious problem for golf clubs. Slow play results in fewer rounds of golf and less profits for public course owners. To examine this problem, a random sample of British and American golf courses was selected. The amount of time taken (in minutes) was recorded for a random sample of British and American golfers. Can we conclude that British golfers play golf in less time than do American golfers?

Source: *Golf Magazine*, July 2001.

- A15.10** **XrA15-10** The United States and Canada (among others) are countries in which a significant proportion of citizens are immigrants. Many arrive in North America with few assets but quickly adapt to a changed economic environment. The question often arises, How quickly do immigrants increase their standard of living? A study initiated by Statistics Canada surveyed three different types of families:

1. Immigrants who arrived before 1976
2. Immigrants who came to Canada after 1986
3. Canadian-born families

The survey measured family wealth, which includes houses, cars, income, and savings and recorded the results (in \$1,000s). Can we infer that differences exist between the three groups? If so, what are those differences?

- A15.11** **XrA15-11** During the decade of the 1980s, professional baseball thrived in North America. However, in the 1990s attendance dropped, and the number of television viewers also decreased. To examine the popularity of baseball relative to other sports, surveys were performed. In 1985 and again in 1992, a Harris Poll asked a random sample of 500 people to name their favorite sport. The results, which were published in the *Wall Street Journal* (July 6, 1993), were recorded in the following way: favorite sport (1 = professional football, 2 = baseball, 3 = professional basketball, 4 = college basketball, 5 = college football, 6 = golf, 7 = auto racing, 8 = tennis, and 9 = other); year (1 = 1985, 2 = 1992). Do these results indicate that North Americans changed their favorite sport between 1985 and 1992?

A15.12 **XrA15-12** In an attempt to learn more about traffic congestion in a large North American city, the number of cars passing through intersections was determined (*National Post*, October 18, 2006). The number of cars was counted in 5-minute samples throughout several days. The counts for one busy intersection were recorded. Estimate with 95% confidence the mean number of cars in 5 minutes. Use the result to estimate the counts for a 24-hour day.

A15.13 **XrA15-13** Organizations that sponsor various leisure activities need to know the number of people who wish to participate. Bureaucrats need to know the number because many organizations apply for government grants to pay the costs. The U.S. National Endowment for the Arts conducts surveys of American adults to acquire this type of information. One part of the survey asked a random sample of adults whether they participated in exercise programs. The responses (1 = yes and 2 = no) were recorded. A recent census reveals that there are 205.9 million adults in the United States. Estimate with 95% confidence the number of American adults who participate in exercise programs.

Source: Adapted from the *Statistical Abstract of the United States*, 2006, Table 1227.

A15.14 **XrA15-14** Low back pain is a common medical problem that sometimes results in disability and absence from work. Any method of treatment that decreases absence would be welcome by individuals and insurance companies. A randomized control study (published in *Annals of Internal Medicine*, January 2004) was undertaken to determine whether an alternate form of treatment is

effective. The study examined 134 workers who were absent from work because of low back pain. Half the sample was assigned to graded activity, a physical exercise program designed to stimulate rapid return to work. The other half was assigned to the usual care, which involves mostly rest. For each worker, the number of days absent from work because of low back pain in the following 6 months was recorded. Do these data provide sufficient evidence to infer that the graded activity is effective?

A15.15 **XrA15-15** Clinical depression is a serious and sometimes debilitating disease. It is often treated by antidepressants such as Prozac and Zoloft. Recent studies may indicate another possible remedy. Researchers took a random sample of people who are clinically depressed and divided them into three groups. The first group was treated with antidepressants and light therapy, the second was treated with a placebo and light therapy, and the third group treated with a placebo. Whether the patient showed improvement (code = 1) or not (code = 2) and the group number were recorded. Can we infer that there are differences between the three groups?

A15.16 How well do airlines keep to their schedules? To help answer this question, an economist conducted a survey of 780 takeoffs in the United States and determined that 77.4% of them departed on time (defined as a departure that is within 15 minutes of its scheduled time). There were 7,140,596 flight departures in the United States in 2005. Estimate with 95% confidence the total number of on-time departures.



GENERAL SOCIAL SURVEY EXERCISES

15.17 **GSS2006 GSS2008*** During 2008, the United States was in the throes of a deep recession. The unemployment rate rose sharply. How did this affect job tenure (the amount of time a worker has been with his or her current employer)? Is there sufficient evidence to conclude that job tenure changed between 2006 (YEARSJOB) and 2008 (CUREMPYR)?

15.18 **GSS2008*** Capital punishment for murderers exists in most U.S. states. However, a few states ban this form of punishment. Politicians often need to know which members of the public support and which oppose. Can we conclude from the data that there is a difference between Democrats, Republicans, and Independents (PARTYID: 0, 1 = Democrat, 2, 3, 4 = Independent, 5,

6 = Republican) in terms of support for capital punishment (CAPPUN)?

15.19 **GSS2008*** Are married couples postponing bearing children? One way to measure this is to determine how old people are when their first child is born. Estimate with 95% confidence the average age of Americans when their first child is born (AGEKDBRN).

15.20 **GSS2008*** In Chapter 2, we used a graphical technique and data from the American National Election Survey to attempt to determine whether men and women differ in their political affiliation. Use a suitable statistical inference technique to determine whether there is sufficient evidence to infer that men and women (SEX) differ in their political affiliations (PARTYID).

A15.21 Do teenage and adult children living with their parents contribute to household income by holding down full- or part-time jobs? And is it more likely that they do so for affluent than for less affluent families? To answer the question, test to determine whether the data allow us to conclude that there are differences in the number of family members earning money (EARNRS) between the four classes (CLASS).

A15.22 [GSS2002*](#) [GSS2004*](#) [GSS2006*](#) A generally accepted method of finding whether Americans have improved financially over a multiyear period is to calculate inflation-adjusted incomes. Using the General Social Survey data, can we infer that American inflation-adjusted incomes (CONRINC) varied from year to year in 2002, 2004, and 2006?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

A15.25 [ANES2008*](#) In recent years, the proportion of eligible voters in the United States who actually vote for president has hovered around 50%. Turning out the vote is considered a critical function for most political voters. Are there differences between Liberals and Conservatives in their intention to vote? Conduct a test to determine whether there is sufficient evidence to infer that liberals and conservatives (LIBCON: 1, 2, 3 = liberal, 5, 6, 7 = conservative) differ in their intention to vote (DEFINITE).

A15.23 [GSS2008*](#) Does the race of an individual affect whether he or she is likely to be self-employed? Can we conclude that differences in whether an individual works for him- or herself (WRKSLF: 1 = Self-employed, 2 = Someone else) exists between the races (RACE)?

A15.24 [GSS2008*](#) Does being unemployed for any period of time affect an individual's political persuasion? Using the GSS 2008 data, determine whether there is enough evidence to infer that Americans who have been unemployed in the last 10 years (UNEMP) have different party affiliations (PARTYID: 0, 1 = Democrat, 2, 3, 4 = Independent, 5, 6 = Republican) than those who have not been unemployed.

A15.26 [ANES2004*](#) [ANES2008*](#) The economy in 2004 was strong, with growth in the economy and unemployment low. By 2008, the U.S. economy was in recession. Can we conclude that employment status (EMPLOY) has changed between 2004 and 2008?

A15.27 [ANES2008*](#) Do the data provide sufficient evidence to conclude that Americans who consider themselves strong Democrat or Republicans (STRENGTH: 1 = Strong, 5 = Not very strong) have more education (EDUC) than those who do not?

CASE A15.1**Which Diets Work?**

DATA
CA15-01

Every year, millions of people start new diets. There is a bewildering array of diets to choose from. The question for many people is, which ones work? Researchers at Tufts University in Boston made an attempt to point dieters in the right direction. Four diets were used:

1. Atkins low-carbohydrate diet
2. Zone high-protein, moderate-carbohydrate diet
3. Weight Watchers diet
4. Dr. Ornish's low-fat diet

The study recruited 160 overweight people and randomly assigned 40 to each diet. The average weight before

dieting was 220 pounds, and all needed to lose between 30 and 80 pounds. All volunteers agreed to follow their diets for 2 months. No exercise or regular meetings were required. The following variables were recorded for each dieter using the format shown here:

Column 1: Identification number

Column 2: Diet

Column 3: Percent weight loss

Column 4: Percent low-density lipoprotein (LDL)—"bad" cholesterol—decrease

Column 5: Percent high-density lipoprotein (HDL)—"good" cholesterol—increase

Column 6: Quit after 2 months?

1 = yes, 2 = no

Column 7: Quit after 1 year? 1 = yes, 2 = no

Is there enough evidence to conclude that there are differences between the diets with respect to

- a. percent weight loss?
- b. percent LDL decrease?
- c. percent HDL increase?
- d. proportion quitting within 2 months?
- e. proportion quitting after 1 year?

16



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SIMPLE LINEAR REGRESSION AND CORRELATION

- 16-1 *Model*
- 16-2 *Estimating the Coefficients*
- 16-3 *Error Variable: Required Conditions*
- 16-4 *Assessing the Model*
- 16-5 *Using the Regression Equation*
- 16-6 *Regression Diagnostics—I*
- Appendix 16 *Review of Chapters 12 to 16*

Education and Income: How Are They Related?

DATA

GSS2012*

You are probably a student in an undergraduate or graduate business or economics program. Your plan is to graduate, get a good job, and draw a high salary. You have probably assumed that more education equals better job equals higher income. Is this true? Fortunately, the General Social Survey recorded two variables that will help determine whether education and income are related and, if so, what the value of an additional year of education might be.



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Getty Images

On page 657, we will provide our answer.

INTRODUCTION

Regression analysis is used to predict the value of one variable on the basis of other variables. This technique may be the most commonly used statistical procedure because, as you can easily appreciate, almost all companies and government institutions forecast variables such as product demand, interest rates, inflation rates, prices of raw materials, and labor costs.

The technique involves developing a mathematical equation or model that describes the relationship between the variable to be forecast, which is called the **dependent variable**, and variables that the statistics practitioner believes are related to the dependent variable. The dependent variable is denoted as Y , whereas the related variables are called **independent variables** and are denoted as X_1, X_2, \dots, X_k (where k is the number of independent variables).

If we are interested only in determining whether a relationship exists, we employ correlation analysis, a technique that we have already introduced. In Chapter 3, we presented the graphical method to describe the association between two interval variables—the scatter diagram. We introduced the coefficient of correlation and covariance in Chapter 4.

Because regression analysis involves many new techniques and concepts, we divided the presentation into three chapters. In this chapter, we present techniques that allow us to determine the relationship between only two variables. In Chapter 17, we expand our discussion to more than two variables; in Chapter 18, we discuss how to build regression models.

Here are three illustrations of the use of regression analysis.

Illustration 1 The product manager in charge of a particular brand of children's breakfast cereal would like to predict the demand for the cereal during the next year. To use regression analysis, she and her staff list the following variables as likely to affect sales:

- Price of the product
- Number of children 5 to 12 years of age (the target market)
- Price of competitors' products
- Effectiveness of advertising (as measured by advertising exposure)
- Annual sales this year
- Annual sales in previous years

Illustration 2 A gold speculator is considering a major purchase of gold bullion. He would like to forecast the price of gold 2 years from now (his planning horizon), using regression analysis. In preparation, he produces the following list of independent variables:

- Interest rates
- Inflation rate
- Price of oil
- Demand for gold jewelry
- Demand for industrial and commercial gold
- Dow Jones Industrial Average

Illustration 3 A real estate agent wants to predict the selling price of houses more accurately. She believes that the following variables affect the price of a house:

- Size of the house (number of square feet)
- Number of bedrooms

Frontage of the lot
Condition
Location

In each of these illustrations, the primary motive for using regression analysis is forecasting. Nonetheless, analyzing the relationship among variables can also be quite useful in managerial decision making. For instance, in the first application, the product manager may want to know how price is related to product demand so that a decision about a prospective change in pricing can be made.

Regardless of why regression analysis is performed, the next step in the technique is to develop a mathematical equation or model that accurately describes the nature of the relationship that exists between the dependent variable and the independent variables. This stage—which is only a small part of the total process—is described in the next section. In the ensuing sections of this chapter (and in Chapter 17), we will spend considerable time assessing and testing how well the model fits the actual data. Only when we're satisfied with the model do we use it to estimate and forecast.

16-1 / MODEL

The job of developing a mathematical equation can be quite complex, because we need to have some idea about the nature of the relationship between each of the independent variables and the dependent variable. The number of different mathematical models that could be proposed is virtually infinite. Here is an example from Chapter 4.

$$\begin{aligned} \text{Profit} = & (\text{Price per unit} - \text{variable cost per unit}) \\ & \times \text{Number of units sold} - \text{Fixed costs} \end{aligned}$$

You may encounter the next example in a finance course:

$$F = P(1 + i)^n$$

where

F = future value of an investment

P = principle or present value

i = interest rate per period

n = number of periods

These are all examples of **deterministic models**, so named because such equations allow us to determine the value of the dependent variable (on the left side of the equation) from the values of the independent variables. In many practical applications of interest to us, deterministic models are unrealistic. For example, is it reasonable to believe that we can determine the selling price of a house solely on the basis of its size? Unquestionably, the size of a house affects its price, but many other variables (some of which may not be measurable) also influence price. What must be included in most practical models is a method to represent the randomness that is part of a real-life process. Such a model is called a **probabilistic model**.

To create a probabilistic model, we start with a deterministic model that approximates the relationship we want to model. We then add a term that measures the random error of the deterministic component.

Suppose that in illustration 3, the real estate agent knows that the cost of building a new house is about \$100 per square foot and that most lots sell for about \$100,000. The approximate selling price would be

$$y = 100,000 + 100x$$

where y = selling price and x = size of the house in square feet. A house of 2,000 square feet would therefore be estimated to sell for

$$y = 100,000 + 100(2,000) = 300,000$$

We know, however, that the selling price is not likely to be exactly \$300,000. Prices may actually range from \$200,000 to \$400,000. In other words, the deterministic model is not really suitable. To represent this situation properly, we should use the probabilistic model

$$y = 100,000 + 100x + \varepsilon$$

where ε (the Greek letter epsilon) represents the **error variable**—the difference between the actual selling price and the estimated price based on the size of the house. The error thus accounts for all the variables, measurable and immeasurable, that are not part of the model. The value of ε will vary from one sale to the next, even if x remains constant. In other words, houses of exactly the same size will sell for different prices because of differences in location and number of bedrooms and bathrooms, as well as other variables.

In the three chapters devoted to regression analysis, we will present only probabilistic models. In this chapter, we describe only the straight-line model with one independent variable. This model is called the **first-order linear model**—sometimes called the **simple linear regression model**.*

First-Order Linear Model

$$y = \beta_0 + \beta_1 x + \varepsilon$$

where

y = dependent variable

x = independent variable

β_0 = y -intercept

β_1 = slope of the line (defined as rise/run)

ε = error variable

The problem objective addressed by the model is to analyze the relationship between two variables, x and y , both of which must be interval. To define the relationship between x and y , we need to know the value of the coefficients β_0 and β_1 . However, these coefficients are population parameters, which are almost always unknown. In the next section, we discuss how these parameters are estimated.

*We use the term *linear* in two ways. The “linear” in linear regression refers to the form of the model wherein the terms form a linear combination of the coefficients β_0 and β_1 . Thus, for example, the model $y = \beta_0 + \beta_1 x^2 + \varepsilon$ is a linear combination whereas $y = \beta_0 + \beta_1^2 x + \varepsilon$ is not. The simple linear regression model $y = \beta_0 + \beta_1 x + \varepsilon$ describes a straight-line or linear relationship between the dependent variable and one independent variable. In this book, we use the linear regression technique only. Hence, when we use the word *linear* we will be referring to the straight-line relationship between the variables.

16-2 / ESTIMATING THE COEFFICIENTS

We estimate the parameters β_0 and β_1 in a way similar to the methods used to estimate all the other parameters discussed in this book. We draw a random sample from the population of interest and calculate the sample statistics we need. However, because β_0 and β_1 represent the coefficients of a straight line, their estimators are based on drawing a straight line through the sample data. The straight line that we wish to use to estimate β_0 and β_1 is the “best” straight line—best in the sense that it comes closest to the sample data points. This best straight line, called the *least squares line*, is derived from calculus and is represented by the following equation:

$$\hat{y} = b_0 + b_1x$$

Here b_0 is the y -intercept, b_1 is the slope, and \hat{y} is the predicted or fitted value of y . In Chapter 4, we introduced the **least squares method**, which produces a straight line that minimizes the sum of the squared differences between the points and the line. The coefficients b_0 and b_1 are calculated so that the sum of squared deviations

$$\sum_{i=1}^n (y_i - \hat{y}_i)^2$$

is minimized. In other words, the values of \hat{y} on average come closest to the observed values of y . The calculus derivation is available in Keller’s website appendix, Deriving the Normal Equations, which shows how the following formulas, first shown in Chapter 4, were produced.

Least Squares Line Coefficients

$$b_1 = \frac{s_{xy}}{s_x^2}$$

$$b_0 = \bar{y} - b_1\bar{x}$$

where

$$s_{xy} = \frac{\sum_{i=1}^n (x_i - \bar{x})(y_i - \bar{y})}{n - 1}$$

$$s_x^2 = \frac{\sum_{i=1}^n (x_i - \bar{x})^2}{n - 1}$$

$$\bar{x} = \frac{\sum_{i=1}^n x_i}{n}$$

$$\bar{y} = \frac{\sum_{i=1}^n y_i}{n}$$

In Chapter 4, we provided shortcut formulas for the sample variance (page 106) and the sample covariance (page 124). Combining them provides a shortcut method to manually calculate the slope coefficient.

Shortcut Formula for b_1

$$b_1 = \frac{s_{xy}}{s_x^2}$$

$$s_{xy} = \frac{1}{n-1} \left[\sum_{i=1}^n x_i y_i - \frac{\sum_{i=1}^n x_i \sum_{i=1}^n y_i}{n} \right]$$

$$s_x^2 = \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right]$$

Statisticians have shown that b_0 and b_1 are unbiased estimators of β_0 and β_1 , respectively.

Although the calculations are straightforward, we would rarely compute the regression line manually because the work is time consuming. However, we illustrate the manual calculations for a very small sample.

EXAMPLE 16.1

DATA
Xm16-01

Annual Bonus and Years of Experience

The annual bonuses (\$1,000s) of six employees with different years of experience were recorded as follows. We wish to determine the straight-line relationship between annual bonus and years of experience.

Years of experience x	1	2	3	4	5	6
Annual bonus y	6	1	9	5	17	12

SOLUTION:

To apply the shortcut formula, we need to compute four summations. Using a calculator, we find

$$\sum_{i=1}^n x_i = 21$$

$$\sum_{i=1}^n y_i = 50$$

$$\sum_{i=1}^n x_i y_i = 212$$

$$\sum_{i=1}^n x_i^2 = 91$$

The covariance and the variance of x can now be computed:

$$s_{xy} = \frac{1}{n-1} \left[\sum_{i=1}^n x_i y_i - \frac{\sum_{i=1}^n x_i \sum_{i=1}^n y_i}{n} \right] = \frac{1}{6-1} \left[212 - \frac{(21)(50)}{6} \right] = 7.4$$

$$s_x^2 = \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right] = \frac{1}{6-1} \left[91 - \frac{(21)^2}{6} \right] = 3.5$$

The sample slope coefficient is calculated next:

$$b_1 = \frac{s_{xy}}{s_x^2} = \frac{7.4}{3.5} = 2.114$$

The y -intercept is computed as follows:

$$\bar{x} = \frac{\sum x_i}{n} = \frac{21}{6} = 3.5$$

$$\bar{y} = \frac{\sum y_i}{n} = \frac{50}{6} = 8.333$$

$$b_0 = \bar{y} - b_1 \bar{x} = 8.333 - (2.114)(3.5) = .934$$

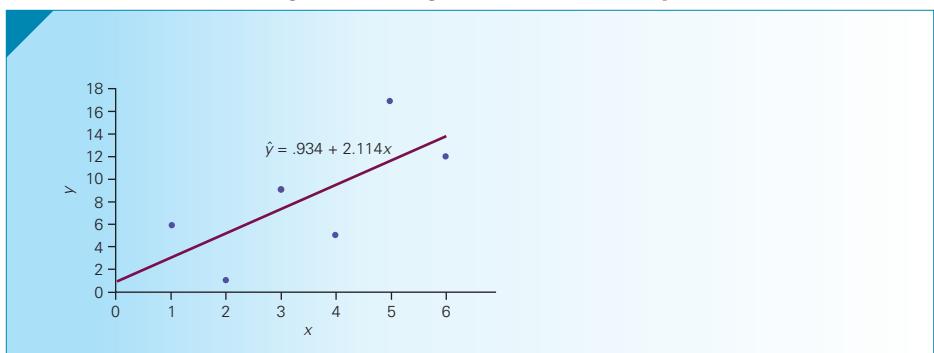
Thus, the least squares line is

$$\hat{y} = .934 + 2.114x$$

Figure 16.1 depicts the least squares (or regression) line. As you can see, the line fits the data reasonably well. We can measure how well by computing the value of the minimized sum of squared deviations. The deviations between the actual data points and the line are called **residuals**, denoted e_i ; that is,

$$e_i = y_i - \hat{y}_i$$

FIGURE 16.1 Scatter Diagram with Regression Line for Example 16.1

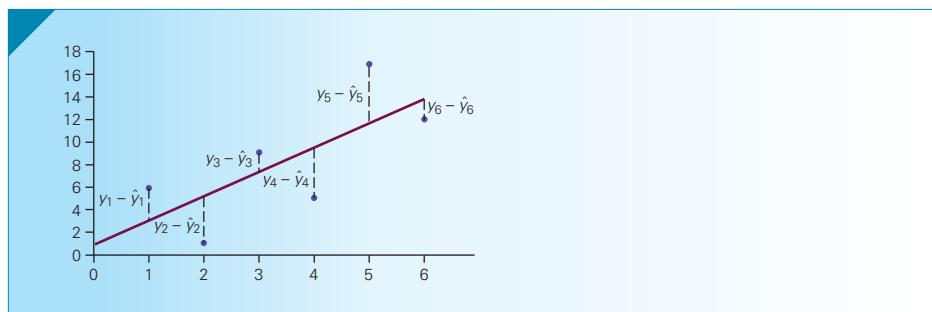


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The residuals are observations of the error variable. Consequently, the minimized sum of squared deviations is called the **sum of squares for error**, denoted SSE.

The calculation of the residuals in this example is shown in Figure 16.2. Notice that we compute by \hat{y}_i substituting x_i into the formula of the regression line. The residuals are the differences between the observed values of y_i and the fitted or predicted values of \hat{y}_i . Table 16.1 describes these calculations.

Thus, $SSE = 81.104$. No other straight line will produce a sum of squared deviations as small as 81.104. In that sense, the regression line fits the data best. The sum of squares for error is an important statistic because it is the basis for other statistics that assess how well the linear model fits the data. We will introduce these statistics in Section 16-4.

FIGURE 16.2 Calculation of Residuals in Example 16.1

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TABLE 16.1 Calculation of Residuals in Example 16.1

x_i	y_i	$\hat{y}_i = .934 = 2.114x_i$	$y_i - \hat{y}_i$	$(y_i - \hat{y}_i)^2$
1	6	3.048	2.952	8.714
2	1	5.162	-4.162	17.322
3	9	7.276	1.724	2.972
4	5	9.390	-4.390	19.272
5	17	11.504	5.496	30.206
6	12	13.618	-1.618	2.618

$$\sum (y_i - \hat{y}_i)^2 = 81.104$$

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EXAMPLE 16.2
DATA
Xm16-02*
Odometer Reading and Prices of Used Toyota Camrys, Part 1

Car dealers across North America use the so-called Blue Book to help them determine the value of used cars that their customers trade in when purchasing new cars. The book, which is published monthly, lists the trade-in values for all basic models of cars. It provides alternative values for each car model according to its condition and optional features. The values are determined on the basis of the average paid at recent used-car auctions, the source of supply for many used-car dealers. However, the Blue Book does not indicate the value determined by the odometer reading, despite the fact that a critical factor for used-car buyers is how far the car has been driven. To examine this issue, a used-car dealer randomly selected 100 3-year old Toyota Camrys that were sold at auction during the past month. Each car was in top condition and equipped with all the features that come standard with this car. The dealer recorded the price (\$1,000) and the number of miles (thousands) on the odometer. Some of these data are listed here. The dealer wants to find the regression line.

Car	Price (\$1,000)	Odometer (1,000 mi)
1	14.6	37.4
2	14.1	44.8
3	14.0	45.8
:	:	:
98	14.5	33.2
99	14.7	39.2
100	14.3	36.4

SOLUTION:**IDENTIFY**

Notice that the problem objective is to analyze the relationship between two interval variables. Because we believe that the odometer reading affects the selling price, we identify the former as the independent variable, which we label x , and the latter as the dependent variable, which we label y .

COMPUTE**MANUALLY:**

From the data set, we find

$$\sum_{i=1}^n x_i = 3,601.1$$

$$\sum_{i=1}^n y_i = 1,484.1$$

$$\sum_{i=1}^n x_i y_i = 53,155.93$$

$$\sum_{i=1}^n x_i^2 = 133,986.59$$

Next we calculate the covariance and the variance of the independent variable x :

$$\begin{aligned}s_{xy} &= \frac{1}{n-1} \left[\sum_{i=1}^n x_i y_i - \frac{\sum_{i=1}^n x_i \sum_{i=1}^n y_i}{n} \right] \\ &= \frac{1}{100-1} \left[53,155.93 - \frac{(3,601.1)(1,484.1)}{100} \right] = -2.909 \\ s_x^2 &= \frac{1}{n-1} \left[\sum_{i=1}^n x_i^2 - \frac{\left(\sum_{i=1}^n x_i \right)^2}{n} \right] \\ &= \frac{1}{100-1} \left[133,986.59 - \frac{(3,601.1)^2}{100} \right] = 43.509\end{aligned}$$

The sample slope coefficient is calculated next:

$$b_1 = \frac{s_{xy}}{s_x^2} = \frac{-2.909}{43.509} = -.0669$$

The y -intercept is computed as follows:

$$\bar{x} = \frac{\sum x_i}{n} = \frac{3,601.1}{100} = 36.011$$

$$\bar{y} = \frac{\sum y_i}{n} = \frac{1,484.1}{100} = 14.841$$

$$b_0 = \bar{y} - b_1 \bar{x} = 14.841 - (-.0669)(36.011) = 17.250$$

The sample regression line is

$$\hat{y} = 17.250 - 0.0669x$$

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.8052				
5	R Square	0.6483				
6	Adjusted R Square	0.6447				
7	Standard Error	0.3265				
8	Observations	100				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	1	19.26	19.26	180.64	5.75E-24
13	Residual	98	10.45	0.11		
14	Total	99	29.70			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	17.25	0.182	94.73	3.57E-98	
18	Odometer	-0.0669	0.0050	-13.44	5.75E-24	

INSTRUCTIONS

1. Type or import data into two columns*, one storing the dependent variable and the other the independent variable. (Open Xm16-02.)
2. Click **Data**, **Data Analysis**, and **Regression**.
3. Specify the **Input Y Range** (**A1:A101**) and the **Input X Range** (**B1:B101**).

To draw the scatter diagram follow the instructions provided in Chapter 3 on page 76.

MINITAB**Regression Analysis: Price versus Odometer**

The regression equation is
Price = 17.2 - 0.0669 Odometer

Predictor	Coef	SE Coef	T	P
Constant	17.2487	0.1821	94.73	0.000
Odometer	-0.066861	0.004975	-13.44	0.000

S = 0.326489 R-Sq = 64.8% R-Sq(adj) = 64.5%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	1	19.256	19.256	180.64	0.000
Residual Error	98	10.446	0.107		
Total	99	29.702			

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm16-02.)
2. Click **Stat**, **Regression**, and **Regression . . .**
3. Type the name of the dependent variable in the **Response** box (**Price**) and the name of the independent variable in the **Predictors** box (**Odometer**).

To draw the scatter diagram click **Stat**, **Regression**, and **Fitted Line Plot**. Alternatively, follow the instructions provide in Chapter 3.

*If one or both columns contain an empty cell (representing missing data) the row must be removed.

The printouts include more statistics than we need right now. However, we will be discussing the rest of the printouts later.

INTERPRET

The slope coefficient b_1 is -0.0669 , which means that for each additional 1,000 miles on the odometer, the price decreases by an average of $\$0.0669$ thousand. Expressed more simply, the slope tells us that for each additional mile on the odometer, the price decreases on average by $\$0.0669$ or 6.69 cents.

The intercept is $b_0 = 17.250$. Technically, the intercept is the point at which the regression line and the y -axis intersect. This means that when $x = 0$ (i.e., the car was not driven at all) the selling price is $\$17.250$ thousand or $\$17,250$. We might be tempted to interpret this number as the price of cars that have not been driven. However, in this case, the intercept is probably meaningless. Because our sample did not include any cars with zero miles on the odometer, we have no basis for interpreting b_0 . As a general rule, we cannot determine the value of \hat{y} for a value of x that is far outside the range of the sample values of x . In this example, the smallest and largest values of x are 19.1 and 49.2, respectively. Because $x = 0$ is not in this interval, we cannot safely interpret the value of \hat{y} when $x = 0$.

It is important to bear in mind that the interpretation of the coefficients pertains only to the sample, which consists of 100 observations. To infer information about the population, we need statistical inference techniques, which are described subsequently.

In the sections that follow, we will return to this problem and the computer output to introduce other statistics associated with regression analysis.



EXERCISES

- 16.1** The term *regression* was originally used in 1885 by Sir Francis Galton in his analysis of the relationship between the heights of children and parents. He formulated the “law of universal regression,” which specifies that “each peculiarity in a man is shared by his kinsmen, but on average in a less degree.” (Evidently, people spoke this way in 1885.) In 1903, two statisticians, K. Pearson and A. Lee, took a random sample of 1,078 father-son pairs to examine Galton’s law (“On the Laws of Inheritance in Man, I. Inheritance of Physical Characteristics,” *Biometrika* 2:457–462). Their sample regression line was

$$\text{Son's height} = 33.73 + .516 \times \text{Father's height}$$

- Interpret the coefficients.
- What does the regression line tell you about the heights of sons of tall fathers?
- What does the regression line tell you about the heights of sons of short fathers?

- 16.2** **Xr16-02** Attempting to analyze the relationship between advertising and sales, the owner of a furniture store recorded the monthly advertising budget (\$ thousands) and the sales (\$ millions) for a sample of 12 months. The data are listed here.

Advertising	23	46	60	54	28	33
Sales	9.6	11.3	12.8	9.8	8.9	12.5

Advertising	25	31	36	88	90	99
Sales	12.0	11.4	12.6	13.7	14.4	15.9

- Draw a scatter diagram. Does it appear that advertising and sales are linearly related?
- Calculate the least squares line and interpret the coefficients.

- 16.3** **Xr16-03** To determine how the number of housing starts is affected by mortgage rates an economist recorded the average mortgage rate and the number of housing starts in a large county for the past 10 years. These data are listed here.

Rate	8.5	7.8	7.6	7.5	8.0
Starts	115	111	185	201	206

Rate	8.4	8.8	8.9	8.5	8.0
Starts	167	155	117	133	150

- Determine the regression line.
- What do the coefficients of the regression line tell you about the relationship between mortgage rates and housing starts?

- 16.4 Xr16-04** Critics of television often refer to the detrimental effects that all the violence shown on television has on children. However, there may be another problem. It may be that watching television also reduces the amount of physical exercise, causing weight gains. A sample of 15 10-year-old children was taken. The number of pounds each child was overweight was recorded (a negative number indicates the child is underweight). In addition, the number of hours of television viewing per week was also recorded. These data are listed here.

Television	42	34	25	35	37	38	31	33
Overweight	18	6	0	-1	13	14	7	7
Television	19	29	38	28	29	36	18	
Overweight	-9	8	8	5	3	14	-7	

- Draw the scatter diagram.
- Calculate the sample regression line and describe what the coefficients tell you about the relationship between the two variables.

- 16.5 Xr16-05** To help determine how many beers to stock the concession manager at Yankee Stadium wanted to know how the temperature affected beer sales. Accordingly, she took a sample of 10 games and recorded the number of beers sold and the temperature in the middle of the game.

Temperature	80	68	78	79	87
Number of beers	20,533	1,439	13,829	21,286	30,985
Temperature	74	86	92	77	84
Number of beers	17,187	30,240	37,596	9,610	28,742

- Compute the coefficients of the regression line.
- Interpret the coefficients.

The exercises that follow were created to allow you to see how regression analysis is used to solve realistic problems. As a result, most feature a large number of observations. We anticipate that most students will solve these problems using a computer and statistical software. However, for students without these resources, we have computed the means, variances, and covariances

that will permit them to complete the calculations manually. (See Appendix A.)

- 16.6 Xr16-06*** In television's early years, most commercials were 60 seconds long. Now, however, commercials can be any length. The objective of commercials remains the same—to have as many viewers as possible remember the product in a favorable way and eventually buy it. In an experiment to determine how the length of a commercial is related to people's memory of it, 60 randomly selected people were asked to watch a 1-hour television program. In the middle of the show, a commercial advertising a brand of toothpaste appeared. Some viewers watched a commercial that lasted for 20 seconds, others watched one that lasted for 24 seconds, 28 seconds, . . . , 60 seconds. The essential content of the commercials was the same. After the show, each person was given a test to measure how much he or she remembered about the product. The commercial times and test scores (on a 30-point test) were recorded.
- Draw a scatter diagram of the data to determine whether a linear model appears to be appropriate.
 - Determine the least squares line.
 - Interpret the coefficients.

- 16.7 Xr16-07** Florida condominiums are popular winter retreats for many North Americans. In recent years, the prices have steadily increased. A real estate agent wanted to know why prices of similar-sized apartments in the same building vary. A possible answer lies in the floor. It may be that the higher the floor, the greater the sale price of the apartment. He recorded the price (in \$1,000s) of 1,200 sq. ft. condominiums in several buildings in the same location that have sold recently and the floor number of the condominium.
- Determine the regression line.
 - What do the coefficients tell you about the relationship between the two variables?

- 16.8 Xr16-08** In 2010, the United States conducted a census of the entire country. The census is completed by mail. To help ensure that the questions are understood, a random sample of Americans take the questionnaire before it is sent out. As part of their analysis, they record the amount of time and ages of the sample. Use the least squares method to analyze the relationship between the amount of time taken to complete the questionnaire and the age of the individual answering the questions. What do the coefficients tell you about the relationship between the two variables?

APPLICATIONS in HUMAN RESOURCES MANAGEMENT

Jack Hollingsworth/Brand X Pictures/Getty Images



Retaining Workers

Human resource managers are responsible for a variety of tasks within organizations. As we pointed out in the introduction in Chapter 1, personnel or human resource managers are involved with recruiting new workers, determining which applicants are most suitable to hire, and helping with various aspects of monitoring the workforce, including absenteeism and worker turnover. For many firms, worker turnover is a costly problem. First, there is the cost of recruiting and attracting qualified workers. The firm must advertise vacant positions and make certain that applicants are judged properly. Second, the cost of training hires can be high, particularly in technical areas. Third, new employees are often not as productive and efficient as experienced employees. Consequently, it is in the interests of the firm to attract and keep the best workers. Any information that the personnel manager can obtain is likely to be useful.

- 16.9** **Xr16-09** The human resource manager of a telemarketing firm is concerned about the rapid turnover of the firm's telemarketers. It appears that many telemarketers do not work very long before quitting. There may be a number of reasons, including relatively low pay, personal unsuitability for the work, and the low probability of advancement. Because of the high cost of hiring and training new workers, the manager decided to examine the factors that influence workers to quit. He reviewed the work history of a random sample of workers who have quit in the last year and recorded the number of weeks on the job before quitting and the age of each worker when originally hired.
- Use regression analysis to describe how the work period and age are related.
 - Briefly discuss what the coefficients tell you.

- 16.10** **Xr16-10** Besides their known long-term effects, do cigarettes also cause short-term illnesses such as colds? To help answer this question, a sample of smokers was drawn. Each person was asked to report the average number of cigarettes smoked per day and the number of days absent from work due to colds last year.

- Determine the regression line.
- What do the coefficients tell you about the relationship between smoking cigarettes and sick days because of colds?

- 16.11** **Xr16-11** Fire damage in the United States amounts to billions of dollars, much of it insured. The time taken to arrive at the fire is critical. This raises the question, Should insurance companies lower premiums if the home to be insured is close to a fire station? To help make a decision, a study was undertaken wherein a number of fires were investigated.

The distance to the nearest fire station (in miles) and the percentage of fire damage were recorded. Determine the least squares line and interpret the coefficients.

- 16.12** **Xr16-12*** A real estate agent specializing in commercial real estate wanted a more precise method of judging the likely selling price (in \$1,000s) of apartment buildings. As a first effort, she recorded the price of a number of apartment buildings sold recently and the number of square feet (in 1,000s) in the building.
- Calculate the regression line.
 - What do the coefficients tell you about the relationship between price and square footage?

- 16.13** **Xr16-13** Millions of boats are registered in the United States. As is the case with automobiles, there is an active used-boat market. Many of the

boats purchased require bank financing, and, as a result, it is important for financial institutions to be capable of accurately estimating the price of boats. One variable that affects the price is the number of hours the engine has been run. To determine the effect of the hours on the price, a financial analyst recorded the price (in \$1,000s) of a sample of 2007 24-foot Sea Ray cruisers (one of the most popular boats) and the number of hours they had been run. Determine the least squares line and explain what the coefficients tell you.

- 16.14** **Xr03-54** (Exercise 3.54 revisited) In an attempt to determine the factors that affect the amount of energy used, 200 households were analyzed. In each, the number of occupants and the amount of electricity used were measured. Determine the regression line and interpret the results.

- 16.15** **Xr16-15** An economist for the federal government is attempting to produce a better measure of poverty than is currently in use. To help acquire information, she recorded the annual household income

(in \$1,000s) and the amount of money spent on food during one week for a random sample of households. Determine the regression line and interpret the coefficients.

- 16.16** **Xr16-16*** An economist wanted to investigate the relationship between office rents (the dependent variable) and vacancy rates. Accordingly, he took a random sample of monthly office rents and the percentage of vacant office space in 30 different cities.

- Determine the regression line.
- Interpret the coefficients.

- 16.17** **Xr03-56** (Exercise 3.56 revisited) One general belief held by observers of the business world is that taller men earn more money than shorter men. In a University of Pittsburgh study, 250 MBA graduates, all about 30 years old, were polled and asked to report their height (in inches) and their annual income (to the nearest \$1,000).

- Determine the regression line.
- What do the coefficients tell you?

APPLICATIONS in HUMAN RESOURCES MANAGEMENT

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Testing Job Applicants

The recruitment process at many firms involves tests to determine the suitability of candidates. The tests may be written to determine whether the applicant has sufficient knowledge in his or her area of expertise to perform well on the job. There may be oral tests to determine whether the applicant's personality matches the needs of the job. Manual or technical skills can be tested through a variety of physical tests. The test results contribute to the decision to hire. In some cases, the test result is the only criterion to hire. Consequently, it is vital to ensure that the test is a reliable predictor of job performance. If the tests are poor predictors, they should be discontinued. Statistical analyses allow personnel managers to examine the link between the test results and job performance.

- 16.18** **Xr16-18** Although a large number of tasks in the computer industry are robotic, many operations require human workers. Some jobs require a great deal of dexterity to properly position components into place. A large North American computer maker routinely tests applicants for these jobs by giving a dexterity test that involves a number of intricate finger and hand movements. The tests are scored on a 100-point scale. Only those who have scored above 70 are hired. To determine whether the tests are valid predictors of job performance, the personnel manager drew a random sample of 45 workers who were hired 2 months ago. He recorded their test scores and the percentage of nondefective computers they produced in the last week. Determine the regression line and interpret the coefficients.

16-3 / ERROR VARIABLE: REQUIRED CONDITIONS

In the previous section, we used the least squares method to estimate the coefficients of the linear regression model. A critical part of this model is the error variable ε . In the next section, we will present an inferential method that determines whether there is a relationship between the dependent and independent variables. Later we will show how we use the regression equation to estimate and predict. For these methods to be valid, however, four requirements involving the probability distribution of the error variable must be satisfied.

Required Conditions for the Error Variable

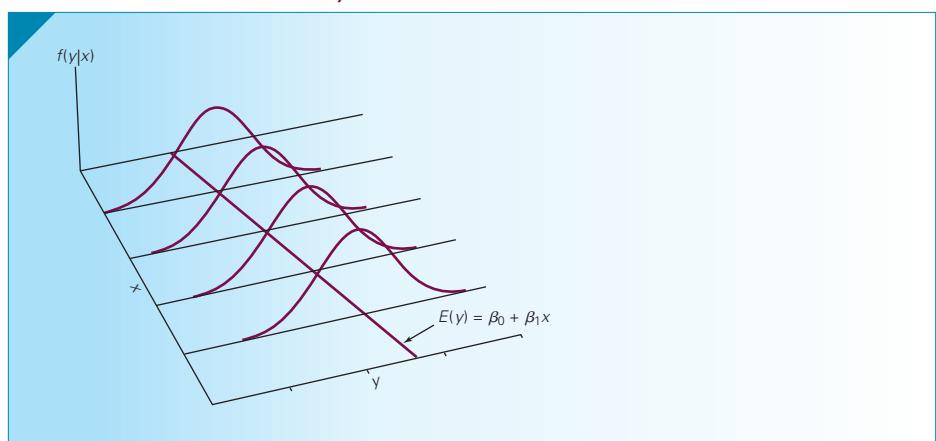
1. The probability distribution of ε is normal.
2. The mean of the distribution is 0; that is, $E(\varepsilon) = 0$.
3. The standard deviation of ε is σ_ε , which is a constant regardless of the value of x .
4. The value of ε associated with any particular value of y is independent of ε associated with any other value of y .

Requirements 1, 2, and 3 can be interpreted in another way: For each value of x, y is a normally distributed random variable whose mean is

$$E(y) = \beta_0 + \beta_1 x$$

and whose standard deviation is σ_ε . Notice that the mean depends on x . The standard deviation, however, is not influenced by x because it is a constant over all values of x . Figure 16.3 depicts this interpretation. Notice that for each value of $x, E(y)$ changes, but the shape of the distribution of y remains the same. In other words, for each x, y is normally distributed with the same standard deviation.

FIGURE 16.3 Distribution of y Given x



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In Section 16-6, we will discuss how departures from these required conditions affect the regression analysis and how they are identified.

16-3a Observational and Experimental Data

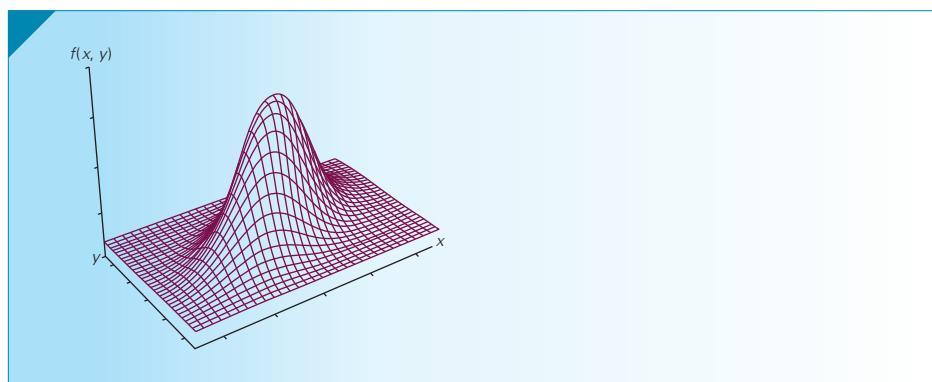
In Chapter 5 and again in Chapter 13, we described the difference between observational and experimental data. We pointed out that statistics practitioners often design controlled experiments to enable them to interpret the results of their analyses more clearly than would be the case after conducting an observational study. Example 16.2 is an illustration of observational data. In that example, we merely observed the odometer reading and auction selling price of 100 randomly selected cars.

If you examine Exercise 16.6, you will see experimental data gathered through a controlled experiment. To determine the effect of the length of a television commercial on its viewers' memories of the product advertised, the statistics practitioner arranged for 60 television viewers to watch a commercial of differing lengths and then tested their memories of that commercial. Each viewer was randomly assigned a commercial length. The values of x ranged from 20 to 60 and were set by the statistics practitioner as part of the experiment. For each value of x , the distribution of the memory test scores is assumed to be normally distributed with a constant variance.

We can summarize the difference between the experiment described in Example 16.2 and the one described in Exercise 16.6. In Example 16.2, both the odometer reading and the auction selling price are random variables. We hypothesize that for each possible odometer reading, there is a theoretical population of auction selling prices that are normally distributed with a mean that is a linear function of the odometer reading and a variance that is constant. In Exercise 16.6, the length of the commercial is not a random variable but a series of values selected by the statistics practitioner. For each commercial length, the memory test scores are required to be normally distributed with a constant variance.

Regression analysis can be applied to data generated from either observational or controlled experiments. In both cases, our objective is to determine how the independent variable is related to the dependent variable. However, observational data can be analyzed in another way. When the data are observational, both variables are random variables. We need not specify that one variable is independent and the other is dependent. We can simply determine *whether* the two variables are related. The equivalent of the required conditions described in the previous box is that the two variables are bivariate normally distributed. (Recall that in Section 7-2 we introduced the bivariate distribution, which describes the joint probability of two variables.) A bivariate normal distribution is described in Figure 16.4. As you can see, it is a three-dimensional bell-shaped curve. The dimensions are the variables x, y , and the joint density function $f(x, y)$.

FIGURE 16.4 Bivariate Normal Distribution



In Section 16-4, we will discuss the statistical technique that is used when both x and y are random variables and they are bivariate normally distributed. In Chapter 19, we will introduce a procedure applied when the normality requirement is not satisfied.



EXERCISES

- 16.19** Describe what the required conditions mean in Exercise 16.6. If the conditions are satisfied, what can you say about the distribution of memory test scores?
- 16.20** What are the required conditions for Exercise 16.8? Do these seem reasonable?

16-4 / ASSESSING THE MODEL

The least squares method produces the best straight line. However, there may, in fact, be no relationship or perhaps a nonlinear relationship between the two variables. If so, a straight-line model is likely to be impractical. Consequently, it is important for us to assess how well the linear model fits the data. If the fit is poor, we should discard the linear model and seek another one.

Several methods are used to evaluate the model. In this section, we present two statistics and one test procedure to determine whether a linear model should be employed. They are the **standard error of estimate**, the t -test of the slope, and the coefficient of determination. All these methods are based on the sum of squares for error.

16-4a Sum of Squares for Error

The least squares method determines the coefficients that minimize the sum of squared deviations between the points and the line defined by the coefficients. Recall from Section 16-2 that the minimized sum of squared deviations is called the *sum of squares for error*, denoted SSE. In that section, we demonstrated the direct method of calculating SSE. For each value of x , we compute the value of \hat{y} . In other words, for $i = 1$ to n , we compute

$$\hat{y}_i = b_0 + b_1 x_i$$

For each point, we then compute the difference between the actual value of y and the value calculated at the line, which is the residual. We square each residual and sum the squared values. Table 16.1 on page 635 shows these calculations for Example 16.1. To calculate SSE manually requires a great deal of arithmetic. Fortunately, there is a shortcut method available that uses the sample variances and the covariance.

Shortcut Calculation of SSE

$$SSE = \sum_{i=1}^n (y_i - \hat{y}_i)^2 = (n - 1) \left(s_y^2 - \frac{s_{xy}^2}{s_x^2} \right)$$

where s_y^2 is the sample variance of the dependent variable.

16-4b Standard Error of Estimate

In Section 16-3, we pointed out that the error variable ϵ is normally distributed with mean 0 and standard deviation σ_ϵ . If σ_ϵ is large, some of the errors will be large, which implies that the model's fit is poor. If σ_ϵ is small, the errors tend to be close to the mean (which is 0); as a result, the model fits well. Hence, we could use σ_ϵ to measure the suitability of using a linear model. Unfortunately, σ_ϵ is a population parameter and, like most other parameters, is unknown. We can, however, estimate σ_ϵ from the data. The estimate is based on SSE. The unbiased estimator of the variance of the error variable σ_ϵ^2 is

$$s_\epsilon^2 = \frac{\text{SSE}}{n - 2}$$

The square root of s_ϵ^2 is called the *standard error of estimate*.

Standard Error of Estimate

$$s_\epsilon = \sqrt{\frac{\text{SSE}}{n - 2}}$$

EXAMPLE 16.3

Odometer Reading and Prices of Used Toyota Camrys—Part 2

Find the standard error of estimate for Example 16.2 and describe what it tells you about the model's fit.

SOLUTION:

COMPUTE

MANUALLY:

To compute the standard error of estimate, we must compute SSE, which is calculated from the sample variances and the covariance. We have already determined the covariance and the variance of x : -2.909 and 43.509, respectively. The sample variance of y (applying the shortcut method) is

$$\begin{aligned} s_y^2 &= \frac{1}{n - 1} \left[\sum_{i=1}^n y_i^2 - \frac{\left(\sum_{i=1}^n y_i \right)^2}{n} \right] \\ &= \frac{1}{100 - 1} \left[22,055.23 - \frac{(1,484.1)^2}{100} \right] \\ &= .300 \end{aligned}$$

$$\begin{aligned} \text{SSE} &= (n - 1) \left(s_y^2 - \frac{s_{xy}^2}{s_x^2} \right) \\ &= (100 - 1) \left[.300 - \frac{(-2.909)^2}{43.509} \right] \\ &= 10.445 \end{aligned}$$

The standard error of estimate follows:

$$s_e = \sqrt{\frac{\text{SSE}}{n - 2}} = \sqrt{\frac{10.445}{98}} = .3265$$

EXCEL

	A	B
7	Standard Error	0.3265

This part of the Excel printout was copied from the complete printout on page 637.

MINITAB

S = 0.326489

This part of the Minitab printout was copied from the complete printout on page 637.

INTERPRET

The smallest value that s_e can assume is 0, which occurs when SSE = 0, that is, when all the points fall on the regression line. Thus, when s_e is small, the fit is excellent, and the linear model is likely to be an effective analytical and forecasting tool. If s_e is large, the model is a poor one, and the statistics practitioner should improve it or discard it.

We judge the value of s_e by comparing it to the values of the dependent variable y or more specifically to the sample mean \bar{y} . In this example, because $s_e = .3265$ and $\bar{y} = 14.841$, it does appear that the standard error of estimate is small. However, because there is no predefined upper limit on s_e , it is often difficult to assess the model in this way. In general, the standard error of estimate cannot be used as an absolute measure of the model's utility.

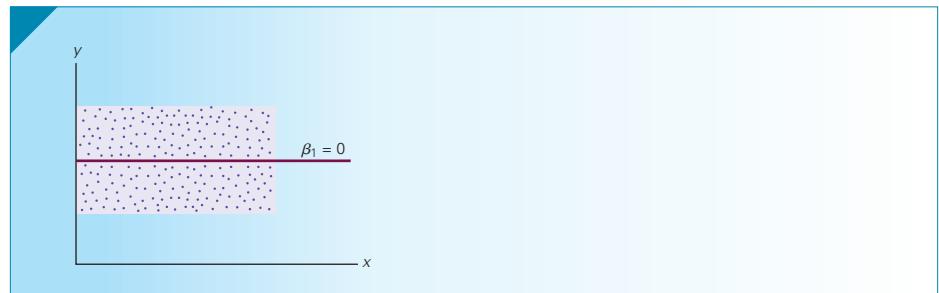
Nonetheless, s_e is useful in comparing models. If the statistics practitioner has several models from which to choose, the one with the smallest value of s_e should generally be the one used. As you'll see, s_e is also an important statistic in other procedures associated with regression analysis.

16-4c Testing the Slope

To understand this method of assessing the linear model, consider the consequences of applying the regression technique to two variables that are not at all linearly related. If we could observe the entire population and draw the regression line, we would observe the scatter diagram shown in Figure 16.5. The line is horizontal, which means that no

matter what value of x is used, we would estimate the same value for \hat{y} ; thus, y is not linearly related to x . Recall that a horizontal straight line has a slope of 0, that is, $\beta_1 = 0$.

FIGURE 16.5 Scatter Diagram of Entire Population with $\beta_1 = 0$



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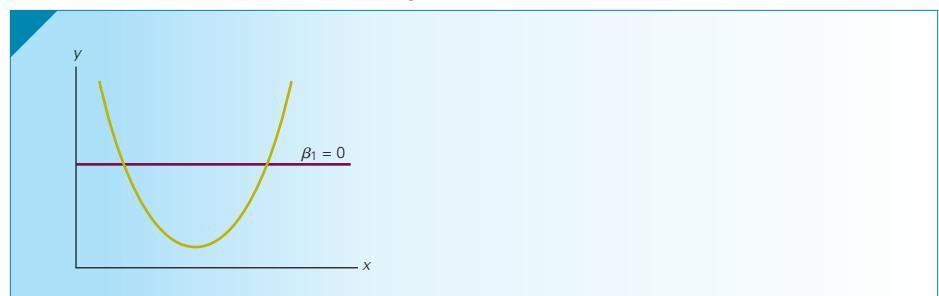
Because we rarely examine complete populations, the parameters are unknown. However, we can draw inferences about the population slope β_1 from the sample slope b_1 .

The process of testing hypotheses about β_1 is identical to the process of testing any other parameter. We begin with the hypotheses. The null hypothesis specifies that there is no linear relationship, which means that the slope is 0. Thus, we specify

$$H_0: \beta_1 = 0$$

It must be noted that if the null hypothesis is true, it does not necessarily mean that no relationship exists. For example, a quadratic relationship described in Figure 16.6 may exist where $\beta_1 = 0$.

FIGURE 16.6 Quadratic Relationship



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We can conduct one- or two-tail tests of β_1 . Most often, we perform a two-tail test to determine whether there is sufficient evidence to infer that a linear relationship exists.* We test the alternative hypothesis

$$H_1: \beta_1 \neq 0$$

16-4d Estimator and Sampling Distribution

In Section 16-2, we pointed out that b_1 is an unbiased estimator of β_1 ; that is,

$$E(b_1) = \beta_1$$

*If the alternative hypothesis is true, it may be that a linear relationship exists or that a nonlinear relationship exists but that the relationship can be approximated by a straight line.

The estimated standard error of b_1 is

$$s_{b_1} = \frac{s_e}{\sqrt{(n-1)s_x^2}}$$

where s_e is the standard error of estimate and s_x^2 is the sample variance of the independent variable. If the required conditions outlined in Section 16-3 are satisfied, the sampling distribution of the t -statistic

$$t = \frac{b_1 - \beta_1}{s_{b_1}}$$

is Student t with degrees of freedom $\nu = n - 2$. Notice that the standard error of b_1 decreases when the sample size increases (which makes b_1 a consistent estimator of β_1) or the variance of the independent variable increases.

Thus, the test statistic and confidence interval estimator are as follows.

Test Statistic for β_1

$$t = \frac{b_1 - \beta_1}{s_{b_1}} \quad \nu = n - 2$$

Confidence Interval Estimator of β_1

$$b_1 \pm t_{\alpha/2}s_{b_1} \quad \nu = n - 2$$

EXAMPLE 16.4

Are Odometer Reading and Price of Used Toyota Camrys Related?

Test to determine whether there is enough evidence in Example 16.2 to infer that there is a linear relationship between the auction price and the odometer reading for all 3-year-old Toyota Camrys. Use a 5% significance level.

SOLUTION:

We test the hypotheses

$$H_0: \beta_1 = 0$$

$$H_1: \beta_1 \neq 0$$

If the null hypothesis is true, no linear relationship exists. If the alternative hypothesis is true, some linear relationship exists.

COMPUTE

MANUALLY:

To compute the value of the test statistic, we need b_1 and s_{b_1} . In Example 16.2, we found

$$b_1 = -0.0669$$

and

$$s_x^2 = 43.509$$

Thus,

$$s_{b_1} = \frac{s_e}{\sqrt{(n-1)s_x^2}} = \frac{.3265}{\sqrt{(99)(43.509)}} = .00497$$

The value of the test statistic is

$$t = \frac{b_1 - \beta_1}{s_{b_1}} = \frac{-0.0669 - 0}{.00497} = -13.46$$

The rejection region is

$$t < -t_{\alpha/2, \nu} = -t_{.025, 98} \approx -1.984 \quad \text{or} \quad t > t_{\alpha/2, \nu} = t_{.025, 98} \approx 1.984$$

EXCEL

	A	B	C	D	E
16		Coefficients	Standard Error	t Stat	P-value
17	Intercept	17.25	0.182	94.73	3.57E-98
18	Odometer	-0.0669	0.0050	-13.44	5.75E-24

MINITAB

Predictor	Coef	SE Coef	T	P
Constant	17.2487	0.1821	94.73	0.000
Odometer	-0.066861	0.004975	-13.44	0.000

INTERPRET

The value of the test statistic is $t = -13.44$, with a p -value of 0. (Excel uses scientific notation, which in this case is 5.75×10^{-24} , which is approximately 0.) There is overwhelming evidence to infer that a linear relationship exists. What this means is that the odometer reading may affect the auction selling price of the cars. (See the subsection on cause-and-effect relationship on page 653.)

As was the case when we interpreted the y -intercept, the conclusion we draw here is valid only over the range of the values of the independent variable. We can infer that there is a relationship between odometer reading and auction price for the 3-year-old Toyota Camrys whose odometer readings lie between 19.1 (thousand) and 49.2 (thousand) miles (the minimum and maximum values of x in the sample). Because we have no observations outside this range, we do not know how, or even whether, the two variables are related.

Notice that the printout includes a test for β_0 . However, as we pointed out before, interpreting the value of the y -intercept can lead to erroneous, if not ridiculous, conclusions. Consequently, we generally ignore the test of β_0 .

We can also acquire information about the relationship by estimating the slope coefficient. In this example, the 95% confidence interval estimate (approximating $t_{.025}$ with 98 degrees of freedom with $t_{.025}$ with 100 degrees of freedom) is

$$b_1 \pm t_{\alpha/2} s_{b_1} = -0.0669 \pm 1.984(.00497) = -0.0669 \pm .0099$$

We estimate that the slope coefficient lies between $-.0768$ and $-.0570$.

16-4e One-Tail Tests

If we wish to test for positive or negative linear relationships, we conduct one-tail tests. To illustrate, suppose that in Example 16.2 we wanted to know whether there is evidence of a negative linear relationship between odometer reading and auction selling price. We would specify the hypotheses as

$$H_0: \beta_1 = 0$$

$$H_1: \beta_1 < 0$$

The value of the test statistic would be exactly as computed previously (Example 16.4). However, in this case the p -value would be the two-tail p -value divided by 2; using Excel's p -value, this would be $(5.75 \times 10^{-24})/2 = 2.875 \times 10^{-24}$, which is still approximately 0.

16-4f Coefficient of Determination

The test of β_1 addresses only the question of whether there is enough evidence to infer that a linear relationship exists. In many cases, however, it is also useful to measure the strength of that linear relationship, particularly when we want to compare several different models. The statistic that performs this function is the **coefficient of determination**, which is denoted R^2 . Statistics practitioners often refer to this statistic as the "R-square." Recall that we introduced the coefficient of determination in Chapter 4, where we pointed out that this statistic is a measure of the amount of variation in the dependent variable that is explained by the variation in the independent variable. However, we did not describe why we interpret the R -square in this way.

Coefficient of Determination

$$R^2 = \frac{s_{xy}^2}{s_x^2 s_y^2}$$

With a little algebra, statisticians can show that

$$R^2 = 1 - \frac{\text{SSE}}{\sum (y_i - \bar{y})^2}$$

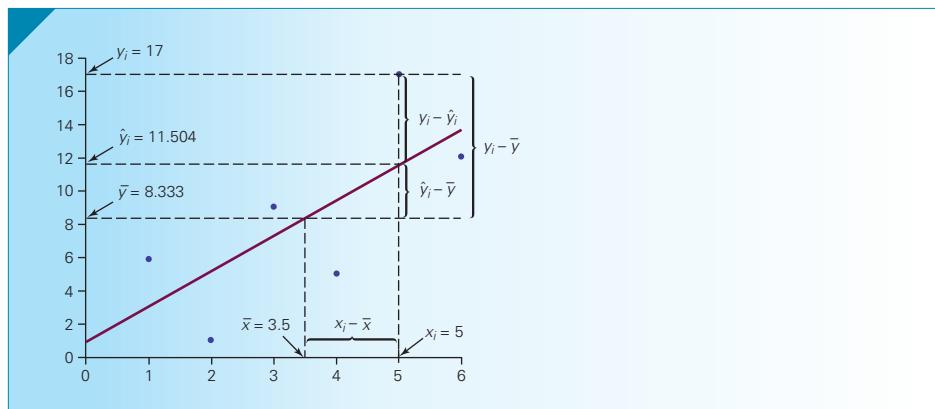
We'll return to Example 16.1 to learn more about how to interpret the coefficient of determination. In Chapter 14, we partitioned the total sum of squares into two sources of variation. We do so here as well. We begin by adding and subtracting \hat{y}_i from the deviation between y_i from the mean \bar{y} ; that is,

$$(y_i - \bar{y}) = (y_i - \bar{y}) + \hat{y}_i - \hat{y}_i$$

We observe that by rearranging the terms, the deviation between y_i and \bar{y} can be decomposed into two parts; that is,

$$(y_i - \bar{y}) = (y_i - \hat{y}_i) + (\hat{y}_i - \bar{y})$$

This equation is represented graphically (for $i = 5$) in Figure 16.7.

FIGURE 16.7 Partitioning the Deviation for $i = 5$ 

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Now we ask why the values of y are different from one another. From Figure 16.7, we see that part of the difference between y_i and \bar{y} is the difference between \hat{y}_i and \bar{y} , which is accounted for by the difference between x_i and \bar{x} . In other words, some of the variation in y is explained by the changes to x . The other part of the difference between y_i and \bar{y} , however, is accounted for by the difference between y_i and \hat{y}_i . This difference is the residual, which represents variables not otherwise represented by the model. As a result, we say that this part of the difference is *unexplained* by the variation in x .

If we now square both sides of the equation, sum over all sample points, and perform some algebra, we produce

$$\sum(y_i - \bar{y})^2 = \sum(y_i - \hat{y}_i)^2 + \sum(\hat{y}_i - \bar{y})^2$$

The quantity on the left side of this equation is a measure of the variation in the dependent variable y . The first quantity on the right side of the equation is SSE, and the second term is denoted SSR, for sum of squares for regression. We can rewrite the equation as

$$\text{Variation in } y = \text{SSE} + \text{SSR}$$

As we did in the analysis of variance, we partition the variation of y into two parts: SSE, which measures the amount of variation in y that remains unexplained; and SSR, which measures the amount of variation in y that is explained by the variation in the independent variable x . We can incorporate this analysis into the definition of R^2 .

Coefficient of Determination

$$R^2 = 1 - \frac{\text{SSE}}{\sum(y_i - \bar{y})^2} = \frac{\sum(y_i - \bar{y})^2 - \text{SSE}}{\sum(y_i - \bar{y})^2} = \frac{\text{Explained variation}}{\text{Variation in } y}$$

It follows that R^2 measures the proportion of the variation in y that can be explained by the variation in x .

EXAMPLE 16.5

Measuring the Strength of the Linear Relationship between Odometer Reading and Price of Used Toyota Camrys

Find the coefficient of determination for Example 16.2 and describe what this statistic tells you about the regression model.

SOLUTION:

COMPUTE

MANUALLY:

We have already calculated all the necessary components of this statistic. In Example 16.2 we found

$$s_{xy} = -2.909$$

$$s_x^2 = 43.509$$

and from Example 16.3

$$s_y^2 = .300$$

Thus,

$$R^2 = \frac{s_{xy}^2}{s_x^2 s_y^2} = \frac{(-2.909)^2}{(43.509)(.300)} = .6483$$

EXCEL

	A	B
5	R Square	0.6483

MINITAB

R-Sq = 64.8%

Both Minitab and Excel print a second R^2 statistic called the *coefficient of determination adjusted for degrees of freedom*. We will define and describe this statistic in Chapter 17.

INTERPRET

We found that R^2 is equal to .6483. This statistic tells us that 64.83% of the variation in the auction selling prices is explained by the variation in the odometer readings. The remaining 35.17% is unexplained. Unlike the value of a test statistic, the coefficient of determination does not have a critical value that enables us to draw conclusions.

In general, the higher the value of R^2 , the better the model fits the data. From the t -test of β_1 we already know that there is evidence of a linear relationship. The coefficient of determination merely supplies us with a measure of the strength of that relationship. As you will discover in the next chapter, when we improve the model, the value of R^2 increases.

16-4g Other Parts of the Computer Printout

The last part of the printout shown on pages 636 and 637 relates to our discussion of the interpretation of the value of R^2 , when its meaning is derived from the partitioning of the variation in y . The values of SSR and SSE are shown in an analysis of variance table similar to the tables introduced in Chapter 14. The general form of the table is shown in Table 16.2. The F -test performed in the ANOVA table will be explained in Chapter 17.

TABLE 16.2 General Form of the ANOVA Table in the Simple Linear Regression Model

SOURCE	d.f.	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Regression	1	SSR	MSR = SSR/1	$F = \text{MSR}/\text{MSE}$
Error	$n - 2$	SSE	$\text{MSE} = \text{SSE}/(n - 2)$	
Total	$n - 1$	Variation in y		

Note: Excel uses the word “Residual” to refer to the second source of variation, which we called “Error.”

16-4h Developing an Understanding of Statistical Concepts

Once again, we encounter the concept of explained variation. We first discussed the concept in Chapter 13 when we introduced the matched pairs experiment, where the experiment was designed to reduce the variation among experimental units. This concept was extended in the analysis of variance, where we partitioned the total variation into two or more sources (depending on the experimental design). And now in regression analysis, we use the concept to measure how the dependent variable is related to the independent variable. We partition the variation of the dependent variable into the sources: the variation explained by the variation in the independent variable and the unexplained variation. The greater the explained variation, the better the model is. We often refer to the coefficient of determination as a measure of the explanatory power of the model.

16-4i Cause-and-Effect Relationship

A common mistake is made by many students when they attempt to interpret the results of a regression analysis when there is evidence of a linear relationship. They imply that changes in the independent variable cause changes in the dependent variable. It must be emphasized that we cannot infer a causal relationship from statistics alone. Any inference about the cause of the changes in the dependent variable must be justified by a reasonable theoretical relationship. For example, statistical tests established that the more one smoked, the greater the probability of developing lung cancer. However, this analysis did not prove that smoking causes lung cancer. It only demonstrated that smoking and lung cancer were somehow related. Only when medical investigations established the connection were scientists able to confidently declare that smoking causes lung cancer.

As another illustration, consider Example 16.2 where we showed that the odometer reading is linearly related to the auction price. Although it seems reasonable to conclude

that decreasing the odometer reading would cause the auction price to rise, the conclusion may not be entirely true. It is theoretically possible that the price is determined by the overall condition of the car and that the condition generally worsens when the car is driven longer. Another analysis would be needed to establish the veracity of this conclusion.

Be cautious about the use of the terms *explained variation* and *explanatory power of the model*. Do not interpret the word *explained* to mean *caused*. We say that the coefficient of determination measures the amount of variation in y that is explained (not caused) by the variation in x . Thus, regression analysis can only show that a statistical relationship exists. We cannot infer that one variable causes another.

Recall that we first pointed this out in Chapter 3 using the following sentence:

Correlation is not causation.

16-4j Testing the Coefficient of Correlation

When we introduced the coefficient of correlation (also called the **Pearson coefficient of correlation**) in Chapter 4, we observed that it is used to measure the strength of association between two variables. However, the coefficient of correlation can be useful in another way. We can use it to test for a linear relationship between two variables.

When we are interested in determining *how* the independent variable is related to the dependent variable, we estimate and test the linear regression model. The t -test of the slope presented previously allows us to determine whether a linear relationship actually exists. As we pointed out in Section 16-3, the statistical test requires that for each value of x , there exists a population of values of y that are normally distributed with a constant variance. This condition is required whether the data are experimental or observational.

In many circumstances, we're interested in determining only *whether* a linear relationship exists and not the form of the relationship. When the data are observational and the two variables are bivariate normally distributed (See Section 16-3.) we can calculate the coefficient of correlation and use it to test for linear association.

As we noted in Chapter 4, the population coefficient of correlation is denoted ρ (the Greek letter *rho*). Because ρ is a population parameter (which is almost always unknown), we must estimate its value from the sample data. Recall that the sample coefficient of correlation is defined as follows.

Sample Coefficient of Correlation

$$r = \frac{s_{xy}}{s_x s_y}$$

When there is no linear relationship between the two variables, $\rho = 0$. To determine whether we can infer that ρ is 0, we test the hypotheses

$$H_0: \rho = 0$$

$$H_1: \rho \neq 0$$

The test statistic is defined in the following way.

Test Statistic for Testing $\rho = 0$

$$t = r \sqrt{\frac{n - 2}{1 - r^2}}$$

which is Student t distributed with $v = n - 2$ degrees of freedom provided that the variables are bivariate normally distributed.

EXAMPLE 16.6**Are Odometer Reading and Price of Used Toyota Camrys Linearly Related? Testing the Coefficient of Correlation**

Conduct the t -test of the coefficient of correlation to determine whether odometer reading and auction selling price are linearly related in Example 16.2. Assume that the two variables are bivariate normally distributed.

SOLUTION:**COMPUTE****MANUALLY:**

The hypotheses to be tested are

$$H_0: \rho = 0$$

$$H_1: \rho \neq 0$$

In Example 16.2, we found $s_{xy} = -2.909$ and $s_x^2 = 43.509$. In Example 16.5, we determined that $s_y^2 = .300$. Thus,

$$\begin{aligned}s_x &= \sqrt{43.509} = 6.596 \\ s_y &= \sqrt{.300} = .5477\end{aligned}$$

The coefficient of correlation is

$$r = \frac{s_{xy}}{s_x s_y} = \frac{-2.909}{(6.596)(.5477)} = -.8052$$

The value of the test statistic is

$$t = r \sqrt{\frac{n - 2}{1 - r^2}} = -.8052 \sqrt{\frac{100 - 2}{1 - (-.8052)^2}} = -13.44$$

Notice that this is the same value we produced in the t -test of the slope in Example 16.4. Because both sampling distributions are Student t with 98 degrees of freedom, the p -value and conclusion are also identical.

EXCEL

	A	B
1	Correlation	
2		
3	<i>Price and Odometer</i>	
4	Pearson Coefficient of Correlation	-0.8052
5	t Stat	-13.44
6	df	98
7	P(T<=t) one tail	0
8	t Critical one tail	1.6606
9	P(T<=t) two tail	0
10	t Critical two tail	1.9845

INSTRUCTIONS

1. Type or import the data into two adjacent columns*. (Open Xm16-02.)
2. Click **Add-ins**, **Data Analysis Plus**, and **Correlation (Pearson)**.
3. Specify the **Variable 1 Input Range** (**A1:A101**), **Variable 2 Input Range** (**B1:B101**), and α (.05).

MINITAB**Correlations: Odometer, Price**

Pearson correlation of Price and Odometer = -0.805
P-Value = 0.000

INSTRUCTIONS

1. Type or import the data into two adjacent columns. (Open Xm16-02.)
2. Click **Stat**, **Basic Statistics**, and **Correlation**.
3. Type the names of the variables in the **Variables** box (**Odometer** **Price**).

Notice that the t -test of ρ and the t -test of β_1 in Example 16.4 produced identical results. This should not be surprising because both tests are conducted to determine whether there is evidence of a linear relationship. The decision about which test to use is based on the type of experiment and the information we seek from the statistical analysis. If we're interested in discovering the relationship between two variables, or if we've conducted an experiment where we controlled the values of the independent variable (as in Exercise 16.6), the t -test of β_1 should be applied. If we're interested only in determining *whether* two random variables that are bivariate normally distributed are linearly related, the t -test of ρ should be applied.

As is the case with the t -test of the slope, we can also conduct one-tail tests. We can test for a positive or a negative linear relationship.

*If one or both columns contain an empty cell (representing missing data) the row must be removed.

General Social Survey: Education and Income—How Are They Related? Solution

IDENTIFY

The problem objective is to analyze the relationship between two interval variables. Because we want to know how education affects income, the independent variable is education (EDUC) and the dependent variable is income (INCOME).

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COMPUTE

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.4150				
5	R Square	0.1722				
6	Adjusted R Square	0.1715				
7	Standard Error	33,935				
8	Observations	1142				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	1	273,069,465,956	273,069,465,956	237.1	9.42E-49
13	Residual	1140	1,312,796,309,000	1,151,575,710		
14	Total	1141	1,585,865,774,956			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	-30,880	4730	-6.53	1.00E-10	
18	EDUC	5,097	331	15.40	9.42E-49	

INTERPRET

The regression equation is $\hat{y} = -30,880 + 5097x$. The slope coefficient tells us that on average for each additional year of education income increases by \$5,097. The intercept is clearly meaningless. We test to determine whether there is evidence of a linear relationship.

$$H_0: \beta_1 = 0$$

$$H_1: \beta_1 \neq 0$$

The test statistic is $t = 15.40$ and the p -value is 9.42×10^{-49} , which is virtually 0. The coefficient of determination is $R^2 = .1722$, which means that 17.22% of the variation in income is explained by the variation in education, and the remaining 82.78% is not explained.

16-4k Violation of the Required Condition

When the normality requirement is unsatisfied, we can use a nonparametric technique—the Spearman rank correlation coefficient (Chapter 19*) to replace the t -test of ρ .

*Instructors who wish to teach the use of the Spearman rank correlation coefficient here can use Keller's website Appendix Spearman Rank Correlation Coefficient and Test.



EXERCISES

Use a 5% significance level for all tests of hypotheses.

- 16.22** You have been given the following data:

x	1	3	4	6	9	8	10
y	1	8	15	33	75	70	95

- a. Draw the scatter diagram. Does it appear that x and y are related? If so, how?
- b. Test to determine whether there is evidence of a linear relationship.

- 16.23** Suppose that you have the following data:

x	3	5	2	6	1	4
y	25	110	9	250	3	71

- a. Draw the scatter diagram. Does it appear that x and y are related? If so, how?
- b. Test to determine whether there is evidence of a linear relationship.

- 16.24** Refer to Exercise 16.2.

- a. Determine the standard error of estimate.
- b. Is there evidence of a linear relationship between advertising and sales?
- c. Estimate β_1 with 95% confidence.
- d. Compute the coefficient of determination and interpret this value.
- e. Briefly summarize what you have learned in parts (a) through (d).

- 16.25** Calculate the coefficient of determination and conduct a test to determine whether a linear relationship exists between housing starts and mortgage interest in Exercise 16.3.

- 16.26** Is there evidence of a linear relationship between the number of hours of television viewing and how overweight the child is in Exercise 16.4?

- 16.27** Determine whether there is evidence of a negative linear relationship between temperature and the number of beers sold at Yankee Stadium in Exercise 16.5.

Exercises 16.28–16.44 require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.

- 16.28** Refer to Exercise 16.6.

- a. What is the standard error of estimate? Interpret its value.
- b. Describe how well the memory test scores and length of television commercial are linearly related.
- c. Are the memory test scores and length of commercial linearly related? Test using a 5% significance level.
- d. Estimate the slope coefficient with 90% confidence.

- 16.29** Refer to Exercise 16.7. Apply the three methods of assessing the model to determine how well the linear model fits.

- 16.30** Is there enough evidence to infer that age and the amount of time needed to complete the questionnaire are linearly related in Exercise 16.8?

- 16.31** Refer to Exercise 16.9. Use two statistics to measure the strength of the linear association. What do these statistics tell you?

- 16.32** Is there evidence of a linear relationship between number of cigarettes smoked and number of sick days in Exercise 16.10?

- 16.33** Refer to Exercise 16.11.

- a. Test to determine whether there is evidence of a linear relationship between distance to the nearest fire station and percentage of damage.
- b. Estimate the slope coefficient with 95% confidence.
- c. Determine the coefficient of determination. What does this statistic tell you about the relationship?

- 16.34** Refer to Exercise 16.12.

- a. Determine the standard error of estimate, and describe what this statistic tells you about the regression line.
- b. Can we conclude that the size and price of the apartment building are linearly related?
- c. Determine the coefficient of determination and discuss what its value tells you about the two variables.

- 16.35** Is there enough evidence to infer that as the number of hours of engine use increases, the price decreases in Exercise 16.13?

- 16.36** Assess fit of the regression line in Exercise 16.14.

- 16.37** Refer to Exercise 16.15.

- a. Determine the coefficient of determination and describe what it tells you.
- b. Conduct a test to determine whether there is evidence of a linear relationship between household income and food budget.

- 16.38** Can we infer that office rents and vacancy rates are linearly related in Exercise 16.16?

- 16.39** Are height and income in Exercise 16.17 positively linearly related?

- 16.40** Refer to Exercise 16.18.

- a. Compute the coefficient of determination and describe what it tells you.
- b. Can we infer that aptitude test scores and percentages of nondefectives are linearly related?

- 16.41** Repeat Exercise 16.13 using the *t*-test of the coefficient of correlation to determine whether there is a negative linear relationship between the number of hours of engine use and the selling price of the used boats.
- 16.42** Repeat Exercise 16.6 using the *t*-test of the coefficient of correlation. Is this result identical to the one you produced in Exercise 16.6?
- 16.43** Are food budget and household income in Exercise 16.15 linearly related? Employ the *t*-test of the coefficient of correlation to answer the question.
- 16.44** Refer to Exercise 16.10. Use the *t*-test of the coefficient of correlation to determine whether there is evidence of a positive linear relationship between number of cigarettes smoked and the number of sick days.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users: You must remove rows containing empty cells. Use a 5% significance level for all tests.

- 16.45 ANES2008*** Do more educated people spend more time watching or news on the Internet? Conduct a regression analysis to determine whether there is enough statistical evidence to conclude that the more education (EDUC) one has the more one watches or reads news on the Internet (TIME1)?
- 16.46 ANES2008*** In the Chapter 16 opening example, we analyzed the relationship between income and education using the 2012 General Social Survey of 2012. Conduct a similar analysis using the 2008 American National Election Survey.
- 16.47 ANES2008*** National news on television features commercials describing pharmaceutical drugs that treat ailments that plague older people. Apparently, the major networks believe that older people tend to watch national newscasts. Is there sufficient evidence to conclude age (AGE) and number of days watching national news on television (DAYS1) are positively related?
- 16.48 ANES2008*** In most presidential elections in the United States the voter turnout is quite low, often in the neighborhood of 50%. Political workers would like to be able to predict who is likely to vote. Thus, it is important to know which variables are related to intention to vote. One candidate is age. Is there sufficient evidence to infer that age (AGE) and intention to vote (DEFINITE) are linearly related?
- 16.49 ANES2008*** Do more affluent people get their news from radio? Answer the question by conducting an analysis of the relationship between income (INCOME) and time listening to news on the radio (TIME4).



GENERAL SOCIAL SURVEY EXERCISES

Excel users: You must delete rows containing empty cells. Use a 5% significance level for all tests.

- 16.50 GSS2012*** Does one's income (INCOME) affect his or her position on the question, Should the government reduce income differences between rich and poor (EQWLTH: 1 = Government should reduce income differences; 2, 3, 4, 5, 6, 7 = No government action)? Answer the question by testing the relationship between the two variables.
- 16.51 GSS2012*** Conduct an analysis of the relationship between income (INCOME) and age (AGE). Estimate with 95% confidence the average increase in income for each additional year of age.
- 16.52 GSS2012*** Does television appeal to the lowest common denominator? If so, we would expect more educated people to watch less television. Is there sufficient evidence to conclude that more educated people (EDUC) watch less television (TVHOURS)?
- 16.53 GSS2012*** It seems rather obvious that the longer one works the more one earns. The question is how much more one earns annually for each additional hour of work. Conduct an analysis of annual income (INCOME) and number of hours per week of work (HRS1).
- Test to determine whether there is a positive linear relationship.
 - Estimate with 95% confidence the increase in annual income for each additional hour of work per week.

- 16.54 GSS2012*** Is there a linear relationship between age (AGE) and how many hours per week one works (HRS1)? Conduct a test to answer the question.
- 16.55 GSS2012*** Television advertisers always want to know who is watching their televised advertising. Do older people watch more television than do younger people? Do the data provide sufficient evidence to infer that there is a positive linear relationship between age (AGE) and television watched (TVHOURS)?
- 16.56 GSS2012*** How does having more family members earning income (EARNRS) affect total family income (TFINCOME)? Conduct an analysis to determine whether there is a positive linear relationship between the two variables, and, if so, estimate with 95% confidence the average increase in total family income for each additional of earners.
- 16.57 GSS2012*** Are more educated (EDUC) people more likely to support government action to reduce income differences across the country differences (EQWLTH: 1 = Government should reduce income differences; 2, 3, 4, 5, 6, 7 = No government action)? Conduct a test to answer the question.
- 16.58 GSS2012*** Do more educated people tend to marry individuals with similar educational experience? Test to determine whether a married person's years of education (EDUC) are positively linearly related to his or her spouse's level of education (SPEDUC).
- 16.59 GSS2012*** An economic theory suggests that as people become richer they tend to have more children. Analyze the relationship between income (INCOME) and number of children (CHILDS) to test the theory.
- 16.60 GSS2012*** If one spouse works longer hours does this mean that the other spouse works less hours? Test the relationship between HRS1 and SPHRS1 to answer the question.
- 16.61 GSS2012*** Does staying in university longer mean that postpone having children? If so, we would expect a positive linear relationship between years of education (EDUC) and the age when one has his or her first child (AGEKDBORN). Test to determine whether there is sufficient statistical evidence of this relationship.
- 16.62 GSS2012*** Refer to Exercise 16.61. We would expect that more educated people would have fewer children. Analyze the relationship between education (EDUC) and number of children (CHILDS).
- 16.63 GSS2012*** Does the amount of education that one completes influence the amount of education his son or daughter completes? Test the relationship between a person's education (EDUC) and his or her father's education (PAEDUC).
- 16.64 GSS2012*** Refer to Exercise 16.63. Is there sufficient evidence of a positive linear relationship between the years of education (EDUC) and the years of education of one's mother (MAEDUC)?
- 16.65 GSS2012*** Are harder-working Americans more likely to urge to want government to reduce income differences? Test to determine whether there is sufficient evidence of a positive linear relationship between hours of work per week (HRS1) and position on whether government should reduce income differences (EQWLTH: 1 = Government should reduce income differences; 2, 3, 4, 5, 6, 7 = No government action).

16-5 / USING THE REGRESSION EQUATION

Using the techniques in Section 16-4, we can assess how well the linear model fits the data. If the model fits satisfactorily, we can use it to forecast and estimate values of the dependent variable. To illustrate, suppose that in Example 16.2, the used-car dealer wanted to predict the selling price of a 3-year-old Toyota Camry with 40 (thousand) miles on the odometer. Using the regression equation, with $x = 40$, we get

$$\hat{y} = 17.250 - .0669x = 17.250 - 0.0669(40) = 14.574$$

We call this value the **point prediction**, and \hat{y} is the point estimate or predicted value for y when $x = 40$. Thus, the dealer would predict that the car would sell for \$14,574.

By itself, however, the point prediction does not provide any information about how closely the value will match the true selling price. To discover that information, we must use an interval. In fact, we can use one of two intervals: the prediction interval of a particular value of y or the confidence interval estimator of the expected value of y .

16-5a Predicting the Particular Value of y for a Given x

The first confidence interval we present is used whenever we want to predict a one-time occurrence for a particular value of the dependent variable when the independent variable is a given value x_g . This interval, often called the **prediction interval**, is calculated in the usual way (point estimator \pm bound on the error of estimation). Here the point estimate for y is \hat{y} , and the bound on the error of estimation is shown below.

Prediction Interval

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{1 + \frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

where x_g is the given value of x and $\hat{y} = b_0 + b_1 x_g$

16-5b Estimating the Expected Value of y for a Given x

The conditions described in Section 16-3 imply that, for a given value of x , there is a population of values of y whose mean is

$$E(y) = \beta_0 + \beta_1 x$$

To estimate the mean of y or long-run average value of y , we would use the following interval referred to simply as the confidence interval. Again, the point estimator is \hat{y} , but the bound on the error of estimation is different from the prediction interval shown below.

Confidence Interval Estimator of the Expected Value of y

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{\frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

Unlike the formula for the prediction interval, this formula does not include the 1 under the square-root sign. As a result, the **confidence interval estimate of the expected value of y** will be narrower than the prediction interval for the same given value of x and confidence level. This is because there is less error in estimating a mean value as opposed to predicting an individual value.

EXAMPLE 16.7

Predicting the Price and Estimating the Mean Price of Used Toyota Camrys

- A used-car dealer is about to bid on a 3-year-old Toyota Camry equipped with all the standard features and with 40,000 ($x_g = 40$) miles on the odometer. To help him decide how much to bid, he needs to predict the selling price.
- The used-car dealer mentioned in part (a) has an opportunity to bid on a lot of cars offered by a rental company. The rental company has 250 Toyota Camrys all

equipped with standard features. All the cars in this lot have about 40,000 ($x_g = 40$) miles on their odometers. The dealer would like an estimate of the selling price of all the cars in the lot.

SOLUTION:

IDENTIFY

- The dealer would like to predict the selling price of a single car. Thus, he must employ the prediction interval

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{1 + \frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

- The dealer wants to determine the mean price of a large lot of cars, so he needs to calculate the confidence interval estimator of the expected value:

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{\frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

Technically, this formula is used for infinitely large populations. However, we can interpret our problem as attempting to determine the average selling price of all Toyota Camrys equipped as described above, all with 40,000 miles on the odometer. The crucial factor in part (b) is the need to estimate the mean price of a number of cars. We arbitrarily select a 95% confidence level.

COMPUTE

MANUALLY:

From previous calculations, we have the following:

$$\hat{y} = 17.250 - .0669(40) = 14.574$$

$$s_e = .3265$$

$$s_x^2 = 43.509$$

$$\bar{x} = 36.011$$

From Table 4 in Appendix B, we find

$$t_{\alpha/2} = t_{.025, 98} \approx t_{.025, 100} = 1.984$$

- The 95% prediction interval is

$$\begin{aligned} \hat{y} &\pm t_{\alpha/2, n-2} s_e \sqrt{1 + \frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}} \\ &= 14.574 \pm 1.984 \times .3265 \sqrt{1 + \frac{1}{100} + \frac{(40 - 36.011)^2}{(100-1)(43.509)}} \\ &= 14.574 \pm .652 \end{aligned}$$

The lower and upper limits of the prediction interval are \$13,922 and \$15,226, respectively.

- b. The 95% confidence interval estimator of the mean price is

$$\begin{aligned}\hat{y} &\pm t_{\alpha/2, n-2} s_e \sqrt{\frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}} \\ &= 14.574 \pm 1.984 \times .3265 \sqrt{\frac{1}{100} + \frac{(40 - 36.011)^2}{(100-1)(43.509)}} \\ &= 14.574 \pm .076\end{aligned}$$

The lower and upper limits of the confidence interval estimate of the expected value are \$14,498 and 14,650, respectively.

EXCEL

	A	B	C
1	Prediction Interval		
2			
3			Price
4			
5	Predicted value	14.574	
6			
7	Prediction Interval		
8	Lower limit	13.922	
9	Upper limit	15.227	
10			
11	Interval Estimate of Expected Value		
12	Lower limit	14.498	
13	Upper limit	14.650	

INSTRUCTIONS

1. Type or import the data into two columns*. (Open Xm16-02.)
2. Type the given value of x into any cell. We suggest the next available row in the column containing the independent variable.
3. Click Add-Ins, Data Analysis Plus, and Prediction Interval.
4. Specify the Input Y Range (A1:A101), the Input X Range (B1:B101), the Given X Range (B102), and the Confidence Level (.95).

MINITAB

Predicted Values for New Observations					
New	Obs	Fit	SE Fit	95% CI	95% PI
	1	14.5743	0.0382	(14.4985, 14.6501)	(13.9220, 15.2266)

Values of Predictors for New Observations					
New	Obs	Odometer			
	1	40.0			

* If one or both columns contain an empty cell (representing missing data), the row must be removed.

The output includes the predicted value \hat{y} (**Fit**), the standard deviation of \hat{y} (**SE Fit**), the 95% confidence interval estimate of the expected value of y (**CI**), and the 95% prediction interval (**PI**).

INSTRUCTIONS

1. Proceed through the three steps of regression analysis described on page 636. Do not click **OK**. Click **Options . . .**
2. Specify the given value of x in the **Prediction intervals for new observations** box (40).
3. Specify the confidence level (.95).

INTERPRET

We predict that one car will sell for between \$13,925 and \$15,226. The average selling price of the population of 3-year-old Toyota Camrys is estimated to lie between \$14,498 and \$14,650. Because predicting the selling price of one car is more difficult than estimating the mean selling price of all similar cars, the prediction interval is wider than the interval estimate of the expected value.

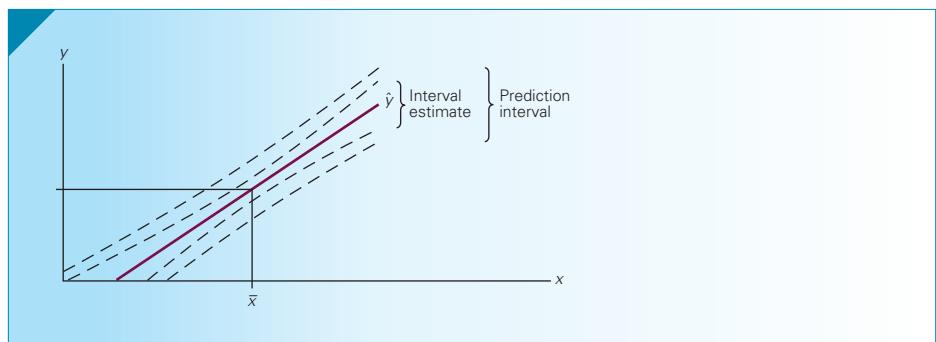
16-5c Effect of the Given Value of x on the Intervals

Calculating the two intervals for various values of x results in the graph in Figure 16.8. Notice that both intervals are represented by curved lines. This is because the farther the given value of x is from \bar{x} , the greater the estimated error becomes. This part of the estimated error is measured by

$$\frac{(x_g - \bar{x})^2}{(n - 1)s_x^2}$$

which appears in both the prediction interval and the interval estimate of the expected value.

FIGURE 16.8 Interval Estimates and Prediction Intervals





EXERCISES

- 16.66** Briefly describe the difference between predicting a value of y and estimating the expected value of y .
- 16.67** Will the prediction interval always be wider than the estimation interval for the same value of the independent variable? Briefly explain.
- 16.68** Use the regression equation in Exercise 16.2 to predict with 90% confidence the sales when the advertising budget is \$80,000.
- 16.69** Estimate with 90% confidence the mean monthly number of housing starts when the mortgage interest rate is 7% in Exercise 16.3.
- 16.70** Refer to Exercise 16.4.
 - Predict with 90% confidence the number of pounds overweight for a child who watches 35 hours of television per week.
 - Estimate with 90% confidence the mean number of pounds overweight for children who watch 35 hours of television per week.
- 16.71** Refer to Exercise 16.5. Predict with 90% confidence the number of beers to be sold when the temperature is 75 degrees.
- Exercises 16.72–16.84 require the use of a computer and software. The answers may be calculated manually. See Appendix A for the sample statistics.*
- 16.72** Refer to Exercise 16.6.
 - Predict with 95% confidence the memory test score of a viewer who watches a 30-second commercial.
 - Estimate with 95% confidence the mean memory test score of people who watch 30-second commercials.
- 16.73** Refer to Exercise 16.7.
 - Predict with 95% confidence the selling price of a 1,200 sq.ft. condominium on the 20th floor.
 - Estimate with 99% confidence the average selling price of a 1,200 sq.ft. condominium on the 15th floor.
- 16.74** Refer to Exercise 16.8. Estimate with 90% confidence the mean amount of time for 40-year-old Americans to complete the census.
- 16.75** Refer to Exercise 16.9. The company has just hired a 22-year-old telemarketer. Predict with 95% confidence how long he will stay with the company.
- 16.76** Refer to Exercise 16.10. Predict with 95% confidence the number of sick days for individuals who smoke on average 40 cigarettes per day.
- 16.77** Refer to Exercise 16.11.
 - Predict with 95% confidence the percentage loss due to fire for a house that is 8 miles away from the nearest fire station.
 - Estimate with 95% confidence the average percentage loss due to fire for houses that are 5 miles away from the nearest fire station.
- 16.78** Refer to Exercise 16.12. Estimate with 95% confidence the mean price of 60,000 sq.ft. apartment buildings.
- 16.79** Refer to Exercise 16.13. Predict with 99% confidence the price of a 1999 24-ft. Sea Ray cruiser with 400 hours of engine use.
- 16.80** Refer to Exercise 16.14. Estimate with 90% confidence the mean electricity consumption for households with four occupants.
- 16.81** Refer to Exercise 16.15. Predict the food budget of a family whose household income is \$60,000. Use a 90% confidence level.
- 16.82** Refer to Exercise 16.16. Predict with 95% confidence the monthly office rent in a city when the vacancy rate is 8%.
- 16.83** Refer to Exercise 16.17
 - Estimate with 95% confidence the mean annual income of 6'2" (74 inches)-tall men.
 - Suppose that an individual is 5'8" (68 inches). Predict with 95% confidence his annual income.
- 16.84** Refer to Exercise 16.18. Estimate with 95% confidence the mean percentage of defectives for workers who score 80 on the dexterity test.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

For Exercises 16.85 to 16.87, construct a prediction interval and a confidence interval estimate of the expected value of the dependent variable for the given value of the independent variable. Use a 95% confidence level.

- 16.85** **ANES2008*** Refer to Exercise 16.45. Time spent watching or reading news on the Internet by a person with 15 years of education.

- 16.86 ANES2008*** Refer to Exercise 16.46. Income of people who have 10 years of education.
- 16.87 ANES2008*** Refer to Exercise 16.47. Number of days watching national news on television by 50-year-old people.



GENERAL SOCIAL SURVEY EXERCISES

For Exercises 16.89 to 16.99, construct a prediction interval and a confidence interval estimate of the expected value of the dependent variable for the given value of the independent variable. Use a 95% confidence level.

- 16.89 GSS2012*** Refer to Exercise 16.51. Annual income of someone who is 45 years old.
- 16.90 GSS2012*** Refer to Exercise 16.52. Number of hours of television watching per day for people with 12 years of education.
- 16.91 GSS2012*** Refer to Exercise 16.53. Income of someone who works 40 hours per week.
- 16.92 GSS2012*** Refer to Exercise 16.54. Number of hours of work per week for someone who is 60 years old.
- 16.93 GSS2012*** Refer to Exercise 16.55. Number of hours of television per day of a 65-year-old.
- 16.94 GSS2012*** Refer to Exercise 16.56. Total family income of a family with four earners.

- 16.88** Pick any one (or more) of the four exercises above and briefly describe why the prediction interval is so wide.

- 16.95 GSS2012*** Refer to Exercise 16.59. Income of someone with one child.
- 16.96 GSS2012*** Refer to Exercise 16.62. Number of children of a person with 11 years of education.
- 16.97 GSS2012*** Refer to Exercise 16.63. Number of years of education of a person whose father had 15 years of education.
- 16.98 GSS2012*** Refer to Exercise 16.64. Number of years of education of a person whose mother had 20 years of education.
- 16.99 GSS2012*** Refer to Exercise 16.65. Position on the issue of whether government should reduce income differences of someone who works 50 hours per week.
- 16.100** Pick any 1 (or more) of the 11 exercises above and briefly describe why the prediction interval is so wide.

16-6 / REGRESSION DIAGNOSTICS—I

In Section 16-3, we described the required conditions for the validity of regression analysis. Simply put, the error variable must be normally distributed with a constant variance, and the errors must be independent of each other. In this section, we show how to diagnose violations. In addition, we discuss how to deal with observations that are unusually large or small. Such observations must be investigated to determine whether an error was made in recording them.

16-6a Residual Analysis

Most departures from required conditions can be diagnosed by examining the residuals, which we discussed in Section 16-4. Most computer packages allow you to output the values of the residuals and apply various graphical and statistical techniques to this variable.

We can also compute the standardized residuals. We standardize residuals in the same way we standardize all variables, by subtracting the mean and dividing by the standard deviation. The mean of the residuals is 0, and because the standard deviation

σ_e is unknown, we must estimate its value. The simplest estimate is the standard error of estimate s_e . Thus,

$$\text{Standardized residuals for point } i = \frac{e_i}{s_e}$$

EXCEL

Excel calculates the standardized residuals by dividing the residuals by the standard deviation of the residuals. (The difference between the standard error of estimate and the standard deviation of the residuals is that in the formula of the former the denominator is $n - 2$, whereas in the formula for the latter, the denominator is $n - 1$.)

Part of the printout (we show only the first five and last five values) for Example 16.2 follows.

	A	B	C	D
1	RESIDUAL OUTPUT			
2				
3	<i>Observation</i>	<i>Predicted Price</i>	<i>Residuals</i>	<i>Standard Residuals</i>
4	1	14.748	-0.148	-0.456
5	2	14.253	-0.153	-0.472
6	3	14.186	-0.186	-0.574
7	4	15.183	0.417	1.285
8	5	15.129	0.471	1.449
9				
10				
11				
12	95	15.149	-0.049	-0.152
13	96	14.828	-0.028	-0.087
14	97	14.962	-0.362	-1.115
15	98	15.029	-0.529	-1.628
16	99	14.628	0.072	0.222
17	100	14.815	-0.515	-1.585

INSTRUCTIONS

Proceed with the three steps of regression analysis described on page 637. Before clicking **OK**, select **Residuals** and **Standardized Residuals**. The predicted values, residuals, and standardized residuals will be printed.

We can also standardize by computing the standard deviation of each residual. Statisticians have determined that the standard deviation of the residual for observation i is defined as follows.

Standard Deviation of the i th Residual

$$s_{e_i} = s_e \sqrt{1 - b_i}$$

where

$$b_i = \frac{1}{n} + \frac{(x_i - \bar{x})^2}{(n - 1)s_x^2}$$

The quantity b_i should look familiar; it was used in the formula for the prediction interval and confidence interval estimate of the expected value of y in Section 16-6. Minitab computes this version of the standardized residuals. Part of the printout (we show only the first five and last five values) for Example 16.2 is shown below.

MINITAB

Obs	Odometer	Price	Fit	SE Fit	Residual	St Resid
1	37.4	14.6000	14.7481	0.0334	-0.1481	-0.46
2	44.8	14.1000	14.2534	0.0546	-0.1534	-0.48
3	45.8	14.0000	14.1865	0.0586	-0.1865	-0.58
4	30.9	15.6000	15.1827	0.0414	0.4173	1.29
5	31.7	15.6000	15.1292	0.0391	0.4708	1.45
96	36.2	14.8000	14.8284	0.0327	-0.0284	-0.09
97	34.2	14.6000	14.9621	0.0339	-0.3621	-1.12
98	33.2	14.5000	15.0289	0.0355	-0.5289	-1.63
99	39.2	14.7000	14.6278	0.0363	0.0722	0.22
100	36.4	14.3000	14.8150	0.0327	-0.5150	-1.59

INSTRUCTIONS

Proceed with the three steps of regression analysis as described on page 637. After specifying the **Response** and **Predictors**, click **Results...**, and **In addition, the full table of fits and residuals**.

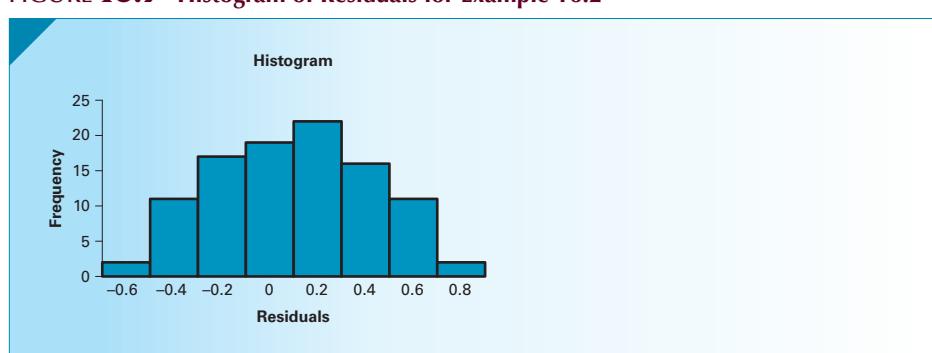
The predicted values, residuals, and standardized residuals will be printed.

An analysis of the residuals will allow us to determine whether the error variable is nonnormal, whether the error variance is constant, and whether the errors are independent. We begin with nonnormality.

16-6b Nonnormality

As we've done throughout this book, we check for normality by drawing the histogram of the residuals. Figure 16.9 is Excel's version (Minitab's is similar). As you can see, the histogram is bell shaped, leading us to believe that the error is normally distributed.

FIGURE 16.9 Histogram of Residuals for Example 16.2



16-6c Heteroscedasticity

The variance of the error variable σ_e^2 is required to be constant. When this requirement is violated, the condition is called **heteroscedasticity**. (You can impress friends and relatives by using this term. If you can't pronounce it, try **homoscedasticity**, which refers to the condition where the requirement is satisfied.) One method of diagnosing heteroscedasticity is to plot the residuals against the predicted values of y . We then look for a change in the spread of the plotted points.* Figure 16.10 describes such a situation. Notice that in this illustration, σ_e^2 appears to be small when \hat{y} is small and large when \hat{y} is large. Of course, many other patterns could be used to depict this problem.

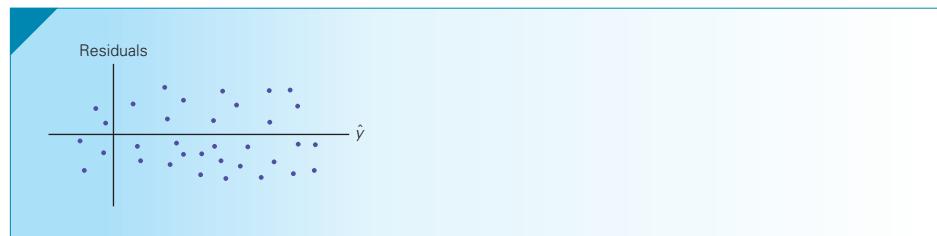
FIGURE 16.10 Plot of Residuals Depicting Heteroscedasticity



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Figure 16.11 illustrates a case in which σ_e^2 is constant. As a result, there is no apparent change in the variation of the residuals.

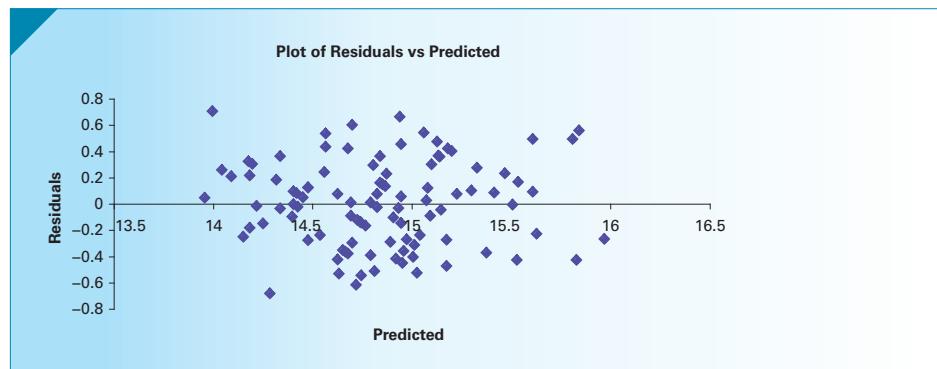
FIGURE 16.11 Plot of Residuals Depicting Homoscedasticity



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Excel's plot of the residuals versus the predicted values of y for Example 16.2 is shown in Figure 16.12. There is no sign of heteroscedasticity.

FIGURE 16.12 Plot of Predicted Values versus Residuals for Example 16.2



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*Keller's website Appendix Szroeter's Test describes a test for heteroscedasticity.

16-6d Nonindependence of the Error Variable

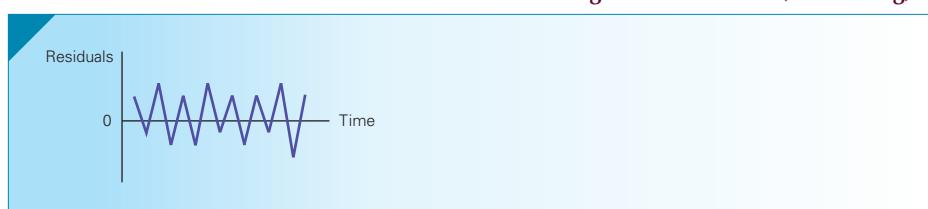
In Chapter 3, we briefly described the difference between cross-sectional and time-series data. Cross-sectional data are observations made at approximately the same time, whereas a time series is a set of observations taken at successive points of time. The data in Example 16.2 are cross-sectional because all of the prices and odometer readings were taken at about the same time. If we were to observe the auction price of cars every week for, say, a year, that would constitute a time series.

Condition 4 states that the values of the error variable are independent. When the data are time series, the errors often are correlated. Error terms that are correlated over time are said to be **autocorrelated** or **serially correlated**. For example, suppose that, in an analysis of the relationship between annual gross profits and some independent variable, we observe the gross profits for the years 1991 to 2010. The observed values of y are denoted y_1, y_2, \dots, y_{20} , where y_1 is the gross profit for 1991, y_2 is the gross profit for 1992, and so on. If we label the residuals e_1, e_2, \dots, e_{20} , then—if the independence requirement is satisfied—there should be no relationship among the residuals. However, if the residuals are related, it is likely that autocorrelation exists.

We can often detect autocorrelation by graphing the residuals against the time periods. If a pattern emerges, it is likely that the independence requirement is violated. Figures 16.13 (alternating positive and negative residuals) and 16.14 (increasing residuals) exhibit patterns indicating autocorrelation. (Notice that we joined the points to make it easier to see the patterns.) Figure 16.15 shows no pattern (the residuals appear to be randomly distributed over the time periods) and thus likely represent the occurrence of independent errors.

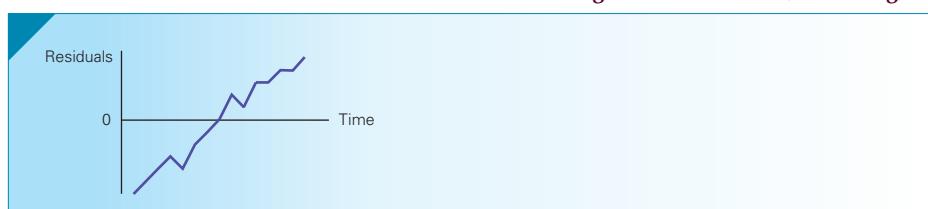
In Chapter 17, we introduce the Durbin-Watson test, which is another statistical test to determine whether one form of autocorrelation is present.

FIGURE 16.13 Plot of Residuals versus Time Indicating Autocorrelation (Alternating)



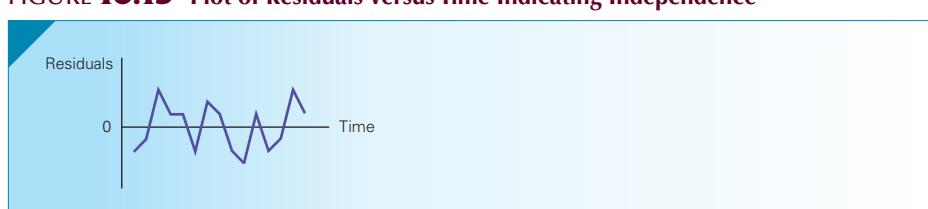
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FIGURE 16.14 Plot of Residuals versus Time Indicating Autocorrelation (Increasing)



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FIGURE 16.15 Plot of Residuals versus Time Indicating Independence



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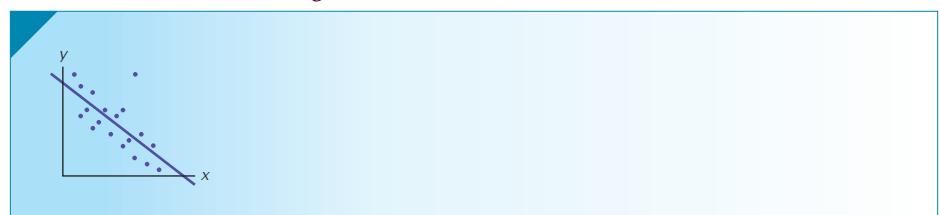
16-6e Outliers

An **outlier** is an observation that is unusually small or unusually large. To illustrate, consider Example 16.2, where the range of odometer readings was 19.1 to 49.2 thousand miles. If we had observed a value of 5,000 miles, we would identify that point as an outlier. We need to investigate several possibilities.

1. There was an error in recording the value. To detect an error, we would check the point or points in question. In Example 16.2, we could check the car's odometer to determine whether a mistake was made. If so, we would correct it before proceeding with the regression analysis.
2. The point should not have been included in the sample. Occasionally, measurements are taken from experimental units that do not belong with the sample. We can check to ensure that the car with the 5,000-mile odometer reading was actually 3 years old. We should also investigate the possibility that the odometer was rolled back. In either case, the outlier should be discarded.
3. The observation was simply an unusually large or small value that belongs to the sample and that was recorded properly. In this case, we would do nothing to the outlier. It would be judged to be valid.

Outliers can be identified from the scatter diagram. Figure 16.16 depicts a scatter diagram with one outlier. The statistics practitioner should check to determine whether the measurement was recorded accurately and whether the experimental unit should be included in the sample.

FIGURE 16.16 Scatter Diagram with One Outlier



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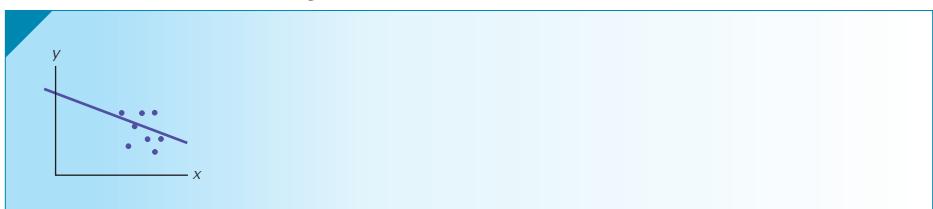
The standardized residuals also can be helpful in identifying outliers. Large absolute values of the standardized residuals should be thoroughly investigated. Minitab automatically reports standardized residuals that are less than -2 and greater than 2 .

16-6f Influential Observations

Occasionally, in a regression analysis, one or more observations have a large influence on the statistics. Figure 16.17 describes such an observation and the resulting least squares line. If the point had not been included, the least squares line in Figure 16.18 would have been produced. Obviously, one point has had an enormous influence on the results. Influential points can be identified by the scatter diagram. The point may be an outlier and as such must be investigated thoroughly. Minitab also identifies influential observations.

FIGURE 16.17 Scatter Diagram with One Influential Observation

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FIGURE 16.18 Scatter Diagram without the Influential Observation

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16-6g Procedure for Regression Diagnostics

The order of the material presented in this chapter is dictated by pedagogical requirements. Consequently, we presented the least squares method of assessing the model's fit, predicting and estimating using the regression equation, coefficient of correlation, and finally, the regression diagnostics. In a practical application, the regression diagnostics would be conducted earlier in the process. It is appropriate to investigate violations of the required conditions when the model is assessed and before using the regression equation to predict and estimate. The following steps describe the entire process. (In Chapter 18, we will discuss model building, for which the following steps represent only a part of the entire procedure.)

- 1.** Develop a model that has a theoretical basis; that is, for the dependent variable in question, find an independent variable that you believe is linearly related to it.
- 2.** Gather data for the two variables. Ideally, conduct a controlled experiment. If that is not possible, collect observational data.
- 3.** Draw the scatter diagram to determine whether a linear model appears to be appropriate. Identify possible outliers.
- 4.** Determine the regression equation.
- 5.** Calculate the residuals and check the required conditions:
Is the error variable nonnormal?
Is the variance constant?
Are the errors independent?
Check the outliers and influential observations.
- 6.** Assess the model's fit.
Compute the standard error of estimate.

Test to determine whether there is a linear relationship. (Test β_1 or ρ .)
Compute the coefficient of determination.

- 7.** If the model fits the data, use the regression equation to predict a particular value of the dependent variable or estimate its mean (or both).



EXERCISES

- 16.101** You are given the following six points:

x	-5	-2	0	3	4	7
y	15	9	7	6	4	1

- a. Determine the regression equation.
- b. Use the regression equation to determine the predicted values of y .
- c. Use the predicted and actual values of y to calculate the residuals.
- d. Compute the standardized residuals.
- e. Identify possible outliers.

- 16.102** Refer to Exercise 16.2. Calculate the residuals and the predicted values of y .

- 16.103** Calculate the residuals and predicted values of y in Exercise 16.3.

- 16.104** Refer to Exercise 16.4.

- a. Calculate the residuals.
- b. Calculate the predicted values of y .
- c. Plot the residuals (on the vertical axis) and the predicted values of y .

- 16.105** Calculate and plot the residuals and predicted values of y for Exercise 16.5.

The following exercises require the use of a computer and software.

- 16.106** Refer to Exercise 16.6.

- a. Determine the residuals and the standardized residuals.
- b. Draw the histogram of the residuals. Does it appear that the errors are normally distributed? Explain.
- c. Identify possible outliers.
- d. Plot the residuals versus the predicted values of y . Does it appear that heteroscedasticity is a problem? Explain.

- 16.107** Refer to Exercise 16.7.

- a. Does it appear that the errors are normally distributed? Explain.
- b. Does it appear that heteroscedasticity is a problem? Explain.

- 16.108** Are the required conditions satisfied in Exercise 16.8?

- 16.109** Refer to Exercise 16.9.

- a. Determine the residuals and the standardized residuals.
- b. Draw the histogram of the residuals. Does it appear that the errors are normally distributed? Explain.
- c. Identify possible outliers.
- d. Plot the residuals versus the predicted values of y . Does it appear that heteroscedasticity is a problem? Explain.

- 16.110** Refer to Exercise 16.10. Are the required conditions satisfied?

- 16.111** Refer to Exercise 16.11.

- a. Determine the residuals and the standardized residuals.
- b. Draw the histogram of the residuals. Does it appear that the errors are normally distributed? Explain.
- c. Identify possible outliers.
- d. Plot the residuals versus the predicted values of y . Does it appear that heteroscedasticity is a problem? Explain.

- 16.112** Check the required conditions for Exercise 16.12.

- 16.113** Refer to Exercise 16.13. Are the required conditions satisfied?

- 16.114** Refer to Exercise 16.14.

- a. Determine the residuals and the standardized residuals.
- b. Draw the histogram of the residuals. Does it appear that the errors are normally distributed? Explain.
- c. Identify possible outliers.
- d. Plot the residuals versus the predicted values of y . Does it appear that heteroscedasticity is a problem? Explain.

- 16.115** Are the required conditions satisfied for Exercise 16.15?

- 16.116** Check to ensure that the required conditions for Exercise 16.16 are satisfied.

- 16.117** Are the required conditions satisfied for Exercise 16.17?

- 16.118** Perform a complete diagnostic analysis for Exercise 16.18 to determine whether the required conditions are satisfied.

CHAPTER SUMMARY

Simple linear regression and correlation are techniques for analyzing the relationship between two interval variables. Regression analysis assumes that the two variables are linearly related. The least squares method produces estimates of the intercept and the slope of the regression line. Considerable effort is expended in assessing how well the linear model fits the data. We calculate the standard error of estimate, which is an estimate of the standard deviation of the error variable. We test the slope to determine whether

there is sufficient evidence of a linear relationship. The strength of the linear association is measured by the coefficient of determination. When the model provides a good fit, we can use it to predict the particular value and to estimate the expected value of the dependent variable. We can also use the Pearson correlation coefficient to measure and test the relationship between two bivariate normally distributed variables. We completed this chapter with a discussion of how to diagnose violations of the required conditions.

IMPORTANT TERMS:

- Regression analysis 629
- Dependent variable 629
- Independent variable 629
- Deterministic model 630
- Probabilistic model 630
- Error variable 631
- First-order linear model 631
- Simple linear regression model 631
- Least squares method 632
- Residuals 634

- Sum of squares for error 634
- Standard error of estimate 644
- Coefficient of determination 650
- Pearson coefficient of correlation 654
- Point prediction 660
- Prediction interval 661
- Confidence interval estimate of the expected value of y 661
- Heteroscedasticity 669
- Homoscedasticity 669
- Autocorrelation 670
- Serial correlation 670

SYMBOLS:

Symbol	Pronounced	Represents
β_0	Beta sub zero or beta zero	y -intercept
β_1	Beta sub one or beta one	Slope coefficient
ϵ	Epsilon	Error variable
\hat{y}	y hat	Fitted or calculated value of y
b_0	b sub zero or b zero	Sample y -intercept coefficient
b_1	b sub one or b one	Sample slope coefficient
σ_ϵ	Sigma sub epsilon or sigma epsilon	Standard deviation of error variable
s_ϵ	s sub epsilon or s epsilon	Standard error of estimate
s_{b_1}	s sub b sub one or s b one	Standard error of b_1
R^2	R squared	Coefficient of determination
x_g	x sub g or x g	Given value of x
ρ	Rho	Pearson coefficient of correlation
r		Sample coefficient of correlation
e_i	e sub i or e i	Residual of i th point

FORMULAS:

Sample slope

$$b_1 = \frac{s_{xy}}{s_x^2}$$

Sample y -intercept

$$b_0 = \bar{y} - b_1 \bar{x}$$

Sum of squares for error

$$\text{SSE} = \sum_{i=1}^n (y_i - \hat{y}_i)^2$$

Standard error of estimate

$$s_e = \sqrt{\frac{\text{SSE}}{n-2}}$$

Test statistic for the slope

$$t = \frac{b_1 - \beta_1}{s_{b_1}}$$

Standard error of b_1

$$s_{b_1} = \frac{s_e}{\sqrt{(n-1)s_x^2}}$$

Coefficient of determination

$$R^2 = \frac{s_{xy}^2}{s_x^2 s_y^2} = 1 - \frac{\text{SSE}}{\sum (y_i - \bar{y})^2}$$

Prediction interval

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{1 + \frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

Confidence interval estimator of the expected value of y

$$\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{\frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$$

Sample coefficient of correlation

$$r = \frac{s_{xy}}{s_x s_y}$$

Test statistic for testing $\rho = 0$

$$t = r \sqrt{\frac{n-2}{1-r^2}}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Regression	637	637
Correlation	656	656
Prediction interval	663	663
Regression diagnostics	667	668

CHAPTER EXERCISES

The following exercises require the use of a computer and software. The answers to some of the questions may be calculated manually. See Appendix A for the sample statistics. **Conduct all tests of hypotheses at the 5% significance level.**

- 16.119** **Xr16-119** The manager of Colonial Furniture has been reviewing weekly advertising expenditures. During the past 6 months, all advertisements for the store have appeared in the local newspaper. The number of ads per week has varied from one to seven. The store's sales staff has been tracking the number of customers who enter the store

each week. The number of ads and the number of customers per week for the past 26 weeks were recorded.

- Determine the sample regression line.
- Interpret the coefficients.
- Can the manager infer that the larger the number of ads, the larger the number of customers?
- Find and interpret the coefficient of determination.
- In your opinion, is it a worthwhile exercise to use the regression equation to predict the

number of customers who will enter the store, given that Colonial intends to advertise five times in the newspaper? If so, find a 95% prediction interval. If not, explain why not.

- 16.120** **Xr16-120** The president of a company that manufactures car seats has been concerned about the number and cost of machine breakdowns. The problem is that the machines are old and becoming quite unreliable. However, the cost of replacing them is quite high, and the president is not certain that the cost can be made up in today's slow economy. To help make a decision about replacement, he gathered data about last month's costs for repairs and the ages (in months) of the plant's 20 welding machines.

- Find the sample regression line.
- Interpret the coefficients.
- Determine the coefficient of determination, and discuss what this statistic tells you.
- Conduct a test to determine whether the age of a machine and its monthly cost of repair are linearly related.
- Is the fit of the simple linear model good enough to allow the president to predict the monthly repair cost of a welding machine that is 120 months old? If so, find a 95% prediction interval. If not, explain why not.

- 16.121** **Xr16-121** An agronomist wanted to investigate the factors that determine crop yield. Accordingly, she undertook an experiment wherein a farm was divided into 30 one-acre plots. The amount of fertilizer applied to each plot was varied. Corn was then planted, and the amount of corn harvested at the end of the season was recorded.

- Find the sample regression line, and interpret the coefficients.
- Can the agronomist conclude that there is a linear relationship between the amount of fertilizer and the crop yield?
- Find the coefficient of determination, and interpret its value.
- Does the simple linear model appear to be a useful tool in predicting crop yield from the amount of fertilizer applied? If so, produce a 95% prediction interval of the crop yield when 300 pounds of fertilizer are applied. If not, explain why not.

- 16.122** **Xr16-122** Every year, the United States Federal Trade Commission rates cigarette brands according to their levels of tar and nicotine, substances that are hazardous to smokers' health. Additionally, the commission includes the amount of carbon monoxide, which is a by-product of burning tobacco that seriously affects the heart. A random sample of 25 brands was taken.

- Are the levels of tar and nicotine linearly related?
- Are the levels of nicotine and carbon monoxide linearly related?

- 16.123** **Xr16-123** Some critics of television complain that the amount of violence shown on television contributes to violence in our society. Others point out that television also contributes to the high level of obesity among children. We may have to add financial problems to the list. A sociologist theorized that people who watch television frequently are exposed to many commercials, which in turn leads them to buy more, finally resulting in increasing debt. To test this belief, a sample of 430 families was drawn. For each, the total debt and the number of hours the television is turned on per week were recorded. Perform a statistical procedure to help test the theory.

- 16.124** **Xr16-124** The analysis that the human resources manager performed in Exercise 16.18 indicated that the dexterity test is not a predictor of job performance. However, before discontinuing the test, he decided that the problem is that the statistical analysis was flawed because it examined the relationship between test score and job performance only for those who scored well in the test. (Recall that only those who scored above 70 were hired; applicants who achieved scores below 70 were not hired.) The manager decided to perform another statistical analysis. A sample of 50 job applicants who scored above 50 were hired, and as before the workers' performance was measured. The test scores and percentages of nondefective computers produced were recorded. On the basis of these data, should the manager discontinue the dexterity tests?

- 16.125** **Xr16-125** Mutual funds minimize risks by diversifying the investments they make. There are mutual funds that specialize in particular types of investments. For example, the TD Precious Metal Mutual Fund buys shares in gold mining companies. The value of this mutual fund depends on a number of factors related to the companies in which the fund invests as well as on the price of gold. To investigate the relationship between the value of the fund and the price of gold, an MBA student gathered the daily fund price and the daily price of gold for a 28-day period. Can we infer from these data that there is a positive linear relationship between the value of the fund and the price of gold? (The authors are grateful to Jim Wheat for writing this exercise.)

- 16.126** **Xr03-59 (Exercise 3.59 revisited)** A very large contribution to profits for a movie theater is the sale

of popcorn, soft drinks, and candy. A movie theater manager speculated that the longer the time between showings of a movie, the greater the sales of concessions. To acquire more information the manager conducted an experiment. For a month he varied the amount of time between movie showings and calculated the sales. Can the manager conclude that when the times between movies increase so do sales?

- 16.127** *Xr16-127** A computer dating service typically asks for various pieces of information such as height, weight, income, and so on. One such service requested the length of index fingers. The only plausible reason for this request is to act as a proxy on height. Women have often complained that men lie about their heights. If there is a strong relationship between heights and index fingers, the information can be used to “correct” false claims about heights. To test the relationship between the two variables researchers gathered the heights and lengths of index fingers (in centimeters) of 121 students.
- Graph the relationship between the two variables.

- Is there sufficient evidence to infer that height and length of index fingers are linearly related?
- Predict with 95% confidence the height of someone whose index finger is 6.5 cm long. Is this prediction likely to be useful? Explain. (The authors would like to thank Howard Waner for supplying the problem and data.)

The following exercises employ data files associated with two previous exercises.

- 16.128** *Xr12-31** In addition to the data recorded for Exercises 12.31 and 13.217, we recorded the grade point average of the students who held down part-time jobs. Determine whether there is evidence of a linear relationship between the hours spent at part-time jobs and the grade point averages.
- 16.129** *Xr13-19** Exercise 13.19 described a survey that asked people between 18 and 34 years of age and 35 to 50 years of age how much time they spent listening to FM radio each day. Also recorded were the amounts spent on music throughout the year. Can we infer that a linear relationship exists between listening times and amounts spent on music?

CASE 16.1

Insurance Compensation for Lost Revenues*

DATA
C16-01

In July 1990, a rock-and-roll museum opened in Atlanta, Georgia. The museum was located in a large city block containing a variety of stores. In late July 1992, a fire that started in one of these stores burned the entire block, including the museum. Fortunately, the museum had taken out insurance to cover the cost of rebuilding as well as lost revenue. As a general rule, insurance companies base their payment on how well the company performed in the past. However, the owners of the museum argued that the revenues were increasing, and hence they were entitled to more money under their insurance plan.

The argument was based on the revenues and attendance figures of an amusement park, featuring rides and other similar attractions that had opened nearby. The amusement park opened in December 1991. The two entertainment facilities were operating jointly during the last 4 weeks of 1991 and the first 28 weeks of 1992 (the point at which the fire destroyed the museum). In April 1995, the museum reopened with considerably more features than the original one.

The attendance figures for both facilities for December 1991 to October 1995 are listed in columns 1 (museum) and 2 (amusement



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park). During the period when the museum was closed, the data show zero attendance.

The owners of the museum argued that the weekly attendance from the 29th week of 1992 to the 16th week of 1995 should be estimated using the most current data (17th to 42nd week of 1995). The insurance company argued that the estimates should be based on the 4 weeks of 1991 and the 28 weeks of 1992, when both facilities were operating and before the museum reopened

with more features than the original museum.

- Estimate the coefficients of the simple regression model based on the insurance company's argument. In other words, use the attendance figures for the last 4 weeks in 1991 and the next 28 weeks in 1992 to estimate the coefficients. Then use the model to calculate point

predictions for the museum's weekly attendance figures when the museum was closed. Calculate the predicted total attendance.

- Repeat part (a) using the museum's argument—that is, use the attendance figures after the reopening in 1995 to estimate the regression coefficients and use the equation to

predict the weekly attendance when the museum was closed. Calculate the total attendance that was lost because of the fire.

- Write a report to the insurance company discussing this analysis and include your recommendation about how much the insurance company should award the museum?

*The case and the data are real. The names have been changed to preserve anonymity. The author wishes to thank Dr. Kevin Leonard for supplying the problem and the data.

CASE 16.2

Predicting University Grades from High School Grades*

Onario high school students must complete a minimum of six Ontario Academic Credits (OACs) to gain admission to a university in the province. Most students take more than six OACs because universities take the average of the best six in deciding which students to admit. Most programs at universities require high school students to select certain courses. For example, science programs require two of chemistry, biology, and physics. Students applying to engineering must complete at least two mathematics OACs as well as physics. In recent years, one business program began an examination

of all aspects of its program, including the criteria used to admit students. Students are required to take English and calculus OACs, and the minimum high school average is about 85%. Strangely enough, even though students are required to complete English and calculus, the marks in these subjects are not included in the average unless they are in the top six courses in a student's transcript. To examine the issue, the registrar took a random sample of students who recently graduated with the BBA (bachelor of business administration degree). He recorded the university GPA (range 0 to 12), the high school average based on the

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DATA
C16-02

best six courses, and the high school average using English and calculus and the four next best marks.

- Is there a relationship between university grades and high school average using the best six OACs?
- Is there a relationship between university grades and high school average using the best four OACs plus calculus and English?
- Write a report to the university's academic vice president describing your statistical analysis and your recommendations.

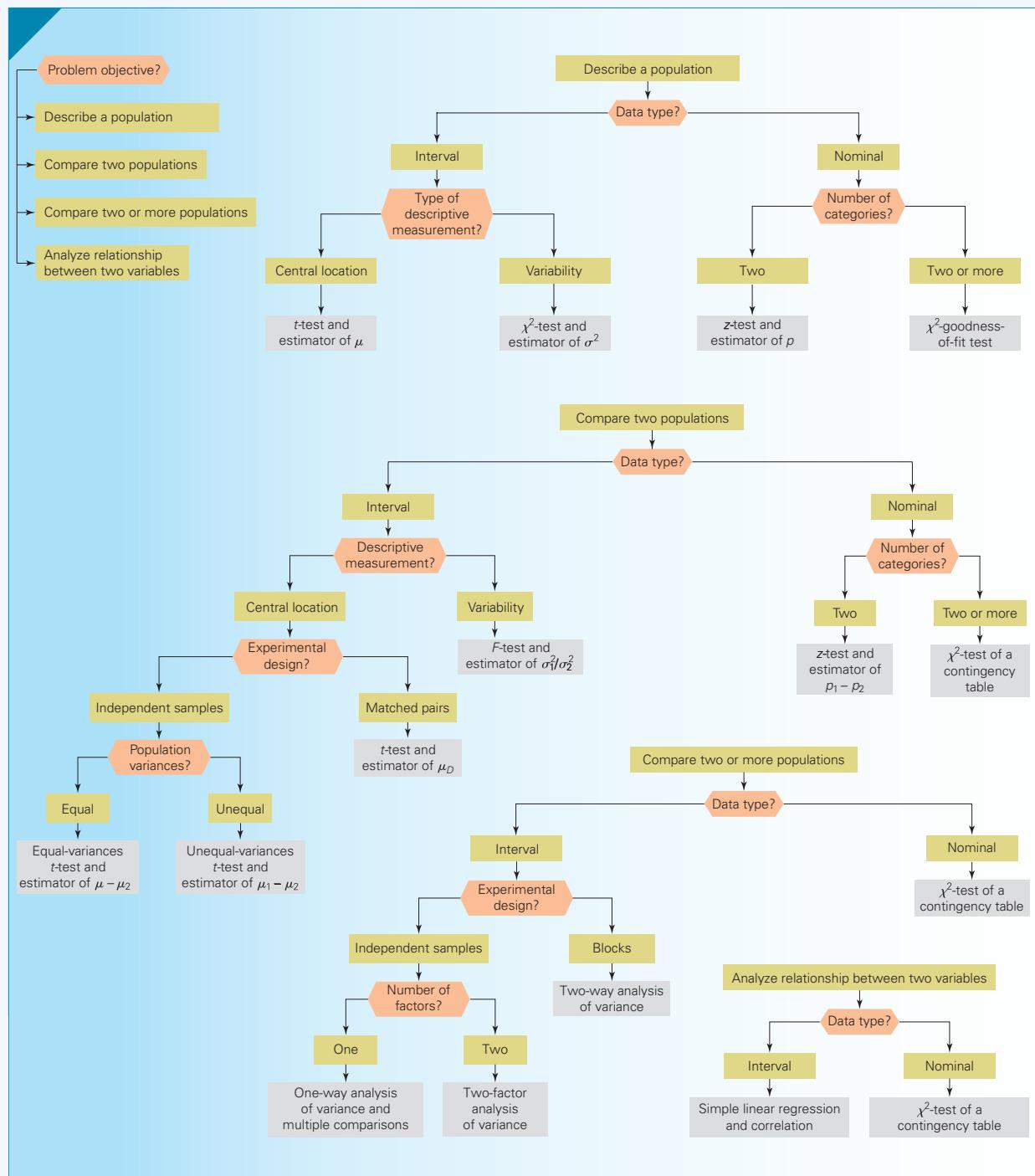
*The author is grateful to Leslie Grauer for her help in gathering the data for this case.

APPENDIX 16 / REVIEW OF CHAPTERS 12 TO 16

We have now presented two dozen inferential techniques. Undoubtedly, the task of choosing the appropriate technique is growing more difficult. Table A16.1 lists all the statistical inference methods covered since Chapter 12. Figure A16.1 is a flowchart to help you choose the correct technique.

TABLE A16.1 Summary of Statistical Techniques in Chapters 12 to 16

<i>t</i> -test of μ
Estimator of μ (including estimator of $N\mu$)
χ^2 -test of σ^2
Estimator of σ^2
<i>z</i> -test of p
Estimator of p (including estimator of Np)
Equal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
<i>t</i> -test of μ_D
Estimator of μ_D
<i>F</i> -test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
<i>z</i> -test of $p_1 - p_2$ (Case 1)
<i>z</i> -test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$
One-way analysis of variance (including multiple comparisons)
Two-way (randomized blocks) analysis of variance
Two-factor analysis of variance
χ^2 -goodness-of-fit test
χ^2 -test of a contingency table
Simple linear regression and correlation (including <i>t</i> -tests of β_1 and ρ , and prediction and confidence intervals)

FIGURE A16.1 Flowchart of Techniques in Chapters 12 to 16



EXERCISES

A16.1 **XrA16-01** In the last decade, society in general and the judicial system in particular have altered their opinions on the seriousness of drunken driving. In most jurisdictions, driving an automobile with a blood alcohol level in excess of .08 is a felony. Because of a number of factors, it is difficult to provide guidelines for when it is safe for someone who has consumed alcohol to drive a car. In an experiment to examine the relationship between blood alcohol level and the weight of a drinker, 50 men of varying weights were each given three beers to drink, and 1 hour later their blood alcohol levels were measured. If we assume that the two variables are normally distributed, can we conclude that blood alcohol level and weight are related?

A16.2 **XrA16-02** An article in the journal *Appetite* (December 2003) described an experiment to determine the effect that breakfast meals have on school children. A sample of 29 children was tested on four successive days, having a different breakfast each day. The breakfast meals were

1. Cereal (Cheerios)
2. Cereal (Shreddies)
3. A glucose drink
4. No breakfast

The order of breakfast meals was randomly assigned. A computerized test of working memory was conducted prior to breakfast and again 2 hours later. The decrease in scores was recorded. Do these data allow us to infer that there are differences in the decrease depending on the type of breakfast?

A16.3 Do cell phones cause cancer? This is a multibillion-dollar question. Currently, dozens of lawsuits are pending that claim cell phone use has caused cancer. To help shed light on the issue, several scientific research projects have been undertaken. One such project was conducted by Danish researchers. The 13-year study examined 420,000 Danish cell phone users. The scientists determined the number of Danes who would be expected to contract various forms of cancer. The expected number and the actual number of cell phone users who developed each type of cancer are listed here.

Cancer	Expected Number	Actual Number
Brain and nervous system	143	135
Salivary glands	9	7
Leukemia	80	77
Pharynx	52	32
Esophagus	57	42
Eye	12	8
Thyroid	13	13

- a. Can we infer from these data that there is a relationship between cell phone use and cancer?
- b. Discuss the results, including whether the data are observational or experimental. Provide several interpretations of the statistics. In particular, indicate whether you can infer that cell phone use causes cancer.

Source: Journal of the National Cancer Institute, 2001.

A16.4 **XrA16-04** A new antiflu vaccine designed to reduce the duration of symptoms has been developed. However, the effect of the drug varies from person to person. To examine the effect of age on the effectiveness of the drug, a sample of 140 flu sufferers was drawn. Each person reported how long the symptoms of the flu persisted and his or her age. Do these data provide sufficient evidence to infer that the older the patient, the longer it takes for the symptoms to disappear?

A16.5 **XrA16-05** Several years ago we heard about the "Mommy Track," the phenomenon of women being underpaid in the corporate world because of what is seen as their divided loyalties between home and office. There may also be a "Daddy Differential," which refers to the situation where men whose wives stay at home earn more than men whose wives work. It is argued that the differential occurs because bosses reward their male employees if they come from "traditional families." Linda Stroh of Loyola University of Chicago studied a random sample of 348 male managers employed by 20 *Fortune 500* companies. Each manager reported whether his wife stayed at home to care for their children or worked outside the home, and his annual income. The incomes (in thousands of dollars) were recorded. The incomes of the managers whose wives stay at home are stored in column 1.

Column 2 contains the incomes of managers whose wives work outside the home.

- Can we conclude that men whose wives stay at home earn more than men whose wives work outside the home?
- If your answer in part (a) is affirmative, does this establish a case for discrimination? Can you think of another cause-and-effect scenario? Explain.

A16.6 XrA16-06 There are enormous differences between health-care systems in the United States and Canada. In a study to examine one dimension of these differences, 300 heart attack victims in each country were randomly selected. (Results of the study conducted by Dr. Daniel Mark of Duke University Medical Center, Dr. David Naylor of Sunnybrook Hospital in Toronto, and Dr. Paul Armstrong of the University of Alberta were published in the *Toronto Sun*, October 27, 1994.) Each patient was asked the following questions regarding the effect of his or her treatment:

- How many days did it take you to return to work?
- Do you still have chest pain? (This question was asked 1 month, 6 months, and 12 months after the patients' heart attacks.)

The responses were recorded in the following way:

Column 1: Code representing nationality: 1 = U.S.; 2 = Canada

Column 2: Responses to question 1

Column 3: Responses to question 2–1 month after heart attack: 2 = yes; 1 = no

Column 4: Responses to question 2–6 months after heart attack: 2 = yes; 1 = no

Column 5: Responses to question 2–12 months after heart attack: 2 = yes; 1 = no

Can we conclude that recovery is faster in the United States?

A16.7 XrA16-07 Betting on the results of National Football League games is a popular North American activity. In some states and provinces, it is legal to do so provided that wagers are made through a government-authorized betting organization. In the province of Ontario, Pro-Line serves that function. Bettors can choose any team on which to wager, and Pro-Line sets the odds, which determine the winning payoffs. It is also possible to bet that in any game a tie will be the result. (A tie is defined as a game in which the winning margin is 3 or fewer points. A win occurs when the winning margin is greater than 3.) To assist bettors, Pro-Line lists the favorite for each game and predicts the point spread between the two teams. To

judge how well Pro-Line predicts outcomes, the Creative Statistics Company tracked the results of a recent season. It recorded whether a team was favored by (1) 3 or fewer points, (2) 3.5 to 7 points, (3) 7.5 to 11 points, or (4) 11.5 or more points. It also recorded whether the favored team (1) won, (2) lost, or (3) tied. These data are recorded in columns 1 (Pro-Line's predictions) and 2 (game results). Can we conclude that Pro-Line's forecasts are useful for bettors?

A16.8 XrA16-08 As all baseball fans know, first base is the only base that the base runner may overrun. At both second and third base, the runner may be tagged out if he runs past the base. Consequently, on close plays at second and third base, the runner will slide, enabling him to stop at the base. In recent years, however, several players have chosen to slide headfirst when approaching first base, claiming that this is faster than simply running over the base. In an experiment to test this claim, 25 players on one National League team were recruited. Each player ran to first base with and without sliding, and the times to reach the base were recorded. Can we conclude that sliding is slower than not sliding?

A16.9 XrA16-09 How does mental outlook affect a person's health? The answer to this question may allow physicians to care more effectively for their patients. In an experiment to examine the relationship between attitude and physical health, Dr. Daniel Mark, a heart specialist at Duke University, studied 1,719 men and women who had recently undergone a heart catheterization, a procedure that checks for clogged arteries. Patients undergo this procedure when heart disease results in chest pain. All of the patients in the experiment were in about the same condition. In interviews, 14% of the patients doubted that they would recover sufficiently to resume their daily routines. Dr. Mark identified these individuals as pessimists; the others were (by default) optimists. After one year, Dr. Mark recorded how many patients were still alive. The data are stored in columns 1 (1 = optimist, 2 = pessimist) and 2 (2 = alive, 1 = dead). Do these data allow us to infer that pessimists are less likely to survive than optimists with similar physical ailments?

A16.10 XrA16-10 Physicians have been recommending more exercise for their patients, particularly those who are overweight. One benefit of regular exercise appears to be a reduction in cholesterol, a substance associated with heart disease. To study the relationship more carefully, a physician took a random sample of 50 patients who do not exercise and measured their cholesterol levels. He then started them on regular exercise programs. After

4 months, he asked each patient how many minutes per week (on average) he or she exercised; he also measured their cholesterol levels. Column 1 = weekly exercise in minutes, column 2 = cholesterol level before exercise program, and column 3 = cholesterol level after exercise program.

- Do these data allow us to infer that the amount of exercise and the reduction in cholesterol levels are related?
- Produce a 95% interval of the amount of cholesterol reduction for someone who exercises for 100 minutes per week.
- Produce a 95% interval for the average cholesterol reduction for people who exercise for 120 minutes per week.

A16.11 **XrA16-11** An economist working for a state university wanted to acquire information about salaries in publicly funded and private colleges and universities. She conducted a survey of 623 public-university faculty members and 592 private-university faculty members asking each to report his or her rank (instructor = 1, assistant professor = 2, associate professor = 3, and professor = 4) and current salary (\$1,000).

- Conduct a test to determine whether public colleges and universities and private colleges and universities pay different salaries when all ranks are combined.
- For each rank, determine whether there is enough evidence to infer that the private college and university salaries differ from that of publicly funded colleges and universities.
- If the answers to parts (a) and (b) differ, suggest a cause.
- Conduct a test to determine whether your suggested cause is valid.

Source: Adapted from the American Association of University Professors, AAUP Annual Report on the Economic Status of the Profession.

A16.12 **XrA16-12** Millions of people suffer from migraine headaches. The costs in work days lost, medication, and treatment are measured in the billions of dollars. A study reported in the *Journal of the American Medical Association* (2005, 293: 2118–2125) described an experiment that examined whether acupuncture is an effective procedure in treating migraines. A random sample of 302 migraine patients was selected and divided into three groups. Group 1 was treated with acupuncture; group 2 was treated with sham acupuncture (patients believed that they were being treated with acupuncture but were not); and group 3 was not treated at all. The number of headache days per month was recorded for each patient before the treatments began. The number of headache days per month after treatment was also measured.

- Conduct a test to determine whether there are differences in the number of headache days before treatment between the three groups of patients.
- Test to determine whether differences exist after treatment. If so, what are the differences?
- Why was the test in part (a) conducted?

A16.13 **XrA16-13** The battle between customers and car dealerships is often intense. Customers want the lowest price, and dealers want to extract as much money as possible. One source of conflict is the trade-in car. Most dealers will offer a relatively low trade-in in anticipation of negotiating the final package. In an effort to determine how dealers operate, a consumer organization undertook an experiment. Seventy-two individuals were recruited. Each solicited an offer on his or her 5-year-old Toyota Camry. The exact same car was used throughout the experiment. The only variables were the age and gender of the “owner.” The ages were categorized as (1) young, (2) middle, and (3) senior. The cash offers are stored in columns 1 and 2. Column 1 stores the data for female owners, and column 2 contains the offers made to male owners. The first 12 rows in both columns represent the offers made to young people, the next 12 rows represent the middle group, and the last 12 rows represent the elderly owners.

- Can we infer that differences exist between the six groups?
- If differences exist, determine whether the differences are due to gender, age, or some interaction.

A16.14 **XrA16-14** In the presidential elections of 2000 and 2004, the vote in the state of Florida was crucial. It is important for the political parties to track party affiliation. Surveys in Broward and Miami-Dade counties were conducted in 1990, 1996, 2000, and 2004. The numbers of Democrats, Republicans, and other voters were recorded for both counties and for all four years. Test each of the following.

- Party affiliation changed over the four surveys in Broward.
- Party affiliation changed over the four surveys in Miami-Dade.
- There were differences between Broward and Miami-Dade in 2004.

A16.15 **XrA16-15** Auto manufacturers are required to test their vehicles for a variety of pollutants in the exhaust. The amount of pollutant varies even among identical vehicles so that several vehicles must be tested. The engineer in charge of testing has collected data (in grams per kilometer driven) on the amounts of two pollutants—carbon monoxide and nitrous oxide—for 50 identical vehicles.

The engineer believes the company can save money by testing for only one of the pollutants because the two pollutants are closely linked; that is, if a car is emitting a large amount of carbon monoxide, it will also emit a large amount of nitrous oxide. Do the data support the engineer's belief?

- A16.16** **XrA16-16** In 2003, there were 129,142,000 workers in the United States. The general manager

for a public transportation company wanted to learn more about how workers commute to work and how long it takes them. A random sample of workers was interviewed. Each reported how he or she typically get to work and how long it takes. Estimate with 95% confidence the total amount of time spent commuting.

Source: U.S. Census Bureau. (Data for this exercise were adapted from the *Statistical Abstract of the United States*, 2006, Table 1083.)



GENERAL SOCIAL SURVEY EXERCISES

- A16.17** **GSS2008*** Is there sufficient evidence to conclude that less than 50% of Americans support gun laws (GUNLAW)?

- A16.18** **GSS2008*** Can we infer from the data that Democrats and Republicans (PARTYID: 0, 1 = Democrat, 5, 6 = Republican) differ in their position on whether the government should reduce income differences between rich and poor (EQWLTH)?

- A16.19** **GSS2008*** How does income affect a person's response to the question, Should the government improve the living conditions of poor people (HELPPOOR)? Test the relationship between income (INCOME) and (HELPPOOR) to answer the question.

- A16.20** **GSS2008*** Do the data allow us to infer that households with at least one union member (UNION: 1 = Respondent belongs, 2 = Spouse belongs, 3 = Both belong, 4 = Neither belong) differ from households with no union members with respect to their position on whether the government should improve the standard of living of poor people (HELPPOOR)?

- A16.21** **GSS2008*** Is there sufficient evidence to conclude that people who have taken college-level science courses (COLSCINM: 1 = Yes, 2 = No) are more likely to answer the following question correctly (HOTCORE): Is the center of Earth very hot? 1 = Yes, 2 = No. Correct answer: Yes.

- A16.22** **GSS2006*** Do larger companies pay better than smaller companies? Answer the question by testing to determine whether there is enough evidence to infer that there is a positive linear relationship between income (INCOME) and the number of people working in the company (NUMORG).

- A16.23** **GSS2004*** Test to determine whether people who went bankrupt in the previous year (FINAN1: 1 = Yes, 2 = No) differ in their political affiliation (PARTYID: 0, 1 = Democrat; 2, 3, 4 = Independent; 5, 6 = Republican)?

- A16.24** **GSS2008*** It seems reasonable to assume that the more one works, the greater the income. Test this assumption by analyzing the relationship between hours worked per week (HRS) and income (INCOME).

- A16.25** **GSS2004*** Is there enough evidence to conclude that victims of a robbery [LAW1: Were you a victim of a robbery (mugging or stick-up) in the previous year? 1 = Yes, 2 = No] are less likely to favor requiring a police permit to buy a gun (GUNLAW: 1 = Favor, 2 = Oppose)?

- A16.26** **GSS2008*** Do you get a more prestigious occupation if you acquire more education? Analyze the relationship between occupation prestige score (PRESTG80) and education (EDUC) to answer the question.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- A16.27** **ANES2008*** Newspaper readership is down all over North America. Newspaper publishers need to acquire more information to stop this worrying trend. Do more educated people spend more time

reading newspapers? Conduct a test to determine whether there is evidence to infer that more education (EDUC) is related to more time reading newspapers (TIME3).

- 16.28 ANES2008*** In many cities, the network national news is broadcast at 6:30 or 7:00 p.m. In most cities, the national news is preceded by local news in the late afternoon or early evening. Do most viewers watch both news shows? To help

answer this question, test to determine whether the number of days watching national news (DAYS1) is related to the number of days watching local news in the late afternoon or early evening (DAYS2).

CASE A 16.1

Nutrition Education Programs*

DATA
CA16-01

Nutrition education programs, which teach clients how to lose weight or reduce cholesterol levels through better eating patterns, have been growing in popularity. The nurse in charge of one such program at a local hospital wanted to know whether the programs actually work. A random sample was drawn of 33 clients who attended a nutrition education program for those with elevated cholesterol levels. The study recorded the weight, cholesterol levels, total dietary fat intake per average day, total dietary cholesterol intake per average day, and percent of daily calories from fat. These data were gathered both before and 3 months after the program. The researchers also

determined the clients' genders, ages, and heights. The data are stored in the following way:

- Column 1: Gender
(1 = female, 2 = male)
- Column 2: Age
- Column 3: Height (in meters)
- Columns 4 and 5: Weight, before and after (in kilograms)
- Columns 6 and 7: Cholesterol level, before and after
- Columns 8 and 9: Total dietary fat intake per average day, before and after (in grams)
- Columns 10 and 11: Dietary cholesterol intake per average day, before and after (in milligrams)

Columns 12 and 13: Percent daily calories from fat, before and after

The nurse would like the following information:

- a. In terms of each of weight, cholesterol level, fat intake, cholesterol intake, and calories from fat, is the program a success?
- b. Does gender affect the amount of reduction in each of weight, cholesterol level, fat intake, cholesterol intake, and calories from fat?
- c. Does age affect the amount of reduction in weight, cholesterol level, fat intake, cholesterol intake, and calories from fat cholesterol?

*The author would like to thank Karen Cavrag for writing this case.



Comstock Images/Getty Images

MULTIPLE REGRESSION

- 17-1 *Model and Required Conditions*
- 17-2 *Estimating the Coefficients and Assessing the Model*
- 17-3 *Regression Diagnostics-II*
- 17-4 *Regression Diagnostics-III (Time Series)*
- Appendix 17 *Review of Chapters 12 to 17*

General Social Survey

Variables That Affect Income

DATA
GSS2012*

In the Chapter 16 opening example, we showed using the General Social Survey that income and education are linearly related. This raises the question, what other variables affect one's income? To answer this question, we need to expand the simple linear regression technique used in the previous chapter to allow for more than one independent variable.

Here is a list of all the interval variables the General Social Survey created:

Age (AGE)

Years of education of respondent, spouse, father, and mother (EDUC, SPEDUC, PAEDUC, MAEDUC)



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Our answer appears
on page 689

Hours of work per week of respondent and of spouse (HRS1 and SPHRS1)
 Number of family members earning money (EARNRS)
 Number of children (CHILDS)
 Age when first child was born (AGEKDBRN)
 Number of hours of television viewing per day (TVHOURS)
 Score on question, Should government reduce income differences between rich and poor? (EQWLTH)
 Score on question, Should government improve standard of living of poor people? (HELPPOOR)
 Score on question, Should government do more or less to solve country's problems? (HELPNOT)
 Score on question, Is it government's responsibility to help pay for doctor and hospital bills? (HELPSICK)

The goal is to create a regression analysis that includes all variables that you believe affect the amount of time spent watching television. Our answer appears on page 689.

INTRODUCTION

In the previous chapter, we employed the simple linear regression model to analyze how one variable (the dependent variable y) is related to another interval variable (the independent variable x). The restriction of using only one independent variable was motivated by the need to simplify the introduction to regression analysis. Although there are a number of applications where we purposely develop a model with only one independent variable (see Section 4-6, for example), in general we prefer to include as many independent variables as are believed to affect the dependent variable. Arbitrarily limiting the number of independent variables also limits the usefulness of the model.

In this chapter, we allow for any number of independent variables. In so doing, we expect to develop models that fit the data better than would a simple linear regression model. We begin by describing the multiple regression model and listing the required conditions. We let the computer produce the required statistics and use them to assess the model's fit and diagnose violations of the required conditions. We use the model by interpreting the coefficients, predicting the particular value of the dependent variable, and estimating its expected value.

17-1 MODEL AND REQUIRED CONDITIONS

We now assume that k independent variables are potentially related to the dependent variable. Thus, the model is represented by the following equation:

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \cdots + \beta_k x_k + \epsilon$$

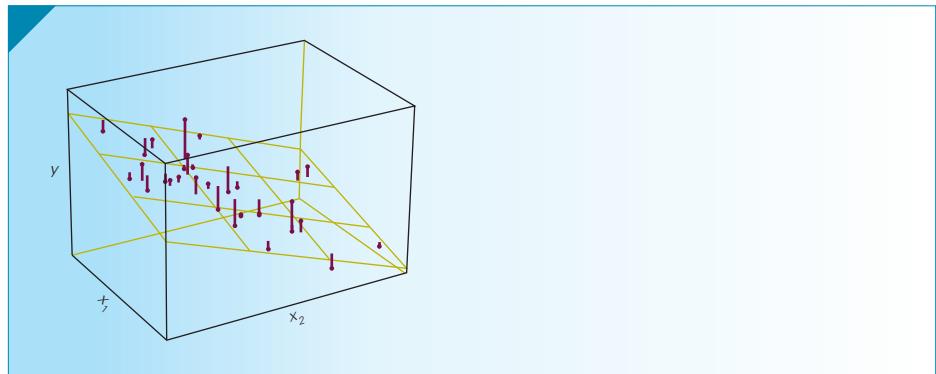
where y is the dependent variable, x_1, x_2, \dots, x_k are the independent variables, $\beta_0, \beta_1, \dots, \beta_k$ are the coefficients, and ϵ is the error variable. The independent variables may actually be functions of other variables. For example, we might define some of the independent variables as follows:

$$\begin{aligned}x_2 &= x_1^2 \\x_5 &= x_3 x_4 \\x_7 &= \log(x_6)\end{aligned}$$

In Chapter 18, we will discuss how and under what circumstances such functions can be used in regression analysis.

The error variable is retained because, even though we have included additional independent variables, deviations between predicted values of y and actual values of y will still occur. Incidentally, when there is more than one independent variable in the regression model, we refer to the graphical depiction of the equation as a **response surface** rather than as a straight line. Figure 17.1 depicts a scatter diagram of a response surface with $k = 2$. (When $k = 2$, the regression equation creates a plane.) Of course, whenever k is greater than 2, we can only imagine the response surface; we cannot draw it.

FIGURE 17.1 Scatter Diagram and Response Surface with $k = 2$



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An important part of the regression analysis comprises several statistical techniques that evaluate how well the model fits the data. These techniques require the following conditions, which we introduced in the previous chapter.

Required Conditions for Error Variable

1. The probability distribution of the error variable ϵ is normal.
2. The mean of the error variable is 0.
3. The standard deviation of ϵ is σ_ϵ , which is a constant.
4. The errors are independent.

In Section 16-6, we discussed how to recognize when the requirements are unsatisfied. Those same procedures can be used to detect violations of required conditions in the multiple regression model.

We now proceed as we did in Chapter 16. We discuss how the model's coefficients are estimated and how we assess the model's fit. However, there is one major difference between Chapters 16 and 17. In Chapter 16, we allowed for the possibility that some students will perform the calculations manually. The multiple regression model involves so many computations that it is virtually impossible to conduct the analysis without a computer. All analyses in this chapter will be performed by Excel and Minitab. Your job will be to interpret the output.

17-2 / ESTIMATING THE COEFFICIENTS AND ASSESSING THE MODEL

The multiple regression equation is expressed similarly to the simple regression equation. The general form is

$$\hat{y} = b_0 + b_1x_1 + b_2x_2 + \cdots + b_kx_k$$

where k is the number of independent variables.

The procedures introduced in Chapter 16 are extended to the multiple regression model. However, in Chapter 16, we first discussed how to interpret the coefficients and then discussed how to assess the model's fit. In practice, we reverse the process. That is, the first step is to determine how well the model fits. If the model's fit is poor, there is no point in a further analysis of the coefficients of that model. A much higher priority is assigned to the task of improving the model. We will discuss the art and science of model building in Chapter 18. In this chapter, we show how a regression analysis is performed.

We'll illustrate the procedure with the chapter-opening example.

17-2a Step 1: Select the Independent Variables That You Believe May Be Related to the Dependent Variable

Here are the available variables from the General Social Survey of 2012 and the reason why we have selected each one:

Age (AGE): For most people, income increases with age

Years of education (EDUC): We've already shown (Chapter 16 opening example) that education is linearly related to income

Hours of work per week (HRS1): Obviously, more hours of work should produce more income

Spouse's hours of work (SPHRS1): It is possible that, if one's spouse works more and earns more, the other spouse may choose to work less and thus earn less

Number of family members earning money (EARNRS): As is the case with SPHRS1, if more family members earn income there may be less pressure on the respondent to work harder

Number of children (CHILDS): Children are expensive, which may encourage their parents to work harder and thus earn more

You may be wondering why we don't simply include all the interval variables that are available to us. There are three reasons. First, the objective is to determine whether our hypothesized model is valid and whether the independent variables in the model are linearly related to the dependent variable. That is, we should screen the independent variables and include only those that in theory affect the dependent variable.

Second, by including large numbers of independent variables we increase the probability of Type I errors. For example, if we include 100 independent variables, none of which are related to the dependent variable, we're likely to conclude that five of them are linearly related to the dependent variable. This is a problem that we discussed in Chapter 14.

Third, because of a problem called multicollinearity (described in Section 17-3), we may conclude that none of the independent variables are linearly related to the dependent variable when in fact one or more are.

17-2b Step 2: Use a Computer to Compute All the Coefficients and Other Statistics

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.5699				
5	R Square	0.3248				
6	Adjusted R Square	0.3127				
7	Standard Error	32,382				
8	Observations	342				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	6	168,950,216,440	28,158,369,407	26.85	4.20E-26
13	Residual	335	351,280,887,544	1,048,599,664		
14	Total	341	520,231,103,984			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	-78,202	15,419	-5.07	6.54E-07	
18	AGE	427	154	2.76	0.0060	
19	EDUC	5,297	580	9.14	6.19E-18	
20	HRS	906	128	7.07	8.90E-12	
21	SPHRS	-215	137	-1.57	0.1178	
22	PRESTG80	3,097	2,512	1.23	0.2186	
23	CHILDS	-1,605	1,424	-1.13	0.2605	

INSTRUCTIONS

1. Type or import the data so that the independent variables are in adjacent columns.*
2. Click **Data**, **Data Analysis**, and **Regression**.
3. Specify the **Input Y Range** the **Input X Range** and a value for α (.05).

MINITAB

Regression Analysis: Income versus AGE, EDUC, ...

The regression equation is
 Income = -78202 + 427 Age + 5297 Educ + 906 Hrs1 - 215 Sphrs1 + 3097 Earnrs
 - 1605 Childs

Predictor	Coef	SE Coef	T	P
Constant	-78202	15419	-5.07	0.000
Age	426.6	154.3	2.76	0.006
Educ	5296.9	579.6	9.14	0.000
Hrs1	906.0	128.1	7.07	0.000
Sphrs1	-215.1	137.2	-1.57	0.118
Earnrs	3097	2512	1.23	0.219
Childs	-1605	1424	-1.13	0.261

S = 32382.1 R-Sq = 32.5% R-Sq(adj) = 31.3%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	6	1.68950E+11	28158369407	26.85	0.000
Residual Error	335	3.51281E+11	1048599664		
Total	341	5.20231E+11			

*Rows with empty cells must be entirely removed.

INSTRUCTIONS

1. Click **Stat, Regression, and Regression . . .**
2. Specify the dependent variable in the **Response** box and the independent variables in the **Predictors** box.

INTERPRET

The regression model is estimated by:

$$\hat{y} (\text{INCOME}) = -78,202 + 427 \text{ AGE} + 5297 \text{ EDUC} + 906 \text{ HRS} - 215 \text{ SPHRS} \\ + 3097 \text{ EARNRS} - 1605 \text{ CHILDS}$$

17-2c Step 3: Assess the Model

We assess the model in three ways: the standard error of estimate, the coefficient of determination (both introduced in Chapter 16), and the *F*-test of the analysis of variance (presented subsequently).

17-2d Standard Error of Estimate

Recall that σ_e is the standard deviation of the error variable ϵ and that, because σ_e is a population parameter, it is necessary to estimate its value by using s_e . In multiple regression, the standard error of estimate is defined as follows:

Standard Error of Estimate

$$s_e = \sqrt{\frac{\text{SSE}}{n - k - 1}}$$

where n is the sample size and k is the number of independent variables in the model.

As we noted in Chapter 16, each of our software packages reports the standard error of estimate in a different way.

EXCEL

	A	B
7	Standard Error	32,382

MINITAB

S = 32382.1

INTERPRET

Recall that we judge the magnitude of the standard error of estimate relative to the values of the dependent variable, and particularly to the mean of y . In this example, $\bar{y} = 49,417$ (not shown in printouts). It appears that the standard error of estimate is quite large.

17-2e Coefficient of Determination

Recall from Chapter 16 that the coefficient of determination is defined as:

$$R^2 = 1 - \frac{\text{SSE}}{\sum(y_i - \bar{y})^2}$$

EXCEL

	A	B
5	R Square	0.3248

MINITAB

R-Sq = 32.5%

INTERPRET

This means that 32.48% of the total variation in income is explained by the variation in the six independent variables, whereas 67.52% remains unexplained.

Notice that Excel and Minitab print a second R^2 statistic, called the **coefficient of determination adjusted for degrees of freedom**, which has been adjusted to take into account the sample size and the number of independent variables. The rationale for this statistic is that, if the number of independent variables k is large relative to the sample size n , the unadjusted R^2 value may be unrealistically high. To understand this point, consider what would happen if the sample size is 2 in a simple linear regression model. The line would fit the data perfectly resulting in $R^2 = 1$ when, in fact, there may be no linear relationship. To avoid creating a false impression, the adjusted R^2 is often calculated. Its formula is as follows:

Coefficient of Determination Adjusted for Degrees of Freedom

$$\text{Adjusted } R^2 = 1 - \frac{\text{SSE}/(n - k - 1)}{\sum(y_i - \bar{y})^2/(n - 1)} = 1 - \frac{\text{MSE}}{s_y^2}$$

If n is considerably larger than k , the unadjusted and adjusted R^2 values will be similar. But if SSE is quite different from 0 and k is large compared to n , the unadjusted and adjusted values of R^2 will differ substantially. If such differences exist, the analyst should

be alerted to a potential problem in interpreting the coefficient of determination. In this example, the adjusted coefficient of determination is 31.27%, indicating that, no matter how we measure the coefficient of determination, the model's fit is not very good.

17-2f Testing the Validity of the Model

In the simple linear regression model, we tested the slope coefficient to determine whether sufficient evidence existed to allow us to conclude that there was a linear relationship between the independent variable and the dependent variable. However, because there is only one independent variable in that model, that same t -test also tested to determine whether that model is valid. When there is more than one independent variable, we need another method to test the overall validity of the model. The technique is a version of the analysis of variance, which we introduced in Chapter 14.

To test the validity of the regression model, we specify the following hypotheses:

$$H_0: \beta_1 = \beta_2 = \dots = \beta_k = 0$$

H_1 : At least one β_i is not equal to 0.

If the null hypothesis is true, none of the independent variables x_1, x_2, \dots, x_k is linearly related to y , and therefore the model is invalid. If at least one β_i is not equal to 0, the model does have some validity.

When we discussed the coefficient of determination in Chapter 16, we noted that the total variation in the dependent variable [measured by $\sum(y_i - \bar{y})^2$] can be decomposed into two parts: the explained variation (measured by SSR) and the unexplained variation (measured by SSE). That is:

$$\text{Total variation in } y = \text{SSR} + \text{SSE}$$

Furthermore, we established that, if SSR is large relative to SSE, the coefficient of determination will be high—signifying a good model. On the other hand, if SSE is large, most of the variation will be unexplained, which indicates that the model provides a poor fit and consequently has little validity.

The test statistic is the same one we encountered in Section 14-1, where we tested for the equivalence of two or more population means. To judge whether SSR is large enough relative to SSE to allow us to infer that at least one coefficient is not equal to 0, we compute the ratio of the two mean squares. (Recall that the mean square is the sum of squares divided by its degrees of freedom; recall, too, that the ratio of two mean squares is F distributed as long as the underlying population is normal—a required condition for this application.) The calculation of the test statistic is summarized in an analysis of variance (ANOVA) table, whose general form appears in Table 17.1. The Excel and Minitab ANOVA tables are shown next.

TABLE 17.1 Analysis of Variance Table for Regression Analysis

SOURCE OF VARIATION	DEGREES OF FREEDOM	SUMS OF SQUARES	MEAN SQUARES	F-STATISTIC
Regression	k	SSR	$\text{MSR} = \text{SSR}/k$	$F = \text{MSR}/\text{MSE}$
Residual	$n - k - 1$	SSE	$\text{MSE} = \text{SSE}/(n - k - 1)$	
Total	$n - 1$	$\sum(y_i - \bar{y})^2$		

EXCEL

	A	B	C	D	E	F
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	6	168,950,216,440	28,158,369,407	26.85	4.20E-26
13	Residual	335	351,280,887,544	1,048,599,664		
14	Total	341	520,231,103,984			

MINITAB

Analysis of Variance					
Source	DF	SS	MS	F	P
Regression	6	1.68950E+11	28158369407	26.85	0.000
Residual Error	335	3.51281E+11	1048599664		
Total	341	5.20231E+11			

A large value of F indicates that most of the variation in y is explained by the regression equation and that the model is valid. A small value of F indicates that most of the variation in y is unexplained. The rejection region allows us to determine whether F is large enough to justify rejecting the null hypothesis. For this test, the rejection region is:

$$F > F_{\alpha, k, n-k-1}$$

In Example 17.1, the rejection region (assuming $\alpha = .05$) is:

$$F > F_{\alpha, k, n-k-1} = F_{.05, 6, 335} \approx 2.21$$

As you can see from the printout, $F = 26.85$. The printout also includes the p -value of the test, which is 0. Obviously, there is a great deal of evidence to infer that the model is valid.

Although each assessment measurement offers a different perspective, all agree in their assessment of how well the model fits the data, because all are based on the sum of squares for error, SSE. The standard error of estimate is:

$$s_e = \sqrt{\frac{SSE}{n - k - 1}}$$

and the coefficient of determination is:

$$R^2 = 1 - \frac{SSE}{\sum (y_i - \bar{y})^2}$$

When the response surface hits every single point, SSE = 0. Hence, $s_e = 0$ and $R^2 = 1$.

If the model provides a poor fit, we know that SSE will be large [its maximum value is $\sum (y_i - \bar{y})^2$], s_e will be large, and [since SSE is close to $\sum (y_i - \bar{y})^2$] R^2 will be close to 0.

The F -statistic also depends on SSE. Specifically,

$$F = \frac{MSR}{MSE} = \frac{\left(\sum (y_i - \bar{y})^2 - SSE \right) / k}{SSE / (n - k - 1)}$$

When SSE = 0:

$$F = \frac{\sum (y_i - \bar{y})^2/k}{0/(n - k - 1)}$$

which is infinitely large. When SSE is large, SSE is close to $\sum (y_i - \bar{y})^2$ and F is quite small.

The relationship among s_e , R^2 , and F is summarized in Table 17.2.

TABLE 17.2 Relationship Among SSE, s_e , R^2 , and F

SSE	s_e	R^2	F	ASSESSMENT OF MODEL
0	0	1	∞	Perfect
Small	Small	Close to 1	Large	Good
Large	Large	Close to 0	Small	Poor
$\sum (y_i - \bar{y})^2$	$\sqrt{\frac{\sum (y_i - \bar{y})^2}{n - k - 1}}$ *	0	0	Invalid

*When n is large and k is small, this quantity is approximately equal to the standard deviation of y .

17-2g Interpreting the Coefficients

The coefficients b_0, b_1, \dots, b_k describe the relationship between each of the independent variables and the dependent variable in the sample. We need to use inferential methods (described below) to draw conclusions about the population. In our example, the sample consists of the 342 observations. The population is composed of all American adults.

Intercept The intercept is $b_0 = -78,202$. This is the average income when all the independent variables are zero. As we observed in Chapter 16, it is often misleading to try to interpret this value, particularly if 0 is outside the range of the values of the independent variables (as is the case here).

Age The relationship between income and age is described by $b_1 = 427$. From this number, we learn that in this model, for each additional year of age, income increases on average by \$427, assuming that the other independent variables in this model are held constant.

Education The coefficient $b_2 = 5297$ specifies that in this sample for each additional year of education the income increases on average by \$5297, assuming the constancy of the other independent variables.

Hours of Work The relationship between hours of work per week is expressed by $b_3 = 906$. We interpret this number as the average increase in annual income for each additional hour of work per week keeping the other independent variables fixed in this sample.

Spouse's Hours of Work The relationship between annual income and a spouse's hours of work per week is described in this sample $b_4 = -215$, which we interpret to mean that for each additional hour a spouse works per week income decreases on average by \$215 when the other variables are constant.

Number of Family Members Earning Income In this dataset, the relationship between annual income and the number of family members who earn money is expressed by $b_5 = 3097$, which tells us that for each additional family member earner annual income increases on average by \$3097 assuming that the other independent variables are constant.

Number of Children The relationship between annual income and number of children is expressed by $b_6 = -1605$, which tells us that in this sample for each additional child annual income decreases on average by \$1605.

17-2h Testing the Coefficients

In Chapter 16, we described how to test to determine whether there is sufficient evidence to infer that in the simple linear regression model x and y are linearly related. The null and alternative hypotheses were:

$$\begin{aligned} H_0: \beta_1 &= 0 \\ H_1: \beta_1 &\neq 0 \end{aligned}$$

The test statistic was:

$$t = \frac{b_1 - \beta_1}{s_{b_1}}$$

which is Student t distributed with $\nu = n - 2$ degrees of freedom.

In the multiple regression model, we have more than one independent variable. For each such variable, we can test to determine whether there is enough evidence of a linear relationship between it and the dependent variable for the entire population when the other independent variables are included in the model.

Testing the Coefficients

$$\begin{aligned} H_0: \beta_i &= 0 \\ H_1: \beta_i &\neq 0 \end{aligned}$$

(for $i = 1, 2, \dots, k$); the test statistic is:

$$t = \frac{b_i - \beta_i}{s_{b_i}}$$

which is Student t distributed with $\nu = n - k - 1$ degrees of freedom.

To illustrate, we test each of the coefficients in the multiple regression model in the chapter-opening example. The tests that follow are performed just as all other tests in this book have been performed. We set up the null and alternative hypotheses, identify the test statistic, and use the computer to calculate the value of the test statistic and its p -value. For each independent variable, we test ($i = 1, 2, 3, 4, 5, 6$):

$$\begin{aligned} H_0: \beta_i &= 0 \\ H_1: \beta_i &\neq 0 \end{aligned}$$

Refer to page 690 and examine the computer output. The output includes the t -tests of β_i . The results of these tests pertain to the entire population of the United States in 2012. It is also important to add that these test results were determined when the other independent variables were included in the model. We add this statement because a simple linear regression will very likely result in different values of the test statistics and possibly the conclusion.

Test of β_1 (Coefficient of age)

Value of the test statistic: $t = 2.76$; p -value = .0060

Test of β_2 (Coefficient of education)

Value of the test statistic: $t = 9.14$; p -value = 0

Test of β_3 (Coefficient of number of hours of work per week)

Value of the test statistic: $t = 7.07$; p -value = 0

Test of β_4 (Coefficient of spouse's number of hours of work per week)

Value of the test statistic: $t = -1.57$; p -value = .1178

Test of β_5 (Coefficient of number of earners in family)

Value of the test statistic: $t = 1.23$; p -value = .2186

Test of β_6 (Coefficient of number of children)

Value of the test statistic: $t = -1.13$; p -value = .2605

There is sufficient evidence at the 5% significance level to infer that each of the following variables is linearly related to income:

Age

Education

Number of hours of work per week

In this model, there is not enough evidence to conclude that each of the following variables is linearly related to income:

Spouse's number of hours of work per week

Number of earners in the family

Number of children

Note that this may mean that there is no evidence of a linear relationship between these three independent variables. However, it may also mean that there is a linear relationship between the two variables, but because of a condition called *multicollinearity*, some t -test of β_i revealed no linear relationship. We will discuss multicollinearity in Section 17-3.

17-2i A Cautionary Note about Interpreting the Results

Care should be taken when interpreting the results of this and other regression analyses. We might find that in one model there is enough evidence to conclude that a particular independent variable is linearly related to the dependent variable, but that in another model, no such evidence exists. Consequently, whenever a particular t -test is *not* significant, we state that there is not enough evidence to infer that the independent and dependent variable are linearly related *in this model*. The implication is that another model may yield different conclusions.

Furthermore, if one or more of the required conditions are violated, the results may be invalid. In Section 17-3, we introduced the procedures that allow the statistics practitioner to examine the model's requirements. We also remind you that it is dangerous to extrapolate far outside the range of the observed values of the independent variables.

17-2j *t*-Tests and the Analysis of Variance

The *t*-tests of the individual coefficients allow us to determine whether $\beta_i \neq 0$ (for $i = 1, 2, \dots, k$), which tells us whether a linear relationship exists between x_i and y . There is a *t*-test for each independent variable. Consequently, the computer automatically performs k *t*-tests. (It actually conducts $k + 1$ *t*-tests, including the one for the intercept β_0 , which we usually ignore.) The *F*-test in the analysis of variance combines these *t*-tests into a single test. That is, we test all the β_i at one time to determine whether at least one of them is not equal to 0. The question naturally arises, why do we need the *F*-test if it is nothing more than the combination of the previously performed *t*-tests? Recall that we addressed this issue earlier. In Chapter 14, we pointed out that we can replace the analysis of variance by a series of *t*-tests of the difference between two means. However, by doing so, we increase the probability of making a Type I error. Which means that even when there is no linear relationship between each of the independent variables and the dependent variable, multiple *t*-tests will likely show some are significant. As a result, you will conclude erroneously that, since at least one β_i is not equal to 0, the model is valid. The *F*-test, on the other hand, is performed only once. Because the probability that a Type I error will occur in a single trial is equal to α , the chance of erroneously concluding that the model is valid is substantially less with the *F*-test than with multiple *t*-tests.

There is another reason that the *F*-test is superior to multiple *t*-tests. Because of a commonly occurring problem called *multicollinearity*, the *t*-tests may indicate that some independent variables are not linearly related to the dependent variable, when in fact they are. The problem of multicollinearity does not affect the *F*-test, nor does it inhibit us from developing a model that fits the data well. Multicollinearity is discussed in Section 17-3.

17-2k The *F*-Test and the *t*-Test in the Simple Linear Regression Model

It is useful for you to know that we can use the *F*-test to test the validity of the simple linear regression model. However, this test is identical to the *t*-test of β_1 . The *t*-test of β_1 in the simple linear regression model tells us whether that independent variable is linearly related to the dependent variable. However, because there is only one independent variable, the *t*-test of β_1 also tells us whether the model is valid, which is the purpose of the *F*-test.

The relationship between the *t*-test of β_1 and the *F*-test can be explained mathematically. Statisticians can show that if we square a *t*-statistic with v degrees of freedom we produce an *F*-statistic with 1 and v degrees of freedom. (We briefly discussed this relationship in Chapter 14.) To illustrate, consider Example 16.2 on page 649. We found the *t*-test of β_1 to be -13.44 , with degrees of freedom equal to 98. The *p*-value was 5.75×10^{-24} . The output included the analysis of variance table where $F = 180.64$ and the *p*-value was 5.75×10^{-24} . The *t*-statistic squared is $t^2 = (-13.44)^2 = 180.63$. (The difference is due to rounding errors.) Notice that the degrees of freedom of the *F*-statistic are 1 and 98. Thus, we can use either test to test the validity of the simple linear regression model.

17-2l Using the Regression Equation

As was the case with simple linear regression, we can use the multiple regression equation in two ways: we can produce the prediction interval for a particular value of y , and we can produce the confidence interval estimate of the expected value of y . Like the

other calculations associated with multiple regression, we call on the computer to do the work.

To illustrate, we'll predict the income of a 50-year-old, with 12 years of education, who works 40 hours per week, whose spouse also works 40 hours per week, 2 earners in the family and has 2 children.

As you discovered in the previous chapter, both Excel and Minitab output the prediction interval for one inn and interval estimate of the expected (average) operating margin for all sites with the given variables.

EXCEL

	A	B
1	Prediction Interval	
2		
3		INCOME
4		
5	Predicted value	37,315
6		
7	Prediction Interval	
8	Lower limit	-26,560
9	Upper limit	101,190
10		
11	Interval Estimate of Expected Value	
12	Lower limit	32,564
13	Upper limit	42,066

INSTRUCTIONS

See the instructions on page 663. In cells B343 to G343, we input the values **50 12 40 40 2 2**, respectively. We specified 95% confidence.

MINITAB

Predicted Values for New Observations					
New	Obs	Fit	SE Fit	95% CI	95% PI
	1	37,315	2,415	(32,564, 42,066)	(-26,560, 101,190)

INSTRUCTIONS

See the instructions on page 692. We input the values **50 12 40 40 2 2**. We specified 95% confidence.

INTERPRET

The prediction interval is $-25,560, 101,190$. It is so wide as to be completely useless. To be useful in predicting values, the model must be considerably better. The confidence interval estimate of the expected income of a population is $32,564, 42,066$.



EXERCISES

The following exercises require the use of a computer and statistical software. Exercises 17.1–17.4 can be solved manually. See Appendix A for the sample statistics. Use a 5% significance level for all tests.

- 17.1 Xr17-01** A developer who specializes in summer cottage properties is considering purchasing a large tract of land adjoining a lake. The current owner of the tract has already subdivided the land into separate building lots and has prepared the lots by removing some of the trees. The developer wants to forecast the value of each lot. From previous experience, she knows that the most important factors affecting the price of a lot are size, number of mature trees, and distance to the lake. From a nearby area, she gathers the relevant data for 60 recently sold lots.
- Find the regression equation.
 - What is the standard error of estimate? Interpret its value.
 - What is the coefficient of determination? What does this statistic tell you?
 - What is the coefficient of determination, adjusted for degrees of freedom? Why does this value differ from the coefficient of determination? What does this tell you about the model?
 - Test the validity of the model. What does the *p*-value of the test statistic tell you?
 - Interpret each of the coefficients.
 - Test to determine whether each of the independent variables is linearly related to the price of the lot in this model.
 - Predict with 90% confidence the selling price of a 40,000-square-foot lot that has 50 mature trees and is 25 feet from the lake.
 - Estimate with 90% confidence the average selling price of 50,000-square-foot lots that have 10 mature trees and are 75 feet from the lake.

- 17.2 Xr17-02** Pat Statsdud, a student ranking near the bottom of the statistics class, decided that a certain amount of studying could actually improve final grades. However, too much studying would not be warranted because Pat's ambition (if that's what one could call it) was to ultimately graduate with the absolute minimum level of work. Pat was registered in a statistics course that had only 3 weeks to go before the final exam and for which the final grade was determined in the following way:

$$\begin{aligned}\text{Total mark} &= 20\% \text{ (Assignment)} \\ &\quad + 30\% \text{ (Midterm test)} \\ &\quad + 50\% \text{ (Final exam)}\end{aligned}$$

To determine how much work to do in the remaining 3 weeks, Pat needed to be able to predict the final exam mark on the basis of the assignment mark

(worth 20 points) and the midterm mark (worth 30 points). Pat's marks on these were 12/20 and 14/30, respectively. Accordingly, Pat undertook the following analysis. The final exam mark, assignment mark, and midterm test mark for 30 students who took the statistics course last year were collected.

- Determine the regression equation.
- What is the standard error of estimate? Briefly describe how you interpret this statistic.
- What is the coefficient of determination? What does this statistic tell you?
- Test the validity of the model.
- Interpret each of the coefficients.
- Can Pat infer that the assignment mark is linearly related to the final grade in this model?
- Can Pat infer that the midterm mark is linearly related to the final grade in this model?
- Predict Pat's final exam mark with 95% confidence.
- Predict Pat's final grade with 95% confidence.

- 17.3 Xr17-03** The president of a company that manufactures drywall wants to analyze the variables that affect demand for his product. Drywall is used to construct walls in houses and offices. Consequently, the president decides to develop a regression model in which the dependent variable is monthly sales of drywall (in hundreds of 4 × 8 sheets) and the independent variables are

Number of building permits issued in the county
Five-year mortgage rates (in percentage points)
Vacancy rate in apartments (in percentage points)

Vacancy rate in office buildings (in percentage points)

To estimate a multiple regression model, he took monthly observations from the past 2 years.

- Analyze the data using multiple regression.
- What is the standard error of estimate? Can you use this statistic to assess the model's fit? If so, how?
- What is the coefficient of determination, and what does it tell you about the regression model?
- Test the overall validity of the model.
- Interpret each of the coefficients.
- Test to determine whether each of the independent variables is linearly related to drywall demand in this model.
- Predict next month's drywall sales with 95% confidence if the number of building permits is 50, the 5-year mortgage rate is 9.0%, and the vacancy rates are 3.6% in apartments and 14.3% in office buildings.

17.4 Xr17-04 The general manager of the Cleveland Indians baseball team is in the process of determining which minor-league players to draft. He is aware that his team needs home-run hitters and would like to find a way to predict the number of home runs a player will hit. Being an astute statistician, he gathers a random sample of players and records the number of home runs each player hit in his first two full years as a major-league player, the number of home runs he hit in his last full year in the minor leagues, his age, and the number of years of professional baseball.

- Develop a regression model and use a software package to produce the statistics.
- Interpret each of the coefficients.

- How well does the model fit?
- Test the model's validity.
- Do each of the independent variables belong in the model?
- Calculate the 95% interval of the number of home runs in the first two years of a player who is 25 years old, has played professional baseball for 7 years, and hit 22 home runs in his last year in the minor leagues.
- Calculate the 95% interval of the expected number of home runs in the first two years of players who are 27 years old, have played professional baseball for 5 years, and hit 18 home runs in their last year in the minors.

APPLICATIONS in HUMAN RESOURCES MANAGEMENT

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Severance Pay

In most firms, the entire issue of compensation falls into the domain of the human resources manager. The manager must ensure that the method used to determine compensation contributes to the firm's objectives. Moreover, the firm needs to ensure that discrimination or bias of any kind is not a factor. Another function of the personnel manager is to develop severance packages for employees whose services are no longer needed because of downsizing or merger. The size and nature of severance are rarely part of any working agreement and must be determined by a variety of factors. Regression analysis is often useful in this area.

17.5 Xr17-05 When one company buys another company, it is not unusual that some workers are terminated. The severance benefits offered to the laid-off workers are often the subject of dispute. Suppose that the Laurier Company recently bought the Western Company and subsequently terminated 20 of Western's employees. As part of the buyout agreement, it was promised that the severance packages offered to the former Western employees would be equivalent to those offered to Laurier employees who had been terminated in the past year. Thirty-six-year-old Bill Smith, a Western employee for the past 10 years, earning \$32,000 per year, was one of those let go. His severance package included an offer of 5 weeks' severance pay. Bill complained that this offer was less than that offered to Laurier's employees when they were laid off, in contravention of the buyout agreement. A statistician was called in to settle the dispute. The statistician was told that severance is determined by three factors: age, length of service with the company, and pay. To determine how generous the severance package had been, a random sample of 50 Laurier ex-employees was taken. For each, the following variables were recorded:

Number of weeks of severance pay
Age of employee
Number of years with the company
Annual pay (in thousands of dollars)

- Determine the regression equation.
- Comment on how well the model fits the data.
- Do all the independent variables belong in the equation? Explain.
- Perform an analysis to determine whether Bill is correct in his assessment of the severance package.

- 17.6** **Xr17-06** The admissions officer of a university is trying to develop a formal system to decide which students to admit to the university. She believes that determinants of success include the standard variables—high school grades and SAT scores. However, she also believes that students who have participated in extracurricular activities are more likely to succeed than those who have not. To investigate the issue, she randomly sampled 100 fourth-year students and recorded the following variables:

GPA for the first 3 years at the university (range: 0 to 12)

GPA from high school (range: 0 to 12)

SAT score (range: 400 to 1600)

Number of hours on average spent per week in organized extracurricular activities in the last year of high school

- Develop a model that helps the admissions officer decide which students to admit and use the computer to generate the usual statistics.
- What is the coefficient of determination? Interpret its value.
- Test the overall validity of the model.
- Test to determine whether each of the independent variables is linearly related to the dependent variable in this model.
- Determine the 95% interval of the GPA for the first 3 years of university for a student whose high school GPA is 10, whose SAT score is 1200, and who worked an average of 2 hours per week on organized extracurricular activities in the last year of high school.
- Find the 90% interval of the mean GPA for the first 3 years of university for all students whose high school GPA is 8, whose SAT score is 1100, and who worked an average of 10 hours per week on organized extracurricular activities in the last year of high school.

- 17.7** **Xr17-07** The marketing manager for a chain of hardware stores needed more information about the effectiveness of the three types of advertising that the chain used. These are localized direct mailing (in which flyers describing sales and featured products are distributed to homes in the area surrounding a store), newspaper advertising, and local television advertisements. To determine which type is most effective, the manager collected 1 week's data from 100 randomly selected stores. For each store, the following variables were recorded:

Weekly gross sales

Weekly expenditures on direct mailing

Weekly expenditures on newspaper advertising

Weekly expenditures on television commercials

All variables were recorded in thousands of dollars.

- Find the regression equation.
- What are the coefficient of determination and the coefficient of determination adjusted for degrees of freedom? What do these statistics tell you about the regression equation?
- What does the standard error of estimate tell you about the regression model?
- Test the validity of the model.
- Which independent variables are linearly related to weekly gross sales in this model? Explain.
- Compute the 95% interval of the week's gross sales if a local store spent \$800 on direct mailing, \$1,200 on newspaper advertisements, and \$2,000 on television commercials.
- Calculate the 95% interval of the mean weekly gross sales for all stores that spend \$800 on direct mailing, \$1,200 on newspaper advertising, and \$2,000 on television commercials.
- Discuss the difference between the two intervals found in parts (f) and (g).

- 17.8** **Xr17-08** For many cities around the world, garbage is an increasing problem. Many North American cities have virtually run out of space to dump the garbage. A consultant for a large American city decided to gather data about the problem. She took a random sample of houses and determined the following:

Y = the amount of garbage per average week (pounds)

X_1 = Size of the house (square feet)

X_2 = Number of children

X_3 = Number of adults who are usually home during the day

- Conduct a regression analysis.
- Is the model valid?
- Interpret each of the coefficients.
- Test to determine whether each of the independent variables is linearly related to the dependent variable.

- 17.9** **Xr17-09** The administrator of a school board in a large county was analyzing the average mathematics test scores in the schools under her control. She noticed that there were dramatic differences in scores among the schools. In an attempt to improve the scores of all the schools, she attempted to determine the factors that account for the differences. Accordingly, she took a random sample of 40 schools across the county and, for each, determined the mean test score last year, the percentage of teachers in each school who have at least one university degree in mathematics, the mean age, and the mean annual income (in \$1,000s) of the mathematics teachers.
- Conduct a regression analysis to develop the equation.
 - Is the model valid?

- c. Interpret and test the coefficients.
- d. Predict with 95% confidence the test score at a school where 50% of the mathematics teachers have mathematics degrees, the mean age is 43, and the mean annual income is \$48,300.
- 17.10 *Xr17-10**** Life insurance companies are keenly interested in predicting how long their customers will live because their premiums and profitability depend on such numbers. An actuary for one insurance company gathered data from 100 recently deceased male customers. He recorded the age at death of the customer plus the ages at death of his mother and father, the mean ages at death of his grandmothers, and the mean ages at death of his grandfathers.
- a. Perform a multiple regression analysis on these data.
 - b. Is the model valid?
 - c. Interpret and test the coefficients.
 - d. Determine the 95% interval of the longevity of a man whose parents lived to the age of 70, whose grandmothers averaged 80 years, and whose grandfathers averaged 75 years.
 - e. Find the 95% interval of the mean longevity of men whose mothers lived to 75 years, whose fathers lived to 65 years, whose grandmothers averaged 85 years, and whose grandfathers averaged 75 years.
- 17.11 *Xr17-11*** University students often complain that universities reward professors for research but not for teaching, and they argue that professors react to this situation by devoting more time and energy to the publication of their findings and less time and energy to classroom activities. Professors counter that research and teaching go hand in hand: More research makes better teachers. A student organization at one university decided to investigate the issue. It randomly selected 50 economics professors who are employed by a multicampus university. The students recorded the salaries (in \$1,000s) of the professors, their average teaching evaluations (on a 10-point scale), and the total number of journal articles published in their careers. Perform a complete analysis (produce the regression equation, assess it, and report your findings).
- 17.12 *Xr17-12**** One critical factor that determines the success of a catalog store chain is the availability of products that consumers want to buy. If a store is sold out, future sales to that customer are less likely. Accordingly, delivery trucks operating from a central warehouse regularly resupply stores. In an analysis of a chain's operations, the general manager wanted to determine the factors that are related to how long it takes to unload delivery trucks. A random sample of 50 deliveries to one store was observed. The times (in minutes) to unload the truck, the total number of boxes, and the total weight (in hundreds of pounds) of the boxes were recorded.
- a. Determine the multiple regression equation.
- b. How well does the model fit the data? Explain.
- c. Interpret and test the coefficients.
- d. Produce a 95% interval of the amount of time needed to unload a truck with 100 boxes weighing 5,000 pounds.
- e. Produce a 95% interval of the average amount of time needed to unload trucks with 100 boxes weighing 5,000 pounds.
- 17.13 *Xr17-13*** Lotteries have become important sources of revenue for governments. Many people have criticized lotteries, however, referring to them as a tax on the poor and uneducated. In an examination of the issue, a random sample of 100 adults was asked how much they spend on lottery tickets and was interviewed about various socioeconomic variables. The purpose of this study is to test the following beliefs:
1. Relatively uneducated people spend more on lotteries than do relatively educated people.
 2. Older people buy more lottery tickets than younger people.
 3. People with more children spend more on lotteries than people with fewer children.
 4. Relatively poor people spend a greater proportion of their income on lotteries than relatively rich people.
- The following data were recorded:
- | |
|---|
| Amount spent on lottery tickets as a percentage of total household income |
| Number of years of education |
| Age |
| Number of children |
| Personal income (in thousands of dollars) |
- a. Develop the multiple regression equation.
 - b. Is the model valid?
 - c. Test each of the beliefs. What conclusions can you draw?
- 17.14 *Xr17-14**** The MBA program at a large university is facing a pleasant problem—too many applicants. The current admissions policy requires students to have completed at least 3 years of work experience and an undergraduate degree with a B-average or better. Until 3 years ago, the school admitted any applicant who met these requirements. However, because the program recently converted from a 2-year program (four semesters) to a 1-year program (three semesters), the number of applicants has increased substantially. The dean, who teaches statistics courses, wants to raise the admissions standards by developing a method that more accurately predicts how well an applicant will perform in the MBA program. She believes that the primary determinants of success are the following:
- | |
|--|
| Undergraduate grade point average (GPA) |
| Graduate Management Admissions Test (GMAT) score |
| Number of years of work experience |

She randomly sampled students who completed the MBA and recorded their MBA program GPA, as well as the three variables listed here.

- Develop a multiple regression model.
- Test the model's validity.

- Test to determine which of the independent variables is linearly related to MBA GPA.

APPLICATIONS in OPERATIONS MANAGEMENT

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Location Analysis

Location analysis is one function of operations management. Deciding where to locate a plant, warehouse, or retail outlet is a critical decision for any organization. A large number of variables must be considered in this decision problem. For example, a production facility must be located close to suppliers of raw resources and supplies, skilled labor, and transportation to customers.

Retail outlets must consider the type and number of potential customers. In the next example, we describe an application of regression analysis to find profitable locations for a motel chain.

- 17.15 X17-15** La Quinta Motor Inns is a moderately priced chain of motor inns located across the United States. Its market is the frequent business traveler. The chain recently launched a campaign to increase market share by building new inns. The management of the chain is aware of the difficulty in choosing locations for new motels. Moreover, making decisions without adequate information often results in poor decisions. Consequently, the chain's management acquired data on 100 randomly selected inns belonging to La Quinta. The objective was to predict which sites are likely to be profitable.

To measure profitability, La Quinta used *operating margin*, which is the ratio of the sum of profit, depreciation, and interest expenses divided by total revenue. (Although occupancy is often used as a measure of a motel's success, the company statistician concluded that occupancy was too unstable, especially during economic turbulence.) The higher the operating margin, the greater the success of the inn. La Quinta defines profitable inns as those with an operating margin in excess of 50%; unprofitable inns are those with margins of less than 30%. After a discussion with a number of experienced managers, La Quinta decided to select one or two independent variables from each of the following categories: competition, market awareness, demand generators, demographics, and physical location. To measure the degree of competition, they determined the total number of motel and hotel rooms within 3 miles of each La Quinta inn. Market awareness was measured by the number of miles to the closest competing motel. Two variables that represent sources of customers were chosen. The amount of office space and college and university enrollment in the surrounding community are demand generators. Both of these are measures of economic activity. A demographic variable that describes the community is the median household income. Finally, as a measure of the physical qualities of the location La Quinta chose the distance to the downtown core. These data are stored using the following format:

- Column 1: y = operating margin, in percent
- Column 2: x_1 = Total number of motel and hotel rooms within 3 miles of La Quinta inn
- Column 3: x_2 = Number of miles to closest competition
- Column 4: x_3 = Office space in thousands of square feet in surrounding community
- Column 5: x_4 = College and university enrollment (in thousands) in nearby university or college
- Column 6: x_5 = Median household income (in \$thousands) in surrounding community
- Column 7: x_6 = Distance (in miles) to the downtown core

(Continued)

Adapted from Sheryl E. Kimes and James A. Fitzsimmons, "Selecting Profitable Hotel Sites at La Quinta Motor Inns," *INTERFACES* 20 March–April 1990, pp. 12–20.

- a. Develop a regression analysis.
- b. Test to determine whether there is enough evidence to infer that the model is valid.
- c. Test each of the slope coefficients.
- d. Interpret the coefficients.
- e. Predict with 95% confidence the operating margin of a site with the following characteristics.
There are 3,815 rooms within 3 miles of the site, the closest other hotel or motel is .9 miles away, the amount of office space is 476,000 square feet, there is one college and one university with a total enrollment of 24,500 students, the median income in the area is \$35,000, and the distance to the downtown core is 11.2 miles.
- f. Refer to part (e). Estimate with 95% confidence the mean operating margin of all La Quinta inns with those characteristics.



GENERAL SOCIAL SURVEY EXERCISES

Excel users: We remind you that any row that contains at least one empty cell (in dependent and independent variables column) must be removed. Conduct all tests at the 5% significance level.

- 17.16 GSS2012*** How does the amount of education of one's parents (PAEDUC, MAEDUC) affect your education (EDUC)?
- a. Develop a regression model
 - b. Test the validity of the model
 - c. Test the two slope coefficients
 - d. Interpret the coefficients
- 17.17 GSS2012*** What determines people's opinion on the following question? Should the government reduce income differences between rich and poor (EQWLTH: 1 = Government should reduce differences; 2, 3, 4, 5, 6, 7 = No government action).
- a. Develop a regression analysis using demographic variables age, (AGE), education (EDUC), income (INCOME), and weekly hours of work (HRS1)
 - b. Test the model's validity
 - c. Test each of the slope coefficients
 - d. Interpret the coefficient of determination
- 17.18 GSS2012*** The Nielsen Ratings estimate the numbers of televisions tuned to various channels. However, television executives need more information. The General Social Survey may be the source of this information. Respondents were asked to report the number of hours per average day of television viewing (TVHOURS). Conduct a regression analysis using the independent variables age (AGE), education (EDUC), hours of work (HRS1), and number of children (CHILDS).
- 17.19 GSS2012*** What determines people's opinion on the following question, Should the government improve the standard of living of poor people (HELPPOOR: 1 = Government act; 2, 3, 4, 5 = People should help themselves).
- a. Develop a regression analysis using demographic variables age, (AGE), education (EDUC), income (INCOME), and weekly hours of work (HRS1)
 - b. Test the model's validity
 - c. Test each of the slope coefficients
 - d. Interpret the coefficient of determination
- 17.20 GSS2008*** Use the General Social Survey of 2008 to conduct a regression analysis of income (INCOME) using the following dependent variables:
- Age (AGE)
 - Years of education (EDUC)
 - Hours of work per week (HRS)
 - Spouse's hours of work (SPHRS)
 - Occupation prestige score (PRESTG80)
 - Number of children (CHILDS)
 - Number of family members earning money (EARNRS)
 - Years with current employer (CUREMPYR)
- a. Test the model's validity
 - b. Test each of the slope coefficients
 - c. Interpret the coefficients



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

Excel users: We remind you that any row that contains at least one empty cell (in the columns of the dependent and the independent variables) must be removed. Use a 5% significance level for all tests.

- 17.21 **ANES2008*** With voter turnout during presidential elections around 50% a vital task for politicians is to try to predict who will actually vote. Develop a regression model to predict intention to vote (DEFINITE) using the following demographic independent variables:

Age (AGE)
Education (EDUC)
Income (INCOME)

- Determine the regression equation
- Test the model's validity
- Test to determine whether there is sufficient evidence to infer a linear relationship between the dependent variable and each independent variable

- 17.22 **ANES2008*** Does watching news on television or reading newspapers provide indicators of who will

vote? Conduct a regression analysis with intention to vote (DEFINITE) as the dependent variable and the following independent variables:

- Number of days in previous week watching national news on television (DAYS1)
 - Number of days in previous week watching local television news in afternoon or early evening (DAYS2)
 - Number of days in previous week watching local television news in late evening (DAYS3)
 - Number of days in previous week reading a daily newspaper (DAYS4)
 - Number of days in previous week reading a daily newspaper on the Internet (DAYS5)
 - Number of days in previous week listen to news on radio (DAYS6)
- Compute the regression equation
 - Is there enough evidence to conclude that the model is valid?
 - Test each slope coefficient

17-3 / REGRESSION DIAGNOSTICS—II

In Section 16-6, we discussed how to determine whether the required conditions are unsatisfied. The same procedures can be used to diagnose problems in the multiple regression model. Here is a brief summary of the diagnostic procedure we described in Chapter 16.

Calculate the residuals and check the following:

1. *Is the error variable nonnormal?* Draw the histogram of the residuals.
2. *Is the error variance constant?* Plot the residuals versus the predicted values of y .
3. *Are the errors independent (time-series data)?* Plot the residuals versus the time periods.
4. *Are there observations that are inaccurate or do not belong to the target population?* Double-check the accuracy of outliers and influential observations.

If the error is nonnormal and/or the variance is not a constant, several remedies can be attempted. These are beyond the level of this book.

Outliers and influential observations are checked by examining the data in question to ensure accuracy.

Nonindependence of a time series can sometimes be detected by graphing the residuals and the time periods and looking for evidence of autocorrelation. In Section 17-4, we introduce the Durbin–Watson test, which tests for one form of autocorrelation. We will offer a corrective measure for nonindependence.

There is another problem that is applicable to multiple regression models only. *Multicollinearity* is a condition wherein the independent variables are highly correlated.

Multicollinearity distorts the *t*-tests of the coefficients, making it difficult to determine whether any of the independent variables are linearly related to the dependent variable. It also makes interpreting the coefficients problematic. We will discuss this condition and its remedy next.

17-3a Multicollinearity

Multicollinearity (also called *collinearity* and *intercorrelation*) is a condition that exists when the independent variables are correlated with one another. The adverse effect of multicollinearity is that the estimated regression coefficients of the independent variables that are correlated tend to have large sampling errors. There are two consequences of multicollinearity. First, because the variability of the coefficients is large, the sample coefficient may be far from the actual population parameter, including the possibility that the statistic and parameter may have opposite signs. Second, when the coefficients are tested, the *t*-statistics will be small, which leads to the inference that there is no linear relationship between the affected independent variables and the dependent variable. In some cases, this inference will be wrong. Fortunately, multicollinearity does not affect the *F*-test of the analysis of variance.

Consider the chapter-opening example, in which we found that the number of children in the family was not statistically significant at the 5% significance level. However, when we tested the coefficient of correlation between income and number of children, we found it to be statistically significant. The Excel printout is shown below. How do we explain the apparent contradiction between the multiple regression *t*-test of the coefficient of the number of children and the result of the *t*-test of the correlation coefficient? The answer is multicollinearity.

	A	B
1	Correlation	
2		
3	<i>INCOME and CHILDS</i>	
4	Pearson Coefficient of Correlation	-0.1422
5	t Stat	-2.65
6	df	340
7	P($T \leq t$) one tail	0.0042
8	t Critical one tail	1.6493
9	P($T \leq t$) two tail	0.0084
10	t Critical two tail	1.967

There is a relatively high degree of correlation between number of family members who earn income and number of children. The result of the *t*-test of the correlation between number of earners and number of children is shown next. The result should not be surprising, as more earners in a family are very likely children.

	A	B
1	Correlation	
2		
3	<i>EARNRS and CHILDS</i>	
4	Pearson Coefficient of Correlation	0.1539
5	t Stat	2.87
6	df	340
7	P($T \leq t$) one tail	0.0022
8	t Critical one tail	1.6493
9	P($T \leq t$) two tail	0.0044
10	t Critical two tail	1.967

Multicollinearity affected the result of the multiple regression t -test so that it appeared that number of children is not significantly related to income, when in fact it is.

Another problem caused by multicollinearity is the interpretation of the coefficients. We interpret the coefficients as measuring the change in the dependent variable when the corresponding independent variable increases by one unit while all the other independent variables are held constant. This interpretation may be impossible when the independent variables are highly correlated, because when the independent variable increases by one unit, some or all of the other independent variables will change.

This raises two important questions for the statistics practitioner. First, how do we recognize the problem of multicollinearity when it occurs, and second, how do we avoid or correct it?

Multicollinearity exists in virtually all multiple regression models. In fact, finding two completely uncorrelated variables is rare. The problem becomes serious, however, only when two or more independent variables are highly correlated. Unfortunately, we do not have a critical value that indicates when the correlation between two independent variables is large enough to cause problems. To complicate the issue, multicollinearity also occurs when a combination of several independent variables is correlated with another independent variable or with a combination of other independent variables. Consequently, even with access to all the correlation coefficients, determining when the multicollinearity problem has reached the serious stage may be extremely difficult. A good indicator of the problem is a large F -statistic, but small t -statistics.

Minimizing the effect of multicollinearity is often easier than correcting it. The statistics practitioner must try to include independent variables that are independent of each other.



EXERCISES

The following exercises require a computer and software.

- 17.23** Compute the residuals and the predicted values for the regression analysis in Exercise 17.1.
- Is the normality requirement violated? Explain.
 - Is the variance of the error variable constant? Explain.
- 17.24** Calculate the coefficients of correlation for each pair of independent variables in Exercise 17.1. What do these statistics tell you about the independent variables and the t -tests of the coefficients?
- 17.25** Refer to Exercise 17.2.
- Determine the residuals and predicted values.
 - Does it appear that the normality requirement is violated? Explain.
 - Is the variance of the error variable constant? Explain.
 - Determine the coefficient of correlation between the assignment mark and the midterm mark. What does this statistic tell you about the t -tests of the coefficients?
- 17.26** Compute the residuals and predicted values for the regression analysis in Exercise 17.3.
- a.** Does it appear that the error variable is not normally distributed?
- b.** Is the variance of the error variable constant?
- c.** Is multicollinearity a problem?
- 17.27** Refer to Exercise 17.4. Find the coefficients of correlation of the independent variables.
- What do these correlations tell you about the independent variables?
 - What do they say about the t -tests of the coefficients?
- 17.28** Calculate the residuals and predicted values for the regression analysis in Exercise 17.5.
- Does the error variable appear to be normally distributed?
 - Is the variance of the error variable constant?
 - Is multicollinearity a problem?
- 17.29** Are the required conditions satisfied in Exercise 17.6?
- 17.30** Refer to Exercise 17.7.
- Conduct an analysis of the residuals to determine whether any of the required conditions are violated.
 - Does it appear that multicollinearity is a problem?
 - Identify any observations that should be checked for accuracy.

- 17.31** Are the required conditions satisfied for the regression analysis in Exercise 17.8?
- 17.32** Determine whether the required conditions are satisfied in Exercise 17.9.
- 17.33** Refer to Exercise 17.10. Calculate the residuals and predicted values.
- Is the normality requirement satisfied?
 - Is the variance of the error variable constant?
 - Is multicollinearity a problem?
- 17.34** Determine whether there are violations of the required conditions in the regression model used in Exercise 17.11.
- 17.35** Determine whether the required conditions are satisfied in Exercise 17.12.
- 17.36** Refer to Exercise 17.13.
- Are the required conditions satisfied?
 - Is multicollinearity a problem? If so, explain the consequences.
- 17.37** Refer to Exercise 17.14. Are the required conditions satisfied?
- 17.38** Refer to Exercise 17.15. Check the required conditions.



GENERAL SOCIAL SURVEY EXERCISES

- 17.39** Refer to Exercise 17.16. Calculate the correlation between the father's and the mother's years of education. Is there any sign of multicollinearity? Explain.
- 17.40** Refer to Exercise 17.17.
- Calculate the correlation between the independent variables. Does it indicate the presence of multicollinearity? Explain.
 - Test the correlation between each independent variable and the dependent variable. Which independent variables are linearly related to the dependent variable? Compare this conclusion with the one produced in Exercise 17.17.
- 17.41** Refer to Exercise 17.19.
- Calculate the correlation between the independent variables. Does it indicate the presence of multicollinearity? Explain.
- b. Test the correlation between each independent variable and the dependent variable. Which independent variables are linearly related to the dependent variable? Compare this conclusion with the one produced in Exercise 17.19.
- 17.42** Refer to Exercise 17.20.
- Calculate the correlation matrix.
 - Are there signs of the presence of multicollinearity? Explain.
 - Test the correlation between each independent variable and the dependent variable. Which independent variables are linearly related to the dependent variable?

17-4 / REGRESSION DIAGNOSTICS—III (TIME SERIES)

In Chapter 16, we pointed out that, in general, we check to see whether the errors are independent when the data constitute a *time series*—data gathered sequentially over a series of time periods. In Section 16-6, we described the graphical procedure for determining whether the required condition that the errors are independent is violated. We plot the residuals versus the time periods and look for patterns. In this section, we augment that procedure with the **Durbin-Watson test**.

17-4a Durbin-Watson Test

The Durbin-Watson test allows the statistics practitioner to determine whether there is evidence of **first-order autocorrelation**—a condition in which a relationship exists between consecutive residuals e_i and e_{i-1} , where i is the time period. The Durbin-Watson statistic is defined as

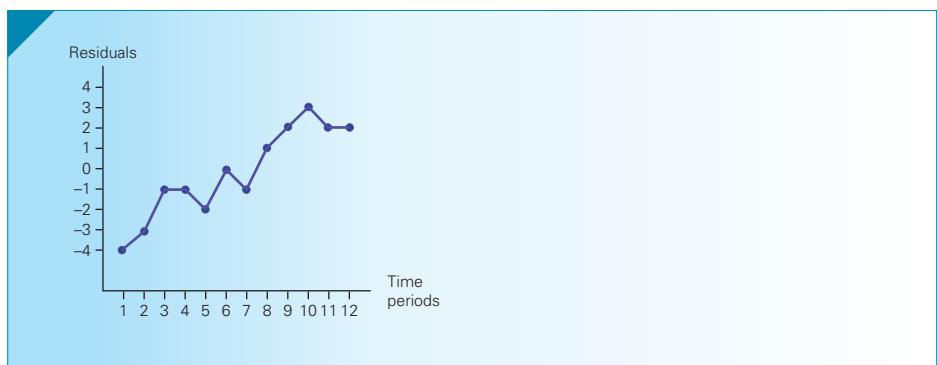
$$d = \frac{\sum_{i=2}^n (e_i - e_{i-1})^2}{\sum_{i=1}^n e_i^2}$$

The range of the values of d is

$$0 \leq d \leq 4$$

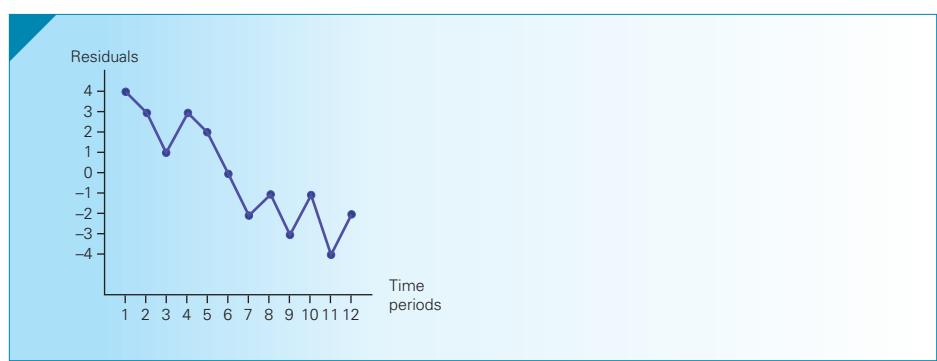
where small values of d ($d < 2$) indicate a positive first-order autocorrelation and large values of d ($d > 2$) imply a negative first-order autocorrelation. Positive first-order autocorrelation is a common occurrence in business and economic time series. It occurs when consecutive residuals tend to be similar. In that case, $(e_i - e_{i-1})^2$ will be small, producing a small value for d . Negative first-order autocorrelation occurs when consecutive residuals differ widely. For example, if positive and negative residuals generally alternate, $(e_i - e_{i-1})^2$ will be large; as a result, d will be greater than 2. Figures 17.2 and 17.3 depict positive first-order autocorrelation, whereas Figure 17.4 illustrates negative autocorrelation. Notice that in Figure 17.2, the first residual is a small number; the second residual, also a small number, is somewhat larger; and that trend continues. In Figure 17.3, the first residual is large and, in general, succeeding residuals decrease. In both figures, consecutive residuals are similar. In Figure 17.4, the first residual is a positive number and is followed by a negative residual. The remaining residuals follow this pattern (with some exceptions). Consecutive residuals are quite different.

FIGURE 17.2 Positive First-Order Autocorrelation

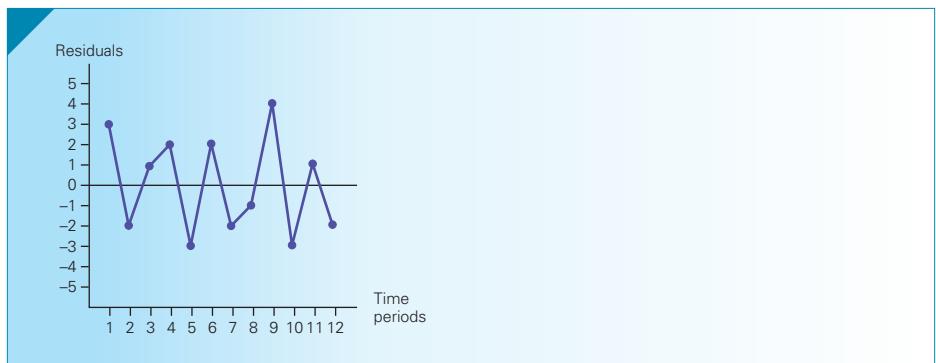


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FIGURE 17.3 Positive First-Order Autocorrelation



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FIGURE 17.4 Negative First-Order Autocorrelation

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Table 8 in Appendix B is designed to test for positive first-order autocorrelation by providing values of d_L and d_U for a variety of values of n and k and for $\alpha = .01$ and $.05$.

The decision is made in the following way. If $d < d_L$, we conclude that there is enough evidence to show that positive first-order autocorrelation exists. If $d > d_U$, we conclude that there is not enough evidence to show that positive first-order autocorrelation exists. And if $d_L \leq d \leq d_U$, the test is inconclusive. The recommended course of action when the test is inconclusive is to continue testing with more data until a conclusive decision can be made.

For example, to test for positive first-order autocorrelation with $n = 20$, $k = 3$, and $\alpha = .05$, we test the following hypotheses:

$$H_0: \text{There is no first-order autocorrelation.}$$

$$H_1: \text{There is positive first-order autocorrelation.}$$

The decision is made as follows:

If $d < d_L = 1.00$, reject the null hypothesis in favor of the alternative hypothesis.

If $d > d_U = 1.68$, do not reject the null hypothesis.

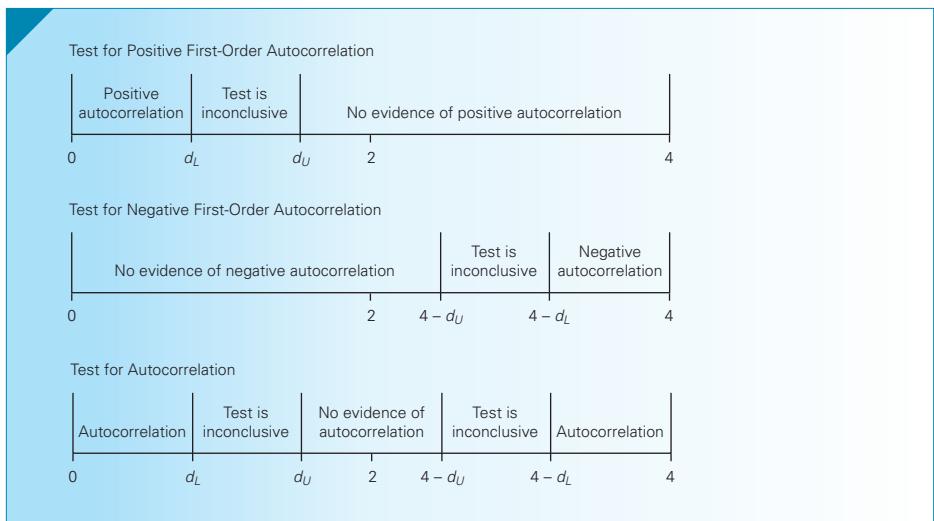
If $1.00 \leq d \leq 1.68$, the test is inconclusive.

To test for negative first-order autocorrelation, we change the critical values. If $d > 4 - d_L$, we conclude that negative first-order autocorrelation exists. If $d < 4 - d_U$, we conclude that there is not enough evidence to show that negative first-order autocorrelation exists. If $4 - d_U \leq d \leq 4 - d_L$, the test is inconclusive.

We can also test simply for first-order autocorrelation by combining the two one-tail tests. If $d < d_L$ or $d > 4 - d_L$, we conclude that autocorrelation exists. If $d_U \leq d \leq 4 - d_U$, we conclude that there is no evidence of autocorrelation. If $d_L \leq d \leq d_U$ or $4 - d_U \leq d \leq 4 - d_L$, the test is inconclusive. The significance level will be 2α (where α is the one-tail significance level). Figure 17.5 describes the range of values of d and the conclusion for each interval.

For time-series data, we add the Durbin-Watson test to our list of regression diagnostics. In other words, we determine whether the error variable is normally distributed with constant variance (as we did in Section 17-3), we identify outliers and (if our software allows it) influential observations that should be verified, and we conduct the Durbin-Watson test.

FIGURE 17.5 Durbin-Watson Test



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EXAMPLE 17.1
DATA
Xm17-01
Christmas Week Ski Lift Sales

Christmas week is a critical period for most ski resorts. Because many students and adults are free from other obligations, they are able to spend several days indulging in their favorite pastime, skiing. A large proportion of gross revenue is earned during this period. A ski resort in Vermont wanted to determine the effect that weather had on its sales of lift tickets. The manager of the resort collected data on the number of lift tickets sold during Christmas week (y), the total snowfall in inches (x_1), and the average temperature in degrees Fahrenheit (x_2) for the past 20 years. Develop the multiple regression model and diagnose any violations of the required conditions.

SOLUTION:

The model is

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \varepsilon$$

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.3465				
5	R Square	0.1200				
6	Adjusted R Square	0.0165				
7	Standard Error	1712				
8	Observations	20				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	2	6,793,798	3,396,899	1.16	0.3373
13	Residual	17	49,807,214	2,929,836		
14	Total	19	56,601,012			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	8308	904	9.19	5.24E-08	
18	Snowfall	74.59	51.57	1.45	0.1663	
19	Temperature	-8.75	19.70	-0.44	0.6625	

MINITAB**Regression Analysis: Tickets versus Snowfall, Temperature**

The regression equation is
 $\text{Tickets} = 8308 + 74.6 \text{ Snowfall} - 8.8 \text{ Temperature}$

Predictor	Coef	SE Coef	T	P
Constant	8308.0	903.7	9.19	0.000
Snowfall	74.59	51.57	1.45	0.166
Temperature	-8.75	19.70	-0.44	0.662

$S = 1712$ R-Sq = 12.0% R-Sq(adj) = 1.7%

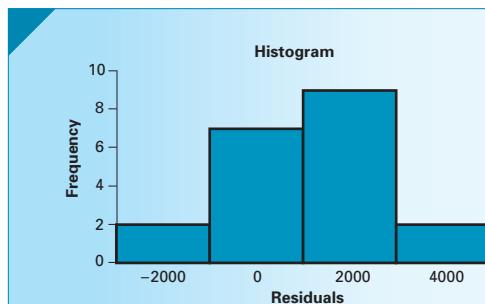
Analysis of Variance

Source	DF	SS	MS	F	P
Regression	2	6,793,798	3,396,899	1.16	0.337
Residual Error	17	49,807,214	2,929,836		
Total	19	56,601,012			

INTERPRET

As you can see, the coefficient of determination is small ($R^2 = 12\%$) and the p -value of the F -test is .3373, both of which indicate that the model is poor. We used Excel to draw the histogram (Figure 17.6) of the residuals and plot the predicted values of y versus the residuals in Figure 17.7. Because the observations constitute a time series, we also used Excel to plot the time periods (years) versus the residuals (Figure 17.8).

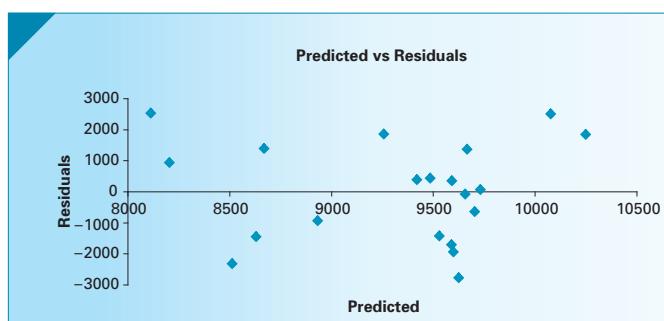
FIGURE 17.6 Histogram of Residuals in Example 17.1



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The histogram reveals that the error may be normally distributed.

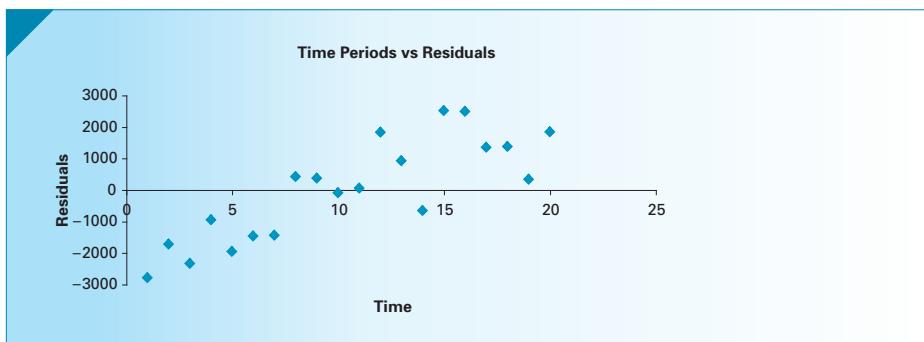
FIGURE 17.7 Plot of Predicted Values versus Residuals in Example 17.1



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There does not appear to be any evidence of heteroscedasticity.

FIGURE 17.8 Plot of Time Periods versus Residuals in Example 17.1



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This graph reveals a serious problem. There is a strong relationship between consecutive values of the residuals, which indicates that the requirement that the errors are independent has been violated. To confirm this diagnosis, we instructed Excel and Minitab to calculate the Durbin–Watson statistic.

EXCEL

	A	B	C
1	Durbin–Watson Statistic		
2			
3	d = 0.5931		

INSTRUCTIONS

Proceed through the usual steps to conduct a regression analysis and print the residuals (see page 667). Highlight the entire list of residuals and click **Add-Ins**, **Data Analysis Plus**, and **Durbin–Watson Statistic**.

MINITAB

Durbin–Watson statistic = 0.593140

INSTRUCTIONS

Follow the instructions on page 668. Before clicking **OK**, click **Options . . .** and **Durbin–Watson statistic**.

The critical values are determined by noting that $n = 20$ and $k = 2$ (there are two independent variables in the model). If we wish to test for positive first-order autocorrelation with $\alpha = .05$, we find in Table 8(a) in Appendix B

$$d_L = 1.10 \quad \text{and} \quad d_U = 1.54$$

The null and alternative hypotheses are

H_0 : There is no first-order autocorrelation.

H_1 : There is positive first-order autocorrelation.

The rejection region is $d < d_L = 1.10$. Because $d = .59$, we reject the null hypothesis and conclude that there is enough evidence to infer that positive first-order autocorrelation exists.

Autocorrelation usually indicates that the model needs to include an independent variable that has a time-ordered effect on the dependent variable. The simplest such independent variable represents the time periods. To illustrate, we included a third independent variable that records the number of years since the year the data were gathered. Thus, $x_3 = 1, 2, \dots, 20$. The new model is

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_3 + \varepsilon$$

EXCEL

A	B	C	D	E	F
1 SUMMARY OUTPUT					
2					
3 Regression Statistics					
4 Multiple R	0.8608				
5 R Square	0.7410				
6 Adjusted R Square	0.6924				
7 Standard Error	957				
8 Observations	20				
9					
10 ANOVA					
11	df	SS	MS	F	Significance F
12 Regression	3	41,940,217	13,980,072	15.26	0.0001
13 Residual	16	14,660,795	916,300		
14 Total	19	56,601,012			
15					
16	Coefficients	Standard Error	t Stat	P-value	
17 Intercept	5966	631.3	9.45	6.00E-08	
18 Snowfall	70.18	28.85	2.43	0.0271	
19 Temperature	-9.23	11.02	-0.84	0.4145	
20 Time	230.0	37.13	6.19	1.29E-05	

MINITAB

Regression Analysis: Tickets versus Snowfall, Temperature, Time

The regression equation is
 $\text{Tickets} = 5966 + 70.2 \text{ Snowfall} - 9.2 \text{ Temperature} + 230 \text{ Time}$

Predictor	Coef	SE Coef	T	P
Constant	5965.6	631.3	9.45	0.000
Snowfall	70.18	28.85	2.43	0.027
Temperature	-9.23	11.02	-0.84	0.414
Time	229.97	37.13	6.19	0.000

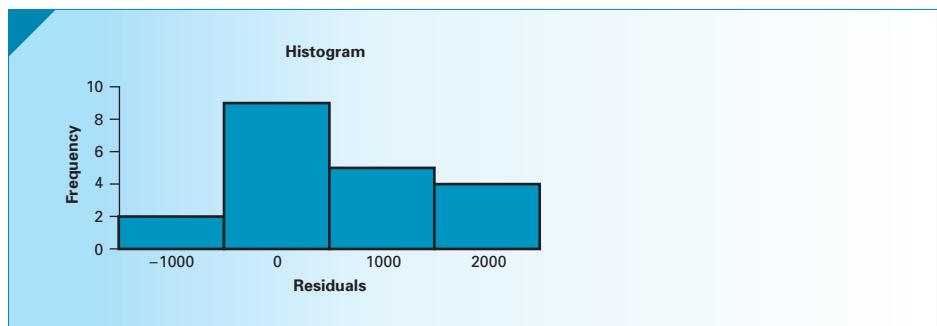
S = 9572 R-Sq = 74.1% R-Sq(adj) = 69.2%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	3	41,940,217	13,980,072	15.26	0.000
Residual Error	16	14,660,795	916,300		
Total	19	56,601,012			

As we did before, we calculate the residuals and conduct regression diagnostics using Excel. The results are shown in Figure 17.9–17.11.

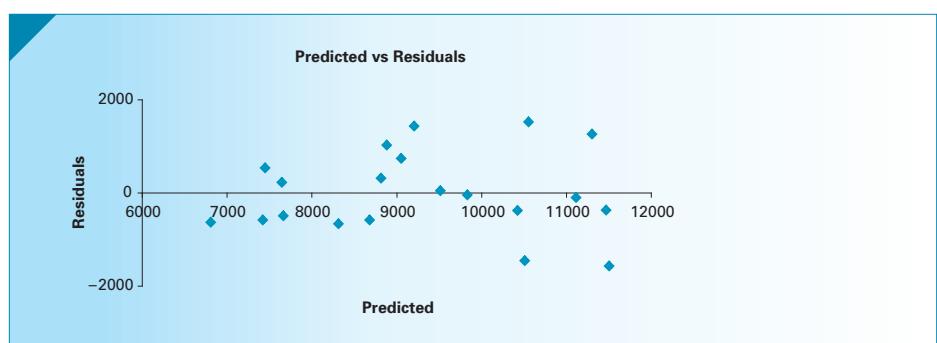
FIGURE 17.9 Histogram of Residuals in Example 17.1 (Time Variable Included)



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The histogram reveals that the error may be normally distributed.

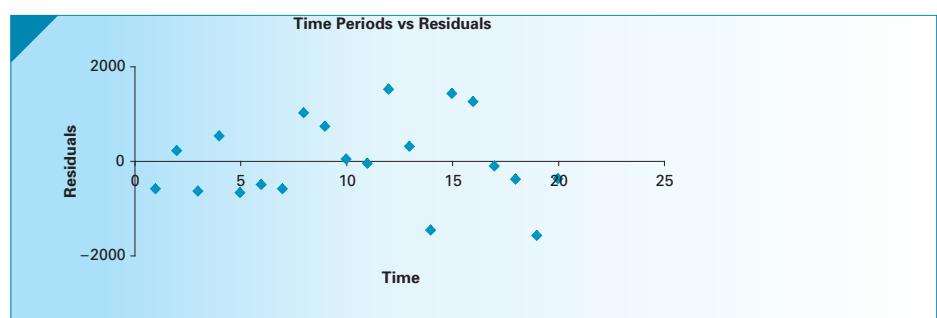
FIGURE 17.10 Plot of Predicted Values versus Residuals in Example 17.1 (Time Variable Included)



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The error variable variance appears to be constant.

FIGURE 17.11 Plot of Time Periods versus Residuals in Example 17.1 (Time Variable Included)



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There is no sign of autocorrelation. To confirm our diagnosis, we conducted the Durbin–Watson test.

EXCEL

	A	B	C
1	Durbin-Watson Statistic		
2			
3	d = 1.885		

MINITAB

Durbin-Watson statistic = 1.88499

From Table 8(a) in Appendix B, we find the critical values of the Durbin–Watson test. With $k = 3$ and $n = 20$, we find

$$d_L = 1.00 \quad \text{and} \quad d_U = 1.68$$

Because $d > 1.68$, we conclude that there is not enough evidence to infer the presence of positive first-order autocorrelation.

Notice that the model is improved dramatically. The F -test tells us that the model is valid. The t -tests tell us that both the amount of snowfall and time are significantly linearly related to the number of lift tickets. This information could prove useful in advertising for the resort. For example, the resort could emphasize any recent snowfall in its advertising. If no new snow has fallen, the resort might emphasize its snow-making facilities.

17-4b Developing an Understanding of Statistical Concepts

Notice that the addition of the time variable explained a large proportion of the variation in the number of lift tickets sold; that is, the resort experienced a relatively steady increase in sales over the past 20 years. Once this variable was included in the model, the amount of snowfall became significant because it was able to explain some of the remaining variation in lift ticket sales. Without the time variable, the amount of snowfall and the temperature were unable to explain a significant proportion of the variation in ticket sales. The graph of the residuals versus the time periods and the Durbin–Watson test enabled us to identify the problem and correct it. In overcoming the autocorrelation problem, we improved the model so that we identified the amount of snowfall as an important variable in determining ticket sales. This result is quite common. Correcting a violation of a required condition will frequently improve the model.



EXERCISES

- 17.43** Perform the Durbin–Watson test at the 5% significance level to determine whether positive first-order autocorrelation exists when $d = 1.10$, $n = 25$, and $k = 3$.
- 17.44** Determine whether negative first-order autocorrelation exists when $d = 2.85$, $n = 50$, and $k = 5$. (Use a 1% significance level.)
- 17.45** Given the following information, perform the Durbin–Watson test to determine whether first-order autocorrelation exists:
 $n = 25$, $k = 5$, $\alpha = .10$, $d = .90$
- 17.46** Test the following hypotheses with $\alpha = .05$.
 H_0 : There is no first-order autocorrelation
 H_1 : There is positive first-order autocorrelation
 $n = 50$, $k = 2$, $d = 1.38$

- 17.47** Test the following hypotheses with $\alpha = .02$.

H_0 : There is no first-order autocorrelation
 H_1 : There is first-order autocorrelation
 $n = 90, k = 5, d = 1.60$

- 17.48** Test the following hypotheses with $\alpha = .05$.

H_0 : There is no first-order autocorrelation
 H_1 : There is negative first-order autocorrelation
 $n = 33, k = 4, d = 2.25$

The following exercises require a computer and software.

- 17.49** **Xr17-49** Observations of variables y, x_1 , and x_2 were taken over 100 consecutive time periods.

- Conduct a regression analysis of these data.
- Plot the residuals versus the time periods. Describe the graph.
- Perform the Durbin-Watson test. Is there evidence of autocorrelation? Use $\alpha = .10$.
- If autocorrelation was detected in Part c, propose an alternative regression model to remedy the problem. Use the computer to generate the statistics associated with this model.
- Redo Parts b and c. Compare the two models.

- 17.50** **Xr17-50** Weekly sales of a company's product (y) and those of its main competitor (x) were recorded for one year.

- Conduct a regression analysis of these data.
- Plot the residuals versus the time periods. Does there appear to be autocorrelation?
- Perform the Durbin-Watson test. Is there evidence of autocorrelation? Use $\alpha = .10$.

- If autocorrelation was detected in Part c, propose an alternative regression model to remedy the problem. Use the computer to generate the statistics associated with this model.
- Redo Parts b and c. Compare the two models.

- 17.51** Refer to Exercise 17.3. Is there evidence of positive first-order autocorrelation?

- 17.52** Refer to Exercise 16.99. Determine whether there is evidence of first-order autocorrelation.

- 17.53** **Xr17-53** The manager of a tire store in Minneapolis has been concerned with the high cost of inventory. The current policy is to stock all the snow tires that are predicted to sell over the entire winter at the beginning of the season (end of October). The manager can reduce inventory costs by having suppliers deliver snow tires regularly from October to February. However, he needs to be able to predict weekly sales to avoid stockouts that will ultimately lose sales. To help develop a forecasting model, he records the number of snow tires sold weekly during the last winter and the amount of snowfall (in inches) in each week.

- Develop a regression model and use a software package to produce the statistics.
- Perform a complete diagnostic analysis to determine whether the required conditions are satisfied.
- if one or more conditions are unsatisfied, attempt to remedy the problem.
- Use whatever procedures you wish to assess how well the new model fits the data.
- Interpret and test each of the coefficients.

CHAPTER SUMMARY

The multiple regression model extends the model introduced in Chapter 16. The statistical concepts and techniques are similar to those presented in simple linear regression. We assess the model in three ways: standard error of estimate, the coefficient of determination (and the coefficient of determination adjusted for degrees of freedom), and the F -test of the analysis of variance. We can use the t -tests of

the coefficients to determine whether each of the independent variables is linearly related to the dependent variable. As we did in Chapter 16, we showed how to diagnose violations of the required conditions and to identify other problems. We introduced multicollinearity and demonstrated its effect and its remedy. Finally, we presented the Durbin-Watson test to detect first-order autocorrelation.

IMPORTANT TERMS:

Response surface 688
 Coefficient of determination adjusted for degrees of freedom 692

Multicollinearity 707
 Durbin-Watson test 709
 First-order autocorrelation 709

SYMBOLS:

Symbol	Pronounced	Represents
β_i	Beta sub i or beta i	Coefficient of i th independent variable
b_i	b sub i or b i	Sample coefficient

FORMULAS:

Standard error of estimate

$$s_e = \sqrt{\frac{SSE}{n - k - 1}}$$

Test statistic for β_i

$$t = \frac{b_i - \beta_i}{s_{b_i}}$$

Coefficient of determination

$$R^2 = \frac{s_{xy}^2}{s_x^2 s_y^2} = 1 - \frac{SSE}{\sum (y_i - \bar{y})^2}$$

Adjusted coefficient of determination

$$\text{Adjusted } R^2 = 1 - \frac{SSE/(n - k - 1)}{\sum (y_i - \bar{y})^2/(n - 1)}$$

Mean square for error

$$\text{MSE} = SSE/k$$

Mean square for regression

$$\text{MSR} = SSR/(n - k - 1)$$

F-statistic

$$F = \text{MSR}/\text{MSE}$$

Durbin-Watson statistic

$$d = \frac{\sum_{i=1}^m (e_i - e_{i-1})^2}{\sum_{i=1}^n e_i^2}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Regression	690	690
Prediction interval	699	699
Durbin-Watson statistic	714	714

CHAPTER EXERCISES

The following exercises require the use of a computer and statistical software. Use a 5% significance level.

- 17.54 Xr17-54** The agronomist referred to in Exercise 16.83 believed that the amount of rainfall as well as the amount of fertilizer used would affect the crop yield. She redid the experiment in the following way. Thirty greenhouses were rented. In each, the amount of fertilizer and the amount of water were varied. At the end of the growing season, the amount of corn was recorded.
- Determine the sample regression line and interpret the coefficients.
 - Do these data allow us to infer that there is a linear relationship between the amount of fertilizer and the crop yield?
 - Do these data allow us to infer that there is a linear relationship between the amount of water and the crop yield?
 - What can you say about the fit of the multiple regression model?
 - Is it reasonable to believe that the error variable is normally distributed with constant variance?
 - Predict the crop yield when 100 kilograms of fertilizer and 1,000 liters of water are applied. Use a confidence level of 95%.

- 17.55 Xr16-12*** Exercise 16.12 addressed the problem of determining the relationship between the price

of apartment buildings and number of square feet. Hoping to improve the predictive capability of the model, the real estate agent also recorded the number of apartments, the age, and the number of floors.

- Calculate the regression equation.
- Is the model valid?
- Compare your answer with that of Exercise 16.12.

- 17.56 Xr16-16*** In Exercise 16.16, a statistics practitioner examined the relationship between office rents and the city's office vacancy rate. The model appears to be quite poor. It was decided to add another variable that measures the state of the economy. The city's unemployment rate was chosen for this purpose.
- Determine the regression equation.
 - Determine the coefficient of determination and describe what this value means.
 - Test the model's validity in explaining office rent.
 - Determine which of the two independent variables is linearly related to rents.
 - Determine whether the error is normally distributed with a constant variance.
 - Determine whether there is evidence of autocorrelation.
 - Predict with 95% confidence the office rent in a city whose vacancy rate is 10% and whose unemployment rate is 7%.

CASE 17.1**An Analysis of Mutual Fund Managers, Part 1***

There are thousands of mutual funds available (see page 178 for a brief introduction to mutual funds). There is no shortage of sources of information about them. Newspapers regularly report the value of each unit, mutual fund companies and brokers advertise extensively, and there are books on the subject. Many of the advertisements imply that individuals should invest in the advertiser's mutual fund because it has performed well in the past. Unfortunately, there is little evidence to infer that past performance is a predictor of the future. However, it may be possible to acquire useful information by

examining the managers of mutual funds. Several researchers have studied the issue. One project gathered data concerning the performance of 2,029 funds.

The performance of each fund was measured by its risk-adjusted excess return, which is the difference between the return on investment of the fund and a return that is considered a standard. The standard is based on a variety of variables, including the risk-free rate.

Four variables describe the fund manager: age, tenure (how many years the manager has been in charge), whether the manager had



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DATA
C17-01

an MBA (1 = yes, 0 = no), and a measure of the quality of the manager's education [the average Scholastic Achievement Test (SAT) score of students at the university where the manager received his or her undergraduate degree].

Conduct an analysis of the data. Discuss how the average SAT score of the manager's alma mater, whether he or she has an MBA, and his or her age and tenure are related to the performance of the fund.

*This case is based on "Are Some Mutual Fund Managers Better Than Others? Cross-Sectional Patterns in Behavior and Performance," Judith Chevalier and Glenn Ellison, Working Paper 5852, National Bureau of Economic Research.

CASE 17.2**An Analysis of Mutual Fund Managers, Part 2**

In addition to analyzing the relationship between the managers' characteristic and the performance of the fund, researchers wanted to determine whether the same characteristics are related to the behavior of the fund. In particular, they wanted to know whether the risk of the fund and its management expense ratio (MER) were related to the manager's age, tenure, university

SAT score, and whether he or she had an MBA.

In Section 4-6, we introduced the market model wherein we measure the systematic risk of stocks by the stock's beta. The beta of a portfolio is the average of the betas of the stocks that make up the portfolio. File C17-02a stores the same managers' characteristics as those in file C17-01. However, the first column contains the betas of the mutual funds.



To analyze the management expense ratios, it was decided to include a measure of the size of the fund. The logarithm of the funds' assets (in \$millions) was recorded with the MER. These data are stored in file C17-02b.

Analyze both sets of data and write a brief report of your findings.

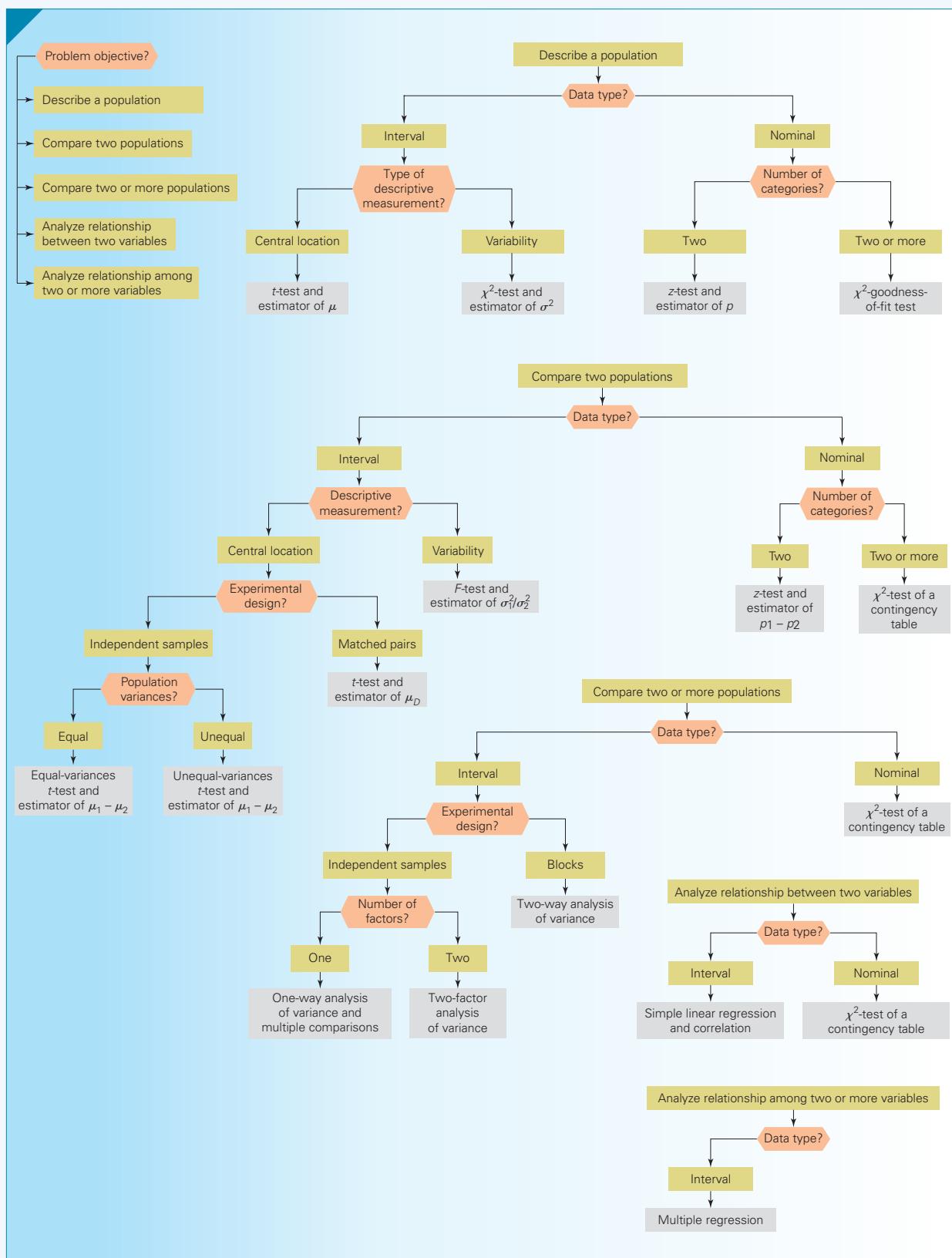
DATA
C17-02a
C17-02b

APPENDIX 17 / REVIEW OF CHAPTERS 12 TO 17

Table A17.1 presents a list of inferential methods presented thus far, and Figure A17.1 depicts a flowchart designed to help students identify the correct statistical technique.

TABLE A17.1 Summary of Statistical Techniques in Chapters 12 to 17

<i>t</i> -test of μ
Estimator of μ (including estimator of $N\mu$)
χ^2 test of σ^2
Estimator of σ^2
<i>z</i> -test of p
Estimator of p (including estimator of Np)
Equal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Equal-variances estimator of $\mu_1 - \mu_2$
Unequal-variances <i>t</i> -test of $\mu_1 - \mu_2$
Unequal-variances estimator of $\mu_1 - \mu_2$
<i>t</i> -test of μ_D
Estimator of μ_D
<i>F</i> -test of σ_1^2/σ_2^2
Estimator of σ_1^2/σ_2^2
<i>z</i> -test of $p_1 - p_2$ (Case 1)
<i>z</i> -test of $p_1 - p_2$ (Case 2)
Estimator of $p_1 - p_2$
One-way analysis of variance (including multiple comparisons)
Two-way (randomized blocks) analysis of variance
Two-factor analysis of variance
χ^2 -goodness-of-fit test
χ^2 -test of a contingency table
Simple linear regression and correlation (including <i>t</i> -tests of β_1 and ρ , and prediction and confidence intervals)
Multiple regression (including <i>t</i> -tests of β_i , <i>F</i> -test, and prediction and confidence intervals)

FIGURE A17.1 Flowchart of Techniques in Chapters 12 to 17



EXERCISE

- A17.1** [XrA17-01](#) Garlic has long been considered a remedy to ward off the common cold. A British researcher organized an experiment to see if this generally held belief is true. A random sample of 146 volunteers was recruited. Half the sample took one capsule of an allicin-containing garlic supplement each day. The others took a placebo. The results for each volunteer after the winter months were recorded in the following way.

Column

1. Identification number
 2. 1 = allicin-containing capsule; 2 = placebo
 3. Suffered a cold (1 = no, 2 = yes)
 4. If individual caught a cold, the number of days until recovery (999 was recorded if no cold)
- a. Can the researcher conclude that garlic does help prevent colds?
 - b. Does garlic reduce the number of days until recovery if a cold was caught?

- A17.2** [XrA17-02](#) Because shelf space is a limited resource for a retail store, product selection, shelf-space allocation, and shelf-space placement decisions must be made according to a careful analysis of profitability and inventory turnover. The manager of a chain of variety stores wishes to see whether shelf location affects the sales of a canned soup. She believes that placing the product at eye level will result in greater sales than will placing the product on a lower shelf. She observed the number of sales of the product in 40 different stores. Sales were observed over 2 weeks, with product placement at eye level one week and on a lower shelf the other week. Can we conclude that placement of the product at eye level significantly increases sales?

- A17.3** [XrA17-03](#) In an effort to explain the results of Exercise A15.9, a researcher recorded the distances for the random sample of British and American golf courses. Can we infer that British courses are shorter than American courses?

- A17.4** [XrA17-04](#) It is generally assumed that alcohol consumption tends to make drinkers more impulsive. However, a recent study in the journal *Alcohol and Alcoholism* may contradict this assumption. The study took a random sample of 76 male undergraduate students and divided them into three groups. One group remained sober; the second group was given flavored drinks with not enough alcohol to intoxicate; and the students in third group were intoxicated. Each student was offered a chance of receiving \$15 at the end of the session or double that amount later. The results were recorded using the following format:

Column 1: Group number
Column 2: Code 1 = chose \$15, 2 = chose \$30 later

Do the data allow us to infer that there is a relationship between the choices students make and their level of intoxication?

- A17.5** [XrA17-05](#) Refer to Exercise 13.35. The executive did a further analysis by taking another random sample. This time she tracked the number of customers who have had an accident in the last 5 years. For each she recorded the total amount of repairs and the credit score. Do these data allow the executive to conclude that the higher the credit score the lower the cost of repairs will be?

- A17.6** [XrA17-06](#) The U.S. National Endowment for the Arts conducts surveys of American adults to determine, among other things, their participation in various arts activities. A recent survey asked a random sample of American adults whether they participate in photography. The responses are 1 = Yes and 2 = no. There were 205.8 million American adults. Estimate with 95% confidence the number of American adults are participate in photography.

(Adapted from the *Statistical Abstract of the United States*, 2006, Table 1228.)

- A17.7** [XrA17-07](#) Mouth-to-mouth resuscitation has long been considered better than chest compression for people who have suffered a heart attack. To determine if this indeed is the better way, Japanese researchers analyzed 4,068 adult patients who had cardiac arrest witnessed by bystanders. Of those, 439 received only chest compressions from bystanders and 712 received conventional CPR compressions and breaths. The results for each group was recorded where 1 = did not survive with good neurological function and 2 = did survive with good neurological function. What conclusions can be drawn from these data?

- A17.8** [XrA17-08](#) Refer to Exercise A15.6. The financial analyst undertook another project wherein respondents were also asked the age of the head of the household. The choices are

1. Younger than 25
2. 25 to 34
3. 35 to 44
4. 45 to 54
5. 55 to 64
6. 65 and older

The responses to questions about ownership of mutual funds is No = 1 and Yes = 2. Do these data allow us to infer that the age of the head of the household is related to whether he or she owns mutual funds?

(Source: Adapted from the *Statistical Abstract of the United States*, 2006, Table 1200.)

A17.9 XrA17-09 Over one decade (1995–2005), the number of hip and knee replacement surgeries increased by 87%. Because the costs of hip and knee replacements are so expensive, private health-insurance and government-operated health-care plans have become more concerned. To get more information, random samples of people who had hip replacements in 1995 and in 2005 were drawn. From the files, the ages of the patients were recorded. Is there enough evidence to infer that the ages of people who require hip replacements are getting smaller?

(Source: Canadian Joint Replacement Registry.)

A17.10 XrA17-10 Refer to Exercise A17.9. Weight is a major factor that determines whether a person will need a hip or knee replacement and at what age. To learn more about the topic, a medical researcher randomly sampled individuals who had hip replacement (code = 1) and knee replacement (code = 2) and one of the following categories:

1. Underweight
2. Normal range
3. Overweight but not obese
4. Obese

Do the data allow the researcher to conclude that weight and the joint needing replacement are related?

A17.11 XrA17-11 Television shows with large amounts of sex or violence tend to attract more viewers. Advertisers want large audiences, but they also want viewers to remember the brand names of their products. A study was undertaken to determine the effect that shows with sex and violence have on their viewers. A random sample of 328 adults was divided into three groups. Group 1 watched violent programs, group 2 watched sexually explicit shows, and group 3 watched neutral shows. The researchers spliced nine 30-second commercials for a wide range of products. After the show, the subjects were quizzed to see if they could recall the brand name of the products. They were also asked to name the brands 24 hours later. The number of correct answers was recorded. Conduct a test to determine whether differences exist between the three groups of viewers and which type of program does best in brand recall. Results were published in the *Journal of Applied Psychology* (*National Post*, August 16, 2004).

A17.12 XrA17-12 In an effort to explain to customers why their electricity bills have been so high lately, and how customers could save money by reducing the thermostat settings on both space heaters and water heaters, a public utility commission has collected total kilowatt consumption figures for last year's winter months, as well as thermostat settings on space and water heaters, for 100 homes.

- a. Determine the regression equation.

- b. Determine the coefficient of determination and describe what it tells you.
- c. Test the validity of the model.
- d. Find the 95% interval of the electricity consumption of a house whose space heater thermostat is set at 70 and whose water heater thermostat is set at 130.
- e. Calculate the 95% interval of the average electricity consumption for houses whose space heater thermostat is set at 70 and whose water heater thermostat is set at 130.

A17.13 XrA17-13 An economist wanted to learn more about total compensation packages. She conducted a survey of 858 workers and asked all to report their hourly wages or salaries, their total benefits, and whether the companies they worked for produced goods or services. Determine whether differences exist between goods-producing and services-producing firms in terms of hourly wages and total benefits.

(Adapted from the *Statistical Abstract of the United States*, 2006, Table 637.)

A17.14 XrA17-14 Professional athletes in North America are paid very well for their ability to play games that amateurs play for fun. To determine the factors that influence a team to pay a hockey player's salary, an MBA student randomly selected 50 hockey players who played in the 1992–1993 and 1993–1994 seasons. He recorded their salaries at the end of the 1993–1994 season as well as a number of performance measures in the previous two seasons. The following data were recorded.

- Columns 1 and 2: Games played in 1992–1993 and 1993–1994
- Columns 3 and 4: Goals scored in 1992–1993 and 1993–1994
- Columns 5 and 6: Assists recorded in 1992–1993 and 1993–1994
- Columns 7 and 8: Plus/minus score in 1992–1993 and 1993–1994
- Columns 9 and 10: Penalty minutes served in 1992–1993 and 1993–1994
- Column 11: Salary in U.S. dollars

(Plus/minus is the number of goals scored by the player's team minus the number of goals scored by the opposing team while the player is on the ice.) Develop a model that analyzes the relationship between salary and the performance measures. Describe your findings. (The author wishes to thank Gordon Barnett for writing this exercise.)

A17.15 XrA17-15 The risks associated with smoking are well known. Virtually all physicians recommend that their patients quit. This raises the question, What are the risks for people who quit smoking compared to continuing smokers and those who have never smoked? In a study described in the *Journal of Internal Medicine* [Feb. 2004, 255(2): 266–272], researchers took samples of each of the following groups.

- Group 1: Never smokers
- Group 2: Continuing smokers
- Group 3: Smokers who quit

At the beginning of the 10-year research project, there were 238 people who had never smoked and 155 smokers. Over the year, 39 smokers quit. The weight gain, increase in systolic blood pressure (SBP), and increase in diastolic blood pressure (DBP) were measured and recorded. Determine whether differences exist between the three groups in terms of weight gain,

increases in systolic blood pressure, and increases in diastolic blood pressure and which groups differ.

- A17.16 *XrA17-16*** A survey was conducted among Canadian farmers, who were each asked to report the number of acres in his or her farm. There were a total of 229,373 farms in Canada in 2006. Estimate with 95% confidence the total amount of area (in acres) that was farmed in Canada in 2006.

(Source: Statistics Canada).



GENERAL SOCIAL SURVEY EXERCISES

- A17.17 *GSS2008**** Do the data allow us to infer that households with at least one union member (UNION: 1 = Respondent belongs, 2 = Spouse belongs, 3 = Both belong, 4 = Neither belong) differ from households with no union members with respect to their position on whether the government should do more or less to solve the country's problems (HELPNOT: 1 = Government should do more; 2, 3, 4, 5 = Government does too much)?

- A17.18 *GSS2008**** Estimate with 95% confidence the proportion of Americans who are divorced (DIVORCE: 1 = Yes, 2 = No).

- A17.19 *GSS2008**** Is there sufficient evidence to conclude that people who have taken college-level science courses (COLSCINM: 1 = Yes, 2 = No) are more likely to answer the following question correctly (ODDS1): A doctor tells a couple that there is one chance in four that their child will have an inherited disease. Does this mean that if the first child has the illness, the next three will not? 1 = Yes, 2 = No. Correct answer: No.

- A17.20 *GSS2008**** Estimate with 95% confidence the mean job tenure (CUREMPYR).

- A17.21 *GSS2008**** Is there sufficient evidence to infer that the three groups of conservatives (POLVIEWS: 5 = slightly conservative, 6 = conservative, 7 = extremely conservative) differ in support for capital punishment (CAPPUN: 1 = Favor, 2 = Oppose)?

- A17.22 *GSS2008**** Do older people watch more television? To answer the question, analyze the relationship between age (AGE) and the amount of time spent watching television (TVHOURS).

- A17.23 *GSS2008**** If a person has a higher income, is he or she more likely to believe that the government should do more to solve the country's problems? Conduct a test of the relationship between income (INCOME) and HELPNOT to answer the question.

- A17.24 *GSS2006**** Is there enough evidence to conclude that people with vision problems (DISABLD2: Do you have a vision problem that prevents you from reading a newspaper even when wearing glasses or contacts: 1 = Yes, 2 = No) are more likely to believe that it is the government's responsibility to help pay for doctor and hospital bills (1 = Government should help; 2, 3, 4, 5 = People should help themselves)?

- A17.25 *GSS2008**** Do the children of men with prestigious occupations have prestigious occupations themselves? Conduct a test to determine whether there is a positive linear relationship between PRESTG80 and PAPRES80.

- A17.26 *GSS2008**** Is there a relationship between the number of hours a husband works and the number of hours his wife works? Answer the question by conducting a test of the two variables (HRS and SPHRS).



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- A17.27 *ANES2008**** Are older people more likely to vote? One way to answer this question is to conduct a test to determine whether there is enough evidence to conclude that age (AGE) and intention to vote (DEFINITE) are positively related.

- A17.28 *ANES2008**** Is the amount of time a person watches television news per day affected by his or her education? Test to determine whether TIME2 and EDUC are linearly related.

CASE A17.1**Testing a More Effective Device to Keep Arteries Open**

A stent is a metal mesh cylinder that holds a coronary artery open after a blockage has been removed. However, in many patients the stents, which are made from bare metal, become blocked as well. One cause of the reoccurrence of blockages is the body's rejection of the foreign object. In a study published in the *New England Journal of Medicine* (January 2004), a new polymer-based stent was tested. After insertion, the new stents slowly release a drug (paclitaxel) to prevent the rejection problem. A sample was recruited of 1,314 patients who were receiving a stent in a single, previously untreated coronary artery blockage. A total of 652 were randomly assigned to receive a bare-metal stent, and 662 to receive

an identical-looking polymer drug-releasing stent. The results were recorded in the following way:

Column 1: Patient identification number

Column 2: Stent type

- (1 = bare metal,
- 2 = polymer based)

Column 3: Reference-vessel diameter (the diameter of the artery that is blocked, in millimeters)

Column 4: Lesion length (the length of the blockage, in millimeters)

Reference-vessel diameters and lesion lengths were measured before the stents were inserted.

The following data were recorded 12 months after the stents were inserted.

Column 5: Blockage

reoccurrence after 9 months
(2 = yes, 1 = no)

Column 6: Blockage that needed to be reopened
(2 = yes, 1 = no)

Column 7: Death from cardiac causes (2 = yes, 1 = no)

Column 8: Stroke caused by stent (2 = yes, 1 = no)

- a. Using the variables stored in columns 3 through 8, determine whether there is enough evidence to infer that the polymer-based stent is superior to the bare-metal stent.
- b. As a laboratory researcher in the pharmaceutical company write a report that describes this experiment and the results.

DATA
CA17-01

CASE A17.2**Automobile Crashes and the Ages of Drivers***

Setting premiums for insurance is a complex task. If the premium is too high, the insurance company will lose customers; if it is too low, the company will lose money. Statistics plays a critical role in almost all aspects of the insurance business. As part of a statistical analysis, an insurance company in Florida studied the relationship between the severity of car crashes and the ages of the drivers. A random sample of crashes in 2002 in the

state of Florida was drawn. For each crash, the age category of the driver was recorded as well as whether the driver was injured or killed. The data were stored as follows:

Column 1: Crash number

Column 2: Age category

1. 5 to 34
2. 35 to 44
3. 45 to 54
4. 55 to 64
5. 65 and over

Column 3: Medical status of driver

1 = Uninjured
2 = Injured (but not killed)
3 = Killed

- a. Is there enough evidence to conclude that age and medical status of the driver in car crashes are related?
- b. Estimate with 95% confidence the proportion of all Florida drivers in crashes in 2002 who were uninjured.

DATA
CA17-02

*Adapted from Florida Department of Highway Safety and Vehicles as reported in the *Miami Herald*, January 1, 2004, p. 2B.

18



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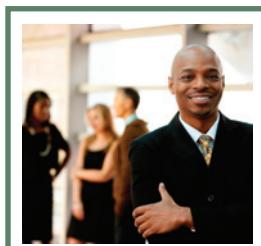
MODEL BUILDING

- 18-1 *Polynomial Models*
- 18-2 *Nominal Independent Variables*
- 18-3 *(Optional) Applications in Human Resources Management: Pay Equity*
- 18-4 *(Optional) Stepwise Regression*
- 18-5 *Model Building*

General Social Survey: Variables That Affect Income II

DATA
GSS2012*

In the Chapter 17 opening example, we found that one's income is affected by age, education, and number of hours of work per week. Determine whether income is also affected by gender and race.



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On page 741, we will provide our answer.

INTRODUCTION

Chapters 16 and 17 introduced the techniques and concepts of regression analysis. We discussed how the model is developed, interpreted, assessed, and diagnosed for violations of required conditions. However, there is more to regression analysis. In this chapter, we demonstrate why this procedure is one of the most powerful and commonly used techniques in statistics. Regression analysis allows the statistics practitioner to use mathematical models to realistically describe relationships between the dependent variable and the independent variables.

In Section 18-1, we introduce models in which the relationship between the dependent variable and the independent variables may not be linear. Section 18-2 introduces indicator variables, which allow us to use nominal independent variables. We describe pay equity, an important human resources management application that employs nominal independent variables in Section 18-3. In Section 18-4, we introduce stepwise regression, which enables the statistics practitioner to include the independent variables that yield the best fitting models. Finally, Section 18-5 discusses how to properly use regression analysis in building models.

18-1 POLYNOMIAL MODELS

Chapter 17 introduced the multiple regression model:

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \cdots + \beta_k x_k + \varepsilon$$

We included variables x_1, x_2, \dots, x_k because we believed that these variables were each linearly related to the dependent variable. In this section, we discuss models where the independent variables may be functions of a smaller number of predictor variables. The simplest form of the **polynomial model** is described in the box.

Polynomial Model with One Predictor Variable

$$y = \beta_0 + \beta_1 x + \beta_2 x^2 + \cdots + \beta_p x^p + \varepsilon$$

Technically, this is a multiple regression model with p independent variables. However, all independent variables are based on only one variable, which we label the **predictor variable**; that is, $x_1 = x, x_2 = x^2, \dots, x_p = x^p$. In this model, p is the **order** of the equation. For reasons that we discuss later, we rarely propose a model whose order is greater than 3. However, it is worthwhile to devote individual attention to situations where $p = 1, 2$, and 3 .

18-1a First-Order Model

When $p = 1$, we have the now-familiar simple linear regression model introduced in Chapter 16. It is also called the **first-order** polynomial model.

$$y = \beta_0 + \beta_1 x + \varepsilon$$

Obviously, this model is chosen when the statistics practitioner believes that there is a straight-line relationship between the dependent and independent variables over the range of the values of x .

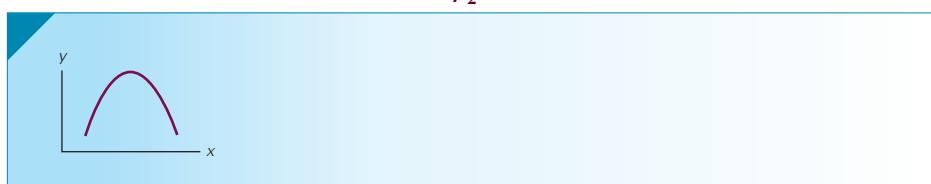
18-1b Second-Order Model

With $p = 2$, the polynomial model is

$$y = \beta_0 + \beta_1 x + \beta_2 x^2 + \varepsilon$$

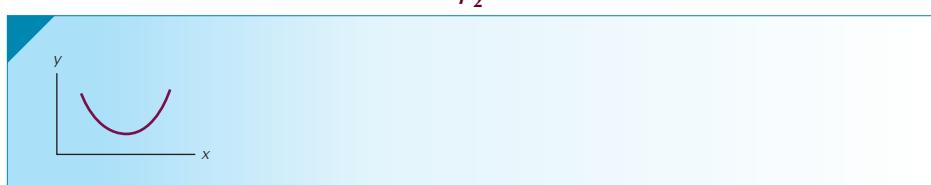
When we plot x versus y , the graph is shaped like a parabola, as shown in Figures 18.1 and 18.2. The coefficient β_0 represents the intercept where the response surface strikes the y -axis. The signs of β_1 and β_2 control the position of the parabola relative to the y -axis. If $\beta_1 = 0$, for example, the parabola is symmetric and centered around $x = 0$. If β_1 and β_2 have the same sign, the parabola shifts to the left. If β_1 and β_2 have opposite signs, the parabola shifts to the right. The coefficient β_2 describes the curvature. If $\beta_2 = 0$, there is no curvature. If β_2 is negative, the graph is concave (as in Figure 18.1). If β_2 is positive, the graph is convex (as in Figure 18.2). The greater the absolute value of β_2 , the greater the rate of curvature, as can be seen in Figure 18.3.

FIGURE 18.1 Second-Order Model with $\beta_2 < 0$



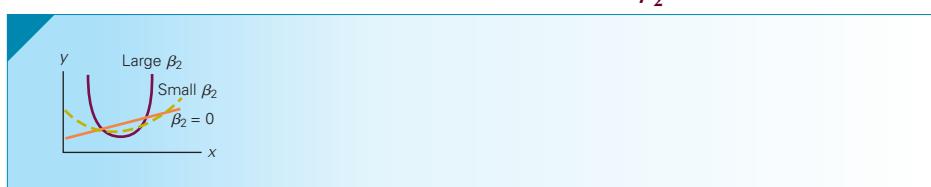
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FIGURE 18.2 Second-Order Model with $\beta_2 > 0$



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FIGURE 18.3 Second-Order Model with Various Values of β_2



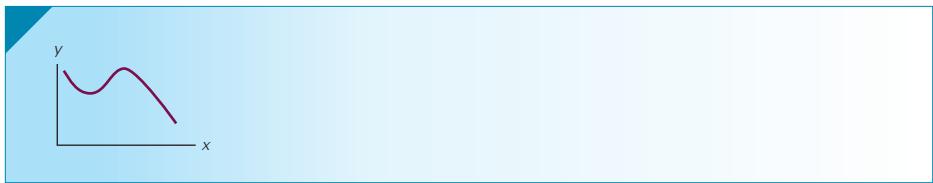
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18-1c Third-Order Model

By setting $p = 3$, we produce the third-order model

$$y = \beta_0 + \beta_1 x + \beta_2 x^2 + \beta_3 x^3 + \varepsilon$$

Figures 18.4 and 18.5 depict this equation, whose curvature can change twice.

FIGURE 18.4 Third-Order Model with $\beta_3 < 0$ 

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FIGURE 18.5 Third-Order Model with $\beta_3 > 0$ 

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As you can see, when β_3 is negative, y is decreasing over the range of x , and when β_3 is positive, y increases. The other coefficients determine the position of the curvature changes and the point at which the curve intersects the y -axis.

The number of real-life applications of this model is quite small. Statistics practitioners rarely encounter problems involving more than one curvature reversal. Therefore, we will not discuss any higher order models.

18-1d Polynomial Models with Two Predictor Variables

If we believe that two predictor variables influence the dependent variable, we can use one of the following polynomial models. The general form of this model is rather cumbersome, so we will not show it. Instead we discuss several specific examples.

18-1e First-Order Model

The first-order model is represented by

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \epsilon$$

This model is used whenever the statistics practitioner believes that, on average, y is linearly related to each of x_1 and x_2 , and the predictor variables do not interact. (Recall that we introduced interaction in Chapter 14.) This means that the effect of one predictor variable on y is independent of the value of the second predictor variable. For example, suppose that the sample regression line of the first-order model is

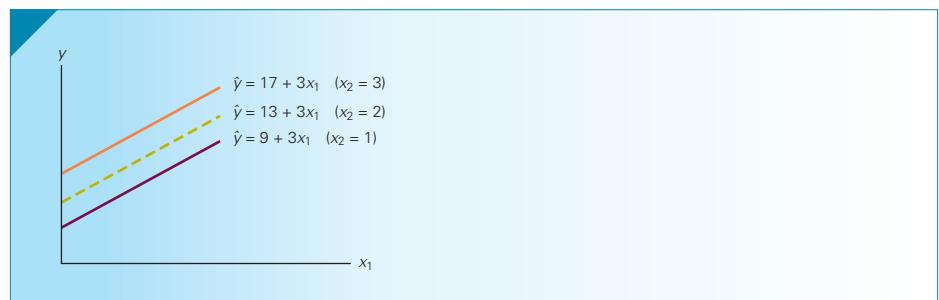
$$\hat{y} = 5 + 3x_1 + 4x_2$$

If we examine the relationship between y and x_1 for several values of x_2 (say, $x_2 = 1, 2$, and 3), we produce the following equations.

x_2	$\hat{y} = 5 + 3x_1 + 4x_2$
1	$\hat{y} = 9 + 3x_1$
2	$\hat{y} = 13 + 3x_1$
3	$\hat{y} = 17 + 3x_1$

The only difference in the three equations is the intercept. (See Figure 18.6.) The coefficient of x_1 remains the same, which means that the effect of x_1 on y remains the same no matter what the value of x_2 . (We could also have shown that the effect of x_2 on y remains the same no matter what the value of x_1 .) As you can see from Figure 18.6, the first-order model with no interaction produces parallel straight lines.

FIGURE 18.6 First-Order Model with Two Independent Variables: No Interaction



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A statistics practitioner who thinks that the effect of one predictor variable on y is influenced by the other predictor variable can use the model described next.

18-1f First-Order Model with Two Predictor Variables and Interaction

Interaction means that the effect of x_1 on y is influenced by the value of x_2 . (It also means that the effect of x_2 on y is influenced by x_1 .)

First-Order Model with Interaction

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_1 x_2 + \varepsilon$$

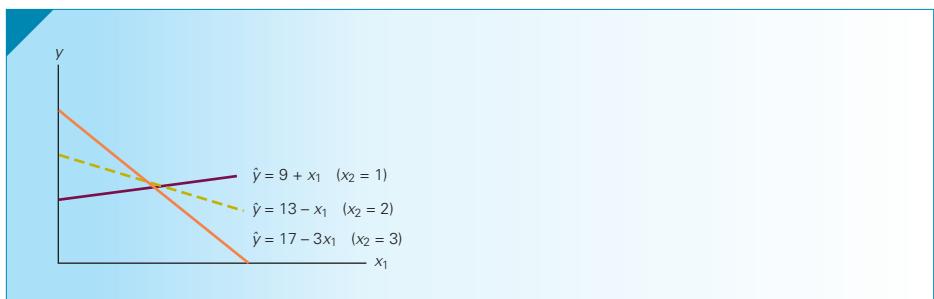
Suppose that the sample regression line is

$$\hat{y} = 5 + 3x_1 + 4x_2 - 2x_1 x_2$$

If we examine the relationship between y and x_1 for $x_2 = 1, 2$, and 3 , we produce the following table of equations:

x_2	$\hat{y} = 5 + 3x_1 + 4x_2 - 2x_1 x_2$
1	$\hat{y} = 9 + x_1$
2	$\hat{y} = 13 - x_1$
3	$\hat{y} = 17 - 3x_1$

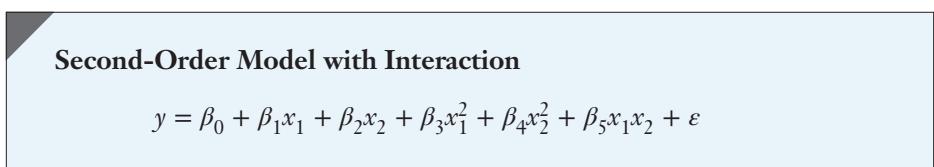
As you can see, not only is the intercept different but also the coefficient of x_1 varies. Obviously, the effect of x_1 on y is influenced by the value of x_2 . Figure 18.7 depicts these equations. The straight lines are clearly not parallel.

FIGURE 18.7 First-Order Model with Interaction

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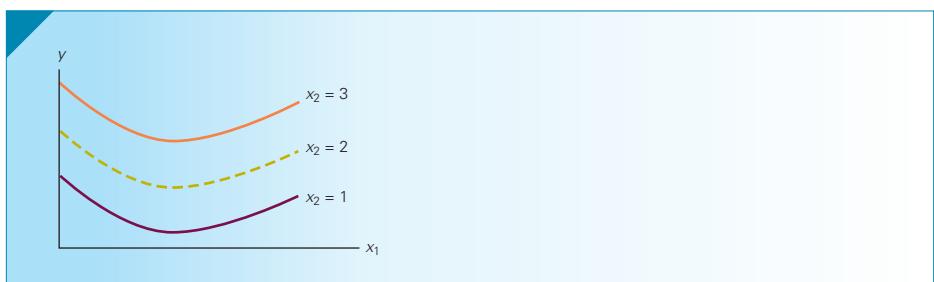
18-1g Second-Order Model with Interaction

A statistics practitioner who believes that a **quadratic relationship** exists between y and each of x_1 and x_2 and that the predictor variables interact in their effect on y can use the following **second-order** model.

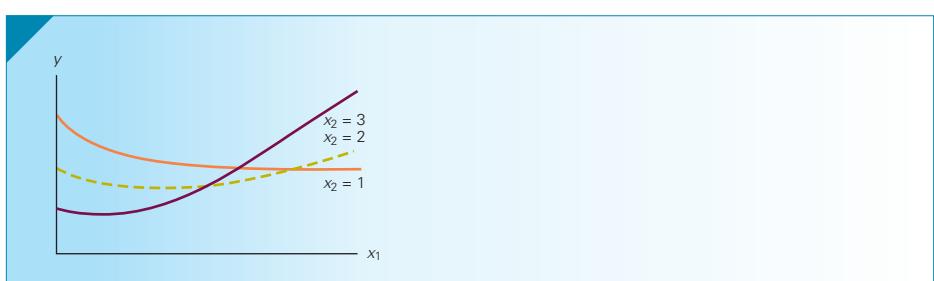


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Figures 18.8 and 18.9, respectively, depict this model without and with the interaction term.

FIGURE 18.8 Second-Order Model without Interaction

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FIGURE 18.9 Second-Order Model with Interaction

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Now that we've introduced several different models, how do we know which model to use? The answer is that we employ a model based on our knowledge of the variables involved and then test that model using the statistical techniques presented in this and the preceding chapters.

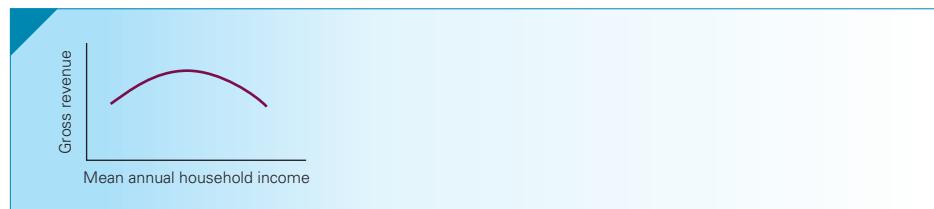
EXAMPLE 18.1**Selecting Sites for a Fast-Food Restaurant, Part 1**

In trying to find new locations for their restaurants, fast-food restaurant chains like McDonald's and Wendy's usually consider a number of factors. Suppose that an analyst working for a fast-food restaurant chain has been asked to construct a regression model that will help identify new locations that are likely to be profitable. The analyst knows that this type of restaurant has, as its primary market, middle-income adults and their children, particularly those between the ages of 5 and 12. Which model should the analyst propose?

SOLUTION:

The dependent variable is gross revenue or net profit. The predictor variables will be mean annual household income and the mean age of children in the restaurant's neighborhood. The relationship between the dependent variable and each predictor variable is probably quadratic. In other words, members of relatively poor or relatively affluent households are less likely to eat at this chain's restaurants because the restaurants attract mostly middle-income customers. Figure 18.10 depicts the hypothesized relationship.

FIGURE 18.10 Relationship between Annual Gross Revenue and Mean Household Income



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A similar relationship can be proposed for revenue and age. Neighborhoods where the mean age of children is either quite low or quite high will probably produce lower revenues than in similar areas where the mean age lies in the middle of the 5-to-12 range.

The question of whether to include the interaction term is more difficult to answer. When in doubt, it is probably best to include it. Thus, the model to be tested is

$$y = \beta_0 + \beta_1 x_1 + \beta_2 x_2 + \beta_3 x_1^2 + \beta_4 x_2^2 + \beta_5 x_1 x_2 + \varepsilon$$

where

y = Annual gross sales

x_1 = Mean annual household income in the neighborhood

x_2 = Mean age of children in the neighborhood

EXAMPLE 18.2**DATA**

Xm18-02

Selecting Sites for a Fast-Food Restaurant, Part 2

To determine whether the second-order model with interaction is appropriate, the analyst in Example 18.1 selected 25 areas at random. Each area consists of approximately 5,000 households, as well as one of her employer's restaurants and three competing fast-food restaurants. The previous year's annual gross sales, the mean annual household income, and the mean age of children (the latter two figures are available from the latest

census) were recorded; some of these data are listed here (the file also contains x_1^2 , x_2^2 , and x_1x_2). What conclusions can be drawn from these data?

Area	Annual Gross Revenue (\$ Thousands) y	Mean Annual Household (\$ Thousands) x_1	Mean Age of Children x_2
1	\$1,128	\$23.5	10.5
2	1,005	17.6	7.2
3	1,212	26.3	7.6
:	:	:	:
25	950	17.8	6.1

SOLUTION:

Both Excel and Minitab were employed to produce the regression analysis shown here.

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.9521				
5	R Square	0.9065				
6	Adjusted R Square	0.8819				
7	Standard Error	44.70				
8	Observations	25				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	5	368,140	73,628	36.86	3.86E-09
13	Residual	19	37,956	1,998		
14	Total	24	406,096			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	-1134.0	320.0	-3.54	0.0022	
18	Income	173.20	28.20	6.14	6.66E-06	
19	Age	23.55	32.23	0.73	0.4739	
20	Income sq	-3.726	0.542	-6.87	1.48E-06	
21	Age sq	-3.869	1.179	-3.28	0.0039	
22	(Income)(Age)	1.967	0.944	2.08	0.0509	

MINITAB

Regression Analysis: Revenue Versus Income, Age, Inc-sq, Age-sq, Inc-Age						
The regression equation is						
Revenue = - 1134 + 173 Income + 23.5 Age - 3.73 Inc-sq - 3.87 Age-sq + 1.97 Inc-Age						
Predictor	Coef	SE Coef	T	P		
Constant	-1134.0	320.0	-3.54	0.002		
Income	173.20	28.20	6.14	0.000		
Age	23.55	32.23	0.73	0.474		
Inc-sq	-3.7261	0.5422	-6.87	0.000		
Age-sq	-3.869	1.179	-3.28	0.004		
Inc-Age	1.9673	0.9441	2.08	0.051		
S = 44.70 R-Sq = 90.7% R-Sq(adj) = 88.2%						
Analysis of Variance						
Source	DF	SS	MS	F	P	
Regression	5	368,140	73,628	36.86	0.000	
Residual Error	19	37,956	1,998			
Total	24	406,096				

INTERPRET

From the computer output, we determine that the value of the coefficient of determination (R^2) is 90.65%, which tells us that the model fits the data quite well. The value of the F -statistic is 36.86, which has a p -value of approximately 0. This confirms that the model is valid.

Care must be taken when interpreting the t -tests of the coefficients in this type of model. Not surprisingly, each variable will be correlated with its square, and the interaction variable will be correlated with both of its components. As a consequence, multicollinearity distorts the t -tests of the coefficients in some cases, making it appear that some of the components should be eliminated from the model. In fact, in Example 18.2, Minitab warns (not shown) the analyst that multicollinearity is a problem. However, in most such applications, the objective is to forecast the dependent variable and multicollinearity does not affect the model's fit or forecasting capability.



EXERCISES

- 18.1** Graph y versus x_1 for $x_2 = 1, 2$, and 3 for each of the following equations.
- $y = 1 + 2x_1 + 4x_2$
 - $y = 1 + 2x_1 + 4x_2 - x_1x_2$
- 18.2** Graph y versus x_1 for $x_2 = 2, 4$, and 5 for each of the following equations.
- $y = 0.5 + 1x_1 - 0.7x_2 - 1.2x_1^2 + 1.5x_2^2$
 - $y = 0.5 + 1x_1 - 0.7x_2 - 1.2x_1^2 + 1.5x_2^2 + 2x_1x_2$

The following exercises require the use of a computer and software. Exercise 18.3–18.5 can be solved manually. See Appendix A.

- 18.3** **Xr18-03** The general manager of a supermarket chain believes that sales of a product are influenced

by the amount of space the product is allotted on shelves. If true, this would have great significance, because the more profitable items could be given more shelf space. The manager realizes that sales volume would likely increase with more space only up to a certain point. Beyond that point, sales would likely flatten and perhaps decrease (because customers are often dismayed by very large displays). To test his belief, the manager records the number of boxes of detergent sold during 1 week in 25 stores in the chain. For each store, he records the shelf space (in inches) allotted to the detergent.

- Write the equation that represents the model.
- Discuss how well the model fits.

APPLICATIONS in ECONOMICS

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Demand Curve

The law of supply and demand states that other things being equal, the higher the price of a product or service, the lower is the quantity demanded. The relationship between quantity and price is called a *demand curve*. Generally, such a curve is modeled by a quadratic equation. To estimate the demand curve, we measure the demand at several different prices and then employ regression analysis to calculate the coefficients of the model.

- 18.4** **Xr18-04** A fast-food restaurant chain whose menu features hamburgers and chicken sandwiches is about to add a fish sandwich to its menu. There was considerable debate among the executives about the likely demand and what the

(Continued)

appropriate price should be. A recently hired economics graduate observed that the demand curve would reveal a great deal about the relationship between price and demand. She convinced the executives to conduct an experiment. A random sample of 20 restaurants was drawn. The restaurants were almost identical in terms of sales and in the demographics of the surrounding area. At each restaurant, the fish sandwich was sold at a different price. The number of sandwiches sold over a 7-day period and the price were recorded. A first-order model and a second-order model were proposed.

- Write the equation for each model.
- Use regression analysis to estimate the coefficients and other statistics for each model.
- Which model seems to fit better? Explain.
- Use the better model to calculate the point prediction for weekly sales when the price is \$2.95.

APPLICATIONS in OPERATIONS MANAGEMENT

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Learning Curve

A well-established phenomenon in operations management is the *learning curve*, which describes how quickly new workers learn to do their jobs.

A number of mathematical models are used to describe the relationship between time on the job and productivity. Regression analysis allows the operations manager to select the appropriate model and use it to predict when workers achieve their highest level of productivity.

- 18.5 Xr18-05** A person starting a new job always takes a certain amount of time to adjust fully. In repetitive-task situations, such as on an assembly line, significant productivity gains can occur within a few days. In an experiment to study this phenomenon, the average amount of time required for a new employee to install electronic components in a computer was measured for her first 10 days. These data are shown here.

Day	1	2	3	4	5	6	7	8	9	10
Mean times										
(minutes)	40	41	36	38	33	32	30	32	29	30

A first-order model and a second-order model were proposed.

- Write the equation for each model.
- Analyze both models. Determine whether they are valid.
- Which model fits better? Explain.

- 18.6 Xr17-14*** Refer to Exercise 17.14. The dean of the school of business wanted to improve the regression model, which was developed to describe the relationship between MBA program GPA and

undergraduate GPA, GMAT score, and years of work experience. The dean now believes that an interaction effect may exist between undergraduate GPA and the GMAT test score.

- a. Write the equation that describes the model.
- b. Use a computer to generate the regression statistics. Use whatever statistics you deem necessary to assess the model's fit. Is this model valid?
- c. Compare your results with those achieved in the original example.
- 18.7 *Xr18-07*** The manager of the food concession at a major league baseball stadium wanted to be able to predict the attendance of a game 24 hours in advance to prepare the correct amount of food for sale. He believed that the two most important factors were the home team's winning percentage and the visiting team's winning percentage. In order to examine his beliefs, he collected the attendance figures, the home team's winning percentage, and the visiting team's winning percentage for 40 randomly selected games from all the teams in the league.
- a. Conduct a regression analysis using a first-order model with interaction.
- b. Do these results indicate that your model is valid? Explain.
- 18.8 *Xr18-08*** The manager of a large hotel on the Riviera in southern France wanted to forecast the monthly vacancy rate (as a percentage) during the peak season. After considering a long list of potential variables, she identified two variables that she believed were most closely related to the vacancy rate: the average daily temperature and the value of the currency in American dollars. She collected data for 25 months.
- a. Perform a regression analysis using a first-order model with interaction.
- b. Perform a regression analysis using a second-order model with interaction.
- c. Which model fits better? Explain.
- 18.9 *Xr18-09*** The coach and the general manager of a team in the National Hockey League are trying to decide what kinds of players to draft. To help in making their decision, they need to know which variables are most closely related to the goals differential—the difference between the number of goals their team scores and the number of goals scored by their team's opponents. (A positive differential means that their team wins, and a negative differential is a loss.) After some consideration, they decide that there are two important variables: the percentage of face-offs won and the penalty-minutes differential. The latter variable is the difference between the number of penalty minutes assessed against their team and the number of penalty minutes assessed against their team's opponents. The data from 100 games were recorded.
- a. Perform a regression analysis using a first-order model with interaction.
- b. Is this model valid?
- c. Should the interaction term be included?
- 18.10 *Xr18-10*** The production manager of a chemical plant wants to determine the roles that temperature and pressure play in the yield of a particular chemical produced at the plant. From past experience, she believes that when pressure is held constant, lower and higher temperatures tend to reduce the yield. When temperature is held constant, higher and lower pressures tend to increase the yield. She does not have any idea about how the yield is affected by various combinations of pressure and temperature. She observes 80 batches of the chemical in which the pressure and temperature were allowed to vary.
- a. Which model should be used? Explain.
- b. Conduct a regression analysis using the model you specified in part (a).
- c. Assess how well the model fits the data.

18-2 NOMINAL INDEPENDENT VARIABLES

When we introduced regression analysis, we pointed out that all the variables must be interval. But in many real-life cases, one or more independent variables are nominal. For example, suppose that the used-car dealer in Example 16.2 believed that the color of a car is a factor in determining its auction price. Color is clearly a nominal variable. If we assign numbers to each possible color, these numbers will be completely arbitrary, and using them in a regression model will usually be pointless. For example, suppose the dealer believes the colors that are most popular, white and silver, are likely to lead to different prices than other colors. Accordingly, he assigns a code of 1 to white cars, a code of 2 to silver cars, and a code of 3 to all other colors. If we now conduct a multiple regression analysis using

odometer reading and color as independent variables, the following results would be obtained. (File Xm16-02* contains these data. Interested readers can produce the following regression equation.)

$$\hat{y} = 17.342 - .0671x_1 - .0434x_2$$

Aside from the inclusion of the variable x_2 , this equation is very similar to the one we produced in the simple regression model ($\hat{y} = 17.250 - .0669x$). The t -test of color (t -statistic = -1.11 , and p -value = $.2694$) indicates that there is not enough evidence to infer that color is not linearly related to price. There are two possible explanations for this result. First, there is no relationship between color and price. Second, color is a factor in determining the car's price, but the way in which the dealer assigned the codes to the colors made detection of that fact impossible—that is, the dealer treated the nominal variable, color, as an interval variable. To further understand why we cannot use nominal data in regression analysis, try to interpret the coefficient of color. Such an effort is similar to attempting to interpret the mean of a sample of nominal data. It is futile. Even though this effort failed, it is possible to include nominal variables in the regression model. This is accomplished through the use of *indicator variables*.

An **indicator variable** (also called a **dummy variable**) is a variable that can assume either one of only two values (usually 0 and 1), where 1 represents the existence of a certain condition and 0 indicates that the condition does not hold. In this illustration, we would create two indicator variables to represent the color of the car:

$$I_1 = \begin{cases} 1 & (\text{if color is white}) \\ 0 & (\text{if color is not white}) \end{cases}$$

and

$$I_2 = \begin{cases} 1 & (\text{if color is silver}) \\ 0 & (\text{if color is not silver}) \end{cases}$$

Notice that we need only two indicator variables to represent the three categories. A white car is represented by $I_1 = 1$ and $I_2 = 0$. A silver car is represented by $I_1 = 0$ and $I_2 = 1$. Because cars that are painted some other color are neither white nor silver, they are represented by $I_1 = 0$ and $I_2 = 0$. It should be apparent that we cannot have $I_1 = 1$ and $I_2 = 1$, as long as we assume that no Toyota Camry is two-toned.

The effect of using these two indicator variables is to create three equations, one for each of the three colors. As you're about to discover, we can use the equations to determine how the car's color relates to its auction selling price.

In general, to represent a nominal variable with m categories, we must create $m - 1$ indicator variables. The last category represented by $I_1 = I_2 = \dots = I_{m-1} = 0$ is called the **omitted category**.

18-2a Interpreting and Testing the Coefficients of Indicator Variables

In file Xm16-02a, we stored the values of I_1 and I_2 . We then performed a multiple regression analysis using the variables odometer reading (x), I_1 , and I_2 .

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.8371				
5	R Square	0.7008				
6	Adjusted R Square	0.6914				
7	Standard Error	0.3043				
8	Observations	100				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	3	20.81	6.94	74.95	4.65E-25
13	Residual	96	8.89	0.0926		
14	Total	99	29.70			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	16.837	0.197	85.42	2.28E-92	
18	Odometer	-0.0591	0.0051	-11.67	4.04E-20	
19	I-1	0.0911	0.0729	1.25	0.2143	
20	I-2	0.3304	0.0816	4.05	0.0001	

MINITAB**Regression Analysis: Price Versus Odometer, I-1, I-2**

The regression equation is
 Price = 16.8 - 0.0591 Odometer + 0.0911 I-1 + 0.330 I-2

Predictor	Coef	SE Coef	T	P
Constant	16.8372	0.1971	85.42	0.000
Odometer	-0.059123	0.005065	-11.67	0.000
I-1	0.09113	0.07289	1.25	0.214
I-2	0.33037	0.08165	4.05	0.000

S = 0.304258 R-Sq = 70.1% R-Sq(adj) = 69.1%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	3	20.8149	6.9383	74.95	0.000
Residual Error	96	8.8870	0.0926		
Total	99	29.7019			

INTERPRET

The regression equation is

$$\hat{y} = 16.837 - .0591x + .0911I_1 + .3304I_2$$

The intercept and the coefficient of odometer reading are interpreted in the usual manner. The intercept ($b_0 = 16.837$) is meaningless in the context of this problem. The coefficient of the odometer reading ($b_1 = -.0591$) tells us that for each additional mile on the odometer, the auction price decreases an average of 5.91 cents, holding the color constant. Now examine the remaining two coefficients:

$$b_2 = .0911$$

$$b_3 = .3304$$

Recall that we interpret the coefficients in a multiple regression model by holding the other variables constant. In this example, we interpret the coefficient of I_1 as follows. In this sample, a white Camry sells for .0911 thousand or \$91.10 on average more than other colors (nonwhite, nonsilver) with the same odometer reading. A silver car sells for \$330.40 on average more than other colors with the same odometer reading. The reason both comparisons are made with other colors is that such cars are represented by $I_1 = I_2 = 0$. Thus, for a nonwhite and nonsilver car, the equation becomes

$$\hat{y} = 16.837 - .0591x + .0911(0) + .3304(0)$$

which is

$$\hat{y} = 16.837 - .0591x$$

For a white car ($I_1 = 1$ and $I_2 = 0$), the regression equation is

$$\hat{y} = 16.837 - .0591x + .0911(1) + .3304(0)$$

which is

$$\hat{y} = 16.928 - .0591x$$

Finally, for a silver car ($I_1 = 0$ and $I_2 = 1$), the regression equation is

$$\hat{y} = 16.837 - .0591x + .0911(0) + .3304(1)$$

which simplifies to

$$\hat{y} = 17.167 - .0591x$$

Figure 18.11 depicts the graph of price versus odometer reading for the three different color categories. Notice that the three lines are parallel (with slope = $-.0591$) while the intercepts differ.

FIGURE 18.11 Price Versus Odometer Reading for Three Colors



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We can also perform t -tests on the coefficients of I_1 and I_2 . However, because the variables I_1 and I_2 represent different groups (the three color categories), these t -tests allow us to draw inferences about the differences in auction selling prices between the groups for the entire population of similar 3-year-old Toyota Camrys.

The test of the coefficient of I_1 , which is β_2 , is conducted as follows:

$$H_0: \beta_2 = 0$$

$$H_1: \beta_2 \neq 0$$

Test statistic: $t = 1.25$, p -value = .2143

There is insufficient evidence to infer that white Camrys have a different mean selling price than do Camrys in the omitted category in the population of 3-year-old Camrys with the same odometer reading.

To determine whether silver-colored Camrys sell for a different price than Camrys in the other color category, we test

$$\begin{aligned} H_0: \quad & \beta_3 = 0 \\ H_1: \quad & \beta_3 \neq 0 \end{aligned}$$

Test statistic: $t = 4.05$, $p\text{-value} = .0001$

We can conclude that there are differences in the mean auction selling prices between all 3-year-old, silver-colored Camrys and the omitted color category with the same odometer readings.

General Social Survey: Variables that Affect Income II

To include the nominal variables gender and race in a multiple regression model, we need to create two sets of indicator variables. The first is to represent gender.

For gender let:

$$I_1 = \begin{cases} 1 & \text{if male} \\ 0 & \text{if female} \end{cases}$$

For race let:

$$I_2 = \begin{cases} 1 & \text{if white} \\ 0 & \text{otherwise} \end{cases}$$

$$I_3 = \begin{cases} 1 & \text{if black} \\ 0 & \text{otherwise} \end{cases}$$



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EXCEL

A	B	C	D	E	F
1 SUMMARY OUTPUT					
2					
<i>Regression Statistics</i>					
4 Multiple R	0.6171				
5 R Square	0.3808				
6 Adjusted R Square	0.3640				
7 Standard Error	31,148				
8 Observations	342				
9					
10 ANOVA					
11	df	SS	MS	F	Significance F
12 Regression	9	198,118,009,661	22,013,112,185	22.69	5.17E-30
13 Residual	332	322,113,094,323	970,220,164		
14 Total	341	520,231,103,984			
15					
16	Coefficients	Standard Error	t Stat	P-value	
17 Intercept	-77203	15417	-5.01	8.97E-07	
18 I-1	18794	3704	5.07	6.52E-07	
19 I-2	-9286	5920	-1.57	0.1177	
20 I-3	-15534	7827	-1.98	0.0480	
21 AGE	378	150	2.52	0.0121	
22 EDUC	5620	562	10.00	9.49E-21	
23 HRS1	665	132	5.06	6.99E-07	
24 SPHRS1	-66	135	-0.49	0.6248	
25 CHILDS	-1107	1398	-0.79	0.4289	
26 EARNRS	2920	2420	1.21	0.2285	

MINITAB**Regression Analysis: INCOME versus AGE, SEX, . . .**

The regression equation is

$$\text{INCOME} = -77203 + 378 \text{ AGE} + 18794 \text{ SEX} - 9286 \text{ RACECAT1} - 15534 \text{ RACECAT2} \\ + 5620 \text{ EDUC} + 665 \text{ HRS1} - 66 \text{ SPHRS1} - 1107 \text{ CHILDS} + 2920 \text{ EARNRS}$$

Predictor	Coef	SE Coef	T	P
Constant	-77203	15417	-5.01	0.000
AGE	378.3	149.9	2.52	0.012
SEX	18794	3704	5.07	0.000
RACECAT1	-9286	5920	-1.57	0.118
RACECAT2	-15534	7827	-1.98	0.048
EDUC	5620.4	562.1	10.00	0.000
HRS1	665.4	131.5	5.06	0.000
SPHRS1	-66.1	135.0	-0.49	0.625
CHILDS	-1107	1398	-0.79	0.429
EARNRS	2920	2420	1.21	0.228

$$S = 31148.4 \quad R-\text{Sq} = 38.1\% \quad R-\text{Sq}(\text{adj}) = 36.4\%$$

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	9	1.98118E+11	22013112185	22.69	0.000
Residual Error	332	3.22113E+11	970220164		
Total	341	5.20231E+11			

INTERPRET

The model has improved somewhat; the coefficient of determination has increased from .3248 to .3808 and the standard error decreased from 32,282 to 31,148.

The coefficient of variable I_1 is 18,794, which tells us that in this sample men earn an average \$18,794 more than women when the comparison is made holding the other independent variables constant. Here is how we interpret this number. Assume that this is the population coefficient (and not the sample coefficient). Imagine populations of men and women who are identical in terms of the other independent variables (race, age, education, hours of work, spouse's hours of work, number of children, and number of family earners). And now when we compare incomes, the men earn on average \$18,794 more than the women.

The t -test of the coefficient is $t = 5.07$ and with a p -value of 0. We conclude that there is enough evidence that, in the United States in 2012, average incomes of men and women were different when the other variables were held constant.

The coefficient of I_2 is -9286. This number means that in this sample white people earn an average of \$9286 less than the other category, which is nonwhite and nonblack holding the other variables constant. However, the t -statistic is -1.57 and its p -value is .1177. There is not enough evidence to infer that the mean income of the population of white people is different from the mean income of the population of nonwhite, nonblack people.

The coefficient of I_3 is -15,534. In this sample black people earn an average of \$15,534 less than the other category holding the other variables constant. The t -test value is -1.98 and its p -value is .0480. There is enough evidence to conclude that, in 2012, the mean income of black people was different from the mean income of nonwhite, nonblack people.



EXERCISES

- 18.11** How many indicator variables must be created to represent a nominal independent variable that has five categories?
- 18.12** Create and identify indicator variables to represent the following nominal variables.
- Religious affiliation (Catholic, Protestant, and others)
 - Working shift (8 A.M. to 4 P.M., 4 P.M. to 12 midnight, and 12 midnight to 8 A.M.)
 - Supervisor (Jack Jones, Mary Brown, George Fosse, and Elaine Smith)
- 18.13** In a study of computer applications, a survey asked which microcomputer a number of companies used. The following indicator variables were created.

$$I_1 = \begin{cases} 1 & (\text{if IBM}) \\ 0 & (\text{if not}) \end{cases} \quad I_2 = \begin{cases} 1 & (\text{if Macintosh}) \\ 0 & (\text{if not}) \end{cases}$$

Which computer is being referred to by each of the following pairs of values?

- $I_1 = 0; I_2 = 1$
- $I_1 = 1; I_2 = 0$
- $I_1 = 0; I_2 = 0$

The following exercises require the use of a computer and software. Exercises 18.16 and 18.17 can be solved manually. See Appendix A.

- 18.14** **Xr17-14*** Refer to Exercise 17.14. After considering the results of the initial study, the dean realized that she may have omitted an important variable—the type of undergraduate degree. She returned to her sample of students and recorded the type of undergraduate degree using the following codes:

- 1 = BA
- 2 = BBA (including similar business or management degrees)
- 3 = BEng or BSc
- 4 = Other (including no undergraduate degree)

These data were included with the data from the original example. Can the dean conclude that the undergraduate degree is a factor in determining how well a student performs in the MBA program?

- 18.15** **Xr17-14*** Refer to Exercise 17.14.
- Predict with 95% confidence the MBA program GPA of a BEng whose undergraduate GPA was 9.0, whose GMAT score as 700, and who has had 10 years of work experience.
 - Repeat part (a) for a BA student.

- 18.16** **Xr17-10*** Refer to Exercise 17.10, where a multiple regression analysis was performed to predict men's longevity based on the parents' and grandparents' longevity. In addition to these data, suppose that the actuary also recorded whether the man was a smoker (1 = yes and 0 = no).
- Use regression analysis to produce the statistics for this model.
 - Compare the equation you just produced to that produced in Exercise 18.10. Describe the differences.
 - Are smoking and length of life related? Explain.

- 18.17** **Xr18-17** The manager of an amusement park would like to be able to predict daily attendance in order to develop more accurate plans about how much food to order and how many ride operators to hire. After some consideration, he decided that the following three factors are critical:

Yesterday's attendance
Weekday or weekend
Predicted weather

He then took a random sample of 40 days. For each day, he recorded the attendance, the previous day's attendance, day of the week, and weather forecast. The first independent variable is interval, but the other two are nominal. Accordingly, he created the following sets of indicator variables:

$$I_1 = \begin{cases} 1 & (\text{if weekend}) \\ 0 & (\text{if not}) \end{cases}$$

$$I_2 = \begin{cases} 1 & (\text{if mostly sunny is predicted}) \\ 0 & (\text{if not}) \end{cases}$$

$$I_3 = \begin{cases} 1 & (\text{if rain is predicted}) \\ 0 & (\text{if not}) \end{cases}$$

- Conduct a regression analysis.
- Is this model valid? Explain.
- Can we conclude that weather is a factor in determining attendance?
- Do these results provide sufficient evidence that weekend attendance is, on average, larger than weekday attendance?

- 18.18** **Xr16-06*** Recall Exercise 16.6 where a statistics practitioner analyzed the relationship between the length of a commercial and viewers' memory of the commercial's product. However, in the experiment not only was the length varied but also the type of commercial. There were three types: humorous (1), musical (2), and serious (3). The memory test scores,

lengths, and type of commercial (using the codes in parentheses) were recorded.

- a. Perform a regression analysis using the codes provided in the data file.
- b. Can we infer that the memory test score is related to the type of commercial? Test with $\alpha = .05$.
- c. Create indicator variables to describe the type of commercial and perform another regression analysis.
- d. Repeat part (b) using the second model.
- e. Discuss the reasons for the differences between parts (b) and (d).

- 18.19 *Xr17-12**** Refer to Exercise 17.12 where the amount of time to unload a truck was analyzed. The manager realized that another variable, the time of day, may affect unloading time. He recorded the following codes: 1 = morning, 2 = early afternoon, and 3 = late afternoon.
- a. Run a regression using the codes for time of day.
 - b. Create indicator variables to represent time of day. Perform a regression analysis with these new variables.
 - c. Which model fits better? Explain.
 - d. Is time of day related to time to unload?

- 18.20 *XR18-20*** Profitable banks are ones that make good decisions on loan applications. *Credit scoring* is the statistical technique that helps banks make that decision. However, many branches overturn credit scoring recommendations, whereas other banks do not use the technique. In an attempt to determine the factors that affect loan decisions, a statistics practitioner surveyed 100 banks and recorded the percentage of bad loans (any loan that is not completely repaid), the average size of the loan, and whether a scorecard is used, and if so, whether scorecard recommendations are overturned more than 10% of the time. These results are stored in columns 1 (percentage good loans), 2 (average loan), and 3 (code 1 = no scorecard, 2 = scorecard overturned more than 10% of

the time, and 3 = scorecard overturned less than 10% of the time).

- a. Create indicator variables to represent the codes.
- b. Perform a regression analysis.
- c. How well does the model fit the data?
- d. Is multicollinearity a problem?
- e. Interpret and test the coefficients. What does this tell you?
- f. Predict with 95% confidence the percentage of bad loans for a bank whose average loan is \$10,000 and that does not use a scorecard.

- 18.21 *Xr18-21*** Refer to Exercise 16.100, where a simple linear regression model was used to analyze the relationship between welding machine breakdowns and the age of the machine. The analysis proved to be so useful to company management that it decided to expand the model to include other machines. Data were gathered for two other machines. These data as well as the original data were recorded in the following way:

Column 1: Cost of repairs
 Column 2: Age of machine
 Column 3: Machine (1 = welding machine; 2 = lathe; 3 = stamping machine)

- a. Develop a multiple regression model.
- b. Interpret the coefficients.
- c. Can we conclude that welding machines cost less to repair than other machines?

- 18.22 *Xr16-127**** Refer to Exercise 16.127. The gender of the student was recorded where 1 = male and 0 = female.

- a. Does the inclusion of gender improve the model?
- b. Predict with 95% confidence the height of a female whose index finger is 6.5 cm long.
- c. Predict with 95% confidence the height of a male whose index finger is 6.5 cm long.
- d. Is this model likely to be useful? Explain.

APPLICATIONS in HUMAN RESOURCES MANAGEMENT



Performance Measurement

Most aspects of workers' performance fall into the domain of the human resources or personnel department. An important performance measurement is the attendance record of each worker. Personnel managers need to know what factors are likely to influence a worker to be absent more frequently than the norm. This can enable the manager to determine whether

someone should be hired in the first place. Once hired, the manager needs to be able to influence workers' attitudes and performance.

18.23 *Xr18-23* Absenteeism is a serious employment problem in most countries. It is estimated that absenteeism reduces potential output by more than 10%. Two economists launched a research project to learn more about the problem. They randomly selected 100 organizations to participate in a 1-year study. For each organization, they recorded the average number of days absent per employee and several variables thought to affect absenteeism. The following data were recorded:

- Column 1: Average number of days absent per employee
- Column 2: Average employee wage
- Column 3: Percentage of part-time employees
- Column 4: Percentage of unionized employees
- Column 5: Availability of shiftwork (1 = yes; 0 = no)
- Column 6: Union-management relationship (1 = good; 0 = not good)

- a. Conduct a regression analysis.
- b. Can we infer at the 5% significance level that the availability of shiftwork is related to absenteeism?
- c. Is there enough evidence at the 5% significance level to infer that in organizations where the union-management relationship is good, absenteeism is lower?

(The authors are grateful to James Fong and Diana Mansour for developing this exercise. The data are based on M. Chadhury and I. Ng, "Absenteeism Predictors," *Canadian Journal of Economics*, August 1992.)



GENERAL SOCIAL SURVEY EXERCISES

- 18.24 *GSS2012**** a. Conduct a regression analysis with income (INCOME) as the dependent variable and age (AGE), education (EDUC), number of hours of work (HRS1), and whether someone worked for him or herself (WRKSLF: 1 = Self, 2 = Someone else) as independent variables.
- b. Interpret the coefficient of WRKSLF.
- c. Is there sufficient evidence to infer that people who work for themselves earn smaller incomes after removing the effect of age, education, and weekly hours of work?
- 18.25 *GSS2012**** Develop a multiple regression model with the position on the question, should the government reduce income differences (EQWLTH: 1 = Government should reduce income differences; 2, 3, 4, 5, 6, 7 = No government action) as the dependent variable and age (AGE), education (EDUC), income (INCOME), weekly hours of work (HRS1), and party (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican) as independent variables.
- 18.26 *GSS2012**** Repeat Exercise 18.25 using political views (POLVIEWS3: 1 = Liberal, 2 = Moderate, 3 = Conservative) instead of political party.
- a. Is there sufficient evidence to infer that liberals are more likely than moderates to believe that government should reduce income differences after removing the effects of age, income, education, and weekly hours?

- b. Is there sufficient evidence to infer that conservatives are more likely than moderates to believe that government should take no action to reduce income differences after removing the effects of age, income, education, and weekly hours?
- 18.27 GSS2012*** Can we infer that men and women (SEX: 1 = Male, 2 = Female) differ in the amount of television per day (TVHOURS) after removing the effects of age (AGE) and education (EDUC)?
- 18.28 GSS2012*** Conduct a regression analysis with position on the question, should the government help poor people? Use (HELPPOOR: 1 = Government action; 2, 3, 4, 5 = People should help themselves) as the dependent variable and age (AGE), education (EDUC), income (INCOME), weekly work hours (HRS1), and political views (POLVIEWS3: 1 = Liberal, 2 = Moderate, 3 = Conservative) as independent variables
- a. Is there sufficient evidence to infer that liberals are more likely than moderates to believe that government should help poor people after removing the effects of age, income, education, and weekly hours?
 - b. Is there sufficient evidence to infer that conservatives are more likely than moderates to believe that people should help themselves after removing the effects of age, income, education, and weekly hours?
- 18.29 GSS2012*** Can we infer that there are differences in income (INCOME) between people who work for the government and people who work for private employers (WRKGVT: 1 = Government, 2 = Private) after removing the effects of age (AGE), education (EDUC), and weekly work hours (HRS1)?
- 18.30 GSS2012*** Conduct a regression analysis with education (EDUC), and weekly hours of work (HRS1)?
- 18.31 GSS2012*** Conduct a regression analysis with number of hours of television per day (TVHOURS) to determine whether there is enough evidence to infer that there are differences between the three race categories (RACE: 1 = White, 2 = Black, 3 = Other) after removing the effects of age (AGE) and education (EDUC).
- 18.32 GSS2012*** Conduct a regression analysis with position on the question, should the government help poor people (HELPPOOR: 1 = Government action; 2, 3, 4, 5 = People should help themselves) as the dependent variable and age (AGE), income (INCOME), education (EDUC), weekly work hours (HRS1), and party (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican) as independent variables.
- a. Is there sufficient evidence to infer that Democrats are more likely than Independents to believe that government should help poor people after removing the effects of age, income, education, and weekly hours?
 - b. Is there sufficient evidence to infer that Republicans are more likely than Independents to believe that people should help themselves after removing the effects of age, income, education, and weekly hours?
- 18.32 GSS2012*** Can we infer that there are differences in income (INCOME) between Americans born in the United States and those born elsewhere (BORN: 1 = U.S., 2 = Elsewhere), after removing the effects of age (AGE), education (EDUC), and weekly hours of work (HRS1)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISE

- 18.33 ANES2008*** Refer to Exercise 17.21. Add STRENGTH as an independent variable. Is there sufficient evidence to conclude that people who

call themselves strong (Democrat/Republican) are more likely to vote?

18-3 / (OPTIONAL) APPLICATIONS IN HUMAN RESOURCES MANAGEMENT: PAY EQUITY

In the history of North America, there are many examples of racial, ethnic, and gender discrimination. In the last three decades, there have been a number of endeavors designed to eliminate discriminatory practices and to right past wrongs. One of these efforts is pay equity, a program that attempts to correct discrimination in the way workers are paid. Our goal in this section is to describe the statistical component of the pay equity issue.

There are two forms of pay equity. The first is “equal pay for equal work.” This form is relatively straightforward, arguing that if two individuals do the same job with similar qualifications and experience, they should be paid the same. In many jurisdictions, it is illegal to violate equal pay for equal work. The second form is “equal pay for work of equal value.” This form is controversial for several reasons, including the use of subjectively assigned measures of qualifications and working conditions.

Regression analysis is used extensively in pay-equity cases. However, the methodology used in equal-pay-for-equal-work cases differs from that used for equal-pay-for-work-of-equal-value cases. The following example illustrates how statistical analyses can be utilized for the former.

EXAMPLE 18.3

DATA
Xm18-03

Testing for Pay Equity: Equal Pay for Equal Work

A large firm employing tens of thousands of workers has been accused of discriminating against its female managers. The accusation is based on a random sample of 100 managers. The mean annual salary of the 38 female managers is \$76,189, whereas the mean annual salary of the 62 male managers is \$97,832. A statistical analysis reveals that the *t*-test of the difference between two means yields a *p*-value of less than 1%, which provides overwhelming evidence that male managers are paid more than female managers. In rebuttal, the president of the firm points out that the company has a strict policy of equal pay for equal work and that the difference may be the result of other variables. Accordingly, he found and recorded the number of years of education and the number of years of experience for each of the 100 managers in the sample. Also recorded are the salary and gender (0 = female, 1 = male). The president wanted to know whether a regression analysis would shed some light on the issue.

SOLUTION:

Using salary as the dependent variable, a multiple regression analysis was performed with the results shown here.

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.8326				
5	R Square	0.6932				
6	Adjusted R Square	0.6836				
7	Standard Error	16,274				
8	Observations	100				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	3	57,434,095,083	19,144,698,361	72.29	1.55E-24
13	Residual	96	25,424,794,888	264,841,613		
14	Total	99	82,858,889,971			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	-5835	16083	-0.36	0.7175	
18	Education	2119	1018	2.08	0.0401	
19	Experience	4099	317	12.92	9.89E-23	
20	Gender	1851	3703	0.50	0.6183	

MINITAB**Regression Analysis:**

The regression equation is
 $\text{Salary} = -5835 + 2119 \text{ Education} + 4099 \text{ Experience} + 1851 \text{ Gender}$

Predictor	Coeff	StDev	T	P
Constant	-5835	16083	-0.36	0.718
Education	2119	1018	2.08	0.040
Experience	4099.3	317.2	12.92	0.000
Gender	1851	3703	0.50	0.618

S = 16274 R-Sq = 69.3% R-Sq(adj) = 68.4%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	3	57,434,095.083	19,144,698.361	72.29	0.000
Residual Error	96	25,424,794.888	264,841.613		
Total	99	82,858,889.971			

INTERPRET

The model fits quite well. The coefficient of determination is .6932, which tells the president that 69.32% of the variation in salaries is explained by the model. The *F*-statistic is 72.29, which has a *p*-value of 0. There is overwhelming evidence to allow us to infer that the model is valid.

The *p*-values of the *t*-tests to determine whether there is evidence of a linear relationship between salary and each of education, experience, and gender are .0401, 0, and .6183, respectively. Both the years of education and the years of experience are linearly related to salary. However, the *t*-test of the slope for gender tells us that there is not enough evidence to infer that the mean salaries of all the firm's male and female managers with the same amount of education and experience differ. In other words, on average, the female managers in this firm have less education and experience than their male counterparts, which explains their lower mean salary. Before the regression analysis, we calculated the difference in sample mean salaries to be \$97,832 – \$76,189 = \$21,643. After removing the effects of education and experience in this sample that difference was reduced to \$1,851, which is statistically insignificant.

18-3a Regression Analysis for Equal-Pay-for-Work-of-Equal-Value Cases

Cases involving the issue of equal pay for work of equal value are much more difficult. The issue generally revolves around female-dominated and male-dominated jobs. The former refers to jobs that are generally held by women (e.g., secretaries) and the latter refers to jobs generally held by men (e.g., maintenance workers). Women's groups claim that male-dominated jobs are more highly paid. Here the issue is not underpaying women who are doing exactly the same jobs performed by men. Instead, the issue is that women's jobs are undervalued. Thus, it is necessary to evaluate jobs.

Several jurisdictions have enacted laws requiring pay equity for work of equal value. One such jurisdiction is the province of Manitoba. The Manitoba Pay Equity Act is mandatory in

the province's civil service, crown corporations, hospitals, and universities. The act defines gender-dominated job classes as ones with at least 10 workers where at least 70% are of the same gender. The act requires that all such jobs be evaluated to determine whether female-dominated jobs are undervalued and underpaid compared to male-dominated jobs.

Although regression analysis is employed, there are major differences between the technique described in Example 18.3 and the one used in this case. Rather than estimate a regression model that explains how several related variables affect pay, we need to develop a job evaluation system. The system is used to assign a score to each job, which is then used as an independent variable in regression where pay is again the dependent variable. The regression analysis can be conducted in several ways. The simple linear regression equation can be estimated using the male-dominated jobs only. The coefficients are then used to calculate the "correct" female-dominated job pay rates. The difference between the so-called correct and actual pay rates represents the degree of underpayment. Alternatively, a regression analysis with both male- and female-dominated jobs can be employed. An indicator variable representing gender is included. The value of the indicator variable's coefficient represents the difference between male- and female-dominated jobs and the degree of underpayment. The following example illustrates the latter type of analysis, which was adapted from the province of Manitoba Pay Equity Act manuals that describe the law and how it is to be administered.

EXAMPLE 18.4

Testing for Pay Equity: Equal Pay for Work of Equal Value

In a university, a total of eight jobs are identified as gender dominated. The female-dominated jobs are cleaner, secretary, and workers in the book store and cafeteria. The male-dominated jobs are maintenance worker, security guard, gardener, and technician. Perform a pay-equity analysis to determine whether and to what degree female-dominated jobs are undervalued and underpaid.

SOLUTION:

The hourly pay rates are as follows:

Job Categories	Pay Rate
Maintenance	13.55
Security	15.65
Gardener	13.80
Technician	19.90
Cleaner	11.85
Secretary	14.75
Bookstore	18.90
Cafeteria	13.30

After some consideration, the following factors were selected as part of the job evaluation system:

- Knowledge and training
- Responsibility
- Mental effort
- Physical effort
- Working conditions

Each factor is assigned a weight that reflects its importance. The weights (which must sum to 1) are 25%, 23%, 22%, 15%, and 15%, respectively.

A score for each job is determined by assigning a value between 1 and 10 for each of the five factors and then multiplying by the weight. Smaller values represent less-demanding requirements or better conditions.

The male-dominated jobs are evaluated as follows:

Factors	Weight	Maintenance	Security	Gardener	Technician
Knowledge and training	.25	1	2	3	9
Responsibility	.23	2	7	1	7
Mental effort	.22	2	3	1	8
Physical effort	.15	7	1	6	4
Working conditions	.15	7	4	8	1
Total score		3.25	3.52	3.30	6.37

As you can see, the scores assigned to the maintenance workers and gardeners reflect relatively small demands on knowledge, training, and mental effort but high demands on physical effort and poor working conditions. The technician, on the other hand, has excellent working conditions but requires a high level of knowledge and training.

The evaluations of the female-dominated jobs are as follows:

Factors	Weight	Cleaner	Secretary	Bookstore	Cafeteria
Knowledge and training	.25	1	6	4	2
Responsibility	.23	2	7	7	2
Mental effort	.22	2	6	7	2
Physical effort	.15	7	3	2	5
Working conditions	.15	5	1	1	6
Total score		2.95	5.03	4.60	3.05

As was the case with the male-dominated jobs, the scores for the female-dominated jobs are based on a subjective assessment of the requirements and work that the jobs entail.

The score and an indicator variable are used as independent variables in a regression analysis with pay as the dependent variable. The following data are used in the regression analysis:

Job Categories	Pay Rate	Score	Gender
Maintenance	13.55	3.25	1
Security	15.65	3.52	1
Gardener	13.80	3.30	1
Technician	19.90	6.37	1
Cleaner	11.85	2.95	0
Secretary	14.75	5.03	0
Bookstore	18.90	4.60	0
Cafeteria	13.30	3.05	0

where

$$\text{Gender} = \begin{cases} 1 & \text{if male-dominated job} \\ 0 & \text{if female-dominated job} \end{cases}$$

The results of the regression are shown below.

EXCEL

	A	B	C	D	E	F
1	SUMMARY OUTPUT					
2						
3	Regression Statistics					
4	Multiple R	0.8515				
5	R Square	0.7251				
6	Adjusted R Square	0.6152				
7	Standard Error	1.75				
8	Observations	8				
9						
10	ANOVA					
11		df	SS	MS	F	Significance F
12	Regression	2	40.39	20.19	6.59	0.0396
13	Residual	5	15.31	3.06		
14	Total	7	55.70			
15						
16		Coefficients	Standard Error	t Stat	P-value	
17	Intercept	7.15	2.31	3.10	0.0270	
18	Score	1.93	0.547	3.54	0.0166	
19	Gender	0.633	1.242	0.51	0.6318	

MINITAB

Regression Analysis:

The regression equation is
Pay rate = 7.15 + 1.93 Score + 0.63 Gender

Predictor	Coef	StDev	T	P
Constant	7.145	2.309	3.10	0.027
Score	1.9334	0.5468	3.54	0.017
Gender	0.633	1.242	0.51	0.632

S = 1.7 R-Sq = 72.5% R-Sq(adj) = 61.5%

Analysis of Variance

Source	DF	SS	MS	F	P
Regression	2	40.388	20.194	6.59	0.040
Residual Error	5	15.310	3.062		
Total	7	55.699			

INTERPRET

We cannot apply the usual statistical inference because the eight observations represent the entire population under consideration. Instead we simply use the coefficients of interest. In this case we discover that male-dominated jobs are paid an average of .63 more than female-dominated jobs after adjusting for the value of each job. If we accept the validity of this analysis (see Exercises 18.29 and 18.30), we conclude that the holders of female-dominated jobs need to have their pay rates increased by 63 cents per hour.



EXERCISES

The following exercises require a computer and software.

- 18.34** *Xr18-34* Pay equity for men and women has been an ongoing source of conflict for a number of years in North America. Suppose that a statistics practitioner is investigating the factors that affect salary differences between male and female university professors. He believes that the following variables have some impact on a professor's salary:

Number of years since first degree

$$\text{Highest degree} = \begin{cases} 1 & \text{if Highest degree is a Ph.D.} \\ 0 & \text{if Highest degree is not a Ph.D.} \end{cases}$$

Average score on teaching evaluations

Number of articles published in refereed journals

$$\text{Gender} = \begin{cases} 1 & \text{if Professor is male} \\ 0 & \text{if Professor is female} \end{cases}$$

A random sample of 100 university professors was taken and the following data were recorded:

Column 1: Annual salary

Column 2: Number of years since first degree

Column 3: Highest degree

Column 4: Mean score on teaching evaluation

Column 5: Number of articles published

Column 6: Gender

- Can the statistics practitioner conclude that the model is valid?
- Can the statistics practitioner conclude at the 5% significance level that there is gender discrimination?

An Excel spreadsheet, *Pay Equity* (stored in the *Excel Workbooks* folder), was created to perform the analysis described in Example 18.4. The jobs, pay rates, job scores, and the values of the indicator variable are shown at the bottom of the sheet. These data were used as inputs in the regression analysis. The worksheet is set up so that any change in the factor scores and/or weights automatically changes the job scores at the bottom of the page.

- 18.35** Redo Example 18.4. Change the weights for knowledge and training to 15% and for working conditions to 25%. What effect does this have on the conclusion? Briefly explain why the result was predictable.
- 18.36** Re-do Example 18.4 by assigning your own values to each factor and to the weights. What conclusion did you reach?
- 18.37** Discuss how the factor values and weights affect the final result. Explain the strengths and weaknesses of the statistical analysis.

18-4 / (OPTIONAL) STEPWISE REGRESSION

In Section 17-3 we introduced multicollinearity and described the problems that it causes by distorting the *t*-tests of the coefficients. If one of the objectives of the regression analysis is to determine whether and how each independent variable is related to the dependent variable, it is necessary to reduce the extent of multicollinearity.

As we discussed in Section 17-3, one of the ways to reduce multicollinearity is to include independent variables that appear to be uncorrelated with each other. A correlation matrix is usually produced to determine the correlation coefficients for each pair of variables. In many cases the correlation matrix will not be able to identify whether multicollinearity is a serious problem because there are many ways for variables to be related. For example, one variable may be a function of several other variables. Consequently, a correlation matrix may not reveal the problem. In this section, we introduce *stepwise regression*, a procedure that eliminates correlated independent variables.

Stepwise regression is an iterative procedure that adds and deletes one independent variable at a time. The decision to add or delete a variable is made on the basis of whether that variable improves the model. Minitab features this and related procedures. Excel does not. However, we created a macro that performs stepwise regression. It should be noted that this macro is different from the ones you have encountered thus far in this book. Specific instructions for its use are provided here.

18-4a Stepwise Regression Procedure

The procedure begins by computing the simple regression model for each independent variable. The independent variable with the largest F -statistic (which in a simple regression model is the t -statistic squared) or, equally, with the smallest p -value is chosen as the first entering variable. (Minitab uses the F -statistic, and the Excel macro can use either the F -statistic or the p -value.) The standard is usually set at $F = 4.0$, chosen because the significance level is about 5%. The standard may be changed in both Minitab and Excel. The standard is called the F -to-enter. If no independent variable exceeds the F -to-enter, the procedure ceases with no regression model produced. If at least one variable exceeds the standard, the procedure continues. It then considers whether the model would be improved by adding a second independent variable. It examines all such models to determine which is best and whether the F -statistic of the second variable (with the first variable already in the equation) is greater than the F -to-enter.

If two independent variables are highly correlated, only one of them will enter the equation. Once the first variable is included, the added explanatory power of the second variable will be minimal and its F -statistic will not be large enough to enter the model. In this way, multicollinearity is reduced.

The procedure continues by deciding whether to add another independent variable at each step. The computer also checks to see whether the inclusion of previously added variables is warranted. At each step the p -values of all variables are computed and compared to the F -to-remove. If a variable's F -statistic falls below this standard, it is removed from the equation. These steps are repeated until no more variables are added or removed.

To illustrate, we'll return to the Chapter 17 opening example in which we found that multicollinearity affected the results.

EXCEL

Step 3 - Entering variable: AGE						
			Change	% Change		
3	Summary measures					
4		Multiple R	0.5620	0.0142	0.026	
5		R-Square	0.3159	0.0158	0.053	
6		Adj R-Square	0.3098	0.0138	0.047	
7		StErr of Est	32450	-324	-0.010	
8						
9	ANOVA Table					
10		Source	df	SS	MS	F
11		Explained	3	164,324,355,568	54,774,785,189	52.02
12		Unexplained	338	355,906,748,416	1,052,978,546	1.14E-27
13						
14	Regression coefficients					
15			Coefficient	Std Err	t-value	p-value
16		Constant	-84462	12042	-7.01	1.27E-11
17		EDUC	5352	559	9.57	2.30E-19
18		HRST	913	128	7.13	6.12E-12
19		AGE	421	151	2.79	0.0055

The printout above displays the third and last step of the stepwise regression procedure.

INSTRUCTIONS

1. Type or import the data according to the following instructions.
2. Click **Add-Ins, Data Analysis Plus**, and **Stepwise Regression**.
3. Specify the dependent variable (**response variable**), and the independent variables (**explanatory variables**). Highlight the entire list.
4. Select the **Significance option**. Click **OK** to choose **p-values** as the criterion. Click **OK** to accept the default values for **p-to-enter** and **p-to-leave**.

18-4b Special Instructions for Stepwise Regression

Before beginning place the cursor somewhere in the data set. If you don't, you will be forced to close the macro and repeat.

The macro will ask about missing values. If there are no blank simply accept the default and proceed. Otherwise, click the box to erase the check mark.

Instead of specifying the input range of the data, you simply specify variable names for the dependent and the independent variables. The names must start with a letter or underscore. Do not use names that are the same as cell addresses (e.g., A2), R or C, or names consisting only of numbers (e.g., 55). Do not use symbols other than letters, numbers, and underscores.

The dependent variable must be interval. It cannot be an indicator (dummy) variable. You may use independent indicator variables.

You will be asked to specify the significance options, which refers to the way the stepwise regression decides which variables to enter and which variables to leave. Until you learn more about these choices, we suggest that you accept the defaults.

The macro will draw several different plots. Specify the ones you want.

The output will be placed on the same worksheet as the data or on a different worksheet. If you choose the latter, the macro will ask you to name the worksheet.

MINITAB

Stepwise Regression: INCOME versus AGE, EDUC, ...			
Forward selection. Alpha-to-Enter: 0.05			
Response is INCOME on 6 predictors, with N = 342			
Step	1	2	3
Constant	-29697	-63700	-84462
EDUC	5550	5284	5352
T-Value	9.24	9.37	9.57
P-Value	0.000	0.000	0.000
HRS1		896	913
T-Value		6.94	7.13
P-Value		0.000	0.000
AGE			421
T-Value			2.79
P-Value			0.006
S	34970	32773	32450
R-Sq	20.08	30.01	31.59
R-Sq(adj)	19.84	29.60	30.98
Mallows Cp	58.5	11.2	5.4

INSTRUCTIONS

1. Click **Stat**, **Regression**, and **Stepwise**.
2. Specify the dependent variable (**Response**) and the independent variables (**Predictors**).
3. Click **Methods** and **Forward selection**. Specify **Alpha to enter**. (We recommend .05.)

INTERPRET

The regression equation is:

$$\hat{y} = -84,462 + 5352 \text{ EDUC} + 913 \text{ HRS} + 421 \text{ AGE}$$

All of these independent variables are shown to be linearly related to income.

The *F*-statistic is 52.02 and the coefficient of determination is .3159.

Compare this equation to the one produced in Chapter 17 and you find that the coefficients and test results are very similar. The main difference is that the three variables that were not significant in the equation in Chapter 17 are not included in the stepwise regression result.



EXERCISES

The following exercises require the use of a computer and statistical software.



GENERAL SOCIAL SURVEY EXERCISES

- 18.38 **GSS2012*** Refer to Exercise 17.17.
- Use stepwise regression to compute the regression equation.
 - Compare the output with that produced in Exercise 17.17.
- 18.39 **GSS2012*** Refer to Exercise 17.18
- Use stepwise regression to compute the regression equation.
- 18.40 **GSS2012*** Refer to Exercise 17.19. Use stepwise regression to calculate the equation.
- 18.41 **GSS2008*** Refer to Exercise 17.20. Use stepwise regression to answer the question.



AMERICAN NATIONAL ELECTION SURVEY EXERCISE

- 18.42 **ANES2008*** Refer to Exercise 17.22. Use stepwise regression to produce the statistics.

18-5 / MODEL BUILDING

At this point, we have described several different regression models. You now have the use of nominal predictor variables and the tools to describe a variety of nonlinear relationships. In this section, we describe how the statistician builds a model.

Regression analysis is used either to determine how one or more predictor variables are related to a dependent variable or to predict the value of the dependent variable and

estimate its expected value. Although the process differs between the two objectives, there are many similarities in the approach.

Here is the procedure that is employed in the building of a model.

18-5a Procedure for Building a Model

- 1.** *Identify the dependent variable.* Clearly define the variable that you wish to analyze or predict. For example, if you want to forecast sales, decide whether it is to be the number of units sold, gross revenue, or perhaps net profits. In addition, decide whether to forecast weekly, monthly, or annual figures.
- 2.** *List potential predictors.* Using your knowledge of the dependent variable, produce a list of predictors that may be related to the dependent variable. Although we cannot establish a causal relationship, we should attempt to include predictor variables that cause changes in the dependent variable. Bear in mind the problems caused by multicollinearity and the cost of gathering, storing, and processing data. Be selective in your choices. It is best to use the fewest independent variables that produce a satisfactory model.
- 3.** *Gather the required observations for the potential models.* A general rule is that there should be at least six observations for each independent variable used in the equation.
- 4.** *Identify several possible models.* Once again, use your knowledge of the dependent variable and predictor variables to formulate a model. For example, if you believe that a predictor variable affects the dependent variable, but you are uncertain about the form of the relationship, then formulate first- and second-order models with and without interaction. It may be helpful to draw a scatter diagram of the dependent variable and each predictor variable to discover the nature of the relationship.
- 5.** *Use statistical software to estimate the models.* Use one or more of the variable selection methods described in the previous section to determine which variables to include in the model. If the objective is to determine which predictor variables are related to the dependent variable, you will need to ensure that multicollinearity is not a problem. If it is, attempt to reduce the number of independent variables.
- 6.** *Determine whether the required conditions are satisfied.* If not, attempt to correct the problem. At this point, you may have several “equal” models from which to choose.
- 7.** *Use your judgment and the statistical output to select the best model.* This may be the most difficult part of the process. There may be a model that fits best, but another one may be a better predictor, and yet another may feature fewer variables and, thus, be easier to work with. Experience with regression helps. Taking another statistics course is likely your best strategy.

CHAPTER SUMMARY

This chapter completes our discussion of the regression technique, which began in Chapter 17. We presented several additional models for predicting the value of one variable on the basis of other variables. Polynomial models with one and two independent variables were presented. We discussed how indicator variables allow us to use nominal

variables and we described how indicator variables are used in pay equity discussions. Logistic regression was introduced to address the problem of a nominal dependent variable. To help choose the model that is best for our purposes, we introduced stepwise regression. We completed the chapter by providing some advice on how statisticians build models.

IMPORTANT TERMS:

Polynomial model	728
Predictor variable	728
Order	728
First-order model	728
Interaction	731
Quadratic relationship	732

Second-order model	732
Indicator variable	738
Dummy variable	738
Omitted category	738
Stepwise regression	752

SYMBOLS:

Symbol	Pronounced	Represents
I_i	I sub i or Ii	Indicator variable

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Stepwise regression	753	754

CHAPTER EXERCISES

The following exercises require the use of a computer and statistical software. Use a 5% significance level.

18.43 Xr18-43 Car designers have been experimenting with ways to improve gas mileage for many years. An important element in this research is the way in which a car's speed affects how quickly fuel is burned. Competitions whose objective is to drive the farthest on the smallest amount of gas have determined that low speeds and high speeds are inefficient. Designers would like to know which speed burns gas most efficiently. As an experiment, 50 identical cars are driven at different speeds and the gas mileage measured.

- a. Write the equation of the model you think is appropriate.

- b. Perform a regression analysis using your model.
c. How well does it fit?

18.44 Xr18-44 The number of car accidents on a particular stretch of highway seems to be related to the number of vehicles that travel over it and the speed at which they are traveling. A city alderman has decided to ask the county sheriff to provide him with statistics covering the last few years, with the intention of examining these data statistically so that he can (if possible) introduce new speed laws that will reduce traffic accidents. Using the number of accidents as the dependent variable, he obtains estimates of the number of cars passing along a stretch of road and their average speeds (in miles per hour). The observations for 60 randomly selected days were recorded.

- a. Which model should the alderman use? Explain.
- b. Conduct a regression analysis using a first-order model with interaction.
- c. Is the model valid?

18.45 Refer to Exercise 18.44.

- a. Estimate a second-order model with interaction.
- b. Is this model valid in predicting the number of accidents? Test at the 10% significance level.

18.46 **Xr18-46** After analyzing whether the number of ads is related to the number of customers, the manager in Exercise 16.99 decided to determine whether the advertising made any difference. As a result, he reorganized the experiment. Each week he advertised several times per week, but in only one of the advertising media. He again recorded the weekly number of customers, the number of ads, and the media of that week's advertisement (1 = Newspaper, 2 = Radio, 3 = Television).

- a. Create indicator variables to describe the advertising medium.
- b. Conduct a regression analysis. Test to determine whether the model is valid.
- c. Does the advertising medium make a difference? Explain.

18.47 **Xr18-47** A baseball fan has been collecting data from a newspaper on the various American League teams. She wants to explain each team's winning percentage as a function of its batting average and its earned run average plus an indicator variable for whether the team fired its manager within the last 12 months (1 = Fired manager, and 0 = Did not fire manager). The data for 50 randomly selected teams over the last five seasons were recorded.

- a. Perform a regression analysis using a first-order model (no interaction).
- b. Do these data provide sufficient evidence that a team that fired its manager within the last 12 months wins less frequently than a team that did not fire its manager?

18.48 **Xr18-48** A growing segment of the textile industry in the United States is based on piecework, wherein workers are paid for each unit they produce, instead of receiving an hourly wage. The manager of one such company has observed that inexperienced workers perform quite poorly, but they usually improve quickly. However, very experienced workers do not perform as well as expected. Analysts attribute this phenomenon to boredom. More experienced

workers grow weary of the monotonous work and become less productive. In an attempt to learn more about piecework labor, a statistics practitioner took a random sample of workers with varying years of experience and counted the number of units each produced in 8 hours.

- a. Write the equation of the model that you think would fit.
- b. Perform a regression analysis using your model.
- c. Describe how well the model fits.

18.49 **Xr18-49** The maintenance of swimming pools is quite costly because of all the chlorine that is needed to keep the water clear and relatively free of germs. A chain of hotels (all with outdoor pools) seeking to reduce costs decided to analyze the factors that determine how much chlorine is needed. They commissioned a chemist to conduct an analysis. It is believed that the speed at which chlorine in a pool is depleted is dependent on the temperature of the water (higher temperature uses chlorine faster); pH level, which is a measure of the acidity of the water (pH ranges from 0 to 14, where 0 is very acidic and 14 is very alkaline; levels around 7.5 use the least chlorine); and weather (sunshine uses up chlorine). The chemist conducted the following experiment. The percentage of chlorine depletion during 8-hour days was recorded under varying conditions of pH level, water temperature, and weather conditions. These data were recorded in the following way:

- Column 1: Percentage of chlorine depletion over 8 hours
- Column 2: Temperature (degrees Fahrenheit)
- Column 3: pH level
- Column 4: 1 = Mainly cloudy, 2 = Sunny, 3 = Partly sunny

- a. Write the equation of the model that you would suggest.
- b. Use regression analysis to estimate the model's coefficients.
- c. Test to determine whether the model is valid.
- d. Can we infer that higher temperatures deplete chlorine more quickly?
- e. Is there evidence to infer that the belief about the relationship between chlorine depletion and pH level is correct?
- f. Can we infer that weather is a factor in chlorine depletion?

19



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NONPARAMETRIC STATISTICS

- 19-1 *Wilcoxon Rank Sum Test*
 - 19-2 *Sign Test and Wilcoxon Signed Rank Sum Test*
 - 19-3 *Kruskal–Wallis Test and Friedman Test*
 - 19-4 *Spearman Rank Correlation Coefficient*
- Appendix 19 *Review of Statistical Inference (Chapters 12 to 19)*

General Social Survey

Do Democrats, Independents, and Republicans Differ in the Number of Times per Week They Read Newspapers?

DATA
GSS2012*

Because of the way politics have evolved, it appears that campaigns for president start at least two years before the actual election. And of course there are elections for representatives every two years. This means that politics is part of the regular news that appears in newspapers across the country. In the business of politics, it is important to know where voters are getting their information. Historically, newspapers have been critical to political campaigns because almost all newspapers make recommendations about whom to vote for. This raises the question;



(See Solution on page 792.)

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do supporters of the three political affiliations (PARTYID3: 1 = Democrat, 2 = Independent, 3 = Republican) read newspapers with the same frequency? One of the questions asked in the 2012 General Social Survey was, How often do you read the newspaper (NEWS: 1 = Every day, 2 = A few times a week, 3 = Once a week, 4 = Less than once a week, 5 = Never)? After we introduce the appropriate statistical technique, we will provide our answer. (See page 792.)

INTRODUCTION

Throughout this book, we have presented statistical techniques that are used when the data are either interval or nominal. In this chapter, we introduce statistical techniques that deal with ordinal data. We will introduce three methods that compare two populations, two procedures used to compare two or more populations, and a technique to analyze the relationship between two variables. As you've seen when we compare two or more populations of interval data, we measure the difference between means. However, as we discussed in Chapter 2, when the data are ordinal, the mean is not an appropriate measure of location. As a result, the methods in this chapter do not enable us to test the difference in population means; instead, we will test characteristics of populations without referring to specific parameters. For this reason, these techniques are called **nonparametric techniques**. Rather than testing to determine whether the population means differ, we will test to determine whether the *population locations* differ.

Although nonparametric methods are designed to test ordinal data, they have another area of application. The statistical tests described in Sections 13-1 and 13-3 and in Chapter 14 require that the populations be normally distributed. If the data are extremely nonnormal, the *t*-tests and *F*-test are invalid. Fortunately, nonparametric techniques can be used instead. For this reason, nonparametric procedures are often (perhaps more accurately) called **distribution-free statistics**. The techniques presented here can be used when the data are interval and the required condition of normality is unsatisfied. In such circumstances, we will treat the interval data as if they were ordinal. For this reason, even when the data are interval and the mean is the appropriate measure of location, we will choose instead to test population locations.

Figure 19.1 depicts the distributions of two populations when their locations are the same. Notice that because we don't know (or care) anything about the shape of the distributions, we represent them as nonnormal. Figure 19.2 describes a circumstance when the location of population 1 is to the right of the location of population 2. The location of population 1 is to the left of the location of population 2 in Figure 19.3.

FIGURE 19.1 Population Locations Are the Same

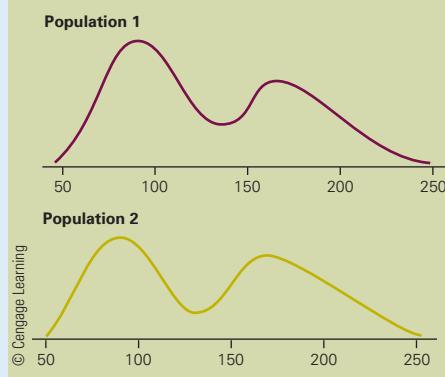
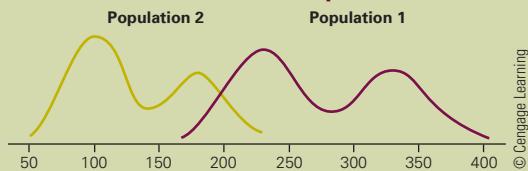
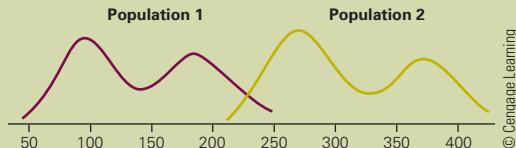


FIGURE 19.2 Location of Population 1 Is to the Right of the Location of Population 2

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FIGURE 19.3 Location of Population 1 Is to the Left of the Location of Population 2

© Cengage Learning

When the problem objective is to compare two populations, the null hypothesis will state

$$H_0: \text{The two population locations are the same}$$

The alternative hypothesis can take on any one of the following three forms.

1. If we want to know whether there is sufficient evidence to infer that there is a difference between the two populations, the alternative hypothesis is

$$H_1: \text{The location of population 1 is different from the location of population 2}$$

2. If we want to know whether we can conclude that the random variable in population 1 is larger in general than the random variable in population 2 (see Figure 19.2), the alternative hypothesis is

$$H_1: \text{The location of population 1 is to the right of the location of population 2}$$

3. If we want to know whether we can conclude that the random variable in population 1 is smaller in general than the random variable in population 2 (see Figure 19.3), the alternative hypothesis is

$$H_1: \text{The location of population 1 is to the left of the location of population 2}$$

As you will see, nonparametric tests utilize a ranking procedure as an integral part of the calculations. You've actually dealt with such a process already in this book. In Chapter 4, we introduced the median as a measure of central location. The median is computed by placing the observations in order and selecting the observation that falls in the middle. Thus, the appropriate measure of central location of ordinal data is the median, a statistic that is the product of a ranking process.

In the next section, we present the Wilcoxon Rank Sum Test employed when we wish to test for the differences between population locations when the data are generated from independent samples. Section 19-2 introduces the sign test and the Wilcoxon signed Rank Sum Test, both of which are applied to the matched pairs experiment. Section 19-3 introduces the Kruskal-Wallis Test and the Friedman Test, procedures that are employed when the objective is to compare two or more populations. The Spearman rank correlation coefficient, which analyzes the relationship between two variables, is presented in Section 19-4.

19-1 / WILCOXON RANK SUM TEST

The test we introduce in this section deals with problems with the following characteristics:

- 1.** The problem objective is to compare two populations.
- 2.** The data are either ordinal or interval where the normality requirement necessary to perform the equal-variances t -test of $\mu_1 - \mu_2$ is unsatisfied.
- 3.** The samples are independent.

To illustrate how to compute the test statistic for the **Wilcoxon Rank Sum Test** for independent samples, we offer the following example.

EXAMPLE 19.1

Wilcoxon Rank Sum Test

Suppose that we want to determine whether the following observations drawn from two populations allow us to conclude at the 5% significance level that the location of population 1 is to the left of the location of population 2.

Sample 1:	22	23	20
Sample 2:	18	27	26

We want to test the following hypotheses:

H_0 : The two population locations are the same

H_1 : The location of population 1 is to the left of the location of population 2

Test Statistic

The first step is to rank all six observations, with rank 1 assigned to the smallest observation and rank 6 to the largest.

Sample 1	Rank	Sample 2	Rank
22	3	18	1
23	4	27	6
20	2	26	5
$T_1 = 9$		$T_2 = 12$	

Observe that 18 is the smallest number, so it receives a rank of 1; 20 is the second-smallest number, and it receives a rank of 2. We continue until rank 6 is assigned to 27, which is the largest of the observations. In case of ties, we average the ranks of the tied observations. The second step is to calculate the sum of the ranks of each sample. The rank sum of sample 1, denoted as T_1 , is 9. The rank sum of sample 2, denoted as T_2 , is 12.

(Note that T_1 plus T_2 must equal the sum of the integers from 1 to 6, which is 21.) We can use either rank sum as the test statistic. We arbitrarily select T_1 as the test statistic and label it T . The value of the test statistic in this example is $T = T_1 = 9$.

Sampling Distribution of the Test Statistic

A small value of T indicates that most of the smaller observations are in sample 1 and that most of the larger observations are in sample 2. This would imply that the location of population 1 is to the left of the location of population 2. Therefore, in order for us to conclude statistically that this is the case, we need to show that T is small. The definition of “small” comes from the sampling distribution of T . As we did in Section 9-1 when we derived the sampling distribution of the sample mean, we can derive the sampling distribution of T by listing all possible values of T . In Table 19.1, we show all possible rankings of two samples of size 3.

TABLE 19.1 All Possible Ranks and Rank Sums of Two Samples of Size 3

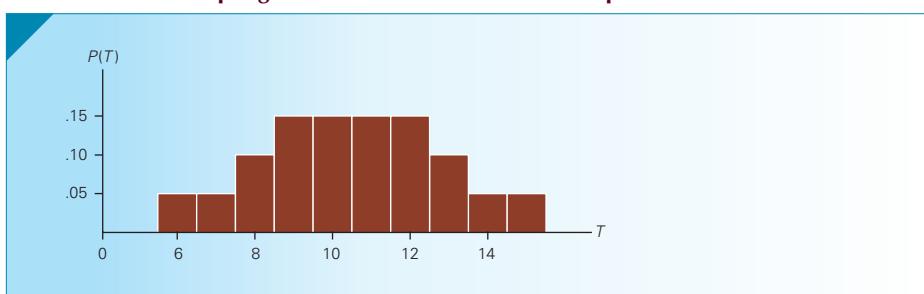
RANKS OF SAMPLE 1	RANK SUM	RANKS OF SAMPLE 2	RANK SUM
1, 2, 3	6	4, 5, 6	15
1, 2, 4	7	3, 5, 6	14
1, 2, 5	8	3, 4, 6	13
1, 2, 6	9	3, 4, 5	12
1, 3, 4	8	2, 5, 6	13
1, 3, 5	9	2, 4, 6	12
1, 3, 6	10	2, 4, 5	11
1, 4, 5	10	2, 3, 6	11
1, 4, 6	11	2, 3, 5	10
1, 5, 6	12	2, 3, 4	9
2, 3, 4	9	1, 5, 6	12
2, 3, 5	10	1, 4, 6	11
2, 3, 6	11	1, 4, 5	10
2, 4, 5	11	1, 3, 6	10
2, 4, 6	12	1, 3, 5	9
2, 5, 6	13	1, 3, 4	8
3, 4, 5	12	1, 2, 6	9
3, 4, 6	13	1, 2, 5	8
3, 5, 6	14	1, 2, 4	7
4, 5, 6	15	1, 2, 3	6

If the null hypothesis is true and the two population locations are identical, then it follows that each possible ranking is equally likely. Because there are 20 different possibilities, each value of T has the same probability, namely, 1/20. Notice that there is one value of 6, one value of 7, two values of 8, and so on. Table 19.2 summarizes the values of T and their probabilities, and Figure 19.4 depicts this sampling distribution.

TABLE 19.2 Sampling Distribution of T with Two Samples of Size 3

T	$P(T)$
6	1/20
7	1/20
8	2/20
9	3/20
10	3/20
11	3/20
12	3/20
13	2/20
14	1/20
15	1/20
Total	1

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FIGURE 19.4 Sampling Distribution of T with Two Samples of Size 3

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From this sampling distribution we can see that $P(T \leq 6) = P(T = 6) = 1/20 = .05$. Because we're trying to determine whether the value of the test statistic is small enough for us to reject the null hypothesis at the 5% significance level, we specify the rejection region as $T \leq 6$. Because $T = 9$, we cannot reject the null hypothesis.

Statisticians have generated the sampling distribution of T for various combinations of sample sizes. The critical values are provided in Table 9 in Appendix B and reproduced here as Table 19.3. Table 19.3 provides values of T_L and T_U for sample sizes between 3 and 10 (n_1 is the size of sample 1, and n_2 is the size of sample 2). The values of T_L and T_U in part (a) of the table are such that

$$P(T \leq T_L) = P(T \geq T_U) = .025$$

The values of T_L and T_U in part (b) of the table are such that

$$P(T \leq T_L) = P(T \geq T_U) = .05$$

Part (a) is used either in a two-tail test with $\alpha = .05$ or in a one-tail test with $\alpha = .025$. Part (b) is employed either in a two-tail test with $\alpha = .10$ or in a one-tail test with $\alpha = .05$. Because no other values are provided, we are restricted to those values of α .

TABLE 19.3 Critical Values of the Wilcoxon Rank Sum Test

		(a) $\alpha = .025$ one-tail; $\alpha = .05$ two-tail														
$n_2 \backslash n_1$	3	4		5		6		7		8		9		10		
		T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	
4	6	18	11	25	17	33	23	43	31	53	40	64	50	76	61	89
5	6	21	12	28	18	37	25	47	33	58	42	70	52	83	64	96
6	7	23	12	32	19	41	26	52	35	63	44	76	55	89	66	104
7	7	26	13	35	20	45	28	56	37	68	47	81	58	95	70	110
8	8	28	14	38	21	49	29	61	39	73	49	87	60	102	73	117
9	8	31	15	41	22	53	31	65	41	78	51	93	63	108	76	124
10	9	33	16	44	24	56	32	70	43	83	54	98	66	114	79	131

		(b) $\alpha = .05$ one-tail; $\alpha = .10$ two-tail														
$n_2 \backslash n_1$	3	4		5		6		7		8		9		10		
		T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	
3	6	15	11	21	16	29	23	37	31	46	39	57	49	68	60	80
4	7	17	12	24	18	32	25	41	33	51	42	62	52	74	63	87
5	7	20	13	27	19	36	26	46	35	56	45	67	55	80	66	94
6	8	22	14	30	20	40	28	50	37	61	47	73	57	87	69	101
7	9	24	15	33	22	43	30	54	39	66	49	79	60	93	73	107
8	9	27	16	36	24	46	32	58	41	71	52	84	63	99	76	114
9	10	29	17	39	25	50	33	63	43	76	54	90	66	105	79	121
10	22	31	18	42	26	54	35	67	46	80	57	95	69	111	83	127

Source: From F. Wilcoxon and R.A. Wilcox, "Some Rapid Approximate Statistical Procedures" (1964), p. 28. Reproduced with the permission of American Cyanamid Company.

Although it is possible to derive the sampling distribution of the test statistic for any other sample sizes, the process can be quite tedious. Fortunately it is also unnecessary. Statisticians have shown that when the sample sizes are larger than 10, the test statistic is approximately normally distributed with mean $E(T)$ and standard deviation σ_T where

$$E(T) = \frac{n_1(n_1 + n_2 + 1)}{2}$$

and

$$\sigma_T = \sqrt{\frac{n_1 n_2 (n_1 + n_2 + 1)}{12}}$$

Thus, the standardized test statistic is

$$z = \frac{T - E(T)}{\sigma_T}$$

EXAMPLE 19.2**DATA****Xm19-02****Comparing Pharmaceutical Painkillers**

A pharmaceutical company is planning to introduce a new painkiller. In a preliminary experiment to determine its effectiveness, 30 people were randomly selected, of whom 15 were given the new painkiller and 15 were given aspirin. All 30 were told to use the drug when headaches or other minor pains occurred and to indicate which of the following statements most accurately represented the effectiveness of the drug they took:

- 5 = The drug was extremely effective.
- 4 = The drug was quite effective.
- 3 = The drug was somewhat effective.
- 2 = The drug was slightly effective.
- 1 = The drug was not at all effective.

The responses are listed here using the codes. Can we conclude at the 5% significance level that the new painkiller is perceived to be more effective?

New painkiller: 3, 5, 4, 3, 2, 5, 1, 4, 5, 3, 3, 5, 5, 5, 4

Aspirin: 4, 1, 3, 2, 4, 1, 3, 4, 2, 2, 2, 4, 3, 4, 5

SOLUTION:**IDENTIFY**

The objective is to compare two populations: the perceived effectiveness of the new painkiller and of aspirin. We recognize that the data are ordinal; except for the order of the codes, the numbers used to record the results are arbitrary. Finally, the samples are independent. These factors tell us that the appropriate technique is the Wilcoxon Rank Sum Test. We denote the effectiveness scores of the new painkiller as sample 1 and the effectiveness scores of aspirin as sample 2. Because we want to know whether the new painkiller is better than aspirin, the alternative hypothesis is

H_1 : The location of population 1 is to the right of the location of population 2

We specify the null hypothesis as

H_0 : The two population locations are the same

COMPUTE**MANUALLY:**

If the alternative hypothesis is true, the location of population 1 will be located to the right of the location of population 2. It follows that T and z would be large. Our job is to determine whether z is large enough to reject the null hypothesis in favor of the alternative hypothesis. Thus, the rejection region is

$$z > z_\alpha = z_{.05} = 1.645$$

We compute the test statistic by ranking all the observations.

New Painkiller	Rank	Aspirin	Rank
3	12	4	19.5
5	27	1	2
4	19.5	3	12
3	12	2	6
2	6	4	19.5
5	27	1	2
1	2	3	12
4	19.5	4	19.5
5	27	2	6
3	12	2	6
3	12	2	6
5	27	4	19.5
5	27	3	12
5	27	4	19.5
4	19.5	5	27

$$T_1 = 276.5 \qquad T_2 = 188.5$$

Notice that three “ones” occupy ranks 1, 2, and 3. The average is 2. Thus, each “one” is assigned a rank of 2. There are five “twos” whose ranks are 4, 5, 6, 7, and 8, the average of which is 6. We continue until all the observations have been similarly ranked. The rank sums are computed with $T_1 = 276.5$ and $T_2 = 188.5$. The unstandardized test statistic is $T = T_1 = 276.5$. To standardize, we determine $E(T)$ and σ_T as follows.

$$E(T) = \frac{n_1(n_1 + n_2 + 1)}{2} = \frac{15(31)}{2} = 232.5$$

$$\sigma_T = \sqrt{\frac{n_1 n_2 (n_1 + n_2 + 1)}{12}} = \sqrt{\frac{(15)(15)(31)}{12}} = 24.1$$

The standardized test statistic is calculated next:

$$z = \frac{T - E(T)}{\sigma_T} = \frac{276.5 - 232.5}{24.1} = 1.83$$

The p -value of the test is

$$p\text{-value} = P(Z > 1.83) = 1 - .9664 = .0336$$

EXCEL

	A	B	C	D	E
1	Wilcoxon Rank Sum Test				
2					
3			Rank Sum	Observations	
4	New		276.5	15	
5	Aspirin		188.5	15	
6	z Stat		1.83		
7	P(Z<=z) one-tail		0.0340		
8	z Critical one-tail		1.6449		
9	P(Z<=z) two-tail		0.0680		
10	z Critical two-tail		1.96		

INSTRUCTIONS

1. Type or import the data into two adjacent columns. ([Open Xm19-02](#).)
2. Click **Add-Ins**, **Data Analysis Plus**, and **Wilcoxon Rank Sum Test**.
3. Specify the **Variable 1 Range** (**A1:A16**), the **Variable 2 Range** (**B1:B16**), and the value of α (.05).

MINITAB**Mann-Whitney Test and CI: New, Aspirin**

	N	Median
New	15	4.000
Aspirin	15	3.000

Point estimate for ETA1-ETA2 is 1.000
 95.4 Percent CI for ETA1-ETA2 is (0.001,2.000)
 $W = 276.5$
 Test of $ETA1 = ETA2$ vs $ETA1 > ETA2$ is significant at 0.0356
 The test is significant at 0.0321 (adjusted for ties)

Minitab performs the Mann-Whitney Test rather than the Wilcoxon Test. However, the tests are equivalent. In the output, **ETA** represents the population median. The test statistic $W = 276.5$ is the value of the Wilcoxon Rank Sum statistic; that is $T = W = 276.5$. The output includes the p -value (0.0356) and another p -value calculated by adjusting for tied observations (0.0321). We will report the first p -value only.

INSTRUCTIONS

1. Type or import the data into two columns. ([Open Xm19-02](#).)
2. Click **Stat**, **Nonparametrics**, and **Mann-Whitney . . .**
3. Type the variable name for the **First Sample** (**New**), the variable name of the **Second Sample** (**Aspirin**), and click one of **less than**, **not equal to**, or **greater than** in the **Alternative** box (**greater than**).

INTERPRET

The data provide sufficient evidence to infer that the new painkiller is perceived to be more effective than aspirin. We note that the data were generated from a controlled experiment; that is, the subjects were assigned to take either the new painkiller or aspirin. (When subjects decide for themselves which medication to take, the data are observational.) This factor helps support the claim that the new painkiller is indeed more effective than aspirin. Factors that weaken the argument are small sample sizes and the inexactness of the responses. There may be methods to measure the effectiveness less subjectively. In addition, a double-blind experiment should have been conducted.

As we pointed out in the introduction to this chapter, the Wilcoxon Rank Sum Test is used to compare two populations when the data are either ordinal or interval. Example 19.2 illustrated the use of the Wilcoxon Rank Sum Test when the data are ordinal. In the next example we demonstrate its use when the data are interval.

EXAMPLE 19.3

DATA
Xm19-03

Retaining Workers

Because of the high cost of hiring and training new employees, employers would like to ensure that they retain highly qualified workers. To help develop a hiring program, the human resources manager of a large company wanted to compare how long business and nonbusiness university graduates worked for the company before quitting to accept a position elsewhere. The manager selected a random sample of 25 business and 20 nonbusiness graduates who had been hired 5 years ago. The number of months each had worked for the company was recorded. (Those who had not quit were recorded as having worked for 60 months.) The data are listed below. Can the human resources manager conclude at the 5% significance level that a difference in duration of employment exists between business and nonbusiness graduates?

Duration of Employment (Months)

Business Graduates												Nonbusiness Graduates									
60	11	18	19	5	25	60	7	8	17	37	4	8	25	60	22	24	23	36	39	15	35
28	27	11	60	25	5	13	22	11	17	9	4		9	60	29	16	22	60	17	60	32

SOLUTION:**IDENTIFY**

The problem objective is to compare two populations whose data are interval. The samples are independent. Thus, the appropriate parametric technique is the t -test of $\mu_1 - \mu_2$, which requires that the populations be normally distributed. However, when the histograms are drawn (see Figures 19.5 and 19.6), it becomes clear that this requirement is unsatisfied. It follows that the correct statistical procedure is the Wilcoxon Rank Sum Test. The null and alternative hypotheses are

H_0 : The two population locations are the same

H_1 : The location of population 1 (business graduates) is different from the location of population 2 (nonbusiness graduates)

FIGURE 19.5 Histogram of Length of Employment of Business Graduates in Retaining Workers Example

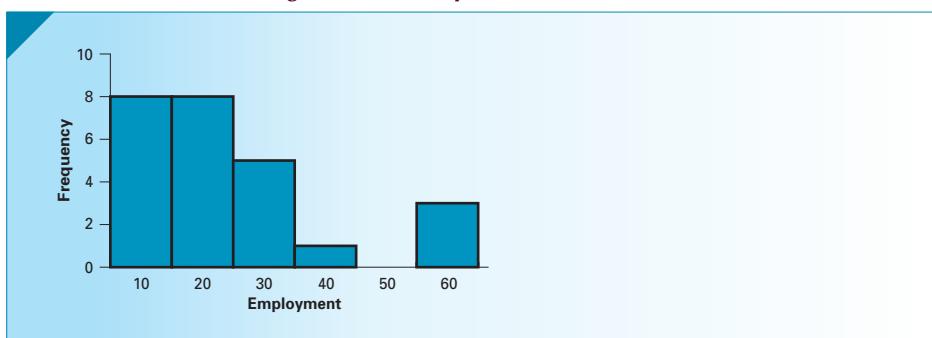
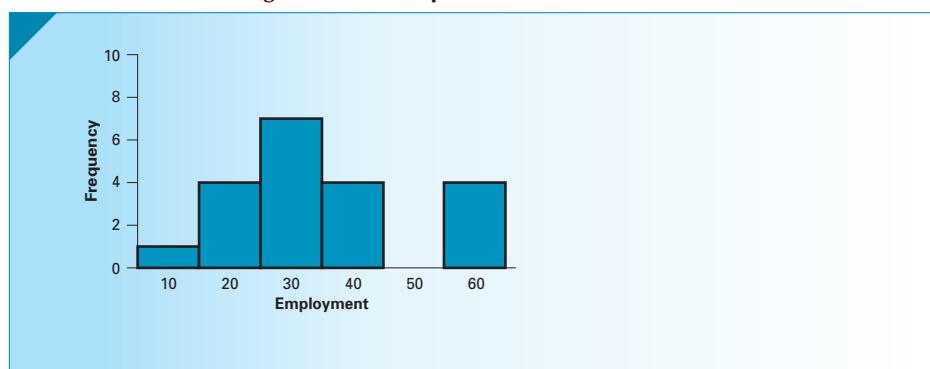


FIGURE 19.6 Histogram of Length of Employment of Nonbusiness Graduates in Retaining Workers Example



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COMPUTE

MANUALLY:

The rejection region is

$$z < -z_{\alpha/2} = -z_{.025} = -1.96 \quad \text{or} \quad z > z_{\alpha/2} = z_{.025} = 1.96$$

We calculate the value of the test statistic in the following way.

Business	Rank	Nonbusiness	Rank
60	42	25	28
11	11	60	42
18	20	22	23
19	21	24	26
5	3.5	23	25
25	28	36	36
60	42	39	38
7	5	15	14
8	6.5	35	35
17	18	16	15.5
37	37	28	31.5
4	1.5	9	8.5
8	6.5	60	42
28	31.5	29	33
27	30	16	15.5
11	11	22	23
60	42	60	42
25	28	17	18
5	3.5	60	42
13	13	32	34
22	23	$T_2 = 572$	
11	11		
17	18		
9	8.5		
4	1.5		
$T_1 = 463$			

The unstandardized test statistic is $T = T_1 = 463$. To calculate z , we first determine the mean and standard deviation of T . Note that $n_1 = 25$ and $n_2 = 20$.

$$E(T) = \frac{n_1(n_1 + n_2 + 1)}{2} = \frac{25(46)}{2} = 575$$

$$\sigma_T = \sqrt{\frac{n_1 n_2 (n_1 + n_2 + 1)}{12}} = \sqrt{\frac{(25)(20)(46)}{12}} = 43.8$$

The standardized test statistic is

$$z = \frac{T - E(T)}{\sigma_T} = \frac{463 - 575}{43.8} = -2.56$$

$$p\text{-value} = 2P(Z < -2.56) = 2(1 - .9948) = .0104$$

EXCEL

	A	B	C	D	E
1	Wilcoxon Rank Sum Test				
2					
3			Rank Sum	Observations	
4	Business		463	25	
5	Non-Bus		572	20	
6	z Stat		-2.56		
7	P(Z<=z) one-tail		0.0053		
8	z Critical one-tail		1.6449		
9	P(Z<=z) two-tail		0.0106		
10	z Critical two-tail		1.96		

MINITAB

Mann-Whitney Test and CI: Business, Non-Bus

N	Median	
Business	25	17.00
Non-Bus	20	26.50

Point estimate for ETA1-ETA2 is -11.00
 95.2 Percent CI for ETA1-ETA2 is (-19.00, -3.00)
 $W = 463.0$
 Test of ETA1 = ETA2 vs ETA1 not = ETA2 is significant at 0.0109
 The test is significant at 0.0107 (adjusted for ties)

INTERPRET

There is strong evidence to infer that the duration of employment is different for business and nonbusiness graduates. The data cannot tell us the cause of this conclusion. For example, we don't know whether business graduates are in greater demand, making it more likely that such employees will leave for better jobs, or whether nonbusiness graduates are more satisfied with their jobs and thus remain longer. Moreover, we don't know what the results would have been had we surveyed employees 10 years after they were employed.

19-1a Required Conditions

The Wilcoxon Rank Sum Test (like the other nonparametric tests presented in this chapter) actually tests to determine whether the population *distributions* are identical. This means that it tests not only for identical locations but also for identical spreads (variances) and shapes (distributions). Unfortunately, this means that the rejection of the null hypothesis may not necessarily signify a difference in population locations. The rejection of the null hypothesis may result instead from a difference in distribution shapes or spreads. To avoid this problem, we will require that the two probability distributions be identical except with respect to location, which then becomes the sole focus of the test. This requirement is made for the tests introduced in the next two sections (sign test, Wilcoxon Signed Rank Sum Test, Kruskal–Wallis Test, and Friedman Test).

Both histograms (Figures 19.5 and 19.6) are approximately bimodal. Although there are differences between them it would appear that the required condition for the use of the Wilcoxon Rank Sum Test is roughly satisfied in the example about retaining workers.

19-1b Developing an Understanding of Statistical Concepts

When applying nonparametric techniques, we do not perform any calculations using the original data. Instead, we perform computations only on the ranks. (We determine the rank sums and use them to make our decision.) As a result, we do not care about the actual distribution of the data (hence the name *distribution-free techniques*), and we do not specify parameters in the hypotheses (hence the name *nonparametric techniques*). Although there are other techniques that do not specify parameters in the hypotheses, we use the term *nonparametric* for procedures that feature these concepts.

Here is a summary of how to identify the Wilcoxon Rank Sum Test.

Factors That Identify the Wilcoxon Rank Sum

1. **Problem objective:** Compare two populations
2. **Data type:** Ordinal or interval but nonnormal
3. **Experimental design:** Independent samples



EXERCISES

Developing an Understanding of Statistical Concepts

Exercises 19.1 and 19.2 are “what-if” analyses designed to determine what happens to the test statistics and p-values when elements of the statistical inference change. These problems can be solved manually or by creating an Excel spreadsheet.

- 19.1** a. Given the following statistics calculate the value of the test statistic to determine whether the population locations differ.

$$\begin{array}{ll} T_1 = 250 & n_1 = 15 \\ T_2 = 215 & n_2 = 15 \end{array}$$

- b. Repeat part (a) with $T_1 = 275$ and $T_2 = 190$.
c. Describe the effect on the test statistic of increasing T_1 to 275.

- 19.2** a. From the following statistics, test (with $\alpha = .05$) to determine whether the location of population 1 is to the right of the location of population 2.

$$\begin{array}{ll} T_1 = 1,205 & n_1 = 30 \\ T_2 = 1,280 & n_2 = 40 \end{array}$$

- b. Repeat part (a) with $T_1 = 1,065$.
c. Discuss the effect on the test statistic and p -value of decreasing T_1 to 1,065.
- 19.3** **Xr19-03** Use the Wilcoxon Rank Sum Test on the following data to determine whether the location of population 1 is to the left of the location of population 2. (Use $\alpha = .05$.)

Sample 1: 75 60 73 66 81
Sample 2: 90 72 103 82 78

- 19.4** **Xr19-04** Use the Wilcoxon Rank Sum Test on the following data to determine whether the two population locations differ. (Use a 10% significance level.)

Sample 1: 15 7 22 20 32 18 26 17 23 30
Sample 2: 8 27 17 25 20 16 21 17 10 18

Exercises 19.5 to 19.24 require the use of a computer and software. Conduct tests of hypotheses at the 5% significance level.

- 19.5** a. **Xr19-05a** In a taste test of a new beer, 25 people rated the new beer and another 25 rated the leading brand on the market. The possible ratings were Poor, Fair, Good, Very Good, and Excellent. The responses for the new beer and the leading beer were stored using a 1-2-3-4-5 coding system. Can we infer that the new beer is less highly rated than the leading brand?
b. **Xr19-05b** The responses were recoded so that 3 = Poor, 8 = Fair, 22 = Good, 37 = Very Good, and 55 = Excellent. Can we infer that the new beer is less highly rated than the leading brand?
c. What does this exercise tell you about ordinal data?
- 19.6** a. **Xr19-06a** To determine whether the satisfaction rating of an airline differs between business class and economy class, a survey was performed. Random samples of both groups were asked to rate their satisfaction with the quality of service using the following responses:

Very satisfied
Quite satisfied
Somewhat satisfied
Neither satisfied nor dissatisfied
Somewhat dissatisfied
Quite dissatisfied
Very dissatisfied

Using a 7-6-5-4-3-2-1 coding system, the results were recorded. Can we infer that business and economy class differ in their degree of satisfaction with the service?

- b. **Xr19-06b** The responses were recoded using the values 88-67-39-36-25-21-18. Can we infer that

business and economy class differ in their degree of satisfaction with the service?

- c. What is the effect of changing the codes? Why was this expected?
- 19.7** a. **Xr19-07** Refer to Example 19.2. Suppose that the responses were coded as follows:

100 = The drug was extremely effective.
60 = The drug was quite effective.
40 = The drug was somewhat effective.
35 = The drug was slightly effective.
10 = The drug was not at all effective.

Determine whether we can infer that the new painkiller is more effective than aspirin.

- b. Why are the results of Example 19.2 and part (a) identical?

Applications

Exercises 19.8 to 19.16 may be solved manually. See Appendix A for the sample statistics.

- 19.8** **Xr19-08** A survey of statistics professors asked them to rate the importance of teaching nonparametric techniques. The possible responses are

Very important
Quite important
Somewhat important
Not too important
Not important at all

The professors were classified as either a member of the Mathematics Department or a member of some other department. The responses were coded (codes 5, 4, 3, 2, and 1, respectively) and recorded. Can we infer that members of the Mathematics Department rate nonparametric techniques as more important than do members of other departments?

- 19.9** **Xr19-09** In recent years, insurance companies offering medical coverage have given discounts to companies that are committed to improving the health of their employees. To help determine whether this policy is reasonable, the general manager of one large insurance company organized a study of a random sample of 30 workers who regularly participate in their company's lunchtime exercise program and 30 workers who do not. Over a 2-year period he observed the total dollar amount of medical expenses for each individual. Can the manager conclude that companies that provide exercise programs should be given discounts?

- 19.10** **Xr19-10** Feminist organizations often use the issue of who does the housework in two-career families as a gauge of equality. Suppose that a study was undertaken and a random sample of 125 two-career families was taken. The wives were asked to report

the number of hours of housework they performed the previous week. The results, together with the responses from a survey performed last year (with a different sample of two-career families), were recorded. Can we conclude that women are doing less housework today than last year?

- 19.11** **Xr19-11** The American public's support for the space program is important for the program's continuation and for the financial health of the aerospace industry. In a poll conducted by the Gallup organization last year, a random sample of 100 Americans was asked, "Should the amount of money being spent on the space program be increased or kept at current levels (3), decreased (2), or ended altogether (1)?" The survey was conducted again this year. The results were recorded using the codes in parentheses. Can we conclude that public support decreased between this year and last year?
- 19.12** **Xr19-12** Certain drugs differ in their side effects depending on the gender of the patient. In a study to determine whether men or women suffer more serious side effects when taking a powerful penicillin substitute, 50 men and 50 women were given the drug. Each was asked to evaluate the level of stomach upset on a 4-point scale, where 4 = extremely upset, 3 = somewhat upset, 2 = not too upset, and 1 = not upset at all. Can we conclude that men and women experience different levels of stomach upset from the drug?
- 19.13** **Xr19-13** The president of Tastee Inc., a baby-food producer, claims that her company's product is superior to that of her leading competitor because babies gain weight faster with her product. As an experiment, 40 healthy newborn infants are randomly selected. For two months, 15 of the babies are fed Tastee baby food and the other 25 are fed the competitor's product. Each baby's weight gain (in ounces) was recorded. If we use weight gain as our criterion, can we conclude that Tastee baby food is indeed superior? (This exercise is identical to Exercise 13.17 except for the data.)
- 19.14** **Xr19-14** Do the ways that women dress influence the ways that other women judge them? This question was addressed by a researcher at Ohio State University (*Working Mother*, April 1992). The experiment consisted of asking women to rate how

professional two women looked. One woman wore a size 6 dress and the other wore a size 14. Suppose that the researcher asked 20 women to rate the woman wearing the size 6 dress and another 20 to rate the woman wearing the size 14 dress. The ratings were as follows:

- 4 = Highly professional
- 3 = Somewhat professional
- 2 = Not very professional
- 1 = Not at all professional

Do these data provide sufficient evidence to infer that women perceive another woman wearing a size 6 dress as more professional than one wearing a size 14 dress?

- 19.15** **Xr19-15** The image of the lowly prune is not very good. It is perceived as a product used by seniors to help avoid constipation. However, in reality it is a nutritious and (for many) a tasty treat. To help improve the image of the prune, a company that produces the product decided to see the effect of changing its name to dried plums (which is what a prune is). To gauge the effect, a random sample of shoppers was asked how likely it was that they would purchase the product. Half the sample was shown a package that identified its contents as prunes. The other half was shown packages labeled dried plums. The responses are
- Highly unlikely (1)
 - Somewhat unlikely (2)
 - Somewhat likely (3)
 - Highly likely (4)
- Can we infer from these data that changing the name of prunes to dried plums increases the likelihood that shoppers will buy the product?
 - Write a report to the marketing manager of the company and describe your findings.

- 19.16** **Xr19-16** Burger King Restaurants regularly survey customers to determine how well they are doing. Suppose that a survey asked customers to rate (among other things) the speed of service. The responses are

- 1 = Poor
- 2 = Good
- 3 = Very good
- 4 = Excellent

The responses for the day shift and night shift were recorded. Can we infer that night shift customers rate the service differently than the day shift?



GENERAL SOCIAL SURVEY EXERCISES

Exercises 19.17 to 19.23 refer to the following questions. Please look at the list below and specify which one you would most prefer in a job. Which comes second? Which comes

third? Which comes fourth? Which comes fifth? (1 = First, 2 = Second, 3 = Third, 4 = Fourth, 5 = Fifth)

- High income (JOBINC)
 No danger of being fired (JOPBSEC)
 Working hours are short, lots of free time (JOBHOUR)
 Chances for advancement (JOBPROMO)
 Work is important and gives a feeling of accomplishment (JOBMEANS)
- 19.17 **GSS2012*** Do men (SEX: 1 = Male, 2 = Female) prefer jobs with higher incomes more than do women? Conduct a statistical test to answer the question.
- 19.18 **GSS2012*** There appear to be many attractive features of government jobs, the most attractive being job security. But is this actually the case? Conduct a test to determine whether government workers (WRKGGOVT: 1 = Government, 2 = Private) show a greater preference for job security.
- 19.19 **GSS2012*** Working for one's self generally means that the amount of time devoted to work is up to the individual. Is there sufficient evidence to conclude that people who work for themselves (WRKSLF: 1 = Self, 2 = Someone else) prefer shorter work hours with lots of free time?
- 19.20 **GSS2012*** Can we infer that men and women (SEX: 1 = Male, 2 = Female) differ in their preference for work that is important and gives a feeling of accomplishment?
- 19.21 **GSS2012*** Almost everyone dreams of being rich enough to quit working. Respondents were asked, If you were to get enough money to live as comfortably as you would like for the rest of your life, would you continue to Work, or would you stop working (RICHWORK: 1 = Continue working, 2 = Stop working)? Is there enough evidence to conclude that those who would continue working and those who would stop working differ in their preference for high income?
- 19.22 **GSS2012*** Refer to Exercise 19.21. For those who would continue working is it because they consider the work important? Test to determine whether those who would continue working have a higher preference for work they consider important and gives them a feeling of accomplishment.
- 19.23 **GSS2012*** Can we infer that men and women (SEX: 1 = Male, 2 = Female) differ in their preference for jobs where there is a chance for advancement?
- 19.24 **GSS2012*** Do Democrats and Republicans (PARTYID: 0, 1 = Democrat; 5, 6 = Republican) differ in their views about the federal income tax that they have to pay (TAX: Do you consider the amount of federal income tax which you have to pay as too high, about right, or too low: 1 = Too high, 2 = About right, 3 = Too low)?
- 19.25 **GSS2012*** Refer to Exercise 19.24. Is there sufficient evidence to infer that people who work for themselves (WRKSLF: 1 = Self-employed, 2 = Work for someone else) differ from those who work for someone else with respect to how they describe the federal income tax they have to pay?
- 19.26 **GSS2012*** Can we infer that women are more likely than men to lose their jobs in the next 12 months (JOBLOSE: In the next 12 months how likely is it that you will lose your job or be laid off: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely)?
- 19.27 **GSS2012*** It is well known that on average women live about four years longer than men. However, are they healthier? Conduct a test to determine if women (SEX: 1 = Male, 2 = Female) consider themselves to be healthier than men (HEALTH: 1 = Excellent, 2 = Good, 3 = Fair, 4 = Poor)?

Exercises 19.28 to 19.31 compare various aspects of 2010 and 2012.

- 19.28 **GSS2010*, GSS2012*** Is there sufficient evidence to infer that Americans were healthier (HEALTH: 1 = Excellent, 2 = Good, 3 = Fair, 4 = Poor) in 2012 than in 2010?
- 19.29 **GSS2010*, GSS2012*** Were Americans more worried about their chances of losing their jobs (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely) in 2010 than in 2012?
- 19.30 **GSS2010*, GSS2012*** Were Americans more optimistic about their children's standard of living (KIDSSOL: When your children are at the age you are now, do you think their standard of living will be 1 = Much better, 2 = Somewhat better, 3 = About the same, 4 = Somewhat worse, or 5 = Much worse than your standard of living is now?) in 2010 than they were in 2012?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 19.31 **ANES2008*** Is there enough statistical evidence to infer that Liberals and Conservatives (LIBCON: 1, 2, 3 = Liberal; 5, 6, 7 = Conservatives) differ in their interest in information about what's going on in government and politics (INTB: 1 = Extremely interested, 2 = Very interested, 3 = Moderately interested, 4 = Slightly interested, 5 = Not at all interested)?

- 19.32 ANES2008*** Test to determine whether we can draw the conclusion that Democrats and Republicans (PARTY: 1 = Democrat, 2 = Republican) differ in the attention they pay to local news on television about the campaign for president (ATTN2: 1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None)?
- 19.33 ANES2008*** Is there sufficient evidence to conclude that men and women (GENDER: 1 = Male, 2 = Female) differ in their interest in information about what's going on in government

and politics (INTB: 1 = Extremely interested, 2 = Very interested, 3 = Moderately interested, 4 = Slightly interested, 5 = Not at all interested)?

- 19.34 ANES2008*** Can we conclude that people who voted for Barack Obama (WHOVOTE: 1 = Barack Obama, 3 = John McCain) were more likely than people who voted for John McCain to believe that the economy has changed for the worse in the year prior to the election (ECON: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)?

19-2 / SIGN TEST AND WILCOXON SIGNED RANK SUM TEST

In the preceding section, we discussed the nonparametric technique for comparing two populations of data that are either ordinal or interval (nonnormal) and where the data are independently drawn. In this section, the problem objective and data type remain as they were in Section 19-1, but we will be working with data generated from a matched pairs experiment. We have dealt with this type of experiment before. In Section 13-3, we dealt with the mean of the paired differences represented by the parameter μ_D . In this section, we introduce two nonparametric techniques that test hypotheses in problems with the following characteristics:

- 1.** The problem objective is to compare two populations.
- 2.** The data are either ordinal or interval (where the normality requirement necessary to perform the parametric test is unsatisfied).
- 3.** The samples are matched pairs.

To extract all the potential information from a matched pairs experiment, we must create the matched pair differences. Recall that we did so when conducting the t -test and estimate of μ_D . We then calculated the mean and standard deviation of these differences and determined the test statistic and confidence interval estimator. The first step in both nonparametric methods presented here is the same: Compute the differences for each pair of observations. However, if the data are ordinal, we cannot perform any calculations on those differences because differences between ordinal values have no meaning.

To understand this point, consider comparing two populations of responses of people rating a product or service. The responses are “excellent,” “good,” “fair,” and “poor.” Recall that we can assign any numbering system as long as the order is maintained. The simplest system is 4-3-2-1. However, any other system such as 66-38-25-11 (or another set of numbers of decreasing order) is equally valid. Now suppose that in one matched pair the sample 1 response was “excellent” and the sample 2 response was “good.” Calculating the matched pairs difference under the 4-3-2-1 system gives a difference of $4 - 3 = 1$. Using the 66-38-25-11 system gives a difference of $66 - 38 = 28$. If we treat this and other differences as real numbers, we are likely to produce different results depending on which numbering system we used. Thus, we cannot use any method that uses the actual differences. However, we can use the sign of the differences. In fact, when the data are ordinal that is the only method that is valid. In other words, no matter what numbering system is used we know that “excellent” is better than “good.” In the 4-3-2-1 system the difference between “excellent” and “good” is +1. In the 66-38-25-11 system

the difference is +28. If we ignore the magnitude of the number and record only the sign, the two numbering systems (and all other systems where the rank order is maintained) will produce exactly the same result.

As you will shortly discover, the sign test uses only the sign of the differences. That's why it's called the *sign test*.

When the data are interval, however, differences have real meaning. Although we can use the sign test when the data are interval, doing so results in a loss of potentially useful information. For example, knowing that the difference in sales between two matched used-car salespeople is 25 cars is much more informative than simply knowing that the first salesperson sold more cars than the second salesperson. As a result, when the data are interval, but not normal, we will use the *Wilcoxon Signed Rank Sum Test*, which incorporates not only the sign of the difference (hence the name) but also the magnitude.

19-2a Sign Test

The **sign test** is employed in the following situations:

1. The problem objective is to compare two populations.
2. The data are ordinal.
3. The experimental design is matched pairs.

19-2b Test Statistic and Sampling Distribution

The sign test is quite simple. For each matched pair, we calculate the difference between the observation in sample 1 and the related observation in sample 2. We then count the number of positive differences and the number of negative differences. If the null hypothesis is true, we expect the number of positive differences to be approximately equal to the number of negative differences. Expressed another way, we expect the number of positive differences and the number of negative differences each to be approximately equal to half the total sample size. If either number is too large or too small, we reject the null hypothesis. By now you know that the determination of what is too large or too small comes from the sampling distribution of the test statistic. We will arbitrarily choose the test statistic to be the number of positive differences, which we denote x . The test statistic x is a binomial random variable, and under the null hypothesis, the binomial proportion is $p = .5$. Thus, the sign test is none other than the z -test of p introduced in Section 12-3.

Recall from Sections 7-4 and 9-2 that x is binomially distributed and that, for sufficiently large n , x is approximately normally distributed with mean $\mu = np$ and standard deviation $\sqrt{np(1 - p)}$. Thus, the standardized test statistic is

$$z = \frac{x - np}{\sqrt{np(1 - p)}}$$

The null hypothesis

$$H_0: \text{The two population locations are the same}$$

is equivalent to testing

$$H_0: p = .5$$

Therefore, the test statistic, assuming that the null hypothesis is true, becomes

$$z = \frac{x - np}{\sqrt{np(1-p)}} = \frac{x - .5n}{\sqrt{n(.5)(.5)}} = \frac{x - .5n}{.5\sqrt{n}}$$

The normal approximation of the binomial distribution is valid when $np \geq 5$ and $n(1-p) \geq 5$. When $p = .5$,

$$np = n(.5) \geq 5$$

and

$$n(1-p) = n(1 - .5) = n(.5) \geq 5$$

implies that n must be greater than or equal to 10. Thus, this is one of the required conditions of the sign test. However, the quality of the inference with very small sample size is poor. Larger sample sizes are recommended and will be used in the examples and exercises that follow.

It is common practice in this type of test to eliminate the matched pairs of observations when the differences equal 0. Consequently, n equals the number of nonzero differences in the sample.

EXAMPLE 19.4

DATA

Xm19-04

Comparing the Comfort of Two Midsize Cars

In an experiment to determine which of two cars is perceived to have the more comfortable ride, 25 people rode (separately) in the back seat of an expensive European model and also in the back seat of a North American midsize car. Each of the 25 people was asked to rate the ride on the following 5-point scale:

- 1 = Ride is very uncomfortable.
- 2 = Ride is quite uncomfortable.
- 3 = Ride is neither uncomfortable nor comfortable.
- 4 = Ride is quite comfortable.
- 5 = Ride is very comfortable.

The results are shown here. Do these data allow us to conclude at the 5% significance level that the European car is perceived to be more comfortable than the North American car?

Respondent	Comfort Ratings	
	European Car	North American Car
1	3	4
2	2	1
3	5	4
4	3	2
5	2	1
6	5	3
7	2	3
8	4	2
9	4	2
10	2	2
11	2	1
12	3	4
13	2	1
14	3	4

Respondent	Comfort Ratings	
	European Car	North American Car
15	2	1
16	4	3
17	5	4
18	2	3
19	5	4
20	3	1
21	4	2
22	3	3
23	3	4
24	5	2
25	5	3

SOLUTION:

IDENTIFY

The problem objective is to compare two populations of ordinal data. Because the same 25 people rated both cars, we recognize the experimental design as matched pairs. The sign test is applied, with the following hypotheses:

H_0 : The two population locations are the same

H_1 : The location of population 1 (European car rating) is to the right of the location of population 2 (North American car rating)

COMPUTE

MANUALLY:

The rejection region is

$$z > z_{\alpha} = z_{.05} = 1.645$$

To calculate the value of the test statistic, we calculate the paired differences and count the number of positive, negative, and zero differences. The matched pairs differences are

$$\begin{array}{ccccccccccccccccc} -1 & 1 & 1 & 1 & 1 & 2 & -1 & 2 & 2 & 0 & 1 & -1 & 1 \\ -1 & 1 & 1 & 1 & -1 & 1 & 2 & 2 & 0 & -1 & 3 & 2 \end{array}$$

There are 17 positive, 6 negative, and 2 zero differences. Thus, $x = 17$ and $n = 23$. The value of the test statistic is

$$z = \frac{x - .5n}{.5\sqrt{n}} = \frac{17 - .5(23)}{.5\sqrt{23}} = 2.29$$

Because the test statistic is normally distributed, we can calculate the p -value of the test:

$$p\text{-value} = P(Z > 2.29) = 1 - .9890 = .0110.$$

EXCEL

	A	B	C	D	E
1	Sign Test				
2					
3	Difference				<i>European - American</i>
4					
5	Positive Differences			17	
6	Negative Differences			6	
7	Zero Differences			2	
8	z Stat			2.29	
9	P(Z<=z) one-tail			0.0109	
10	z Critical one-tail			1.6449	
11	P(Z<=z) two-tail			0.0218	
12	z Critical two-tail			1.96	

INSTRUCTIONS

1. Type or import the data into two adjacent columns*. (Open Xm19-04.)
2. Click **Add-Ins**, **Data Analysis Plus**, and **Sign Test**.
3. Specify the **Variable 1 Range** (**A1:A26**), the **Variable 2 Range** (**B1:B26**), and the value of α (.05).

MINITAB**Sign Test for Median: Differences**

Sign test of median = 0.00000 versus > 0.00000

Differences	N	Below	Equal	Above	P	Median
	25	6	2	17	0.0173	1.000

Minitab prints the number of differences that are negative (Below), the number of zero differences (Equal), and the number of positive differences (Above). The p -value .0173 is based on the actual distribution of the number of positive differences, which is binomial.

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm19-04.)
2. Create a new variable, the paired difference.
3. Click **Stat**, **Nonparametrics**, and **1-Sample Sign . . .**
4. Type or select the new variable in the **Variables** box, select **Test median** and type **0**, and specify the alternative hypothesis in the **Alternative** box (**greater than**).

INTERPRET

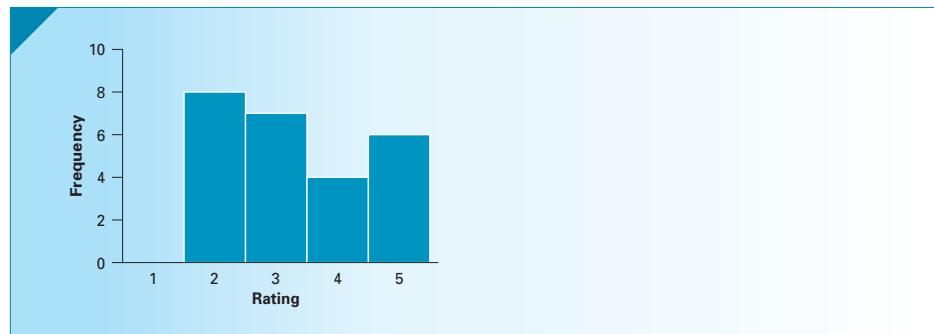
There is relatively strong evidence to indicate that people perceive the European car as providing a more comfortable ride than the North American car. There are, however, two aspects of the experiment that may detract from that conclusion. First, did the respondents know in which car they were riding? If so, they may have answered on their preconceived bias that European cars are more expensive and therefore better. If the subjects were blindfolded, we would be more secure in our conclusion. Second, was the order in which each subject rode the two cars varied? If all the subjects rode in the North American car first and the European car second, that may have influenced their ratings. The experiment should have been conducted so that the car each subject rode in first was randomly determined.

*If one or both columns contain an empty cell (representing missing data) the row must be removed.

19-2c Checking the Required Conditions

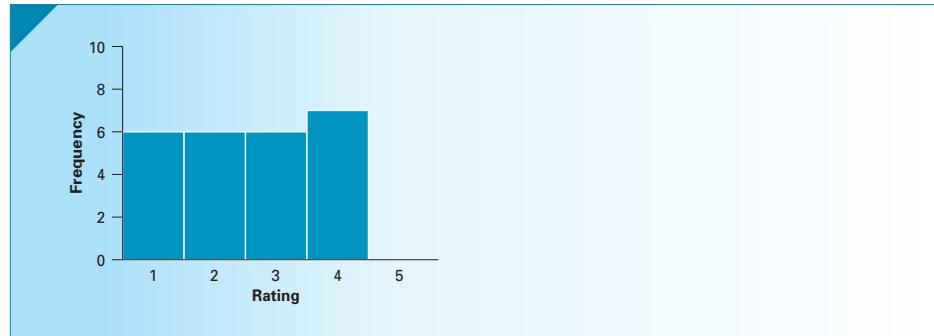
As we noted in Section 19-1, the sign test requires that the populations be identical in shape and spread. The histogram of the ratings for the European car (Figure 19.7) suggests that the ratings may be uniformly distributed between 2 and 5. The histogram of the ratings for the North American car (Figure 19.8) seems to indicate that the ratings are uniformly distributed between 1 and 4. Thus, both sets of ratings have the same shape and spread but their locations differ. The other condition is that the sample size exceeds 10.

FIGURE 19.7 Histogram of Ratings of European Car in Example 19.4



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FIGURE 19.8 Histogram of Ratings of North American Car in Example 19.4



© Cengage Learning

19-2d Wilcoxon Signed Rank Sum Test

The **Wilcoxon Signed Rank Sum Test** is used under the following circumstances:

1. The problem objective is to compare two populations.
2. The data (matched pairs differences) are interval, but not normally distributed.
3. The samples are matched pairs.

The Wilcoxon Signed Rank Sum Test is the nonparametric counterpart of the t -test of μ_D . Because the data are interval, we can refer to the Wilcoxon Signed Rank Sum Test as a test of μ_D . However, to be consistent with the other nonparametric techniques and to avoid confusion, we will express the hypotheses to be tested in the same way as we did in Section 19-1.

19-2e Test Statistic and Sampling Distribution

We begin by computing the paired differences. As we did in the sign test, we eliminate all differences that are equal to 0. Next, we rank the absolute values of the nonzero differences where 1 = smallest value and n = largest value, with n = number of nonzero differences. (We average the ranks of tied observations.) The sum of the ranks of the positive differences (denoted T^+) and the sum of the ranks of the negative differences (denoted T^-) are then calculated. We arbitrarily select T^+ , which we label T , as our test statistic.

For relatively small samples, which we define as $n \leq 30$, the critical values of T can be determined from Table 10 in Appendix B (reproduced here as Table 19.4). This table lists values of T_L and T_U for sample sizes between 6 and 30. The values of T_L and T_U in part (a) of the table are such that

$$P(T \leq T_L) = P(T \geq T_U) = .025$$

The values of T_L and T_U in part (b) of the table are such that

$$P(T \leq T_L) = P(T \geq T_U) = .05$$

Part (a) is used either in a two-tail test with $\alpha = .05$ or in a one-tail test with $\alpha = .025$. Part (b) is employed either in a two-tail test with $\alpha = .10$ or in a one-tail test with $\alpha = .05$.

For relatively large sample sizes (we will define this to mean $n > 30$), T is approximately normally distributed with mean

$$E(T) = \frac{n(n + 1)}{4}$$

and standard deviation

$$\sigma_T = \sqrt{\frac{n(n + 1)(2n + 1)}{24}}$$

Thus, the standardized test statistic is

$$z = \frac{T - E(T)}{\sigma_T}$$

TABLE 19.4 Critical Values of the Wilcoxon Signed Rank Sum Test

<i>n</i>	(a) $\alpha = .025$ One-Tail $\alpha = .05$ Two-Tail		(b) $\alpha = .05$ One-Tail $\alpha = .10$ Two-Tail	
	T_L	T_U	T_L	T_U
6	1	20	2	19
7	2	26	4	24
8	4	32	6	30
9	6	39	8	37
10	8	47	11	44
11	11	55	14	52
12	14	64	17	61
13	17	74	21	70
14	21	84	26	79
15	25	95	30	90

TABLE 19.4 (Continued)

<i>n</i>	(a) $\alpha = .025$ One-Tail $\alpha = .05$ Two-Tail		(b) $\alpha = .05$ One-Tail $\alpha = .10$ Two-Tail	
	<i>T_L</i>	<i>T_U</i>	<i>T_L</i>	<i>T_U</i>
16	30	106	36	100
17	35	118	41	112
18	40	131	47	124
19	46	144	54	136
20	52	158	60	150
21	59	172	68	163
22	66	187	75	178
23	73	203	83	193
24	81	219	92	208
25	90	235	101	224
26	98	253	110	241
27	107	271	120	258
28	117	289	130	276
29	127	308	141	294
30	137	328	152	313

EXAMPLE 19.5

DATA
Xm19-05

Comparing Flextime and Fixed Time Schedules

Traffic congestion on roads and highways costs industry billions of dollars annually as workers struggle to get to and from work. Several suggestions have been made about how to improve this situation, one of which is called *flextime*—workers are allowed to determine their own schedules (provided they work a full shift). Such workers will likely choose an arrival and departure time to avoid rush-hour traffic. In a preliminary experiment designed to investigate such a program, the general manager of a large company wanted to compare the times it took workers to travel from their homes to work at 8 A.M. with travel time under the flextime program. A random sample of 32 workers was selected. The employees recorded the time (in minutes) it took to arrive at work at 8 A.M. on Wednesday of one week. The following week, the same employees arrived at work at times of their own choosing. The travel time on Wednesday of that week was recorded. These results are listed in the following table. Can we conclude at the 5% significance level that travel times under the flextime program are different from travel times to arrive at work at 8 A.M.?

Worker	Travel Time	
	Arrival at 8:00 A.M.	Flextime Program
1	34	31
2	35	31
3	43	44
4	46	44
5	16	15
6	26	28
7	68	63

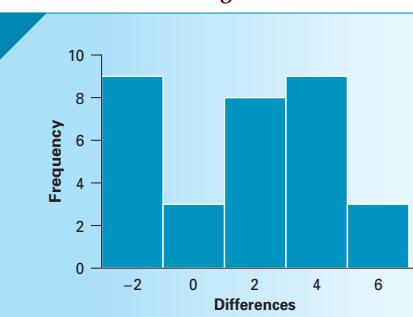
(Continued)

Worker	Travel Time	
	Arrival at 8:00 A.M.	Flextime Program
8	38	39
9	61	63
10	52	54
11	68	65
12	13	12
13	69	71
14	18	13
15	53	55
16	18	19
17	41	38
18	25	23
19	17	14
20	26	21
21	44	40
22	30	33
23	19	18
24	48	51
25	29	33
26	24	21
27	51	50
28	40	38
29	26	22
30	20	19
31	19	21
32	42	38

SOLUTION:**IDENTIFY**

The objective is to compare two populations; the data are interval and were produced from a matched pairs experiment. If matched pairs differences are normally distributed, we should apply the t -test of μ_D . To judge whether the data are normal, we computed the paired differences and drew the histogram (actually Excel did). Figure 19.9 depicts this histogram. Apparently, the normality requirement is not satisfied, indicating that we should employ the Wilcoxon Signed Rank Sum Test.

FIGURE 19.9 Histogram of the Differences for Example 19.5



Because we want to know whether the two groups of times differ, we perform a two-tail test whose hypotheses are

H_0 : The two population locations are the same

H_1 : The location of population 1 (travel times for current work schedule) is different from the location of population 2 (travel times for flextime program)

COMPUTE

M A N U A L L Y:

For each worker, we compute the difference between travel time with arrival at 8 A.M. and travel time under flextime.

Worker	Travel Time			Rank	Rank
	Arrival at 8:00 A.M.	Flextime Program	Difference		
1	34	31	3	3	21.0
2	35	31	4	4	27.0
3	43	44	-1	1	4.5
4	46	44	2	2	13.0
5	16	15	1	1	4.5
6	26	28	-2	2	13.0
7	68	63	5	5	31.0
8	38	39	-1	1	4.5
9	61	63	-2	2	13.0
10	52	54	-2	2	13.0
11	68	65	3	3	21.0
12	13	12	1	1	4.5
13	69	71	-2	2	13.0
14	18	13	5	5	31.0
15	53	55	-2	2	13.0
16	18	19	-1	1	4.5
17	41	38	3	3	21.0
18	25	23	2	2	13.0
19	17	14	3	3	21.0
20	26	21	5	5	31.0
21	44	40	4	4	27.0
22	30	33	-3	3	21.0
23	19	18	1	1	4.5
24	48	51	-3	3	21.0
25	29	33	-4	4	27.0
26	24	21	3	3	21.0
27	51	50	1	1	4.5
28	40	38	2	2	13.0
29	26	22	4	4	27.0
30	20	19	1	1	4.5
31	19	21	-2	2	13.0
32	42	38	4	4	27.0
				$T^+ = 367.5$	$T^- = 160.5$

The differences and the absolute values of the differences are calculated. We rank the absolute differences. (If there were any zero differences, we would eliminate them before ranking the absolute differences.) Ties are resolved by calculating the averages. The ranks of the negative differences are offset to facilitate the summing of the ranks. The rank sums of the positive and negative differences are

$$T^+ = 367.5 \quad \text{and} \quad T^- = 160.5$$

The test statistic is

$$z = \frac{T - E(T)}{\sigma_T}$$

where

$$T = T^+ = 367.5$$

$$E(T) = \frac{n(n + 1)}{4} = \frac{32(33)}{4} = 264$$

$$\sigma_T = \sqrt{\frac{n(n + 1)(2n + 1)}{24}} = \sqrt{\frac{32(33)(65)}{24}} = 53.48$$

Thus,

$$z = \frac{T - E(T)}{\sigma_T} = \frac{367.5 - 264}{53.48} = 1.94$$

The rejection region is

$$z < -z_{\alpha/2} = -z_{.025} = -1.96 \quad \text{or} \quad z > z_{\alpha/2} = z_{.025} = 1.96$$

The *p*-value is $2P(Z > 1.94) = 2(1 - .9738) = .0524$

EXCELC

	A	B	C	D
1	Wilcoxon Signed Rank Sum Test			
2				
3	Difference		8:00-Arr - Flextime	
4				
5	T ⁺		367.5	
6	T ⁻		160.5	
7	Observations (for test)		32	
8	z Stat		1.94	
9	P(Z<=z) one-tail		0.0265	
10	z Critical one-tail		1.6449	
11	P(Z<=z) two-tail		0.0530	
12	z Critical two-tail		1.96	

INSTRUCTIONS

1. Type or import the data into two adjacent columns*. (Open Xm19-05.)
2. Click Add-Ins, Data Analysis Plus, and Wilcoxon Signed Rank Sum Test.
3. Specify the Variable 1 Range (A1:A33), the Variable 2 Range (B1:B33), and the value of α (.05).

*If one or both columns contain an empty cell (representing missing data) the row must be removed.

MINITAB

Wilcoxon Signed Rank Test: Difference					
Test of median = 0.000000 versus median not = 0.000000					
	N	for	Wilcoxon	P	Estimated
Difference	32	Test	Statistic	P	Median
	32		367.5	0.054	1.000

The output includes the original sample size, the number of nonzero differences (N for Test), the value of T^+ (Wilcoxon Statistic 367.5), and the p -value (0.054).

INSTRUCTIONS

1. Type or import the data into two columns. (Open Xm19-05.)
2. Follow the same steps as in the sign test. At step 2, click **Stat**, **Nonparametrics**, and **1-Sample Wilcoxon....**

INTERPRET

There is not enough evidence to infer that flextime commutes are different from the commuting times under the current schedule. This conclusion may be due primarily to the way in which this experiment was performed. All of the drivers recorded their travel time with 8 A.M. arrival on the first Wednesday and their flextime travel time on the second Wednesday. If the second day's traffic was heavier than usual, that may account for the conclusion reached. As we pointed out in Example 19.4, the order of schedules should have been randomly determined for each employee. In this way, the effect of varying traffic conditions could have been minimized.

Here is how we recognize when to use the two techniques introduced in this section.

Factors That Identify the Sign Test

1. **Problem objective:** Compare two populations
2. **Data type:** Ordinal
3. **Experimental design:** Matched pairs

Factors That Identify the Wilcoxon Signed Rank Sum Test

1. **Problem objective:** Compare two populations
2. **Data type:** Interval
3. **Distribution of differences:** Nonnormal
4. **Experimental design:** Matched pairs



EXERCISES

- 19.35** In a matched pairs experiment, if we find 30 negative, 5 zero, and 15 positive differences, perform the sign test to determine whether the two population locations differ. (Use a 5% significance level.)

- 19.36** Suppose that in a matched pairs experiment we find 28 positive differences, 7 zero differences, and 41 negative differences. Can we infer at the 10% significance level that the location of population 1 is to the left of the location of population 2?

- 19.37** A matched pairs experiment yielded the following results:

Positive differences: 18

Zero differences: 0

Negative differences: 12

Can we infer at the 5% significance level that the location of population 1 is to the right of the location of population 2?

- 19.38** *Xr19-38* Use the sign test on the following data to determine whether the location of population 1 is to the right of the location of population 2. (Use $\alpha = .05$.)

Pair: 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16

Sample 1 5 3 4 2 3 4 3 5 4 3 4 5 4 5 3 2

Sample 2 3 2 4 3 3 1 3 4 2 5 1 2 2 3 1 2

- 19.39** Given the following statistics from a matched pairs experiment, perform the Wilcoxon signed rank sum test to determine whether we can infer at the 5% significance level that the two population locations differ.

$$T^+ = 660 \quad T^- = 880 \quad n = 55$$

- 19.40** A matched pairs experiment produced the following statistics. Conduct a Wilcoxon signed rank sum test to determine whether the location of population 1 is to the right of the location of population 2. (Use $\alpha = .01$.)

$$T^+ = 3,457 \quad T^- = 2,429 \quad n = 108$$

- 19.41** Perform the Wilcoxon signed rank sum test for the following matched pairs to determine whether the two population locations differ. (Use $\alpha = .10$.)

Pair	1	2	3	4	5	6
Sample 1	9	12	13	8	7	10
Sample 2	5	10	11	9	3	9

- 19.42** *Xr19-42* Perform the Wilcoxon signed rank sum test to determine whether the location of population 1 differs from the location of population 2 given the data shown here. (Use $\alpha = .05$.)

Pair	1	2	3	4	5	6	7	8	9	10	11	12
Sample 1	18.2	14.1	24.5	11.9	9.5	12.1	10.9	16.7	19.6	8.4	21.7	23.4
Sample 2	18.2	14.1	23.6	12.1	9.5	11.3	9.7	17.6	19.4	8.1	21.9	21.6

Exercises 19.43 to 19.57 require the use of a computer and software. Use a 5% significance level, unless specified otherwise.

Developing an Understanding of Statistical Concepts

- 19.43** a. *Xr19-43a* In a taste test of a new beer 100 people rated the new beer and the leading brand on the market. The possible ratings were Poor, Fair, Good, Very good, and Excellent. The responses for the new beer and the leading beer were recorded using a 1-2-3-4-5 coding system. Can we infer that the new beer is more highly rated than the leading brand?
- b. *Xr19-43b* The responses were recoded so that 3 = Poor, 8 = Fair, 22 = Good, 37 = Very good, and 55 = Excellent. Can we infer that the new beer is more highly rated than the leading brand?
- c. Why are the answers to Parts (a) and (b) identical?

- 19.44** a. *Xr19-44a* A random sample of 50 people was asked to rate two brands of ice cream using the following responses:

Delicious
OK
Not bad
Terrible

The responses were converted to codes 4, 3, 2, and 1, respectively. Can we infer that Brand A is preferred?

- b. *Xr19-44b* The responses were recoded using the values 28-25-16-3. Can we infer that Brand A is preferred?
- c. Compare your answers for Parts (a) and (b). Are they identical? Explain why?

- 19.45** *Xr19-45* Refer to Example 19.4. Suppose that the responses have been recorded in the following way:

6 = Ride is very uncomfortable.
24 = Ride is quite uncomfortable.
28 = Ride is neither uncomfortable nor comfortable.
53 = Ride is quite comfortable.
95 = Ride is very comfortable.

- a. Do these data allow us to conclude that the European car is perceived to be more comfortable than the North American car?

- b. Compare your answer with that obtained in Example 19.4. Explain why the results are identical.
- 19.46** a. **Xr19-46** Data from a matched pairs experiment were recorded. Use the sign test to determine whether the population locations differ.
 b. Repeat Part (a) using the Wilcoxon signed rank sum test.
 c. Why do the answers to Parts (a) and (b) differ?
- 19.47** a. **Xr19-47** Data from a matched pairs experiment were recorded. Use the sign test to determine whether the population locations differ.
 b. Repeat Part (a) using the Wilcoxon signed rank sum test.
 c. Why do the results of Parts (a) and (b) differ?

Applications

Exercises 19.48 to 19.57 may be solved manually. See Appendix A for the sample statistics.

- 19.48** **Xr19-48** Research scientists at a pharmaceutical company have recently developed a new nonprescription sleeping pill. They decide to test its effectiveness by measuring the time it takes for people to fall asleep after taking the pill. Preliminary analysis indicates that the time to fall asleep varies considerably from one person to another. Consequently, they organize the experiment in the following way. A random sample of 100 volunteers who regularly suffer from insomnia is chosen. Each person is given one pill containing the newly developed drug and one placebo. (A placebo is a pill that contains absolutely no medication.) Participants are told to take one pill one night and the second pill one night a week later. (They do not know whether the pill they are taking is the placebo or the new drug, and the order of use is random.) Each participant is fitted with a device that measures the time until sleep occurs. Can we conclude that the new drug is effective? (This exercise is identical to Exercise 13.92, except for the data.)
- 19.49** **Xr19-49** Suppose that the housework study referred to in Exercise 19.10 was repeated with some changes. In the revised experiment, 60 women were asked last year and again this year how many hours of housework they perform weekly. Can we conclude at the 1% significance level that women as a group are doing less housework now than last year?
- 19.50** **Xr19-50** At the height of the energy shortage during the 1970s, governments were actively seeking ways to persuade consumers to reduce their energy consumption. Among other efforts undertaken, several advertising campaigns were launched. To provide input on how to design effective advertising

messages, a poll was taken in which people were asked how concerned they were about shortages of gasoline and electricity. There were four possible responses to the questions:

- Not concerned at all (1)
- Not too concerned (2)
- Somewhat concerned (3)
- Very concerned (4)

A poll of 150 individuals was undertaken. Do these data provide enough evidence to allow us to infer that concern about a gasoline shortage exceeded concern about an electricity shortage?

- 19.51** **Xr19-51** A locksmith is in the process of selecting a new key-cutting machine. If there is a difference in key-cutting speed between the two machines under consideration, he will purchase the faster one. If there is no difference, he will purchase the cheaper machine. The times (in seconds) required to cut each of the 35 most common types of keys were recorded. What should he do?
- 19.52** **Xr19-52** A large sporting-goods store located in Florida is planning a renovation that will result in an increase in the floor space for one department. The manager of the store has narrowed her choice about which department's floor space to increase to two possibilities: the tennis-equipment department or the swimming-accessories department. The manager would like to enlarge the tennis-equipment department because she believes that this department improves the overall image of the store. She decides, however, that if the swimming-accessories department can be shown to have higher gross sales, she will choose that department. She has collected each of the two departments' weekly gross sales data for the past 32 weeks. Which department should be enlarged?
- 19.53** **Xr19-53** Does the brand name of an ice cream affect consumers' perceptions of it? The marketing manager of a major dairy pondered this question. She decided to ask 60 randomly selected people to taste the same flavor of ice cream in two different dishes. The dishes contained exactly the same ice cream but were labeled differently. One was given a name that suggested that its maker was European and sophisticated; the other was given a name that implied that the product was domestic and inexpensive. The tasters were asked to rate each ice cream on a 5-point scale, where 1 = Poor, 2 = Fair, 3 = Good, 4 = Very good, and 5 = Excellent. Do the results allow the manager to conclude at the 10% significance level that the European brand is preferred?
- 19.54** **Xr19-54** Do children feel less pain than adults? That question was addressed by nursing professors at the University of Alberta and the University of

Saskatchewan. Suppose that in a preliminary study, 50 8-year-old children and their mothers were subjected to moderately painful pressure on their hands. Each was asked to rate the level of pain as Very severe (4), Severe (3), Moderate (2), or Weak (1). The data were recorded using the codes in parentheses. Can we conclude at the 1% significance level that children feel less pain than adults?

- 19.55** *Xr19-55* In a study to determine whether gender affects salary offers for graduating MBA students, 45 pairs of students were selected. Each pair consisted of a male and a female student who had almost identical grade-point averages, courses taken, ages, and previous work experience. The highest salary offered to each student upon graduation was recorded. Is there sufficient evidence to allow us to conclude that the salary offers differ between men and women? (This exercise is identical to Exercise 13.97, except for the data.)

- 19.56** *Xr19-56* Admissions officers at universities and colleges face the problem of comparing grades achieved at different high schools. As a step toward developing a more informed interpretation of such grades, an admissions officer at a large state university conducts the following experiment. The records of 100 students from the same local high school (high school 1) who just completed their first year at the university were selected. Each of

these students was paired (according to average grade in the last year of high school) with a student from another local high school (high school 2) who also just completed the first year at the university. For each matched pair, the average letter grades (4 = A, 3 = B, 2 = C, 1 = D, or 0 = F) in the first year of university study were recorded. Do these results allow us to conclude that, in comparing two students with the same high-school average (one from high school 1 and the other from high school 2), preference in admissions should be given to the student from high school 1?

- 19.57** *Xr19-57* Some movie studios believe that by adding sexually explicit scenes to the home video version of a movie, they can increase the movie's appeal and profitability. A studio executive decided to test this belief. She organized a study that involved 40 movies that were rated PG-13. Versions of each movie were created by adding scenes that changed the rating to R. The two versions of the movies were then made available to rental shops. For each of the 40 pairs of movies, the total number of rentals in one major city during a 1-week period was recorded.
- Do these data provide enough evidence to support the belief?
 - As an analyst for a movie studio write a report detailing the statistical analysis.



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 19.58** *ANES2008** Is there sufficient evidence to conclude that attention paid to national network news about the presidential campaign (ATTN1) differs from the attention paid to local news on television about the presidential campaign (ATTN2: 1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None)?

- 19.59** *ANES2008** Conduct a statistical test to determine whether there is enough evidence to conclude that attention paid to newspaper articles (ATTN3) differs from the attention paid to radio news about the presidential campaign (ATTN4: 1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None)?

19-3 / KRUSKAL-WALLIS TEST AND FRIEDMAN TEST

In this section we introduce two statistical procedures designed to compare two or more populations. The first test is the **Kruskal-Wallis Test**, which is applied to problems with the following characteristics:

- 1.** The problem objective is to compare two or more populations.
- 2.** The data are either ordinal or interval, but nonnormal.
- 3.** The samples are independent.

When the data are interval and normal, we use the one-way analysis of variance F -test presented in Section 14-1 to determine whether differences exist. When the data are not normal, we will treat the data as if they were ordinal and employ the Kruskal–Wallis Test.

The second procedure is the **Friedman Test**, which is applied to problems with the following characteristics:

- 1.** The problem objective is to compare two or more populations.
- 2.** The data are either ordinal or interval, but not normal.
- 3.** The data are generated from a randomized block experiment.

The parametric counterpart is the two-way analysis of variance, which we use when the data are interval and normal.

19-3a Hypotheses

The null and alternative hypotheses for both tests are similar to those we specified in the analysis of variance. Because the data are ordinal or are treated as ordinal, however, we test population locations instead of population means. In all applications of the Kruskal–Wallis Test and the Friedman Test, the null and alternative hypotheses are

$$\begin{aligned} H_0: & \text{ The locations of all } k \text{ populations are the same} \\ H_1: & \text{ At least two population locations differ} \end{aligned}$$

Here, k represents the number of populations to be compared.

19-3b Kruskal–Wallis Test

Test Statistic The test statistic is calculated in a way that closely resembles the way in which the Wilcoxon Rank Sum Test was calculated. The first step is to rank all the observations. As before, 1 = smallest observation and n = largest observation, where $n = n_1 + n_2 + \dots + n_k$. In case of ties, average the ranks.

If the null hypothesis is true, the ranks should be evenly distributed among the k samples. The degree to which this is true is judged by calculating the rank sums (labeled T_1, T_2, \dots, T_k). The last step is to calculate the test statistic, which is denoted H .

Test Statistic for Kruskal–Wallis Test

$$H = \left[\frac{12}{n(n+1)} \sum_{j=1}^k \frac{T_j^2}{n_j} \right] - 3(n+1)$$

Although it is impossible to see from this formula, if the rank sums are similar, the test statistic will be small. As a result, a small value of H supports the null hypothesis. Conversely, if considerable differences exist between the rank sums, the test statistic will be large. To judge the value of H , we need to know its sampling distribution.

Sampling Distribution The distribution of the test statistic can be derived in the same way we derived the sampling distribution of the test statistic in the Wilcoxon Rank Sum Test. In other words, we can list all possible combinations of ranks and their probabilities to yield the sampling distribution. A table of critical values can then be determined. However, this is necessary only for small sample sizes. For sample sizes greater than or equal to 5, the test statistic H is approximately chi-squared distributed with $k - 1$ degrees of freedom. Recall that we introduced the chi-squared distribution in Section 8-4.

Rejection Region and p -Value As we noted previously, large values of H are associated with different population locations. Consequently, we want to reject the null hypothesis if H is sufficiently large. Thus, the rejection region is

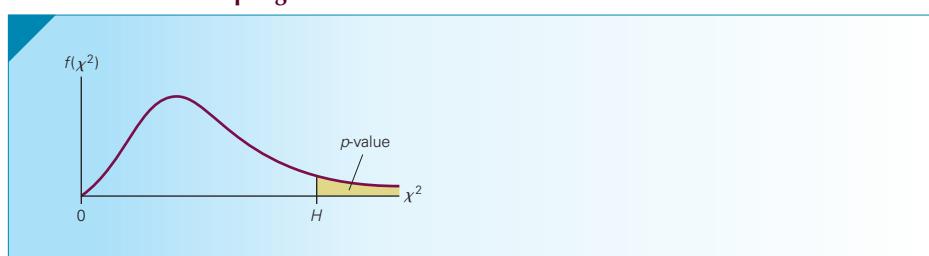
$$H > \chi_{\alpha, k-1}^2$$

and the p -value is

$$P(\chi^2 > H)$$

Figure 19.10 describes this sampling distribution and the p -value.

FIGURE 19.10 Sampling Distribution of H



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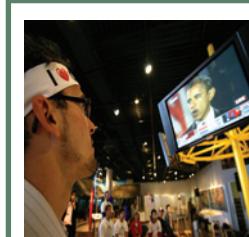
General Social Survey

Do Democrats, Independents, and Republicans Differ in the Number of Times per Week That They Read Newspapers?

SOLUTION:

IDENTIFY

The problem objective is to compare three populations (Democrats, Independents, and Republicans). The data are ordinal and the samples are independent. These factors are sufficient to justify the use of the Kruskal-Wallis test. The null and alternative hypotheses are:



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- H_0 : The locations of all three populations are the same
 H_1 : At least two population locations differ

COMPUTE

EXCEL

	A	B	C
1	Kruskal-Wallis Test		
2			
3	Group	Rank Sum	Observations
4	Democrats	280590.5	464
5	Independents	337009.0	511
6	Republicans	180616.5	288
7			
8	H Stat		5.5532
9	df		2
10	p-value		0.0622
11	chi-squared Critical		5.9915

INSTRUCTIONS

1. Type or import the data into adjacent columns. (Open GSS2012*.)
2. We unstacked the data and stored the values of READ in three columns representing Democrats, Independents, and Republicans.
3. Click Add-Ins, Data Analysis Plus, and Kruskal-Wallis Test
4. Specify the Input Range and the value of α (.05).

MINITAB

Kruskal-Wallis Test: READ versus Party

1263 cases were used
 640 cases contained missing values

Kruskal-Wallis Test on READ

Party	N	Median	Ave Rank	Z
1	464	3.000	604.7	-2.03
2	511	3.000	659.5	2.21
3	288	3.000	627.1	-0.26
Overall	1263		632.0	

H = 5.55 DF = 2 P = 0.062
 H = 5.82 DF = 2 P = 0.054 (adjusted for ties)

(Continued)

INSTRUCTIONS

1. The data must be stacked so that the responses are in one column and the codes identifying the shift are in a second column.
2. Click **Stat**, **Nonparametrics**, and **Kruskal–Wallis**
3. Select the name of the **Response** variable and the name of **Factor** variable.

INTERPRET

There is not enough evidence at the 5% significance level to infer that a difference in frequency of newspaper reading differs between the three political affiliations.

19-3c Kruskal–Wallis Test and the Wilcoxon Rank Sum Test

When the Kruskal–Wallis Test is used to test for a difference between two populations, it will produce the same outcome as the two-tail Wilcoxon Rank Sum Test. However, the Kruskal–Wallis Test can determine only whether a difference exists. To determine, for example, if one population is located to the right of another, we must apply the Wilcoxon Rank Sum Test.

19-3d Friedman Test

Test Statistic To calculate the test statistic, we first rank each observation within each block, where $1 =$ smallest observation and $k =$ largest observation, averaging the ranks of ties. Then we compute the rank sums, which we label T_1, T_2, \dots, T_k . The test statistic is defined as follows. (Recall that $b =$ number of blocks.)

Test Statistic for the Friedman Test

$$F_r = \left[\frac{12}{b(k)(k+1)} \sum_{j=1}^k T_j^2 \right] - 3b(k+1)$$

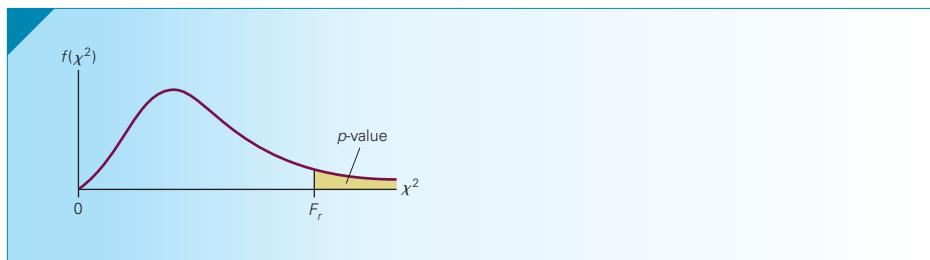
Sampling Distribution of the Test Statistic The test statistic is approximately chi-squared distributed with $k - 1$ degrees of freedom, provided that either k or b is greater than or equal to 5. As was the case with the Kruskal–Wallis Test, we reject the null hypothesis when the test statistic is large. Hence, the rejection region is

$$F_r > \chi_{\alpha, k-1}^2$$

and the p -value is

$$P(\chi^2 > F_r)$$

Figure 19.11 depicts the sampling distribution and p -value.

FIGURE 19.11 Sampling Distribution of F_r 

This test, like all the other nonparametric tests, requires that the populations being compared be identical in shape and spread.

EXAMPLE 19.6

DATA
Xm19-06

Comparing Managers' Evaluations of Job Applicants

The personnel manager of a national accounting firm has been receiving complaints from senior managers about the quality of recent hirings. All new accountants are hired through a process in which four managers interview the candidate and rate her or him on several dimensions, including academic credentials, previous work experience, and personal suitability. Each manager then summarizes the results and produces an evaluation of the candidate. There are five possibilities:

1. The candidate is in the top 5% of applicants.
2. The candidate is in the top 10% of applicants, but not in the top 5%.
3. The candidate is in the top 25% of applicants, but not in the top 10%.
4. The candidate is in the top 50% of applicants, but not in the top 25%.
5. The candidate is in the bottom 50% of applicants.

The evaluations are then combined in making the final decision. The personnel manager believes that the quality problem is caused by the evaluation system. However, she needs to know whether there is general agreement or disagreement between the interviewing managers in their evaluations. To test for differences between the managers, she takes a random sample of the evaluations of eight applicants. The results are shown below. What conclusions can the personnel manager draw from these data? Employ a 5% significance level.

Applicant	Manager			
	1	2	3	4
1	2	1	2	2
2	4	2	3	2
3	2	2	2	3
4	3	1	3	2
5	3	2	3	5
6	2	2	3	4
7	4	1	5	5
8	3	2	5	3

SOLUTION:**IDENTIFY**

The problem objective is to compare the four populations of managers' evaluations, which we can see are ordinal data. This experiment is identified as a randomized block design because the eight applicants were evaluated by all four managers. (The treatments are the managers, and the blocks are the applicants.) The appropriate statistical technique is the Friedman Test. The null and alternative hypotheses are as follows:

H_0 : The locations of all four populations are the same

H_1 : At least two population locations differ

COMPUTE**MANUALLY:**

The rejection region is

$$F_r > \chi^2_{\alpha,k-1} = \chi^2_{.05,3} = 7.81$$

The following table demonstrates how the ranks are assigned and the rank sums calculated. Notice how the ranks are assigned by moving across the rows (blocks) and the rank sums computed by adding down the columns (treatments).

Applicant	Manager			
	1 (Rank)	2 (Rank)	3 (Rank)	4 (Rank)
1	2(3)	1(1)	2(3)	2(3)
2	4(4)	2(1.5)	3(3)	2(1.5)
3	2(2)	2(2)	2(2)	3(4)
4	3(3.5)	1(1)	3(3.5)	2(2)
5	3(2.5)	2(1)	3(2.5)	5(4)
6	2(1.5)	2(1.5)	3(3)	4(4)
7	4(2)	1(1)	5(3.5)	5(3.5)
8	3(2.5)	2(1)	5(4)	3(2.5)
	$T_1 = 21$	$T_2 = 10$	$T_3 = 24.5$	$T_4 = 24.5$

The value of the test statistic is

$$\begin{aligned} F_r &= \left[\frac{12}{b(k)(k+1)} \sum_{j=1}^k T_j^2 \right] - 3b(k+1) \\ &= \left[\frac{12}{(8)(4)(5)} (21^2 + 10^2 + 24.5^2 + 24.5^2) \right] - 3(8)(5) \\ &= 10.61 \end{aligned}$$

EXCEL

	A	B	C
1	Friedman Test		
2			
3	Group		Rank Sum
4	Manager 1		21
5	Manager 2		10
6	Manager 3		24.5
7	Manager 4		24.5
8			
9	Fr Stat		10.61
10	df		3
11	p-value		0.0140
12	chi-squared Critical		7.8147

INSTRUCTIONS

1. Type or import the data into adjacent columns*. (Open Xm19-06.)
2. Click **Add-Ins**, **Data Analysis Plus**, and **Friedman Test**.
3. Specify the **Input Range** (A1:D9) and the value of α (.05).

MINITAB**Friedman Test: Ratings Versus Manager Blocked by Applicant**

S = 10.61 DF = 3 P = 0.014
 S = 12.86 DF = 3 P = 0.005 (adjusted for ties)

Manager	N	Est Median	Sum of Ranks
1	8	2.8750	21.0
2	8	2.0000	10.0
3	8	3.0000	24.5
4	8	3.1250	24.5

Grand median = 2.7500

INSTRUCTIONS

1. Type or import the data in stacked format. The responses are stored in one column, the treatment codes are stored in another column, and the block codes are stored in a third column.
2. Click **Stat**, **Nonparametrics**, and **Friedman . . .**
3. Select the **Response** variable, the **Treatment** variable, and the **Blocks** variable.

INTERPRET

There appears to be sufficient evidence to indicate that the managers' evaluations differ. The personnel manager should attempt to determine why the evaluations differ. Is there a problem with the way in which the assessments are conducted, or are some managers using different criteria? If it is the latter, those managers may need additional training.

*If one or more columns contain an empty cell (representing missing data) the entire row must be removed.

19-3e The Friedman Test and the Sign Test

The relationship between the Friedman and sign tests is the same as the relationship between the Kruskal–Wallis and Wilcoxon Rank Sum Tests; that is, we can use the Friedman Test to determine whether two populations differ. The conclusion will be the same as that produced from the sign test. However, we can use the Friedman Test to determine only whether a difference exists. If we want to determine whether one population is, for example, to the left of another population, we must use the sign test.

Here is a list of the factors that tell us when to use the Kruskal Wallis Test and the Friedman Test.

Factors That Identify the Kruskal–Wallis Test

1. **Problem objective:** Compare two or more populations
2. **Data type:** Ordinal or interval but not normal
3. **Experimental design:** Independent samples

Factors That Identify the Friedman Test

1. **Problem objective:** Compare two or more populations
2. **Data type:** Ordinal or interval but not normal
3. **Experimental design:** Randomized blocks



EXERCISES

- 19.60** Conduct the Kruskal–Wallis test on the following statistics. Use a 5% significance level.

$$T_1 = 984 \quad n_1 = 23$$

$$T_2 = 1,502 \quad n_2 = 36$$

$$T_3 = 1,430 \quad n_3 = 29$$

- 19.61** From the following statistics, use the Kruskal–Wallis test (with $\alpha = .01$) to determine whether the population locations differ.

$$T_1 = 1,207 \quad n_1 = 25$$

$$T_2 = 1,088 \quad n_2 = 25$$

$$T_3 = 1,310 \quad n_3 = 25$$

$$T_4 = 1,445 \quad n_4 = 25$$

- 19.62** Apply the Kruskal–Wallis test and the following statistics to determine whether there is enough statistical evidence at the 10% significance level to infer that the population locations differ.

$$T_1 = 3,741 \quad n_1 = 47$$

$$T_2 = 1,610 \quad n_2 = 29$$

$$T_3 = 4,945 \quad n_3 = 67$$

- 19.63** Use the Kruskal–Wallis test on the following data to determine whether the population locations differ. (Use $\alpha = .05$.)

Sample 1: 27 33 18 29 41 52 75

Sample 2: 37 12 17 22 30

Sample 3: 19 12 33 41 28 18

- 19.64** Using the Kruskal–Wallis test, determine whether there is enough evidence provided by the accompanying data to enable us to infer that at least two population locations differ. (Use $\alpha = .05$.)

Sample 1: 25 15 20 22 23

Sample 2: 19 21 23 22 28

Sample 3: 27 25 22 29 28

Developing an Understanding of Statistical Concepts

Exercise 19.65 requires the use of a computer and software.

- 19.65 a. **Xr19-65a** Four random samples of 50 people each were asked to rate four different computer printers in terms of their ease of use. The responses are:

Very easy to use
Easy to use
Difficult to use
Very difficult to use

The responses were coded using a 4-3-2-1 system. Do these data yield enough evidence at the 5% significance level to infer that differences in ratings exist among the four printers?

- b. **Xr19-65b** The responses were recoded using a 25-22-5-2 system. Do these data yield enough evidence to infer that differences in ratings exist between the four printers?
c. Why are the results of Parts (a) and (b) identical?
- 19.66 **Xr19-66** Apply the Friedman test to the accompanying table of data to determine whether we can conclude that at least two population locations differ. (Use $\alpha = .10$.)

Block	Treatment			
	1	2	3	4
1	10	12	15	9
2	8	10	11	6
3	13	14	16	11
4	9	9	12	13
5	7	8	14	10

- 19.67 **Xr19-67** The following data were generated from a blocked experiment. Conduct a Friedman test to determine whether at least two population locations differ. (Use $\alpha = .05$.)

Block	Treatment		
	1	2	3
1	7.3	6.9	8.4
2	8.2	7.0	7.3
3	5.7	6.0	8.1
4	6.1	6.5	9.1
5	5.9	6.1	8.0

Developing an Understanding of Statistical Concepts

Exercises 19.68 to 19.93 require the use of a computer and software. Use a 5% significance level.

- 19.68 a. **Xr19-68a** A random sample of 30 people was asked to rate each of four different premium brands of coffee. The ratings are:

Excellent
Good
Fair
Poor

The responses were assigned numbers 1 through 4, respectively. Can we infer that differences exist between the ratings of the four brands of coffee?

- b. **Xr19-68b** Suppose that the codes were 12, 31, 66, and 72, respectively. Can we infer that differences exist between the ratings of the four brands of coffee?
c. Compare your answers in Parts (a) and (b). Why are they identical?

- 19.69 a. **Xr19-69** Refer to Example 19.6. Suppose that the responses were recoded so that the numbers equaled the midpoint of the range of percentiles. That is:

97.5 = The candidate is in the top 5% of applicants
92.5 = The candidate is in the top 10% of applicants, but not in the top 5%
82.5 = The candidate is in the top 25% of applicants, but not in the top 10%
62.5 = The candidate is in the top 50% of applicants, but not in the top 25%
25 = The candidate is in the bottom 50% of applicants

Can we conclude that differences exist between the ratings assigned by the four professors?

- b. Compare your answer in Part (a) with the one obtained in Example 19.6. Are they the same? Explain why.

Applications (Unless specified otherwise use a 5% significance level.)

Exercises 19.70 to 19.84 can be solved manually. See Appendix A for the sample statistics.

- 19.70 **Xr19-70** In an effort to determine whether differences exist between three methods of teaching statistics, a professor of business taught his course differently in each of three large sections. In the first section, he taught by lecturing; in the second, he taught by the case method; and in the third, he used a computer software package extensively. At the end of the semester, each student was asked to evaluate the course on a 7-point scale, where 1 = Atrocious, 2 = Poor, 3 = Fair, 4 = Average, 5 = Good, 6 = Very good, and 7 = Excellent. From each section, the professor chose 25 evaluations at random. Is there evidence that differences in student satisfaction exist with respect to at least two of the three teaching methods?

- 19.71 **Xr19-71** Applicants to MBA programs must take the Graduate Management Admission Test (GMAT). There are several companies that offer assistance in preparing for the test. To determine whether they work, and if so, which one is best, an experiment was conducted. Several hundred MBA applicants were surveyed and asked to report their GMAT score and which, if any, GMAT preparation course they took.

The responses are course A, course B, course C, or no preparatory course. Do these data allow us to infer that there are differences between the four groups of GMAT scores?

- 19.72** **Xr19-72** Ten judges were asked to test the quality of four different brands of orange juice. The judges assigned scores using a 5-point scale where 1 = Bad, 2 = Poor, 3 = Average, 4 = Good, and 5 = Excellent. The results are shown here. Can we conclude at the 5% significance level that there are differences in sensory quality between the four brands of orange juice?

		Orange Juice Brand			
Judge		1	2	3	4
1		3	5	4	3
2		2	3	5	4
3		4	4	3	4
4		3	4	5	2
5		2	4	4	3
6		4	5	5	3
7		3	3	4	4
8		2	3	3	3
9		4	3	5	4
10		2	4	5	3

- 19.73** **Xr19-73** The manager of a chain of electronic-products retailers is trying to decide on a location for its newest store. After a thorough analysis, the choice has been narrowed to three possibilities. An important factor in the decision is the number of people passing each location. The number of people passing each location per day was counted during 30 days.

- Which techniques should be considered to determine whether the locations differ? What are the required conditions? How do you select a technique?
- Can management conclude that there are differences in the numbers of people passing the three locations if the number of people passing each location is not normally distributed?

- 19.74** **Xr19-74** In recent years, lack of confidence in the U.S. Postal Service has led many companies to send all of their correspondence by private courier. A large company is in the process of selecting one of three possible couriers to act as its sole delivery method. To help make the decision, an experiment was performed whereby letters were sent using each of the three couriers at 12 different times of the day to a delivery point across town. The number of minutes required for delivery was recorded. Can we conclude that there are differences in delivery times between the three couriers? (This exercise is identical to Exercise 14.39, except for the data.)

- 19.75** **Xr19-75** The manager of a personnel company is in the process of examining her company's advertising

programs. Currently, the company advertises in each of the three local newspapers for a wide variety of positions, including computer programmers, secretaries, and receptionists. The manager has decided that only one newspaper will be used if it can be determined that there are differences between the newspapers in the number of inquiries. The following experiment was performed. For 1 week (6 days), six different jobs were advertised in each of the three newspapers. The number of inquiries was counted, and the results appear in the accompanying table.

Job Advertised	Newspaper		
	1	2	3
Receptionist	14	17	12
Systems analyst	8	9	6
Junior secretary	25	20	23
Computer programmer	12	15	10
Legal secretary	7	10	5
Office manager	5	9	4

- What techniques should be considered to apply in reaching a decision? What are the required conditions? How do we determine whether the conditions are satisfied?
- Assuming that the data are not normally distributed, can we conclude at the 5% significance level that differences exist between the newspapers' abilities to attract potential employees?

- 19.76** **Xr19-76** Because there are no national or regional standards, it is difficult for university admission committees to compare graduates of different high schools. University administrators have noted that an 80% average at a high school with low standards may be equivalent to a 70% average at another school with higher standards of grading. In an effort to more equitably compare applications, a pilot study was initiated. Random samples of students who were admitted the previous year from four local high schools were drawn. All the students entered the business program with averages between 70% and 80%. Their average grades in the first year at the university were computed. Can the university admissions officer conclude that there are differences in grading standards between the four high schools? (This exercise is identical to Exercise 14.9, except for the data.)

- 19.77** **Xr19-77** Many North Americans suffer from high levels of cholesterol, which can lead to heart attacks. For those with very high levels (over 280), doctors prescribe drugs to reduce cholesterol levels. A pharmaceutical company has recently developed three such drugs. To determine whether any differences exist in their benefits, an experiment was organized. The company selected 25 groups of four men, each of whom had cholesterol levels in excess of 280. In each group, the men were matched according to

age and weight. The drugs were administered over a 2-month period, and the reduction in cholesterol was recorded. Do these results allow the company to conclude differences exist between the four new drugs? (This exercise is identical to Example 14.3, except for the data.)

- 19.78** **Xr19-78** A well-known soft-drink manufacturer has used the same secret recipe for its product since its introduction over 100 years ago. In response to a decreasing market share, however, the president of the company is contemplating changing the recipe. He has developed two alternative recipes. In a preliminary study, he asked 20 people to taste the original recipe and the two new recipes. He asked each to evaluate the taste of the product on a 5-point scale, where 1 = Awful, 2 = Poor, 3 = Fair, 4 = Good, and 5 = Wonderful. The president decides that unless significant differences exist between evaluations of the products, he will not make any changes. Can we conclude that there are differences in the ratings of the three recipes?

- 19.79** **Xr19-79** The management of fast-food restaurants is extremely interested in knowing how their customers rate the quality of food and service and the cleanliness of the restaurants. Customers are given the opportunity to fill out customer comment cards. Suppose that one franchise wanted to compare how customers rate the three shifts (4:00 P.M. to midnight, midnight to 8:00 A.M., and 8:00 A.M. to 4:00 P.M.). In a preliminary study, 100 customer cards were randomly selected from each shift. The responses to the question concerning speed of service were recorded, where 4 = Excellent, 3 = Good, 2 = Fair, and 1 = Poor, and are listed here. Do these data provide sufficient evidence at the 5% significance level to indicate whether customers perceive the speed of service to be different between the three shifts?

- 19.80** **Xr19-80** A consumer testing service compared the effectiveness of four different brands of drain cleaner. The experiment consisted of using each product on 50 different clogged sinks and measuring the amount of time that elapsed until each drain became unclogged. The recorded times were measured in minutes.
- Which techniques should be considered as possible procedures to apply to determine whether differences exist? What are the required conditions? How do you decide?
 - If a statistical analysis has shown that the times are not normally distributed, can the service conclude that differences exist between the speeds at which the four brands perform?

- 19.81** **Xr19-81** During the last presidential campaign, the Gallup organization surveyed a random sample of

30 registered Democrats in January, another 30 in February, and yet another 30 in March. All 90 Democrats were asked to "rate the chances of the Democrats winning the presidential race in your state." The responses and their numerical codes were Excellent (4), Good (3), Fair (2), and Poor (1). Do these data allow us to infer that Democrats' ratings of their chances of winning the presidency changed over the 3-month period?

- 19.82** **Xr19-82** It is common practice in the advertising business to create several different advertisements and then ask a random sample of potential customers to rate the ads on several different dimensions. Suppose that an advertising firm developed four different ads for a new breakfast cereal and asked a sample of 400 shoppers to rate the believability of the advertisements. One hundred people viewed ad 1, another 100 viewed ad 2, another 100 saw ad 3, and another 100 saw ad 4. The ratings were Very believable (4), Quite believable (3), Somewhat believable (2), and Not believable at all (1). Can the firm's management conclude that differences exist in believability between the four ads?

- 19.83** **Xr19-83** Do university students become more supportive of their varsity teams as they progress through their 4-year stint? To help answer this question, a sample of students was drawn. Each was asked their class standing (freshman, sophomore, junior, or senior) and to what extent they supported the university's football team, the Hawks. The responses to the latter question are:

Wildly fanatic
Support the Hawks wholeheartedly
Support the Hawks, but not that enthusiastically
Who are the Hawks?

The responses were coded using a 4-3-2-1 numbering system. Can we conclude that the four levels of students differ in their support for the Hawks?

- 19.84** **Xr19-84** In anticipation of buying a new scanner, a student turned to a web site that reported the results of surveys of users of the different scanners. A sample of 133 responses was listed showing the ease of use of five different brands. The survey responses were:

Very easy
Easy
Not easy
Difficult
Very difficult

The responses were assigned numbers from 1 to 5. Can we infer that there are differences in perceived ease of use between the five brands of scanners?



GENERAL SOCIAL SURVEY EXERCISES

- 19.85 GSS2012*** Do more educated people derive more satisfaction from their jobs? Test to determine whether there are differences in job satisfaction (SATJOB: 1 = Very satisfied, 2 = Moderately satisfied, 3 = A little dissatisfied, 4 = Very dissatisfied) between the degree holders (DEGREE: 0 = Left high school, 1 = Finished high school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree).
- 19.86 GSS2012*** Respondents were asked the following question, compared to your parents at your age is your standard of living (PARSOL: 1 = Much better, 2 = Somewhat better, 3 = About the same, 4 = Somewhat worse, 5 = Much worse). Test to determine whether we can infer that differences in perception exist between the three races (RACE).
- 19.87 GSS2012*** Are there differences between the five categories of marital status (MARITAL) with respect to health (HEALTH: 1 = Excellent, 2 = Good, 3 = Fair, 4 = Poor)? Conduct a statistical test to answer the question.
- 19.88 GSS2012*** Do less educated people believe that they have a higher probability of losing their job? Test to determine whether there is enough evidence to conclude that there are differences in perceived likelihood of losing their jobs (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely) between the degree holders (DEGREE: 0 = Left high school, 1 = Finished high school, 2 = Junior college, 3 = Bachelor's degree, 4 = Graduate degree).
- 19.89 GSS2012*** Is there enough statistical evidence to infer that there are differences between the three race categories (RACE) with respect to how likely they are to lose their jobs (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely)?
- 19.90 GSS2012*** Is there enough statistical evidence to conclude that Democrats, Republicans, and Independents (PARTYID: 0, 1, 2 = Democrat; 3 = Independent; 4, 5, 6 = Republican) differ in their views about the federal income tax that they have to pay (TAX: Do you consider the amount of federal income tax that you have to pay as too high, about right, or too low: 1 = Too high, 2 = About right, 3 = Too low)?
- 19.91 GSS2012*** Can we infer from the data that liberals, moderates, and conservatives (POLVIEWS3: 1 = Liberal, 2 = Moderate, 3 = Conservative) differ in their views about the federal income tax that they have to pay (TAX: Do you consider the amount of federal income tax that you have to pay as too high, about right, or too low: 1 = Too high, 2 = About right, 3 = Too low)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 19.92 ANES2008*** Is there sufficient evidence to conclude that Democrats, Republicans, and Independents (PARTY3) differ in their perception about whether the economy has gotten better or worse in the last year (ECON: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)?
- 19.93 ANES2008*** Can we infer from the data that Democrats, Republicans, and Independents (PARTY3) differ in their expectation that the economy, in the country as a whole, to get better, stay the same, or get worse in the next 12 months (ECON12: 1 = Much better, 2 = Somewhat better, 3 = Stay about the same, 4 = Somewhat worse, 5 = Much worse)?

19-4 / SPEARMAN RANK CORRELATION COEFFICIENT

In Section 17-4, we introduced the test of the coefficient of correlation, which allows us to determine whether there is evidence of a linear relationship between two interval variables. Recall that the required condition for the t -test of ρ is that the variables are bivariate normally distributed. In many situations, however, one or both variables may be ordinal; or if both variables are interval, the normality requirement may not be satisfied. In such cases, we measure and test to determine whether a relationship exists by employing a nonparametric technique, the **Spearman rank correlation coefficient**.

The Spearman rank correlation coefficient is calculated like all of the other previously introduced nonparametric methods by first ranking the data. We then calculate the *Pearson correlation coefficient* of the ranks.

The population Spearman correlation coefficient is labeled ρ_s , and the sample statistic used to estimate its value is labeled r_s .

Sample Spearman Rank Correlation Coefficient

$$r_s = \frac{s_{ab}}{s_a s_b}$$

where a and b are the ranks of x and y , respectively, s_{ab} is the covariance of the values of a and b , s_a is the standard deviation of the values of a , and s_b is the standard deviation of the values of b .

We can test to determine whether a relationship exists between the two variables. The hypotheses to be tested are

$$H_0: \rho_s = 0$$

$$H_1: \rho_s \neq 0$$

(We also can conduct one-tail tests.) The test statistic is the absolute value of r_s . To determine whether the value of r_s is large enough to reject the null hypothesis, we refer to Table 11 in Appendix B, reproduced here as Table 19.5, which lists the critical values of the test statistic for one-tail tests. To conduct a two-tail test, the value of α must be doubled. The table lists critical values for $\alpha = .01, .025$, and $.05$ and for $n = 5$ to 30 . When n is greater than 30 , r_s is approximately normally distributed with mean 0 and standard deviation $1/\sqrt{n-1}$. Thus, for $n > 30$, the test statistic is as shown in the box.

Test Statistic for Testing $\rho_s = 0$ When $n > 30$

$$z = \frac{r_s - 0}{1/\sqrt{n-1}} = r_s \sqrt{n-1}$$

which is standard normally distributed

TABLE 19.5 Critical Values for the Spearman Rank Correlation Coefficient

The α values correspond to a one-tail test of $H_0: \rho_s = 0$. The value should be doubled for two-tail tests.

n	$\alpha = .05$	$\alpha = .025$	$\alpha = .01$
5	.900	—	—
6	.829	.886	.943
7	.714	.786	.893
8	.643	.738	.833
9	.600	.683	.783
10	.564	.648	.745

(Continued)

TABLE 19.5 (Continued)

The α values correspond to a one-tail test of $H_0: \rho_s = 0$. The value should be doubled for two-tail tests.

<i>n</i>	$\alpha = .05$	$\alpha = .025$	$\alpha = .01$
11	.523	.623	.736
12	.497	.591	.703
13	.475	.566	.673
14	.457	.545	.646
15	.441	.525	.623
16	.425	.507	.601
17	.412	.490	.582
18	.399	.476	.564
19	.388	.462	.549
20	.377	.450	.534
21	.368	.438	.521
22	.359	.428	.508
23	.351	.418	.496
24	.343	.409	.485
25	.336	.400	.475
26	.329	.392	.465
27	.323	.385	.456
28	.317	.377	.448
29	.311	.370	.440
30	.305	.364	.432

EXAMPLE 19.7**DATA**
Xm19-07**Testing the Relationship between Aptitude Tests and Performance**

The production manager of a firm wants to examine the relationship between aptitude test scores given before hiring production-line workers and performance ratings received by the employees 3 months after starting work. The results of the study would allow the firm to decide how much weight to give to these aptitude tests relative to other work-history information obtained, including references. The aptitude test results range from 0 to 100. The performance ratings are as follows:

- 1 = Employee has performed well below average.
- 2 = Employee has performed somewhat below average.
- 3 = Employee has performed at the average level.
- 4 = Employee has performed somewhat above average.
- 5 = Employee has performed well above average.

A random sample of 40 production workers yielded the results listed here. Can the firm's manager infer at the 5% significance level that aptitude test scores are correlated with performance rating?

Employee	Aptitude	Performance
1	59	3
2	47	2
3	58	4
4	66	3
5	77	2
6	57	4
7	62	3
8	68	3
9	69	5
10	36	1
11	48	3
12	65	3
13	51	2
14	61	3
15	40	3
16	67	4
17	60	2
18	56	3
19	76	3
20	71	2
21	52	3
22	62	5
23	54	2
24	50	3
25	57	1
26	59	5
27	66	4
28	84	5
29	56	2
30	61	1
31	53	4
32	76	3
33	42	4
34	59	4
35	58	2
36	66	4
37	58	2
38	53	1
39	63	5
40	85	3

SOLUTION:**IDENTIFY**

The problem objective is to analyze the relationship between two variables. The aptitude test score is interval, but the performance rating is ordinal. We will treat the aptitude test score as if it were ordinal and calculate the Spearman rank correlation coefficient. To answer the question, we specify the hypotheses as

$$H_0: \rho_s = 0$$

$$H_1: \rho_s \neq 0$$

COMPUTE**MANUALLY:**

We rank each of the variables separately, averaging any ties that we encounter. The original data and ranks are as follows.

Employee	Aptitude	Rank a	Performance	Rank b
1	59	20	3	20.5
2	47	4	2	9
3	58	17	4	31.5
4	66	30	3	20.5
5	77	38	2	9
6	57	14.5	4	31.5
7	62	25.5	3	20.5
8	68	33	3	20.5
9	69	34	5	38
10	36	1	1	2.5
11	48	5	3	20.5
12	65	28	3	20.5
13	51	7	2	9
14	61	23.5	3	20.5
15	40	2	3	20.5
16	67	32	4	31.5
17	60	22	2	9
18	56	12.5	3	20.5
19	76	36	3	20.5
20	71	35	2	9
21	52	8	3	20.5
22	62	25.5	5	38
23	54	11	2	9
24	50	6	3	20.5

Employee	Aptitude	Rank a	Performance	Rank b
25	57	14.5	1	2.5
26	59	20	5	38
27	66	30	4	31.5
28	84	39	5	38
29	56	12.5	2	9
30	61	23.5	1	2.5
31	53	9.5	4	31.5
32	76	37	3	20.5
33	42	3	4	31.5
34	59	20	4	31.5
35	58	17	2	9
36	66	30	4	31.5
37	58	17	2	9
38	53	9.5	1	2.5
39	63	27	5	38
40	85	40	3	20.5

The next step is to calculate the following sums

$$\sum a_i b_i = 18,319$$

$$\sum a_i = 820 \quad \sum b_i = 820$$

$$\sum a_i^2 = 22,131.5$$

$$\sum b_i^2 = 21,795.5$$

Using the shortcut calculation on page 124, we determine that the covariance of the ranks is

$$s_{ab} = \frac{1}{n-1} \left(\sum a_i b_i - \frac{\sum a_i \sum b_i}{n} \right) = \frac{1}{40-1} \left[18,319 - \frac{(820)(820)}{40} \right] = 38.69$$

The sample variances of the ranks (using the short-cut formula on page 107) are

$$s_a^2 = \frac{1}{n-1} \left[\sum a_i^2 - \frac{\left(\sum a_i \right)^2}{n} \right] = \frac{1}{40-1} \left[22,131.5 - \frac{(820)^2}{40} \right] = 136.45$$

$$s_b^2 = \frac{1}{n-1} \left[\sum b_i^2 - \frac{\left(\sum b_i \right)^2}{n} \right] = \frac{1}{40-1} \left[21,795.5 - \frac{(820)^2}{40} \right] = 127.83$$

The standard deviations are

$$s_a = \sqrt{s_a^2} = \sqrt{136.45} = 11.68$$

$$s_b = \sqrt{s_b^2} = \sqrt{127.83} = 11.31$$

Thus,

$$r_s = \frac{s_{ab}}{s_a s_b} = \frac{38.69}{(11.68)(11.31)} = .2929$$

The value of the test statistic is

$$z = r_s \sqrt{n - 1} = .2929 \sqrt{40 - 1} = 1.83$$

$$p\text{-value} = 2P(Z > 1.83) = 2(1 - .9664) = .0672$$

EXCEL

	A	B	C	D
1	Spearman Rank Correlation			
2				
3	Aptitude and Performance			
4	Spearman Rank Correlation	0.2930		
5	z Stat	1.83		
6	P(Z<=z) one tail	0.0337		
7	z Critical one tail	1.6449		
8	P(Z<=z) two tail	0.0674		
9	z Critical two tail	1.96		

INSTRUCTIONS

1. Type or import the data into two adjacent columns*. (Open Xm19-07.)
2. Click Add-Ins, Data Analysis Plus, and Correlation (Spearman).
3. Specify the Input Range (A1:B41) and the value of α (.05).

MINITAB

Correlations: Rank Aptitude, Rank Performance

Pearson correlation of Rank Aptitude and Rank Performance = 0.293
P-Value = 0.067

INSTRUCTIONS

1. Click Data and Rank... to rank each variable.
2. Click Stat, Basic Statistics, and Correlation. Select the variables representing the ranks.

INTERPRET

There is not enough evidence to believe that the aptitude test scores and performance ratings are related. This conclusion suggests that the aptitude test should be improved to better measure the knowledge and skill required by a production-line worker. If this proves impossible, the aptitude test should be discarded.

*If one or both columns contain an empty cell (representing missing data) the row must be removed.



EXERCISES

- 19.94** Test the following hypotheses:

$$H_0: \rho_s = 0$$

$$H_1: \rho_s \neq 0$$

$$n = 50 \quad r_s = .23 \quad \alpha = .05$$

- 19.95** Is there sufficient evidence at the 5% significance level to infer that there is a positive relationship between two ordinal variables given that $r_s = .15$ and $n = 12$?

- 19.96** **Xr19-96** A statistics student asked seven first-year economics students to report their grades in the required mathematics and economics courses. The results (where 1 = F, 2 = D, 3 = C, 4 = B, 5 = A) are as follows:

Mathematics	4	2	5	4	2	2	1
Economics	5	2	3	5	3	3	2

Calculate the Spearman rank correlation coefficient, and test to determine whether we can infer that a relationship exists between the grades in the two courses. (Use $\alpha = .05$.)

- 19.97** **Xr19-97** Does the number of commercials shown during a half-hour television program affect how viewers rate the show? In a preliminary study eight people were asked to watch a pilot for a situation comedy and rate the show (1 = Terrible, 2 = Bad, 3 = OK, 4 = Good, 5 = Very good). Each person was shown a different number of 30-second commercials. The data are shown here. Calculate the Spearman rank correlation coefficient and test with a 10% significance level to determine whether there is a relationship between the two variables.

Number of commercials	1	2	3	4	5	6	7	8
Rating	4	5	3	3	3	2	3	1

- 19.98** **Xr19-98** The weekly returns of two stocks for a 13-week period were recorded and are listed here. Assuming that the returns are not normally distributed, can we infer at the 5% significance level that the stock returns are correlated?

Stock 1	-7	-4	-7	-3	2	-10	-10
Stock 2	6	6	-4	9	3	-3	7
Stock 1	5	1	-4	2	6	-13	
Stock 2	-3	4	7	9	5	-7	

- 19.99** **Xr19-99** The general manager of an engineering firm wants to know whether a draftsman's experience influences the quality of his work. She selects 24 draftsmen at random and records their years of work experience and their quality rating (as assessed by their

supervisors, where 5 = Excellent, 4 = Very good, 3 = Average, 2 = Fair, and 1 = Poor). The data are listed here. Can we infer from these data that years of work experience is a factor in determining the quality of work performed? (Use $\alpha = .05$.)

Draftsman	Experience Rating	Draftsman	Experience Rating	Draftsman	Experience Rating
1	1	1	13	8	2
2	17	4	14	20	5
3	20	4	15	21	3
4	9	5	16	19	2
5	2	2	17	1	1
6	13	4	18	22	3
7	9	3	19	20	4
8	23	5	20	11	3
9	7	2	21	18	5
10	10	5	22	14	4
11	12	5	23	21	3
12	24	2	24	21	1

The following exercises require the use of a computer and software. Use a 5% significance level.

- 19.100** **Xm16-02** Refer to Example 16.2. If the required condition is not satisfied conduct another more appropriate test to determine whether odometer reading and price are related.

- 19.101** **Xr19-101** At the completion of most courses in universities and colleges a course evaluation is undertaken. Some professors believe that the way in which students fill out the evaluations is based on how well the student is doing in the course. To test this theory, a random sample of course evaluations was selected. Two answers were recorded. The questions and answers are:

- How would you rate the course?
- Poor
- Fair
- Good
- Very good
- Excellent
- What grade do you expect in this course?
- F
- D
- C
- B
- A

Is there enough evidence to conclude that the theory is correct?

- 19.102** **Xr19-102** Many people suffer from heartburn. It appears, however, that the problem may increase with age. A researcher for a pharmaceutical company wanted to determine whether age and the incidence and extent of heartburn are related. A random sample of 325 adults was drawn. Each person was asked to give his or her age and to rate the severity of heartburn (1 = Low, 2 = Moderate, 3 = High,

4 = Very high). Do these data provide sufficient evidence to indicate that older people suffer more severe heartburn?

- 19.103** **Xr16-06** Assume that the conditions for the test conducted in Exercise 16.6 are not met. Do the data allow us to conclude that the longer the commercial, the higher the memory test score will be?

- 19.104** **Xr16-07** Assume that the normality requirement in Exercise 16.7 is not met. Test to determine whether the price of a condominium and floor number are positively related.

- 19.105** **Xr19-105** Many people who quit smoking gain weight. Many explain that after they quit smoking food tastes better. To examine the relationship between smoking and taste, a researcher randomly sample 280 smokers. Each was asked how many cigarettes they smoked on an average day. In addition, each

person was asked to taste and rate some vanilla ice cream. The responses are 5 = Excellent, 4 = Very good, 3 = Good, 2 = Fair, and 1 = Poor. Can the researcher infer that the more a person smokes the less taste sensation he or she has?

- 19.106** **Xr19-106** Gambling on sports is big business in the United States and Canada. A television executive wants to know whether the amount of money wagered on a professional football game affects the enjoyment of viewers. A random sample of 200 men who regularly watch football Sunday afternoons and wager on the outcomes was drawn. Each was asked to report the amount wagered on the game they watched and to rate the enjoyment (where 1 = Not enjoyable, 2 = Somewhat enjoyable, 3 = Moderately, enjoyable, and 4 = Very enjoyable). Do these data provide enough evidence to conclude that the greater the wager the more enjoyable the game is for the viewer?



GENERAL SOCIAL SURVEY EXERCISES

- 19.107** **GSS2012*** Do older Americans have a greater fear of losing their jobs? Test to determine whether there is enough evidence to conclude that as one gets older (AGE) the probability of losing one's job (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely) decreases.

- 19.108** **GSS2012*** Is there sufficient evidence to infer that more educated (EDUC) people read newspapers more often (NEWS: 1 = Every day, 2 = A few times per week, 3 = Once a week, 4 = Less than once a week, 5 = Never)?

- 19.109** **GSS2012*** Do the most satisfying jobs also produce the highest income? Test to determine whether there is enough evidence to infer that more satisfying jobs (SATJOB: 1 = Very satisfied, 2 = Moderately satisfied, 3 = A little dissatisfied, 4 = Very dissatisfied) have higher incomes (INCOME).

- 19.110** **GSS2012*** Can we infer from the data that jobs that are most secure (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely) are also the most satisfying (SATJOB: 1 = Very satisfied, 2 = Moderately satisfied, 3 = A little dissatisfied, 4 = Very dissatisfied)?

- 19.111** **GSS2012*** Can we conclude from the data that more educated (EDUC) people are more likely to perceive themselves as healthier (HEALTH: 1 = Excellent, 2 = Good, 3 = Fair, 4 = Poor)?

- 19.112** **GSS2012*** Are more educated people (EDUC) more likely to believe that compared to their parents at their age their standard of living is better (PARSOL: 1 = Much better, 2 = Somewhat better, 3 = About the same, 4 = Somewhat worse, 5 = Much worse)? Perform an appropriate test to answer the question.

- 19.113** **GSS2012*** Is it a myth that younger Americans do not read newspapers, choosing instead to get their news from the Internet or television (or not at all)? Conduct a test to determine whether there is sufficient statistical evidence to conclude that younger people (AGE) read newspapers (NEWS: 1 = Every day, 2 = A few times per week, 3 = Once a week, 4 = Less than once a week, 5 = Never) less frequently than older people.

- 19.114** **GSS2012*** If one works longer hours (HRS1) does the chances of losing one's job (JOBLOSE: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely) become less likely? Conduct a test to answer the question.

- 19.115** **GSS2012*** Does age (AGE) affect one's belief concerning the federal income tax that one has to pay (TAX: Do you consider the amount of federal income tax that you have to pay as too high, about right, or too low: 1 = Too high, 2 = About right, 3 = Too low)?



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- 19.116 ANES2008*** Is there sufficient evidence to conclude that older (AGE) people are more interested in information about what's going on in government and politics (INTB: 1 = Extremely interested, 2 = Very interested, 3 = Moderately interested, 4 = Slightly interested, 5 = Not at all interested)?
- 19.117 ANES2008** Do people who believe that the economy has gotten worse in the last year (ECON: 1 = Much

better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse) also believe that unemployment has gotten worse in the last year (UNEMPLOY: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)? Conduct a test to answer the question.

CHAPTER SUMMARY

Nonparametric statistical tests are applied to problems where the data are either ordinal or interval but not normal. The Wilcoxon Rank Sum Test is used to compare two populations of ordinal or interval data when the data are generated from independent samples. The sign test is used to compare two populations of ordinal data drawn from a matched pairs experiment. The Wilcoxon Signed Rank Sum Test is employed to compare two populations of nonnormal

interval data taken from a matched pairs experiment. When the objective is to compare two or more populations of independently sampled ordinal or interval nonnormal data the Kruskal-Wallis Test is employed. The Friedman Test is used instead of the Kruskal-Wallis Test when the samples are blocked. To determine whether two variables are related we employ the test of the Spearman rank correlation coefficient.

IMPORTANT TERMS:

Nonparametric techniques	760
Distribution-free statistics	760
Wilcoxon Rank Sum Test	762
Sign test	777

Wilcoxon Signed Rank Sum Test	781
Kruskal-Wallis Test	790
Friedman Test	791
Spearman rank correlation coefficient	802

SYMBOLS:

Symbol	Pronounced	Represents
T_i	T sub i or T_i	Rank sum of sample i ($i = 1, 2, \dots, k$)
T^+	T plus	Rank sum of positive differences
T^-	T minus	Rank sum of negative differences
σ_T	Sigma sub T or sigma T	Standard deviation of the sampling distribution of T
ρ_s	Rho sub s or rho s	Spearman rank correlation coefficient

FORMULAS:

Wilcoxon Rank Sum Test

$$T = T_1$$

$$E(T) = \frac{n_1(n_1 + n_2 + 1)}{2}$$

$$\sigma_T = \sqrt{\frac{n_1 n_2 (n_1 + n_2 + 1)}{12}}$$

$$z = \frac{T - E(T)}{\sigma_T}$$

Sign test

$$x = \text{number of positive differences}$$

$$z = \frac{x - .5n}{.5\sqrt{n}}$$

Wilcoxon Signed Rank Sum Test

$$T = T^+$$

$$E(T) = \frac{n(n+1)}{4}$$

$$\sigma_T = \sqrt{\frac{n(n+1)(2n+1)}{24}}$$

$$z = \frac{T - E(T)}{\sigma_T}$$

Kruskal–Wallis Test

$$H = \left[\frac{12}{n(n+1)} \sum_{j=1}^k \frac{T_j^2}{n_j} \right] - 3(n+1)$$

Friedman Test

$$F_r = \left[\frac{12}{b(k)(k+1)} \sum_{j=1}^k T_j^2 \right] - 3b(k+1)$$

Spearman rank correlation coefficient

$$r_s = \frac{s_{ab}}{s_a s_b}$$

Spearman test statistic for $n > 30$

$$z = r_s \sqrt{n-1}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
Wilcoxon Rank Sum Test	767	768
Sign test	780	780
Wilcoxon Signed Rank Sum Test	786	787
Kruskal–Wallis Test	793	793
Friedman Test	797	797
Spearman rank correlation coefficient	808	808

CHAPTER EXERCISES

The following exercises require the use of a computer and software. Use a 5% significance level.

19.118 [Xr19-118](#) Are education and income related? To answer this question, a random sample of people was selected and each was asked to indicate into which of the following categories of education they belonged:

1. Less than high school
2. High school graduate
3. Some college or university but no degree
4. University degree
5. Postgraduate degree

Additionally, respondents were asked for their annual income group from the following choices:

1. Under \$25,000
2. \$25,000 up to but not including \$40,000
3. \$40,000 up to but not including \$60,000
4. \$60,000 up to \$100,000
5. Greater than \$100,000

Conduct a test to determine whether more education and higher incomes are linked.

19.119 [Xr19-119](#) In a study to determine which of two teaching methods is perceived to be better, two sections of an introductory marketing course were

taught in different ways by the same professor. At the course's completion, each student rated the course on a boring/stimulating spectrum, with 1 = Very boring, 2 = Somewhat boring, 3 = A little boring, 4 = Neither boring nor stimulating, 5 = A little stimulating, 6 = Somewhat stimulating, and 7 = Very stimulating. Can we conclude that the ratings of the two teaching methods differ?

19.120 [Xr19-120](#) The researchers at a large carpet manufacturer have been experimenting with a new dyeing process in hopes of reducing the streakiness that frequently occurs with the current process. As an experiment, 15 carpets are dyed using the new process, and another 15 are dyed using the existing method. Each carpet is rated on a 5-point scale of streakiness, where 5 is Extremely streaky, 4 is Quite streaky, 3 is Somewhat streaky, 2 is A little streaky, and 1 is Not streaky at all. Is there enough evidence to infer that the new method is better?

19.121 [Xr19-121](#) The editor of the student newspaper was in the process of making some major changes in the newspaper's layout. He was also contemplating changing the typeface of the print used. To help make a decision, he set up an experiment in which 20 individuals were asked to read four newspaper pages, with

each page printed in a different typeface. If the reading speed differed, the typeface that was read fastest would be used. However, if there was not enough evidence to allow the editor to conclude that such differences exist, the current typeface would be continued. The times (in seconds) to completely read one page were recorded. We have determined that the times are not normally distributed. Determine the course of action the editor should follow. (This exercise is identical to Exercise 14.62, except in this exercise, the data are not normally distributed.)

- 19.122** *Xr19-122* Large potential profits for pharmaceutical companies exist in the area of hair growth drugs. The head chemist for a large pharmaceutical company is conducting experiments to determine which of two new drugs is more effective in growing hair among balding men. One experiment was conducted as follows. A total of 30 pairs of men—each pair of which was matched according to their degree of baldness—was selected. One man used drug A, and the other used drug B. After 10 weeks, the men's new hair growth was examined, and the new growth was judged using the following ratings:

- 0 = No growth
- 1 = Some growth
- 2 = Moderate growth

Do these data provide sufficient evidence that drug B is more effective?

- 19.123** *Xr19-123* Suppose that a precise measuring device for new hair growth has been developed and is used in the experiment described in Exercise 19.22. The percentages of new hair growth for the 30 pairs of men involved in the experiment were recorded. Do these data allow the chemist to conclude that drug B is more effective?

- 19.124** *Xr19-124* The printing department of a publishing company wants to determine whether there are differences in durability between three types of book bindings. Twenty-five books with each type of binding were selected and placed in machines that continually opened and closed them. The numbers of openings and closings until the pages separated from the binding were recorded.

- a. What techniques should be considered to determine whether differences exist between the types of bindings? What are the required conditions? How do you decide which technique to use?
- b. If we know that the number of openings and closings is not normally distributed, test to determine whether differences exist between the types of bindings.

- 19.125** *Xr19-125* In recent years, consumers have become more safety conscious, particularly about children's

products. A manufacturer of children's pajamas is looking for material that is as nonflammable as possible. In an experiment to compare a new fabric with the kind now being used, 50 pieces of each kind were exposed to an open flame, and the number of seconds until the fabric burst into flames was recorded. Because the new material is much more expensive than the current material, the manufacturer will switch only if the new material can be shown to be better. On the basis of these data, what should the manufacturer do?

- 19.126** *Xr19-126* Samuel's is a chain of family restaurants. Like many other service companies, Samuel's surveys its customers on a regular basis to monitor their opinions. Two questions (among others) asked in the survey are as follows:
- a. While you were at Samuel's, did you find the service Slow (1), Moderate (2), or Fast (3)?
 - b. What day was your visit to Samuel's?
- The responses of a random sample of 269 customers were recorded. Can the manager infer that there are differences in customer perceptions of the speed of service between the days of the week?

- 19.127** *Xr19-127* An advertising firm wants to determine the relative effectiveness of two recently produced commercials for a car dealership. An important attribute of such commercials is their believability. To judge this aspect of the commercials, 60 people were randomly selected. Each watched both commercials and then rated them on a 5-point scale (where 1 = Not believable, 2 = Somewhat believable, 3 = Moderately believable, 4 = Quite believable, and 5 = Very believable). Do these data provide sufficient evidence to indicate that there are differences in believability between the two commercials?

- 19.128** *Xr19-128* Researchers at the U.S. National Institute of Aging in Bethesda, Maryland, have been studying hearing loss. They have hypothesized that as men age they will lose their hearing faster than comparably aged women because many more men than women have worked at jobs where noise levels have been excessive. To test their beliefs, the researchers randomly selected one man and one woman aged 45, 46, 47, . . . , 78, 79, 80 and measured the percentage hearing loss for each person. What conclusions can be drawn from these data?

- 19.129** *Xr19-129* In a Gallup poll this year, 200 people were asked, "Do you feel that the newspaper you read most does a good job of presenting the news?" The same question was asked of another 200 people 10 years ago. The possible responses were as follows:

- 3 = Good job
- 2 = Fair job
- 1 = Not a good job

Do these data provide enough evidence to infer that people perceive newspapers as doing a better job 10 years ago than today?

- 19.130** **Xr19-130** It is common practice in many MBA programs to require applicants to arrange for a letter of reference. Some universities have their own forms in which referees assess the applicant using the following categories:

- 5: The candidate is in the top 5% of applicants
- 4: The candidate is in the top 10% of applicants, but not in the top 5%
- 3: The candidate is in the top 25% of applicants, but not in the top 10%
- 2: The candidate is in the top 50% of applicants, but not in the top 25%
- 1: The candidate is in the bottom 50% of applicants

However, the question arises, Are the referees' ratings related to how well the applicant performs in the MBA program? To answer the question, a random sample of recently graduated MBAs was drawn. For each, the rating of the referee and the MBA grade-point average (GPA) were recorded. Do these data present sufficient evidence to infer that the letter of reference and the MBA GPA are related?

- 19.131** **Xr19-131** The increasing number of traveling businesswomen represents a large potential clientele for the hotel industry. Many hotel chains have made changes designed to attract more women. To help direct these changes, a hotel chain commissioned a study to determine whether major differences exist between male and female business travelers. A total of 100 male and 100 female executives were questioned on a variety of topics, one of which was the number of trips they had taken in the previous 12 months. We would like to know whether these data provide enough evidence to allow us to conclude that businesswomen and businessmen differ in the number of business trips taken per year.

- 19.132** **Xr19-132** To examine the effect that a tough midterm test has on student evaluations of professors, a statistics professor had her class evaluate her teaching effectiveness before the midterm test. The questionnaire asked for opinions on a number of dimensions, but the last question is considered the most important. It is "How would you rate the overall performance of the instructor?" The possible responses are 1 = poor, 2 = fair, 3 = good, and 4 = excellent. After a difficult test, the evaluation was redone. The evaluation scores before and after the test for each of the 40 students in the class were recorded. Do the data allow the professor to conclude that the results of the midterm negatively influence student opinion?

- 19.133** **Xr19-133** The town of Stratford, Ontario, is very much dependent on the Shakespearean Festival it holds every summer for its financial well-being. Thousands of people visit Stratford to attend one or more Shakespearean plays and spend money in hotels, restaurants, and gift shops. As a consequence, any sign that the number of visitors will decrease in the future is cause for concern. Two years ago, a survey of 100 visitors asked how likely it was that they would return within the next 2 years. This year the survey was repeated with another 100 visitors. The likelihood of returning within 2 years was measured as:

- 4 = Very likely
- 3 = Somewhat likely
- 2 = Somewhat unlikely
- 1 = Very unlikely

Conduct whichever statistical procedures you deem necessary to determine whether the citizens of Stratford should be concerned about the results of the two surveys.

- 19.134** **Xr19-134** Scientists have been studying the effects of lead in children's blood, bones, and tissue for a number of years. It is known that lead reduces intelligence and can cause a variety of other problems. A study directed by Dr. Herman Needleman, a psychiatrist at the University of Pittsburgh Medical Center, examined some of these problems. Two hundred boys attending public schools in Pittsburgh were recruited. Each boy was categorized as having low or high levels of lead in their bones. Each boy was then assessed by his teachers on a 4-point scale (where 1 = low, 2 = moderate, 3 = high, and 4 = extreme) on degrees of aggression. Is there evidence to infer that boys with high levels of lead are more aggressive than boys with low levels of lead?

- 19.135** **Xr19-135** How does gender affect teaching evaluations? Several researchers addressed this question during the past decade. In one study several female and male professors in the same department with similar backgrounds were selected. A random sample of 100 female students was drawn. Each student evaluated a female professor and a male professor. A sample of 100 male students was drawn and each also evaluated a female professor and a male professor. The ratings were based on a 4-point scale (where 1 = Poor, 2 = Fair, 3 = Good, and 4 = Excellent). The evaluations were recorded in the following way:

- Column 1 = Female student
- Column 2 = Female professor rating
- Column 3 = Male professor rating
- Column 4 = Male student
- Column 5 = Female professor rating
- Column 6 = Male professor rating

- a. Can we infer that female students rate female professors higher than they rate male professors?
- b. Can we infer that male students rate male professors higher than they rate female professors?

19.136 **Xr19-136** It is an unfortunate fact of life that the characteristics that one is born with play a critical role in later life. For example, race is a critical factor in almost all aspects of North American life. Height and weight also determine how friends, teachers, employers, and customers will treat you. And now we may add physical attractiveness to this list. A recent study followed the careers of students from a prestigious U.S. law school. A panel of independent raters examined the graduation yearbook photos of the students and rated their appearance as unattractive, neither attractive nor unattractive, or attractive. The annual incomes in thousands of dollars 5 years after graduation were recorded. Assuming that incomes are not normally distributed, can we infer that incomes of lawyers are affected by physical attractiveness?

19.137 **Xr19-137** According to a CNN news report 9% of full-time workers telecommute. This means that they do not work in their employers' offices but instead perform their work at home using a computer and modem. To ascertain whether such workers are more satisfied than their nontelecommuting counterparts, a study was undertaken. A random sample of telecommuters and regular office workers was taken. Each was asked how satisfied they were with their current employment. The responses are 1 = Very unsatisfied, 2 = Somewhat unsatisfied, 3 = Somewhat satisfied, and 4 = Very satisfied. What conclusions can we draw from these data?

19.138 **Xr19-138** How does alcohol affect judgment? To provide some insight an experiment was conducted. A

random sample of customers of an Ohio club was selected. Each respondent was asked to assess the attractiveness of members of the opposite sex who were in the club at the time. The assessment was to be made on a 5-point scale (where 1 = Very unattractive, 2 = Unattractive, 3 = Neither attractive nor unattractive, 4 = Attractive, and 5 = Very attractive). The survey was conducted 3 hours before closing and again just before closing using another group of respondents. Can we conclude that the assessments made just before closing are higher than those made 3 hours earlier? If so, what does this imply about the effects of alcohol on judgment?

19.139 **Xr19-139** Can you become addicted to exercise? In a study conducted at the University of Wisconsin at Madison, a random sample of dedicated exercisers who usually work out every day was drawn. Each completed a questionnaire that gauged their mood on a 5-point scale (where 5 = Very relaxed and happy, 4 = Somewhat relaxed and happy, 3 = Neutral feeling, 2 = Tense and anxious, and 1 = Very tense and anxious). The group was then instructed to abstain from all workouts for the next 3 days. Moreover, they were told to be as physically inactive as possible. Each day their mood was measured using the same questionnaire. Column 1 stores the code identifying the respondent and columns 2 through 5 store the measures of mood for the day before the experiment began and for the 3 days of the experiment, respectively.

- a. Can we infer that for each day the exercisers abstained from physical activity they were less happy than when they were exercising?
- b. Do the data indicate that by the third day moods were improving?
- c. Draw two possible conclusions from your findings.

Case 19.1

Customer Ratings of an Automobile Service Center

DATA
CA19-01

A number of retailers regularly survey their customers to determine among other things, whether they were happy with their purchase or service and whether they intended to return. A chain of hardware stores/automobile service centers is one such company.

At the completion of repair work customers are asked to fill out the following form:

A random sample of 134 responses was drawn. The responses to questions 1 through 4 (1 = poor, 2 = fair, 3 = good, 4 = very good) are stored in columns 1 through 4, respectively. Responses to question

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5 (2 = yes, 1 = no) are stored in column 5. Column 6 stores a 1 if a positive comment was made, 2 if a negative comment was made, and 3 if no comment was made.

- Can we infer that those who say they will return assess each category higher than those who will not return?
- Is there sufficient evidence to infer that those who make positive comments, negative comments, and no comments differ in their assessment of each category?
- Prepare a presentation for the company's executives describing your analysis.

Tell us what you think.		Very Good	Good	Fair	Poor
Are You Satisfied?					
1. Quality of work performed					
2. Fairness of price					
3. Explanation of work and guarantee					
4. Checkout process					
5. Will return in future					
Comments? YES NO					

APPENDIX 19 / REVIEW OF STATISTICAL INFERENCE (CHAPTERS 12 TO 19)

Although there are four more chapters to go in this book, we have completed our presentation of statistical inference. (The remaining techniques—times-series analysis and forecasting, statistical process control, and decision analysis—address different kinds of problems, which tend to be easy to identify.) The list of statistical techniques in Table A19.1 and the flowchart in Figure A19.1 now contain all the statistical inference methods presented in this book. Use them to determine how each of the exercises is to be addressed. Because these exercises were drawn from a wide variety of applications and collectively require the use of all the techniques introduced in this book, they provide the same kind of challenge faced by real statistics practitioners. By attempting to solve these problems, you will be getting realistic exposure to statistical applications. Incidentally, this also provides practice in the approach required to succeed in a statistics course examination.

TABLE A19.1 Summary of Statistical Techniques in Chapters 12 to 19

Problem objective: Describe a population Data type: Interval Descriptive measurement: Central location Parameter: μ Test statistic: $t = \frac{\bar{x} - \mu}{s/\sqrt{n}}$ Interval estimator: $\bar{x} \pm t_{\alpha/2} \frac{s}{\sqrt{n}}$ Required condition: Population is normal. Descriptive measurement: Variability Parameter: σ^2
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TABLE A19.1 (Continued)

<p>Test statistic: $\chi^2 = \frac{(n - 1)s^2}{\sigma^2}$</p> <p>Interval estimator: $LCL = \frac{(n - 1)s^2}{\chi^2_{\alpha/2}} \quad UCL = \frac{(n - 1)s^2}{\chi^2_{1-\alpha/2}}$</p> <p>Required condition: Population is normal.</p> <p>Data type: Nominal</p> <p>Number of categories: Two</p> <p>Parameter: p</p> <p>Test statistic: $z = \frac{\hat{p} - p}{\sqrt{p(1 - p)/n}}$</p> <p>Interval estimator: $\hat{p} \pm z_{\alpha/2} \sqrt{\hat{p}(1 - \hat{p})/n}$</p> <p>Required condition: $np \geq 5$ and $n(1 - p) \geq 5$ (for test) $n\hat{p} \geq 5$ and $n(1 - \hat{p}) \geq 5$ for estimate</p> <p>Number of categories: Two or more</p> <p>Parameters: p_1, p_2, \dots, p_k</p> <p>Statistical technique: Chi-squared goodness-of-fit</p> <p>Test statistic: $\chi^2 = \sum \frac{(f_i - e_i)^2}{e_i}$</p> <p>Required condition: $e_i \geq 5$</p> <p>Problem objective: Compare two populations</p> <p>Data type: Interval</p> <p>Descriptive measurement: Central location</p> <p>Experimental design: Independent samples</p> <p>Population variances: $\sigma_1^2 = \sigma_2^2$</p> <p>Parameter: $\mu_1 - \mu_2$</p> <p>Test statistic: $t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}}$</p> <p>Interval estimator: $(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{s_p^2 \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}$</p> <p>Required condition: Populations are normal. If populations are nonnormal, apply the Wilcoxon Rank Sum Test.</p> <p>Population variances: $\sigma_1^2 \neq \sigma_2^2$</p> <p>Parameter: $\mu_1 - \mu_2$</p> <p>Test statistic: $t = \frac{(\bar{x}_1 - \bar{x}_2) - (\mu_1 - \mu_2)}{\sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right)}}$</p> <p>Interval estimator: $(\bar{x}_1 - \bar{x}_2) \pm t_{\alpha/2} \sqrt{\left(\frac{s_1^2}{n_1} + \frac{s_2^2}{n_2} \right)}$</p>

(Continued)

TABLE A19.1 (Continued)

<p>Required condition: Populations are normal.</p> <p>Experimental design: Matched pairs</p> <p>Parameter: μ_D</p> <p>Test statistic: $t = \frac{\bar{x}_D - \mu_D}{s_D / \sqrt{n_D}}$</p> <p>Interval estimator: $\bar{x}_D \pm t_{\alpha/2} \frac{s_D}{\sqrt{n_D}}$</p> <p>Required condition: Differences are normal. If differences are nonnormal, apply Wilcoxon Signed Rank Sum Test. Nonparametric technique: Wilcoxon Signed Rank Sum Test</p> <p>Test statistic: $z = \frac{T - E(T)}{\sigma_T}$</p> <p>Required condition: Populations are identical in shape and spread.</p> <p>Descriptive measurement: Variability</p> <p>Parameter: σ_1^2 / σ_2^2</p> <p>Test statistic: $F = \frac{s_1^2}{s_2^2}$</p> <p>Interval estimator: $LCL = \left(\frac{s_1^2}{s_2^2} \right) \frac{1}{F_{\alpha/2, \nu_1, \nu_2}} \quad UCL = \left(\frac{s_1^2}{s_2^2} \right) F_{\alpha/2, \nu_2, \nu_1}$</p> <p>Required condition: Populations are normal.</p> <p>Data type: Ordinal</p> <p>Experimental design: Independent samples</p> <p>Nonparametric technique: Wilcoxon Rank Sum Test</p> <p>Test statistic: $z = \frac{T - E(T)}{\sigma_T}$</p> <p>Required condition: Populations are identical in shape and spread.</p> <p>Experimental design: Matched pairs</p> <p>Nonparametric technique: Sign test</p> <p>Test statistic: $z = \frac{x - .5n}{.5\sqrt{n}}$</p> <p>Required condition: Populations are identical in shape and spread.</p> <p>Data type: Nominal</p> <p>Number of categories: Two</p> <p>Parameter: $p_1 - p_2$</p> <p>Test statistic:</p>

$$\text{Case 1: } H_0: p_1 - p_2 = 0 \quad z = \frac{(\hat{p}_1 - \hat{p}_2)}{\sqrt{\hat{p}(1 - \hat{p}) \left(\frac{1}{n_1} + \frac{1}{n_2} \right)}}$$

$$\text{Case 2: } H_0: p_1 - p_2 = D \quad (D \neq 0) \quad z = \frac{(\hat{p}_1 - \hat{p}_2) - (p_1 - p_2)}{\sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}}$$

TABLE A19.1 (Continued)

<p>Interval estimator: $(\hat{p}_1 - \hat{p}_2) \pm z_{\alpha/2} \sqrt{\frac{\hat{p}_1(1 - \hat{p}_1)}{n_1} + \frac{\hat{p}_2(1 - \hat{p}_2)}{n_2}}$</p> <p>Required condition: $n_1\hat{p}_1, n_1(1 - \hat{p}_1), n_2\hat{p}_2$, and $n_2(1 - \hat{p}_2) \geq 5$</p> <p>Number of categories: Two or more</p> <p>Statistical technique: Chi-squared test of a contingency table</p> <p>Test statistic: $\chi^2 = \sum \frac{(f_i - e_i)^2}{e_i}$</p> <p>Required condition: $e_i \geq 5$</p> <p>Problem objective: Compare two or more populations</p> <p>Data type: Interval</p> <p>Experimental design: Independent samples</p> <p>Number of factors: One</p> <p>Parameters: $\mu_1, \mu_2, \dots, \mu_k$</p> <p>Statistical technique: (One-way analysis of variance)</p> <p>Test statistic: $F = \frac{MST}{MSE}$</p> <p>Statistical technique: Multiple comparisons:</p> <p>Fisher and Bonferroni adjustment: $LSD = t_{\alpha/2} \sqrt{MSE \left(\frac{1}{n_i} + \frac{1}{n_j} \right)}$</p> <p>Tukey: $\omega = q_\alpha(k, \nu) \sqrt{\frac{MSE}{n_g}}$</p> <p>Required conditions: Populations are normal with equal variances. If populations are nonnormal, apply the Kruskal-Wallis Test.</p> <p>Number of factors: Two</p> <p>Parameters: $\mu_1, \mu_2, \dots, \mu_k$</p> <p>Statistical technique: (Two-factor analysis of variance)</p> <p>Test statistics: $F = \frac{MS(AB)}{MSE} \quad F = \frac{MS(A)}{MSE} \quad F = \frac{MS(B)}{MSE}$</p> <p>Required conditions: Populations are normal with equal variances.</p> <p>Experimental design: Randomized blocks</p> <p>Parameters: $\mu_1, \mu_2, \dots, \mu_k$</p> <p>Statistical technique: (Two-way analysis of variance)</p> <p>Test statistics: $F = \frac{MST}{MSE} \quad F = \frac{MSB}{MSE}$</p> <p>Required conditions: Populations are normal with equal variances. If populations are nonnormal, apply the Friedman Test.</p> <p>Data type: Ordinal</p> <p>Experimental design: Independent samples</p> <p>Nonparametric technique: Kruskal-Wallis Test</p> <p>Test statistic: $H = \left[\frac{12}{n(n+1)} \sum_{j=1}^k \frac{T_j^2}{n_j} \right] - 3(n+1)$</p> <p>Required condition: Populations are identical in shape and spread and $n_j \geq 5$.</p>

(Continued)

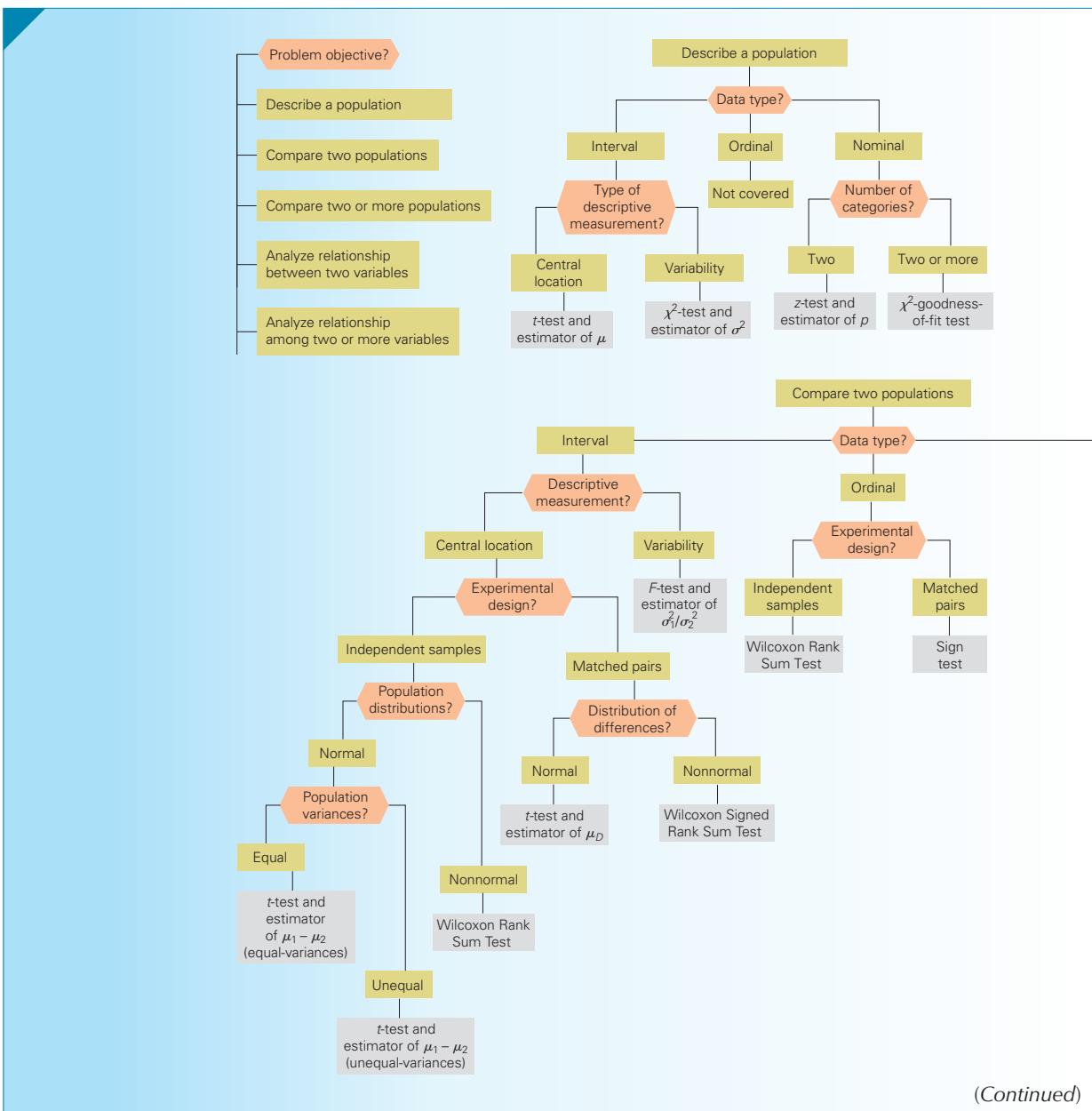
TABLE A19.1 (Continued)

<p>Experimental design: Randomized blocks Nonparametric technique: Friedman Test Test statistic: $F_r = \left[\frac{12}{b(k)(k+1)} \sum_{j=1}^k T_j^2 \right] - 3b(k+1)$ Required condition: Populations are identical in shape and spread and $n_j \geq 5$.</p> <p>Data type: Nominal Number of categories: Two or more Statistical technique: Chi-squared test of a contingency table Test statistic: $\chi^2 = \sum \frac{(f_i - e_i)^2}{e_i}$ Required condition: $e_i \geq 5$</p> <p>Problem objective: Analyze the relationship between two variables</p> <p>Data type: Interval Parameters: β_0, β_1, ρ Statistical technique: Simple linear regression and correlation Test statistic: $t = \frac{b_1 - \beta_1}{s_{b_1}}; t = r\sqrt{\frac{n-2}{1-r^2}}$ Prediction interval: $\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{1 + \frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$ Interval estimator of expected value: $\hat{y} \pm t_{\alpha/2, n-2} s_e \sqrt{\frac{1}{n} + \frac{(x_g - \bar{x})^2}{(n-1)s_x^2}}$ Required conditions: ϵ is normally distributed with mean 0 and standard deviation σ_ϵ; ϵ values are independent. To test whether two bivariate normally distributed variables are linearly related: Parameter: ρ Test statistic: $t = r\sqrt{\frac{n-2}{1-r^2}}$ If x and y are not bivariate normally distributed, apply the Spearman rank correlation coefficient test.</p> <p>Data type: Ordinal Statistical technique: Spearman rank correlation coefficient test Parameter: ρ_s Test statistic: $z = r_s \sqrt{n-1}$ Required condition: none</p> <p>Data type: Nominal Statistical technique: Chi-squared test of a contingency table Test statistic: $\chi^2 = \sum \frac{(f_i - e_i)^2}{e_i}$ Required condition: $e_i \geq 5$</p> <p>Problem objective: Analyze the relationship among two or more variables</p>
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TABLE A19.1 (Continued)

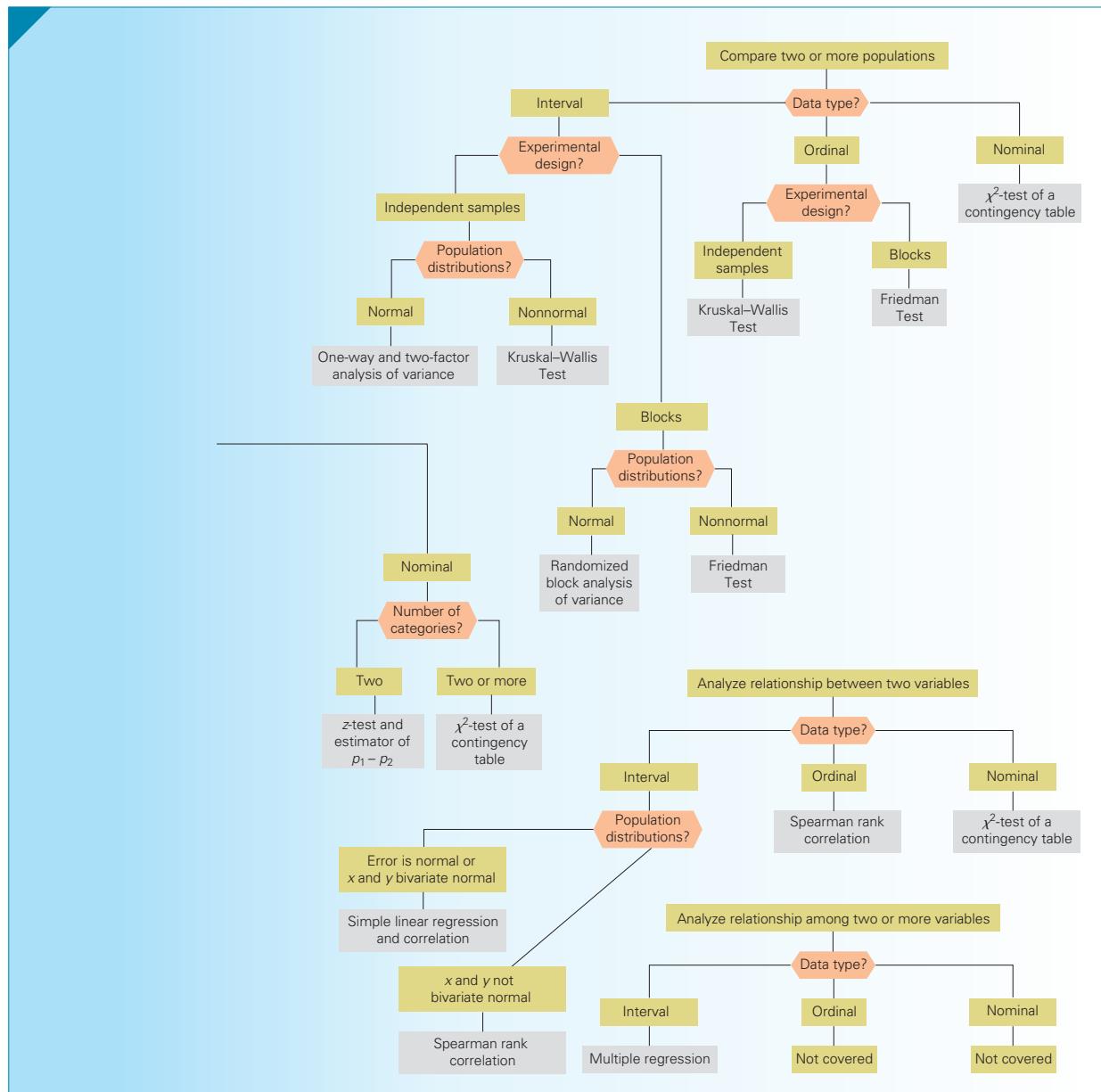
<p>Data type: Interval</p> <p>Parameters: $\beta_0, \beta_1, \beta_2, \dots, \beta_k$</p> <p>Statistical technique: multiple regression</p> <p>Test statistics: $t = \frac{b_i - \beta_i}{s_{b_i}} (i = 1, 2, \dots, k); F = \frac{\text{MSR}}{\text{MSE}}$</p> <p>Required conditions: ϵ is normally distributed with mean 0 and standard deviation σ_ϵ; ϵ values are independent.</p>

FIGURE A19.1 Flowchart of All Statistical Inference Techniques



(Continued)

FIGURE A19.1 (Continued)





EXERCISES

- A19.1** **XrA19-01** Most supermarkets load groceries into plastic bags. However, plastic bags take many years to decompose in garbage dumps. To determine how big the problem might be, a random sample of American households was each asked to determine the number of plastic bags they use and discard in a week. The last census revealed that there are 112 million households in the United States. Estimate with 95% confidence the total number of plastic bags discarded per week.

Source: NBC News May 7, 2007.

- A19.2** **XrA19-02** Some customers spend a great deal of time doing research before choosing a particular brand of a product, particularly an expensive product. Does this result in a more satisfied customer? To shed light on this question, a random sample of people who purchased a new car within the last two years was drawn. Each was asked to report the amount of time spent researching (reading newspaper reports and brochures, as well as looking on the Internet) in hours and his or her level of satisfaction measured in the following way:

1. Extremely dissatisfied
2. Somewhat dissatisfied
3. Neither satisfied or dissatisfied
4. Somewhat satisfied
5. Extremely satisfied

Do the data allow us to infer that those who do more research are more satisfied with their choice?

- A19.3** **Xr13-36*** Refer to Exercise 13.36 where respondents were asked to taste the same wine in two different bottles. The first bottle was capped using a cork, and the second had a metal screw cap. Respondents were also asked to taste the wine and rate it using the following categories.

Poor (1), Fair (2), Good (3), Very good (4), Excellent (5)

Do these data provide sufficient evidence to indicate that wine bottled with a screw cap is perceived to be inferior?

- A19.4** **XrA19-04** In an effort to analyze the results of Exercise A15.9, the researcher recorded the total travel length of the course. This variable measures the total distance golfers must walk to play a round of golf. It is the sum of the golf-course playing distance plus the distance golfers must walk from the green to the next tee. What can you conclude from these data?

- A19.5** **XrA19-05*** In city after city, downtown cores have become less and less populated and poorer because

shoppers have taken their money to the suburbs and to shopping malls. One reason often given for the decline in downtown shops is the difficulty in parking. To shed more light on the issue, a random sample of 197 adults was asked to rate the difficulty in parking using the following responses:

Poor (1), Acceptable (2), Good (3), Very good (4), Excellent (5)

These adults were also asked how often they shopped at a downtown store in a typical month. Do these data allow us to infer that the problem of parking is one reason for the decline in downtown shopping?

- A19.6** **XrA19-05*** Refer to A19.5. To acquire information about who is shopping downtown, the statistics practitioner also recorded the annual household income (in \$1,000s) of the respondents. Is there enough evidence to infer that affluent people shop downtown more frequently than poorer people? (The author is grateful to Patricia Gafoor-Darlington and Michael Kirby-MacLean for writing these exercises.)

- A19.7** **XrA19-07** Why do some students do well in university while others struggle? To help answer this question, a random sample of first-year students at four universities was selected. Those who had a grade point average of more than 3.0 (group 1) and those who had a grade point average of less than 2.0 (group 2) were surveyed. For each student, researchers recorded the results of tests (scored 0 to 10) that measure the following.

Interpersonal skills (strong social skills, ability to interact effectively)

Stress management (being able to work well under pressure or resist and delay an impulse)

Do these data provide sufficient evidence to infer that students whose GPA is more than 3.0 score higher in interpersonal skills and stress management than students whose GPA is less than 2.0?

Source: *National Post*, August 16, 2004.

- A19.8** **XrA19-08** The issue of immigration, legal and illegal, has political and economic ramifications. An important component of the issue is how well immigrants integrate into the American economy. A University of Florida study attempted to answer this question. Researchers randomly surveyed U.S.-born Americans, immigrants who arrived in the United States before 1980, and immigrants who arrived after 1980 in Miami-Dade County, the state of Florida, and the United States. Each respondent

was employed full-time and was asked to report his or her annual earnings. Conduct tests to determine whether differences exist between the three groups in each of the three geographic regions.

A19.9 XrA19-09 The high price of gasoline is likely to lead to less travel. An economist specializing in energy uses wanted to learn more about driving habits, and, in particular, distances traveled by cars, buses, vans, and trucks. In the latest year data were available (2003), there were 136 million cars, 776,000 buses, and 87 million vans, pickups, and SUVs. An economist undertook a survey of each type of vehicle, recording the number of miles driven (in 1,000s). For each type of vehicle, estimate with 95% confidence the mean number of miles driven and the total number of miles driven.

Source: U.S. Federal Highway Administration, *Highway Statistics*. Adapted from the *Statistical Abstract of the United States*, 2006, Table 1084.

A19.10 XrA19-10 Refer to Exercise A19.9. The economist also wanted to know whether there are differences in miles driven between cars, buses, and vans, pickups, and SUVs.

A19.11 XrA19-11 An important measure of the health of a nation's economy is total debt. A Canadian survey asked a random sample of households how much money (in \$1,000s) they owed. This includes mortgages, loans, and credit card debt. Assuming that there are 10 million households in Canada, estimate with 95% confidence the total debt in Canada.

A19.12 XrA19-12 In Chapter 7, we showed that diversification reduces the risk associated with a portfolio of investments. (Most experts advise their clients that the portfolios should contain between 20 and 30 stocks scattered in different industries.) Do investors understand this concept? To help answer this question, a random sample of investors' portfolios was sampled. This survey was a duplicate of the one done 5 years earlier. The number of stocks in each sampled portfolio was recorded. Do these data allow us to infer that investors' portfolios are becoming more diverse?

Source: Adapted from W. Goetzman and A. Kumar, "Equity Portfolio Diversification," NBER Paper 8686.

A19.13 XrA19-13 The cost of taking an extra year to earn an MBA is quite high. To determine whether it is worthwhile, a BBA graduate surveyed 200 people who had either a BBA or an MBA and recorded their annual salary (in \$1,000s) after 5 years of work. The student determined that the added cost of the MBA is warranted only if the mean income of MBAs is more than \$5,000 greater than that of BBAs. Can we conclude that acquiring an MBA is worthwhile?

A19.14 XrA19-14 Flonase is a nasal allergy treatment; like all drugs, it has side effects. Before approving it, the company (GlaxoSmithKline) performs a number of experiments to determine the drug's side effects. In one such experiment, a random sample of 1,707 volunteers was drawn. Of these, 167 were given a 100-mcg dose once a day (1), 782 were given 200 mcg daily (2), and the remaining 758 were given a placebo spray once a day (3). Each person reported whether he or she had any side effects and, if so, which was the most serious. The following data were recorded.

1. Headache
2. Pharyngitis (sore throat)
3. Epistaxis (nosebleed)
4. Other side effect
5. No side effect

Do these data allow us to infer that there are differences in side effects between the three groups of volunteers?

A19.15 XrA19-15 Simco Inc. is a manufacturer that purchased a new piece of equipment designed to reduce costs. After several months of operation, the results were quite unsatisfactory. The operations manager believes that the problem lies with the machine's operators, who were unable to master the required skills. It was decided to establish a training program to upgrade the skills of those workers with the greatest likelihood of success. To do so, the company needed to know which skills are most needed to run the machine. Experts identified six such skills: dexterity, attention to detail, teamwork skills, mathematical ability, problem-solving skills, and technical knowledge. To examine the issue, a random sample of workers was drawn. Workers were measured on each of the six skills through a series of paper-and-pencil tests and through supervisor ratings. In addition, each worker received a score on the quality of his or her actual work on the machine. These data are stored in columns 1 through 7. (Column 1 stores the quality-of-work scores, and columns 2 to 7 are the scores on the skill tests. All data are interval.) Identify the skills that affect the quality of work. (We are grateful to Scott Bergen for writing this exercise.)

A19.16 XrA19-16 Obesity among children in North America is said to be at near-epidemic proportions. Some experts blame television for the problem, citing the statistic that children watch an average of 26 hours per week. During this time, children are not engaged in any physical activity, which results in weight gains. However, the problem may be compounded by a reduction in metabolic rate. In an experiment to address this issue (the study results

were published in the February 1993 issue of the medical journal *Pediatrics*), scientists from Memphis State University and the University of Tennessee at Memphis took a random sample of 223 children aged 8 to 12; 41 of them were obese. Each child's metabolic rate (the amount of calories burned per hour) was measured while at rest and also measured while the child watched a television program (*The Wonder Years*). The differences between the two rates were recorded; column 1 contains the numbers representing the decrease in metabolic rate, and column 2 codes the children as 1 = obese and 2 = nonobese.

- Do these data allow us to conclude that there is a decrease in metabolism when children watch television?
- Can we conclude that the decrease in metabolism while watching television is greater among obese children?

A19.17 *XrA19-17* Scrabble is one of the oldest and most popular board games. It is played all over the world, and there is even an annual world championship competition. The game is played by forming words and placing them on the board to obtain the maximum number of points. It is generally believed that a large vocabulary is the only skill required to be successful. However, there is a strategic element to the game that suggests that mathematical skills are just as necessary. To determine which skills are most in demand, a statistician recruited a random sample of fourth-year university English and mathematics majors and asked them to play the game. A total of 500 games was played by different pairs of English and mathematics majors. The scores in each game were recorded. (The authors would like to thank Scott Bergen for his assistance in writing this exercise.)

- Can we conclude that mathematics majors win more frequently than do English majors?
- Do these data allow us to infer that the average score obtained by English majors is greater than that for mathematics majors?
- Why are the results of Parts (a) and (b) not the same?

A19.18 *XrA19-18* Ever since the discovery of germs, parents have been telling their children to wash their hands. Common sense tells us that this should help minimize the spread of infectious diseases and lead to better health. A study reported in the *University of California at Berkeley Wellness Letter* (volume 13, issue 6, March 1997) may confirm the advice our parents gave us. A study in Michigan tracked a random sample of children, some of whom washed their hands four or more times during the school day. The number of sick days from colds and flu

and the number of sick days from stomach illness were recorded for the past year. Column 1 contains a code representing whether the child washed his or her hands four or more times per school day (1) or not (2). Column 2 stores the number of sick days from cold and flu and column 3 contains the number of sick days from stomach illness.

- Do these data allow us to infer that a child who washed his or her hands four or more times during the school day will have fewer sick days from cold and flu than other children?
- Repeat Part (a) for sick days from stomach illness.

A19.19 *XrA19-19* Under the rules of Canada's Employment Insurance (EI) plan, some workers can use EI repeatedly after working only a short time. The amount of time needed to qualify for EI varies by region and by occupation. In a study undertaken by researchers, regular users of EI were surveyed and asked, among other questions, how frequently they used EI and how satisfied they were with their employment situation. The responses are

- Very unsatisfied
- Somewhat unsatisfied
- Neither unsatisfied or satisfied
- Somewhat satisfied
- Very satisfied

Do the data allow us to conclude that workers who use EI more often are more satisfied with their employment situation?

Source: *National Post Business*, July 2001.

A19.20 *XrA19-20* Winter is the influenza season in North America. Each winter, thousands of elderly and sick people die from the flu and its attendant complications. Consequently, many elderly people receive flu shots in the fall. It has generally been accepted that young healthy North Americans need not receive flu shots because, although many contract the disease, few die from it. However, there are economic consequences. Sick days cost both employees and employers. A study published in the *New England Journal of Medicine* reported the results of an experiment to determine whether it is useful for young healthy people to take flu shots. A random sample of working adults was selected. Half received a flu shot in November; the other half received a placebo. The numbers of sick days over the next 6-month period were recorded in columns 1 (flu shot) and 2 (placebo). Columns 3 (flu shot) and 4 (placebo) contain the number of visits to the doctor.

- Can we conclude that those who take flu shots have fewer sick days?
- Can we conclude that those who take flu shots visit their doctors less frequently?

A19.21 *XrA19-21* The high cost of medical care makes it imperative that hospitals operate efficiently and effectively. As part of a larger study, patients leaving a hospital were surveyed. They were asked how satisfied they were with the treatment they received. The responses were recorded with a measure of the degree of severity of their illness (as determined by the admitting physician) and the length of stay. These data are recorded in the following way:

Column 1: Satisfaction level (1 = very unsatisfied; 2 = somewhat unsatisfied; 3 = neither satisfied nor dissatisfied; 4 = somewhat satisfied; 5 = very satisfied)

Column 2: Severity of illness (1 = least severe and 10 = most severe)

Column 3: Number of days in hospital

- Is the satisfaction level affected by the severity of illness?
- Is the satisfaction level higher for patients who stay for shorter periods of time?

A19.22 *XrA19-22* What should be the priority of paramedics who respond to accidents? Should they treat the patients with their limited facilities or should they rush the victims to the nearest hospital (an approach known as “scoop and run”)? A research project begun in 1993 may provide the answer. Researchers looked at the care of 1,846 trauma patients—those with life-threatening injuries—in Montreal (1), Toronto (2), and Quebec City (3). Montreal uses physicians to provide advanced life support (ALS) at the scene of the accident. Toronto uses paramedics to provide ALS, and Quebec City uses emergency medical services who apply only basic life support. The outcomes (survived = 1, died = 2) and city were recorded. Determine whether there are differences in the death rate between the three cities. What recommendation would you make?

Source: Adapted from *Annals of Surgery*, 2002. The author is grateful to Jie Hunag for creating this exercise.

A19.23 *XrA19-23* How many golfers are there in the United States? A survey of American adults (age 18 and above) asked whether they had played golf at least once a month during the summer. The responses are 2 = yes and 1 = no. The survey also asked respondents to indicate which of the following household income categories they fell into.

- Less than \$15,000
- \$15,000 to \$24,999
- \$25,000 to \$34,999

- \$35,000 to \$49,999
- \$50,000 to \$75,000
- More than \$75,000

The latest census reveals that the number of American households in each of the income categories is as follows.

- 75.7 million
 - 36.9 million
 - 28.3 million
 - 27.8 million
 - 21.9 million
 - 17.1 million
- Estimate with 95% confidence the total number of golfers.
 - For each income category, estimate with 95% confidence the number of golfers who earn at least \$75,000.
 - Test to determine whether income is a determinant in who plays golf.

Source: *Statistical Abstract of the United States*, 2006, Tables 685 and 1238.

A19.24 *XrA19-24* One of the arguments put forth by advocates of lower tuition fees is that children of low or moderate income families will not be able to pay for a child’s university education. To examine this issue, a random sample of families whose children were at least 20 years old was drawn. Each family was asked to specify which of the following household income categories they fell into and whether at least one child had attended university (2 = yes and 1 = no).

- Less than \$25,000
- \$50,000 to \$75,000
- More than \$100,000

Do these data allow researchers to conclude that family income affects whether children attend university?

Source: *Globe and Mail*, Wednesday, October 15, 2003.

A19.25 *XrA19-25* Because of the high cost of hospital stays, anything that can reduce their length and the costs of medication would be appreciated by insurance companies, hospitals, and patients. A physician researcher was searching for ways to reduce costs and decided to investigate the effect of the room the patient stayed in. She gathered data on the length of stay and the amount of pain medication (measured in morphine equivalents). Also recorded was whether the room was sunny or dim. Do these data allow the researcher to conclude that the length of stay and the amount of pain medication is lower in bright rooms than in dim ones?

Source: *USA Today*, Wednesday, March 3, 2004.



GENERAL SOCIAL SURVEY EXERCISES

- A19.26 GSS2008*** Is there enough statistical evidence to infer that younger (AGE) people believe that the rich should pay a bigger share of taxes (TAXSHARE: 1 = Much larger share, 2 = Larger share, 3 = Same share, 4 = Smaller share, 5 = Much lower share)?
- A19.27 GSS2006* GSS2008*** Is there sufficient evidence to conclude that people in 2008 are less likely to know the correct answer to the question below than people in 2006? EARTHSUN: Does Earth go around the Sun or does the Sun go around Earth: 1 = earth around Sun, 2 = sun around Earth. Correct answer: Earth around Sun.
- A19.28 GSS2008*** Are you better off staying with the same employer or can you increase your income more rapidly by switching companies? Test the relationship between job tenure (CUREMPYR) and income (INCOME).
- A19.29 GSS2008*** Is there sufficient evidence to infer that less-educated people (EDUC) are more likely to believe that when their children are their age, their standard of living will be better (KIDSSOL: 1 = Much better, 2 = somewhat better, 3 = About the same, 4 = Somewhat worse, 5 = Much worse)?
- A19.30 GSS2008*** Do the data allow us to infer that there are differences in job tenure (CUREMPYR) between the four classes(CLASS: 1 = Lower class, 2 = Working class, 3 = Middle class, 4 = Upper class)?
- A19.31 GSS2006*** If you work for a company for a long time are you more likely to work overtime? Test to determine whether there is evidence of a positive linear relationship between job tenure (YEARSJOB) and the number of days per month working extra hours (MOREDAYS).
- A19.32 GSS2008*** Is there sufficient evidence to conclude that there are differences between the races (RACE) with respect to responses to the following question (KIDSSOL): When your children are at your age will their standard of living be . . . 1 = Much better, 2 = Somewhat better, 3 = About the same, 4 = Somewhat worse, 5 = Much worse?
- A19.33 GSS2008*** Test to determine whether the three groups of liberals (POLVIEWS: 1 = Extremely liberal, 2 = Liberal, 3 = Slightly liberal) differ in their support of capital punishment (CAPPUN: 1 = Favor, 2 = Oppose)?
- A19.34 GSS2008*** Do the data support the hypothesis that older people (AGE) are more likely to agree that it's the government's responsibility to help pay for doctor and hospital bills (HELPSICK: 1 = Government should help; 2, 3, 4, 5 = People should help themselves)?
- A19.35 GSS2008*** Find the *p*-value of the test to determine whether people who favor capital punishment (CAPPUN: 1 = Favor, 2 = Oppose) are less likely to favor requiring a police permit to buy a gun (GUNLAW: 1 = Favor, 2 = Oppose).
- A19.36 GSS2008*** If one member of a married couple has a prestigious occupation, does the other member have a prestigious occupation as well? Conduct a test to determine whether there is enough evidence to infer that there is a positive linear relationship between the occupation prestige scores of a married couple (PARESTG80 and SPPRES80).
- A19.37 GSS2006*** Can we infer that people who own shares in the company where they work (OWNSTOCK: 1 = Yes, 2, 3, 4, 5 = No) have higher incomes (INCOME)?
- A19.38 GSS2006*** Is there enough evidence to conclude that people with hearing problems (DISABLD1: Do you have a hearing problem that prevents you from hearing normal conversation even with a hearing aid: 1 = Yes, 2 = No) are more likely to believe that it is the government's responsibility to help pay for doctor and hospital bills (HELPSICK: 1 = Government should help, 2, 3, 4, 5 = People should help themselves)?
- A19.39 GSS2004*** Test to determine whether people whose financial condition worsened in the last year (FINAN5: 1 = Yes, 2 = No) differ in their political views (POLVIEW: 1, 2, 3 = Liberal, 4 = Moderate, 5, 6, 7 = Conservative).
- A19.40 GSS2004*** Is there enough evidence to conclude that victims of a home burglary [LAW3: Was your home burglarized or broken into in the last year? 1 = Yes, 2 = No] are less likely to favor requiring a police permit to buy a gun (GUNLAW: 1 = Favor, 2 = Oppose)?
- A19.41 GSS2008*** Can we infer that men are more likely than women to lose their jobs in the next 12 months (JOBLOSE: In the next 12 months, how likely is it that you will lose your job or be laid off: 1 = Very likely, 2 = Fairly likely, 3 = Not too likely, 4 = Not likely)?

- 19.42 GSS2008*** Test to determine whether there is enough evidence to conclude that liberals, moderates, and conservatives (POLVIEW: 1, 2, 3 = Liberal, 4 = Moderate, 5, 6, 7 = Conservative) differ in their belief that the rich should pay a bigger share of taxes (TAXSHARE: 1 = Much larger share, 2 = Larger share, 3 = Same share, 4 = Smaller share, 5 = Much lower share).



AMERICAN NATIONAL ELECTION SURVEY EXERCISES

- A19.44 ANES2004*** Conduct an analysis of the relationship between income (INCOME) and education (EDUC) in 2004.

- On average, how much does income increase for each additional year of education?
- Can we infer that there is a positive linear relationship between income and education.

- A19.45 ANES2008*** Is there sufficient evidence to infer that people who believe that the economy has gotten worse in the last year (ECON: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse) also believe that inflation has gotten worse in the last year (INFLATION: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)?

- A19.46 ANES2008*** Do liberals, moderates, and conservatives (LIBCON3) differ in their perception about the level of unemployment in the last year (UNEMPLOY: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)? Conduct a test to answer the question.

- A19.47 ANES2008*** Can we infer from the data that attention paid to news about national politics in a printed newspaper (ATTN7) differs from the attention

- 19.43 GSS2008*** Is there sufficient evidence to infer that men and women (SEX) differ in their responses to the question, Compared to your parents at your age is your standard of living 1 = Much better, 2 = somewhat better, 3 = About the same, 4 = Somewhat worse, 5 = Much worse (PARSOL)?

paid to news about national politics on the radio (ATTN8) (1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None)?

- A19.48 ANES2008*** Is there enough evidence to infer that liberals, moderates, and conservatives (LIBCON3) differ in their perception about the level of inflation over the past year (INFLATION: 1 = Much better, 2 = Somewhat better, 3 = Stayed about the same, 4 = Somewhat worse, 5 = Much worse)?

- A19.49 ANES2008*** Can we conclude from the data that more educated (EDUC) people pay more attention to national network news about the campaign for president (ATTN1: 1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None)?

- A19.50 ANES2008*** Can we conclude from the data that Democrats and Republicans (PARTY: 1 = Democrat, 2 = Republican) differ in their interest in information about what's going on in government and politics (INTB: 1 = Extremely interested, 2 = Very interested, 3 = Moderately interested, 4 = Slightly interested, 5 = Not at all interested)?

- A19.51 ANES2008*** Test to determine whether men and women (GENDER) differ in the attention they pay to national news about the campaign for president (ATTN1: 1 = A great deal, 2 = Quite a bit, 3 = Some, 4 = Very little, 5 = None).

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TIME-SERIES ANALYSIS AND FORECASTING

- 20-1 *Time-Series Components*
- 20-2 *Smoothing Techniques*
- 20-3 *Trend and Seasonal Effects*
- 20-4 *Introduction to Forecasting*
- 20-5 *Forecasting Models*

Housing Starts

Data
Xm20-00

At the end of 2005, a major builder of residential houses in the northeastern United States wanted to predict the number of housing units that would be started in 2006. This information would be extremely useful in determining a variety of variables, including housing demand, availability of labor, and the price of building materials. To help develop an accurate forecasting model, an economist collected data on the number of housing starts (in thousands) for the previous 60 months (2001–2005). Forecast the number of housing starts for the 12 months of 2006. (Source: Standard & Poor's Industry Surveys.)*



See page 854 for the answer.

*We have chosen not to update the housing starts data. In 2008, most of the world's economies were thrown into a recession precipitated by a housing crisis in the United States. As a result, statistical forecasting tools became wildly inaccurate. You can see for yourself how inaccurate by completing Exercise 20.52.

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INTRODUCTION

Any variable that is measured over time in sequential order is called a **time series**. We introduced time series in Chapter 3 and demonstrated how we use a line chart to graphically display the data. Our objective in this chapter is to analyze time series in order to detect patterns that will enable us to forecast future values of the time series. There is an almost unlimited number of such applications in management and economics. Some examples follow.

1. Governments want to know future values of interest rates, unemployment rates, and percentage increases in the cost of living.
2. Housing industry economists must forecast mortgage interest rates, demand for housing, and the cost of building materials.
3. Many companies attempt to predict the demand for their products and their share of the market.
4. Universities and colleges often try to forecast the number of students who will be applying for acceptance at postsecondary-school institutions.

Forecasting is a common practice among managers and government decision makers. This chapter focuses on time-series forecasting, which uses historical time-series data to predict future values of variables such as sales or unemployment rates. This entire chapter is an application tool for both economists and managers in all functional areas of business because forecasting is such a vital factor in decision making in these areas.

For example, the starting point for aggregate production planning by operations managers is to forecast the demand for the company's products. These forecasts will make use of economists' forecasts of macroeconomic variables (such as gross domestic product, disposable income, and housing starts) as well as the marketing managers' internal forecasts of their customers' future needs. Not only are these sales forecasts critical to production planning but also they are the key to accurate pro forma (i.e., forecasted) financial statements, which are produced by the accounting and financial managers to assist in their planning for future financial needs such as borrowing. Likewise, the human resources department will find such forecasts of a company's growth prospects to be invaluable in their planning for future worker requirements.

There are many different forecasting techniques. Some are based on developing a model that attempts to analyze the relationship between a dependent variable and one or more independent variables. We presented some of these methods in the chapters on regression analysis (Chapters 16, 17, and 18). The forecasting methods to be discussed in this chapter are all based on time series, which we discuss in the next section. In Sections 20-2 and 20-3, we deal with methods for detecting and measuring which time-series components exist. After we uncover this information, we can develop forecasting tools. We will only scratch the surface of this topic. Our objective is to expose you to the concepts of forecasting and to introduce some of the simpler techniques. The level of this text precludes the investigation of more complicated methods.

20-1 TIME-SERIES COMPONENTS

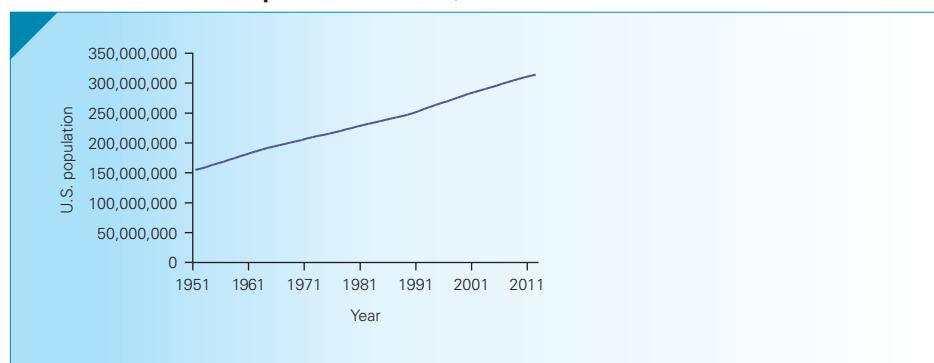
A time series can consist of four different components as described in the box.

Time-Series Components

1. Long-term trend
2. Cyclical variation
3. Seasonal variation
4. Random variation

A **trend** (also known as a **secular trend**) is a long-term, relatively smooth pattern or direction exhibited by a series. Its duration is more than 1 year. For example, the population of the United States exhibited a trend of relatively steady growth from 157 million in 1952 to 314 million in 2012. (The data are stored on Keller's website in Ch20:\Fig20-01.) Figure 20.1 exhibits the line chart.

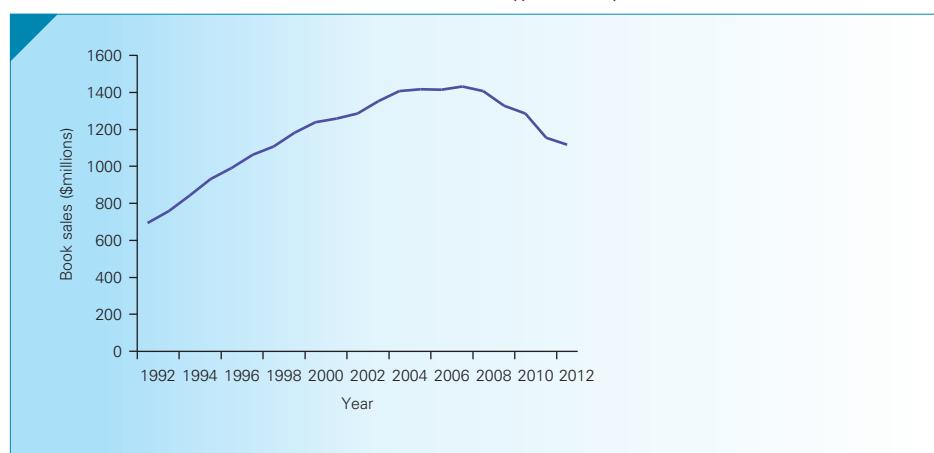
FIGURE 20.1 U.S. Population (millions), 1952–2012



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The trend of a time series is not always linear. For example, Figure 20.2 describes U.S. annual retail book sales in \$millions. As you can see, sales increased from 1992 to 2008 and has decreased since then (data are stored in Ch20:\Fig20-02).

FIGURE 20.2 U.S. Annual Retail Book Sales (\$millions)



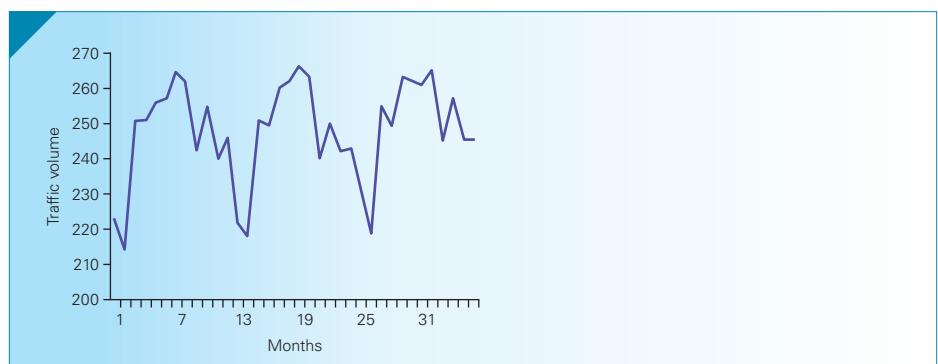
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Cyclical variation is a wavelike pattern describing a long-term trend that is generally apparent over a number of years, resulting in a cyclical effect. By definition, it has duration of more than 1 year. Examples include business cycles that record periods of economic recession and inflation, long-term product-demand cycles, and cycles in monetary and financial sectors. However, cyclical patterns that are consistent and predictable are quite rare. For practical purposes, we will ignore this type of variation.

Seasonal variation refers to cycles that occur over short repetitive calendar periods and, by definition, have a duration of less than 1 year. The term *seasonal variation* may refer to the four traditional seasons or to systematic patterns that occur during a month, a week, or even one day. Demand for restaurants feature “seasonal” variation throughout the day.

An illustration of seasonal variation is provided in Figure 20.3, which graphs monthly U.S. traffic volume (in billions of miles and where period 1 is January). (Data are in Ch20\Fig20-03.) It is obvious from the graph that Americans drive more during the summer months than during the winter months.

FIGURE 20.3 Traffic Volume (Billions of Miles)



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Random variation is caused by irregular and unpredictable changes in a time series that are not caused by any other components. It tends to mask the existence of the other more predictable components. Because random variation exists in almost all time series, one of the objectives of this chapter is to introduce ways to reduce the random variation, which will enable statistics practitioners to describe and measure the other components. By doing so, we hope to be able to make accurate predictions of the time series.

20-2 SMOOTHING TECHNIQUES

If we can determine which components actually exist in a time series, we can develop better forecasts. Unfortunately, the existence of random variation often makes the task of identifying components difficult. One of the simplest ways to reduce random variation is to smooth the time series. In this section, we introduce two methods: *moving averages* and *exponential smoothing*.

20-2a Moving Averages

A **moving average** for a time period is the arithmetic mean of the values in that time period and those close to it. For example, to compute the three-period moving average for any time period, we would average the time-series values in that time period, the previous period, and the following period. We compute the three-period moving

averages for all time periods except the first and the last. To calculate the five-period moving average, we average the value in that time period, the values in the two preceding periods, and the values in the two following time periods. We can choose any number of periods with which to calculate the moving averages.

EXAMPLE 20.1

Data
Xm20-01

Gasoline Sales, Part 1

As part of an effort to forecast future sales, an operator of five independent gas stations recorded the quarterly gasoline sales (in thousands of gallons) for the past 4 years. These data are shown below. Calculate the three-quarter and five-quarter moving averages. Draw graphs of the time series and the moving averages.

Time Period	Year	Quarter	Gasoline Sales (Thousands of Gallons)
1	1	1	39
2		2	37
3		3	61
4		4	58
5	2	1	18
6		2	56
7		3	82
8		4	27
9	3	1	41
10		2	69
11		3	49
12		4	66
13	4	1	54
14		2	42
15		3	90
16		4	66

SOLUTION:

COMPUTE

MANUALLY:

To compute the first three-quarter moving average, we group the gasoline sales in periods 1, 2, and 3, and then average them. Thus, the first moving average is

$$\frac{39 + 37 + 61}{3} = \frac{137}{3} = 45.7$$

The second moving average is calculated by dropping the first period's sales (39), adding the fourth period's sales (58), and then computing the new average. Thus, the second moving average is

$$\frac{37 + 61 + 58}{3} = \frac{156}{3} = 52.0$$

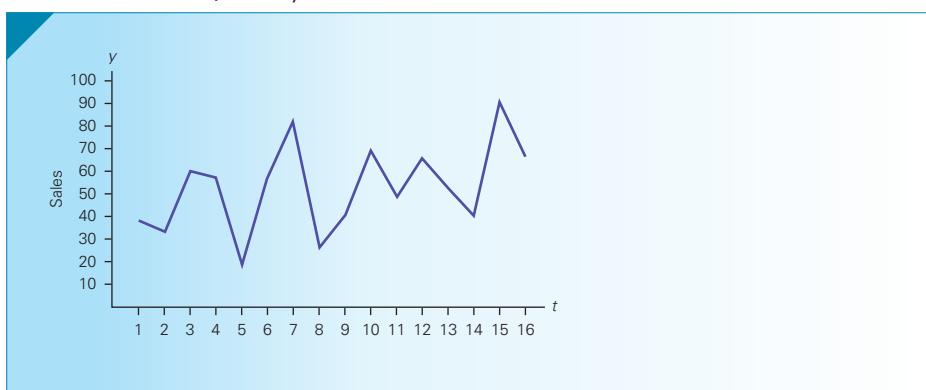
The process continues as shown in the following table. Similar calculations are made to produce the five-quarter moving averages (also shown in the table).

Time Period	Gasoline Sales	Three-Quarter Moving Average	Five-Quarter Moving Average
1	39	—	—
2	37	45.7	—
3	61	52.0	42.6
4	58	45.7	46.0
5	18	44.0	55.0
6	56	52.0	48.2
7	82	55.0	44.8
8	27	50.0	55.0
9	41	45.7	53.6
10	69	53.0	50.4
11	49	61.3	55.8
12	66	56.3	56.0
13	54	54.0	60.2
14	42	62.0	63.6
15	90	66.0	—
16	66	—	—

Notice that we place the moving averages in the center of the group of values being averaged. It is for this reason that we prefer to use an odd number of periods in the moving averages. Later in this section, we discuss how to deal with an even number of periods.

Figure 20.4 displays the line chart for gasoline sales, and Figure 20.5 shows the three-period and five-period moving averages.

FIGURE 20.4 Quarterly Gasoline Sales



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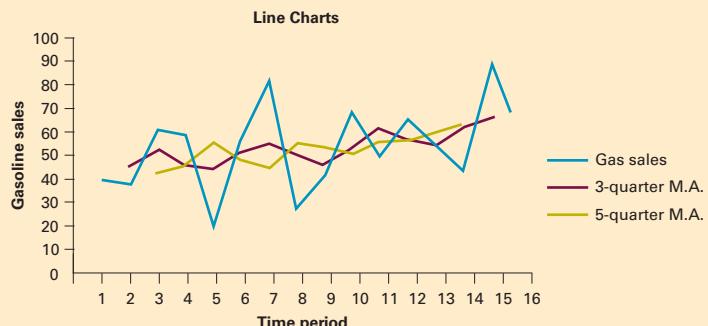
FIGURE 20.5 Quarterly Gasoline Sales and Three-Quarter and Five-Quarter Moving Averages



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EXCEL

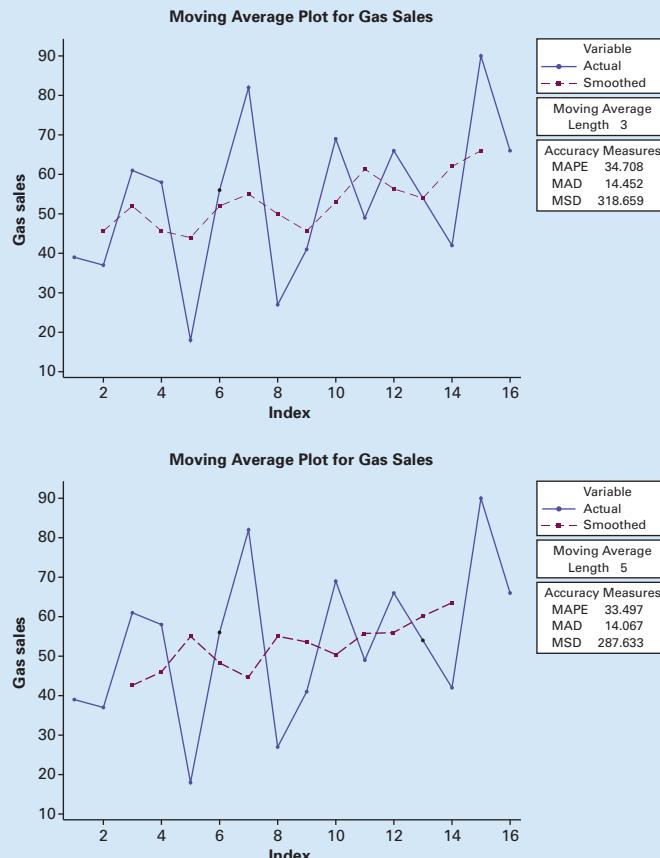
	A	B
1	Gas Sales	Moving Average
2	39	
3	37	45.7
4	61	52.0
5	58	45.7
6	18	44.0
7	56	52.0
8	82	55.0
9	27	50.0
10	41	45.7
11	69	53.0
12	49	61.3
13	66	56.3
14	54	54.0
15	42	62.0
16	90	66.0
17	66	

**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm20-01](#).)
2. Click **Data**, **Data Analysis**, and **Moving Average**.
3. Specify the **Input Range** (A1:A17). Specify the number of periods (3), and the **Output Range** (B1).
4. Delete the cells containing N/A.
5. To draw the line charts, follow the instructions on page 65.

MINITAB

Gas Sales	AVER1	AVER2
39	*	*
37	45.6667	*
61	52.0000	42.6
58	45.6667	46.0
18	44.0000	55.0
56	52.0000	48.2
82	55.0000	44.8
27	50.0000	55.0
41	45.6667	53.6
69	53.0000	50.4
49	61.3333	55.8
66	56.3333	56.0
54	54.0000	60.2
42	62.0000	63.6
90	66.0000	
66		



INSTRUCTIONS

1. Type or import the data into one column. ([Open Xm20-01](#).)
2. Click **Stat**, **Time series**, and **Moving Average . . .**.
3. Type or select the variable in the **Variable** box (**Gas sales**) and type the number of periods in the **MA length** box (3). Click **Center the moving averages**, **Storage . . .**, and **Moving averages**.
4. To draw the graph click **Graphs . . .** and **Plot smoothed vs. actual**.

INTERPRET

To see how the moving averages remove some of the random variation, examine Figures 20.4 and 20.5. Figure 20.4 depicts the quarterly gasoline sales. Discerning any of the time-series components is difficult because of the large amount of random variation. Now consider the three-quarter moving average in Figure 20.5. You should be able to detect the seasonal pattern that exhibits peaks in the third quarter of each year (periods 3, 7, 11, and 15) and valleys in the first quarter of the year (periods 5, 9, and 13). There is also a small but discernible long-term trend of increasing sales.

Notice also in Figure 20.5 that the five-quarter moving average produces more smoothing than the three-quarter moving average. In general, the longer the time period over which we average, the smoother the series becomes. Unfortunately, in this case we've smoothed too much—the seasonal pattern is no longer apparent in the five-quarter

moving average. All we can see is the long-term trend. It is important to realize that our objective is to smooth the time series sufficiently to remove the random variation and to reveal the other components (trend, cycle, or season) present. With too little smoothing, the random variation disguises the real pattern. With too much smoothing, however, some or all of the other effects may be eliminated along with the random variation.

20-2b Centered Moving Averages

Using an even number of periods to calculate the moving averages presents a problem about where to place the moving averages in a graph or table. For example, suppose that we calculate the four-period moving average of the following time series:

Period	Time Series
1	15
2	27
3	20
4	14
5	25
6	11

The first moving average is

$$\frac{15 + 27 + 20 + 14}{4} = 19.0$$

However, because this value represents time periods 1, 2, 3, and 4, we must place it between periods 2 and 3. The next moving average is

$$\frac{27 + 20 + 14 + 25}{4} = 21.5$$

and it must be placed between periods 3 and 4. The moving average that falls between periods 4 and 5 is

$$\frac{20 + 14 + 25 + 11}{4} = 17.5$$

There are several problems that result from placing the moving averages between time periods, including graphing difficulties. Centering the moving average corrects the problem. We do this by computing the two-period moving average of the four-period moving average. Thus, the centered moving average for period 3 is

$$\frac{19.0 + 21.5}{2} = 20.25$$

The centered moving average for period 4 is

$$\frac{21.5 + 17.5}{2} = 19.50$$

The following table summarizes these results.

Period	Time Series	Four-Period Moving Average	Four-Period Centered Moving Average
1	15	—	—
2	27	19.0	—
3	20	21.5	20.25
4	14	17.5	19.50
5	25	—	—
6	11	—	—

Minitab centers the moving averages on command. Excel does not center the moving averages.

20-2c Exponential Smoothing

Two drawbacks are associated with the moving average method of smoothing time series. First, we do not have moving averages for the first and last sets of time periods. If the time series has few observations, the missing values can represent an important loss of information. Second, the moving average “forgets” most of the previous time-series values. For example, in the five-quarter moving average described in Example 20.1, the average for quarter 4 reflects quarters 2, 3, 4, 5, and 6 but is not affected by quarter 1. Similarly, the moving average for quarter 5 forgets quarters 1 and 2. Both of these problems are addressed by **exponential smoothing**.

Exponentially Smoothed Time Series

$$S_t = w y_t + (1 - w) S_{t-1} \text{ for } t \geq 2$$

where

S_t = Exponentially smoothed time series at time period t

y_t = Time series at time period t

S_{t-1} = Exponentially smoothed time series at time period $t - 1$

w = Smoothing constant, where $0 \leq w \leq 1$

We begin by setting

$$S_1 = y_1$$

Then

$$\begin{aligned} S_2 &= w y_2 + (1 - w) S_1 \\ &= w y_2 + (1 - w) y_1 \\ S_3 &= w y_3 + (1 - w) S_2 \\ &= w y_3 + (1 - w)[w y_2 + (1 - w) y_1] \\ &= w y_3 + w(1 - w) y_2 + (1 - w)^2 y_1 \end{aligned}$$

and so on. In general, we have

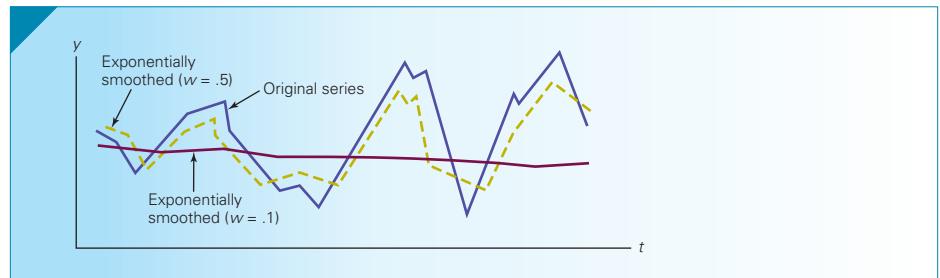
$$S_t = w y_t + w(1 - w) y_{t-1} + w(1 - w)^2 y_{t-2} + \cdots + (1 - w)^{t-1} y_1$$

This formula states that the smoothed time series in period t depends on all the previous observations of the time series.

The smoothing constant w is chosen on the basis of how much smoothing is required. A small value of w produces a great deal of smoothing. A large value of w

results in very little smoothing. Figure 20.6 depicts a time series and two exponentially smoothed series with $w = .1$ and $w = .5$.

FIGURE 20.6 Time Series and Two Exponentially Smoothed Series



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EXAMPLE 20.1

Gasoline Sales, Part 2

Apply the exponential smoothing technique with $w = .2$ and $w = .7$ to the data in Example 20.1, and graph the results.

SOLUTION:

COMPUTE

MANUALLY:

The exponentially smoothed values are calculated from the formula

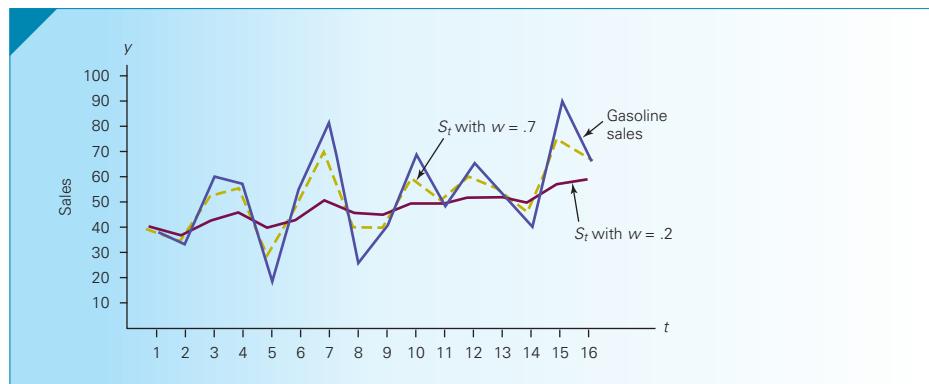
$$S_t = w y_t + (1 - w) S_{t-1}$$

The results with $w = .2$ and $w = .7$ are shown in the following table.

Time Period	Gasoline Sales	Exponentially Smoothed with $w = .2$	Exponentially Smoothed with $w = .7$
1	39	39.0	39.0
2	37	38.6	37.6
3	61	43.1	54.0
4	58	46.1	56.8
5	18	40.5	29.6
6	56	43.6	48.1
7	82	51.2	71.8
8	27	46.4	40.4
9	41	45.3	40.8
10	69	50.1	60.6
11	49	49.8	52.5
12	66	53.1	61.9
13	54	53.3	56.4
14	42	51.0	46.3
15	90	58.8	76.9
16	66	60.2	69.3

Figure 20.7 shows the exponentially smoothed time series.

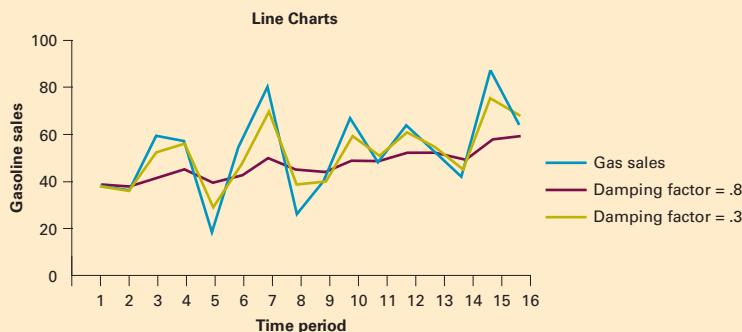
FIGURE 20.7 Quarterly Gasoline Sales and Exponentially Smoothed Sales with $w = .2$ and $w = .7$



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EXCEL

	A	B	C
1	Gas Sales	Damping factor = .8	Damping factor = .3
2	39	39.0	39.0
3	37	38.6	37.6
4	61	43.1	54.0
5	58	46.1	56.8
6	18	40.5	29.6
7	56	43.6	48.1
8	82	51.2	71.8
9	27	46.4	40.4
10	41	45.3	40.8
11	69	50.1	60.6
12	49	49.8	52.5
13	66	53.1	61.9
14	54	53.3	56.4
15	42	51.0	46.3
16	90	58.8	76.9
17	66	60.2	69.3



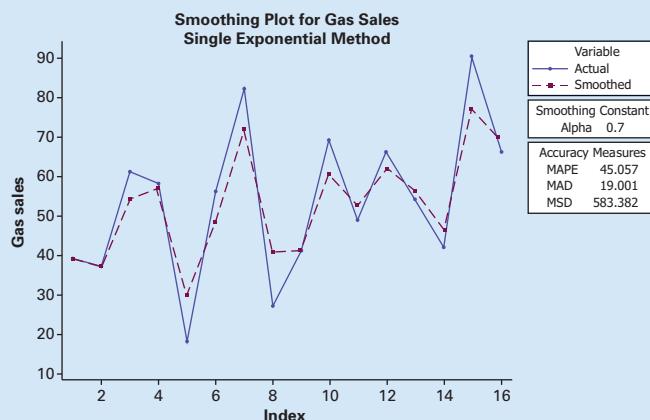
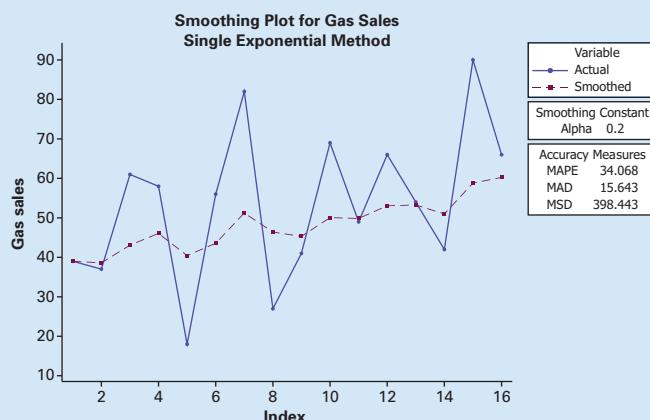
INSTRUCTIONS

1. Type or import the data into one column (Open Xm20-01.)
2. Click Data, Data Analysis, and Exponential Smoothing.
3. Specify the Input Range (A1:A17). Type the Damping factor, which is $1 - w$ (.8). Specify the Output Range (B1). To calculate the second exponentially smoothed time series specify $1 - w$ (.3) Output Range (C1).

To modify the table so that the smoothed values appear the way we calculated, manually click the cell containing the last smoothed value displayed here (58.8) and drag it to the cell below to reveal the final smoothed value (60.2 and 69.3).

MINITAB

Gas Sales	SMOO1	SMOO2
39	39.0000	39.0000
37	38.6000	37.6000
61	43.0800	53.9800
58	46.0640	56.7940
18	40.4512	29.6382
56	43.5610	48.0915
82	51.2488	71.8274
27	46.3990	40.4482
41	45.3192	40.8345
69	50.0554	60.5503
49	49.8443	52.4651
66	53.0754	61.9395
54	53.2603	56.3819
42	51.0083	46.3146
90	58.8066	76.8944
66	60.2453	69.2683



INSTRUCTIONS

1. Type or import the data into one column. (Open Xm20-01.)
2. Click **Stat**, **Time-series**, and **Single Exp Smoothing . . .**
3. Type or select the time variable in the **Variable** box (**Gas Sales**). Click **Use** under **Weight to use in Smoothing** and type the value of w (.2) (.7). Click **Options . . .**
4. Type 1 in the **Use average of first k observations K =** box.
5. Click **Storage . . .** and **Smoothed data**.

To draw the graph, click **Graphs . . .** and **Plot smoothed vs. actual**.

INTERPRET

Figure 20.7 depicts the graph of the original time series and the exponentially smoothed series. As you can see, $w = .7$ results in very little smoothing, whereas $w = .2$ results in perhaps too much smoothing. In both smoothed time series, it is difficult to discern the seasonal pattern that we detected by using moving averages. A different value of w (perhaps $w = .5$) would be likely to produce more satisfactory results.

Moving averages and exponential smoothing are relatively crude methods of removing the random variation to discover the existence of other components. In the next section, we attempt to measure these components more precisely.



EXERCISES

- 20.1** [Xr20-01](#) For the following time series, compute the three-period moving averages.

Period	Time Series	Period	Time Series
1	48	7	43
2	41	8	52
3	37	9	60
4	32	10	48
5	36	11	41
6	31	12	30

- 20.2** Compute the five-period moving averages for the time series in Exercise 20.1.
- 20.3** For Exercises 20.1 and 20.2, graph the time series and the two moving averages.
- 20.4** [Xr20-04](#) For the following time series, compute the three-period moving averages.

Period	Time Series	Period	Time Series
1	16	7	24
2	22	8	29
3	19	9	21
4	24	10	23
5	30	11	19
6	26	12	15

- 20.5** For Exercise 20.4, compute the five-period moving averages.

- 20.6** For Exercises 20.4 and 20.5, graph the time series and the two moving averages.

- 20.7** [Xr20-07](#) Apply exponential smoothing with $w = .1$ to help detect the components of the following time series.

Period	1	2	3	4	5
Time Series	12	18	16	24	17
Period	6	7	8	9	10
Time Series	16	25	21	23	14

- 20.8** Repeat Exercise 20.7 with $w = .8$.

- 20.9** For Exercises 20.7 and 20.8, draw the time series and the two sets of exponentially smoothed values. Does there appear to be a trend component in the time series?

- 20.10** [Xr20-10](#) Apply exponential smoothing with $w = .1$ to help detect the components of the following time series.

Period	1	2	3	4	5
Time Series	38	43	42	45	46
Period	6	7	8	9	10
Time Series	48	50	49	46	45

- 20.11** Repeat Exercise 20.10 with $w = .8$.
- 20.12** For Exercises 20.10 and 20.11, draw the time series and the two sets of exponentially smoothed values. Does there appear to be a trend component in the time series?
- 20.13** **Xr20-13** The following daily sales figures have been recorded in a medium-size merchandising firm.

Day	Week			
	1	2	3	4
Monday	43	51	40	64
Tuesday	45	41	57	58
Wednesday	22	37	30	33
Thursday	25	22	33	38
Friday	31	25	37	25

- a. Compute the three-day moving averages.
 b. Plot the time series and the moving averages on a graph.
 c. Does there appear to be a seasonal (weekly) pattern?
- 20.14** For Exercise 20.13, compute the five-day moving averages, and superimpose these on the same

graph. Does this help you answer part (c) of Exercise 20.13?

- 20.15** **Xr20-15** The following quarterly sales of a department store chain were recorded for the years 2010–2013.

Quarter	Year			
	2010	2011	2012	2013
1	18	33	25	41
2	22	20	36	33
3	27	38	44	52
4	31	26	29	45

- a. Calculate the four-quarter centered moving averages.
 b. Graph the time series and the moving averages.
 c. What can you conclude from your time-series smoothing?

- 20.16** Repeat Exercise 20.15, using exponential smoothing with $w = .4$.
- 20.17** Repeat Exercise 20.15, using exponential smoothing with $w = .8$.

20-3 TREND AND SEASONAL EFFECTS

In the previous section, we described how smoothing a time series can give us a clearer picture of which components are present. In order to forecast, however, we often need more precise measurements of the time-series components.

20-3a Trend Analysis

A trend can be linear or nonlinear and, indeed, can take on a whole host of functional forms. The easiest way of measuring the long-term trend is by regression analysis, where the independent variable is time. If we believe that the long-term trend is approximately linear, we will use the linear model introduced in Chapter 16:

$$y = \beta_0 + \beta_1 t + \varepsilon$$

If we believe that the trend is nonlinear, we can use one of the polynomial models described in Chapter 18. For example, the quadratic model is

$$y = \beta_0 + \beta_1 t + \beta_2 t^2 + \varepsilon$$

In most realistic applications, the linear model is used. We will demonstrate how the long-term trend is measured and applied later in this section.

20-3b Seasonal Analysis

Seasonal variation may occur within a year or within shorter intervals, such as a month, week, or day. To measure the seasonal effect, we compute seasonal indexes, which gauge the degree to which the seasons differ from one another. One requirement necessary to calculate seasonal indexes is a time series sufficiently long enough to allow us to observe the variable over several seasons. For example, if the seasons are defined as the quarters

of a year, we need to observe the time series for at least 4 years. The **seasonal indexes** are computed in the following way.

20-3c Procedure for Computing Seasonal Indexes

1. Remove the effect of seasonal and random variation by regression analysis; that is, compute the sample regression line

$$\hat{y}_t = b_0 + b_1 t$$

2. For each time period compute the ratio

$$\frac{y_t}{\hat{y}_t}$$

This ratio removes most of the trend variation.

3. For each type of season, compute the average of the ratios in step 2. This procedure removes most (but seldom all) of the random variation, leaving a measure of seasonality.
4. Adjust the averages in step 3 so that the average of all the seasons is 1 (if necessary).

EXAMPLE 20.3

Data
Xm20-03

Hotel Quarterly Occupancy Rates

The tourist industry is subject to seasonal variation. In most resorts, the spring and summer seasons are considered the “high” seasons. Fall and winter (except for Christmas and New Year’s) are “low” seasons. A hotel in Bermuda has recorded the occupancy rate for each quarter for the past 5 years. These data are shown here. Measure the seasonal variation by computing the seasonal indexes.

Year	Quarter	Occupancy Rate
2009	1	.561
	2	.702
	3	.800
	4	.568
2010	1	.575
	2	.738
	3	.868
	4	.605
2011	1	.594
	2	.738
	3	.729
	4	.600
2012	1	.622
	2	.708
	3	.806
	4	.632
2013	1	.665
	2	.835
	3	.873
	4	.670

SOLUTION:**COMPUTE****MANUALLY:**

We performed a regression analysis with y = occupancy rate and t = time period $1, 2, \dots, 20$. The regression equation is

$$\hat{y} = .639368 + .005246t$$

For each time period, we computed the ratio

$$\frac{y_t}{\hat{y}_t}$$

In the next step, we collected the ratios associated with each quarter and computed the average. We then computed the seasonal indexes by adjusting the average ratios so that they summed to 4.0, if necessary. In this example, it was not necessary.

Year	Quarter	t	y_t	$\hat{y} = .639368 + .005246t$	Ratio $\frac{y_t}{\hat{y}_t}$
2009	1	1	.561	.645	.870
	2	2	.702	.650	1.080
	3	3	.800	.655	1.221
	4	4	.568	.660	.860
2010	1	5	.575	.666	.864
	2	6	.738	.671	1.100
	3	7	.868	.676	1.284
	4	8	.605	.681	.888
2011	1	9	.594	.687	.865
	2	10	.738	.692	1.067
	3	11	.729	.697	1.046
	4	12	.600	.702	.854
2012	1	13	.622	.708	.879
	2	14	.708	.713	.993
	3	15	.806	.718	1.122
	4	16	.632	.723	.874
2013	1	17	.665	.729	.913
	2	18	.835	.734	1.138
	3	19	.873	.739	1.181
	4	20	.670	.744	.900

Year	Quarter			
	1	2	3	4
2009	.870	1.080	1.221	.860
2010	.864	1.100	1.284	.888
2011	.865	1.067	1.046	.854
2012	.879	.993	1.122	.874
2013	.913	1.138	1.181	.900
Average	.878	1.076	1.171	.875
Index	.878	1.076	1.171	.875

EXCEL

	A	B
1	Seasonal Indexes	
2		
3	Season	Index
4	1	0.8782
5	2	1.0756
6	3	1.1709
7	4	0.8753

INSTRUCTIONS

1. Type or import the time series in chronological order into one column and the codes representing the seasons into the next column. ([Open Xm20-03.](#))
2. Click **Tools, Data Analysis Plus**, and **Seasonal Indexes**.
3. Specify the **Input Range** ([A1:B21](#)).

MINITAB**Time Series Decomposition for Rate**

Fitted Trend Equation

$$Y_t = 0.638747 + 0.00535513*t$$

Seasonal Indices

Period	Index
1	0.87684
2	1.07939
3	1.17764
4	0.86613

Note: Some output has been omitted.

INSTRUCTIONS

1. Type or import the data into one column. ([Open file Xm20-03.](#))
2. Click **Stat, Time-series**, and **Decomposition . . .**
3. Select the **variable** ([Rate](#)), specify the **Seasonal length** ([4](#)), and click **Multiplicative** under **Model Type** and **Trend plus seasonal** under **Model Components**. Click **Options . . .**
4. Type [1](#) in the **First obs. is in period** box.
5. Click **Storage . . .** and **Seasonals**.

INTERPRET

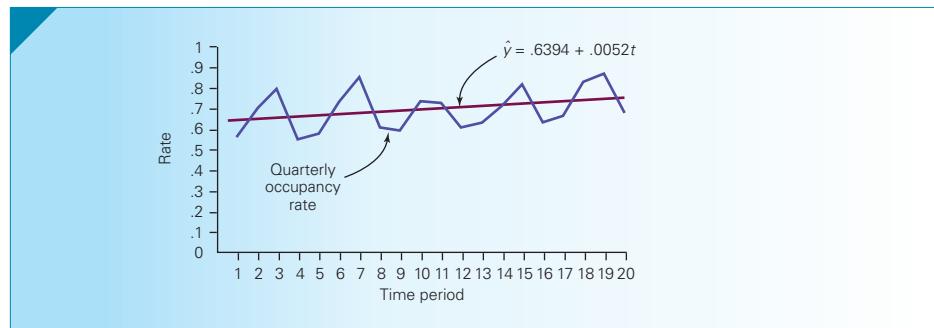
Note that Minitab's results differ from those computed manually and by Excel. (Minitab uses a technique other than ordinary least squares to produce the trend line.) In this example, the differences are small. However, in other cases there can be substantial differences. The discussion that follows uses Excel's figures.

The seasonal indexes tell us that, on average, the occupancy rates in the first and fourth quarters are below the annual average, and the occupancy rates in the second and third quarters are above the annual average. Using Excel's figures (the manually

calculated seasonal indexes are the same, but Minitab's indexes differ slightly), we expect the occupancy rate in the first quarter to be 12.2% ($100\% - 87.8\%$) below the annual rate. The second and third quarters' rates are expected to be 7.6% and 17.1%, respectively, above the annual rate. The fourth quarter's rate is 12.5% below the annual rate.

Figure 20.8 depicts the time series and the regression trend line.

FIGURE 20.8 Time Series and Trend for Example 20.3



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20-3d Deseasonalizing a Time Series

One application of seasonal indexes is to remove the seasonal variation in a time series. The process is called **deseasonalizing**, and the result is called a **seasonally adjusted time series**. Often this allows the statistics practitioner to more easily compare the time series across seasons. For example, the unemployment rate varies according to the season. During the winter months, unemployment usually rises; it falls in the spring and summer. The seasonally adjusted unemployment rate allows economists to determine whether unemployment has increased or decreased over the previous months. The process is easy: Simply divide the time series by the seasonal indexes. To illustrate, we have deseasonalized the occupancy rates in Example 20.3 (using the seasonal indexes produced by Excel). The results are shown next.

Year	Quarter	Occupancy Rate y_t	Seasonal Index	Seasonally Adjusted Occupancy Rate
2009	1	.561	.878	.639
	2	.702	1.076	.652
	3	.800	1.171	.683
	4	.568	.875	.649
2010	1	.575	.878	.655
	2	.738	1.076	.686
	3	.868	1.171	.741
	4	.605	.875	.691
2011	1	.594	.878	.677
	2	.738	1.076	.686
	3	.729	1.171	.623
	4	.600	.875	.686
2012	1	.622	.878	.708
	2	.708	1.076	.658
	3	.806	1.171	.688
	4	.632	.875	.722
2013	1	.665	.878	.757
	2	.835	1.076	.776
	3	.873	1.171	.746
	4	.670	.875	.766

By removing the seasonality, we can see when there has been a “real” increase or decrease in the occupancy rate. This enables the statistics practitioner to examine the factors that produced the rate change. We can more easily see that there has been an increase in the occupancy rate over the 5-year period.

In the next section, we show how to forecast with seasonal indexes.



EXERCISES

- 20.18** [Xr20-18](#) Plot the following time series. Would the linear or quadratic model fit better?

Period	1	2	3	4	5	6	7	8
Time Series	.5	.6	1.3	2.7	4.1	6.9	10.8	19.2

- 20.19** [Xr20-19](#) Plot the following time series to determine which of the trend models appears to fit better.

Period	1	2	3	4	5
Time Series	55	57	53	49	47

Period	6	7	8	9	10
Time Series	39	41	33	28	20

- 20.20** Refer to Exercise 20.18. Use regression analysis to calculate the linear and quadratic trends. Which line fits better?

- 20.21** Refer to Exercise 20.19. Use regression analysis to calculate the linear and quadratic trends. Which line fits better?

- 20.22** [Xr20-22](#) For the following time series, compute the seasonal (daily) indexes.

The regression line is

$$\hat{y} = 16.8 + .366t \quad (t = 1, 2, \dots, 20)$$

Day	Week			
	1	2	3	4
Monday	12	11	14	17
Tuesday	18	17	16	21
Wednesday	16	19	16	20
Thursday	25	24	28	24
Friday	31	27	25	32

- 20.23** [Xr20-23](#) Given the following time series, compute the seasonal indexes.

The regression equation is

$$\hat{y} = 47.7 - 1.06t \quad (t = 1, 2, \dots, 20)$$

Quarter	Year				
	1	2	3	4	5
1	55	41	43	36	50
2	44	38	39	32	25
3	46	37	39	30	24
4	39	30	35	25	22

Applications

- 20.24** [Xr20-24](#) The quarterly earnings (in \$millions) of a large soft-drink manufacturer have been recorded for the years 2010 to 2013. These data are listed here. Compute the seasonal indexes given the regression line

$$\hat{y} = 61.75 + 1.18t \quad (t = 1, 2, \dots, 16)$$

Quarter	Year			
	2010	2011	2012	2013
1	52	57	60	66
2	67	75	77	82
3	85	90	94	98
4	54	61	63	67

The following exercises require a computer and software.

- 20.25** [Xr20-25](#) College and university enrollment increased sharply during the 1970s and 1980s. However, since then, the rate of growth has slowed. To help forecast future enrollments, an economist recorded the total U.S. college and university enrollment from 1993 to 2009. These data (in thousands) are listed here.

Year	1993	1994	1995	1996	1997	1998	1999
Enrollment	13,898	15,022	14,715	15,226	15,436	15,546	15,203
Year	2000	2001	2002	2003	2004	2005	2006
Enrollment	15,314	15,873	16,497	16,638	17,272	17,487	17,672
Year	2007	2008	2009				
Enrollment	18,248	19,103	20,428				

Source: Statistical Abstract of the United States, 2009, Table 279.

- Plot the time series
- Use regression analysis to determine the trend.

- 20.26** [Xr20-26](#) Foreign trade is important to the United States. No country exports and imports more. However, there has been a large trade imbalance in many sectors. To measure the extent of the problem, an economist recorded the difference between exports and imports of merchandise (excluding military) for the years 1980 to 2012.

- Plot the trade balance.
- Apply regression analysis to measure the trend.

Source: Federal Reserve St. Louis.

- 20.27** **Xr20-27** The number of cable television subscribers has increased over the past 5 years. The marketing manager for a cable company has recorded the numbers of subscribers for the past 24 quarters.
- Plot the numbers.
 - Compute the seasonal (quarterly) indexes.
- 20.28** **Xr20-28** The owner of a pizzeria wants to forecast the number of pizzas she will sell each day. She recorded the numbers sold daily for the past 4 weeks. Calculate the seasonal (daily) indexes.
- 20.29** **Xr20-29** A manufacturer of ski equipment is in the process of reviewing his accounts receivable. He noticed that there appears to be a seasonal pattern with the accounts receivable increasing in the winter months and decreasing during the summer. The quarterly accounts receivable (in \$millions) were recorded. Compute the seasonal (quarterly) indexes.

20-4 / INTRODUCTION TO FORECASTING

Many different forecasting methods are available for the statistics practitioner. One factor to be considered in choosing among them is the type of component that makes up the time series. Even then, however, we have several different methods from which to choose. One way of deciding which method to apply is to select the technique that achieves the greatest forecast accuracy. The most commonly used measures of forecast accuracy are **mean absolute deviation (MAD)** and the **sum of squares for forecast errors (SSE)**.

Mean Absolute Deviation

$$\text{MAD} = \frac{\sum_{i=1}^n |y_t - F_t|}{n}$$

where

y_t = Actual value of the time series at time period t

F_t = Forecasted value of the time series at time period t

n = Number of time periods

Sum of Squares for Forecast Error

$$\text{SSE} = \sum_{i=1}^n (y_t - F_t)^2$$

MAD averages the absolute differences between the actual and forecast values; SSE is the sum of the squared differences. Which measure to use in judging forecast accuracy depends on the circumstances. If avoiding large errors is important, SSE should be used because it penalizes large deviations more heavily than does MAD. Otherwise, use MAD.

It is probably best to use some of the observations of the time series to develop several competing forecasting models and then forecast for the remaining time periods. Afterward, compute MAD or SSE for the forecasts. For example, if we have 5 years of monthly observations, use the first 4 years to develop the forecasting models and then use them to forecast the fifth year. Because we know the actual values in the fifth year, we can choose the technique that results in the most accurate forecast using either MAD or SSE.

EXAMPLE 20.4**Comparing Forecasting Models**

Annual data from 1976 to 2009 were used to develop three different forecasting models. Each model was used to forecast the time series for 2010, 2011, 2012, and 2013. The forecasted and actual values for these years are shown here. Use MAD and SSE to determine which model performed best.

Year	Actual Time Series	1	2	3
2010	129	136	118	130
2011	142	148	141	146
2012	156	150	158	170
2013	183	175	163	180

SOLUTION:

For model 1, we have

$$\begin{aligned} \text{MAD} &= \frac{|129 - 136| + |142 - 148| + |156 - 150| + |183 - 175|}{4} \\ &= \frac{7 + 6 + 6 + 8}{4} = 6.75 \\ \text{SSE} &= (129 - 136)^2 + (142 - 148)^2 + (156 - 150)^2 + (183 - 175)^2 \\ &= 49 + 36 + 36 + 64 = 185 \end{aligned}$$

For model 2, we compute

$$\begin{aligned} \text{MAD} &= \frac{|129 - 118| + |142 - 141| + |156 - 158| + |183 - 163|}{4} \\ &= \frac{11 + 1 + 2 + 20}{4} = 8.5 \\ \text{SSE} &= (129 - 118)^2 + (142 - 141)^2 + (156 - 158)^2 + (183 - 163)^2 \\ &= 121 + 1 + 4 + 400 = 526 \end{aligned}$$

The measures of forecast accuracy for model 3 are

$$\begin{aligned} \text{MAD} &= \frac{|129 - 130| + |142 - 146| + |156 - 170| + |183 - 180|}{4} \\ &= \frac{1 + 4 + 14 + 3}{4} = 5.5 \\ \text{SSE} &= (129 - 130)^2 + (142 - 146)^2 + (156 - 170)^2 + (183 - 180)^2 \\ &= 1 + 16 + 196 + 9 = 222 \end{aligned}$$

Model 2 is inferior to both models 1 and 3, no matter how we measure forecast accuracy. Using MAD, model 3 is best—but using SSE, model 1 is most accurate. The choice between model 1 and model 3 should be made on the basis of whether we prefer a model that consistently produces moderately accurate forecasts (model 1) or one whose forecasts come quite close to most actual values but miss badly in a small number of time periods (model 3).



EXERCISES

- 20.30** For the actual and forecast values of a time series shown here, calculate MAD and SSE

Period	1	2	3	4	5
Forecast	173	186	192	211	223
Actual Value	166	179	195	214	220

- 20.31** Two forecasting models were used to predict the future values of a time series. These are shown here together with the actual values. Compute MAD and SSE for each model to determine which was more accurate.

Period	1	2	3	4
Forecast (Model 1)	7.5	6.3	5.4	8.2
Forecast (Model 2)	6.3	6.7	7.1	7.5
Actual	6.0	6.6	7.3	9.4

- 20.32** Calculate MAD and SSE for the forecasts that follow.

Period	1	2	3	4	5
Forecast	63	72	86	71	60
Actual	57	60	70	75	70

- 20.33** Three forecasting techniques were used to predict the values of a time series. These values are given in the following table. Compute MAD and SSE for each technique to determine which was most accurate.

Period	1	2	3	4	5
Forecast (Model 1)	21	27	29	31	35
Forecast (Model 2)	22	24	26	28	30
Forecast (Model 3)	17	20	25	31	39
Actual	19	24	28	32	38

20-5 FORECASTING MODELS

There is a large number of different forecasting techniques available to statistics practitioners. However, many are beyond the level of this book. In this section, we present three models. Similar to the method of choosing the correct statistical inference technique in Chapters 12 to 19, the choice of model depends on the time-series components.

20-5a Forecasting with Exponential Smoothing

If the time series displays a gradual trend or no trend and no evidence of seasonal variation, exponential smoothing can be effective as a forecasting method. Suppose that t represents the most recent time period and we've computed the exponentially smoothed value S_t . This value is then the forecasted value at time $t + 1$; that is,

$$F_{t+1} = S_t$$

If we wish, we can forecast two or three or any number of periods into the future:

$$F_{t+2} = S_t \quad \text{or} \quad F_{t+3} = S_t$$

It must be understood that the accuracy of the forecast decreases rapidly for predictions more than one time period into the future. However, as long as we're dealing with time series with no cyclical or seasonal variation, we can produce reasonably accurate predictions for the next time period.

20-5b Forecasting with Seasonal Indexes

If the time series is composed of seasonal variation and long-term trend, we can use seasonal indexes and the regression equation to forecast.

Forecast of Trend and Seasonality

The forecast for time period t is

$$F_t = [b_0 + b_1 t] \times SI_t$$

where

F_t = Forecast for period t

$b_0 + b_1 t$ = Regression equation

SI_t = Seasonal index for period t

EXAMPLE 20.5**Forecasting Hotel Occupancy Rates**

Forecast hotel occupancy rates for next year in Example 20.3.

SOLUTION:

In the process of computing the seasonal indexes, we computed the trend line. It is

$$\hat{y} = .639 + .00525t$$

For $t = 21, 22, 23$, and 24 , we calculate the forecasted trend values.

Quarter	t	$\hat{y} = .639 + .00525t$
1	21	.639 + .00525(21) = .749
2	22	.639 + .00525(22) = .755
3	23	.639 + .00525(23) = .760
4	24	.639 + .00525(24) = .765

We now multiply the forecasted trend values by the seasonal indexes calculated in Example 20.3. The seasonalized forecasts are as follows:

Quarter	t	Trend Value \hat{y}_t	Seasonal Index	Forecast $F_t = \hat{y}_t \times SI_t$
1	21	.749	.878	.749 \times .878 = .658
2	22	.755	1.076	.755 \times 1.076 = .812
3	23	.760	1.171	.760 \times 1.171 = .890
4	24	.765	.875	.765 \times .875 = .670

INTERPRET

We forecast that the quarterly occupancy rates during the next year will be .658, .812, .890, and .670.

20-5c Autoregressive Model

In Chapter 17, we discussed autocorrelation wherein the errors are not independent of one another. The existence of strong autocorrelation indicates that the model has been misspecified, which usually means that until we improve the regression model,

it will not provide an adequate fit. However, autocorrelation also provides us with an opportunity to develop another forecasting technique. If there is no obvious trend or seasonality and we believe that there is a correlation between consecutive residuals, the **autoregressive model** may be most effective.

Autoregressive Forecasting Model

$$y_t = \beta_0 + \beta_1 y_{t-1} + \varepsilon$$

The model specifies that consecutive values of the time series are correlated. We estimate the coefficient in the usual way. The estimated regression line is defined as

$$\hat{y}_t = b_0 + b_1 y_{t-1}$$

EXAMPLE 20.6

Data
Xm20-06

Forecasting Changes to the Consumer Price Index

The consumer price index (CPI) is used as a general measure of inflation. It is an important measure because a high rate of inflation often influences governments to take corrective measures. The table below lists the consumer price index from 1980 to 2009 and the annual percentage increases in the CPI. Forecast next year's change in the CPI.

Year	CPI	% Change	Year	CPI	% Change
1980	82.4		1997	160.5	2.3%
1981	90.9	10.4%	1998	163.0	1.5%
1982	96.5	6.2%	1999	166.6	2.2%
1983	99.6	3.2%	2000	172.2	3.4%
1984	103.9	4.4%	2001	177.0	2.8%
1985	107.6	3.5%	2002	179.9	1.6%
1986	109.7	1.9%	2003	184.0	2.3%
1987	113.6	3.6%	2004	188.9	2.7%
1988	118.3	4.1%	2005	195.3	3.4%
1989	123.9	4.8%	2006	201.6	3.2%
1990	130.7	5.4%	2007	207.3	2.9%
1991	136.2	4.2%	2008	215.2	3.8%
1992	140.3	3.0%	2009	214.5	-0.3%
1993	144.5	3.0%	2010	218.1	1.6%
1994	148.2	2.6%	2011	224.9	3.1%
1995	152.4	2.8%	2012	229.6	2.1%
1996	156.9	2.9%			

Source: U.S. Bureau of Labor Statistics.

SOLUTION:

Notice that we included the CPI for 1980 because we wanted to determine the percentage change for 1981. We will use the percentage changes for 1981 to 2008 as the independent variable and the percentage change from 1982 to 2009 as the dependent variable. File Xm20-06 stores the data in the format necessary to determine the autoregressive model.

EXCEL

A	B	C	D	E
16	Coefficients	Standard Error	t Stat	P-value
17 Intercept	0.0175	0.0040	4.41	0.0001
18 % Change X	0.3910	0.1056	3.70	0.0009

MINITAB**Regression Analysis: % Change Y Versus % Change X**

The regression equation is
 $\% \text{ Change Y} = 0.0175 + 0.391 \% \text{ Change X}$

INTERPRET

The regression line is

$$\hat{y}_t = .0175 + .3910y_{t-1}$$

Because the last CPI change is 3.2%, our forecast for 2013 is

$$\begin{aligned}\hat{y}_{2010} &= .0175 + .3910y_{2012} \\ &= .0175 + .3910(2.1\%) = .84\%\end{aligned}$$

The autoregressive model forecasts a .84% increase in the CPI for the year 2013.

Housing Starts: Solution

A preliminary examination of the data reveals that there is a very small upward trend over the 5-year period. Moreover, the number of housing starts varies by month. The presence of these components suggests that we determine the linear trend and seasonal (monthly) indexes.



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EXCEL

With housing starts as the dependent variable and the month as the independent variable, Excel yielded the following regression line:

$$\hat{y} = 11.46 + .0808t \quad t = 1, 2, \dots, 60$$

The seasonal indexes were computed as follows. (See the instructions on page 846.)

A	B
1 Seasonal Indexes	
2	
3 Season	Index
4 1	0.5974
5 2	0.6548
6 3	0.9800
7 4	1.0697
8 5	1.1110
9 6	1.1917
10 7	1.2050
11 8	1.2276
12 9	1.0960
13 10	1.0226
14 11	0.9960
15 12	0.8483

The regression equation was used again to predict the number of housing starts based on the linear trend:

$$\hat{y} = 11.46 + .0808t \quad t = 61, 62, \dots, 72$$

These figures were multiplied by the seasonal indexes, which resulted in the following forecasts.

Period	Month	$\hat{y} = 11.46 + .0808t$	Seasonal Index	Forecasts
61	January	16.39	.5974	9.79
62	February	16.47	.6548	10.79
63	March	16.55	.9800	16.22
64	April	16.63	1.0697	17.79
65	May	16.71	1.1110	18.57
66	June	16.79	1.1917	20.01
67	July	16.87	1.2050	20.33
68	August	16.95	1.2276	20.81
69	September	17.04	1.0960	18.67
70	October	17.12	1.0226	17.50
71	November	17.20	.9960	17.13
72	December	17.28	.8483	14.66

This table displays the actual and forecasted housing starts for 2006. Figure 20.9 depicts the time series, trend line, and forecasts.

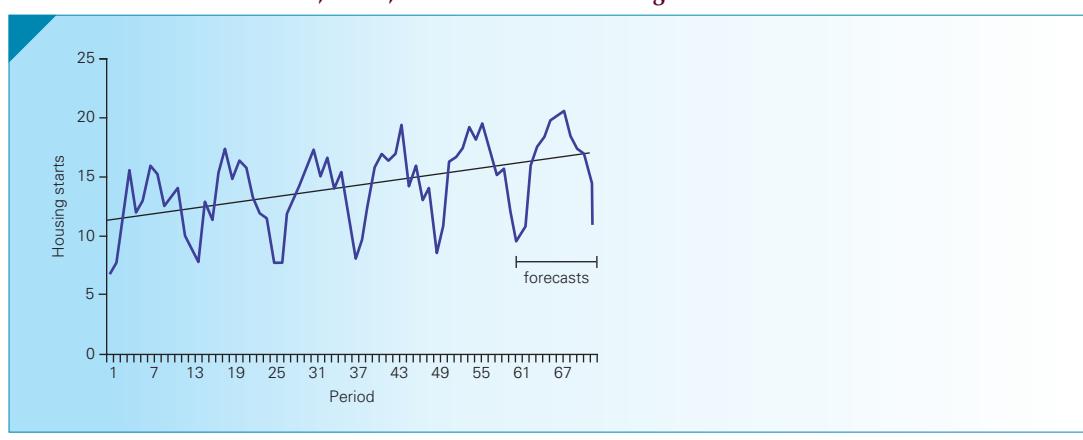
Period	Month	Forecasts	Actual
61	January	9.79	13.3
62	February	10.79	10.1
63	March	16.22	12.9
64	April	17.79	16.0
65	May	18.57	18.8
66	June	20.01	16.1
67	July	20.33	13.7
68	August	20.81	15.6
69	September	18.67	12.3
70	October	17.50	13.3
71	November	17.13	12.2
72	December	14.66	12.9

The size of the error was measured by MAD and SSE. They are

$$\text{MAD} = 42.55$$

$$\text{SSE} = 199.13$$

FIGURE 20.9 Time Series, Trend, and Forecasts of Housing Starts



MINITAB**Time Series Decomposition for Starts**

Multiplicative Model

Data	Starts
Length	60
NMissing	0

Fitted Trend Equation

$$Y_t = 11.921 + 0.0658*t$$

Seasonal Indices

Period	Index
1	0.57912
2	0.63392
3	0.95450
4	1.03338
5	1.13799
6	1.19369
7	1.21443
8	1.23142
9	1.09832
10	1.04138
11	0.00315
12	0.87869

Accuracy Measures

MAPE 6.98073
 MAD 0.95337
 MSD 1.32163

Forecasts

Period	Forecast
61	9.2293
62	10.1445
63	15.3375
64	16.6730
65	18.4357
66	19.4166
67	19.8341
68	20.1926
69	18.0823
70	17.2135
71	16.6477
72	14.6400

INSTRUCTIONS

Follow the instructions on page 846. For **Seasonal Length** type 12, check **Generate forecasts**, type 12 for the **Number of forecast**, and type 60 for **Starting from origin**.



EXERCISES

- 20.34** The following trend line and seasonal indexes were computed from 10 years of quarterly observations. Forecast the next year's time series.

$$\hat{y} = 150 + 3t \quad t = 1, 2, \dots, 40$$

Quarter	Seasonal Index
1	.7
2	1.2
3	1.5
4	.6

- 20.35** The following trend line and seasonal indexes were computed from 4 weeks of daily observations. Forecast the 7 values for next week.

$$\hat{y} = 120 + 2.3t \quad t = 1, 2, \dots, 28$$

Day	Seasonal Index
Sunday	1.5
Monday	.4
Tuesday	.5
Wednesday	.6
Thursday	.7
Friday	1.4
Saturday	1.9

- 20.36** Use the following autoregressive equation to forecast the next value of the time series if the last observed value is 65.

$$\hat{y} = 625 - 1.3y_{t-1}$$

- 20.37** The following autoregressive equation was developed. Forecast the next value if the last observed value was 11.

$$\hat{y} = 155 + 21y_{t-1}$$

- 20.38** Apply exponential smoothing with $w = .4$ to forecast the next four quarters in Exercise 20.15.

- 20.39** Use the seasonal indexes and trend line to forecast the time series for the next 5 days in Exercise 20.22.

- 20.40** Refer to Exercise 20.23. Use the seasonal indexes and the trend line to forecast the time series for the next four quarters.

Applications

- 20.41** Use the seasonal indexes and trend line to forecast the quarterly earnings for the years 2014 and 2015 in Exercise 20.24.

- 20.42** Refer to Exercise 20.25. Forecast next year's enrollment using the following methods.

- Autoregressive forecasting model.
- Exponential smoothing method with $w = .5$.

- 20.43** Refer to Exercise 20.26. Forecast next year's merchandise trade balance using the following methods.

- Autoregressive forecasting model.
- Exponential smoothing method with $w = .7$.

- 20.44** Use the seasonal indexes and trend line from Exercise 20.27 to forecast the number of cable subscribers for the next four quarters.

- 20.45** Refer to Exercise 20.28. Use the seasonal indexes and trend line to forecast the number of pizzas to be sold for each of the next 7 days.

- 20.46** Apply the trend line and seasonal indexes from Exercise 20.29 to forecast accounts receivable for the next four quarters.

Exercises 20.47–20.51 are based on the following problem.

Xr20-47 The revenues (in \$millions) of a chain of ice cream stores are listed for each quarter during the previous 5 years.

Quarter	Year				
	2009	2010	2011	2012	2013
1	16	14	17	18	21
2	25	27	31	29	30
3	31	32	40	45	52
4	24	23	27	24	32

- 20.47** Plot the time series.

- 20.48** Discuss why exponential smoothing is not recommended as a forecasting tool in this problem.

- 20.49** Use regression analysis to determine the trend line.

- 20.50** Determine the seasonal indexes.

- 20.51** Using the seasonal indexes and trend line, forecast revenues for the next four quarters.

- 20.52** **Xr20-52** The number of housing starts (in 1,000s) in the northeast United States for the years 2004 to 2009 were recorded.

- Use the 2004 to 2008 data to calculate the seasonal indexes.
- Use the indexes and regression analysis to forecast the number of housing starts in 2009.
- Calculate SSE and MAD to measure how well (or poorly) the forecasts fared.

CHAPTER SUMMARY

In this chapter, we discussed the classical time series and its decomposition into trend, seasonal, and random variation. Moving averages and exponential smoothing were used to remove some of the random variation, making it easier to detect trend and seasonality. The long-term trend

was measured by regression analysis. Seasonal variation was measured by computing the seasonal indexes. Three forecasting techniques were described in this chapter: exponential smoothing, forecasting with seasonal indexes, and the autoregressive model.

IMPORTANT TERMS:

Time series	830	Exponential smoothing	838
Forecasting	830	Seasonal indexes	844
Trend	831	Deseasonalizing	847
Secular trend	831	Seasonally adjusted time series	847
Cyclical variation	832	Mean absolute deviation (MAD)	849
Seasonal variation	832	Sum of squares for forecast error (SSE)	849
Random variation	832	Autoregressive model	853
Moving average	832		

SYMBOLS:

Symbol	Represents
y_t	Time series
S_t	Exponentially smoothed time series
w	Smoothing constant
F_t	Forecasted time series

FORMULAS:

Exponential smoothing Forecast of trend and seasonality

$$S_t = w y_t + (1 - w) S_{t-1}$$

Mean absolute deviation

$$\text{MAD} = \frac{\sum_{i=1}^n |y_t - F_t|}{n}$$

$$y_t = \beta_0 + \beta_1 y_{t-1} + \varepsilon$$

Autoregressive model

Sum of squares for error

$$SSE = \sum_{i=1}^n (y_t - F_t)^2$$

COMPUTER INSTRUCTIONS:

Technique	Excel	Minitab
Moving averages	835	835
Exponential smoothing	840	841
Seasonal indexes	846	846

21



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STATISTICAL PROCESS CONTROL

- 21-1 *Process Variation*
- 21-2 *Control Charts*
- 21-3 *Control Charts for Variables: \bar{x} and S Charts*
- 21-4 *Control Charts for Attributes: p Chart*

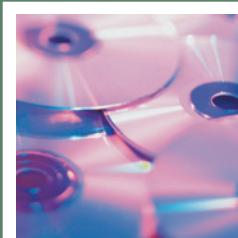
Detecting the Source of Defective Discs

Data

Xm21-00

A company that produces compact discs (CDs) has been receiving complaints from its customers about the large number of discs that will not store data properly. Company management has decided to institute statistical process control to remedy the problem. Every hour, a random sample of 200 discs is taken, and each disc is tested to determine whether it is defective. The number of defective discs in the samples of size 200 for the first 40 hours is shown here (in chronological order). Using these data, draw a *p* chart to monitor the production process. Was the process out of control when the sample results were generated?

19	5	16	20	6	12	18	6	13	15	10	6	7	10	18	20	13	6	8	3
8	7	4	19	3	19	9	10	10	18	15	16	5	14	3	10	19	13	19	9



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See solution on page
883.

INTRODUCTION

Operations managers are responsible for developing and maintaining the production processes that deliver quality products and services. In Section 14-6, we demonstrated an important application of the analysis of variance that is used to investigate sources of variation and determine ways to reduce that variation. The goal is to select the methods, materials, machines, and personnel (workers) that combine to yield the production process that features the smallest amount of variation at a reasonable cost. Once the production process is operating, it is necessary to constantly monitor the process to ensure that it functions the way it was designed. The statistical methods we are about to introduce are the most common application of statistics. At any point in time, there are literally thousands of firms applying these methods. This chapter deals with the subject of **statistical process control or SPC** (formerly called **quality control**).

There are two general approaches to the management of quality. The first approach is to produce the product and, at the completion of the production process, inspect the unit to determine whether it conforms to specifications; if it doesn't, the unit is either discarded or repaired. This approach has several drawbacks. Foremost among them is producing substandard products that are later discarded or fixed is costly. In recent years, this approach has been employed by a decreasing number of companies. Instead, many firms have adopted the **prevention approach**. Using the concepts of hypothesis testing, statistics practitioners concentrate on the production process. Rather than inspect the product, they inspect the process to determine when the process starts producing units that do not conform to specifications. This allows them to correct the production process before it creates a large number of defective products.

In Section 21-1, we discuss the problem of process variation and why it is often the key to the management of quality. In Section 21-2, we also introduce the concept and logic of control charts and show why they work. In the rest of the chapter, we introduce three specific control charts.

21-1 / PROCESS VARIATION

All production processes result in variation; that is, no product is exactly the same as another. You can see for yourself that this is true by weighing, for example, two boxes of breakfast cereal that are supposed to weigh 16 ounces each. They not only will not weigh exactly 16 ounces but also will not even have equal weights. All products exhibit some degree of variation. There are two sources of variation: *chance* and *assignable variation*. **Chance or common variation** is caused by a number of randomly occurring events that are part of the production process and, in general, cannot be eliminated without changing the process. In effect, chance variation was built into the product when the production process was first set up, perhaps as a result of a statistical analysis that attempted to minimize but not necessarily eliminate such variation. In Section 14-6, we discuss statistical techniques that allow firms to experiment to search for sources of variation and, in so doing, reduce the variation.

Assignable or special variation is caused by specific events or factors that are frequently temporary and that can usually be identified and eliminated. To illustrate, consider a paint company that produces and sells paint in 1-gallon cans. The cans are filled by an automatic valve that regulates the amount of paint in each can. The designers of the valve acknowledge that there will be some variation in the amount of paint even when the valve is working as it was designed to work. This is chance variation. Occasionally the valve will malfunction, causing the variation in the amount delivered to each can to increase. This increase is the assignable variation.

Perhaps the best way to understand what is happening is to consider the volume of paint in each can as a random variable. If the only sources of variation are caused by chance, then each can's volume is drawn from identical distributions; that is, each distribution has the same shape, mean, and standard deviation. Under such circumstances, the production process is said to be **under control**. In recognition of the fact that variation in output will occur even when the process is under control and operating properly, most processes are designed so that their products will fall within designated **specification limits** or "specs." For example, the process that fills the paint cans may be designed so that the cans contain between .99 and 1.01 gallons. Inevitably, some event or combination of factors in a production process will cause the process distribution to change. When it does, the process is said to be **out of control**. There are several possible ways for the process to go out of control. Here is a list of the most commonly occurring possibilities and their likely assignable causes.

- 1. Level shift.** This is a change in the mean of the process distribution. Assignable causes include machine breakdown, new machine or operator, or a change in the environment. In the paint-can illustration, a temperature or humidity change may affect the density of the paint, resulting in less paint in each can.
- 2. Instability.** This is the name we apply to the process when the standard deviation increases. (As we discuss later, a decrease in the standard deviation is desirable.) This may be caused by a machine in need of repair, defective materials, worn tools, or a poorly trained operator. Suppose, for example, that a part in the valve that controls the amount of paint wears down, causing greater variation than normal.
- 3. Trend.** When there is a slow steady shift (either up or down) in the process distribution mean, the result is a trend. This is frequently the result of less-than-regular maintenance, operator fatigue, residue or dirt buildup, or gradual loss of lubricant. If the paint-control valve becomes increasingly clogged, we would expect to see a steady decrease in the amount of paint delivered.
- 4. Cycle.** This is a repeated series of small observations followed by large observations. Likely assignable causes include environmental changes, worn parts, or operator fatigue. If there are changes in the voltage in the electricity that runs the machines in the paint-can example, we might see series of overfilled cans and series of underfilled cans.

The key to quality is to detect when the process goes out of control so that we can correct the malfunction and restore control. The control chart is the statistical method that we use to detect problems.



EXERCISES

- 21.1** What is meant by *chance variation*?
- 21.2** Provide two examples of production processes and their associated chance variation.
- 21.3** What is meant by *special variation*?
- 21.4** Your education as a statistics practitioner can be considered a production process overseen by the

course instructor. The variable we measure is the grade achieved by each student.

- a. Discuss chance variation—that is, describe the sources of variation that the instructor has no control over.
- b. Discuss special variation.

21-2 CONTROL CHARTS

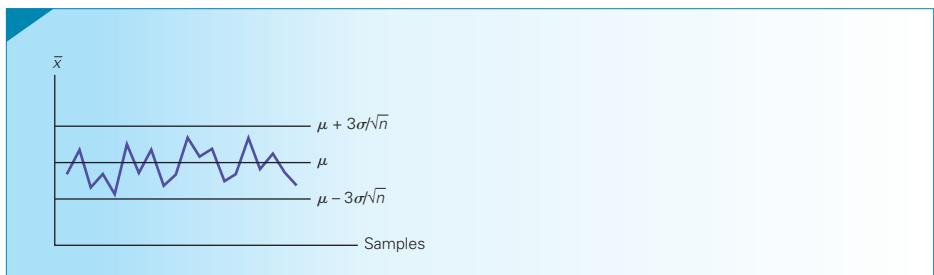
A **control chart** is a plot of statistics over time. For example, an \bar{x} chart plots a series of sample means taken over a period of time. Each control chart contains a **centerline** and **control limits**. The control limit above the centerline is called the **upper control limit** and that below the centerline is called the **lower control limit**. If, when the sample statistics are plotted, all points are randomly distributed between the control limits, we conclude that the process is under control. If the points are not randomly distributed between the control limits, we conclude that the process is out of control.

To illustrate the logic of control charts, let us suppose that in the paint-can example described previously we want to determine whether the central location of the distribution has changed from one period to another. We will draw our conclusion from an \bar{x} chart. For the moment, let us assume that we know the mean μ and standard deviation σ of the process when it is under control. We can construct the \bar{x} chart as shown in Figure 21.1. The chart is drawn so that the vertical axis plots the values of \bar{x} that will be calculated and the horizontal axis tracks the samples in the order in which they are drawn. The centerline is the value of μ . The control limits are set at three standard errors from the centerline. Recall that the standard error of \bar{x} is σ/\sqrt{n} . Hence, we define the control limits as follows:

$$\text{Lower control limit} = \mu - 3 \frac{\sigma}{\sqrt{n}}$$

$$\text{Upper control limit} = \mu + 3 \frac{\sigma}{\sqrt{n}}$$

FIGURE 21.1 \bar{x} Chart: μ and σ Known



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After we've constructed the chart by drawing the centerline and control limits, we use it to plot the sample means, which are joined to make it easier to interpret. The principles underlying control charts are identical to the principles of hypothesis testing. The null and alternative hypotheses are

H_0 : The process is under control

H_1 : The process is out of control

For an \bar{x} chart, the test statistic is the sample mean \bar{x} . However, because we're dealing with a dynamic process rather than a fixed population, we test a series of sample means: We compute the mean for each of a continuing series of samples taken over time. For each series of samples, we want to determine whether there is sufficient evidence to infer that the process mean has changed. We reject the null hypothesis if at any time the sample mean falls outside the control limits. It is logical to ask why we use 3 standard errors and not 2 or 1.96 or 1.645 as we did when we tested hypotheses about a population mean in Chapter 11. The answer lies in the way in which all tests are conducted. Because test conclusions are based on sample data, there are two possible errors. In statistical process

control, a Type I error occurs if we conclude that the process is out of control when, in fact, it is not. This error can be quite expensive because the production process must be stopped and the causes of the variation found and repaired. Consequently, we want the probability of a Type I error to be small. With control limits set at 3 standard errors from the mean, the probability of a Type I error for each sample is

$$\alpha = P(|z| > 3) = .0026$$

Recall that a small value of α results in a relatively large value of the probability of a Type II error. A Type II error occurs when at any sample we do not reject a false null hypothesis. This means that, for each sample, we are less likely to recognize when the process goes out of control. However, because we will be performing a series of tests (one for each sample), we will eventually discover that the process is out of control and take steps to rectify the problem.

Suppose that in order to test the production process that fills 1-gallon paint cans, we choose to take a sample of size 4 every hour. Let us also assume that we know the mean and standard deviation of the process distribution of the amount of paint when the process is under control, say, $\mu = 1.001$ and $\sigma = .006$. (This means that when the valve is working the way it was designed, the amount of paint put into each can is a random variable whose mean is 1.001 gallons and whose standard deviation is .006 gallon.) Thus,

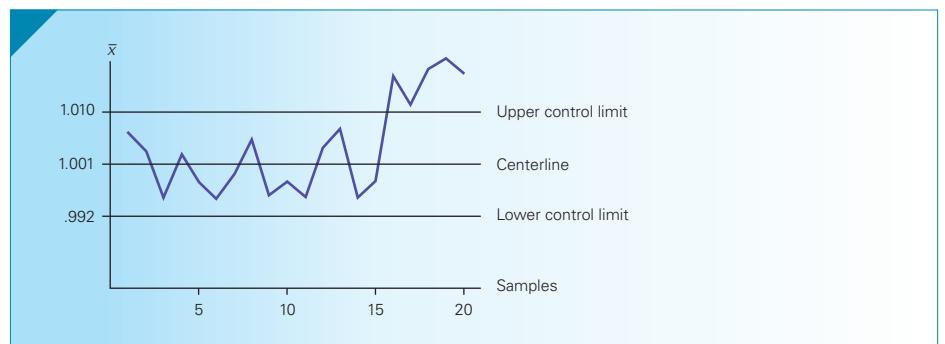
$$\text{Centerline} = \mu = 1.001$$

$$\text{Lower control limit} = \mu - 3 \frac{\sigma}{\sqrt{n}} = 1.001 - 3 \frac{.006}{\sqrt{4}} = 1.001 - .009 = .992$$

$$\text{Upper control limit} = \mu + 3 \frac{\sigma}{\sqrt{n}} = 1.001 + 3 \frac{.006}{\sqrt{4}} = 1.001 + .009 = 1.010$$

Figure 21.2 depicts a situation in which the first 15 samples were taken when the process was under control. However, after the 15th sample was drawn, the process went out of control and produced sample means outside the control limits. We conclude that the process distribution has changed because the data display variability beyond that predicted for a process with the specified mean and standard deviation. This means that the variation is assignable and that the cause must be identified and corrected.

FIGURE 21.2 \bar{x} Chart: Process Out of Control



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As we stated previously, SPC is a slightly different form of hypothesis testing. The concept is the same, but there are differences that you should be aware of. The most important difference is that when we tested means and proportions in Chapters 11 and 12, we were dealing with fixed but unknown parameters of populations. For instance, in Example 11.1 the population we dealt with was the account balances of the department store customers. The population mean balance was a constant value that we simply did not know. The purpose of the test was to determine whether there was enough statistical evidence to allow

us to infer that the mean balance was greater than \$170. So we took one sample and based the decision on the sample mean. When dealing with a production process, it's important to realize that the process distribution itself is variable; that is, at any time, the process distribution of the amount of paint fill may change if the valve malfunctions. Consequently, we do not simply take one sample and make the decision. Instead, we plot a number of statistics over time in the control chart. Simply put, in Chapters 11 through 18, we assumed static population distributions with fixed but unknown parameters, whereas in this chapter we assume a dynamic process distribution with parameters subject to possible shifts.

21-2a Sample Size and Sampling Frequency

In designing a control chart, the statistics practitioner must select a sample size and a sampling frequency. These decisions are based on several factors, including the costs of making Type I and Type II errors, the length of the production run, and the typical change in the process distribution when the process goes out of control. A useful aid in making the decision is the operating characteristic (OC) curve.

Operating Characteristic Curve Recall that in Chapter 11 we drew the **operating characteristic (OC) curve** that plotted the probabilities of Type II errors and population means. Here is how the OC curve for the \bar{x} chart is drawn.

Suppose that when the production process is under control the mean and standard deviation of the process variable are μ_0 and σ , respectively. For specific values of α and n , we can compute the probability of a Type II error when the process mean changes to $\mu_1 = \mu_0 + k\sigma$. A Type II error occurs when a sample mean falls between the control limits when the process is out of control. In other words, the probability of a Type II error is the probability that the \bar{x} chart will be unable to detect a shift of $k\sigma$ in the process mean on the first sample after the shift has occurred. Figure 21.3 depicts the OC curve for $n = 2, 3, 4$, and 5 . Figure 21.4 is the OC curve for $n = 10, 15, 20$, and 25 . (We drew two sets of curves because one alone would not provide the precision we need.) We can use the OC curves to help determine the sample size we should use.

Figure 21.3 tells us that for small shifts in the mean of 1 standard deviation or less, samples of size 2 to 5 produce probabilities of not detecting shifts that range between .8 and .95 (approximately). To appreciate the effect of large probabilities of Type II errors, consider the paint-can illustration. Suppose that when the process goes out of control it shifts the mean by about 1 standard deviation. The probability that the first sample after the shift will not detect this shift is approximately .85. The probability that it will not detect the shift for the first m samples after the shift is $.85^m$. Thus, for $m = 5$ the probability of not detecting the shift for the first five samples after the shift is .44. If

FIGURE 21.3 Operating Characteristic Curve for $n = 2, 3, 4$, and 5

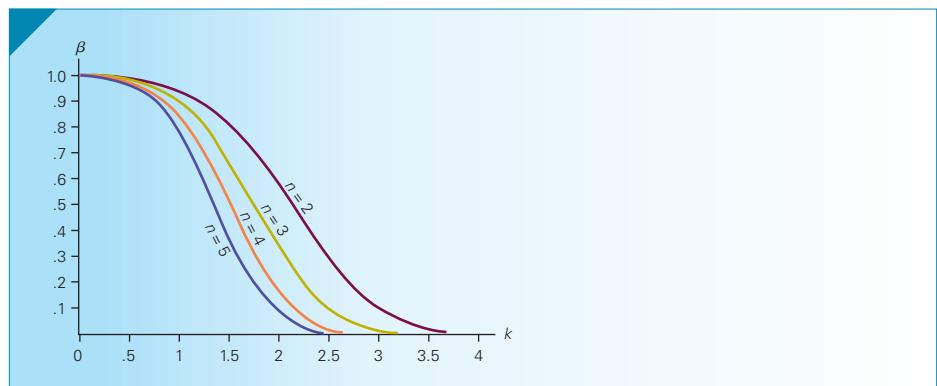
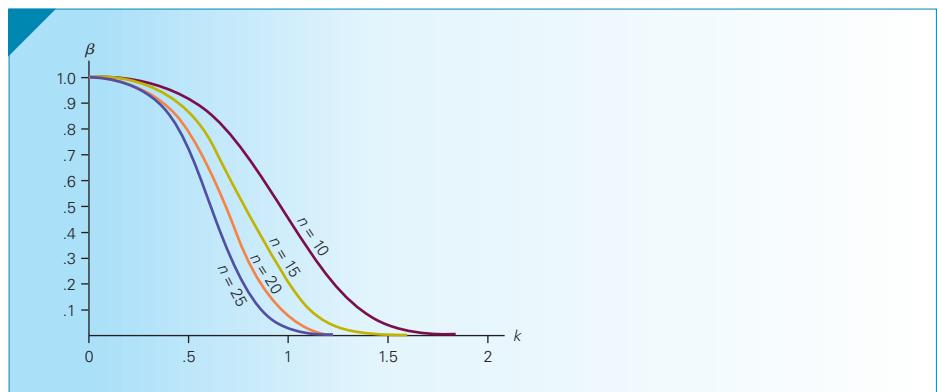


FIGURE 21.4 Operating Characteristic Curve for $n = 10, 15, 20$, and 25 

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the process fills 1,000 cans per hour, a large proportion of the 5,000 cans filled will be overfilled or underfilled (depending on the direction of the shift). Figure 21.4 suggests that when the shift moves the process mean by 1 standard deviation, samples of size 15 or 20 are recommended. For $n = 15$, the probability that a shift of 1 standard deviation will not be detected by the first sample is approximately .2.

If the typical shift is 2 or more standard deviations, samples of size 4 or 5 will likely suffice. For $n = 5$, the probability of a Type II error is about .07.

Using the Computer

EXCEL

As we did in Chapter 11, we can use the computer to determine the probability of a Type II error. Here is the printout for $k = 1.5$ and $n = 4$. (See page 376 for instructions.)

	A	B	C	D
1	Type II Error			
2				
3	H0: MU	0	Critical values	-1.51
4	SIGMA	1		1.51
5	Sample size	4	Prob(Type II error)	0.5046
6	ALPHA	0.0026	Power of the test	0.4954
7	H1: MU	1.5		

MINITAB

As we did in Chapter 11, we can use the computer to determine the probability of a Type II error. Here is the printout for $k = 1.5$ and $n = 4$. (See page 376 for instructions.)

Power and Sample Size			
1-Sample Z Test			
Testing mean = null (versus not = null) Calculating power for mean = null + difference Alpha = 0.0026 Assumed standard deviation = 1			
Difference	Sample Size	Power	
1.5	4	0.4954	

Minitab prints the power of the test. Recall that the power of the test is $1 - \beta$.

21-2b Average Run Length

The **average run length (ARL)** is the expected number of samples that must be taken before the chart indicates that the process has gone out of control. The ARL is determined by

$$\text{ARL} = \frac{1}{P}$$

where P is the probability that a sample mean falls outside the control limits. Assuming that the control limits are defined as 3 standard errors above and below the centerline, the probability that a sample mean falls outside the control limits when the process is under control is

$$P = P(|z| > 3) = .0026$$

Thus,

$$\text{ARL} = \frac{1}{.0026} = 385$$

This means that when the process is under control, the \bar{x} chart will erroneously conclude that it is out of control once every 385 samples on average. If the sampling plan calls for samples to be taken every hour, on average there will be a *false alarm* once every 385 hours.

We can use the OC curve to determine the average run length until the \bar{x} chart detects a process that is out of control. Suppose that when the process goes out of control, it typically shifts the process mean 1.5 standard deviations to the right or left. From Figure 21.3, we can see that for $n = 4$ and $k = 1.5$ the probability of a Type II error is approximately .5; that is, the probability that a mean falls between the control limits, which indicates that the process is under control when there has been a shift of 1.5 standard deviations, is .5. The probability that the sample mean falls outside the control limits is $P = 1 - .5 = .5$. Thus, the average run length is

$$\text{ARL} = \frac{1}{.5} = 2$$

This means that the control chart will require two samples on average to detect a shift of 1.5 standard deviations. Suppose that a shift of this magnitude results in an unacceptably high number of nonconforming cans. We can reduce that number in two ways: by sampling more frequently or increasing the sample size. For example, if we take samples of size 4 every half hour, then on average it will take 1 hour to detect the shift and make repairs. If we take samples of size 10 every hour, Figure 21.4 indicates that the probability of a Type II error when the shift is 1.5 standard deviations is about .05. Thus, $P = 1 - .05 = .95$ and

$$\text{ARL} = \frac{1}{.95} = 1.05$$

This tells us that a sample size of 10 will allow the statistics practitioner to detect a shift of 1.5 standard deviations about twice as quickly as a sample of size 4.

21-2c Changing the Control Limits

Another way to decrease the probability of a Type II error is to increase the probability of making a Type I error. Thus, we may define the control limits so that they are two standard errors above and below the centerline. To judge whether this is advisable, it is necessary to draw the OC curve for this plan.

In our demonstration of the logic of control charts, we resorted to traditional methods of presenting inferential methods; we assumed that the process parameters were known. When the parameters are unknown, we estimate their values from the sample data. In the next two sections, we discuss how to construct and use control charts in more realistic situations. In Section 21-3, we present control charts when the data are interval. In the context of statistical process control, we call these **control charts for variables**. Section 21-4 demonstrates the use of control charts that record whether a unit is defective or nondefective. These are called **control charts for attributes**.



EXERCISES

- 21.5** If the control limits of an \bar{x} chart are set at 2.5 standard errors from the centerline, what is the probability that on any sample the control chart will indicate that the process is out of control when it is under control?
- 21.6** Refer to Exercise 21.5. What is the average run length until the \bar{x} chart signals that the process is out of control when it is under control?
- 21.7** The control limits of an \bar{x} chart are set at two standard errors from the centerline. Calculate the probability that on any sample the control chart will indicate that the process is out of control when it is under control.
- 21.8** Refer to Exercise 21.7. Determine the ARL until the \bar{x} chart signals that the process is out of control when it is under control.

Exercises 21.9 to 21.15 are based on the following scenario.

A production facility produces 100 units per hour and uses an \bar{x} chart to monitor its quality. The control limits are set at 3 standard errors from the mean. When the process goes out of control, it usually shifts the mean by 1.5 standard deviations. Sampling is conducted once per hour with a sample size of 3.

- 21.9** On average, how many units will be produced until the control chart signals that the process is out of control when it is under control?
- 21.10** Refer to Exercise 21.9.
 - a. Find the probability that the \bar{x} chart does not detect a shift of 1.5 standard deviations on the first sample after the shift occurs.
 - b. Compute the probability that the \bar{x} chart will not detect the shift for the first eight samples after the shift.
- 21.11** Refer to Exercise 21.10. Find the average run length to detect the shift.
- 21.12** The operations manager is unsatisfied with the current sampling plan. He changes it to samples of

size 2 every half hour. What is the average number of units produced until the chart indicates that the process is out of control when it is not?

- 21.13** Refer to Exercise 21.12.
 - a. Find the probability that the \bar{x} chart does not detect a shift of 1.5 standard deviations on the first sample after the shift occurs.
 - b. Compute the probability that the \bar{x} chart will not detect the shift for the first eight samples after the shift.
- 21.14** Refer to Exercise 21.13. What is the average run length to detect the shift?
- 21.15** Write a brief report comparing the sampling plans described in Exercises 21.9 and 21.12. Discuss the relative costs of the two plans and the frequency of Type I and Type II errors.

Exercises 21.16 to 21.22 are based on the following scenario.

A firm that manufactures notebook computers uses statistical process control to monitor all its production processes. For one component, the company draws samples of size 10 every 30 minutes. The company makes 4,000 of these components per hour. The control limits of the \bar{x} chart are set at 3 standard errors from the mean. When the process goes out of control, it usually shifts the mean by .75 standard deviation.

- 21.16** On average how many units will be produced until the control chart signals that the process is out of control when it is under control?
- 21.17** Refer to Exercise 21.16.
 - a. Find the probability that the \bar{x} chart does not detect a shift of .75 standard deviation on the first sample after the shift occurs.
 - b. Compute the probability that the \bar{x} chart will not detect the shift for the first four samples after the shift.
- 21.18** Refer to Exercise 21.17. Find the average run length to detect the shift.

- 21.19** The company is considering changing the sampling plan so that 20 components are sampled every hour. What is the average number of units produced until the chart indicates that the process is out of control when it is not?
- 21.20** Refer to Exercise 21.19.
- Find the probability that the \bar{x} chart does not detect a shift of .75 standard deviation on the first sample after the shift occurs.
- 21.21** Refer to Exercise 21.20. What is the average run length to detect the shift?
- 21.22** Write a brief report comparing the sampling plans described in Exercises 21.16 and 21.19. Discuss the relative costs of the two plans and the frequency of Type I and Type II errors.

21-3 CONTROL CHARTS FOR VARIABLES: \bar{X} AND S CHARTS

There are several ways to judge whether a change in the process distribution has occurred when the data are interval. To determine whether the distribution means have changed, we employ the \bar{x} chart. To determine whether the process distribution standard deviation has changed, we can use the S (which stands for *standard deviation*) chart or the R (which stands for *range*) chart.

Throughout this textbook, we have used the sample standard deviation to estimate the population standard deviation. However, for a variety of reasons, SPC frequently employs the range instead of the standard deviation. This is primarily because computing the range is simpler than computing the standard deviation. Because many practitioners conducting SPC perform calculations by hand (with the assistance of a calculator), they select the computationally simple range as the method to estimate the process standard deviation. In this section, we will introduce control charts that feature the sample standard deviation. In our Keller's website Appendix Control Charts for Variables X and R Charts, we employ the sample range to construct our charts.

21-3a \bar{x} Chart

In Section 21-2, we determined the centerline and control limits of an \bar{x} chart using the mean and standard deviation of the process distribution. However, it is unrealistic to believe that the mean and standard deviation of the process distribution are known. Thus, to construct the \bar{x} chart, we need to estimate the relevant parameters from the data.

We begin by drawing samples when we have determined that the process is under control. The sample size must lie between 2 and 25. We discuss later how to determine that the process is under control. For each sample, we compute the mean and the standard deviation. The estimator of the mean of the distribution is the mean of the sample means (denoted $\bar{\bar{x}}$):

$$\bar{\bar{x}} = \frac{\sum_{j=1}^k \bar{x}_j}{k}$$

where \bar{x}_j is the mean of the j th sample and there are k samples. (Note that $\bar{\bar{x}}$ is simply the average of all nk observations.)

To estimate the standard deviation of the process distribution, we calculate the sample variance s_j^2 for each sample. We then compute the pooled standard deviation,* which we denote S and define as

$$S = \sqrt{\frac{\sum_{j=1}^k s_j^2}{k}}$$

In the previous section, where we assumed that the process distribution mean and variance were known, the centerline and control limits were defined as

$$\text{Centerline} = \mu$$

$$\text{Lower control limit} = \mu - 3 \frac{\sigma}{\sqrt{n}}$$

$$\text{Upper control limit} = \mu + 3 \frac{\sigma}{\sqrt{n}}$$

Because the values of μ and σ are unknown, we must use the sample data to estimate them. The estimator of μ is \bar{x} , and the estimator of σ is S . Therefore, the centerline and control limits are as shown in the box.

Centerline and Control Limits for \bar{x} Chart

$$\text{Centerline} = \bar{\bar{x}}$$

$$\text{Lower control limit} = \bar{\bar{x}} - 3 \frac{S}{\sqrt{n}}$$

$$\text{Upper control limit} = \bar{\bar{x}} + 3 \frac{S}{\sqrt{n}}$$

EXAMPLE 21.1

Data
Xm21-01

Statistical Process Control at Lear Seating, Part 1

Lear Seating of Kitchener, Ontario, manufactures seats for Chrysler, Ford, and General Motors cars. Several years ago, Lear instituted statistical process control, which has resulted in improved quality and lower costs. One of the components of a front-seat cushion is a wire spring produced from 4-mm (millimeter) steel wire. A machine is used to bend the wire so that the spring's length is 500 mm. If the springs are longer than 500 mm, they will loosen and eventually fall out. If they are too short, they won't easily fit into position. (In fact, in the past, when there were a relatively large number of short springs, workers incurred arm and hand injuries when attempting to install the springs.) To determine whether the process is under control, random samples of four springs are taken every hour. The last 25 samples are shown here. Construct an \bar{x} chart from these data.

*This formula requires that the sample size be the same for all samples, a condition that is imposed throughout this chapter.

SAMPLE

1	501.02	501.65	504.34	501.10
2	499.80	498.89	499.47	497.90
3	497.12	498.35	500.34	499.33
4	500.68	501.39	499.74	500.41
5	495.87	500.92	498.00	499.44
6	497.89	499.22	502.10	500.03
7	497.24	501.04	498.74	503.51
8	501.22	504.53	499.06	505.37
9	499.15	501.11	497.96	502.39
10	498.90	505.99	500.05	499.33
11	497.38	497.80	497.57	500.72
12	499.70	500.99	501.35	496.48
13	501.44	500.46	502.07	500.50
14	498.26	495.54	495.21	501.27
15	497.57	497.00	500.32	501.22
16	500.95	502.07	500.60	500.44
17	499.70	500.56	501.18	502.36
18	501.57	502.09	501.18	504.98
19	504.20	500.92	500.02	501.71
20	498.61	499.63	498.68	501.84
21	499.05	501.82	500.67	497.36
22	497.85	494.08	501.79	501.95
23	501.08	503.12	503.06	503.56
24	500.75	501.18	501.09	502.88
25	502.03	501.44	498.76	499.39

SOLUTION:**COMPUTE****MANUALLY:**

The means and standard deviations for each sample were computed and are listed in Table 21.1. We then calculated the mean of the means (which is also the mean of all 100 numbers) and the pooled standard deviation:

$$\bar{\bar{x}} = 500.296$$

$$S = 1.971$$

Thus, the centerline and control limits are

$$\text{Centerline} = \bar{\bar{x}} = 500.296$$

$$\text{Lower control limit} = \bar{\bar{x}} - 3 \frac{S}{\sqrt{n}} = 500.296 - 3 \frac{1.971}{\sqrt{4}} = 497.340$$

$$\text{Upper control limit} = \bar{\bar{x}} + 3 \frac{S}{\sqrt{n}} = 500.296 + 3 \frac{1.971}{\sqrt{4}} = 503.253$$

The centerline and control limits are drawn and the sample means plotted in the order in which they occurred. The manually drawn chart is identical to the Excel and Minitab versions shown here.

TABLE 21.1 Means and Standard Deviations of Samples in Example 21.1

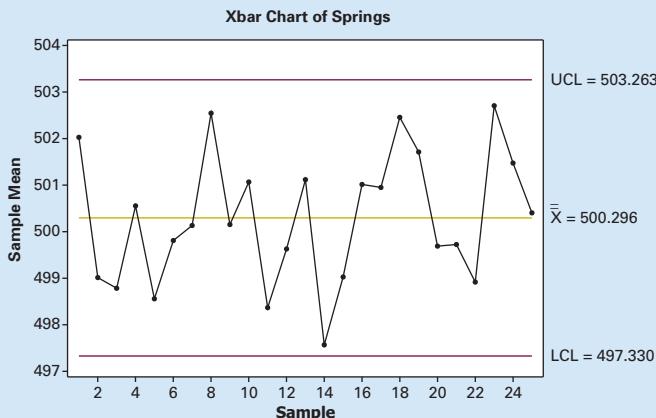
SAMPLE					\bar{x}_j	s_j
1	501.02	501.65	504.34	501.10	502.03	1.567
2	499.80	498.89	499.47	497.90	499.02	0.833
3	497.12	498.35	500.34	499.33	498.79	1.376
4	500.68	501.39	499.74	500.41	500.56	0.683
5	495.87	500.92	498.00	499.44	498.56	2.152
6	497.89	499.22	502.10	500.03	499.81	1.763
7	497.24	501.04	498.74	503.51	500.13	2.741
8	501.22	504.53	499.06	505.37	502.55	2.934
9	499.15	501.11	497.96	502.39	500.15	1.978
10	498.90	505.99	500.05	499.33	501.07	3.316
11	497.38	497.80	497.57	500.72	498.37	1.578
12	499.70	500.99	501.35	496.48	499.63	2.216
13	501.44	500.46	502.07	500.50	501.12	0.780
14	498.26	495.54	495.21	501.27	497.57	2.820
15	497.57	497.00	500.32	501.22	499.03	2.059
16	500.95	502.07	500.60	500.44	501.02	0.735
17	499.70	500.56	501.18	502.36	500.95	1.119
18	501.57	502.09	501.18	504.98	502.46	1.724
19	504.20	500.92	500.02	501.71	501.71	1.796
20	498.61	499.63	498.68	501.84	499.69	1.507
21	499.05	501.82	500.67	497.36	499.73	1.943
22	497.85	494.08	501.79	501.95	498.92	3.741
23	501.08	503.12	503.06	503.56	502.71	1.106
24	500.75	501.18	501.09	502.88	501.48	0.955
25	502.03	501.44	498.76	499.39	500.41	1.576

EXCEL

	A	B	C
1	Statistical Process Control		
2			
3			Springs
4	Upper control limit		503.253
5	Centerline		500.2964
6	Lower control limit		497.3398

**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm21-01](#))
2. Click **Add-Ins**, **Data Analysis Plus**, and **Statistical Process Control**.
3. Specify the **Input Range** ([A1:101](#)) and the **Sample Size** ([4](#)). Click **XBAR (Using S)**.

MINITAB**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm21-01](#).)
2. Click **Stat**, **Control Charts**, **Variable charts for subgroups**, and **Xbar**
3. Specify **All observations for a chart are in one column**. Type or select the variable ([Springs](#)). Type the **Subgroup sizes** (4). Click **Xbar Options**
4. Click **Estimate** Under **Method for estimating standard deviation**, click **Pooled standard deviation**.

INTERPRET

As you can see, no point lies outside the control limits. We conclude that the variation in the lengths of the springs is caused by chance—that is, there is not enough evidence to infer that the process is out of control. No remedial action by the operator is called for.

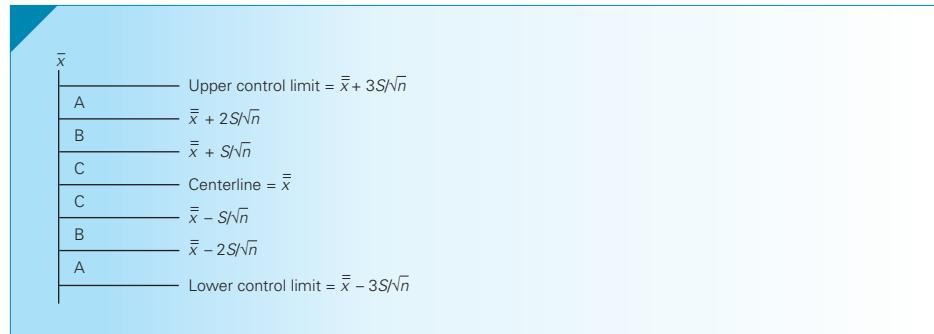
We stress that statistical process control allows us to detect assignable variation only. In Example 21.1, we determined that the process is under control, which means that there are no detectable sources of assignable variation. However, this does not mean that the process is a good one. It may well be that the production process yields a large proportion of defective units because the amount of chance variation is large. Recall that in Section 14-6 we noted that chance variation decreases product quality and increases costs. If the costs of producing defective units are high because of large chance variation, we can improve quality and reduce costs only by changing the process itself, which is management's responsibility.

21-3b Pattern Tests to Determine When the Process Is Out of Control

When we tested hypotheses in the other parts of this book, we used only one sample statistic to make a decision. However, in statistical process control, the decision is made from a series of sample statistics. In the \bar{x} chart, we make the decision after plotting at

least 25 sample means. As a result, we can develop tests that are based on the pattern the sample means make when plotted. To describe them, we need to divide the \bar{x} chart between the control limits into six zones, as shown in Figure 21.5. The C zones represent the area within one standard error of the centerline. The B zones are the regions between one and two standard errors from the centerline. The spaces between two and three standard errors from the centerline are defined as A zones.

FIGURE 21.5 Zones of \bar{x} Chart



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The width of the zones is one standard error of $\bar{x}(S/\sqrt{n})$. If the calculations were performed manually, the value of S will be known. However, if a computer was used, the centerline and control limits are the only statistics printed. We can calculate S/\sqrt{n} by finding the difference between the upper and lower control limits and dividing the difference by 6; that is,

$$S/\sqrt{n} = \frac{(\bar{x} + 3S/\sqrt{n}) - (\bar{x} - 3S/\sqrt{n})}{6} = \frac{503.253 - 497.340}{6} = .9855$$

Figure 21.6 describes the centerline, control limits, and zones for Example 21.1.

FIGURE 21.6 Zones of \bar{x} Chart: Example 21.1



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Several pattern tests can be applied. We list eight tests that are conducted by Minitab and by Data Analysis Plus.

Test 1: One point beyond zone A. This is the method discussed previously, where we conclude that the process is out of control if any point is outside the control limits.

Test 2: Nine points in a row in zone C or beyond (on the same side of the centerline).

Test 3: Six increasing or six decreasing points in a row.

Test 4: Fourteen points in a row alternating up and down.

Test 5: Two out of three points in a row in zone A or beyond (on the same side of the centerline).

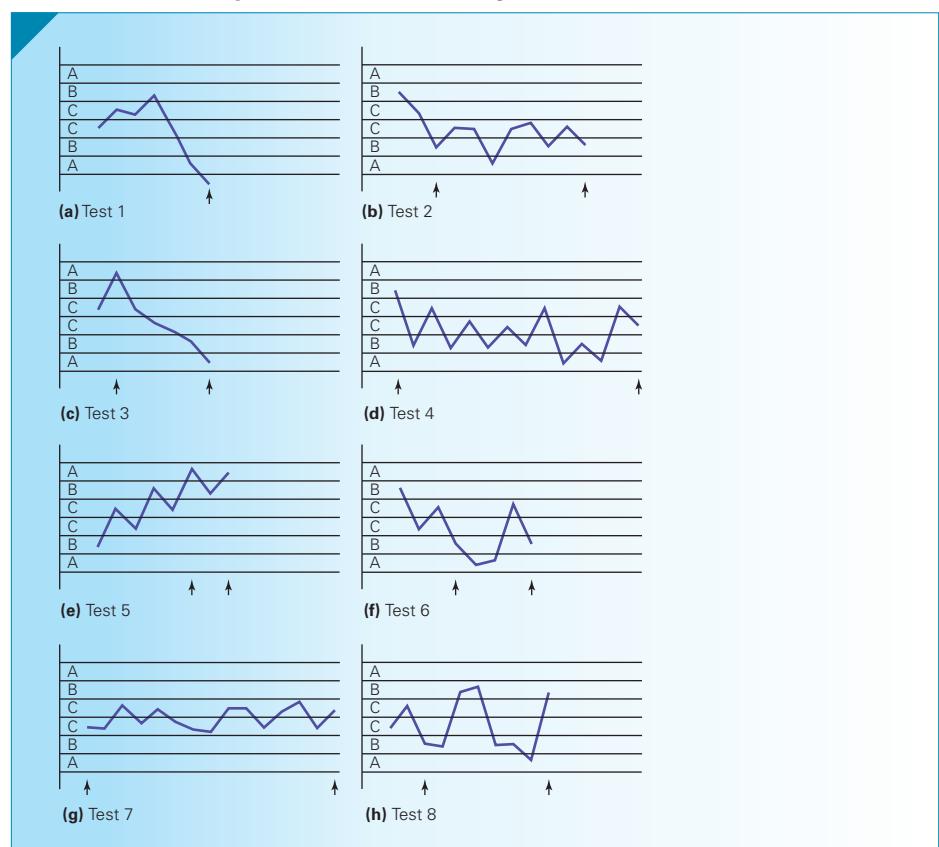
Test 6: Four out of five points in a row in zone B or beyond (on the same side of the centerline).

Test 7: Fifteen points in a row in zone C (on both sides of the centerline).

Test 8: Eight points in a row beyond zone C (on both sides of the centerline).

In the examples shown in Figure 21.7, each of the eight tests indicates a process out of control.

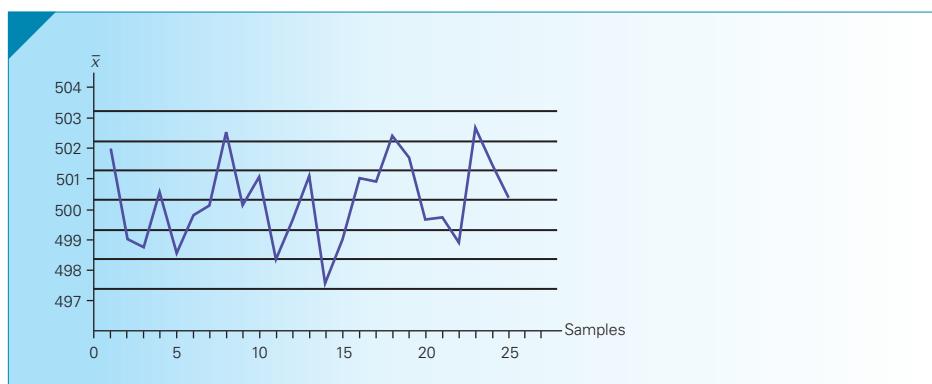
FIGURE 21.7 Examples of Patterns Indicating Process Out of Control



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All eight tests are based on the same concepts used to test hypotheses throughout this book. In other words, each pattern is a rare event that is unlikely to occur when a process is under control. Thus, when any one of these patterns is recognized, the statistics practitioner has reason to believe that the process is out of control. In fact, it is often possible to identify the cause of the problem from the pattern in the control chart.

Figure 21.8 depicts the zones and the means for Example 21.1. After checking each of the eight pattern tests, we conclude that the process is under control.

FIGURE 21.8 \bar{x} Chart with Zones: Example 21.1

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EXCEL

Excel automatically performs all eight tests. Any that fail will be reported on the spreadsheet.

MINITAB

Minitab will perform any or all of the pattern tests and report any that fail.

INSTRUCTIONS

After clicking **Xbar Options ...** click **Tests** and click **Perform all tests for special causes**. To draw the zones, click **S Limits ...** and type **1 2 3** in the **Display control limits at** box.

21-3c Pattern Tests in Practice

There appears to be a great deal of disagreement among statisticians with regard to pattern tests. Some authors and statistical software packages apply eight tests, whereas others employ a different number. In addition, some statisticians apply pattern tests to \bar{x} charts, but not to other charts. Rather than joining the debate with our own opinions, we will follow Minitab's rules. There are eight pattern tests for \bar{x} charts, no pattern tests for S and R charts, and four pattern tests for the chart presented in Section 21-4 (p charts). The same rules apply to Data Analysis Plus.

21-3d S Charts

The **S chart** graphs sample standard deviations to determine whether the process distribution standard deviation has changed. The format is similar to that of the \bar{x} chart: The **S chart** will display a centerline and control limits. However, the formulas for the centerline and control limits are more complicated than those for the \bar{x} chart. Consequently, we will not display the formulas; instead we will let the computer do all the work.

EXAMPLE 21.2

Statistical Process Control at Lear Seating, Part 2

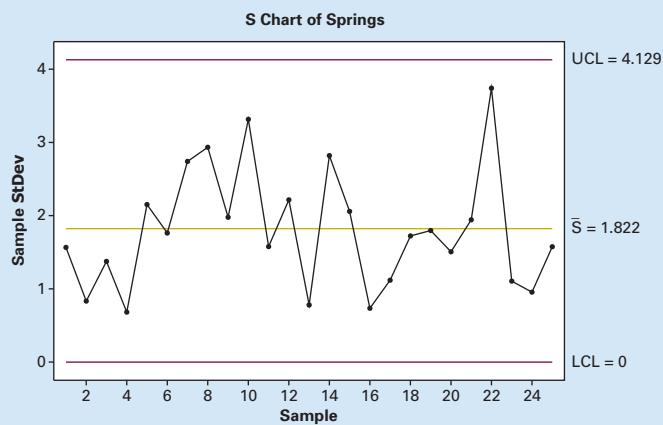
Using the data provided in Example 21.1, determine whether there is evidence to indicate that the process distribution standard deviation has changed over the period when the samples were taken.

SOLUTION:**COMPUTE****EXCEL**

	A	B	C
1	Statistical Process Control		
2			
3			Springs
4	Upper control limit	4.1288	
5	Centerline	1.822	
6	Lower control limit	0	

**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm21-01.](#))
2. Click **Add-Ins**, **Data Analysis Plus**, and **Statistical Process Control**.
3. Specify the **Input Range** ([A1:101](#)) and the **Sample Size** ([4](#)). Click **S**.

MINITAB**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm21-01.](#))
2. Click **Stat**, **Control Charts**, **Variable charts for subgroups**, and **S . . .**
3. Specify **All observations for a chart are in one column**. Type or select the variable ([Springs](#)). Type the **Subgroup sizes** ([4](#)). Click **S Options . . .**
4. Click **Estimate . . .** Under **Method for estimating standard deviation**, click **Pooled standard deviation**.

INTERPRET

There are no points outside the control limits. Because we do not apply any of the pattern tests, we conclude that there is no evidence to believe that the standard deviation has changed over this period.

21-3e Good News and Bad News About S Charts

In analyzing *S* charts, we would conclude that the process distribution has changed if we observe points outside the control limits. Obviously, points above the upper control limit indicate that the process standard deviation has increased—an undesirable situation. Points below the lower control limit also indicate that the process standard deviation has changed. However, cases in which the standard deviation has decreased are welcome occurrences because reducing the variation generally leads to improvements in quality. The operations manager should investigate cases where the sample standard deviations or ranges are small to determine the factors that produced such results. The objective is to determine whether permanent improvements in the production process can be made. Care must be exercised in cases in which the *S* chart reveals a decrease in the standard deviation because this is often caused by improper sampling.

21-3f Using the \bar{x} and *S* Charts

In this section, we have introduced \bar{x} and *S* charts as separate procedures. In actual practice, however, the two charts must be drawn and assessed together. The reason for this is that the \bar{x} chart uses *S* to calculate the control limits and zone boundaries. Consequently, if the *S* chart indicates that the process is out of control, the value of *S* will not lead to an accurate estimate of the standard deviation of the process distribution. The usual procedure is to draw the *S* chart first. If it indicates that the process is under control, we then draw the \bar{x} chart. If the \bar{x} chart also indicates that the process is under control, we are then in a position to use both charts to maintain control. If either chart shows that the process was out of control at some time during the creation of the charts, then we can detect and fix the problem and then redraw the charts with new data.

21-3g Monitoring the Production Process

When the process is under control, we can use the control chart limits and centerline to monitor the process in the future. We do so by plotting all future statistics on the control chart.

EXAMPLE 21.3

Statistical Process Control at Lear Seating, Part 3

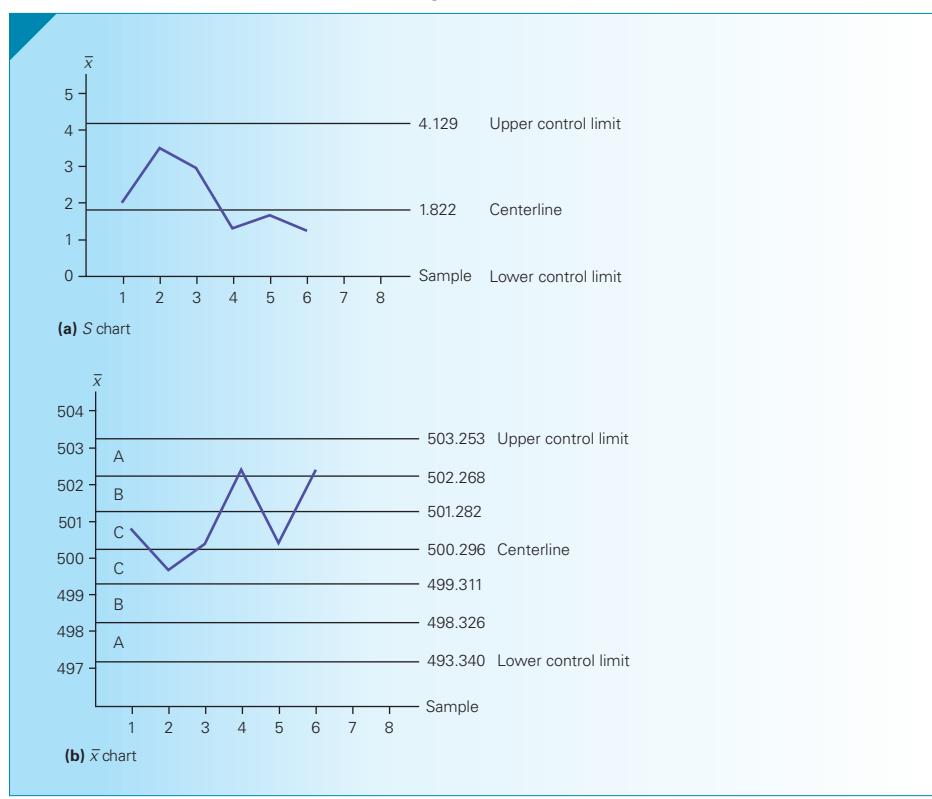
After determining that the process is under control, the company in Example 21.1 began using the statistics generated in the creation of the \bar{x} and *S* charts to monitor the production process. The sampling plan calls for samples of size 4 every hour. The following table lists the lengths of the springs taken during the first 6 hours.

Sample

1	502.653	498.354	502.209	500.080
2	501.212	494.454	500.918	501.855
3	500.086	500.826	496.426	503.591
4	502.994	500.481	502.996	503.113
5	500.549	498.780	502.480	499.836
6	500.441	502.666	502.569	503.248

SOLUTION:

After each sample is taken, the mean and standard deviation are computed. The standard deviations are plotted on the S chart using the previously determined control limits when the process variation was deemed to be in control. The sample means are plotted on the \bar{x} chart, again using the zone limits determined when the process was deemed to be in control, and the pattern tests are checked after each point is plotted. The first six samples are shown in Figure 21.9. After the standard deviation and mean of the sixth sample are plotted, the technician would stop the production process. Although the process variation still appears to be in control, the fourth and sixth means on the \bar{x} chart combine to indicate that test 5 has failed; there are two out of three points in a row that are in zone A or beyond. Thus, it appears that the process mean has shifted upward. Technicians need to find the source of the problem and make repairs. After repairs are completed, production resumes and new control charts and their centerlines and control limits are recalculated.

FIGURE 21.9 S and \bar{x} Charts for Example 21.3

21-3h Process Capability Index

In Section 14-6, we discussed the **process capability index**, which measures the capability of the process to produce units whose dimensions fall within the specifications. We defined the index as

$$C_p = \frac{USL - LSL}{6\sigma}$$

where USL and LSL are the upper and lower specification limits, respectively. To compute the process capability index, we need to know these limits and the process standard deviation. The standard deviation is a population parameter that is generally unknown. Thus, C_p measures the theoretical or potential process capability. To produce a measure of the process's actual capability, we must use statistics computed in the construction of the control chart. Suppose that in Example 21.1 the operations manager determined that the springs will fit, provided that their lengths fall between the lower specification limit $LSL = 493$ and the upper specification limit $USL = 507$. In Example 21.1, we found $\bar{x} = 500.296$ and $S = 1.971$.

We define the following:

$$CPL = \frac{\bar{x} - LSL}{3S} = \frac{500.296 - 493}{3(1.971)} = 1.23$$

$$CPU = \frac{USL - \bar{x}}{3S} = \frac{507 - 500.296}{3(1.971)} = 1.13$$

We define the process capability index as the smaller of these two indexes; that is,

$$C_{pk} = \text{Min}(CPL, CPU) = 1.13$$

As is the case with C_p , the larger C_{pk} is, the better the production process meets specifications. By determining this value, operations managers can measure improvements in the production process.

21-3i Reducing the Process Variance

In Section 14-6, we described how experimentation with the four M's allows statistics practitioners to discover sources of variation and ultimately reduce that variation. Control charts may also contribute to this effort. By examining the results of control charts, we may be able to find additional sources of variation.

21-3j Developing an Understanding of Statistical Concepts

The concepts that underlie statistical process control are the same as the fundamental principles of hypothesis testing; that is, statistics that are not consistent with the null hypothesis lead us to reject the null hypothesis. However, there are two critical differences between SPC and hypothesis testing. First, in SPC we test processes rather than parameters of populations. In other words, we test to determine whether there is evidence that the process distribution has changed. Second, in SPC we test a series of statistics taken over time. From a pedagogical point of view, there is another fundamental difference. Many students of statistics have difficulty identifying the correct hypothesis-testing procedure to employ. However, SPC applications tend to be rather uncomplicated. We use control charts for variables to determine whether the process is under control when the product produced must be measured quantitatively. Identifying the correct technique is seldom difficult and thus does not require the technique-identification skills developed throughout this book.



EXERCISES

- 21.23** Given the following statistics drawn from 30 samples of size 4, calculate the centerline and control limits for the \bar{x} chart.

$$\bar{\bar{x}} = 453.6 \quad S = 12.5$$

- 21.24** The mean of the sample means and the pooled standard deviation of 40 samples of size 9 taken from a production process under control are shown here. Compute the centerline, control limits, and zone boundaries for the \bar{x} chart.

$$\bar{\bar{x}} = 181.1 \quad S = 11.0$$

- 21.25** Twenty-five samples of size 4 were taken from a production process. The sample means are listed in chronological order below. The mean of the sample means and the pooled standard deviation are $\bar{x} = 13.3$ and $S = 3.8$, respectively.

14.5	10.3	17.0	9.4	13.2	9.3	17.1
5.5	5.3	16.3	10.5	11.5	8.8	12.6
10.5	16.3	8.7	9.4	11.4	17.6	20.5
21.1	16.3	18.5	20.9			

- Find the centerline and control limits for the \bar{x} chart.
- Plot the sample means on the \bar{x} chart.
- Is the process under control? Explain.

The following exercises require a computer and statistical software.

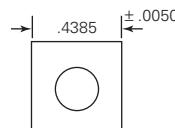
- 21.26** **Xr21-26** Thirty samples of size 4 were drawn from a production process.

- Construct an S chart.
- Construct an \bar{x} chart.
- Do the charts allow you to conclude that the process is under control?
- If the process went out of control, which of the following is the likely cause: level shift, instability, trend, or cycle?

- 21.27** **Xr21-27** The fence of a saw is set so that it automatically cuts 2-by-4 boards into 96-inch lengths needed to produce prefabricated homes. To ensure that the lumber is cut properly, three pieces of wood are measured after each 100 cuts are made. The measurements in inches for the last 40 samples were recorded.

- Do these data indicate that the process is out of control?
- If so, when did it go out of control? What is the likely cause: level shift, instability, trend, or cycle?
- Speculate on how the problem could be corrected.

- 21.28** **Xr21-28** An arc extinguishing unit (AEU) is used in the high-voltage electrical industry to eliminate the occurrence of electrical flash from one live 25,000-volt switch contact to another. A small but important component of an AEU is a nonconductive sliding bearing called a (ST-90811) pin guide. The dimensional accuracy of this pin guide is critical to the overall operation of the AEU. If any one of its dimensions is “out of spec” (specification), the part will bind within the AEU, causing failure. This would cause the complete destruction of both the AEU and the 25,000 volt-switch contacts, resulting in a power blackout. A pin guide has a square shape with a circular hole in the center, as shown below with its specified dimensions. The specification limits are LSL = .4335 and USL = .4435.



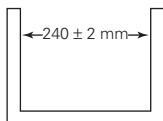
Because of the critical nature of the dimensions of the pin guide, statistical process control is used during long production runs to check that the production process is under control. Suppose that samples of five pin guides are drawn every hour. The results of the last 25 samples were recorded. Do these data allow the technician to conclude that the process is out of control?

- 21.29** Refer to Exercise 21.28. Find the process capability index C_{pk} .

- 21.30** **Xr21-30** KW Paints is a company that manufactures various kinds of paints and sells them in 1- and 4-liter cans. The cans are filled on an assembly line with an automatic valve regulating the amount of paint. If the cans are overfilled, paint and money will be wasted. If the cans are underfilled, customers will complain. To ensure that the proper amount of paint goes into each can, statistical process control is used. Every hour, five cans are opened, and the volume of paint is measured. The results from the last 30 hours from the 1-liter production line were recorded. To avoid rounding errors, we recorded the volumes in cubic centimeters (cc) after subtracting 1,000. Thus, the file contains the amounts of overfill and underfill. Draw the \bar{x} and S charts to determine whether the process is under control.

- 21.31** Refer to Exercise 21.30. If the lower and upper specification limits are 995 cc and 1005 cc, respectively, what is C_{pk} ?

- 21.32** [Xr21-32](#) Lear Seating of Kitchener, Ontario, produces seats for Cadillacs and other GM cars and trucks. The Cadillac seat includes a part called the EK headrest. The frame of the headrest is made from steel rods. A machine is used to bend the rod into a U-shape described as shown. The width is critical; if it is too wide or too narrow, it will not fit into the holes drilled into the seat frame. The process is checked by drawing samples of size 3 every 2 hours. The last 20 samples were recorded.



- What do these data tell you about the process?
- If it went out of control, at what sample did this occur?
- What is the likely assignable cause?

- 21.33** [Xr21-33](#) The degree to which nuts and bolts are tightened in numerous places on a car is often important. For example, in Toyota cars, a nut holds the rear signal light. If the nut is not tightened sufficiently, it will loosen and fall off; if it is too tight, the light may break. The nut is tightened with a torque wrench with a set clutch. The target torque is 8 kgf/cm (kilogram-force per centimeter) with specification limits LSL = 7 kgf/cm and USL = 9 kgf/cm. Statistical process control is employed to constantly check the process. Random samples of size 4 are drawn after every 200 nuts are tightened. The data from the last 25 samples were recorded.
- Determine whether the process is under control.
 - If it is out of control, identify when this occurred and the likely cause.

- 21.34** [Xr21-34](#) The seats for the F-150 series Ford trucks are manufactured by Lear Seating. The frames must be 1,496 mm wide with specification limits LSL = 1,486 mm and USL = 1,506 mm. Frames that are wider than 1,506 mm or narrower than 1,486 mm result in assembly problems because seat cushions and/or other parts won't fit. The process is tested by drawing random samples of five frames every 2 hours. The last 25 samples were recorded. What can we conclude from these data?

- 21.35** [Xr21-35](#) Long Manufacturing produces heat exchangers, primarily for the automotive industry. One such product, a transmission oil cooler, is used in the cooling of bus transmissions. It is composed of a series of copper tubes that are soldered into a header. The header must have a diameter of 4.984 inches with specification limits LSL = 4.978 inches and USL = 4.990 inches. Oversized headers result

in fluid mixing and possible failure of the device. For every 100 headers produced, the operations manager draws a sample of size 4. The data from the last 25 samples were recorded. What can we conclude from these data?

- 21.36** Find the process capability index for Exercise 21.35.

- 21.37** [Xr21-37](#) Refer to Exercise 21.35. Nuts and bolts are used in the assembly of the transmission oil coolers. They are supposed to be tightened by a torque wrench to 7 foot-pounds with specification limits LSL = 6 foot-pounds and USL = 8 foot-pounds. To test the process, three nuts are tested every 3 hours. The results for the last 75 hours were recorded. Does it appear that the process is under control?

- 21.38** [Xr21-38](#) Motor oil is packaged and sold in plastic bottles. The bottles are often handled quite roughly in delivery to the stores (bottles are packed in boxes, which are stacked to conserve truck space), in the stores themselves, and by consumers. The bottles must be hardy enough to withstand this treatment without leaking. Before leaving the plant, the bottles undergo statistical process control procedures. Five out of every 10,000 bottles are sampled. The burst strength (the pressure required to burst the bottle) is measured in pounds per square inch (psi). The process is designed to produce bottles that can withstand as much as 800 psi. The burst strengths of the last 30 samples were recorded.
- Draw the appropriate control chart(s).
 - Does it appear that the process went out of control? If so, when did this happen, and what are the likely causes and remedies?

- 21.39** [Xr21-39](#) Almost all computer hardware and software producers offer a toll-free telephone number to solve problems associated with their products. The ability to work quickly to resolve difficulties is critical. One software maker's policy is that all calls must be answered by a software consultant within 120 seconds. (All calls are initially answered by computer and the caller is put on hold until a consultant attends to the caller.) To help maintain the quality of the service, four calls per day are monitored. The amount of time before the consultant responds to the calls was recorded for the last 30 days.
- Draw the appropriate control chart(s).

- Does it appear that the process went out of control? If so, when did this happen, and what are the likely causes and remedies?

- 21.40** [Xr21-40](#) Plastic pipe is used for plumbing in almost all new homes. If the pipes are too narrow or too wide, they will not connect properly with other parts of the plumbing system. A manufacturer of 3-inch-diameter pipes uses statistical process control to

maintain the quality of its products. The sampling plan is to draw samples of three 10-foot-long pipes every hour and measure the diameters. Twenty hours ago, the production process was shut down for repairs. The results of the first 20 samples taken since were recorded. Does it appear that the production process is under control?

- 21.41** If the specification limits for the plastic pipes in Exercise 21.40 are LSL = 2.9 inches and USL = 3.1 inches, determine the process capability index C_{pk} .
- 21.42** Calculate the process capability index for Exercise 21.34. Does the value of this index indicate that the production process is poor? Explain.

21-4 CONTROL CHARTS FOR ATTRIBUTES: *P* CHART

In this section, we introduce a control chart that is used to monitor a process whose results are categorized as either defective or nondefective. We construct a *p* chart to track the proportion of defective units in a series of samples.

21-4a *p* Chart

We draw the *p* chart in a way similar to the construction of the \bar{x} chart. We draw samples of size n from the process at a minimum of 25 time periods. For each sample, we calculate the sample proportion of defective units, which we label \hat{p}_j . We then compute the mean of the sample proportions, which is labeled \bar{p} ; that is,

$$\bar{p} = \frac{\sum_{j=1}^k \hat{p}_j}{k}$$

The centerline and control limits are as follows.

Centerline and Control Limits for the *p* Chart

$$\text{Centerline} = \bar{p}$$

$$\text{Lower control limit} = \bar{p} - 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}}$$

$$\text{Upper control limit} = \bar{p} + 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}}$$

If the lower limit is negative, set it equal to 0.

21-4b Pattern Tests

As we did in the previous section, we use Minitab's pattern tests. Minitab performs only tests 1 through 4, which are as follows:

Test 1: One point beyond zone A.

Test 2: Nine points in a row in zone C or beyond (on the same side of the centerline).

Test 3: Six increasing or six decreasing points in a row.

Test 4: Fourteen points in a row alternating up and down.

We'll demonstrate this technique using the chapter-opening example.

Detecting the Source of Defective Discs: Solution

For each sample, we compute the proportion of defective discs and calculate the mean sample proportion, which is $\bar{p} = .05762$. Thus,

$$\text{Centerline} = \bar{p} = .05762$$



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$$\begin{aligned}\text{Lower control limit} &= \bar{p} - 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}} \\ &= .05762 - 3\sqrt{\frac{(.05762)(1-.05762)}{200}} \\ &= .008188\end{aligned}$$

$$\begin{aligned}\text{Upper control limit} &= \bar{p} + 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}} \\ &= .05762 + 3\sqrt{\frac{(.05762)(1-.05762)}{200}} \\ &= .1071\end{aligned}$$

Because

$$\sqrt{\frac{\bar{p}(1-\bar{p})}{n}} = \sqrt{\frac{(.05762)(1-.05762)}{200}} = .01648$$

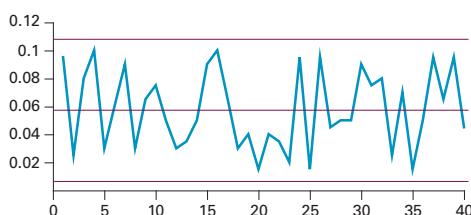
The boundaries of the zones are as follows:

- Zone C: $.05762 \pm .01648 = (.04114, .0741)$
- Zone B: $.05762 \pm 2(.01648) = (.02467, .09057)$
- Zone A: $.05762 \pm 3(.01648) = (.008188, .1071)$

The following output exhibits this p chart.

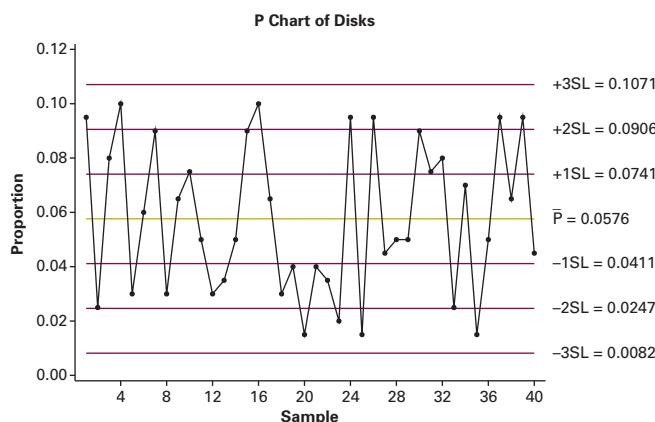
EXCEL

	A	B	C
1	Statistical Process Control		
2			
3			<i>Disks</i>
4	Upper control limit		0.1071
5	Centerline		0.0576
6	Lower control limit		0.0082



INSTRUCTIONS

- Type or import the data into one column. (Open Xm21-00.)
- Click **Add-Ins, Data Analysis Plus**, and **Statistical Process Control**.
- Specify the **Input Range** (A1:41) and the **Sample Size** (200). Click **P**.

MINITAB**INSTRUCTIONS**

1. Type or import the data into one column. ([Open Xm21-00](#).)
2. Click **Stat, Control Charts, Attribute Charts**, and **P ...**
3. Type or select the variable ([Discs](#)). Type the sample size in the **Subgroup sizes** box (200). Click **P Chart Options**
4. Click **S Limits** and type **1 2 3**.
5. Click **Tests** and **Perform all four tests**.

INTERPRET

None of the points lies outside the control limits (test 1), and the other test results are negative. There is no evidence to infer that the process is out of control. However, this does not mean that 5.76% is an acceptable proportion of defects. Management should continually improve the process to reduce the defective rate and improve the process.

The comment we made about *S* charts is also valid for *p* charts: Sample proportions that are less than the lower control limit indicate a change in the process that we would like to make permanent. We need to investigate the reasons for such a change just as vigorously as we investigate the causes of large proportions of defects.



EXERCISES

- 21.43** To ensure that a manufacturing process is under control, 40 samples of size 1,000 were drawn, and the number of defectives in each sample was counted. The mean sample proportion was .035. Compute the centerline and control limits for the p chart.

- 21.44** **Xr21-44** Random samples of 200 copier machines were taken on an assembly line every hour for the past 25 hours. The number of defective machines is shown here. Are there any points beyond the control limits? If so, what do they tell you about the production process?

3	5	3	2	2	11	12	6	7	5	0	7	8
2	10	6	4	2	10	5	4	11	10	13	14	

- 21.45** **Xr21-45** Raytheon of Canada Limited produces printed circuit boards (PCBs), which involve a number of soldering operations. At the end of the process, the PCBs are tested to determine whether they work properly. There are several causes of PCB failure, including bad flux, improper heating, and impurities. A reject rate of less than .80% is considered acceptable. Statistical process control is used by Raytheon to constantly check quality. Every hour, 500 PCBs are tested. The number of defective PCBs for the past 25 hours is shown here. Draw a p chart and apply the pattern tests to determine whether the process is under control.

3	1	2	2	1	2	3	3	3	2	3	0	0
0	2	0	0	2	4	1	1	1	4	1	3	

- 21.46** **Xr21-46** A plant produces 1,000 cordless telephones daily. A random sample of 100 telephones is inspected each day. After 30 days, the following number of defectives were found. Construct a p chart to determine whether the process is out of control.

5	0	4	3	0	3	1	1	5	0	2	1	6	0	3
0	5	5	8	5	0	1	9	6	11	6	6	4	5	10

- 21.47** **Xr21-47** The Woodsworth Publishing Company produces millions of books containing hundreds of millions of pages each year. To ensure the quality of the printed page, Woodsworth uses statistical process control. In each production run, 1,000 pages

are randomly inspected. The examiners look for print clarity and whether the material is centered on the page properly. The numbers of defective pages in the last 40 production runs are listed here. Draw the p chart. Using the pattern tests, can we conclude that the production process is under control?

11	9	17	19	15	15	18	21	18	6	27	14	7	18
18	19	17	15	7	16	17	22	12	12	12	16	12	
9	21	17	20	17	17	18	23	29	24	27	23	21	

The following exercises require the use of a computer and statistical software.

- 21.48** **Xr21-48** A company that manufactures batteries employs statistical process control to ensure that its product functions properly. The sampling plan for the D-cell batteries calls for samples of 500 batteries to be taken and tested. The numbers of defective batteries in the last 30 samples were recorded. Determine whether the process is under control.

- 21.49** **Xr21-49** A courier delivery company advertises that it guarantees delivery by noon the following day. The statistical process control plan calls for sampling 2,000 deliveries each day to ensure that the advertisement is reasonable. The numbers of late deliveries for the last 30 days were recorded. What can we conclude from these data?

- 21.50** **Xr21-50** Optical scanners are used in all supermarkets to speed the checkout process. Whenever the scanner fails to read the bar code on the product, the cashier is required to manually punch the code into the register. Obviously, unreadable bar codes slow the checkout process. Statistical process control is used to determine whether the scanner is working properly. Once a day at each checkout counter, a sample of 500 scans is taken, and the number of times the scanner is unable to read the bar code is determined. (The sampling process is performed automatically by the cash register.) The results for one checkout counter for the past 25 days were recorded.

- Draw the appropriate control chart(s).
- Does it appear that the process went out of control? If so, identify when this happened and suggest several possible explanations for the cause.

CHAPTER SUMMARY

In this chapter, we introduced **statistical process control** and explained how it contributes to the maintenance of quality. We

discussed how **control charts** detect changes in the process distribution and introduced the \bar{x} chart, *S* chart, and *p* chart.

IMPORTANT TERMS:

Statistical process control (SPC) 860
 Quality control 860
 Prevention approach 860
 Chance (or common) variation 860
 Assignable (or special) variation 860
 Under control 861
 Specification limits 861
 Out of control 861
 Control chart 862
 \bar{x} chart 862

Centerline 862
 Upper control limit 862
 Lower control limit 862
 Operating characteristic (OC) curve 864
 Average run length (ARL) 866
 Control charts for variables 867
 Control charts for attributes 867
S chart 875
 Process capability index 879
 p chart 882

SYMBOLS:

Symbol	Pronounced	Represents
S		Pooled standard deviation
s_j	s -sub- j	Standard deviation of the j th sample
\hat{p}_j	p -hat-sub- j	Proportion of defectives in j th sample
\bar{p}	p -bar	Mean proportion of defectives

FORMULAS:

Centerline and control limits for \bar{x} chart using *S*

$$\text{Centerline} = \bar{x}$$

$$\text{Lower control limit} = \bar{x} - 3 \frac{S}{\sqrt{n}}$$

$$\text{Upper control limit} = \bar{x} + 3 \frac{S}{\sqrt{n}}$$

Centerline and control limits for the *p* chart

$$\text{Centerline} = \bar{p}$$

$$\text{Lower control limit} = \bar{p} - 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}}$$

$$\text{Upper control limit} = \bar{p} + 3\sqrt{\frac{\bar{p}(1-\bar{p})}{n}}$$

COMPUTER OUTPUT AND INSTRUCTIONS:

Technique	Excel	Minitab
\bar{x} chart using <i>S</i>	871	872
<i>S</i> chart	876	876
p chart	883	884

22



Rubberball/Mike Kemp/Getty Images

DECISION ANALYSIS

22-1 *Decision Problem*

22-2 *Acquiring, Using, and Evaluating Additional Information*

Acceptance Sampling

A factory produces a small but important component used in computers. The factory manufactures the component in 1,000-unit lots. Because of the relatively advanced technology, the manufacturing process results in a large proportion of defective units. In fact, the operations manager has observed that the percentage of defective units per lot has been either 15% or 35%. In the past year, 60% of the lots have had 15% defectives, and 40% have had 35% defectives. The current policy of the company is to send the lot to the customer, replace all defectives, and pay any additional costs. The total cost of replacing a defective unit that has been sent to the customer is \$10/unit. Because of the high costs, the company management is considering inspecting all

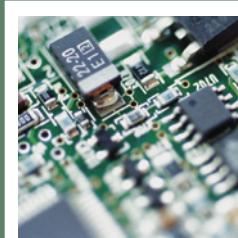


Image Source/Getty Images

On page 900 we provide answers to our questions.

units and replacing the defective units before shipment. The sampling cost is \$2/unit, and the replacement cost is \$.50/unit. Each unit sells for \$5.

- Based on the history of the past year, should the company adopt the 100% inspection plan?
- Is it worthwhile to take a sample of size 2 from the lot before deciding whether to inspect 100%?

INTRODUCTION

In previous chapters, we dealt with techniques for summarizing data in order to make decisions about population parameters and population characteristics. Our focus in this chapter is also on decision making, but the types of problems we deal with here differ in several ways. First, the technique for hypothesis testing concludes with either rejecting or not rejecting some hypothesis concerning a dimension of a population. In decision analysis, we deal with the problem of selecting one alternative from a list of several possible decisions. Second, in hypothesis testing, the decision is based on the statistical evidence available. In decision analysis, there may be no statistical data, or if there are data, the decision may depend only partly on them. Third, costs (and profits) are only indirectly considered (in the selection of a significance level or in interpreting the p -value) in the formulation of a hypothesis test. Decision analysis directly involves profits and losses. Because of these major differences, the only topics covered previously in the text that are required for an understanding of decision analysis are probability (including Bayes's Law) and expected value.

22-1 / DECISION PROBLEM

You would think that, by this point in the text, we would already have introduced all the necessary concepts and terminology. Unfortunately, because decision analysis is so radically different from statistical inference, several more terms must be defined. They will be introduced in the following example.

EXAMPLE 22.1

An Investment Decision

A man wants to invest \$1 million for 1 year. After analyzing and eliminating numerous possibilities, he has narrowed his choice to one of three alternatives. These alternatives are referred to as **acts** and are denoted a_i .

- a_1 : Invest in a guaranteed income certificate paying 3%.
- a_2 : Invest in a bond with a coupon value of 2%.
- a_3 : Invest in a well-diversified portfolio of stocks.

He believes that the payoffs associated with the last two acts depend on a number of factors, foremost among which is interest rates. He concludes that there are three possible **states of nature**, denoted s_j .

- s_1 : Interest rates increase.
- s_2 : Interest rates stay the same.
- s_3 : Interest rates decrease.

After further analysis, he determines the amount of profit he will make for each possible combination of an act and a state of nature. Of course, the payoff for the guaranteed income certificate will be \$30,000 no matter which state of nature occurs. The profits from each alternative investment are summarized in Table 22.1, in what is called a **payoff table**. Notice that for example, when the decision is a_2 and the state of nature is s_1 , the investor would suffer a \$15,000 loss, which is represented by a $-\$15,000$ payoff.

TABLE 22.1 Payoff Table for Example 22.1

STATES OF NATURE	a_1 (GIC)	a_2 (BOND)	a_3 (STOCKS)
s_1 (interest rates increase)	\$30,000	-\$15,000	\$40,000
s_2 (interest rates stay the same)	30,000	20,000	27,500
s_3 (interest rates decrease)	30,000	60,000	15,000

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Another way of expressing the consequence of an act involves measuring the opportunity loss associated with each combination of an act and a state of nature. An **opportunity loss** is the difference between what the decision maker's profit for an act is and what the profit could have been had the best decision been made. For example, consider the first row of Table 22.1. If s_1 is the state of nature that occurs and the investor chooses act a_1 , he makes a profit of \$30,000. However, had he chosen act a_3 , he would have made a profit of \$40,000. The difference between what he could have made (\$40,000) and what he actually made (\$30,000) is the opportunity loss. Thus, given that s_1 is the state of nature, the opportunity loss of act a_1 , is \$10,000. The opportunity loss of act a_2 is \$55,000, which is the difference between \$40,000 and $-\$15,000$. The opportunity loss of act a_3 is 0, because there is no opportunity loss when the best alternative is chosen. In a similar manner, we can compute the remaining opportunity losses for this example (see Table 22.2). Notice that we can never experience a negative opportunity loss.

TABLE 22.2 Opportunity Loss Table for Example 22.1

STATES OF NATURE	a_1 (GIC)	a_2 (BOND)	a_3 (STOCKS)
s_1 (interest rates increase)	\$10,000	\$55,000	0
s_2 (interest rates stay the same)	0	10,000	2,500
s_3 (interest rates decrease)	30,000	0	45,000

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Decision Trees

Most problems involving a simple choice of alternatives can readily be resolved by using the payoff table (or the opportunity loss table). In other situations, however, the decision maker must choose between sequences of acts. In Section 22-2, we introduce one form of such situations. In these cases, a payoff table will not suffice to determine the best alternative; instead, we require a **decision tree**.

In Chapter 6, we suggested the probability tree as a useful device for computing probabilities. In this type of tree, all the branches represent stages of events. In a decision tree, however, the branches represent both acts and events (states of nature). We distinguish between them in the following way: A square node represents a point where

Figure 22.1 Decision Tree for Example 22.1

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a decision is to be made; a point where a state of nature occurs is represented by a round node. Figure 22.1 depicts the decision tree for Example 22.1.

The tree begins with a square node; that is, we begin by making a choice among a_1 , a_2 , and a_3 . The branches emanating from the square node represent these alternatives. At the ends of branches a_2 and a_3 , we reach round nodes representing the occurrence of some state of nature. These are depicted as branches representing s_1 , s_2 , and s_3 . At the end of branch a_1 , we don't really have a state of nature, because the payoff is fixed at \$30,000 no matter what happens to interest rates.

At the ends of the branches, the payoffs are shown (alternatively, we could have worked with opportunity losses instead of with payoffs). These are, of course, the same values that appear in Table 22.1.

Up to this point, all we have done is set up the problem; we have not made any attempt to determine the decision. It should be noted that in many real-life problems, determining the payoff table or decision tree can be a formidable task in itself. Many managers, however, have observed that this task is often extremely helpful in decision making.

Expected Monetary Value Decision

In many decision problems, it is possible to assign probabilities to the states of nature. For example, if the decision involves trying to decide whether to draw to an inside straight in the game of poker, the probability of succeeding can easily be determined by the use of simple rules of probability. If we must decide whether to replace a machine that has broken down frequently in the past, we can assign probabilities on the basis of the relative frequency of the breakdowns. In many other instances, however, formal rules and techniques of probability cannot be applied. In Example 22.1, the historical relative frequencies of the ups and downs of interest rates will supply scant useful information to help the investor assign probabilities to the behavior of interest rates during the coming year. In such cases, probabilities must be assigned subjectively. In other words, the determination of the probabilities must be based on the experience, knowledge, and (perhaps) guesswork of the decision maker.

If, in Example 22.1, the investor has some knowledge about a number of economic variables, he might have a reasonable guess about what will happen to interest rates in the next year. Suppose, for example, that our investor believes that future interest rates are most likely to remain essentially the same as they are today and that (of the

remaining two states of nature) rates are more likely to decrease than to increase. He might then guess the following probabilities:

$$P(s_1) = .2, P(s_2) = .5, P(s_3) = .3$$

Because the probabilities are subjective, we would expect another decision maker to produce a completely different set of probabilities. In fact, if this were not true, we would rarely have buyers and sellers of stocks (or any other investment), because everyone would be a buyer (and there would be no sellers) or everyone would be a seller (with no buyers).

After determining the probabilities of the states of nature, we can address the *expected monetary value decision*. We now calculate what we expect will happen for each decision. Because we generally measure the consequences of each decision in monetary terms, we compute the **expected monetary value (EMV)** of each act. Recall from Section 7-1 that we calculate expected values by multiplying the values of the random variables by their respective probabilities and then summing the products. Thus, in our example, the expected monetary value of alternative a_1 is:

$$\text{EMV}(a_1) = .2(30,000) + .5(30,000) + .3(30,000) = \$30,000$$

The expected values of the other decisions are found in the same way:

$$\text{EMV}(a_2) = .2(-15,000) + .5(20,000) + .3(60,000) = \$25,000$$

$$\text{EMV}(a_3) = .2(40,000) + .5(27,500) + .3(15,000) = \$26,250$$

We choose the decision with the largest expected monetary value, which is a_1 , and label its expected value EMV^* . Hence, $\text{EMV}^* = \$30,000$.

In general, the expected monetary values do not represent possible payoffs. For example, the expected monetary value of act a_2 is \$25,000, yet the payoff table indicates that the only possible payoffs from choosing a_2 are -\$15,000, \$20,000, and \$60,000. Of course, the expected monetary value of act a_1 (\$30,000) is possible, because that is the only payoff of the act.

What, then, does the expected monetary value represent? If the investment is made a large number of times, with exactly the same payoffs and probabilities, the expected monetary value is the average payoff per investment. That is, if the investment is repeated an infinite number of times with act a_2 , 20% of the investments will result in a \$15,000 loss, 50% will result in a \$20,000 profit, and 30% will result in a \$60,000 profit. The average of all these investments is the expected monetary value, \$25,000. If act a_3 is chosen, the average payoff in the long run will be \$26,250.

An important point is raised by the question of how many investments are going to be made. The answer is one. Even if the investor intends to make the same type of investment annually, the payoffs and the probabilities of the states of nature will undoubtedly change from year to year. Hence, we are faced with having determined the expected monetary value decision on the basis of an infinite number of investments, when there will be only one investment. We can rationalize this apparent contradiction in two ways. First, the expected value decision is the only method that allows us to combine the two most important factors in the decision process—the payoffs and their probabilities. It seems inconceivable that, where both factors are known, the investor would want to ignore either one. (There are processes that make decisions on the basis of the payoffs alone; however, these processes assume no knowledge of the probabilities, which is not the case with our example.) Second, typical decision makers make a large number of decisions over their lifetimes. By using the expected value decision, the

decision maker should perform at least as well as anyone else. Thus, despite the problem of interpretation, we advocate the expected monetary value decision.

Expected Opportunity Loss Decision

We can also calculate the **expected opportunity loss (EOL)** of each act. From the opportunity loss table (Table 22.2), we get the following values:

$$\text{EOL}(a_1) = .2(10,000) + .5(0) + .3(30,000) = \$11,000$$

$$\text{EOL}(a_2) = .2(55,000) + .5(10,000) + .3(0) = \$16,000$$

$$\text{EOL}(a_3) = .2(0) + .5(2,500) + .3(45,000) = \$14,750$$

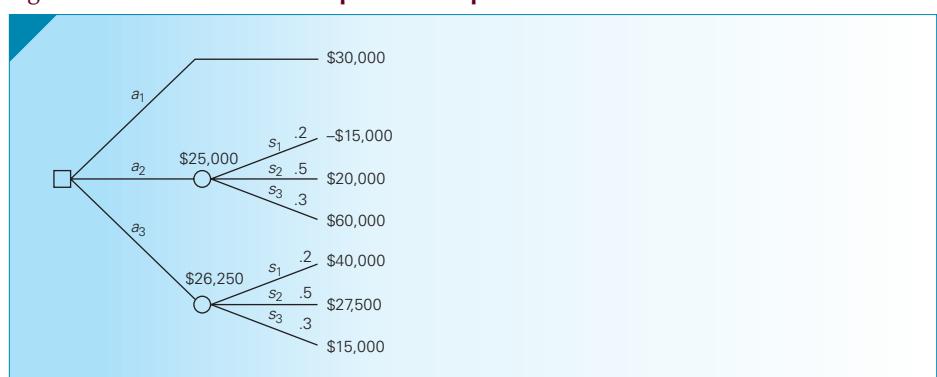
Because we want to minimize losses, we choose the act that produces the smallest expected opportunity loss, which is a_1 . We label its expected value EOL*. Observe that the EMV decision is the same as the EOL decision. This is not a coincidence—the opportunity loss table was produced directly from the payoff table.

Rollback Technique for Decision Trees

Figure 22.2 presents the decision tree for Example 22.1, with the probabilities of the states of nature included. The process of determining the EMV decision is called the **rollback technique**; it operates as follows. Beginning at the end of the tree (right-hand side), we calculate the expected monetary value at each round node. The numbers above the round nodes in Figure 22.2 specify these expected monetary values.

At each square node, we make a decision by choosing the branch with the largest EMV. In our example, there is only one square node. Our optimal decision is, of course, a_1 .

Figure 22.2 Rollback Technique for Example 22.1



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Using the Computer

There is yet another Excel add-in called Treeplan that enables Excel to draw the decision tree and produce the optimal solution. CD Appendix Treeplan provides a brief introduction to get you started.



EXERCISES

- 22.1** Set up the opportunity loss table from the following payoff table:

	a_1	a_2
s_1	55	26
s_2	43	38
s_3	29	43
s_4	15	51

- 22.2** Draw the decision tree for Exercise 22.1.

- 22.3** If we assign the following probabilities to the states of nature in Exercise 22.1, determine the EMV decision:

$$P(s_1) = .4 \quad P(s_2) = .1 \quad P(s_3) = .3 \quad P(s_4) = .2$$

- 22.4** Given the following payoff table, draw the decision tree:

	a_1	a_2	a_3
s_1	20	5	-1
s_2	8	5	4
s_3	-10	5	10

- 22.5** Refer to Exercise 22.4. Set up the opportunity loss table.

- 22.6** If we assign the following probabilities to the states of nature in Exercise 22.5, determine the EOL decision:

$$P(s_1) = .2 \quad P(s_2) = .6 \quad P(s_3) = .2$$

Applications

- 22.7** A baker must decide how many specialty cakes to bake each morning. From past experience, she knows that the daily demand for cakes ranges from 0 to 3. Each cake costs \$3.00 to produce and sells for \$8.00, and any unsold cakes are thrown into the garbage at the end of the day.

- Set up a payoff table to help the baker decide how many cakes to bake.
- Set up the opportunity loss table.
- Draw the decision tree.

- 22.8** Refer to Exercise 22.7. Assume that the probability of each value of demand is the same for all possible demands.

- Determine the EMV decision.
- Determine the EOL decision.

- 22.9** The manager of a large shopping center in Buffalo is in the process of deciding on the type of snow-clearing service to hire for his parking lot. Two services are available. The White Christmas Company will clear all snowfalls for a flat fee of \$40,000 for

the entire winter season. The Weplowem Company charges \$18,000 for each snowfall it clears. Set up the payoff table to help the manager decide, assuming that the number of snowfalls per winter season ranges from 0 to 4.

- 22.10** Refer to Exercise 22.9. Using subjective assessments the manager has assigned the following probabilities to the number of snowfalls. Determine the optimal decision.

$$\begin{aligned} P(0) &= .05 & P(1) &= .15 & P(2) &= .30 & P(3) &= .40 \\ P(4) &= .10 \end{aligned}$$

- 22.11** The owner of a clothing store must decide how many men's shirts to order for the new season. For a particular type of shirt, she must order in quantities of 100 shirts. If she orders 100 shirts, her cost is \$10 per shirt; if she orders 200 shirts, her cost is \$9 per shirt; and if she orders 300 or more shirts, her cost is \$8.50 per shirt. Her selling price for the shirt is \$12, but any shirts that remain unsold at the end of the season are sold at her famous "half-price, end-of-season sale." For the sake of simplicity, she is willing to assume that the demand for this type of shirt will be 100, 150, 200, or 250 shirts. Of course, she cannot sell more shirts than she stocks. She is also willing to assume that she will suffer no loss of goodwill among her customers if she understocks and the customers cannot buy all the shirts they want. Furthermore, she must place her order today for the entire season; she cannot wait to see how the demand is running for this type of shirt.

- Construct the payoff table to help the owner decide how many shirts to order.
- Set up the opportunity loss table.
- Draw the decision tree.

- 22.12** Refer to Exercise 22.11. The owner has assigned the following probabilities:

$$\begin{aligned} P(\text{Demand} = 100) &= .2, & P(\text{Demand} = 150) &= .25, \\ P(\text{Demand} = 200) &= .40, & P(\text{Demand} = 250) &= .15 \end{aligned}$$

Find the EMV decision.

- 22.13** A building contractor must decide how many mountain cabins to build in the ski resort area of Chick-oh-pee. He builds each cabin at a cost of \$26,000 and sells each for \$33,000. All cabins unsold after 10 months will be sold to a local investor for \$20,000. The contractor believes that the demand for cabins follows a Poisson distribution, with a mean of .5. He assumes that any probability less than .01 can be treated as 0.

Construct the payoff table and the opportunity loss table for this decision problem.

- 22.14** The electric company is in the process of building a new power plant. There is some uncertainty regarding the size of the plant to be built. If the community that the plant will service attracts a large number of industries, the demand for electricity will be high. If commercial establishments (offices and retail stores) are attracted, demand will be moderate. If neither industries nor commercial stores locate in the community, the electricity demand will be low. The company can build a small, medium, or large plant, but if the plant is too small, the company will incur extra costs. The total costs (in \$millions) of all options are shown in the accompanying table.

Electricity Demand	Size of Plant		
	Small	Medium	Large
Low	220	300	350
Moderate	330	320	350
High	440	390	350

The following probabilities are assigned to the electricity demand:

Demand	P(Demand)
Low	.15
Moderate	.55
High	.30

- Determine the act with the largest expected monetary value. (*Caution:* All the values in the table are costs.)
- Draw up an opportunity loss table.
- Calculate the expected opportunity loss for each decision, and determine the optimal decision.

- 22.15** A retailer buys bushels of mushrooms for \$2 each and sells them for \$5 each. The quality of the mushrooms begins to decline after the first day they are offered for sale; therefore, to sell the mushrooms for \$5/bushel, he must sell them on the first day. Bushels not sold on the first day can be sold to a wholesaler who buys day-old mushrooms at the following rates.

Amount purchased (bushels)	1	2	3	4 or more
Price per bushel	\$2.00	\$1.75	\$1.50	\$1.25

A 90-day observation of past demand yields the following information:

Daily demand (bushels)	10	11	12	13
Number of days	9	18	36	27

- Set up a payoff table that could be used by the retailer to decide how many bushels to buy.
- Find the optimal number of bushels the retailer should buy to maximize profit.

- 22.16** An international manufacturer of electronic products is contemplating introducing a new type of compact disk player. After some analysis of the market, the president of the company concludes that, within 2 years, the new product will have a market share of 5%, 10%, or 15%. She assesses the probabilities of these events as .15, .45, and .40, respectively. The vice-president of finance informs her that, if the product captures only a 5% market share, the company will lose \$28 million. A 10% market share will produce a \$2 million profit, and a 15% market share will produce an \$8 million profit. If the company decides not to begin production of the new compact disk player, there will be no profit or loss. Based on the expected value decision, what should the company do?

22-2 ACQUIRING, USING, AND EVALUATING ADDITIONAL INFORMATION

In this section, we discuss methods of introducing and incorporating additional information into the decision process. Such information generally has value, but it also has attendant costs; that is, we can acquire useful information from consultants, surveys, or other experiments, but we usually must pay for this information. We can calculate the maximum price that a decision maker should be willing to pay for any information by determining the value of perfect information. We begin by calculating the **expected payoff with perfect information** (EPPI).

If we knew in advance which state of nature would occur, we would certainly make our decisions accordingly. For instance, if the investor in Example 22.1 knew before investing his money what interest rates would do, he would choose the best act to suit that case. Referring to Table 22.1, if he knew that s_1 was going to occur, he would choose act a_3 ;

if s_2 were certain to occur, he'd choose a_1 , and if s_3 were certain, he'd choose a_2 . Thus, in the long run, his expected payoff from perfect information would be:

$$\text{EPPI} = .2(40,000) + .5(30,000) + .3(60,000) = \$41,000$$

Notice that we compute EPPI by multiplying the probability of each state of nature by the largest payoff associated with that state of nature and then summing the products.

This figure, however, does not represent the maximum amount he'd be willing to pay for perfect information. Because the investor could make an expected profit of $\text{EMV}^* = \$30,000$ without perfect information, we subtract EMV^* from EPPI to determine the **expected value of perfect information (EVPI)**. That is:

$$\text{EVPI} = \text{EPPI} - \text{EMV}^* = \$41,000 - \$30,000 = \$11,000$$

This means that, if perfect information were available, the investor should be willing to pay up to \$311,000 to acquire it.

You may have noticed that the expected value of perfect information (EVPI) equals the smallest expected opportunity loss (EOL*). Again, this is not a coincidence—it will always be the case. In future questions, if the opportunity loss table has been determined, you need only calculate EOL* in order to know EVPI.

22-2a Decision Making with Additional Information

Suppose the investor in our continuing example wants to improve his decision-making capabilities. He learns about Investment Management Consultants (IMC), who, for a fee of \$5,000, will analyze the economic conditions and forecast the behavior of interest rates over the next 12 months. The investor, who is quite shrewd (after all, he does have \$1 million to invest), asks for some measure of IMC's past successes. IMC has been forecasting interest rates for many years and so provides him with various conditional probabilities (referred to as **likelihood probabilities**), as shown in Table 22.3. Table 22.3 uses the following notation:

- I_1 : IMC predicts that interest rates will increase.
- I_2 : IMC predicts that interest rates will stay the same.
- I_3 : IMC predicts that interest rates will decrease.

TABLE 22.3 Likelihood Probabilities $P(I_i | s_j)$

	$I_1(\text{PREDICT } s_1)$	$I_2(\text{PREDICT } s_2)$	$I_3(\text{PREDICT } s_3)$
s_1	$P(I_1 s_1) = .60$	$P(I_2 s_1) = .30$	$P(I_3 s_1) = .10$
s_2	$P(I_1 s_2) = .10$	$P(I_2 s_2) = .80$	$P(I_3 s_2) = .10$
s_3	$P(I_1 s_3) = .10$	$P(I_2 s_3) = .20$	$P(I_3 s_3) = .70$

The I_i terms are referred to as **experimental outcomes**, and the process by which we gather additional information is called the **experiment**.

Examine the first line of Table 22.3. When s_1 actually did occur in the past, IMC correctly predicted s_1 60% of the time; 30% of the time, it predicted s_2 ; and 10% of the time, it predicted s_3 . The second row gives the conditional probabilities of I_1, I_2 , and I_3 when s_2 actually occurred. The third row shows the conditional probabilities of I_1, I_2 , and I_3 when s_3 actually occurred.

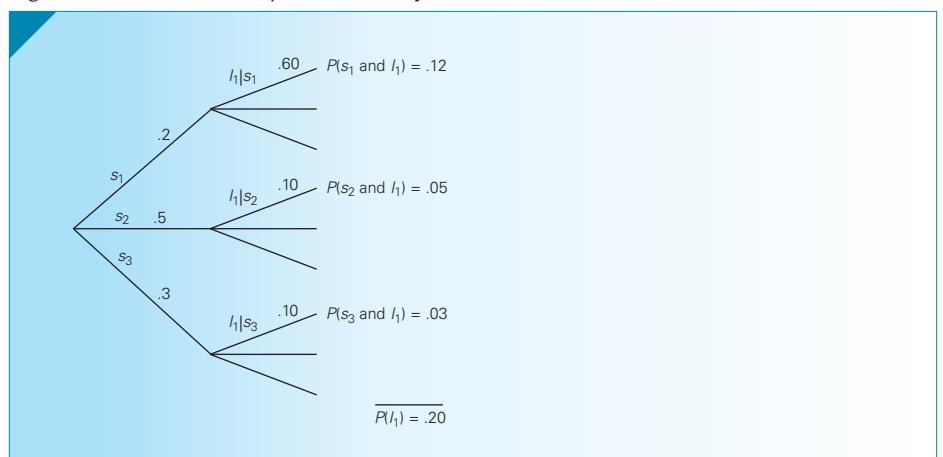
The following question now arises: How is the investor going to use the forecast that IMC produces? One approach is simply to assume that whatever IMC forecasts will actually take place and to choose the act accordingly. There are several drawbacks to this approach. Foremost among them is that it puts the investor in the position of ignoring whatever knowledge (in the form of subjective probabilities) he had concerning the issue. Instead the decision maker should use this information to modify his initial assessment of the probabilities of the states of nature. To incorporate the investor's subjective probabilities with the consultant's forecast requires the use of Bayes's Law, which we introduced in Section 6-4. We'll review Bayes's Law in the context of our example.

Suppose that the investor pays IMC the \$5,000 fee and IMC forecasts that s_1 will occur. We want to revise our estimates for the probabilities of the states of nature, given that I_1 is the outcome of the experiment. That is, we want $P(s_1|I_1)$, $P(s_2|I_1)$, and $P(s_3|I_1)$. Before proceeding, let's develop some terminology.

Recall from Section 6-4 that the original probabilities, $P(s_1)$, $P(s_2)$, and $P(s_3)$, are called **prior probabilities**, because they were determined prior to the acquisition of any additional information. In this example, they were based on the investor's experience. The set of probabilities we want to compute— $P(s_1|I_1)$, $P(s_2|I_1)$, and $P(s_3|I_1)$ —are called **posterior or revised probabilities**.

Now we will calculate the posterior probabilities, first by using a probability tree and then by applying a less time-consuming method. Figure 22.3 depicts the probability tree. We begin with the branches of the prior probabilities, which are followed by the likelihood probabilities.

Figure 22.3 Probability Tree to Compute Posterior Probabilities



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Notice that we label only $P(I_1|s_1)$, $P(I_1|s_2)$, and $P(I_1|s_3)$ because (at this point) we are assuming that I_1 is the experimental outcome. Now recall that conditional probability is defined as:

$$P(A|B) = \frac{P(A \text{ and } B)}{P(B)}$$

At the end of each branch, we have the joint probability $P(s_j \text{ and } I_1)$. By summing the joint probabilities $P(s_j \text{ and } I_1)$ for $j = 1, 2$, and 3 , we calculate $P(I_1)$. Finally:

$$P(s_j|I_1) = \frac{P(s_j \text{ and } I_1)}{P(I_1)}$$

Table 22.4 performs exactly the same calculations as the probability tree except without the tree. So, for example, our revised probability for s_3 , which was initially .3, is now .15.

Table 22.4 Posterior Probabilities for I_1

s_j	$P(s_j)$	$P(I_1 s_j)$	$P(s_j \text{ and } I_1)$	$P(s_j I_1)$
s_1	.2	.60	(.2)(.60) = .12	.12/.20 = .60
s_2	.5	.10	(.5)(.10) = .05	.05/.20 = .25
s_3	.3	.10	(.3)(.10) = .03	.03/.20 = .15
				$P(I_1) = .20$

After the probabilities have been revised, we can use them in exactly the same way we used the prior probabilities. That is, we can calculate the expected monetary value of each act:

$$\text{EMV}(a_1) = .60(30,000) + .25(30,000) + .15(30,000) = \$30,000$$

$$\text{EMV}(a_2) = .60(-15,000) + .25(20,000) + .15(60,000) = \$5,000$$

$$\text{EMV}(a_3) = .60(40,000) + .25(27,500) + .15(15,000) = \$33,125$$

Thus, if IMC forecasts s_1 , the optimal act is a_3 , and the expected monetary value of the decision is \$33,125.

As a further illustration, we now repeat the process for I_2 and I_3 in Tables 22.5 and 22.6, respectively.

Table 22.5 Posterior Probabilities for I_2

s_j	$P(s_j)$	$P(I_2 s_j)$	$P(s_j \text{ and } I_2)$	$P(s_j I_2)$
s_1	.2	.30	(.2)(.30) = .06	.06/.52 = .115
s_2	.5	.80	(.5)(.80) = .40	.40/.52 = .770
s_3	.3	.20	(.3)(.20) = .06	.06/.52 = .115
				$P(I_2) = .52$

Applying the posterior probabilities for I_2 from Table 22.5 to the payoff table, we find the following:

$$\text{EMV}(a_1) = .115(30,000) + .770(30,000) + .115(30,000) = \$30,000$$

$$\text{EMV}(a_2) = .115(-15,000) + .770(20,000) + .115(60,000) = \$20,575$$

$$\text{EMV}(a_3) = .115(40,000) + .770(27,500) + .115(15,000) = \$27,500$$

As you can see, if IMC predicts that s_2 will occur, the optimal act is a_1 , with an expected monetary value of \$30,000.

Table 22.6 Posterior Probabilities for I_3

s_j	$P(s_j)$	$P(I_3 s_j)$	$P(s_j \text{ and } I_3)$	$P(s_j I_3)$
s_1	.2	.10	(.2)(.10) = .02	.02/.28 = .071
s_2	.5	.10	(.5)(.10) = .05	.05/.28 = .179
s_3	.3	.70	(.3)(.70) = .21	.21/.28 = .750
				$P(I_3) = .28$

With the set of posterior probabilities for I_3 from Table 22.6, the expected monetary values are as follows:

$$\text{EMV}(\alpha_1) = .071(30,000) + .179(30,000) + .750(30,000) = \$30,000$$

$$\text{EMV}(\alpha_2) = .071(-15,000) + .179(20,000) + .750(60,000) = \$47,515$$

$$\text{EMV}(\alpha_3) = .071(40,000) + .179(27,500) + .750(15,000) = \$19,013$$

If IMC predicts that s_3 will occur, the optimal act is α_2 , with an expected monetary value of \$47,515.

At this point, we know the following:

If IMC predicts s_1 , then the optimal act is α_3 .

If IMC predicts s_2 , then the optimal act is α_1 .

If IMC predicts s_3 , then the optimal act is α_2 .

Thus, even before IMC makes its forecast, the investor knows which act is optimal for each of the three possible IMC forecasts. Of course, all these calculations can be performed before paying IMC its \$5,000 fee. This leads to an extremely important calculation. By performing the computations just described, the investor can determine whether he should hire IMC, that is, he can determine whether the value of IMC's forecast exceeds the cost of its information. Such a determination is called a **preposterior analysis**.

22-2b Preposterior Analysis

The objective of a preposterior analysis is to determine whether the value of the prediction is greater or less than the cost of the information. *Posterior* refers to the revision of the probabilities, and the *pre* indicates that this calculation is performed before paying the fee.

We begin by finding the expected monetary value of using the additional information. This value is denoted EMV' , which for our example is determined on the basis of the following analysis:

If IMC predicts s_1 , then the optimal act is α_3 , and the expected payoff is \$33,125.

If IMC predicts s_2 , then the optimal act is α_1 , and the expected payoff is \$30,000.

If IMC predicts s_3 , then the optimal act is α_2 , and the expected payoff is \$47,515.

A useful by-product of calculating the posterior probabilities is the set of probabilities of I_1 , I_2 , and I_3 :

$$P(I_1) = .20, \quad P(I_2) = .52, \quad P(I_3) = .28$$

(Notice that these probabilities sum to 1.) Now imagine that the investor seeks the advice of IMC an infinite number of times. (This is the basis for the expected value decision.) The set of probabilities of I_1 , I_2 , and I_3 indicates the following outcome distribution: 20% of the time, IMC will predict s_1 and the expected monetary value will be \$33,125; 52% of the time, IMC will predict s_2 and the expected monetary value will be \$30,000; and 28% of the time, IMC will predict s_3 and the expected monetary value will be \$47,515.

The expected monetary value with additional information is the weighted average of the expected monetary values, where the weights are $P(I_1)$, $P(I_2)$, and $P(I_3)$. Hence:

$$\text{EMV}' = .20(33,125) + .52(30,000) + .28(47,515) = \$35,529$$

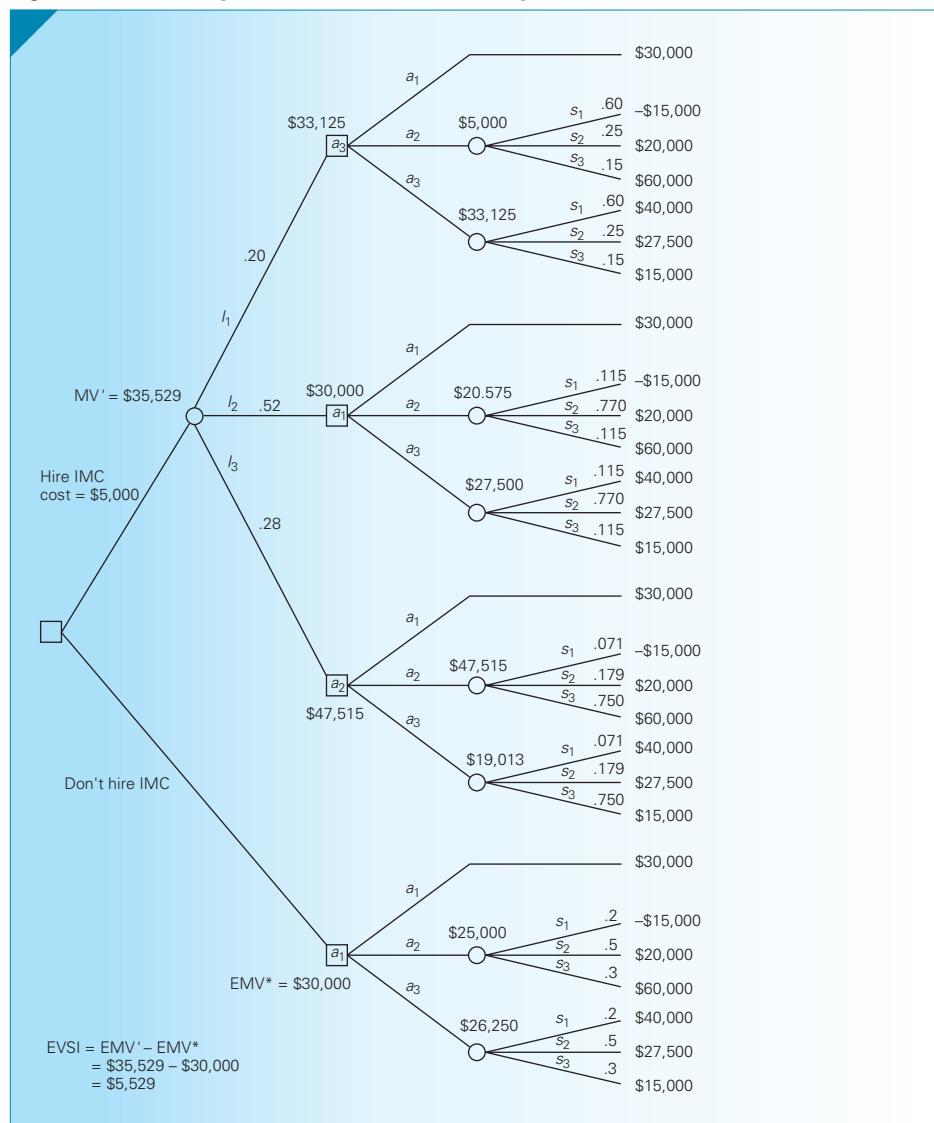
The value of IMC's forecast is the difference between the expected monetary value with additional information (EMV') and the expected monetary value without additional information (EMV*). This difference is called the **expected value of sample information** and is denoted EVSI. Thus:

$$\text{EVSI} = \text{EMV}' - \text{EMV}^* = \$35,529 - \$30,000 = \$5,529$$

By using IMC's forecast, the investor can make an average additional profit of \$5,529 in the long run. Because the cost of the forecast is only \$5,000, the investor is advised to hire IMC.

If you review this problem, you'll see that the investor had to make two decisions. The first (chronologically) was whether to hire IMC, and the second was which type of investment to make. A decision tree is quite helpful in describing the acts and states of nature in this question. Figure 22.4 provides the complete tree diagram.

Figure 22.4 Complete Decision Tree for Example 22.1



Acceptance Sampling: Solution

a. The two alternatives are

a_1 : No inspection (the current policy)

a_2 : 100% inspection

The two states of nature are

s_1 : The lot contains 15% defectives

s_2 : The lot contains 35% defectives

Based on the past year's historical record,

$$P(s_1) = .60 \text{ and } P(s_2) = .40$$

The payoff table is constructed as shown in Table 22.7.

TABLE 22.7 Payoff Table

	a_1	a_2
s_1	$5(1,000) - .15(1,000)(10) = \$3,500$	$5(1,000) - [(1,000)(2) + .15(1,000)(.50)] = \$2,925$
s_2	$5(1,000) - .35(1,000)(10) = \$1,500$	$5(1,000) - [(1,000)(2) + .35(1,000)(.50)] = \$2,825$

The expected monetary values are

$$\text{EMV}(a_1) = .60(3,500) + .40(1,500) = \$2,700$$

$$\text{EMV}(a_2) = .60(2,925) + .40(2,825) = \$2,885$$

The optimal act is a_2 with $\text{EMV}^* = \$2,885$.

- b. The cost of the proposed sampling is \$4. (The cost of inspecting a single unit is \$2.) To determine whether we should sample, we need to calculate the expected value of sample information—that is, we need to perform a preposterior analysis.

The first step of the preposterior analysis is to calculate the likelihood probabilities. There are three possible sample outcomes:

I_0 : No defectives in the sample

I_1 : One defective in the sample

I_2 : Two defectives in the sample

Because the sampling process is a binomial experiment, the likelihood probabilities are calculated by using the binomial probability distribution as summarized in Table 22.8.

TABLE 22.8 Likelihood Probability Table

	$P(I_0 s_j)$	$P(I_1 s_j)$	$P(I_2 s_j)$
$s_1(p = .15)$	$P(I_0 s_1) = (.85)^2 = .7225$	$P(I_1 s_1) = 2(.15)(.85) = .2550$	$P(I_2 s_1) = (.15)^2 = .0225$
$s_2(p = .35)$	$P(I_0 s_2) = (.65)^2 = .4225$	$P(I_1 s_2) = 2(.35)(.65) = .4550$	$P(I_2 s_2) = (.35)^2 = .1225$

If I_0 is the sample outcome, the posterior probabilities are calculated as shown in Table 22.9.

TABLE 22.9 Posterior Probabilities for I_0

s_j	$P(s_j)$	$P(I_0 s_j)$	$P(s_j \text{ and } I_0)$	$P(s_j I_0)$
s_1	$.60$	$.7225$	$(.60)(.7225) = .4335$	$.4335/.6025 = .720$
s_2	$.40$	$.4225$	$(.40)(.4225) = .1690$	$.1690/.6025 = .280$
$P(I_0) = .6025$				



Image Source/Getty Images

The expected monetary values if the sample outcome is I_0 are

$$\text{EMV}(a_1) = .720(3,500) + .280(1,500) = \$2,940$$

$$\text{EMV}(a_2) = .720(2,925) + .280(2,825) = \$2,897$$

Therefore, the optimal act is a_1 .

If I_1 is the sample outcome, the posterior probabilities are calculated as shown in Table 22.10.

TABLE 22.10 Posterior Probabilities for I_1

s_j	$P(s_j)$	$P(I_1 s_j)$	$P(s_j \text{ and } I_1)$	$P(s_j I_1)$
s_1	.60	.2550	(.60)(.2550) = .1530	.1530/.3350 = .457
s_2	.40	.4550	(.40)(.4550) = .1820	.1820/.3350 = .543
$P(I_1) = .3350$				© Cengage Learning

The expected monetary values if the sample outcome is I_1 are

$$\text{EMV}(a_1) = .457(3,500) + .543(1,500) = \$2,414$$

$$\text{EMV}(a_2) = .457(2,925) + .543(2,825) = \$2,871$$

Therefore, the optimal act is a_2 .

If I_2 is the sample outcome, the posterior probabilities are calculated as shown in Table 22.11.

TABLE 22.11 Posterior Probabilities for I_2

s_j	$P(s_j)$	$P(I_2 s_j)$	$P(s_j \text{ and } I_2)$	$P(s_j I_2)$
s_1	.60	.0225	(.60)(.0225) = .0135	.0135/.0625 = .216
s_2	.40	.1225	(.40)(.1225) = .0490	.0490/.0625 = .784
$P(I_2) = .0625$				© Cengage Learning

The expected monetary values if the sample outcome is I_2 are

$$\text{EMV}(a_1) = .216(3,500) + .784(1,500) = \$1,932$$

$$\text{EMV}(a_2) = .216(2,925) + .784(2,825) = \$2,847$$

Therefore, the optimal act is a_2 .

We can now summarize these results, as shown in Table 22.12.

TABLE 22.12 Summary of Optimal Acts

Sample Outcome	Probability	Optimal Act	Expected Monetary Value (\$)
I_0	.6025	a_1	2,940
I_1	.3350	a_2	2,871
I_2	.0625	a_2	2,847

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The expected monetary value with additional information is

$$\text{EMV}' = .6025(2,940) + .3350(2,871) + .0625(2,847) = \$2,911$$

The expected value of sample information is

$$\text{EVSI} = \text{EMV}' - \text{EMV}^* = 2,911 - 2,885 = \$26$$

Because the expected value of sample information is \$26 and the sampling cost is \$4, the company should take a sample of 2 units before deciding whether to inspect 100%. The optimal sequence is as follows:

1. Take a sample of 2 units.
2. If there are no defective units in the sample, continue the current policy of no inspection. If either one or two of the sample units are defective, perform a complete inspection of the lot.

22-2c Bayesian Statistics

In Chapters 10–19, we dealt with inference about unknown parameters. In Chapter 10, we pointed out that when interpreting the confidence interval estimate, we cannot make probability statements about parameters because they are not variables. However, Bayesian statistics specifies that parameters are variables, and we can assume various probability distributions. The acceptance sampling example illustrates this concept. The parameter was the proportion p of defective units in the 1,000-unit batch. The example was unrealistic because we allowed the parameter to assume one of only two values, 15% and 35%. We assigned prior probabilities using the relative frequency approach; that is, based on historic records we had

$$P(p = 15\%) = .60 \quad \text{and} \quad P(p = 35\%) = .40$$

To make the problem more realistic, we let p be a continuous random variable rather than a discrete one. In other words, p can take on any value between 0 and 100%. We assign a density function also based on historical records. We can express the payoffs as a linear function of p . Then, using calculus, we can determine the optimum decision. We can also revise the prior probabilities based on the outcome of the sampling of two units. The technique requires some calculus, but the concept is the same as the one developed in this chapter. It should be noted that there is a parallel universe of Bayesian statistics that more or less matches the material in the inference part of this book. Interested readers can learn more about Bayesian statistics from additional courses dedicated to the subject.



EXERCISES

- 22.17** Find EPPI, EMV*, and EVPI for the accompanying payoff table and probabilities.

	a₁	a₂	a₃
s₁	60	110	75
s₂	40	110	150
s₃	220	120	85
s₄	250	120	130

$$P(s_1) = .10 \quad P(s_2) = .25 \quad P(s_3) = .50 \quad P(s_4) = .15$$

- 22.18** For Exercise 22.17, determine the opportunity loss table and compute EOL*. Confirm that EOL* = EVPI.

- 22.19** Given the following payoff table and probabilities, determine EVPI.

	a₁	a₂	a₃	a₄
s₁	65	20	45	30
s₂	70	110	80	95

$$P(s_1) = .5 \quad P(s_2) = .5$$

- 22.20** Redo Exercise 22.19, changing the probabilities to the following values.

- $P(s_1) = .75 \quad P(s_2) = .25$
- $P(s_1) = .95 \quad P(s_2) = .05$

- 22.21** What conclusion can you draw about the effect of the probabilities on EVPI from Exercises 22.19 and 22.20?

- 22.22** Determine the posterior probabilities, given the following prior and likelihood probabilities.

Prior probabilities

$$P(s_1) = .25 \quad P(s_2) = .40 \quad P(s_3) = .35$$

Likelihood Probabilities

	<i>I</i> ₁	<i>I</i> ₂	<i>I</i> ₃	<i>I</i> ₄
<i>s</i> ₁	.40	.30	.20	.10
<i>s</i> ₂	.25	.25	.25	.25
<i>s</i> ₃	0	.30	.40	.30

- 22.23 Calculate the posterior probabilities from the prior and likelihood probabilities that follow.

Prior Probabilities

$$P(s_1) = .5 \quad P(s_2) = .5$$

Likelihood Probabilities

	<i>I</i> ₁	<i>I</i> ₂
<i>s</i> ₁	.98	.02
<i>s</i> ₂	.05	.95

- 22.24 With the accompanying payoff table and the prior and posterior probabilities computed in Exercise 22.23 calculate the following.
- The optimal act for each experimental outcome
 - The expected value of sample information

Payoff Table

	<i>a</i> ₁	<i>a</i> ₂	<i>a</i> ₃
<i>s</i> ₁	10	18	23
<i>s</i> ₂	22	19	15

- 22.25 Given the following payoff table, prior probabilities, and likelihood probabilities, find the expected value of sample information.

Payoff Table

	<i>a</i> ₁	<i>a</i> ₂
<i>s</i> ₁	60	90
<i>s</i> ₂	90	90
<i>s</i> ₃	150	90

Prior probabilities

$$P(s_1) = \frac{1}{3} \quad P(s_2) = \frac{1}{3} \quad P(s_3) = \frac{1}{3}$$

Likelihood Probabilities

	<i>I</i> ₁	<i>I</i> ₂
<i>s</i> ₁	.7	.3
<i>s</i> ₂	.5	.5
<i>s</i> ₃	.2	.8

- 22.26 Repeat Exercise 22.25 with the following prior probabilities.

$$P(s_1) = .5 \quad P(s_2) = .4 \quad P(s_3) = .1$$

- 22.27 Repeat Exercise 22.25 with the following prior probabilities.

$$P(s_1) = .90 \quad P(s_2) = .05 \quad P(s_3) = .05$$

- 22.28 What conclusions can you draw about the effect of the prior probabilities on EVSI from Exercises 22.25–22.27?

Applications

- 22.29 A sporting-goods storeowner has the opportunity to purchase a lot of 50,000 footballs for \$100,000. He believes that he can sell some or all by taking out mail-order advertisements in a magazine. Each football will be sold for \$6. The advertising cost is \$25,000, and the mailing cost per football is \$1. He believes that the demand distribution is as follows.

Demand	<i>P(Demand)</i>
10,000	.2
30,000	.5
50,000	.3

What is the maximum price the owner should pay for additional information about demand?

- 22.30 What is the maximum price the electronics product manufacturer should be willing to pay for perfect information regarding the market share in Exercise 22.16?

- 22.31 To improve her decision-making capability, the electronics products manufacturer in Exercise 22.16 performs a survey of potential buyers of compact disc players. She describes the product to 25 individuals, 3 of whom say they would buy it. Using this additional information together with the prior probabilities, determine whether the new product should be produced.

- 22.32 A radio station that currently directs its programming toward middle-age listeners is contemplating switching to rock-and-roll music. After analyzing advertising revenues and operating costs, the owner concludes that, for each percentage point of market share, revenues increase by \$100,000 per year. Fixed annual operating costs are \$700,000. The owner believes that, with the change, the station will get a 5%, 10%, or 20% market share, with probabilities .4, .4, and .2, respectively. The current annual profit is \$285,000.

- Set up the payoff table.
- Determine the optimal act.
- What is the most the owner should be willing to pay to acquire additional information about the market share?

- 22.33 There is a garbage crisis in North America—too much garbage and no place to put it. As a consequence, the idea of recycling has become quite popular. A waste-management company in a large

city is willing to begin recycling newspapers, aluminum cans, and plastic containers. However, it is profitable to do so only if a sufficiently large proportion of households is willing to participate. In this city, 1 million households are potential recyclers. After some analysis, it was determined that, for every 1,000 households that participate in the program, the contribution to profit is \$500. It was also discovered that fixed costs are \$55,000 per year. It is believed that 50,000, 100,000, 200,000, or 300,000 households will participate, with probabilities .5, .3, .1, and .1, respectively. A preliminary survey was performed wherein 25 households were asked whether they would be willing to be part of this recycling program. Suppose only 3 of the 25 respond affirmatively, incorporate this information into the decision-making process to decide whether the waste-management company should proceed with the recycling venture.

22.34 Repeat Exercise 22.33, given that 12 out of 100 households respond affirmatively.

22.35 Suppose that in Exercise 22.14 a consultant offers to analyze the problem and predict the amount of electricity required by the new community. To induce the electric company to hire her, the consultant provides the set of likelihood probabilities given here. Perform a preposterior analysis to determine the expected value of the consultant's sample information.

	I_1 (predict low demand)	I_2 (predict moderate demand)	I_3 (predict high demand)
s_1	.5	.3	.2
s_2	.3	.6	.1
s_3	.2	.2	.6

22.36 In Exercise 22.32, suppose that it is possible to survey radio listeners to determine whether they would tune in to the station if the format changed to rock and roll. What would a survey of size 2 be worth?

22.37 Suppose that in Exercise 22.32 a random sample of 25 radio listeners revealed that 2 people would be regular listeners of the station. What is the optimal decision now?

22.38 The president of an automobile battery company must decide which one of three new types of batteries to produce. The fixed and variable costs of each battery are shown in the accompanying table.

Battery	Fixed Cost (\$)	Variable Cost (per Unit) (\$)
1	900,000	20
2	1,150,000	17
3	1,400,000	15

The president believes that demand will be 50,000, 100,000, or 150,000 batteries, with probabilities .3, .3, and .4, respectively. The selling price of the battery will be \$40.

- Determine the payoff table.
- Determine the opportunity loss table.
- Find the expected monetary value for each act, and select the optimal one.
- What is the most the president should be willing to pay for additional information about demand?

22.39 Credibility is often the most effective feature of an advertising campaign. Suppose that, for a particular advertisement, 32% of people surveyed currently believe what the ad claims. A marketing manager believes that for each 1-point increase in that percentage, annual sales will increase by \$1 million. For each 1-point decrease, annual sales will decrease by \$1 million. The manager believes that a change in the advertising approach can influence the ad's credibility. The probability distribution of the potential percentage changes is listed here.

Percentage Change	Probability
-2	.1
-1	.1
0	.2
+1	.3
+2	.3

If for each dollar of sales the profit contribution is 10 cents and the overall cost of changing the ad is \$58,000, should the ad be changed?

22.40 Suppose that in Exercise 22.39 it is possible to perform a survey to determine the percentage of people who believe the ad. What would a sample of size 1 be worth?

22.41 Suppose that in Exercise 22.39 a sample of size 5 showed that only one person believes the new ad. In light of this additional information, what should the manager do?

22.42 Max the Bookie is trying to decide how many telephones to install in his new bookmaking operation. Because of heavy police activity, he cannot increase or decrease the number of telephones once he sets up his operation. He has narrowed the possible choices to three. He can install 25, 50, or 100 telephones. His profit for 1 year (the usual length of time he can remain in business before the police close him down) depends on the average number of calls he receives. The number of calls is Poisson distributed. After some deliberation, he concludes that the average number of calls per minute can be

.5, 1.0, or 1.5, with probabilities of .50, .25, and .25, respectively. Max then produces the payoffs given in the accompanying table.

Payoff Table

	25 Telephones (\$)	50 Telephones (\$)	100 Telephones (\$)
$s_1(\mu = .5)$	50,000	30,000	20,000
$s_2(\mu = 1.0)$	50,000	60,000	40,000
$s_3(\mu = 1.5)$	50,000	60,000	80,000

Max's assistant, Lefty (who attended a business school for 2 years), points out that Max may be able to get more information by observing a competitor's similar operation. However, he will be able to watch for only 10 minutes, and doing so will cost him \$4,000. Max determines that if he counts fewer than 8 calls, that would be a low number; at least 8 but fewer than 17 would be a medium number; and at least 17 would be a large number of calls. Max also decides that, if the experiment is run, he will record only whether there is a small, medium, or large number of calls. Help Max by performing a preposterior analysis to determine whether the sample should be taken. Conclude by specifying clearly what the optimal strategy is.

- 22.43** The Megabuck Computer Company is thinking of introducing two new products. The first, Model 101, is a small computer designed specifically for children between ages 8 and 16. The second, Model 202, is a medium-size computer suitable for managers. Because of limited production capacity, Megabuck has decided to produce only one of the products.

The profitability of each model depends on the proportion of the potential market that would actually buy the computer. For Model 101, the size of the market is estimated at 10 million, whereas for Model 202, the estimate is 3 million.

After careful analysis, the management of Megabuck has concluded that the percentage of buyers of Model 101 is 5%, 10%, or 15%. The respective profits are given here.

Percent Who Buy Model 101	Net Profits (\$ Millions)
5	20
10	100
15	210

An expert in probability from the local university estimated the probability of the percentages as $P(5\%) = .2$, $P(10\%) = .4$, and $P(15\%) = .4$.

A similar analysis for Model 202 produced the following table.

Percent Who Buy Model 202	Net Profits (\$ Millions)
30	70
40	100
50	150

For this model, the expert estimated the probabilities as $P(30\%) = .1$, $P(40\%) = .4$, and $P(50\%) = .5$.

- a. Based on this information, and with the objective of maximizing expected profit, which model should Megabuck produce?

- b. To make a better decision, Megabuck sampled 10 potential buyers of Model 101 and 20 potential buyers of Model 202. Only 1 of the 10 wished to purchase the Model 101, whereas 9 of the 20 indicated that they would buy Model 202. Given this information, revise the prior probabilities and determine which model should be produced.

- 22.44** A major movie studio has just completed its latest epic, a musical comedy about the life of Attila the Hun. Because the movie is different (no sex or violence), the studio is uncertain about how to distribute it. The studio executives must decide whether to release the movie to North American audiences or to sell it to a European distributor and realize a profit of \$12 million. If the movie is shown in North America, the studio profit depends on its level of success, which can be classified as excellent, good, or fair. The payoffs and the prior subjective probabilities of the success levels are shown in the accompanying table.

Success Level	Payoff (\$ Million)	Probability
Excellent	33	.5
Good	12	.3
Fair	-15	.2

Another possibility is to have the movie shown to a random sample of North Americans and use their collective judgment to help the studio make a decision. These judgments are categorized as "rave review," "lukewarm response," and "poor response." The cost of the sample is \$100,000. The sampling process has been used several times in the past. The likelihood probabilities describing the audience judgments and the movie's success level are shown next. Perform a preposterior analysis to determine what the studio executives should do.

Success Level	Judgment		
	Rave Review	Lukewarm Response	Poor Response
Excellent	.8	.1	.1
Good	.5	.3	.2
Fair	.4	.3	.3

CHAPTER SUMMARY

The objective of decision analysis is to select the optimal act from a list of alternative acts. We define as optimal the act with the largest expected monetary value or smallest expected opportunity loss. The expected values are calculated after assigning prior probabilities to the states of nature. The acts, states of nature, and their consequences may be presented in a payoff table, an opportunity loss table, or a decision tree. We also discussed a method by

which additional information in the form of an experiment can be incorporated in the analysis. This method involves combining prior and likelihood probabilities to produce posterior probabilities. The preposterior analysis allows us to decide whether to pay for and acquire the experimental outcome. That decision is based on the expected value of sample information and on the sampling cost.

IMPORTANT TERMS:

- Acts 888
- States of nature 888
- Payoff table 889
- Opportunity loss 889
- Decision tree 889
- Expected monetary value (EMV) 891
- Expected opportunity loss (EOL) 892
- Rollback technique 892
- Expected payoff with perfect information (EPPI) 894

- Expected value of perfect information (EVPI) 895
- Likelihood probabilities 895
- Experimental outcomes 895
- Experiment 895
- Prior probabilities 896
- Posterior or revised probabilities 896
- Preposterior analysis 898
- Expected value of sample information 899

S Y M B O L S :

Symbol	Represents
a_i	Acts
s_j	States of nature
I_i	Experimental outcomes
$P(s_j)$	Prior probability
$P(I_i s_j)$	Likelihood probability
$P(s_j \text{ and } I_i)$	Joint probability
$P(s_j I_i)$	Posterior probability

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CONCLUSION

We have come to the end of the journey that began with the words “Statistics is a way to get information from data.” You will shortly write the final examination in your statistics course. (We assume that readers of this book are taking a statistics course and not just reading it for fun.) If you believe that this event will be the point where you and statistics part company, you could not be more wrong. In the world into which you are about to graduate, the potential applications of statistical techniques are virtually limitless.

However, if you are unable or unwilling to employ statistics, you cannot consider yourself to be competent. Can you imagine a marketing manager who does not fully understand marketing concepts and techniques? Can an accountant who knows little about accounting principles do his or her job? Similarly, you cannot be a competent decision maker without a comprehension of statistical concepts and techniques.

In our experience, we have come across far too many people who display an astonishing ignorance of probability and statistics. In some cases, this is displayed in the way they gamble. (Talk to people in a casino in Las Vegas or Atlantic City and discover how many understand probability; see how many of them lose money.) We have seen managers who regularly make decisions involving millions of dollars who don’t understand the fundamental principles that should govern the way decisions are made. The worst may be the managers who have access to vast amounts of information no farther away than the nearest computer but don’t know how to get it or even know it is there.

This raises the question, What statistical concepts and techniques will you need for your life after the final exam? We don’t expect students to remember the formulas (or computer commands) that calculate the confidence interval estimates or test statistics. (Statistics reference books are available for that purpose.) However, you must know what you can and cannot do with statistical techniques. You must remember a number of important principles that were covered in this book. To assist you, we have selected the

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12 most important concepts and list them here. They are drawn from the “Developing an Understanding of Statistical Concepts” subsections that are scattered throughout the book. We hope that they prove useful to you.

23-1 / TWELVE STATISTICAL CONCEPTS YOU NEED FOR LIFE AFTER THE STATISTICS FINAL EXAM

1. Statistical techniques are processes that convert data into information. Descriptive techniques describe and summarize; inferential techniques allow us to make estimates and draw conclusions about populations from samples.
2. We need a large number of techniques because there are numerous objectives and types of data. There are three types of data: interval (real numbers), nominal (categories), and ordinal (ratings). Each combination of data type and objective requires specific techniques.
3. We gather data by various sampling plans. However, the validity of any statistical outcome is dependent on the validity of the sampling. “Garbage in, garbage out” very much applies in statistics.
4. The sampling distribution is the source of statistical inference. The confidence interval estimator and the test statistic are derived directly from the sampling distribution. All inferences are actually probability statements based on the sampling distribution.
5. All tests of hypotheses are conducted similarly. We assume that the null hypothesis is true. We then compute the value of the test statistic. If the difference between what we have observed (and calculated) and what we expect to observe is too large, we reject the null hypothesis. The standard that decides what is “too large” is determined by the probability of a Type I error.
6. In any test of hypothesis (and in most decisions) there are two possible errors: Type I and Type II. The relationship between the probabilities of these errors helps us decide where to set the standard. If we set the standard so high that the probability of a Type I error is very small, we increase the probability of a Type II error. A procedure designed to decrease the probability of a Type II error must have a relatively large probability of a Type I error.
7. We can improve the exactitude of a confidence interval estimator or decrease the probability of a Type II error by increasing the sample size. More data mean more information, which results in narrower intervals or lower probabilities of making mistakes, which in turn leads to better decisions.
8. The sampling distributions that are used for interval data are the Student t and the F . These distributions are related so that the various techniques for interval data are themselves related. We can use the analysis of variance in place of the t -test of two means. We can use regression analysis with indicator variables in place of the analysis of variance. We often build a model to represent relationships among interval variables, including indicator variables.
9. In analyzing interval data, we attempt to explain as much of the variation as possible. By doing so, we can learn a great deal about whether populations differ and what variables affect the response (dependent) variable.

10. The techniques used on nominal data require that we count the number of times each category occurs. The counts are then used to compute statistics. The sampling distributions we use for nominal data are the standard normal and the chi-squared. These distributions are related, as are the techniques.
11. The techniques used on ordinal data are based on a ranking procedure. We call these techniques *nonparametric*. Because the requirements for the use of nonparametric techniques are less stringent than those for a parametric procedure, we often use nonparametric techniques in place of parametric ones when the required conditions for the parametric test are not satisfied. To ensure the validity of a statistical technique, we must check the required conditions.
12. We can obtain data through experimentation or by observation. Observational data lend themselves to several conflicting interpretations. Data gathered by an experiment are more likely to lead to a definitive interpretation. In addition to designing experiments, statistics practitioners can also select particular sample sizes to produce the accuracy and confidence they desire.

APPENDIX A

DATA FILE SAMPLE STATISTICS

Chapter 10

- 10.30** $\bar{x} = 252.38$
10.31 $\bar{x} = 1,810.16$
10.32 $\bar{x} = 12.10$
10.33 $\bar{x} = 10.21$
10.34 $\bar{x} = .510$
10.35 $\bar{x} = 26.81$
10.36 $\bar{x} = 19.28$
10.37 $\bar{x} = 15.00$
10.38 $\bar{x} = 585,063$
10.39 $\bar{x} = 14.98$
10.40 $\bar{x} = 27.19$

Chapter 11

- 11.35** $\bar{x} = 5,065$
11.36 $\bar{x} = 29,120$
11.37 $\bar{x} = 569$
11.38 $\bar{x} = 19.13$
11.39 $\bar{x} = -1.20$
11.40 $\bar{x} = 55.8$
11.41 $\bar{x} = 5.04$
11.42 $\bar{x} = 19.39$
11.43 $\bar{x} = 105.7$
11.44 $\bar{x} = 4.84$
11.45 $\bar{x} = 5.64$
11.46 $\bar{x} = 29.92$
11.47 $\bar{x} = 231.56$

Chapter 12

- 12.31** $\bar{x} = 7.15, s = 1.65, n = 200$
12.32 $\bar{x} = 4.66, s = 2.37, n = 250$
12.33 $\bar{x} = 17.00, s = 4.31, n = 162$
12.34 $\bar{x} = 15,137, s = 5,263, n = 306$
12.35 $\bar{x} = 59.04, s = 20.62, n = 122$
12.36 $\bar{x} = 2.67, s = 2.50, n = 188$
12.37 $\bar{x} = 44.14, s = 7.88, n = 475$
12.38 $\bar{x} = 591.87, s = 125.06, n = 205$
12.39 $\bar{x} = 13.94, s = 2.16, n = 212$
12.40 $\bar{x} = 15.27, s = 5.72, n = 116$
12.41 $\bar{x} = 4.34, s = 4.22, n = 950$
12.42 $\bar{x} = 89.27, s = 17.30, n = 85$
12.43 $\bar{x} = 15.02, s = 8.31, n = 83$
12.44 $\bar{x} = 96,100, s = 34,468, n = 473$
12.45 $\bar{x} = 1,507, s = .640, n = 473$
12.75 $s^2 = 270.58, n = 25$
12.76 $s^2 = 22.56, n = 245$
12.77 $s^2 = 4.72, n = 90$
12.78 $s^2 = 174.47, n = 100$
12.79 $s^2 = 19.68, n = 25$
12.103 $n(1) = 51, n(2) = 291, n(3) = 70, n(4) = 301, n(5) = 261$
12.104 $n(1) = 28, n(2) = 174, n(3) = 135, n(4) = 67, n(5) = 51, n(6) = 107$
12.105 $n(1) = 466, n(2) = 55$
12.107 $n(1) = 140, n(2) = 59, n(3) = 39, n(4) = 106, n(5) = 47$

12.108 $n(1) = 153, n(2) = 24$

12.109 $n(1) = 92, n(2) = 28$

12.110 $n(1) = 603, n(2) = 905$

12.111 $n(1) = 92, n(2) = 334$

12.112 $n(1) = 57, n(2) = 35, n(3) = 4, n(4) = 4$

12.114 $n(1) = 60, n(2) = 275, n(3) = 20, n(4) = 180, n(5) = 75, n(6) = 4,390$

12.115 $n(1) = 786, n(2) = 254$

12.116 $n(1) = 518, n(2) = 132$

12.136 $n(1) = 81, n(2) = 47, n(3) = 167, n(4) = 146, n(5) = 34$

12.137 $n(1) = 63, n(2) = 125, n(3) = 45, n(4) = 87$

12.138 $n(1) = 418, n(2) = 536, n(3) = 882$

12.139 $n(1) = 290, n(2) = 35$

12.140 $n(1) = 72, n(2) = 77, n(3) = 37, n(4) = 50, n(5) = 176$

12.141 $n(1) = 289, n(2) = 51$

Chapter 13

13.17 Tastee: $\bar{x}_1 = 36.93, s_1 = 4.23, n_1 = 15;$

Competitor: $\bar{x}_2 = 31.36, s_2 = 3.35, n_2 = 25$

13.18 Oat bran: $\bar{x}_1 = 10.01, s_1 = 4.43, n_1 = 120;$

Other: $\bar{x}_2 = 9.12, s_2 = 4.45, n_2 = 120$

13.19 18-to-34: $\bar{x}_1 = 58.99, s_1 = 30.77, n_1 = 250;$

35-to-50: $\bar{x}_2 = 52.96, s_2 = 43.32, n_2 = 250$

13.20 2 yrs ago: $\bar{x}_1 = 59.81, s_1 = 7.02, n_1 = 125;$

This year: $\bar{x}_2 = 57.40, s_2 = 6.99, n_2 = 159$

13.21 Male: $\bar{x}_1 = 10.23, s_1 = 2.87, n_2 = 100;$

Female: $\bar{x}_2 = 9.66, s_2 = 2.90, n_2 = 100$

13.22 A: $\bar{x}_1 = 115.50, s_1 = 21.69, n_1 = 30;$

B: $\bar{x}_2 = 110.20, s_2 = 21.93, n_2 = 30$

13.23 Men: $\bar{x}_1 = 5.56, s_1 = 5.36, n_1 = 306;$

Women: $\bar{x}_2 = 5.49, s_2 = 5.58, n_2 = 290$

13.24 A: $\bar{x}_1 = 70.42, s_1 = 20.54, n_1 = 24;$

B: $\bar{x}_2 = 56.44, s_2 = 9.03, n_2 = 16$

13.25 Successful: $\bar{x}_1 = 5.02, s_1 = 1.39, n_1 = 200;$

Unsuccessful: $\bar{x}_2 = 7.80, s_2 = 3.09, n_2 = 200$

13.26 Phone: $\bar{x}_1 = .646, s_1 = .045, n_1 = 125;$

Not: $\bar{x}_2 = .601, s_2 = .053, n_2 = 145$

13.27 Chitchat: $\bar{x}_1 = .654, s_1 = .048, n_1 = 95;$

Political: $\bar{x}_2 = .662, s_2 = .045, n_2 = 90$

13.28 Planner: $\bar{x}_1 = 6.18, s_1 = 1.59, n_1 = 64;$

Broker: $\bar{x}_2 = 5.94, s_2 = 1.61, n_2 = 81$

13.29 Textbook: $\bar{x}_1 = 63.71, s_1 = 5.90, n_1 = 173,$

No book: $\bar{x}_2 = 66.80, s_2 = 6.85, n_2 = 202$

13.30 Wendy's: $\bar{x}_1 = 149.85, s_1 = 21.82, n_1 = 213;$

McDonald's: $\bar{x}_2 = 154.43, s_2 = 23.64, n_2 = 202$

13.31 Men: $\bar{x}_1 = 488, s_1 = 19.6, n_1 = 124;$

Women: $\bar{x}_2 = 498, s_2 = 21.9, n_2 = 187$

13.32 Applied: $\bar{x}_1 = 130.93, s_1 = 31.99, n_1 = 100;$

Contacted: $\bar{x}_2 = 126.14, s_2 = 26.00, n_2 = 100$

13.33 New: $\bar{x}_1 = 73.60, s_1 = 15.60, n_1 = 20;$

Existing: $\bar{x}_2 = 69.20, s_2 = 15.06, n_2 = 20$

13.34 Fixed: $\bar{x}_1 = 60,245, s_1 = 10,506, n_1 = 90;$

Commission: $\bar{x}_2 = 63,563, s_2 = 10,755, n_2 = 90$

13.35 Accident: $\bar{x}_1 = 633.97, s_1 = 49.45, n_1 = 93,$

No accident: $\bar{x}_2 = 661.86, s_2 = 52.69, n_2 = 338$

13.36 Cork: $\bar{x}_1 = 14.20, s_1 = 2.84, n_1 = 130;$

Metal: $\bar{x}_2 = 11.27, s_2 = 4.42, n_2 = 130,$

13.37 Before: $\bar{x}_1 = 497, s_1 = 73.8, n_1 = 355;$

After: $\bar{x}_2 = 511, s_2 = 69.1, n_2 = 288$

13.38 Big bucket: $\bar{x}_1 = 93.82, s_1 = 15.89, n_1 = 48;$

Medium bucket: $\bar{x}_2 = 61.25, s_2 = 9.96, n_2 = 48$

13.39 a. CA wine: $\bar{x}_1 = 97.71, s_1 = 5.10, n_1 = 24;$

SD wine: $\bar{x}_2 = 94.58, s_2 = 7.36, n_2 = 24$

b. CA wine: $\bar{x}_1 = 64.00, s_1 = 9.44, n_1 = 24;$

SD wine: $\bar{x}_2 = 57.33, s_2 = 9.14, n_2 = 24$

13.40 Clean plates: $\bar{x}_1 = 10.04, s_1 = 2.32, n_1 = 28;$

Dirty plate: $\bar{x}_2 = 8.64, s_2 = 1.85, n_2 = 28$

13.41 One pound: $\bar{x}_1 = 136.80$, $s_1 = 24.16$, $n_1 = 20$; Half pound: $\bar{x}_2 = 72.80$, $s_2 = 9.87$, $n_2 = 20$

13.101 $D = X$ [This year] $-X$ [5 years ago]: $\bar{x}_D = 12.4$, $s_D = 99.1$, $n_D = 150$

13.102 $D = X$ [Waiter] $-X$ [Waitress]: $\bar{x}_D = -1.16$, $s_D = 2.22$, $n_D = 50$

13.103 $D = X$ [This year] $-X$ [Last year]: $\bar{x}_D = 19.75$, $s_D = 30.63$, $n_D = 40$

13.104 $D = X$ [Insulated] $-X$ [Uninsulated]: $\bar{x}_D = -57.40$, $s_D = 13.14$, $n_D = 15$

13.105 $D = X$ [Men] $-X$ [Women]: $\bar{x}_D = -42.94$, $s_D = 317.16$, $n_D = 45$

13.106 $D = X$ [Last year] $-X$ [Previous year]: $\bar{x}_D = -183.35$, $s_D = 1,568.94$, $n_D = 170$

13.107 $D = X$ [This year] $-X$ [Last year]: $\bar{x}_D = .0422$, $s_D = .1634$, $n_D = 38$

13.108 $D = X$ [Company 1]

$-X$ [Company 2]: $\bar{x}_D = 520.85$, $s_D = 1,854.92$, $n_D = 55$

13.109 $D = X$ [New] $-X$ [Existing]: $\bar{x}_D = 4.55$, $s_D = 7.22$, $n_D = 20$

13.111 $D = X$ [Finance] $-X$ [Marketing]: $\bar{x}_D = 4,587$, $s_D = 22,851$, $n_D = 25$

13.113 a. $D = X$ [After] $-X$ [Before]: $\bar{x}_D = -10$, $s_D = 1.95$, $n_D = 42$

b. $D = X$ [After] $-X$ [Before]: $\bar{x}_D = 1.24$, $s_D = 2.83$, $n_D = 98$

13.125 Week 1: $s^2_1 = 19.38$, $n_1 = 100$; Week 2: $s^2_2 = 12.70$, $n_2 = 100$

13.126 A: $s^2_1 = 41,309$, $n_1 = 100$;

B: $s^2_2 = 19,850$, $n_2 = 100$

13.127 Portfolio 1: $s^2_1 = .0261$, $n_1 = 52$; Portfolio 2: $s^2_2 = .0875$, $n_2 = 52$

13.128 Teller 1: $s^2_1 = 3.35$, $n_1 = 100$; Teller 2: $s^2_2 = 10.95$, $n_2 = 100$

13.151 Cadillac: $n(1) = 33$, $n(2) = 317$;

Lincoln: $n(1) = 33$, $n(2) = 261$

13.152 Smokers: $n_1(1) = 28$; $n_1(2) = 10$; Non-smokers:

$n_2(1) = 150$; $n_2(2) = 12$

13.153 This year: $n_1(1) = 306$;

$n_1(2) = 171$; 10 years ago:

$n_2(1) = 304$; $n_2(2) = 158$

13.154 Canada: $n_1(1) = 230$; $n_1(2) = 215$; U.S.: $n_2(1) = 165$; $n_2(2) = 275$

13.155 A: $n_1(1) = 189$; $n_1(2) = 11$;

B: $n_2(1) = 178$; $n_2(2) = 22$

13.156 High school: $n_1(1) = 17$; $n_1(2) = 63$; Post-secondary: $n_2(1) = 29$; $n_2(2) = 167$

13.157 2008: $n_1(1) = 81$; $n_1(2) = 44$; 2011: $n_2(1) = 63$; $n_2(2) = 41$

13.158 2012: $n_1(1) = 578$; $n_1(2) = 371$; $n_1(3) = 208$; $n_1(4) = 281$;

2013: $n_2(1) = 495$; $n_2(2) = 480$;

$n_2(3) = 195$; $n_2(4) = 300$

13.159 Men: $n_1(1) = 501$; $n_1(2) = 155$; Women: $n_2(1) = 486$; $n_2(2) = 183$

13.160 Health conscious:

$n_1(1) = 199$; $n_1(2) = 32$;

Not health conscious:

$n_2(1) = 563$; $n_2(2) = 56$

13.161 Segment 1: $n(1) = 68$, $n(2) = 95$; Segment 2: $n(1) = 20$, $n(2) = 34$; Segment 3: $n(1) = 10$, $n(2) = 13$; Segment 4: $n(1) = 29$, $n(2) = 79$

13.162 Source 1: $n_1(1) = 344$, $n_1(2) = 38$; Source 2: $n_2(1) = 275$, $n_2(2) = 41$

14.18 a.

Sample	\bar{x}_i	s_i^2	n_i
1	31.30	28.34	63
2	34.42	23.20	81
3	37.38	31.16	40
4	39.93	72.03	111

b.

Sample	\bar{x}_i	s_i^2	n_i
1	37.22	39.82	63
2	38.91	40.85	81
3	41.48	61.38	40
4	41.75	46.59	111

c.

Sample	\bar{x}_i	s_i^2	n_i
1	11.75	3.93	63
2	12.41	3.39	81
3	11.73	4.26	40
4	11.89	4.30	111

14.19

Sample	\bar{x}_i	s_i^2	n_i
1	153.6	654.3	20
2	151.5	924.0	20
3	133.3	626.8	20

14.20

Sample	\bar{x}_i	s_i^2	n_i
1	18.54	178.0	61
2	19.34	171.4	83
3	20.29	297.5	91

14.21

Sample	\bar{x}_i	s_i^2	n_i
1	26.6	97.3	315
2	31.4	159.6	404
3	24.6	113.9	352

14.22

Reading			
Sample	\bar{x}_i	s_i^2	n_i
1	500.3	611.8	624
2	524.4	686.3	409
3	493.8	608.3	498

14.23

Mathematics			
Sample	\bar{x}_i	s_i^2	n_i
1	486.6	619.5	624
2	527.5	654.0	409
3	492.0	648.3	498

14.24

Science			
Sample	\bar{x}_i	s_i^2	n_i
1	502.0	659.3	624
2	528.9	882.2	409
3	513.9	716.0	498

14.49

Sample	\bar{x}_i	s_i^2	n_i
1	61.60	80.49	10
2	57.30	70.46	10
3	61.80	22.18	10
4	51.80	75.29	10

14.51

Sample	\bar{x}_i	s_i^2	n_i
1	53.17	194.6	30
2	49.37	152.6	30
3	44.33	129.9	30

14.77 $k = 3$, $b = 12$, $SST = 204.2$, $SSB = 1,150.2$, $SSE = 495.1$

14.78 $k = 3$, $b = 20$, $SST = 7,131$, $SSB = 177,465$, $SSE = 1,098$

- 14.79** $k = 3, b = 20$, SST = 10.26,
SSB = 3,020.30, SSE = 226.71
14.80 $k = 4, b = 30$, SST = 4,206,
SSB = 126,843, SSE = 5,764
14.81 $k = 7, b = 200$, SST = 28,674,
SSB = 209,835, SSE = 479,125
14.82 $k = 5, b = 36$, SST = 1,406.4,
SSB = 7,309.7, SSE = 4,593.9
14.83 $k = 4, b = 21$, SST = 563.82,
SSB = 1,327.33, SSE = 748.70

Chapter 15

- 15.7** $n(1) = 28, n(2) = 17, n(3) = 19$,
 $n(4) = 17, n(5) = 19$
15.8 $n(1) = 41, n(2) = 107, n(3) = 66$,
 $n(4) = 19$
15.9 $n(1) = 114, n(2) = 92, n(3) = 84$,
 $n(4) = 101, n(5) = 107, n(6) = 102$
15.10 $n(1) = 11, n(2) = 32, n(3) = 62$,
 $n(4) = 29, n(5) = 16$
15.11 $n(1) = 8, n(2) = 4, n(3) = 3$,
 $n(4) = 8, n(5) = 2$
15.12 $n(1) = 159, n(2) = 28, n(3) = 47$,
 $n(4) = 16$
15.13 $n(1) = 36, n(2) = 58, n(3) = 74$,
 $n(4) = 29$
15.14 $n(1) = 408, n(2) = 571, n(3) = 221$
15.15 $n(1) = 19, n(2) = 23, n(3) = 14$,
 $n(4) = 194$
15.16 $n(1) = 63, n(2) = 125, n(3) = 45$,
 $n(4) = 87$

Newspaper				
Occupation	G&M	Post	Star	Sun
Blue collar	27	18	38	37
White collar	29	43	21	15
Professional	33	51	22	20

Actual		
Predicted	Positive	Negative
Positive	65	64
Negative	39	48

Last				
Second-last	1	2	3	4
1	39	36	51	23
2	36	32	46	20
3	54	46	65	29
4	24	20	28	10

Education	Continuing	Quitter
1	34	23
2	251	212
3	159	248
4	16	57

Heartburn Condition				
Source	1	2	3	4
ABC	60	23	13	25
CBS	65	19	14	28
NBC	73	26	9	24
Newspaper	67	11	10	7
Radio	57	16	9	14
None	47	21	10	10

15.36

Degree				
University	B.A.	B.Eng.	B.B.A.	Other
1	44	11	34	11
2	52	14	27	7
3	31	27	18	24
4	40	12	42	6

15.37

Financial Ties		
Results	Yes	No
Favorable	29	1
Neutral	10	7
Critical	9	14

15.38

Degree				
Approach	1	2	3	4
1	51	8	5	11
2	24	14	12	8
3	26	9	19	8

15.39

Year			
Weapon	2000	2005	2010
1	161	175	131
2	36	37	24
3	53	39	27
4	159	166	126

15.40

Year				
Condition	2004	2006	2008	2010
1	78	74	71	69
2	80	80	80	77
3	436	443	450	458

15.41

Country			
Household Type	United States	Canada	United Kingdom
1	65	94	63
2	85	78	105
3	27	31	21
4	83	80	90
5	40	17	21

15.42

Country				
Household Type	Denmark	Ireland	Netherlands	Sweden
1	180	318	234	158
2	222	170	246	220
3	50	99	55	37
4	393	190	304	409
5	5	73	11	26

15.43

Country				
Obese?	Australia	Canada	New Zealand	United Kingdom
1	152	151	147	151
2	48	49	53	49

15.44

Country				
Smoker?	Denmark	Finland	Norway	Sweden
1	420	398	395	430
2	80	102	105	70

15.45

Country				
Smoker?	Australia	Canada	New Zealand	United Kingdom
1	165	167	164	156
2	35	33	36	44

15.46

Party				
Marriage	Democrat	Republi-can	Independent	
1	48	21	43	
2	24	53	37	
3	23	25	21	

Chapter 16

- 16.6** Lengths: $\bar{x} = 38.00, s_x^2 = 193.90$,
Test: $\bar{y} = 13.80, s_y^2 = 47.96$;
 $n = 60, s_{xy} = 51.86$
- 16.7** Floors: $\bar{x} = 13.68, s_x^2 = 59.32$,
Price: $\bar{y} = 210.42, s_y^2 = 496.41$;
 $n = 50, s_{xy} = 86.93$
- 16.8** Education: $\bar{x} = 13.17, s_x^2 = 11.12$,
Income: $\bar{y} = 78.13, s_y^2 = 437.90$;
 $n = 150, s_{xy} = 46.02$
- 16.9** Age: $\bar{x} = 37.28, s_x^2 = 55.11$,
Employment:
 $\bar{y} = 26.28, s_y^2 = 4.00$;
 $n = 80, s_{xy} = 3.44$
- 16.10** Cigarettes: $\bar{x} = 37.64, s_x^2 = 108.3$,
Days: $\bar{y} = 14.43, s_y^2 = 19.80$;
 $n = 231, s_{xy} = 20.55$
- 16.11** Distance: $\bar{x} = 4.88, s_x^2 = 4.27$,
Percent: $\bar{y} = 49.22, s_y^2 = 243.94$;
 $n = 85, s_{xy} = 22.83$
- 16.12** Size: $\bar{x} = 53.93, s_x^2 = 688.18$,
Price: $\bar{y} = 6,465, s_y^2 = 11,918,489$;
 $n = 40, s_{xy} = 30,945$
- 16.13** Hours: $\bar{x} = 1,199, s_x^2 = 59,153$,
Price: $\bar{y} = 27.73, s_y^2 = 3.62$;
 $n = 60, s_{xy} = -81.78$
- 16.14** Occupants: $\bar{x} = 4.75, s_x^2 = 4.84$,
Electricity: $\bar{y} = 762.6$,
 $s_y^2 = 56,725$; $n = 200, s_{xy} = 310.0$
- 16.15** Income: $\bar{x} = 59.42, s_x^2 = 115.24$,
Food: $\bar{y} = 270.3, s_y^2 = 1,797.25$;
 $n = 150, s_{xy} = 225.66$
- 16.16** Vacancy: $\bar{x} = 11.33, s_x^2 = 35.47$,
Rent: $\bar{y} = 17.20, s_y^2 = 11.24$;
 $n = 30, s_{xy} = -10.78$
- 16.17** Height: $\bar{x} = 68.95, s_x^2 = 9.966$,
Income: $\bar{y} = 59.59, s_y^2 = 71.95$;
 $n = 250, s_{xy} = 6.020$
- 16.18** Test: $\bar{x} = 79.47, s_x^2 = 16.07$,
Nondefective: $\bar{y} = 93.89$,
 $s_y^2 = 1.28$; $n = 45, s_{xy} = .83$
- 16.19** Ads: $\bar{x} = 4.12, s_x^2 = 3.47$,
Customers: $\bar{y} = 384.81$,
 $s_y^2 = 18,552$; $n = 26, s_{xy} = 74.02$
- 16.120** Age: $\bar{x} = 113.35, s_x^2 = 378.77$,
Repairs: $\bar{y} = 395.21$,
 $s_y^2 = 4,094.79$; $n = 20$,
 $s_{xy} = 936.82$
- 16.121** Fertilizer: $\bar{x} = 300, s_x^2 = 20,690$,
Yield: $\bar{y} = 318.60, s_y^2 = 5,230$;
 $n = 30, s_{xy} = 2,538$
- 16.123** Television: $\bar{x} = 30.43$,
 $s_x^2 = 99.11$, Debt: $\bar{y} = 126,604$,
 $s_y^2 = 2,152,602,614$; $n = 430$,
 $s_{xy} = 255,877$

A-4 APPENDIX A

- 16.124** Test: $\bar{x} = 71.92$, $s_x^2 = 90.97$,
Nondefective: $\bar{y} = 94.44$,
 $s_y^2 = 11.84$; $n = 50$, $s_{xy} = 13.08$

Chapter 17

- 17.1** $R^2 = .2425$, $R^2(\text{adjusted}) = .2019$,
 $s_e = 40.24$, $F = 5.97$, $p\text{-value} = .0013$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	51.39	23.52	2.19	.0331
Lot size	.700	.559	1.25	.2156
Trees	.679	.229	2.96	.0045
Distance	-.378	.195	-1.94	.0577

- 17.2** $R^2 = .7629$, $R^2(\text{adjusted}) = .7453$,
 $s_e = 3.75$, $F = 43.43$, $p\text{-value} = 0$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	13.01	3.53	3.69	.0010
Assignment	.194	.200	.97	.3417
Midterm	1.11	.122	9.12	0

- 17.3** $R^2 = .8935$, $R^2(\text{adjusted}) = .8711$,
 $s_e = 40.13$, $F = 39.86$, $p\text{-value} = 0$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	-111.83	134.34	-.83	.4155
Permits	4.76	.395	12.06	0
Mortgage	16.99	15.16	1.12	.2764
Apartment	-10.53	6.39	-1.65	.1161
vacancy				
Office	1.31	2.79	.47	.6446
vacancy				

- 17.4** $R^2 = .3511$, $R^2(\text{adjusted}) = .3352$,
 $s_e = 6.99$, $F = 22.01$, $p\text{-value} = 0$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	-1.97	9.55	-.21	.8369
Minor HR	.666	.087	7.64	0
Age	.136	.524	.26	.7961
Years pro	1.18	.671	1.75	.0819

Chapter 18

- 18.3** $R^2 = .4068$, $R^2(\text{adjusted}) = .3528$,
 $s_e = 41.15$, $F = 7.54$, $p\text{-value} = .0032$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	-108.99	97.24	-1.12	.2744
Space	33.09	8.59	3.85	.0009
Space ²	-.666	.177	-3.75	.0011

18.4 First-order model

- $R^2 = .8553$, $R^2(\text{adjusted}) = .8473$,
 $s_e = 13.29$, $F = 106.44$, $p\text{-value} = 0$

	Coeffi-cients	Standard Error	t-Statistic	p-Value
Intercept	453.6	15.18	29.87	0
Price	-68.91	6.68	-10.32	0

Second-order model

- $R^2 = .9726$, $R^2(\text{adjusted}) = .9693$,
 $s_e = 5.96$, $F = 301.15$, $p\text{-value} = 0$

	Coeffi-cients	Standard Error	t-Statistic	p-Value
Intercept	766.9	37.40	20.50	0
Price	-359.1	34.19	-10.50	0
Price ²	64.55	7.58	8.52	0

18.5 First-order model

- $R^2 = .8504$, $R^2(\text{adjusted}) = .8317$,
 $s_e = 1.79$, $F = 45.48$, $p\text{-value} = .0001$

	Coeffi-cients	Standard Error	t-Statistic	p-Value
Intercept	41.4	1.22	33.90	0
Day	-1.33	.197	-6.74	.0001

Second-order model

- $R^2 = .8852$, $R^2(\text{adjusted}) = .8524$,
 $s_e = 1.67$, $F = 26.98$, $p\text{-value} = .0005$

	Coeffi-cients	Standard Error	t-Statistic	p-Value
Intercept	43.73	1.97	22.21	0
Day	-2.49	.822	-3.03	.0191
Day ²	.106	.073	1.46	.1889

- 18.16** $R^2 = .8051$, $R^2(\text{adjusted}) = .7947$,
 $s_e = 2.32$, $F = 77.66$, $p\text{-value} = 0$

	Coef-ficients	Standard Error	t-Statistic	p-Value
Intercept	23.57	5.98	3.94	.0002
Mother	.306	.054	5.65	0
Father	.303	.048	6.37	0
Gmothers	.032	.058	.55	.5853
Gfathers	.078	.057	1.36	.1777
Smoker	-3.72	.669	-5.56	0

- 18.17** $R^2 = .7002$, $R^2(\text{adjusted}) = .6659$,
 $s_e = 810.8$, $F = 20.43$, $p\text{-value} = 0$

	Coeffi-cients	Standard Error	t-Statistic	p-Value
Intercept	3490	469.2	7.44	0
Yest Att	.369	.078	4.73	0
I1	1623	492.6	3.30	.0023
I2	733.5	394.4	1.86	.0713
I3	-766.5	484.7	-1.58	.1232

Chapter 19

- 19.8** $T_1 = 6,807$, $n_1 = 82$, $T_2 = 5,596$,
 $n_2 = 75$

- 19.9** $T_1 = 797$, $n_1 = 30$, $T_2 = 1,033$,
 $n_2 = 30$

- 19.10** $T_1 = 14,873.5$, $n_1 = 125$,

- $T_2 = 16,501.5$, $n_2 = 125$

- 19.11** $T_1 = 10,691$, $n_1 = 100$,

- $T_2 = 9,409$, $n_2 = 100$

- 19.12** $T_1 = 2,810$, $n_1 = 50$, $T_2 = 2,240$,

- $n_2 = 50$

- 19.13** $T_1 = 383.5$, $n_1 = 15$, $T_2 = 436.5$,

- $n_2 = 25$

- 19.14** $T_1 = 439.5$, $n_1 = 20$, $T_2 = 380.5$,

- $n_2 = 20$

- 19.15** $T_1 = 13,078$, $n_1 = 125$, $T_2 = 18,297$,

- $n_2 = 125$

- 19.16** $T_1 = 32,225.5$, $n_1 = 182$,

- $T_2 = 27,459.5$, $n_2 = 163$

- 19.48** $T^+ = 378.5$, $T^- = 2,249.5$, $n = 72$

- 19.49** $T^+ = 62$, $T^- = 758$, $n = 40$

- 19.50** $n(\text{positive}) = 60$,

- $n(\text{negative}) = 38$

- 19.51** $T^+ = 40.5$, $T^- = 235.5$, $n = 23$

- 19.52** $T^+ = 111$, $T^- = 240$, $n = 26$

- 19.53** $n(\text{positive}) = 30$, $n(\text{negative}) = 8$

- 19.54** $n(\text{positive}) = 5$, $n(\text{negative}) = 15$

- 19.55** $T^+ = 190$, $T^- = 135$, $n = 25$

- 19.56** $n(\text{positive}) = 32$,

- $n(\text{negative}) = 21$

- 19.57** $T^+ = 48$, $T^- = 732$, $n = 39$

- 19.70** $T_1 = 767.5$, $n_1 = 25$, $T_2 = 917$,

- $n_2 = 25$, $T_3 = 1,165.5$, $n_3 = 25$

- 19.71** $T_1 = 17,116.5$, $n_1 = 80$,

- $T_2 = 16,816.5$, $n_2 = 90$, $T_3 = 17,277$,

- $n_3 = 77$, $T_4 = 29,391$, $n_4 = 154$

- 19.73** $T_1 = 46$, $T_2 = 72$, $T_3 = 62$

- 19.74** $T_1 = 28.5$, $T_2 = 22.5$, $T_3 = 21$

- 19.76** $T_1 = 2,195$, $n_1 = 33$, $T_2 = 1,650.5$,

- $n_2 = 34$, $T_3 = 2,830$, $n_3 = 34$,

- $T_4 = 2,102.5$, $n_4 = 31$

- 19.77** $T_1 = 59.5$, $T_2 = 63.5$,

- $T_3 = 64$, $T_4 = 63$

- 19.78** $T_1 = 33$, $T_2 = 39.5$, $T_3 = 47.5$

- 19.79** $T_1 = 13,805.5$, $n_1 = 100$,

- $T_2 = 14,909.5$, $n_2 = 100$,

- $T_3 = 16,390$, $n_3 = 100$

- 19.80** $T_1 = 4,180$, $n_1 = 50$, $T_2 = 5,262$,

- $n_2 = 50$, $T_3 = 5,653$, $n_3 = 50$,

- $T_4 = 5,005$, $n_4 = 50$

- 19.81** $T_1 = 1,565$, $n_1 = 30$, $T_2 = 1,358.5$,

- $n_2 = 30$, $T_3 = 1,171.5$, $n_3 = 30$

- 19.82** $T_1 = 21,246$, $n_1 = 100$, $T_2 = 19,784$,

- $n_2 = 100$, $T_3 = 20,976$, $n_3 = 100$,

- $T_4 = 18,194$, $n_4 = 100$

- 19.83** $T_1 = 28,304$, $n_1 = 123$, $T_2 = 21,285$,

- $n_2 = 109$, $T_3 = 21,796$, $n_3 = 102$,

- $T_4 = 20,421$, $n_4 = 94$

- 19.84** $T_1 = 638.5$, $n_1 = 18$,

- $T_2 = 1,233.5$, $n_2 = 14$,

- $T_3 = 1,814.5$, $n_3 = 26$,

- $T_4 = 3,159.5$, $n_4 = 42$,

- $T_5 = 2,065$, $n_5 = 33$

APPENDIX B

TABLES

TABLE 1 Binomial Probabilities

Tabulated values are $P(X \leq k) = \sum_{x=0}^k p(x_i)$. (Values are rounded to four decimal places.)

***n* = 5**

<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9510	0.7738	0.5905	0.3277	0.2373	0.1681	0.0778	0.0313	0.0102	0.0024	0.0010	0.0003	0.0000	0.0000	0.0000
1	0.9990	0.9774	0.9185	0.7373	0.6328	0.5282	0.3370	0.1875	0.0870	0.0308	0.0156	0.0067	0.0005	0.0000	0.0000
2	1.0000	0.9988	0.9914	0.9421	0.8965	0.8369	0.6826	0.5000	0.3174	0.1631	0.1035	0.0579	0.0086	0.0012	0.0000
3	1.0000	1.0000	0.9995	0.9933	0.9844	0.9692	0.9130	0.8125	0.6630	0.4718	0.3672	0.2627	0.0815	0.0226	0.0010
4	1.0000	1.0000	1.0000	0.9997	0.9990	0.9976	0.9898	0.9688	0.9222	0.8319	0.7627	0.6723	0.4095	0.2262	0.0490

***n* = 6**

<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9415	0.7351	0.5314	0.2621	0.1780	0.1176	0.0467	0.0156	0.0041	0.0007	0.0002	0.0001	0.0000	0.0000	0.0000
1	0.9985	0.9672	0.8857	0.6554	0.5339	0.4202	0.2333	0.1094	0.0410	0.0109	0.0046	0.0016	0.0001	0.0000	0.0000
2	1.0000	0.9978	0.9842	0.9011	0.8306	0.7443	0.5443	0.3438	0.1792	0.0705	0.0376	0.0170	0.0013	0.0001	0.0000
3	1.0000	0.9999	0.9987	0.9830	0.9624	0.9295	0.8208	0.6563	0.4557	0.2557	0.1694	0.0989	0.0159	0.0022	0.0000
4	1.0000	1.0000	0.9999	0.9984	0.9954	0.9891	0.9590	0.8906	0.7667	0.5798	0.4661	0.3446	0.1143	0.0328	0.0015
5	1.0000	1.0000	1.0000	0.9999	0.9998	0.9993	0.9959	0.9844	0.9533	0.8824	0.8220	0.7379	0.4686	0.2649	0.0585

***n* = 7**

<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9321	0.6983	0.4783	0.2097	0.1335	0.0824	0.0280	0.0078	0.0016	0.0002	0.0001	0.0000	0.0000	0.0000	0.0000
1	0.9980	0.9556	0.8503	0.5767	0.4449	0.3294	0.1586	0.0625	0.0188	0.0038	0.0013	0.0004	0.0000	0.0000	0.0000
2	1.0000	0.9962	0.9743	0.8520	0.7564	0.6471	0.4199	0.2266	0.0963	0.0288	0.0129	0.0047	0.0002	0.0000	0.0000
3	1.0000	0.9998	0.9973	0.9667	0.9294	0.8740	0.7102	0.5000	0.2898	0.1260	0.0706	0.0333	0.0027	0.0002	0.0000
4	1.0000	1.0000	0.9998	0.9953	0.9871	0.9712	0.9037	0.7734	0.5801	0.3529	0.2436	0.1480	0.0257	0.0038	0.0000
5	1.0000	1.0000	1.0000	0.9996	0.9987	0.9962	0.9812	0.9375	0.8414	0.6706	0.5551	0.4233	0.1497	0.0444	0.0020
6	1.0000	1.0000	1.0000	1.0000	0.9999	0.9998	0.9984	0.9922	0.9720	0.9176	0.8665	0.7903	0.5217	0.3017	0.0679

(Continued)

TABLE 1 (*Continued*)

<i>n = 8</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9227	0.6634	0.4305	0.1678	0.1001	0.0576	0.0168	0.0039	0.0007	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9973	0.9428	0.8131	0.5033	0.3671	0.2553	0.1064	0.0352	0.0085	0.0013	0.0004	0.0001	0.0000	0.0000	0.0000
2	0.9999	0.9942	0.9619	0.7969	0.6785	0.5518	0.3154	0.1445	0.0498	0.0113	0.0042	0.0012	0.0000	0.0000	0.0000
3	1.0000	0.9996	0.9950	0.9437	0.8862	0.8059	0.5941	0.3633	0.1737	0.0580	0.0273	0.0104	0.0004	0.0000	0.0000
4	1.0000	1.0000	0.9996	0.9896	0.9727	0.9420	0.8263	0.6367	0.4059	0.1941	0.1138	0.0563	0.0050	0.0004	0.0000
5	1.0000	1.0000	1.0000	0.9988	0.9958	0.9887	0.9502	0.8555	0.6846	0.4482	0.3215	0.2031	0.0381	0.0058	0.0001
6	1.0000	1.0000	1.0000	0.9999	0.9996	0.9987	0.9915	0.9648	0.8936	0.7447	0.6329	0.4967	0.1869	0.0572	0.0027
7	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9993	0.9961	0.9832	0.9424	0.8999	0.8322	0.5695	0.3366	0.0773
<i>n = 9</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9135	0.6302	0.3874	0.1342	0.0751	0.0404	0.0101	0.0020	0.0003	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9966	0.9288	0.7748	0.4362	0.3003	0.1960	0.0705	0.0195	0.0038	0.0004	0.0001	0.0000	0.0000	0.0000	0.0000
2	0.9999	0.9916	0.9470	0.7382	0.6007	0.4628	0.2318	0.0898	0.0250	0.0043	0.0013	0.0003	0.0000	0.0000	0.0000
3	1.0000	0.9994	0.9917	0.9144	0.8343	0.7297	0.4826	0.2539	0.0994	0.0253	0.0100	0.0031	0.0001	0.0000	0.0000
4	1.0000	1.0000	0.9991	0.9804	0.9511	0.9012	0.7334	0.5000	0.2666	0.0988	0.0489	0.0196	0.0009	0.0000	0.0000
5	1.0000	1.0000	0.9999	0.9969	0.9900	0.9747	0.9006	0.7461	0.5174	0.2703	0.1657	0.0856	0.0083	0.0006	0.0000
6	1.0000	1.0000	1.0000	0.9997	0.9987	0.9957	0.9750	0.9102	0.7682	0.5372	0.3993	0.2618	0.0530	0.0084	0.0001
7	1.0000	1.0000	1.0000	1.0000	0.9999	0.9996	0.9962	0.9805	0.9295	0.8040	0.6997	0.5638	0.2252	0.0712	0.0034
8	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9997	0.9980	0.9899	0.9596	0.9249	0.8658	0.6126	0.3698	0.0865

TABLE 1 (Continued)

<i>n = 10</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.9044	0.5987	0.3487	0.1074	0.0563	0.0282	0.0060	0.0010	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9957	0.9139	0.7361	0.3758	0.2440	0.1493	0.0464	0.0107	0.0017	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000
2	0.9999	0.9885	0.9298	0.6778	0.5256	0.3828	0.1673	0.0547	0.0123	0.0016	0.0004	0.0001	0.0000	0.0000	0.0000
3	1.0000	0.9990	0.9872	0.8791	0.7759	0.6496	0.3823	0.1719	0.0548	0.0106	0.0035	0.0009	0.0000	0.0000	0.0000
4	1.0000	0.9999	0.9984	0.9672	0.9219	0.8497	0.6331	0.3770	0.1662	0.0473	0.0197	0.0064	0.0001	0.0000	0.0000
5	1.0000	1.0000	0.9999	0.9936	0.9803	0.9527	0.8338	0.6230	0.3669	0.1503	0.0781	0.0328	0.0016	0.0001	0.0000
6	1.0000	1.0000	1.0000	0.9991	0.9965	0.9894	0.9452	0.8281	0.6177	0.3504	0.2241	0.1209	0.0128	0.0010	0.0000
7	1.0000	1.0000	1.0000	0.9999	0.9996	0.9984	0.9877	0.9453	0.8327	0.6172	0.4744	0.3222	0.0702	0.0115	0.0001
8	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9983	0.9893	0.9536	0.8507	0.7560	0.6242	0.2639	0.0861	0.0043
9	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9990	0.9940	0.9718	0.9437	0.8926	0.6513	0.4013	0.0956
<i>n = 15</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.8601	0.4633	0.2059	0.0352	0.0134	0.0047	0.0005	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9904	0.8290	0.5490	0.1671	0.0802	0.0353	0.0052	0.0005	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
2	0.9996	0.9638	0.8159	0.3980	0.2361	0.1268	0.0271	0.0037	0.0003	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
3	1.0000	0.9945	0.9444	0.6482	0.4613	0.2969	0.0905	0.0176	0.0019	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000
4	1.0000	0.9994	0.9873	0.8358	0.6865	0.5155	0.2173	0.0592	0.0093	0.0007	0.0001	0.0000	0.0000	0.0000	0.0000
5	1.0000	0.9999	0.9978	0.9389	0.8516	0.7216	0.4032	0.1509	0.0338	0.0037	0.0008	0.0001	0.0000	0.0000	0.0000
6	1.0000	1.0000	0.9997	0.9819	0.9434	0.8689	0.6098	0.3036	0.0950	0.0152	0.0042	0.0008	0.0000	0.0000	0.0000
7	1.0000	1.0000	1.0000	0.9958	0.9827	0.9500	0.7869	0.5000	0.2131	0.0500	0.0173	0.0042	0.0000	0.0000	0.0000
8	1.0000	1.0000	1.0000	0.9992	0.9958	0.9848	0.9050	0.6964	0.3902	0.1311	0.0566	0.0181	0.0003	0.0000	0.0000
9	1.0000	1.0000	1.0000	0.9999	0.9992	0.9963	0.9662	0.8491	0.5968	0.2784	0.1484	0.0611	0.0022	0.0001	0.0000
10	1.0000	1.0000	1.0000	1.0000	0.9999	0.9993	0.9907	0.9408	0.7827	0.4845	0.3135	0.1642	0.0127	0.0006	0.0000
11	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9981	0.9824	0.9095	0.7031	0.5387	0.3518	0.0556	0.0055	0.0000
12	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9997	0.9963	0.9729	0.8732	0.7639	0.6020	0.1841	0.0362	0.0004
13	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9995	0.9948	0.9647	0.9198	0.8329	0.4510	0.1710	0.0096
14	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9995	0.9953	0.9866	0.9648	0.7941	0.5367	0.1399

(Continued)

TABLE 1 (*Continued*)

<i>n = 20</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.8179	0.3585	0.1216	0.0115	0.0032	0.0008	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9831	0.7358	0.3917	0.0692	0.0243	0.0076	0.0005	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
2	0.9990	0.9245	0.6769	0.2061	0.0913	0.0355	0.0036	0.0002	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
3	1.0000	0.9841	0.8670	0.4114	0.2252	0.1071	0.0160	0.0013	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
4	1.0000	0.9974	0.9568	0.6296	0.4148	0.2375	0.0510	0.0059	0.0003	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
5	1.0000	0.9997	0.9887	0.8042	0.6172	0.4164	0.1256	0.0207	0.0016	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
6	1.0000	1.0000	0.9976	0.9133	0.7858	0.6080	0.2500	0.0577	0.0065	0.0003	0.0000	0.0000	0.0000	0.0000	0.0000
7	1.0000	1.0000	0.9996	0.9679	0.8982	0.7723	0.4159	0.1316	0.0210	0.0013	0.0002	0.0000	0.0000	0.0000	0.0000
8	1.0000	1.0000	0.9999	0.9900	0.9591	0.8867	0.5956	0.2517	0.0565	0.0051	0.0009	0.0001	0.0000	0.0000	0.0000
9	1.0000	1.0000	1.0000	0.9974	0.9861	0.9520	0.7553	0.4119	0.1275	0.0171	0.0039	0.0006	0.0000	0.0000	0.0000
10	1.0000	1.0000	1.0000	0.9994	0.9961	0.9829	0.8725	0.5881	0.2447	0.0480	0.0139	0.0026	0.0000	0.0000	0.0000
11	1.0000	1.0000	1.0000	0.9999	0.9991	0.9949	0.9435	0.7483	0.4044	0.1133	0.0409	0.0100	0.0001	0.0000	0.0000
12	1.0000	1.0000	1.0000	1.0000	0.9998	0.9987	0.9790	0.8684	0.5841	0.2277	0.1018	0.0321	0.0004	0.0000	0.0000
13	1.0000	1.0000	1.0000	1.0000	1.0000	0.9997	0.9935	0.9423	0.7500	0.3920	0.2142	0.0867	0.0024	0.0000	0.0000
14	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9984	0.9793	0.8744	0.5836	0.3828	0.1958	0.0113	0.0003	0.0000
15	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9997	0.9941	0.9490	0.7625	0.5852	0.3704	0.0432	0.0026	0.0000
16	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9987	0.9840	0.8929	0.7748	0.5886	0.1330	0.0159	0.0000
17	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9998	0.9964	0.9645	0.9087	0.7939	0.3231	0.0755	0.0010
18	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9995	0.9924	0.9757	0.9308	0.6083	0.2642	0.0169
19	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9992	0.9968	0.9885	0.8784	0.6415	0.1821

TABLE 1 (*Continued*)

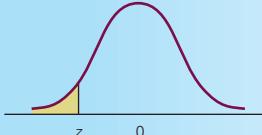
<i>n = 25</i>															
<i>k</i>	<i>p</i>														
	0.01	0.05	0.10	0.20	0.25	0.30	0.40	0.50	0.60	0.70	0.75	0.80	0.90	0.95	0.99
0	0.7778	0.2774	0.0718	0.0038	0.0008	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.9742	0.6424	0.2712	0.0274	0.0070	0.0016	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
2	0.9980	0.8729	0.5371	0.0982	0.0321	0.0090	0.0004	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
3	0.9999	0.9659	0.7636	0.2340	0.0962	0.0332	0.0024	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
4	1.0000	0.9928	0.9020	0.4207	0.2137	0.0905	0.0095	0.0005	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
5	1.0000	0.9988	0.9666	0.6167	0.3783	0.1935	0.0294	0.0020	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
6	1.0000	0.9998	0.9905	0.7800	0.5611	0.3407	0.0736	0.0073	0.0003	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
7	1.0000	1.0000	0.9977	0.8909	0.7265	0.5118	0.1536	0.0216	0.0012	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
8	1.0000	1.0000	0.9995	0.9532	0.8506	0.6769	0.2735	0.0539	0.0043	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000
9	1.0000	1.0000	0.9999	0.9827	0.9287	0.8106	0.4246	0.1148	0.0132	0.0005	0.0000	0.0000	0.0000	0.0000	0.0000
10	1.0000	1.0000	1.0000	0.9944	0.9703	0.9022	0.5858	0.2122	0.0344	0.0018	0.0002	0.0000	0.0000	0.0000	0.0000
11	1.0000	1.0000	1.0000	0.9985	0.9893	0.9558	0.7323	0.3450	0.0778	0.0060	0.0009	0.0001	0.0000	0.0000	0.0000
12	1.0000	1.0000	1.0000	0.9996	0.9966	0.9825	0.8462	0.5000	0.1538	0.0175	0.0034	0.0004	0.0000	0.0000	0.0000
13	1.0000	1.0000	1.0000	0.9999	0.9991	0.9940	0.9222	0.6550	0.2677	0.0442	0.0107	0.0015	0.0000	0.0000	0.0000
14	1.0000	1.0000	1.0000	1.0000	0.9998	0.9982	0.9656	0.7878	0.4142	0.0978	0.0297	0.0056	0.0000	0.0000	0.0000
15	1.0000	1.0000	1.0000	1.0000	1.0000	0.9995	0.9868	0.8852	0.5754	0.1894	0.0713	0.0173	0.0001	0.0000	0.0000
16	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9957	0.9461	0.7265	0.3231	0.1494	0.0468	0.0005	0.0000	0.0000
17	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9988	0.9784	0.8464	0.4882	0.2735	0.1091	0.0023	0.0000	0.0000
18	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9997	0.9927	0.9264	0.6593	0.4389	0.2200	0.0095	0.0002	0.0000
19	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9980	0.9706	0.8065	0.6217	0.3833	0.0334	0.0012	0.0000
20	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9995	0.9905	0.9095	0.7863	0.5793	0.0980	0.0072	0.0000
21	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9976	0.9668	0.9038	0.7660	0.2364	0.0341	0.0001
22	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9996	0.9910	0.9679	0.9018	0.4629	0.1271	0.0020
23	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9984	0.9930	0.9726	0.7288	0.3576	0.0258
24	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	1.0000	0.9999	0.9992	0.9962	0.9282	0.7226	0.2222

TABLE 2 Poisson Probabilities

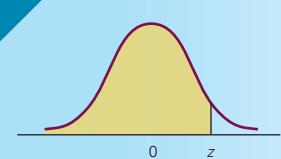
k	μ																
	0.10	0.20	0.30	0.40	0.50	1.0	1.5	2.0	2.5	3.0	3.5	4.0	4.5	5.0	5.5	6.0	
0	0.9048	0.8187	0.7408	0.6703	0.6065	0.3679	0.2231	0.1353	0.0821	0.0498	0.0302	0.0183	0.0111	0.0067	0.0041	0.0025	
1	0.9953	0.9825	0.9631	0.9384	0.9098	0.7358	0.5578	0.4060	0.2873	0.1991	0.1359	0.0916	0.0611	0.0404	0.0266	0.0174	
2	0.9998	0.9989	0.9964	0.9921	0.9856	0.9197	0.8088	0.6767	0.5438	0.4232	0.3208	0.2381	0.1736	0.1247	0.0884	0.0620	
3	1.0000	0.9999	0.9997	0.9992	0.9982	0.9810	0.9344	0.8571	0.7576	0.6472	0.5366	0.4335	0.3423	0.2650	0.2017	0.1512	
4	1.0000	1.0000	0.9999	0.9998	0.9963	0.9814	0.9473	0.8912	0.8153	0.7254	0.6288	0.5321	0.4405	0.3575	0.2851		
5		1.0000	1.0000	0.9994	0.9955	0.9834	0.9580	0.9161	0.8576	0.7851	0.7029	0.6160	0.5289	0.4457			
6			0.9999	0.9991	0.9955	0.9858	0.9665	0.9347	0.8893	0.8311	0.7622	0.6860	0.6063				
7				1.0000	0.9998	0.9989	0.9958	0.9881	0.9733	0.9489	0.9134	0.8666	0.8095	0.7440			
8					1.0000	0.9998	0.9989	0.9962	0.9901	0.9786	0.9597	0.9319	0.8944	0.8472			
9						1.0000	0.9997	0.9989	0.9967	0.9919	0.9829	0.9682	0.9462	0.9161			
10							0.9999	0.9997	0.9990	0.9972	0.9933	0.9863	0.9747	0.9574			
11								1.0000	0.9999	0.9997	0.9991	0.9976	0.9945	0.9890	0.9799		
12									1.0000	0.9999	0.9997	0.9992	0.9980	0.9955	0.9912		
13										1.0000	0.9999	0.9997	0.9993	0.9983	0.9964		
14											1.0000	0.9999	0.9998	0.9994	0.9986		
15												1.0000	0.9999	0.9998	0.9995		
16													1.0000	0.9999	0.9998		
17														1.0000	0.9999		
18															1.0000		
19																	
20																	

TABLE 2 (Continued)

k	μ												
	6.50	7.00	7.50	8.00	8.50	9.00	9.50	10	11	12	13	14	15
0	0.0015	0.0009	0.0006	0.0003	0.0002	0.0001	0.0001	0.0000	0.0000	0.0000	0.0000	0.0000	0.0000
1	0.0113	0.0073	0.0047	0.0030	0.0019	0.0012	0.0008	0.0005	0.0002	0.0001	0.0000	0.0000	0.0000
2	0.0430	0.0296	0.0203	0.0138	0.0093	0.0062	0.0042	0.0028	0.0012	0.0005	0.0002	0.0001	0.0000
3	0.1118	0.0818	0.0591	0.0424	0.0301	0.0212	0.0149	0.0103	0.0049	0.0023	0.0011	0.0005	0.0002
4	0.2237	0.1730	0.1321	0.0996	0.0744	0.0550	0.0403	0.0293	0.0151	0.0076	0.0037	0.0018	0.0009
5	0.3690	0.3007	0.2414	0.1912	0.1496	0.1157	0.0885	0.0671	0.0375	0.0203	0.0107	0.0055	0.0028
6	0.5265	0.4497	0.3782	0.3134	0.2562	0.2068	0.1649	0.1301	0.0786	0.0458	0.0259	0.0142	0.0076
7	0.6728	0.5987	0.5246	0.4530	0.3856	0.3239	0.2687	0.2202	0.1432	0.0895	0.0540	0.0316	0.0180
8	0.7916	0.7291	0.6620	0.5925	0.5231	0.4557	0.3918	0.3328	0.2320	0.1550	0.0998	0.0621	0.0374
9	0.8774	0.8305	0.7764	0.7166	0.6530	0.5874	0.5218	0.4579	0.3405	0.2424	0.1658	0.1094	0.0699
10	0.9332	0.9015	0.8622	0.8159	0.7634	0.7060	0.6453	0.5830	0.4599	0.3472	0.2517	0.1757	0.1185
11	0.9661	0.9467	0.9208	0.8881	0.8487	0.8030	0.7520	0.6968	0.5793	0.4616	0.3532	0.2600	0.1848
12	0.9840	0.9730	0.9573	0.9362	0.9091	0.8758	0.8364	0.7916	0.6887	0.5760	0.4631	0.3585	0.2676
13	0.9929	0.9872	0.9784	0.9658	0.9486	0.9261	0.8981	0.8645	0.7813	0.6815	0.5730	0.4644	0.3632
14	0.9970	0.9943	0.9897	0.9827	0.9726	0.9585	0.9400	0.9165	0.8540	0.7720	0.6751	0.5704	0.4657
15	0.9988	0.9976	0.9954	0.9918	0.9862	0.9780	0.9665	0.9513	0.9074	0.8444	0.7636	0.6694	0.5681
16	0.9996	0.9990	0.9980	0.9963	0.9934	0.9889	0.9823	0.9730	0.9441	0.8987	0.8355	0.7559	0.6641
17	0.9998	0.9996	0.9992	0.9984	0.9970	0.9947	0.9911	0.9857	0.9678	0.9370	0.8905	0.8272	0.7489
18	0.9999	0.9999	0.9997	0.9993	0.9987	0.9976	0.9957	0.9928	0.9823	0.9626	0.9302	0.8826	0.8195
19	1.0000	1.0000	0.9999	0.9997	0.9995	0.9989	0.9980	0.9965	0.9907	0.9787	0.9573	0.9235	0.8752
20			1.0000	0.9999	0.9998	0.9996	0.9991	0.9984	0.9953	0.9884	0.9750	0.9521	0.9170
21				1.0000	0.9999	0.9998	0.9996	0.9993	0.9977	0.9939	0.9859	0.9712	0.9469
22					1.0000	0.9999	0.9999	0.9997	0.9990	0.9970	0.9924	0.9833	0.9673
23						1.0000	0.9999	0.9999	0.9995	0.9985	0.9960	0.9907	0.9805
24							1.0000	1.0000	0.9998	0.9993	0.9980	0.9950	0.9888
25								0.9999	0.9997	0.9990	0.9974	0.9938	
26									1.0000	0.9999	0.9995	0.9987	0.9967
27										0.9999	0.9998	0.9994	0.9983
28										1.0000	0.9999	0.9997	0.9991
29											1.0000	0.9999	0.9996
30												0.9999	0.9998
31												1.0000	0.9999
32													1.0000

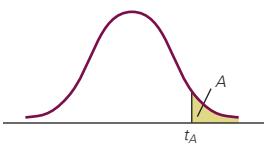
TABLE 3 Cumulative Standardized Normal Probabilities


Z	0.00	0.01	0.02	0.03	0.04	0.05	0.06	0.07	0.08	0.09
-3.0	0.0013	0.0013	0.0013	0.0012	0.0012	0.0011	0.0011	0.0011	0.0010	0.0010
-2.9	0.0019	0.0018	0.0018	0.0017	0.0016	0.0016	0.0015	0.0015	0.0014	0.0014
-2.8	0.0026	0.0025	0.0024	0.0023	0.0023	0.0022	0.0021	0.0021	0.0020	0.0019
-2.7	0.0035	0.0034	0.0033	0.0032	0.0031	0.0030	0.0029	0.0028	0.0027	0.0026
-2.6	0.0047	0.0045	0.0044	0.0043	0.0041	0.0040	0.0039	0.0038	0.0037	0.0036
-2.5	0.0062	0.0060	0.0059	0.0057	0.0055	0.0054	0.0052	0.0051	0.0049	0.0048
-2.4	0.0082	0.0080	0.0078	0.0075	0.0073	0.0071	0.0069	0.0068	0.0066	0.0064
-2.3	0.0107	0.0104	0.0102	0.0099	0.0096	0.0094	0.0091	0.0089	0.0087	0.0084
-2.2	0.0139	0.0136	0.0132	0.0129	0.0125	0.0122	0.0119	0.0116	0.0113	0.0110
-2.1	0.0179	0.0174	0.0170	0.0166	0.0162	0.0158	0.0154	0.0150	0.0146	0.0143
-2.0	0.0228	0.0222	0.0217	0.0212	0.0207	0.0202	0.0197	0.0192	0.0188	0.0183
-1.9	0.0287	0.0281	0.0274	0.0268	0.0262	0.0256	0.0250	0.0244	0.0239	0.0233
-1.8	0.0359	0.0351	0.0344	0.0336	0.0329	0.0322	0.0314	0.0307	0.0301	0.0294
-1.7	0.0446	0.0436	0.0427	0.0418	0.0409	0.0401	0.0392	0.0384	0.0375	0.0367
-1.6	0.0548	0.0537	0.0526	0.0516	0.0505	0.0495	0.0485	0.0475	0.0465	0.0455
-1.5	0.0668	0.0655	0.0643	0.0630	0.0618	0.0606	0.0594	0.0582	0.0571	0.0559
-1.4	0.0808	0.0793	0.0778	0.0764	0.0749	0.0735	0.0721	0.0708	0.0694	0.0681
-1.3	0.0968	0.0951	0.0934	0.0918	0.0901	0.0885	0.0869	0.0853	0.0838	0.0823
-1.2	0.1151	0.1131	0.1112	0.1093	0.1075	0.1056	0.1038	0.1020	0.1003	0.0985
-1.1	0.1357	0.1335	0.1314	0.1292	0.1271	0.1251	0.1230	0.1210	0.1190	0.1170
-1.0	0.1587	0.1562	0.1539	0.1515	0.1492	0.1469	0.1446	0.1423	0.1401	0.1379
-0.9	0.1841	0.1814	0.1788	0.1762	0.1736	0.1711	0.1685	0.1660	0.1635	0.1611
-0.8	0.2119	0.2090	0.2061	0.2033	0.2005	0.1977	0.1949	0.1922	0.1894	0.1867
-0.7	0.2420	0.2389	0.2358	0.2327	0.2296	0.2266	0.2236	0.2206	0.2177	0.2148
-0.6	0.2743	0.2709	0.2676	0.2643	0.2611	0.2578	0.2546	0.2514	0.2483	0.2451
-0.5	0.3085	0.3050	0.3015	0.2981	0.2946	0.2912	0.2877	0.2843	0.2810	0.2776
-0.4	0.3446	0.3409	0.3372	0.3336	0.3300	0.3264	0.3228	0.3192	0.3156	0.3121
-0.3	0.3821	0.3783	0.3745	0.3707	0.3669	0.3632	0.3594	0.3557	0.3520	0.3483
-0.2	0.4207	0.4168	0.4129	0.4090	0.4052	0.4013	0.3974	0.3936	0.3897	0.3859
-0.1	0.4602	0.4562	0.4522	0.4483	0.4443	0.4404	0.4364	0.4325	0.4286	0.4247
-0.0	0.5000	0.4960	0.4920	0.4880	0.4840	0.4801	0.4761	0.4721	0.4681	0.4641

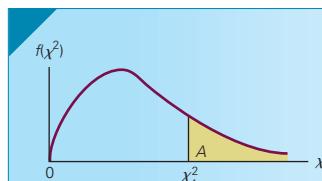
TABLE 3 (*Continued*)


Z	0.00	0.01	0.02	0.03	0.04	0.05	0.06	0.07	0.08	0.09
0.0	0.5000	0.5040	0.5080	0.5120	0.5160	0.5199	0.5239	0.5279	0.5319	0.5359
0.1	0.5398	0.5438	0.5478	0.5517	0.5557	0.5596	0.5636	0.5675	0.5714	0.5753
0.2	0.5793	0.5832	0.5871	0.5910	0.5948	0.5987	0.6026	0.6064	0.6103	0.6141
0.3	0.6179	0.6217	0.6255	0.6293	0.6331	0.6368	0.6406	0.6443	0.6480	0.6517
0.4	0.6554	0.6591	0.6628	0.6664	0.6700	0.6736	0.6772	0.6808	0.6844	0.6879
0.5	0.6915	0.6950	0.6985	0.7019	0.7054	0.7088	0.7123	0.7157	0.7190	0.7224
0.6	0.7257	0.7291	0.7324	0.7357	0.7389	0.7422	0.7454	0.7486	0.7517	0.7549
0.7	0.7580	0.7611	0.7642	0.7673	0.7704	0.7734	0.7764	0.7794	0.7823	0.7852
0.8	0.7881	0.7910	0.7939	0.7967	0.7995	0.8023	0.8051	0.8078	0.8106	0.8133
0.9	0.8159	0.8186	0.8212	0.8238	0.8264	0.8289	0.8315	0.8340	0.8365	0.8389
1.0	0.8413	0.8438	0.8461	0.8485	0.8508	0.8531	0.8554	0.8577	0.8599	0.8621
1.1	0.8643	0.8665	0.8686	0.8708	0.8729	0.8749	0.8770	0.8790	0.8810	0.8830
1.2	0.8849	0.8869	0.8888	0.8907	0.8925	0.8944	0.8962	0.8980	0.8997	0.9015
1.3	0.9032	0.9049	0.9066	0.9082	0.9099	0.9115	0.9131	0.9147	0.9162	0.9177
1.4	0.9192	0.9207	0.9222	0.9236	0.9251	0.9265	0.9279	0.9292	0.9306	0.9319
1.5	0.9332	0.9345	0.9357	0.9370	0.9382	0.9394	0.9406	0.9418	0.9429	0.9441
1.6	0.9452	0.9463	0.9474	0.9484	0.9495	0.9505	0.9515	0.9525	0.9535	0.9545
1.7	0.9554	0.9564	0.9573	0.9582	0.9591	0.9599	0.9608	0.9616	0.9625	0.9633
1.8	0.9641	0.9649	0.9656	0.9664	0.9671	0.9678	0.9686	0.9693	0.9699	0.9706
1.9	0.9713	0.9719	0.9726	0.9732	0.9738	0.9744	0.9750	0.9756	0.9761	0.9767
2.0	0.9772	0.9778	0.9783	0.9788	0.9793	0.9798	0.9803	0.9808	0.9812	0.9817
2.1	0.9821	0.9826	0.9830	0.9834	0.9838	0.9842	0.9846	0.9850	0.9854	0.9857
2.2	0.9861	0.9864	0.9868	0.9871	0.9875	0.9878	0.9881	0.9884	0.9887	0.9890
2.3	0.9893	0.9896	0.9898	0.9901	0.9904	0.9906	0.9909	0.9911	0.9913	0.9916
2.4	0.9918	0.9920	0.9922	0.9925	0.9927	0.9929	0.9931	0.9932	0.9934	0.9936
2.5	0.9938	0.9940	0.9941	0.9943	0.9945	0.9946	0.9948	0.9949	0.9951	0.9952
2.6	0.9953	0.9955	0.9956	0.9957	0.9959	0.9960	0.9961	0.9962	0.9963	0.9964
2.7	0.9965	0.9966	0.9967	0.9968	0.9969	0.9970	0.9971	0.9972	0.9973	0.9974
2.8	0.9974	0.9975	0.9976	0.9977	0.9977	0.9978	0.9979	0.9979	0.9980	0.9981
2.9	0.9981	0.9982	0.9982	0.9983	0.9984	0.9984	0.9985	0.9985	0.9986	0.9986
3.0	0.9987	0.9987	0.9987	0.9988	0.9988	0.9989	0.9989	0.9989	0.9990	0.9990

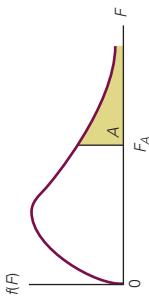
TABLE 4
Critical Values of the Student *t* Distribution



Degrees of Freedom	<i>t_{.100}</i>	<i>t_{.050}</i>	<i>t_{.025}</i>	<i>t_{.010}</i>	<i>t_{.005}</i>
1	3.078	6.314	12.706	31.821	63.657
2	1.886	2.920	4.303	6.965	9.925
3	1.638	2.353	3.182	4.541	5.841
4	1.533	2.132	2.776	3.747	4.604
5	1.476	2.015	2.571	3.365	4.032
6	1.440	1.943	2.447	3.143	3.707
7	1.415	1.895	2.365	2.998	3.499
8	1.397	1.860	2.306	2.896	3.355
9	1.383	1.833	2.262	2.821	3.250
10	1.372	1.812	2.228	2.764	3.169
11	1.363	1.796	2.201	2.718	3.106
12	1.356	1.782	2.179	2.681	3.055
13	1.350	1.771	2.160	2.650	3.012
14	1.345	1.761	2.145	2.624	2.977
15	1.341	1.753	2.131	2.602	2.947
16	1.337	1.746	2.120	2.583	2.921
17	1.333	1.740	2.110	2.567	2.898
18	1.330	1.734	2.101	2.552	2.878
19	1.328	1.729	2.093	2.539	2.861
20	1.325	1.725	2.086	2.528	2.845
21	1.323	1.721	2.080	2.518	2.831
22	1.321	1.717	2.074	2.508	2.819
23	1.319	1.714	2.069	2.500	2.807
24	1.318	1.711	2.064	2.492	2.797
25	1.316	1.708	2.060	2.485	2.787
26	1.315	1.706	2.056	2.479	2.779
27	1.314	1.703	2.052	2.473	2.771
28	1.313	1.701	2.048	2.467	2.763
29	1.311	1.699	2.045	2.462	2.756
30	1.310	1.697	2.042	2.457	2.750
35	1.306	1.690	2.030	2.438	2.724
40	1.303	1.684	2.021	2.423	2.704
45	1.301	1.679	2.014	2.412	2.690
50	1.299	1.676	2.009	2.403	2.678
55	1.297	1.673	2.004	2.396	2.668
60	1.296	1.671	2.000	2.390	2.660
65	1.295	1.669	1.997	2.385	2.654
70	1.294	1.667	1.994	2.381	2.648
75	1.293	1.665	1.992	2.377	2.643
80	1.292	1.664	1.990	2.374	2.639
85	1.292	1.663	1.988	2.371	2.635
90	1.291	1.662	1.987	2.368	2.632
95	1.291	1.661	1.985	2.366	2.629
100	1.290	1.660	1.984	2.364	2.626
110	1.289	1.659	1.982	2.361	2.621
120	1.289	1.658	1.980	2.358	2.617
130	1.288	1.657	1.978	2.355	2.614
140	1.288	1.656	1.977	2.353	2.611
150	1.287	1.655	1.976	2.351	2.609
160	1.287	1.654	1.975	2.350	2.607
170	1.287	1.654	1.974	2.348	2.605
180	1.286	1.653	1.973	2.347	2.603
190	1.286	1.653	1.973	2.346	2.602
200	1.286	1.653	1.972	2.345	2.601
∞	1.282	1.645	1.960	2.326	2.576

TABLE 5 Critical Values of the χ^2 Distribution


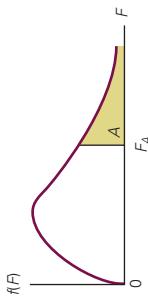
Degrees of Freedom	$\chi^2_{.995}$	$\chi^2_{.990}$	$\chi^2_{.975}$	$\chi^2_{.950}$	$\chi^2_{.900}$	$\chi^2_{.100}$	$\chi^2_{.050}$	$\chi^2_{.025}$	$\chi^2_{.010}$	$\chi^2_{.005}$
1	0.000039	0.000157	0.000982	0.00393	0.0158	2.71	3.84	5.02	6.63	7.88
2	0.0100	0.0201	0.0506	0.103	0.211	4.61	5.99	7.38	9.21	10.6
3	0.072	0.115	0.216	0.352	0.584	6.25	7.81	9.35	11.3	12.8
4	0.207	0.297	0.484	0.711	1.06	7.78	9.49	11.1	13.3	14.9
5	0.412	0.554	0.831	1.15	1.61	9.24	11.1	12.8	15.1	16.7
6	0.676	0.872	1.24	1.64	2.20	10.6	12.6	14.4	16.8	18.5
7	0.989	1.24	1.69	2.17	2.83	12.0	14.1	16.0	18.5	20.3
8	1.34	1.65	2.18	2.73	3.49	13.4	15.5	17.5	20.1	22.0
9	1.73	2.09	2.70	3.33	4.17	14.7	16.9	19.0	21.7	23.6
10	2.16	2.56	3.25	3.94	4.87	16.0	18.3	20.5	23.2	25.2
11	2.60	3.05	3.82	4.57	5.58	17.3	19.7	21.9	24.7	26.8
12	3.07	3.57	4.40	5.23	6.30	18.5	21.0	23.3	26.2	28.3
13	3.57	4.11	5.01	5.89	7.04	19.8	22.4	24.7	27.7	29.8
14	4.07	4.66	5.63	6.57	7.79	21.1	23.7	26.1	29.1	31.3
15	4.60	5.23	6.26	7.26	8.55	22.3	25.0	27.5	30.6	32.8
16	5.14	5.81	6.91	7.96	9.31	23.5	26.3	28.8	32.0	34.3
17	5.70	6.41	7.56	8.67	10.1	24.8	27.6	30.2	33.4	35.7
18	6.26	7.01	8.23	9.39	10.9	26.0	28.9	31.5	34.8	37.2
19	6.84	7.63	8.91	10.1	11.7	27.2	30.1	32.9	36.2	38.6
20	7.43	8.26	9.59	10.9	12.4	28.4	31.4	34.2	37.6	40.0
21	8.03	8.90	10.3	11.6	13.2	29.6	32.7	35.5	38.9	41.4
22	8.64	9.54	11.0	12.3	14.0	30.8	33.9	36.8	40.3	42.8
23	9.26	10.2	11.7	13.1	14.8	32.0	35.2	38.1	41.6	44.2
24	9.89	10.9	12.4	13.8	15.7	33.2	36.4	39.4	43.0	45.6
25	10.5	11.5	13.1	14.6	16.5	34.4	37.7	40.6	44.3	46.9
26	11.2	12.2	13.8	15.4	17.3	35.6	38.9	41.9	45.6	48.3
27	11.8	12.9	14.6	16.2	18.1	36.7	40.1	43.2	47.0	49.6
28	12.5	13.6	15.3	16.9	18.9	37.9	41.3	44.5	48.3	51.0
29	13.1	14.3	16.0	17.7	19.8	39.1	42.6	45.7	49.6	52.3
30	13.8	15.0	16.8	18.5	20.6	40.3	43.8	47.0	50.9	53.7
40	20.7	22.2	24.4	26.5	29.1	51.8	55.8	59.3	63.7	66.8
50	28.0	29.7	32.4	34.8	37.7	63.2	67.5	71.4	76.2	79.5
60	35.5	37.5	40.5	43.2	46.5	74.4	79.1	83.3	88.4	92.0
70	43.3	45.4	48.8	51.7	55.3	85.5	90.5	95.0	100	104
80	51.2	53.5	57.2	60.4	64.3	96.6	102	107	112	116
90	59.2	61.8	65.6	69.1	73.3	108	113	118	124	128
100	67.3	70.1	74.2	77.9	82.4	118	124	130	136	140

TABLE 6(a) Critical Values of the F -Distribution: $A = .05$ 

		NUMERATOR DEGREES OF FREEDOM																			
		DENOMINATOR DEGREES OF FREEDOM																			
ν_1	ν_2	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
1	161	199	216	225	230	234	237	239	241	242	243	244	245	246	246	247	247	248	248	248	
2	18.5	19.0	19.2	19.3	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	19.4	
3	10.1	9.55	9.28	9.12	9.01	8.94	8.89	8.85	8.81	8.79	8.76	8.74	8.73	8.71	8.70	8.69	8.68	8.67	8.67	8.66	
4	7.71	6.94	6.59	6.39	6.26	6.16	6.09	6.04	6.00	5.96	5.94	5.91	5.89	5.87	5.86	5.84	5.83	5.82	5.81	5.80	
5	6.61	5.79	5.41	5.19	4.95	4.88	4.82	4.77	4.74	4.70	4.68	4.66	4.64	4.62	4.60	4.59	4.58	4.57	4.57	4.56	
6	5.99	5.14	4.76	4.53	4.39	4.28	4.21	4.15	4.10	4.06	4.03	4.00	3.98	3.96	3.94	3.92	3.91	3.90	3.88	3.87	
7	5.59	4.74	4.35	4.12	3.97	3.87	3.79	3.73	3.68	3.64	3.60	3.57	3.55	3.53	3.51	3.49	3.48	3.47	3.46	3.44	
8	5.32	4.46	4.07	3.84	3.69	3.58	3.50	3.44	3.39	3.35	3.31	3.28	3.26	3.24	3.22	3.20	3.19	3.17	3.16	3.15	
9	5.12	4.26	3.86	3.63	3.48	3.37	3.29	3.23	3.18	3.14	3.10	3.07	3.05	3.03	3.01	2.99	2.97	2.96	2.95	2.94	
10	4.96	4.10	3.71	3.48	3.33	3.22	3.14	3.07	3.02	2.98	2.94	2.91	2.89	2.86	2.85	2.83	2.81	2.80	2.79	2.77	
11	4.84	3.98	3.59	3.36	3.20	3.09	3.01	2.95	2.90	2.85	2.82	2.79	2.76	2.74	2.72	2.70	2.69	2.67	2.66	2.65	
12	4.75	3.89	3.49	3.26	3.11	3.00	2.91	2.85	2.80	2.75	2.72	2.69	2.66	2.64	2.62	2.60	2.58	2.57	2.56	2.54	
13	4.67	3.81	3.41	3.18	3.03	2.92	2.83	2.77	2.71	2.67	2.63	2.60	2.58	2.55	2.53	2.51	2.50	2.48	2.47	2.46	
14	4.60	3.74	3.34	3.11	2.96	2.85	2.76	2.70	2.65	2.60	2.57	2.53	2.51	2.48	2.46	2.44	2.43	2.41	2.40	2.39	
15	4.54	3.68	3.29	3.06	2.90	2.79	2.71	2.64	2.59	2.54	2.51	2.48	2.45	2.42	2.40	2.38	2.37	2.35	2.34	2.33	
16	4.49	3.63	3.24	3.01	2.85	2.74	2.66	2.59	2.54	2.49	2.46	2.42	2.40	2.37	2.35	2.33	2.32	2.30	2.29	2.28	
17	4.45	3.59	3.20	2.96	2.81	2.70	2.61	2.55	2.49	2.45	2.41	2.38	2.35	2.33	2.31	2.29	2.27	2.26	2.24	2.23	
18	4.41	3.55	3.16	2.93	2.77	2.66	2.58	2.51	2.46	2.41	2.37	2.34	2.31	2.29	2.27	2.25	2.23	2.22	2.20	2.19	
19	4.38	3.52	3.13	2.90	2.74	2.63	2.54	2.48	2.42	2.38	2.34	2.31	2.28	2.26	2.23	2.21	2.20	2.18	2.17	2.16	
20	4.35	3.49	3.10	2.87	2.71	2.60	2.51	2.45	2.39	2.35	2.31	2.28	2.25	2.22	2.20	2.18	2.17	2.15	2.14	2.12	
22	4.30	3.44	3.05	2.82	2.66	2.55	2.46	2.40	2.34	2.30	2.26	2.23	2.20	2.17	2.15	2.13	2.11	2.10	2.08	2.07	
24	4.26	3.40	3.01	2.78	2.62	2.51	2.42	2.36	2.30	2.25	2.22	2.18	2.15	2.13	2.11	2.09	2.07	2.05	2.04	2.03	
26	4.23	3.37	2.98	2.74	2.59	2.47	2.39	2.32	2.27	2.22	2.18	2.15	2.12	2.09	2.07	2.05	2.03	2.02	2.00	1.99	
28	4.20	3.34	2.95	2.71	2.56	2.45	2.36	2.29	2.24	2.19	2.15	2.12	2.09	2.06	2.04	2.02	2.00	1.99	1.97	1.96	
30	4.17	3.32	2.92	2.69	2.53	2.42	2.33	2.27	2.21	2.16	2.13	2.09	2.06	2.04	2.01	1.99	1.98	1.96	1.95	1.93	
35	4.12	3.27	2.87	2.64	2.49	2.37	2.29	2.22	2.16	2.11	2.07	2.04	2.01	1.99	1.96	1.94	1.92	1.91	1.89	1.88	
40	4.08	3.23	2.84	2.61	2.45	2.34	2.25	2.18	2.12	2.08	2.04	2.00	1.97	1.95	1.92	1.90	1.89	1.87	1.85	1.84	
45	4.06	3.20	2.81	2.58	2.42	2.31	2.22	2.15	2.10	2.05	2.01	1.97	1.94	1.92	1.89	1.87	1.86	1.84	1.82	1.81	
50	4.03	3.18	2.79	2.56	2.40	2.29	2.20	2.13	2.07	2.03	1.99	1.95	1.92	1.89	1.87	1.85	1.83	1.81	1.80	1.78	
60	4.00	3.15	2.76	2.53	2.37	2.25	2.17	2.10	2.04	1.99	1.95	1.92	1.89	1.86	1.84	1.82	1.80	1.78	1.76	1.75	
70	3.98	3.13	2.74	2.50	2.35	2.23	2.14	2.07	2.02	1.97	1.93	1.89	1.86	1.84	1.81	1.79	1.77	1.75	1.74	1.72	
80	3.96	3.11	2.72	2.49	2.33	2.21	2.13	2.06	2.00	1.95	1.91	1.88	1.84	1.82	1.79	1.77	1.75	1.73	1.72	1.70	
90	3.95	3.10	2.71	2.47	2.32	2.20	2.11	2.04	1.99	1.94	1.90	1.86	1.83	1.80	1.78	1.76	1.74	1.72	1.70	1.69	
100	3.94	3.09	2.70	2.46	2.31	2.19	2.10	2.03	1.97	1.93	1.89	1.85	1.82	1.79	1.77	1.75	1.73	1.71	1.69	1.68	
120	3.92	3.07	2.68	2.45	2.29	2.18	2.09	2.02	1.96	1.91	1.87	1.83	1.80	1.78	1.75	1.73	1.71	1.69	1.67	1.66	
140	3.91	3.06	2.67	2.44	2.28	2.16	2.08	2.01	1.95	1.90	1.86	1.82	1.79	1.76	1.74	1.72	1.70	1.68	1.66	1.65	
160	3.90	3.05	2.66	2.43	2.27	2.16	2.07	2.00	1.94	1.89	1.85	1.81	1.78	1.75	1.73	1.71	1.69	1.67	1.65	1.64	
180	3.89	3.05	2.65	2.42	2.26	2.15	2.06	1.99	1.93	1.88	1.84	1.81	1.77	1.75	1.72	1.70	1.68	1.66	1.64	1.63	
200	3.89	3.04	2.65	2.42	2.26	2.14	2.06	1.98	1.93	1.88	1.84	1.80	1.77	1.74	1.72	1.69	1.67	1.66	1.64	1.62	
∞	3.84	3.00	2.61	2.37	2.21	2.10	2.01	1.94	1.88	1.83	1.79	1.75	1.72	1.69	1.67	1.64	1.62	1.60	1.59	1.57	

		NUMERATOR DEGREES OF FREEDOM																			
		22	24	26	28	30	35	40	45	50	60	70	80	90	100	120	140	160	180	200	∞
$\nu_1 \backslash \nu_2$	22	249	249	250	250	251	251	252	252	253	253	253	253	253	253	253	253	254	254	254	
1	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	249	
2	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	19.5	
3	8.65	8.64	8.63	8.62	8.62	8.60	8.59	8.59	8.58	8.57	8.56	8.55	8.55	8.54	8.54	8.54	8.54	8.54	8.54	8.53	
4	5.79	5.77	5.76	5.75	5.75	5.73	5.72	5.71	5.70	5.69	5.68	5.67	5.66	5.66	5.65	5.65	5.65	5.65	5.65	5.63	
5	4.54	4.53	4.52	4.50	4.50	4.48	4.46	4.45	4.44	4.43	4.42	4.41	4.41	4.41	4.40	4.39	4.39	4.39	4.39	4.37	
6	3.86	3.84	3.83	3.82	3.81	3.79	3.77	3.76	3.75	3.74	3.73	3.72	3.71	3.71	3.70	3.70	3.69	3.69	3.67	3.67	
7	3.43	3.41	3.40	3.39	3.38	3.36	3.34	3.33	3.32	3.30	3.29	3.28	3.27	3.27	3.26	3.26	3.25	3.25	3.23	3.23	
8	3.13	3.12	3.10	3.09	3.08	3.06	3.04	3.03	3.02	3.01	2.99	2.97	2.97	2.96	2.95	2.95	2.93	2.93	2.93	2.93	
9	2.92	2.90	2.89	2.87	2.86	2.84	2.83	2.81	2.80	2.79	2.78	2.77	2.76	2.75	2.74	2.74	2.73	2.73	2.71	2.71	
10	2.75	2.74	2.72	2.71	2.70	2.68	2.66	2.64	2.62	2.61	2.60	2.59	2.59	2.58	2.57	2.57	2.57	2.56	2.56	2.54	
11	2.63	2.61	2.59	2.58	2.57	2.55	2.53	2.52	2.51	2.49	2.48	2.47	2.46	2.46	2.45	2.44	2.44	2.43	2.43	2.41	
12	2.52	2.51	2.49	2.48	2.47	2.44	2.43	2.41	2.40	2.38	2.37	2.36	2.36	2.35	2.34	2.33	2.33	2.32	2.32	2.30	
13	2.44	2.42	2.41	2.39	2.38	2.36	2.34	2.33	2.31	2.30	2.28	2.27	2.27	2.26	2.25	2.25	2.24	2.24	2.23	2.21	
14	2.37	2.35	2.33	2.32	2.31	2.28	2.27	2.25	2.24	2.22	2.21	2.20	2.19	2.19	2.18	2.17	2.17	2.16	2.16	2.13	
15	2.31	2.29	2.27	2.26	2.25	2.22	2.20	2.19	2.18	2.16	2.15	2.14	2.14	2.13	2.12	2.11	2.11	2.10	2.10	2.07	
16	2.25	2.24	2.22	2.21	2.19	2.17	2.15	2.14	2.12	2.11	2.09	2.08	2.07	2.07	2.06	2.05	2.05	2.04	2.04	2.01	
17	2.21	2.19	2.17	2.16	2.15	2.12	2.10	2.09	2.08	2.06	2.05	2.03	2.03	2.02	2.01	2.00	2.00	1.99	1.99	1.96	
18	2.17	2.15	2.13	2.12	2.11	2.08	2.06	2.05	2.04	2.02	2.00	1.99	1.98	1.97	1.96	1.96	1.95	1.95	1.95	1.92	
19	2.13	2.11	2.10	2.08	2.07	2.05	2.03	2.01	2.00	1.98	1.97	1.96	1.95	1.94	1.93	1.92	1.91	1.91	1.88	1.88	
20	2.10	2.08	2.07	2.05	2.04	2.01	1.99	1.98	1.97	1.95	1.93	1.92	1.91	1.91	1.90	1.89	1.88	1.88	1.88	1.84	
22	2.05	2.03	2.01	1.98	1.96	1.94	1.92	1.91	1.89	1.88	1.86	1.86	1.85	1.84	1.83	1.82	1.82	1.82	1.82	1.78	
24	2.00	1.98	1.97	1.95	1.94	1.91	1.89	1.88	1.86	1.84	1.83	1.82	1.81	1.80	1.79	1.78	1.78	1.77	1.77	1.73	
26	1.95	1.93	1.91	1.90	1.87	1.85	1.84	1.82	1.80	1.79	1.78	1.77	1.76	1.75	1.74	1.73	1.73	1.73	1.69		
28	1.93	1.91	1.90	1.88	1.87	1.84	1.82	1.80	1.79	1.77	1.75	1.74	1.73	1.73	1.71	1.70	1.69	1.69	1.65		
30	1.91	1.89	1.87	1.85	1.84	1.81	1.79	1.77	1.76	1.74	1.72	1.71	1.70	1.68	1.68	1.67	1.66	1.66	1.62		
35	1.85	1.83	1.82	1.80	1.79	1.76	1.74	1.72	1.70	1.68	1.66	1.65	1.64	1.63	1.62	1.61	1.61	1.60	1.60	1.56	
40	1.81	1.79	1.77	1.76	1.74	1.72	1.69	1.67	1.66	1.64	1.62	1.61	1.60	1.59	1.58	1.57	1.56	1.55	1.55	1.51	
45	1.78	1.76	1.74	1.73	1.71	1.68	1.66	1.64	1.63	1.60	1.59	1.57	1.56	1.55	1.54	1.53	1.52	1.52	1.51	1.47	
50	1.76	1.74	1.72	1.70	1.69	1.66	1.63	1.61	1.60	1.58	1.56	1.54	1.53	1.52	1.51	1.50	1.49	1.49	1.48	1.44	
60	1.72	1.70	1.68	1.66	1.65	1.62	1.59	1.57	1.56	1.53	1.52	1.50	1.49	1.48	1.47	1.46	1.45	1.45	1.44	1.39	
70	1.70	1.67	1.65	1.64	1.62	1.59	1.57	1.55	1.53	1.50	1.49	1.47	1.46	1.45	1.44	1.42	1.42	1.41	1.40	1.35	
80	1.68	1.65	1.63	1.62	1.60	1.57	1.54	1.52	1.51	1.48	1.46	1.45	1.44	1.43	1.41	1.40	1.39	1.38	1.38	1.33	
90	1.66	1.64	1.62	1.60	1.59	1.55	1.53	1.51	1.49	1.46	1.44	1.43	1.42	1.41	1.40	1.39	1.38	1.37	1.36	1.30	
100	1.65	1.63	1.61	1.59	1.57	1.54	1.52	1.50	1.47	1.45	1.43	1.41	1.40	1.39	1.38	1.37	1.36	1.35	1.34	1.28	
120	1.63	1.61	1.59	1.57	1.55	1.52	1.50	1.47	1.46	1.43	1.41	1.39	1.38	1.37	1.35	1.34	1.33	1.32	1.32	1.26	
140	1.62	1.60	1.57	1.56	1.54	1.51	1.48	1.46	1.44	1.41	1.39	1.38	1.36	1.35	1.33	1.32	1.31	1.30	1.30	1.23	
160	1.61	1.59	1.57	1.55	1.53	1.50	1.47	1.45	1.43	1.40	1.38	1.36	1.34	1.33	1.31	1.30	1.29	1.28	1.22	1.22	
180	1.60	1.58	1.56	1.54	1.52	1.49	1.46	1.44	1.42	1.39	1.37	1.35	1.33	1.31	1.30	1.29	1.28	1.27	1.20	1.20	
200	1.60	1.57	1.55	1.53	1.52	1.48	1.46	1.43	1.41	1.39	1.36	1.35	1.33	1.32	1.30	1.29	1.28	1.27	1.26	1.19	
∞	1.54	1.52	1.50	1.48	1.46	1.42	1.40	1.37	1.35	1.32	1.29	1.28	1.26	1.25	1.22	1.21	1.19	1.18	1.17	1.00	

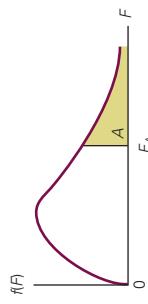
DENOMINATOR DEGREES OF FREEDOM

TABLE 6(b) Values of the F -Distribution: $A = .025$ 

		NUMERATOR DEGREES OF FREEDOM																			
		1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
ν_2	ν_1																				
1	648	799	864	900	922	937	948	957	963	969	973	977	980	983	985	987	989	990	992	993	
2	38.5	39.0	39.2	39.3	39.3	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	39.4	
3	17.4	16.0	15.4	15.1	14.9	14.7	14.6	14.5	14.5	14.5	14.4	14.4	14.3	14.3	14.3	14.3	14.3	14.2	14.2	14.2	
4	12.2	10.6	10.0	9.60	9.36	9.20	9.07	8.98	8.90	8.84	8.79	8.75	8.71	8.68	8.66	8.63	8.61	8.59	8.58	8.56	
5	10.0	8.43	7.76	7.39	7.15	6.98	6.85	6.76	6.68	6.62	6.57	6.52	6.49	6.46	6.43	6.40	6.38	6.36	6.34	6.33	
6	8.81	7.26	6.60	6.23	5.99	5.82	5.70	5.60	5.52	5.46	5.41	5.37	5.33	5.30	5.27	5.24	5.22	5.20	5.18	5.17	
7	8.07	6.54	5.89	5.52	5.29	5.12	4.99	4.90	4.82	4.76	4.71	4.67	4.63	4.60	4.57	4.54	4.52	4.50	4.48	4.47	
8	7.57	6.06	5.42	5.05	4.82	4.65	4.53	4.43	4.36	4.30	4.24	4.20	4.16	4.13	4.10	4.08	4.05	4.03	4.02	4.00	
9	7.21	5.71	5.08	4.72	4.48	4.32	4.20	4.10	4.03	3.96	3.91	3.87	3.83	3.80	3.77	3.74	3.72	3.70	3.68	3.67	
10	6.94	5.46	4.83	4.47	4.24	4.07	3.95	3.85	3.78	3.72	3.66	3.62	3.58	3.55	3.52	3.47	3.45	3.44	3.42		
11	6.72	5.26	4.63	4.28	4.04	3.88	3.76	3.66	3.59	3.53	3.47	3.43	3.39	3.36	3.33	3.30	3.28	3.26	3.24	3.23	
12	6.55	5.10	4.47	4.12	3.89	3.73	3.61	3.51	3.44	3.37	3.32	3.28	3.24	3.21	3.18	3.15	3.13	3.11	3.09	3.07	
13	6.41	4.97	4.35	4.00	3.77	3.60	3.48	3.39	3.31	3.25	3.20	3.15	3.12	3.08	3.05	3.03	3.00	2.98	2.96	2.95	
14	6.30	4.86	4.24	3.89	3.66	3.50	3.38	3.29	3.21	3.15	3.09	3.05	3.01	2.98	2.95	2.90	2.88	2.86	2.84		
15	6.20	4.77	4.15	3.80	3.58	3.41	3.29	3.20	3.12	3.06	3.01	2.96	2.92	2.89	2.86	2.84	2.81	2.79	2.77	2.76	
16	6.12	4.69	4.08	3.73	3.50	3.34	3.22	3.12	3.05	2.99	2.93	2.89	2.85	2.82	2.79	2.76	2.74	2.72	2.70	2.68	
17	6.04	4.62	4.01	3.66	3.44	3.28	3.16	3.06	2.98	2.92	2.87	2.82	2.79	2.75	2.72	2.67	2.65	2.63	2.61	2.60	
18	5.98	4.56	3.95	3.61	3.38	3.22	3.10	3.01	2.93	2.87	2.81	2.77	2.73	2.70	2.67	2.64	2.62	2.60	2.58	2.56	
19	5.92	4.51	3.90	3.56	3.33	3.17	3.05	2.96	2.88	2.82	2.76	2.72	2.68	2.65	2.62	2.59	2.57	2.55	2.53	2.51	
20	5.87	4.46	3.86	3.51	3.29	3.13	3.01	2.91	2.84	2.77	2.72	2.68	2.64	2.60	2.57	2.55	2.52	2.50	2.48	2.46	
22	5.79	4.38	3.78	3.44	3.22	3.05	2.93	2.84	2.76	2.70	2.65	2.60	2.56	2.53	2.50	2.47	2.45	2.43	2.41	2.39	
24	5.72	4.32	3.72	3.38	3.15	2.99	2.87	2.78	2.70	2.64	2.59	2.54	2.50	2.47	2.44	2.41	2.39	2.36	2.35	2.33	
26	5.66	4.27	3.67	3.33	3.10	2.94	2.82	2.73	2.65	2.59	2.54	2.49	2.45	2.42	2.39	2.36	2.34	2.31	2.29	2.28	
28	5.61	4.22	3.63	3.29	3.06	2.90	2.78	2.69	2.61	2.55	2.49	2.45	2.41	2.37	2.34	2.32	2.29	2.27	2.25	2.23	
30	5.57	4.18	3.59	3.25	3.03	2.87	2.75	2.65	2.57	2.51	2.46	2.41	2.37	2.34	2.31	2.28	2.26	2.23	2.21	2.20	
35	5.48	4.11	3.52	3.18	2.96	2.80	2.68	2.58	2.50	2.44	2.39	2.34	2.30	2.27	2.23	2.21	2.18	2.16	2.14	2.12	
40	5.42	4.05	3.46	3.13	2.90	2.74	2.62	2.53	2.45	2.39	2.33	2.29	2.25	2.21	2.18	2.15	2.13	2.11	2.09	2.07	
45	5.38	4.01	3.42	3.09	2.86	2.70	2.58	2.49	2.41	2.35	2.29	2.25	2.21	2.17	2.14	2.11	2.09	2.07	2.04	2.03	
50	5.34	3.97	3.39	3.05	2.83	2.67	2.55	2.46	2.38	2.32	2.26	2.22	2.18	2.14	2.11	2.08	2.06	2.03	2.01	1.99	
60	5.29	3.93	3.34	3.01	2.79	2.63	2.51	2.41	2.33	2.27	2.22	2.17	2.13	2.09	2.06	2.03	2.01	1.98	1.96	1.94	
70	5.25	3.89	3.31	2.97	2.75	2.59	2.47	2.38	2.30	2.24	2.18	2.14	2.10	2.06	2.03	2.00	1.97	1.95	1.93	1.91	
140	5.13	3.79	3.21	2.88	2.66	2.50	2.38	2.28	2.21	2.14	2.09	2.04	2.00	1.96	1.93	1.90	1.87	1.85	1.83	1.81	
80	5.22	3.86	3.28	2.95	2.73	2.57	2.45	2.35	2.28	2.21	2.16	2.11	2.07	2.03	2.00	1.97	1.95	1.92	1.90	1.88	
90	5.20	3.84	3.26	2.93	2.71	2.55	2.43	2.34	2.26	2.19	2.14	2.09	2.05	2.02	1.98	1.95	1.93	1.91	1.88	1.86	
100	5.18	3.83	3.25	2.92	2.70	2.54	2.42	2.32	2.24	2.18	2.12	2.08	2.04	2.00	1.97	1.94	1.91	1.89	1.87	1.85	
120	5.15	3.80	3.23	2.89	2.67	2.52	2.39	2.30	2.22	2.16	2.10	2.05	2.01	1.98	1.94	1.92	1.89	1.87	1.84	1.82	
160	5.12	3.78	3.20	2.87	2.65	2.49	2.37	2.27	2.19	2.13	2.07	2.03	1.99	1.95	1.92	1.89	1.86	1.84	1.82	1.80	
180	5.11	3.77	3.19	2.86	2.64	2.48	2.36	2.26	2.19	2.12	2.07	2.02	1.98	1.94	1.91	1.88	1.85	1.83	1.81	1.79	
200	5.10	3.76	3.18	2.85	2.63	2.47	2.35	2.26	2.18	2.11	2.06	2.01	1.97	1.93	1.90	1.87	1.84	1.82	1.80	1.78	
∞	5.03	3.69	3.12	2.79	2.57	2.41	2.29	2.19	2.11	2.05	1.99	1.95	1.90	1.87	1.83	1.80	1.78	1.75	1.73		

DENOMINATOR DEGREES OF FREEDOM

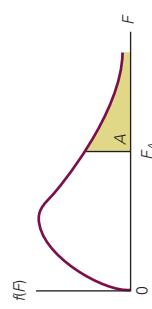
		NUMERATOR DEGREES OF FREEDOM																			
		DENOMINATOR DEGREES OF FREEDOM																			
ν_1	ν_2	22	24	26	28	30	35	40	45	50	60	70	80	90	100	120	140	160	180	200	∞
1	995	997	999	1000	1001	1004	1006	1007	1008	1010	1011	1012	1013	1014	1015	1016	1017	1018			
2	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	39.5	
3	14.1	14.1	14.1	14.1	14.1	14.1	14.1	14.0	14.0	14.0	14.0	14.0	14.0	14.0	14.0	13.9	13.9	13.9	13.9	13.9	
4	8.53	8.51	8.49	8.48	8.46	8.43	8.41	8.39	8.38	8.36	8.35	8.33	8.32	8.31	8.30	8.30	8.29	8.29	8.26	8.26	
5	6.30	6.28	6.26	6.24	6.23	6.20	6.18	6.16	6.14	6.12	6.11	6.10	6.08	6.07	6.06	6.06	6.05	6.05	6.02	6.02	
6	5.14	5.12	5.10	5.08	5.07	5.04	5.01	4.99	4.98	4.96	4.94	4.93	4.92	4.90	4.90	4.89	4.89	4.88	4.85	4.85	
7	4.44	4.41	4.39	4.38	4.36	4.33	4.31	4.29	4.28	4.25	4.24	4.23	4.22	4.21	4.20	4.19	4.18	4.18	4.14	4.14	
8	3.97	3.95	3.93	3.91	3.89	3.86	3.84	3.82	3.81	3.78	3.77	3.76	3.75	3.74	3.73	3.72	3.71	3.70	3.67	3.67	
9	3.64	3.61	3.59	3.58	3.56	3.53	3.51	3.49	3.47	3.45	3.43	3.42	3.41	3.40	3.39	3.38	3.37	3.37	3.33	3.33	
10	3.39	3.37	3.34	3.33	3.31	3.28	3.26	3.24	3.22	3.20	3.18	3.17	3.16	3.15	3.14	3.13	3.12	3.12	3.08	3.08	
11	3.20	3.17	3.15	3.13	3.12	3.09	3.06	3.04	3.03	3.00	2.99	2.97	2.96	2.94	2.94	2.92	2.92	2.92	2.88	2.88	
12	3.04	3.02	3.00	2.98	2.96	2.93	2.91	2.89	2.87	2.85	2.83	2.82	2.81	2.80	2.79	2.78	2.77	2.77	2.76	2.73	
13	2.92	2.89	2.87	2.85	2.84	2.80	2.78	2.76	2.74	2.72	2.70	2.69	2.68	2.67	2.66	2.65	2.64	2.64	2.63	2.60	
14	2.81	2.79	2.77	2.75	2.73	2.70	2.67	2.65	2.64	2.61	2.60	2.58	2.57	2.56	2.55	2.54	2.54	2.53	2.53	2.49	
15	2.73	2.70	2.68	2.66	2.64	2.61	2.59	2.56	2.55	2.52	2.51	2.49	2.48	2.47	2.46	2.45	2.44	2.44	2.44	2.40	
16	2.65	2.63	2.60	2.58	2.57	2.53	2.51	2.49	2.47	2.45	2.43	2.42	2.40	2.40	2.38	2.37	2.37	2.36	2.36	2.32	
17	2.59	2.56	2.54	2.52	2.50	2.47	2.44	2.42	2.41	2.38	2.36	2.35	2.34	2.33	2.32	2.31	2.30	2.29	2.29	2.25	
18	2.53	2.50	2.48	2.46	2.44	2.41	2.38	2.36	2.35	2.32	2.30	2.29	2.28	2.27	2.26	2.25	2.24	2.23	2.23	2.19	
19	2.48	2.45	2.43	2.41	2.39	2.36	2.34	2.31	2.30	2.27	2.25	2.24	2.23	2.22	2.20	2.19	2.19	2.18	2.18	2.13	
20	2.43	2.41	2.39	2.37	2.35	2.31	2.29	2.27	2.25	2.22	2.20	2.19	2.18	2.17	2.16	2.15	2.14	2.13	2.13	2.09	
22	2.36	2.33	2.31	2.29	2.27	2.24	2.21	2.19	2.17	2.14	2.13	2.11	2.10	2.09	2.08	2.07	2.06	2.05	2.05	2.00	
24	2.30	2.27	2.25	2.23	2.21	2.17	2.15	2.12	2.11	2.08	2.06	2.05	2.03	2.02	2.01	2.00	1.99	1.99	1.98	1.94	
26	2.24	2.22	2.19	2.17	2.16	2.12	2.09	2.07	2.05	2.03	2.01	1.99	1.98	1.97	1.95	1.94	1.93	1.92	1.88		
28	2.20	2.17	2.15	2.13	2.11	2.08	2.05	2.03	2.01	1.98	1.96	1.94	1.93	1.92	1.91	1.90	1.89	1.88	1.88		
30	2.16	2.14	2.11	2.09	2.07	2.04	2.01	1.99	1.97	1.94	1.92	1.90	1.89	1.88	1.87	1.86	1.85	1.84	1.84		
35	2.09	2.06	2.04	2.02	2.00	1.96	1.93	1.91	1.89	1.86	1.84	1.82	1.81	1.80	1.79	1.77	1.77	1.76	1.75		
40	2.03	2.01	1.98	1.96	1.94	1.90	1.88	1.85	1.83	1.80	1.78	1.76	1.75	1.74	1.72	1.71	1.70	1.70	1.69		
45	1.99	1.96	1.94	1.92	1.90	1.86	1.83	1.81	1.79	1.76	1.74	1.72	1.70	1.69	1.68	1.66	1.66	1.65	1.64		
50	1.96	1.93	1.91	1.89	1.87	1.83	1.80	1.77	1.75	1.72	1.70	1.68	1.67	1.66	1.64	1.63	1.62	1.61	1.60		
60	1.91	1.88	1.86	1.83	1.82	1.78	1.74	1.72	1.70	1.67	1.64	1.63	1.61	1.60	1.58	1.57	1.56	1.55	1.54		
70	1.88	1.85	1.82	1.80	1.78	1.74	1.71	1.68	1.66	1.63	1.60	1.59	1.57	1.56	1.54	1.53	1.52	1.51	1.50		
80	1.85	1.82	1.79	1.77	1.75	1.71	1.68	1.65	1.63	1.60	1.57	1.55	1.54	1.53	1.52	1.51	1.50	1.49	1.48		
90	1.83	1.80	1.77	1.75	1.73	1.69	1.66	1.63	1.61	1.58	1.55	1.53	1.52	1.50	1.48	1.47	1.46	1.45	1.44		
100	1.81	1.78	1.76	1.74	1.71	1.67	1.64	1.61	1.59	1.56	1.53	1.51	1.50	1.48	1.46	1.45	1.44	1.43	1.42		
120	1.79	1.76	1.73	1.71	1.69	1.65	1.61	1.59	1.56	1.53	1.50	1.48	1.47	1.45	1.43	1.42	1.41	1.40	1.39		
140	1.77	1.74	1.72	1.69	1.67	1.63	1.60	1.57	1.55	1.51	1.48	1.46	1.45	1.43	1.41	1.39	1.38	1.37	1.36		
160	1.76	1.73	1.70	1.68	1.66	1.62	1.58	1.55	1.53	1.50	1.47	1.45	1.43	1.42	1.41	1.39	1.38	1.37	1.36		
180	1.75	1.72	1.69	1.67	1.65	1.61	1.57	1.54	1.52	1.48	1.46	1.43	1.42	1.40	1.38	1.36	1.35	1.34	1.33		
200	1.74	1.71	1.68	1.66	1.64	1.60	1.56	1.53	1.51	1.47	1.45	1.42	1.41	1.39	1.37	1.35	1.34	1.33	1.32		
∞	1.67	1.64	1.61	1.59	1.57	1.52	1.49	1.46	1.43	1.39	1.36	1.33	1.31	1.30	1.27	1.25	1.23	1.22	1.21		

TABLE 6(C) Values of the F -Distribution: $A = .01$ 

		NUMERATOR DEGREES OF FREEDOM																			
		1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
ν_2	ν_1	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
1	4052	4999	5403	5625	5764	5859	5928	5981	6022	6056	6083	6106	6126	6143	6157	6170	6181	6192	6201	6209	
2	98.5	99.0	99.2	99.3	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	99.4	
3	34.1	30.8	29.5	28.7	28.2	27.9	27.5	27.3	27.2	27.1	27.0	26.9	26.8	26.8	26.8	26.8	26.8	26.8	26.7	26.7	
4	21.2	18.0	16.7	16.0	15.5	15.2	15.0	14.8	14.7	14.5	14.4	14.3	14.2	14.2	14.2	14.2	14.1	14.1	14.0	14.0	
5	16.3	13.3	12.1	11.4	11.0	10.7	10.5	10.3	10.2	10.1	9.96	9.89	9.82	9.77	9.72	9.68	9.64	9.61	9.58	9.55	
6	13.7	10.9	9.78	9.15	8.75	8.47	8.26	8.10	7.98	7.79	7.66	7.60	7.56	7.52	7.48	7.45	7.42	7.40			
7	12.2	9.55	8.45	7.85	7.46	7.19	6.99	6.84	6.72	6.62	6.54	6.47	6.41	6.36	6.31	6.28	6.24	6.21	6.18	6.16	
8	11.3	8.65	7.59	7.01	6.63	6.37	6.18	6.03	5.91	5.81	5.73	5.67	5.61	5.56	5.52	5.48	5.44	5.41	5.38	5.36	
9	10.6	8.02	6.99	6.42	6.06	5.80	5.61	5.47	5.35	5.26	5.18	5.11	5.05	4.96	4.92	4.89	4.86	4.83	4.81		
10	10.0	7.56	6.55	5.99	5.64	5.39	5.20	5.06	4.94	4.85	4.77	4.71	4.65	4.60	4.56	4.52	4.49	4.46	4.43	4.41	
11	9.65	7.21	6.22	5.67	5.32	5.07	4.89	4.74	4.63	4.54	4.46	4.40	4.34	4.29	4.25	4.21	4.18	4.15	4.12	4.10	
12	9.33	6.93	5.95	5.41	5.06	4.82	4.64	4.50	4.39	4.30	4.22	4.16	4.10	4.05	4.01	3.97	3.94	3.91	3.88	3.86	
13	9.07	6.70	5.74	5.21	4.86	4.62	4.44	4.30	4.19	4.10	4.02	3.96	3.91	3.86	3.82	3.78	3.75	3.72	3.69	3.66	
14	8.86	6.51	5.56	5.04	4.69	4.46	4.28	4.14	4.03	3.94	3.86	3.80	3.75	3.70	3.66	3.62	3.59	3.56	3.53	3.51	
15	8.68	6.36	5.42	4.89	4.56	4.32	4.14	4.00	3.89	3.80	3.73	3.67	3.61	3.56	3.52	3.49	3.45	3.42	3.40	3.37	
16	8.53	6.23	5.29	4.77	4.44	4.20	4.03	3.89	3.78	3.69	3.62	3.55	3.50	3.45	3.41	3.37	3.34	3.31	3.28	3.26	
17	8.40	6.11	5.18	4.67	4.34	4.10	3.93	3.79	3.68	3.59	3.52	3.46	3.40	3.35	3.31	3.27	3.24	3.21	3.19	3.16	
18	8.29	6.01	5.09	4.58	4.25	4.01	3.84	3.71	3.60	3.51	3.43	3.37	3.32	3.27	3.23	3.19	3.16	3.13	3.10	3.08	
19	8.18	5.93	5.01	4.50	4.17	3.94	3.77	3.63	3.52	3.43	3.36	3.30	3.24	3.19	3.15	3.12	3.08	3.05	3.03	3.00	
20	8.10	5.85	4.94	4.43	4.10	3.87	3.70	3.56	3.46	3.37	3.29	3.23	3.18	3.13	3.09	3.05	3.02	2.99	2.96	2.94	
22	7.95	5.72	4.82	4.31	3.99	3.76	3.59	3.45	3.35	3.26	3.18	3.12	3.07	3.02	2.98	2.94	2.91	2.88	2.85	2.83	
24	7.82	5.61	4.72	4.22	3.90	3.67	3.50	3.36	3.26	3.17	3.09	3.03	2.98	2.93	2.89	2.85	2.82	2.79	2.76	2.74	
26	7.72	5.53	4.64	4.14	3.82	3.59	3.42	3.29	3.18	3.09	3.02	2.96	2.90	2.86	2.81	2.78	2.75	2.72	2.69	2.66	
28	7.64	5.45	4.57	4.07	3.75	3.53	3.36	3.23	3.12	3.03	2.96	2.90	2.84	2.79	2.75	2.72	2.68	2.65	2.63	2.60	
30	7.56	5.39	4.51	4.02	3.70	3.47	3.30	3.17	3.07	2.98	2.91	2.84	2.79	2.74	2.70	2.66	2.63	2.60	2.57	2.55	
35	7.42	5.27	4.40	3.91	3.59	3.37	3.20	3.07	2.96	2.88	2.80	2.74	2.69	2.64	2.60	2.56	2.53	2.50	2.47	2.44	
40	7.31	5.18	4.31	3.83	3.51	3.29	3.12	2.99	2.89	2.80	2.73	2.66	2.61	2.56	2.52	2.48	2.45	2.42	2.39	2.37	
45	7.23	5.11	4.25	3.77	3.45	3.23	3.07	2.94	2.83	2.74	2.67	2.61	2.55	2.51	2.46	2.43	2.39	2.36	2.34	2.31	
50	7.17	5.06	4.20	3.72	3.41	3.19	3.02	2.89	2.78	2.70	2.63	2.56	2.51	2.46	2.42	2.38	2.35	2.32	2.29	2.27	
60	7.08	4.98	4.13	3.65	3.34	3.12	2.95	2.82	2.72	2.63	2.56	2.50	2.44	2.39	2.35	2.31	2.28	2.25	2.22	2.20	
70	7.01	4.92	4.07	3.60	3.29	3.07	2.91	2.78	2.67	2.59	2.51	2.45	2.40	2.35	2.31	2.27	2.23	2.20	2.18	2.15	
80	6.96	4.88	4.04	3.56	3.26	3.04	2.87	2.74	2.64	2.55	2.48	2.42	2.36	2.31	2.27	2.23	2.20	2.17	2.14	2.12	
90	6.93	4.85	4.01	3.53	3.23	3.01	2.84	2.72	2.61	2.52	2.45	2.39	2.33	2.29	2.24	2.21	2.17	2.14	2.11	2.09	
100	6.90	4.82	3.98	3.51	3.21	2.99	2.82	2.69	2.59	2.50	2.43	2.37	2.31	2.27	2.22	2.19	2.15	2.12	2.09	2.07	
120	6.85	4.79	3.95	3.48	3.17	2.96	2.79	2.66	2.56	2.47	2.40	2.34	2.28	2.23	2.19	2.15	2.12	2.09	2.06	2.03	
140	6.82	4.76	3.92	3.46	3.15	2.93	2.77	2.64	2.54	2.45	2.38	2.31	2.26	2.21	2.17	2.13	2.10	2.07	2.04	2.01	
160	6.80	4.74	3.91	3.44	3.13	2.92	2.75	2.62	2.52	2.43	2.36	2.30	2.24	2.20	2.15	2.11	2.08	2.05	2.02	1.99	
180	6.78	4.73	3.89	3.43	3.12	2.90	2.74	2.61	2.51	2.42	2.35	2.28	2.23	2.18	2.14	2.10	2.07	2.04	2.01	1.98	
200	6.76	4.71	3.88	3.41	3.11	2.89	2.73	2.60	2.50	2.41	2.34	2.27	2.22	2.17	2.13	2.09	2.06	2.03	2.00	1.97	
∞	6.64	4.61	3.78	3.32	3.02	2.80	2.64	2.51	2.41	2.32	2.25	2.19	2.13	2.08	2.00	1.97	1.94	1.91	1.88		

DENOMINATOR DEGREES OF FREEDOM

		NUMERATOR DEGREES OF FREEDOM																			
		DENOMINATOR DEGREES OF FREEDOM																			
ν_1	ν_2	22	24	26	28	30	35	40	45	50	60	70	80	90	100	120	140	160	180	200	∞
1	6223	6235	6245	6253	6261	6276	6287	6296	6303	6313	6321	6326	6331	6334	6339	6343	6346	6348	6350	6366	
2	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	99.5	
3	26.6	26.6	26.6	26.5	26.5	26.5	26.4	26.4	26.4	26.4	26.3	26.3	26.3	26.3	26.2	26.2	26.2	26.2	26.2	26.1	
4	14.0	13.9	13.9	13.9	13.8	13.8	13.7	13.7	13.7	13.7	13.6	13.6	13.6	13.6	13.5	13.5	13.5	13.5	13.5	13.5	
5	9.51	9.47	9.43	9.40	9.38	9.33	9.29	9.26	9.24	9.20	9.18	9.16	9.14	9.13	9.11	9.10	9.09	9.08	9.08	9.02	
6	7.35	7.31	7.28	7.25	7.23	7.18	7.14	7.11	7.09	7.06	7.03	7.01	7.00	6.99	6.97	6.96	6.95	6.94	6.93	6.88	
7	6.11	6.07	6.04	6.02	5.99	5.94	5.91	5.88	5.86	5.82	5.80	5.78	5.77	5.75	5.72	5.71	5.70	5.65	5.65	5.65	
8	5.32	5.28	5.25	5.22	5.20	5.15	5.12	5.09	5.07	5.03	5.01	4.99	4.97	4.96	4.95	4.93	4.92	4.91	4.86	4.86	
9	4.77	4.73	4.70	4.67	4.65	4.60	4.57	4.54	4.52	4.48	4.46	4.44	4.43	4.41	4.40	4.39	4.38	4.37	4.36	4.31	
10	4.36	4.33	4.30	4.27	4.25	4.20	4.17	4.14	4.12	4.10	4.08	4.06	4.04	4.03	4.01	4.00	3.98	3.97	3.96	3.91	
11	4.06	4.02	3.99	3.96	3.94	3.89	3.86	3.83	3.81	3.78	3.75	3.73	3.72	3.71	3.69	3.68	3.67	3.66	3.66	3.60	
12	3.82	3.78	3.75	3.72	3.70	3.65	3.62	3.59	3.57	3.54	3.51	3.49	3.47	3.45	3.44	3.43	3.42	3.41	3.36	3.36	
13	3.62	3.59	3.56	3.53	3.51	3.46	3.43	3.40	3.38	3.34	3.32	3.30	3.28	3.27	3.25	3.24	3.23	3.22	3.17	3.17	
14	3.46	3.43	3.40	3.37	3.35	3.30	3.27	3.24	3.22	3.18	3.16	3.14	3.12	3.11	3.09	3.08	3.07	3.06	3.06	3.01	
15	3.33	3.29	3.26	3.24	3.21	3.17	3.13	3.10	3.08	3.05	3.02	3.00	2.99	2.98	2.96	2.95	2.94	2.93	2.92	2.87	
16	3.22	3.18	3.15	3.12	3.10	3.05	3.02	2.99	2.97	2.93	2.91	2.89	2.87	2.86	2.84	2.83	2.82	2.81	2.75	2.75	
17	3.12	3.08	3.05	3.03	3.00	2.96	2.92	2.89	2.87	2.83	2.81	2.79	2.77	2.76	2.75	2.73	2.72	2.71	2.65	2.65	
18	3.03	2.99	2.97	2.94	2.92	2.87	2.84	2.81	2.78	2.75	2.72	2.70	2.69	2.68	2.66	2.65	2.64	2.63	2.62	2.57	
19	2.96	2.92	2.89	2.87	2.84	2.80	2.76	2.73	2.71	2.67	2.65	2.63	2.61	2.60	2.58	2.57	2.56	2.55	2.55	2.49	
20	2.90	2.86	2.83	2.80	2.78	2.73	2.69	2.67	2.64	2.61	2.58	2.56	2.55	2.54	2.52	2.50	2.49	2.48	2.42	2.42	
22	2.78	2.75	2.72	2.69	2.67	2.62	2.58	2.55	2.53	2.50	2.47	2.45	2.43	2.42	2.40	2.39	2.38	2.37	2.36	2.31	
24	2.70	2.66	2.63	2.60	2.58	2.53	2.49	2.46	2.44	2.40	2.38	2.36	2.34	2.33	2.31	2.30	2.29	2.28	2.27	2.21	
26	2.62	2.58	2.55	2.53	2.50	2.45	2.42	2.39	2.36	2.33	2.30	2.28	2.26	2.25	2.22	2.21	2.20	2.19	2.19	2.13	
28	2.56	2.52	2.49	2.46	2.44	2.39	2.35	2.32	2.30	2.26	2.24	2.20	2.19	2.17	2.15	2.14	2.13	2.13	2.07	2.07	
30	2.51	2.47	2.44	2.41	2.39	2.34	2.30	2.27	2.25	2.21	2.18	2.16	2.14	2.13	2.11	2.10	2.09	2.08	2.07	2.01	
35	2.40	2.36	2.33	2.30	2.28	2.23	2.19	2.16	2.14	2.10	2.07	2.05	2.03	2.02	2.00	1.98	1.97	1.96	1.96	1.89	
40	2.33	2.29	2.26	2.23	2.20	2.15	2.11	2.08	2.06	2.02	1.99	1.97	1.95	1.94	1.92	1.90	1.89	1.88	1.87	1.81	
45	2.27	2.23	2.20	2.17	2.14	2.09	2.05	2.02	2.00	1.96	1.93	1.91	1.89	1.88	1.85	1.84	1.83	1.82	1.81	1.74	
50	2.22	2.18	2.15	2.12	2.10	2.05	2.01	1.97	1.95	1.91	1.88	1.86	1.84	1.82	1.80	1.79	1.77	1.76	1.76	1.68	
60	2.15	2.12	2.08	2.05	2.03	1.98	1.94	1.90	1.88	1.84	1.81	1.78	1.76	1.75	1.73	1.71	1.70	1.69	1.68	1.60	
70	2.11	2.07	2.03	2.01	1.98	1.93	1.89	1.85	1.83	1.78	1.75	1.73	1.71	1.70	1.67	1.65	1.64	1.63	1.62	1.54	
80	2.07	2.03	2.00	1.97	1.94	1.89	1.85	1.82	1.79	1.75	1.71	1.69	1.67	1.65	1.63	1.61	1.60	1.59	1.58	1.50	
90	2.00	1.97	1.94	1.92	1.86	1.82	1.79	1.76	1.73	1.70	1.68	1.66	1.64	1.62	1.60	1.58	1.57	1.55	1.55	1.46	
100	2.02	1.98	1.95	1.92	1.89	1.84	1.80	1.76	1.74	1.69	1.66	1.63	1.61	1.60	1.57	1.55	1.54	1.53	1.52	1.43	
120	1.99	1.95	1.92	1.89	1.86	1.81	1.76	1.73	1.70	1.66	1.62	1.58	1.56	1.53	1.50	1.49	1.48	1.48	1.48	1.38	
140	1.97	1.93	1.89	1.86	1.84	1.78	1.74	1.70	1.67	1.63	1.60	1.57	1.55	1.53	1.50	1.48	1.47	1.46	1.45	1.35	
160	1.95	1.91	1.88	1.85	1.82	1.76	1.72	1.68	1.66	1.61	1.58	1.55	1.53	1.51	1.48	1.46	1.45	1.43	1.42	1.32	
180	1.94	1.90	1.86	1.83	1.81	1.75	1.71	1.67	1.64	1.60	1.56	1.53	1.51	1.49	1.47	1.45	1.43	1.42	1.41	1.30	
200	1.93	1.89	1.85	1.82	1.79	1.74	1.69	1.66	1.63	1.58	1.55	1.52	1.50	1.48	1.45	1.43	1.42	1.40	1.39	1.28	
∞	1.83	1.79	1.76	1.73	1.70	1.64	1.59	1.56	1.53	1.48	1.44	1.41	1.38	1.36	1.33	1.30	1.28	1.26	1.25	1.00	

TABLE 6(d) Values of the F -Distribution: $A = .005$ 

		NUMERATOR DEGREES OF FREEDOM																		
		DENOMINATOR DEGREES OF FREEDOM																		
		1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19
ν_1		1	16211	19999	21615	22500	23056	23437	23715	23925	24091	24224	24334	24426	24505	24572	24630	24681	24727	24767
ν_2		2	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199
3		3	55.6	49.8	47.5	46.2	45.4	44.8	44.4	44.1	43.9	43.7	43.5	43.4	43.3	43.2	43.1	43.0	42.9	42.8
4		4	31.3	26.3	24.3	23.2	22.5	22.0	21.6	21.4	21.0	20.8	20.6	20.5	20.4	20.3	20.2	20.1	20.0	20.2
5		5	22.8	18.3	16.5	15.6	14.9	14.5	14.2	14.0	13.8	13.6	13.5	13.4	13.3	13.2	13.1	13.0	12.9	12.9
6		6	18.6	14.5	12.9	12.0	11.5	11.1	10.8	10.6	10.4	10.3	10.1	10.0	9.95	9.88	9.81	9.76	9.71	9.62
7		7	16.2	12.4	10.9	10.1	9.52	9.16	8.89	8.68	8.51	8.38	8.27	8.18	8.10	8.03	7.97	7.91	7.87	7.79
8		8	14.7	11.0	9.60	8.81	8.30	7.95	7.69	7.50	7.34	7.21	7.10	7.01	6.94	6.87	6.81	6.76	6.72	6.68
9		9	13.6	10.1	8.72	7.96	7.47	7.13	6.88	6.69	6.54	6.42	6.31	6.23	6.15	6.09	6.03	5.98	5.94	5.90
10		10	12.8	9.43	8.08	7.34	6.87	6.54	6.30	6.12	5.97	5.85	5.75	5.66	5.59	5.53	5.47	5.42	5.38	5.34
11		11	12.2	8.91	7.60	6.88	6.42	6.10	5.86	5.68	5.54	5.42	5.32	5.24	5.16	5.10	5.05	5.00	4.96	4.89
12		12	11.8	8.51	7.23	6.52	6.07	5.76	5.52	5.35	5.20	5.09	4.99	4.91	4.84	4.77	4.72	4.67	4.63	4.59
13		13	11.4	8.19	6.93	6.23	5.79	5.48	5.25	5.08	4.94	4.82	4.72	4.64	4.57	4.51	4.46	4.41	4.37	4.33
14		14	11.1	7.92	6.68	6.00	5.56	5.26	5.03	4.86	4.72	4.60	4.51	4.43	4.36	4.30	4.25	4.20	4.16	4.06
15		15	10.8	7.70	6.48	5.80	5.37	5.07	4.85	4.67	4.54	4.42	4.33	4.25	4.18	4.12	4.07	4.02	3.98	3.91
16		16	10.6	7.51	6.30	5.64	5.21	4.91	4.69	4.52	4.38	4.27	4.18	4.10	4.03	3.97	3.92	3.87	3.83	3.76
17		17	10.4	7.35	6.16	5.50	5.07	4.78	4.56	4.39	4.25	4.14	4.05	4.05	3.97	3.90	3.84	3.79	3.75	3.67
18		18	10.2	7.21	6.03	5.37	4.96	4.66	4.44	4.28	4.14	4.03	3.94	3.86	3.79	3.73	3.68	3.64	3.60	3.56
19		19	10.1	7.09	5.92	5.27	4.85	4.56	4.34	4.18	4.04	3.93	3.84	3.76	3.70	3.64	3.59	3.54	3.50	3.46
20		20	9.94	6.99	5.82	5.17	4.76	4.47	4.26	4.09	3.96	3.85	3.76	3.68	3.61	3.55	3.50	3.46	3.42	3.35
22		22	9.73	6.81	5.65	5.02	4.61	4.32	4.11	3.94	3.81	3.70	3.61	3.54	3.47	3.41	3.36	3.31	3.27	3.21
24		24	9.55	6.66	5.52	4.89	4.49	4.20	3.99	3.83	3.69	3.59	3.50	3.42	3.35	3.30	3.25	3.20	3.16	3.12
26		26	9.41	6.54	5.41	4.79	4.38	4.10	3.89	3.73	3.60	3.49	3.40	3.33	3.26	3.20	3.15	3.11	3.07	3.03
28		28	9.28	6.44	5.32	4.70	4.30	4.02	3.81	3.65	3.52	3.41	3.32	3.25	3.18	3.12	3.07	3.03	2.99	2.92
30		30	9.18	6.35	5.24	4.62	4.23	3.95	3.74	3.58	3.45	3.34	3.25	3.18	3.11	3.06	3.01	2.96	2.92	2.85
35		35	8.98	6.19	5.09	4.48	4.09	3.81	3.61	3.45	3.32	3.21	3.12	3.05	2.98	2.93	2.88	2.83	2.79	2.72
40		40	8.83	6.07	4.98	4.37	3.99	3.71	3.51	3.35	3.22	3.12	3.03	2.95	2.89	2.83	2.78	2.74	2.70	2.66
45		45	8.71	5.97	4.89	4.29	3.91	3.64	3.43	3.28	3.15	3.04	2.96	2.88	2.82	2.76	2.71	2.66	2.62	2.59
50		50	8.63	5.90	4.83	4.23	3.85	3.58	3.38	3.22	3.09	2.99	2.82	2.76	2.70	2.65	2.61	2.57	2.53	2.47
60		60	8.49	5.79	4.73	4.14	3.76	3.49	3.29	3.13	3.01	2.90	2.82	2.74	2.68	2.62	2.57	2.53	2.49	2.42
70		70	8.40	5.72	4.66	4.08	3.70	3.43	3.23	3.08	2.95	2.85	2.76	2.68	2.62	2.56	2.51	2.47	2.43	2.39
80		80	8.33	5.67	4.61	4.03	3.65	3.39	3.19	3.03	2.91	2.80	2.72	2.64	2.58	2.52	2.47	2.43	2.39	2.35
90		90	8.28	5.62	4.57	3.99	3.62	3.35	3.15	3.00	2.87	2.77	2.68	2.61	2.54	2.49	2.44	2.39	2.35	2.32
100		100	8.24	5.59	4.54	3.96	3.59	3.33	3.13	2.97	2.85	2.74	2.66	2.58	2.52	2.46	2.41	2.37	2.33	2.29
120		120	8.18	5.54	4.50	3.92	3.55	3.28	3.09	2.93	2.81	2.71	2.62	2.54	2.48	2.42	2.37	2.33	2.29	2.25
140		140	8.14	5.50	4.47	3.89	3.52	3.26	3.06	2.91	2.78	2.68	2.59	2.52	2.45	2.40	2.35	2.30	2.26	2.22
160		160	8.10	5.48	4.44	3.87	3.50	3.24	3.04	2.88	2.76	2.66	2.57	2.50	2.43	2.38	2.33	2.28	2.24	2.20
180		180	8.08	5.46	4.42	3.85	3.48	3.22	3.02	2.87	2.74	2.64	2.56	2.48	2.42	2.36	2.31	2.26	2.22	2.17
200		200	8.06	5.44	4.41	3.84	3.47	3.21	3.01	2.86	2.73	2.63	2.54	2.47	2.40	2.35	2.30	2.25	2.21	2.14
∞		7.88	5.30	4.28	3.72	3.35	3.09	2.90	2.75	2.62	2.52	2.43	2.36	2.28	2.24	2.19	2.14	2.10	2.07	2.00

		NUMERATOR DEGREES OF FREEDOM																			
		DENOMINATOR DEGREES OF FREEDOM																			
ν_1	ν_2	22	24	26	28	30	35	40	45	50	60	70	80	90	100	120	140	160	180	200	∞
1	1	24892	24940	24980	25014	25044	25103	25148	25183	25211	25253	25283	25306	25323	25337	25359	25385	25394	25401	25464	199
2	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199	199
3	42.7	42.6	42.6	42.5	42.5	42.4	42.3	42.3	42.2	42.1	42.1	42.1	42.0	42.0	42.0	42.0	42.0	41.9	41.9	41.9	41.8
4	20.1	20.0	20.0	19.9	19.9	19.8	19.8	19.7	19.7	19.6	19.6	19.5	19.5	19.5	19.5	19.4	19.4	19.4	19.4	19.4	19.3
5	12.8	12.8	12.7	12.7	12.6	12.5	12.5	12.5	12.5	12.4	12.4	12.3	12.3	12.3	12.3	12.2	12.2	12.2	12.2	12.2	12.1
6	9.53	9.47	9.43	9.39	9.36	9.29	9.24	9.20	9.17	9.12	9.09	9.06	9.04	9.03	9.00	8.98	8.97	8.96	8.95	8.95	8.88
7	7.69	7.64	7.60	7.57	7.53	7.47	7.42	7.38	7.35	7.31	7.28	7.25	7.23	7.22	7.19	7.18	7.16	7.15	7.15	7.15	7.08
8	6.55	6.50	6.46	6.43	6.40	6.33	6.29	6.25	6.22	6.18	6.15	6.12	6.10	6.09	6.06	6.05	6.04	6.03	6.03	6.03	5.95
9	5.78	5.73	5.69	5.65	5.62	5.56	5.52	5.48	5.45	5.41	5.38	5.36	5.34	5.32	5.30	5.28	5.27	5.26	5.26	5.26	5.19
10	5.22	5.17	5.13	5.10	5.07	5.01	4.97	4.93	4.90	4.86	4.83	4.80	4.79	4.77	4.75	4.73	4.72	4.71	4.71	4.71	4.64
11	4.80	4.76	4.72	4.68	4.65	4.60	4.55	4.52	4.49	4.45	4.41	4.39	4.37	4.36	4.34	4.32	4.31	4.30	4.29	4.29	4.23
12	4.48	4.43	4.39	4.36	4.33	4.27	4.23	4.19	4.17	4.12	4.09	4.07	4.05	4.04	4.01	4.00	3.99	3.98	3.97	3.97	3.91
13	4.22	4.17	4.13	4.10	4.07	4.01	3.97	3.94	3.91	3.87	3.84	3.81	3.79	3.78	3.76	3.74	3.73	3.71	3.71	3.65	3.65
14	4.01	3.96	3.92	3.89	3.86	3.80	3.76	3.73	3.70	3.66	3.62	3.60	3.58	3.57	3.55	3.53	3.52	3.51	3.50	3.44	3.44
15	3.83	3.79	3.75	3.72	3.69	3.63	3.58	3.55	3.52	3.48	3.45	3.43	3.41	3.39	3.37	3.36	3.34	3.34	3.33	3.33	3.26
16	3.68	3.64	3.60	3.57	3.54	3.48	3.44	3.40	3.37	3.33	3.30	3.28	3.26	3.25	3.24	3.21	3.20	3.19	3.18	3.18	3.11
17	3.56	3.51	3.47	3.44	3.41	3.35	3.31	3.28	3.25	3.21	3.18	3.15	3.13	3.12	3.10	3.08	3.07	3.06	3.06	3.06	2.99
18	3.45	3.40	3.36	3.33	3.30	3.25	3.20	3.17	3.14	3.10	3.07	3.04	3.02	3.01	2.99	2.97	2.96	2.95	2.94	2.94	2.87
19	3.35	3.31	3.27	3.24	3.21	3.15	3.11	3.07	3.04	3.00	2.97	2.95	2.93	2.91	2.89	2.87	2.86	2.85	2.85	2.85	2.78
20	3.27	3.22	3.18	3.15	3.12	3.07	3.02	2.99	2.96	2.92	2.88	2.86	2.84	2.83	2.81	2.79	2.78	2.77	2.76	2.69	2.69
22	3.12	3.08	3.04	3.01	2.98	2.92	2.88	2.84	2.82	2.77	2.74	2.72	2.70	2.69	2.66	2.65	2.63	2.62	2.62	2.55	2.55
24	3.01	2.97	2.93	2.90	2.87	2.81	2.77	2.73	2.70	2.66	2.63	2.60	2.58	2.57	2.55	2.53	2.52	2.51	2.50	2.43	2.43
26	2.92	2.87	2.84	2.80	2.77	2.72	2.67	2.64	2.61	2.56	2.53	2.51	2.49	2.47	2.45	2.43	2.42	2.41	2.40	2.33	2.33
28	2.84	2.79	2.76	2.72	2.69	2.64	2.59	2.56	2.53	2.48	2.45	2.43	2.41	2.39	2.37	2.35	2.34	2.33	2.32	2.25	2.25
30	2.77	2.73	2.69	2.66	2.63	2.57	2.52	2.49	2.46	2.42	2.38	2.36	2.34	2.32	2.30	2.28	2.27	2.26	2.26	2.25	2.18
35	2.64	2.60	2.56	2.53	2.50	2.44	2.39	2.36	2.33	2.28	2.25	2.22	2.20	2.19	2.16	2.15	2.13	2.12	2.11	2.04	2.04
40	2.55	2.50	2.46	2.43	2.40	2.34	2.30	2.26	2.23	2.18	2.15	2.12	2.10	2.09	2.06	2.05	2.03	2.02	2.01	1.93	1.93
45	2.47	2.43	2.39	2.36	2.33	2.27	2.22	2.19	2.16	2.11	2.08	2.05	2.03	2.01	1.99	1.97	1.95	1.94	1.93	1.85	1.85
50	2.42	2.37	2.33	2.30	2.27	2.21	2.16	2.13	2.10	2.05	2.02	1.99	1.97	1.95	1.93	1.91	1.89	1.88	1.87	1.79	1.79
60	2.33	2.29	2.25	2.22	2.19	2.13	2.08	2.04	2.01	1.96	1.93	1.90	1.88	1.86	1.83	1.81	1.80	1.79	1.78	1.69	1.69
70	2.28	2.23	2.19	2.16	2.13	2.07	2.02	1.98	1.95	1.90	1.86	1.84	1.81	1.80	1.77	1.75	1.73	1.72	1.71	1.62	1.62
80	2.23	2.19	2.15	2.11	2.08	2.02	1.97	1.94	1.90	1.85	1.82	1.79	1.77	1.75	1.72	1.70	1.68	1.67	1.66	1.57	1.57
90	2.20	2.15	2.12	2.08	2.05	1.99	1.94	1.90	1.87	1.82	1.78	1.75	1.73	1.71	1.68	1.66	1.64	1.63	1.62	1.52	1.52
100	2.17	2.13	2.09	2.05	2.01	1.98	1.92	1.87	1.83	1.80	1.75	1.71	1.68	1.64	1.61	1.58	1.57	1.55	1.54	1.43	1.43
120	2.13	2.09	2.05	2.01	1.98	1.92	1.87	1.83	1.80	1.77	1.72	1.68	1.65	1.62	1.60	1.57	1.55	1.53	1.52	1.51	1.39
140	2.11	2.06	2.02	1.99	1.96	1.89	1.84	1.80	1.77	1.72	1.68	1.65	1.62	1.60	1.58	1.55	1.52	1.51	1.49	1.48	1.36
160	2.09	2.04	2.00	1.97	1.93	1.87	1.82	1.78	1.75	1.69	1.65	1.62	1.60	1.58	1.55	1.52	1.51	1.49	1.47	1.46	1.34
180	2.07	2.02	1.98	1.95	1.92	1.85	1.80	1.76	1.73	1.68	1.64	1.61	1.58	1.55	1.51	1.49	1.47	1.45	1.44	1.32	1.32
200	2.06	2.01	1.97	1.94	1.91	1.84	1.79	1.75	1.71	1.66	1.62	1.59	1.54	1.49	1.46	1.43	1.37	1.34	1.31	1.28	1.00
∞	1.95	1.90	1.86	1.82	1.79	1.72	1.67	1.63	1.59	1.54	1.49	1.46	1.43	1.40	1.37	1.34	1.31	1.30	1.30	1.28	1.00

DENOMINATOR DEGREES OF FREEDOM

TABLE 7(a) Critical Values of the Studentized Range, $\alpha = .05$

ν	k	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
1	18.0	27.0	32.8	37.1	40.4	43.1	45.4	47.4	49.1	50.6	52.0	53.2	54.3	55.4	56.3	57.2	58.0	58.8	59.6	
2	6.08	8.33	9.80	10.9	11.7	12.4	13.0	13.5	14.0	14.4	14.7	15.1	15.4	15.7	15.9	16.1	16.4	16.6	16.8	
3	4.50	5.91	6.82	7.50	8.04	8.48	8.85	9.18	9.46	9.72	9.95	10.2	10.3	10.5	10.7	10.8	11.0	11.1	11.2	
4	3.93	5.04	5.76	6.29	6.71	7.05	7.35	7.60	7.83	8.03	8.21	8.37	8.52	8.66	8.79	8.91	9.03	9.13	9.23	
5	3.64	4.60	5.22	5.67	6.03	6.33	6.58	6.80	6.99	7.17	7.32	7.47	7.60	7.72	7.83	7.93	8.03	8.12	8.21	
6	3.46	4.34	4.90	5.30	5.63	5.90	6.12	6.32	6.49	6.65	6.79	6.92	7.03	7.14	7.24	7.34	7.43	7.51	7.59	
7	3.34	4.16	4.68	5.06	5.36	5.61	5.82	6.00	6.16	6.30	6.43	6.55	6.66	6.76	6.85	6.94	7.02	7.10	7.17	
8	3.26	4.04	4.53	4.89	5.17	5.40	5.60	5.77	5.92	6.05	6.18	6.29	6.39	6.48	6.57	6.65	6.73	6.80	6.87	
9	3.20	3.95	4.41	4.76	5.02	5.24	5.43	5.59	5.74	5.87	5.98	6.09	6.19	6.28	6.36	6.44	6.51	6.58	6.64	
10	3.15	3.88	4.33	4.65	4.91	5.12	5.30	5.46	5.60	5.72	5.83	5.93	6.03	6.11	6.19	6.27	6.34	6.40	6.47	
11	3.11	3.82	4.26	4.57	4.82	5.03	5.20	5.35	5.49	5.61	5.71	5.81	5.90	5.98	6.06	6.13	6.20	6.27	6.33	
12	3.08	3.77	4.20	4.51	4.75	4.95	5.12	5.27	5.39	5.51	5.61	5.71	5.80	5.88	5.95	6.02	6.09	6.15	6.21	
13	3.06	3.73	4.15	4.45	4.69	4.88	5.05	5.19	5.32	5.43	5.53	5.63	5.71	5.79	5.86	5.93	5.99	6.05	6.11	
14	3.03	3.70	4.11	4.41	4.64	4.83	4.99	5.13	5.25	5.36	5.46	5.55	5.64	5.71	5.79	5.85	5.91	5.97	6.03	
15	3.01	3.67	4.08	4.37	4.59	4.78	4.94	5.08	5.20	5.31	5.40	5.49	5.57	5.65	5.72	5.78	5.85	5.90	5.96	
16	3.00	3.65	4.05	4.33	4.56	4.74	4.90	5.03	5.15	5.26	5.35	5.44	5.52	5.59	5.66	5.73	5.79	5.84	5.90	
17	2.98	3.63	4.02	4.30	4.52	4.70	4.86	4.99	5.11	5.21	5.31	5.39	5.47	5.54	5.61	5.67	5.73	5.79	5.84	
18	2.97	3.61	4.00	4.28	4.49	4.67	4.82	4.96	5.07	5.17	5.27	5.35	5.43	5.50	5.57	5.63	5.69	5.74	5.79	
19	2.96	3.59	3.98	4.25	4.47	4.65	4.79	4.92	5.04	5.14	5.23	5.31	5.39	5.46	5.53	5.59	5.65	5.70	5.75	
20	2.95	3.58	3.96	4.23	4.45	4.62	4.77	4.90	5.01	5.11	5.20	5.28	5.36	5.43	5.49	5.55	5.61	5.66	5.71	
24	2.92	3.53	3.90	4.17	4.37	4.54	4.68	4.81	4.92	5.01	5.10	5.18	5.25	5.32	5.38	5.44	5.49	5.55	5.59	
30	2.89	3.49	3.85	4.10	4.30	4.46	4.60	4.72	4.82	4.92	5.00	5.08	5.15	5.21	5.27	5.33	5.38	5.43	5.47	
40	2.86	3.44	3.79	4.04	4.23	4.39	4.52	4.63	4.73	4.82	4.90	4.98	5.04	5.11	5.16	5.22	5.27	5.31	5.36	
60	2.83	3.40	3.74	3.98	4.16	4.31	4.44	4.55	4.65	4.73	4.81	4.88	4.94	5.00	5.06	5.11	5.15	5.20	5.24	
120	2.80	3.36	3.68	3.92	4.10	4.24	4.36	4.47	4.56	4.64	4.71	4.78	4.84	4.90	4.95	5.00	5.04	5.09	5.13	
∞	2.77	3.31	3.63	3.86	4.03	4.17	4.29	4.39	4.47	4.55	4.62	4.68	4.74	4.80	4.85	4.89	4.93	4.97	5.01	

TABLE 7(b) Critical Values of the Studentized Range, $\alpha = .01$

ν	k										
	2	3	4	5	6	7	8	9	10	11	
1	90.0	135	164	186	202	216	227	237	246	253	260
2	14.0	19.0	22.3	24.7	26.6	28.2	29.5	30.7	31.7	32.6	33.4
3	8.26	10.6	12.2	13.3	14.2	15.0	15.6	16.2	16.7	17.1	17.5
4	6.51	8.12	9.17	9.96	10.6	11.1	11.5	11.9	12.3	12.6	12.8
5	5.70	6.97	7.80	8.42	8.91	9.32	9.67	9.97	10.2	10.5	10.7
6	5.24	6.33	7.03	7.56	7.97	8.32	8.61	8.87	9.10	9.30	9.49
7	4.95	5.92	6.54	7.01	7.37	7.68	7.94	8.17	8.37	8.55	8.71
8	4.74	5.63	6.20	6.63	6.96	7.24	7.47	7.68	7.87	8.03	8.18
9	4.60	5.43	5.96	6.35	6.66	6.91	7.13	7.32	7.49	7.65	7.78
10	4.48	5.27	5.77	6.14	6.43	6.67	6.87	7.05	7.21	7.36	7.48
11	4.39	5.14	5.62	5.97	6.25	6.48	6.67	6.84	6.99	7.13	7.25
12	4.32	5.04	5.50	5.84	6.10	6.32	6.51	6.67	6.81	6.94	7.06
13	4.26	4.96	5.40	5.73	5.98	6.19	6.37	6.53	6.67	6.79	6.90
14	4.21	4.89	5.32	5.63	5.88	6.08	6.26	6.41	6.54	6.66	6.77
15	4.17	4.83	5.25	5.56	5.80	5.99	6.16	6.31	6.44	6.55	6.66
16	4.13	4.78	5.19	5.49	5.72	5.92	6.08	6.22	6.35	6.46	6.56
17	4.10	4.74	5.14	5.43	5.66	5.85	6.01	6.15	6.27	6.38	6.48
18	4.07	4.70	5.09	5.38	5.60	5.79	5.94	6.08	6.20	6.31	6.41
19	4.05	4.67	5.05	5.33	5.55	5.73	5.89	6.02	6.14	6.25	6.34
20	4.02	4.64	5.02	5.29	5.51	5.69	5.84	5.97	6.09	6.19	6.29
24	3.96	4.54	4.91	5.17	5.37	5.54	5.69	5.81	5.92	6.02	6.11
30	3.89	4.45	4.80	5.05	5.24	5.40	5.54	5.65	5.76	5.85	5.93
40	3.82	4.37	4.70	4.93	5.11	5.27	5.39	5.50	5.60	5.69	5.77
60	3.76	4.28	4.60	4.82	4.99	5.13	5.25	5.36	5.45	5.53	5.60
120	3.70	4.20	4.50	4.71	4.87	5.01	5.12	5.21	5.30	5.38	5.44
∞	3.64	4.12	4.40	4.60	4.76	4.88	4.99	5.08	5.16	5.23	5.29

Source: From E. S. Pearson and H. O. Hartley, *Biometrika Tables for Statisticians*, 1: 176–77. Reproduced by permission of the Biometrika Trustees.

TABLE 8(a) Critical Values for the Durbin-Watson Statistic, $\alpha = .05$

n	$k = 1$		$k = 2$		$k = 3$		$k = 4$		$k = 5$	
	d_L	d_U								
15	1.08	1.36	.95	1.54	.82	1.75	.69	1.97	.56	2.21
16	1.10	1.37	.98	1.54	.86	1.73	.74	1.93	.62	2.15
17	1.13	1.38	1.02	1.54	.90	1.71	.78	1.90	.67	2.10
18	1.16	1.39	1.05	1.53	.93	1.69	.82	1.87	.71	2.06
19	1.18	1.40	1.08	1.53	.97	1.68	.86	1.85	.75	2.02
20	1.20	1.41	1.10	1.54	1.00	1.68	.90	1.83	.79	1.99
21	1.22	1.42	1.13	1.54	1.03	1.67	.93	1.81	.83	1.96
22	1.24	1.43	1.15	1.54	1.05	1.66	.96	1.80	.86	1.94
23	1.26	1.44	1.17	1.54	1.08	1.66	.99	1.79	.90	1.92
24	1.27	1.45	1.19	1.55	1.10	1.66	1.01	1.78	.93	1.90
25	1.29	1.45	1.21	1.55	1.12	1.66	1.04	1.77	.95	1.89
26	1.30	1.46	1.22	1.55	1.14	1.65	1.06	1.76	.98	1.88
27	1.32	1.47	1.24	1.56	1.16	1.65	1.08	1.76	1.01	1.86
28	1.33	1.48	1.26	1.56	1.18	1.65	1.10	1.75	1.03	1.85
29	1.34	1.48	1.27	1.56	1.20	1.65	1.12	1.74	1.05	1.84
30	1.35	1.49	1.28	1.57	1.21	1.65	1.14	1.74	1.07	1.83
31	1.36	1.50	1.30	1.57	1.23	1.65	1.16	1.74	1.09	1.83
32	1.37	1.50	1.31	1.57	1.24	1.65	1.18	1.73	1.11	1.82
33	1.38	1.51	1.32	1.58	1.26	1.65	1.19	1.73	1.13	1.81
34	1.39	1.51	1.33	1.58	1.27	1.65	1.21	1.73	1.15	1.81
35	1.40	1.52	1.34	1.58	1.28	1.65	1.22	1.73	1.16	1.80
36	1.41	1.52	1.35	1.59	1.29	1.65	1.24	1.73	1.18	1.80
37	1.42	1.53	1.36	1.59	1.31	1.66	1.25	1.72	1.19	1.80
38	1.43	1.54	1.37	1.59	1.32	1.66	1.26	1.72	1.21	1.79
39	1.43	1.54	1.38	1.60	1.33	1.66	1.27	1.72	1.22	1.79
40	1.44	1.54	1.39	1.60	1.34	1.66	1.29	1.72	1.23	1.79
45	1.48	1.57	1.43	1.62	1.38	1.67	1.34	1.72	1.29	1.78
50	1.50	1.59	1.46	1.63	1.42	1.67	1.38	1.72	1.34	1.77
55	1.53	1.60	1.49	1.64	1.45	1.68	1.41	1.72	1.38	1.77
60	1.55	1.62	1.51	1.65	1.48	1.69	1.44	1.73	1.41	1.77
65	1.57	1.63	1.54	1.66	1.50	1.70	1.47	1.73	1.44	1.77
70	1.58	1.64	1.55	1.67	1.52	1.70	1.49	1.74	1.46	1.77
75	1.60	1.65	1.57	1.68	1.54	1.71	1.51	1.74	1.49	1.77
80	1.61	1.66	1.59	1.69	1.56	1.72	1.53	1.74	1.51	1.77
85	1.62	1.67	1.60	1.70	1.57	1.72	1.55	1.75	1.52	1.77
90	1.63	1.68	1.61	1.70	1.59	1.73	1.57	1.75	1.54	1.78
95	1.64	1.69	1.62	1.71	1.60	1.73	1.58	1.75	1.56	1.78
100	1.65	1.69	1.63	1.72	1.61	1.74	1.59	1.76	1.57	1.78

Source: From J. Durbin and G. S. Watson, "Testing for Serial Correlation in Least Squares Regression, II," *Biometrika* 30 (1951): 159–78. Reproduced by permission of the Biometrika Trustees.

TABLE 8(b) Critical Values for the Durbin-Watson Statistic, $\alpha = .01$

n	$k = 1$		$k = 2$		$k = 3$		$k = 4$		$k = 5$	
	d_L	d_U								
15	.81	1.07	.70	1.25	.59	1.46	.49	1.70	.39	1.96
16	.84	1.09	.74	1.25	.63	1.44	.53	1.66	.44	1.90
17	.87	1.10	.77	1.25	.67	1.43	.57	1.63	.48	1.85
18	.90	1.12	.80	1.26	.71	1.42	.61	1.60	.52	1.80
19	.93	1.13	.83	1.26	.74	1.41	.65	1.58	.56	1.77
20	.95	1.15	.86	1.27	.77	1.41	.68	1.57	.60	1.74
21	.97	1.16	.89	1.27	.80	1.41	.72	1.55	.63	1.71
22	1.00	1.17	.91	1.28	.83	1.40	.75	1.54	.66	1.69
23	1.02	1.19	.94	1.29	.86	1.40	.77	1.53	.70	1.67
24	1.04	1.20	.96	1.30	.88	1.41	.80	1.53	.72	1.66
25	1.05	1.21	.98	1.30	.90	1.41	.83	1.52	.75	1.65
26	1.07	1.22	1.00	1.31	.93	1.41	.85	1.52	.78	1.64
27	1.09	1.23	1.02	1.32	.95	1.41	.88	1.51	.81	1.63
28	1.10	1.24	1.04	1.32	.97	1.41	.90	1.51	.83	1.62
29	1.12	1.25	1.05	1.33	.99	1.42	.92	1.51	.85	1.61
30	1.13	1.26	1.07	1.34	1.01	1.42	.94	1.51	.88	1.61
31	1.15	1.27	1.08	1.34	1.02	1.42	.96	1.51	.90	1.60
32	1.16	1.28	1.10	1.35	1.04	1.43	.98	1.51	.92	1.60
33	1.17	1.29	1.11	1.36	1.05	1.43	1.00	1.51	.94	1.59
34	1.18	1.30	1.13	1.36	1.07	1.43	1.01	1.51	.95	1.59
35	1.19	1.31	1.14	1.37	1.08	1.44	1.03	1.51	.97	1.59
36	1.21	1.32	1.15	1.38	1.10	1.44	1.04	1.51	.99	1.59
37	1.22	1.32	1.16	1.38	1.11	1.45	1.06	1.51	1.00	1.59
38	1.23	1.33	1.18	1.39	1.12	1.45	1.07	1.52	1.02	1.58
39	1.24	1.34	1.19	1.39	1.14	1.45	1.09	1.52	1.03	1.58
40	1.25	1.34	1.20	1.40	1.15	1.46	1.10	1.52	1.05	1.58
45	1.29	1.38	1.24	1.42	1.20	1.48	1.16	1.53	1.11	1.58
50	1.32	1.40	1.28	1.45	1.24	1.49	1.20	1.54	1.16	1.59
55	1.36	1.43	1.32	1.47	1.28	1.51	1.25	1.55	1.21	1.59
60	1.38	1.45	1.35	1.48	1.32	1.52	1.28	1.56	1.25	1.60
65	1.41	1.47	1.38	1.50	1.35	1.53	1.31	1.57	1.28	1.61
70	1.43	1.49	1.40	1.52	1.37	1.55	1.34	1.58	1.31	1.61
75	1.45	1.50	1.42	1.53	1.39	1.56	1.37	1.59	1.34	1.62
80	1.47	1.52	1.44	1.54	1.42	1.57	1.39	1.60	1.36	1.62
85	1.48	1.53	1.46	1.55	1.43	1.58	1.41	1.60	1.39	1.63
90	1.50	1.54	1.47	1.56	1.45	1.59	1.43	1.61	1.41	1.64
95	1.51	1.55	1.49	1.57	1.47	1.60	1.45	1.62	1.42	1.64
100	1.52	1.56	1.50	1.58	1.48	1.60	1.46	1.63	1.44	1.65

Source: From J. Durbin and G. S. Watson, "Testing for Serial Correlation in Least Squares Regression, II," Biometrika 30 (1951): 159–78.
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TABLE 9 Critical Values for the Wilcoxon Rank Sum Test

		(a) $\alpha = .025$ one-tail; $\alpha = .05$ two-tail															
		3		4		5		6		7		8		9		10	
n_1	n_2	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U		
4	6	18	11	25	17	33	23	43	31	53	40	64	50	76	61	89	
5	6	11	12	28	18	37	25	47	33	58	42	70	52	83	64	96	
6	7	23	12	32	19	41	26	52	35	63	44	76	55	89	66	104	
7	7	26	13	35	20	45	28	56	37	68	47	81	58	95	70	110	
8	8	28	14	38	21	49	29	61	39	63	49	87	60	102	73	117	
9	8	31	15	41	22	53	31	65	41	78	51	93	63	108	76	124	
10	9	33	16	44	24	56	32	70	43	83	54	98	66	114	79	131	
		(b) $\alpha = .05$ one-tail; $\alpha = 10$ two-tail															
		3		4		5		6		7		8		9		10	
n_1	n_2	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U	T_L	T_U		
3	6	15	11	21	16	29	23	37	31	46	39	57	49	68	60	80	
4	7	17	12	24	18	32	25	41	33	51	42	62	52	74	63	87	
5	7	20	13	27	19	37	26	46	35	56	45	67	55	80	66	94	
6	8	22	14	30	20	40	28	50	37	61	47	73	57	87	69	101	
7	9	24	15	33	22	43	30	54	39	66	49	79	60	93	73	107	
8	9	27	16	36	24	46	32	58	41	71	52	84	63	99	76	114	
9	10	29	17	39	25	50	33	63	43	76	54	90	66	105	79	121	
10	11	31	18	42	26	54	35	67	46	80	57	95	69	111	83	127	

Source: From F. Wilcoxon and R. A. Wilcox, "Some Rapid Approximate Statistical Procedures" (1964), p. 28. Reproduced with the permission of American Cyanamid Company.

TABLE 10
Critical Values for the
Wilcoxon Signed Rank
Sum Test

<i>n</i>	(a) $\alpha = .025$ one-tail; $\alpha = .05$ two-tail		(b) $\alpha = .05$ one-tail; $\alpha = .10$ two-tail	
	<i>T_L</i>	<i>T_U</i>	<i>T_L</i>	<i>T_U</i>
6	1	20	2	19
7	2	26	4	24
8	4	32	6	30
9	6	39	8	37
10	8	47	11	44
11	11	55	14	52
12	14	64	17	61
13	17	74	21	70
14	21	84	26	79
15	25	95	30	90
16	30	106	36	100
17	35	118	41	112
18	40	131	47	124
19	46	144	54	136
20	52	158	60	150
21	59	172	68	163
22	66	187	75	178
23	73	203	83	193
24	81	219	92	208
25	90	235	101	224
26	98	253	110	241
27	107	271	120	258
28	117	289	130	276
29	127	308	141	294
30	137	328	152	313

Source: From F. Wilcoxon and R. A. Wilcox, "Some Rapid Approximate Statistical Procedures" (1964), p.28. Reproduced with the permission of American Cyanamid Company.

TABLE 11 Critical Values for the Spearman Rank Correlation Coefficient

n	$\alpha = .05$	$\alpha = .025$	$\alpha = .01$
5	.900	—	—
6	.829	.886	.943
7	.714	.786	.893
8	.643	.738	.833
9	.600	.683	.783
10	.564	.648	.745
11	.523	.623	.736
12	.497	.591	.703
13	.475	.566	.673
14	.457	.545	.646
15	.441	.525	.623
16	.425	.507	.601
17	.412	.490	.582
18	.399	.476	.564
19	.388	.462	.549
20	.377	.450	.534
21	.368	.438	.521
22	.359	.428	.508
23	.351	.418	.496
24	.343	.409	.485
25	.336	.400	.475
26	.329	.392	.465
27	.323	.385	.456
28	.317	.377	.448
29	.311	.370	.440
30	.305	.364	.432

Source: From E. G. Olds, "Distribution of Sums of Squares of Rank Differences for Small Samples," *Annals of Mathematical Statistics* 9 (1938). Reproduced with the permission of the Institute of Mathematical Statistics.

TABLE 12 Control Chart Constants

SAMPLE SIZE <i>n</i>	<i>A</i> ₂	<i>d</i> ₂	<i>d</i> ₃	<i>D</i> ₃	<i>D</i> ₄
2	1.880	1.128	.853	.000	3.267
3	1.023	1.693	.888	.000	2.575
4	.729	2.059	.880	.000	2.282
5	.577	2.326	.864	.000	2.115
6	.483	2.534	.848	.000	2.004
7	.419	2.704	.833	.076	1.924
8	.373	2.847	.820	.136	1.864
9	.337	2.970	.808	.184	1.816
10	.308	3.078	.797	.223	1.777
11	.285	3.173	.787	.256	1.744
12	.266	3.258	.778	.284	1.716
13	.249	3.336	.770	.308	1.692
14	.235	3.407	.762	.329	1.671
15	.223	3.472	.755	.348	1.652
16	.212	3.532	.749	.364	1.636
17	.203	3.588	.743	.379	1.621
18	.194	3.640	.738	.392	1.608
19	.187	3.689	.733	.404	1.596
20	.180	3.735	.729	.414	1.586
21	.173	3.778	.724	.425	1.575
22	.167	3.819	.720	.434	1.566
23	.162	3.858	.716	.443	1.557
24	.157	3.895	.712	.452	1.548
25	.153	3.931	.709	.459	1.541

Source: From E. S. Pearson, "The Percentage Limits for the Distribution of Range in Samples from a Normal Population," *Biometrika* 24 (1932): 416. Reproduced by permission of the Biometrika Trustees.

APPENDIX C

ANSWERS TO SELECTED EVEN-NUMBERED EXERCISES

All answers have been double-checked for accuracy. However, we cannot be absolutely certain that there are no errors. Students should not automatically assume that answers that don't match ours are wrong. When and if we discover mistakes, we will post corrected answers on our web page. (See page 10 for the address.) If you find any errors, please email the author (address on web page). We will be happy to acknowledge you with the discovery.

Chapter 1

- 1.2 Descriptive statistics summarizes a set of data. Inferential statistics makes inferences about populations from samples.
- 1.4 a. The complete production run
b. 1000 chips
c. Proportion defective
d. Proportion of sample chips that are defective (7.5%)
e. Parameter
f. Statistic
g. Because the sample proportion is less than 10%, we can conclude that the claim is true.
- 1.6 a. Flip the coin 100 times and count the number of heads and tails.
b. Outcomes of flips
c. Outcomes of the 100 flips
d. Proportion of heads
e. Proportion of heads in the 100 flips
- 1.8 a. Fuel mileage of all the taxis in the fleet.
b. Mean mileage
c. The 50 observations
d. Mean of the 50 observations
e. The statistic would be used to estimate the parameter from which the owner can calculate total costs.
- We computed the sample mean to be 19.8 mpg.

Chapter 2

- 2.2 a. Interval b. Interval
c. Nominal d. Ordinal
- 2.4 a. Nominal b. Interval
c. Nominal d. Interval e. Ordinal
- 2.6 a. Interval b. Interval
c. Nominal d. Ordinal e. Interval
- 2.8 a. Interval b. Ordinal
c. Nominal d. Ordinal
- 2.10 a. Ordinal b. Ordinal c. Ordinal

- 2.38 Three out of four Americans are White.
- 2.40 The "Less than high school" category has remained constant, while the number of college graduates has increased.
- 2.42 The dominant source in Australia is coal. In New Zealand it is oil.
- 2.44 Universities 1 and 2 are similar and quite dissimilar from universities 3 and 4, which also differ. The two nominal variables appear to be related.
- 2.46 The two variables are related.
- 2.48 The number of prescriptions filled by all stores except independent drug stores has increased.
- 2.50 More than 40% rate the food as less than good.
- 2.52 There are considerable differences between the two countries.
- 2.54 Customers with children rated the restaurant more highly than did customers with no children.
- 2.56 The United States owes a lot of money to many lenders.
- 3.2 Chapter 3
- 3.2 10 or 11
- 3.4 a. 7 to 9
b. 5.25, 5.40, 5.55, 5.70, 5.85, 6.00, 6.15
- 3.6 c. The number of pages is bimodal and slightly positively skewed.
- 3.8 The histogram is bimodal.
- 3.10 c. The number of stores is bimodal and positively skewed.
- 3.12 d. The histogram is symmetric (approximately) and bimodal.
- 3.14 d. The histogram is slightly positively skewed, unimodal, and not bell-shaped.
- 3.16 a. The histogram should contain 9 or 10 bins.
b. The histogram is positively skewed.
d. The histogram is not bell-shaped.
- 3.18 The histogram is unimodal, bell-shaped, and roughly symmetric. Most of the heights lie between 18 and 23 inches.
- 3.20 The histogram is unimodal, symmetric, and bell-shaped. Most tomatoes weigh between 2 and 7 ounces with a small fraction weighing less than 2 ounces or more than 7 ounces.
- 3.22 The histogram of the number of books shipped daily is negatively skewed. It appears that there is a maximum number that the company can ship.
- 3.24 The histogram is highly positively skewed indicating that most people watch four or less hours per day with some watching considerably more.
- 3.26 Many people work more than 40 hours per week.
- 3.28 The mode is 0. For Americans with children the mode is 2.
- 3.30 After a rapid increase the numbers have leveled off.
- 3.32 The numbers of females and males are both increasing with the number of females increasing faster.
- 3.34 The per capita number of property crimes decreased faster than did the absolute number of property crimes.
- 3.36 Until about five years ago consumption was increasing and production was falling. However, there appears to be a change in both trends.
- 3.38 Over the last 28 years both receipts and outlays increased rapidly. There was a five-year period in which receipts were higher than outlays. After 2004 the deficit increased precipitously.
- 3.40 The inflation adjusted deficits are just as bad.
- 3.42 Imports from Canada have greatly exceeded exports to Canada.
- 3.44 In the early seventies, the Canadian dollar was worth more than the U.S. dollar. By the late seventies, the Canadian lost ground but has recently recovered.
- 3.46 The index grew slowly until month 400 and then grew quickly until month 600. It then fell sharply and recently recovered.
- 3.48 There does not appear to be a linear relationship between the two variables.
- 3.50 b. There is a positive linear relationship between calculus and statistics marks.
- 3.52 b. There is a moderately strong positive linear relationship. In general, those with more education use the Internet more frequently.

- 3.54 b.** There is a moderately strong positive linear relationship.
- 3.56** There is a very weak positive linear relationship.
- 3.58** There is a moderately strong positive linear relationship.
- 3.60** There is a moderately strong positive linear relationship.
- 3.62** There does not appear to be any relationship between the two variables.
- 3.64** There does not appear to be a linear relationship.
- 3.66** There does not appear to be a linear relationship between the two variables.
- 3.68** There is a moderately strong positive linear relationship between the education levels of spouses.
- 3.70** There is a weak positive linear relationship between the amount of education of mothers and their children.
- 3.76 c.** The accident rate generally decreases as the ages increase. The fatal accident rate decreases until the over 64 age category where there is an increase.
- 3.80** There is no linear relationship between the inflation rate and the return on the precious metals sub-index.
- 3.82** There is a strong positive linear relationship.
- 3.84** The histogram of the number of crashes is positively skewed.
- 3.86** There is no linear relationship between the Dow Jones Industrial average and the unemployment rate.
- 3.88** There is a strong positive linear relationship. Poorer players take longer to complete their rounds.
- 3.90** There is a moderately strong negative linear relationship.
- 3.96** There appears to be a stronger linear relationship between marks in the mathematical statistics course and calculus than the relationship between the marks in the business statistics course and the marks in calculus.
- 3.98 a.** The histogram is approximately bell-shaped and symmetric.
- b.** There is no linear relationship between the amount of time needed to land a job and salary.

Chapter 4

- 4.2** $\bar{x} = 6$, median = 5, mode = 5
- 4.4 a.** $\bar{x} = 39.33$, median = 38, mode = all
- 4.6** $R_g = .19$
- 4.8 a.** $\bar{x} = .106$, median = .10
b. $R_g = .102$ **c.** Geometric mean
- 4.10 a.** .20, 0, .25, .33
b. $\bar{x} = .195$, median = .225
c. $R_g = .188$
d. Geometric mean

- 4.12 a.** $\bar{x} = 75,750$, median = 76,410
- 4.14 b.** The mean expenditure is \$110.06 and half the sample spent less than \$117.00.
- 4.16 b.** The mean percentage is .81. Half the sample paid less than .84.
- 4.18 b.** The mean expenditure is \$656.39. Half the sample spent less than \$648.50.
- 4.20** $s^2 = 1.14$
- 4.22** $s^2 = 15.12$, $s = 3.89$
- 4.24 a.** $s^2 = 51.5$ **b.** $s^2 = 6.5$
c. $s^2 = 174.5$
- 4.26** 6, 6, 6, 6, 6
- 4.28 a.** 16% **b.** 97.5% **c.** 16%
- 4.30 a.** nothing
b. at least 75% lie between 60 and 180
c. at least 88.9% lie between 30 and 210
- 4.32** $s^2 = 40.73 \text{ mph}^2$, $s = 6.38 \text{ mph}$; at least 75% of the speeds lie within 12.76 mph of the mean; at least 88.9% of the speeds lie within 19.14 mph of the mean.
- 4.34** $s^2 = 0.858 \text{ cm}^2$, and $s = .2929 \text{ cm}$; at least 75% of the lengths lie within .5858 of the mean; at least 88.9% of the rods will lie within .8787 cm of the mean.
- 4.36 a.** $s = 15.01$
- 4.38 a.** $\bar{x} = 77.86$ and $s = 85.35$
c. The histogram is positively skewed. At least 75% of American adults watch between 0 and 249 minutes of television.
- 4.40** 3, 5, 7
- 4.42** 44.6, 55.2
- 4.44** 6.6, 17.6
- 4.46** 4
- 4.50 a.** 2, 4, 8
b. Most executives spend little time reading resumes. Keep it short.
- 4.52** 50, 125, 260; the amounts are positively skewed.
- 4.54 b.** 145.11, 164.17, 175.18
c. There are no outliers.
d. The data are positively skewed. One-quarter of the times are below 145.11 and one-quarter are above 175.18.
- 4.56 a.** 26, 28.5, 32
b. The times are positively skewed.
- 4.58** Americans spend more time watching news on television than reading news on the Internet.
- 4.60** The two sets of numbers are quite similar.
- 4.62** 1, 2, 4; the number of hours of television watching is highly positively skewed.
- 4.64 a.** -.7813; there is a moderately strong negative linear relationship.
b. 61.04% of the variation in y is explained by the variation in x .
- 4.66 a.** 216.32 **b.** .8811 **c.** .7763
d. $\hat{y} = 5.917 + 1.705x$
e. There is a strong positive linear relationship between marks and study time. For each additional hour of study time, marks increased on average by 1.705.
- 4.68** 40.09% of the variation in the employment rate is explained by the variation in the unemployment rate.
- 4.70** Only 0.78% of the variation in the number of houses sold is explained by the variation in interest rates.
- 4.72** $R^2 = .0069$; there is a very weak positive relationship between the two variables.
- 4.74** $\hat{y} = 263.4 + 71.65x$; estimated fixed costs = \$263.40, estimated variable costs = \$71.65
- 4.76 b.** Home attendance increases on average by 41,340 for each win. 46.41% of the variation in home attendance is explained by the variation in the number of wins.
- 4.78 a.** 9.15% of the variation in away attendance is explained by the variation in team wins.
b. Away attendance increases on average by 4746 for each win.
- 4.80 a.** For each million dollars increase in payroll the number of wins increases on average by .0428. The cost of winning one additional game is \$23,364 million.
b. 8.66% of the variation in wins is explained by the variation in payroll.
- 4.82 a.** Home attendance increases on average by 7579 for each win. 11.08% of the variation in away attendance is explained by the variation in the number of wins.
b. Away attendance increases on average by 1734 for each win. 3.22% of the variation in away attendance is explained by the variation in the number of wins.
- c.** There is a weak linear relationship between home attendance and team wins. There is virtually no linear relationship between away attendance and team wins.
- 4.84 a.** The slope coefficient is .2600; the cost of one more win is \$3,846 million.
b. 4.11% of the variation in wins is explained by the variation in payroll.
- 4.86 a.** Home attendance increases by 3460 for each additional win. 24.68% of the variation in

- home attendance is explained by the variation in wins.
- b.** Away attendance increases by 1277 for each additional win. 44.07% of the variation in away attendance is explained by the variation in wins.
- c.** Compared to the three other sports, it does appear that fans support is affected by how well the team performs on the court.
- 4.88 a.** The slope coefficient is .1526; the cost of one more win is \$6.553 million.
- b.** 8.76% of the variation in wins is explained by the variation in payroll.
- 4.90 a.** Home attendance increases by 1509 for each additional win. 2.31% of the variation in home attendance is explained by the variation in wins.
- b.** Away attendance increases by 217 for each additional win. .21% of the variation in away attendance is explained by the variation in wins.
- c.** The linear relations are very weak, which means that fan support is not affected by how well the teams perform on the ice.
- 4.92** There is a weak positive linear relationship between the two variables.
- 4.94** AXP: 1.8458, .4470
- 4.96** HD: .8741, .4343
- 4.98** MMM: .8696; BAC: .7966; DIS: 1.1795; Mean = .9486
- 4.100** HPQ: 1.0638; INTC: 1.0178; MCD: .3623; Mean = .8146
- 4.102** ABX: 1.0005, .1604
- 4.104** CTC.A: .4378, .1268
- 4.106** ECA: 1.4072; ENB: .7414; SU: 1.7375; Mean = 1.2954
- 4.108** AMZN: .9488, .3139
- 4.110** NFLX: .6116, .0392
- 4.112** COST: .5766; DLTR: .2858; SPLS: .9162; Mean = .5929
- 4.114** 46.03% of the variation in statistics marks is explained by the variation in calculus marks. The coefficient of determination provides a more precise indication of the strength of the linear relationship.
- 4.116 a.** $\hat{y} = 17.933 + .6041x$
- b.** Only 5.05% of the variation in incomes is explained by the variation in heights.
- 4.118 b.** For each additional square foot, the price increases on average by \$.07 thousand. For each additional square foot, the price increases on average by \$70.
- c.** From the least squares line, we can more precisely measure the relationship between the two variables.

- 4.122 a.** $\bar{x} = 29,913$, median = 30,660
b. $s^2 = 148,213,791$; $s = 12,174$
d. The number of coffees sold varies considerably.
- 4.124 a. & b.** $R^2 = .5489$ and the least squares line is $\hat{y} = 49,337 - 553.7x$
- 4.126 a.** $\bar{x} = 26.32$ and median = 26
b. $s^2 = 88.57$, $s = 9.41$
d. The times are positively skewed. Half the times are above 26 hours.
- 4.128 a. & b.** $R^2 = .412$ and the least squares line is $\hat{y} = -8.2897 + 3.146x$
c. 41.2% of the variation in Internet use is explained by the variation in education. For each additional year of education, Internet use increases on average by 3.146 hours.
d. We can measure the strength of the linear relationship accurately and the slope coefficient gives information about how education and Internet use are related.
- 4.130 a. & b.** $R^2 = .369$ and the least squares line is $\hat{y} = 89.543 + .128 \text{ Rainfall}$.
c. 36.92% of the variation in yield is explained by the variation in rainfall. For each additional inch of rainfall, yield increases on average by .128 bushels.
d. We can measure the strength of the linear relationship accurately and the slope coefficient gives information about how rainfall and crop yield are related.
- 4.132 b.** The mean debt is \$12,067. Half the sample incurred debts below \$12,047 and half incurred debts above. The mode is \$11,621.
- Chapter 6**
- 6.2 a.** Subjective approach
b. If all the teams in major league baseball have exactly the same players, the New York Yankees will win 25% of all World Series.
- 6.4 a.** Subjective approach
b. The Dow Jones Industrial Index will increase on 60% of the days if economic conditions remain unchanged.
- 6.6** {Adams wins, Brown wins, Collins wins, Dalton wins}
- 6.8 a.** {0, 1, 2, 3, 4, 5} **b.** {4, 5}
c. .10 **d.** .65 **e.** 0
- 6.10** 2/6, 3/6, 1/6
- 6.12 a.** .40 **b.** .90
- 6.14 a.** $P(\text{single}) = .15$, $P(\text{married}) = .50$, $P(\text{divorced}) = .25$, $P(\text{widowed}) = .10$
b. Relative frequency approach
- 6.16** $P(A_1) = .3$, $P(A_2) = .4$, $P(A_3) = .3$.
 $P(B_1) = .6$, $P(B_2) = .4$.
- 6.18 a.** .57 **b.** .43
c. It is not a coincidence.
- 6.20** The events are not independent.
- 6.22** The events are independent.
- 6.24** $P(A_1) = .40$, $P(A_2) = .45$,
 $P(A_3) = .15$, $P(B_1) = .45$,
 $P(B_2) = .55$.
- 6.26 a.** .85 **b.** .75 **c.** .50
- 6.28 a.** .36 **b.** .49 **c.** .83
- 6.30 a.** .31 **b.** .85
c. .387 **d.** .043
- 6.32 a.** .390 **b.** .66 **c.** No
- 6.34 a.** .11 **b.** .044
c. .091 **d.** .360
- 6.36 a.** .33 **b.** .30
c. Yes, the events are dependent.
- 6.38 a.** .778 **b.** .128 **c.** .385
- 6.40 a.** .636 **b.** .205
- 6.42 a.** .848 **b.** .277 **c.** .077
- 6.44** No
- 6.46 a.** .216 **b.** .198
c. .368 **d.** .632
- 6.52 a.** .81 **b.** .01 **c.** .18 **d.** .99
- 6.54 b.** .8091 **c.** .0091 **d.** .1818
e. .9909
- 6.56 a.** .28 **b.** .30 **c.** .42
- 6.58** .038
- 6.60** .335
- 6.62** .698
- 6.64** .2520
- 6.66** .033
- 6.68** .00000001
- 6.70** .6125
- 6.72 a.** .696 **b.** .304 **c.** .889 **d.** .111
- 6.74** .526
- 6.76** .327
- 6.78** .661
- 6.80** .593
- 6.82** .843
- 6.84** .920, .973, .1460, .9996
- 6.86 a.** .290 **b.** .290 **c.** Yes
- 6.88 a.** .19 **b.** .517 **c.** No
- 6.90** .295
- 6.92** .825
- 6.94 a.** .3285 **b.** .2403
- 6.96** .9710
- 6.98** 2/3
- 6.100** .2214
- 6.102** .3333
- Chapter 7**
- 7.2 a.** any value between 0 and several hundred miles
b. No **c.** No **d.** continuous
- 7.4 a.** 0, 1, 2, ..., 100 **b.** Yes
c. Yes, 101 values **d.** discrete
- 7.6** $P(x) = 1/6$, for $x = 1, 2, \dots, 6$
- 7.8 a.** .950 .020 .680
b. 3.066
c. 1.085
- 7.10 a.** .8 **b.** .8 **c.** .8 **d.** .3
- 7.12** .0156
- 7.14 a.** .25 **b.** .25 **c.** .25 **d.** .25
- 7.18 a.** 1.40, 17.04 **c.** 7.00, 426.00
d. 7.00, 426.00
- 7.20 a.** .6 **b.** 1.7, .81
- 7.22 a.** .40 **b.** .95

- 7.24** 1.025, .168
7.26 a. .06 b. 0 c. .35 d. .65
7.28 a. .21 b. .31 c. .26
7.30 2.76, 1.517
7.32 3.86, 2.60
7.34 $E(\text{value of coin}) = \460 ; take the \$500
7.36 \$18
7.38 4.00, 2.40
7.40 1.85
7.42 3,409
7.44 .14, .58
7.46 b. 2.8, .76
7.48 0, 0
7.50 b. 2.9, .45 c. Yes
7.54 c. 1.07, .505 d. .93, .605 e. -.045, -.081
7.56 a. .412 b. .286 c. .148
7.58 145, 31
7.60 168, 574
7.62 a. .211, .1081 b. .211, .1064 c. .211, .1052
7.64 .1060, .1456
7.66 a. Mean = .0191, standard deviation = .1179 b. Mean = .0295, standard deviation = .1582 c. Mean = .0212, standard deviation = .1225 d. Portfolio 2 has the largest expected value (.0295). e. Portfolio 1 has the smallest standard deviation (.1179).
7.68 a. Mean = .0058, standard deviation = .0645 b. Mean = .0074, standard deviation = .0569 c. Mean = .0041, standard deviation = .0709 d. Portfolio 2 has the largest expected value (.0074) and the smallest deviation (.0569).
7.70 a. Mean = .0063, standard deviation = .0509 b. Mean = .0064, standard deviation = .0548 c. Mean = .0061, standard deviation = .0494 d. Portfolio 2 has the largest expected value (.0064). e. Portfolio 3 has the smallest deviation (.0494).
7.72 a. Mean = .0060, standard deviation = .0539 b. Mean = .0062, standard deviation = .0492 c. Mean = .0053, standard deviation = .0458 d. Portfolio 2 has the largest expected value (.0062). e. Portfolio 3 has the smallest deviation (.0458).
7.74 a. Mean = .0052, standard deviation = .0430 b. Mean = .0063, standard deviation = .0425 c. Mean = .0062, standard deviation = .0387
- d. Portfolio 2 has the largest expected value (.0063). e. Portfolio 3 has the smallest deviation (.0387).
7.76 a. Mean = .0095, standard deviation = .0553 b. Mean = .0111, standard deviation = .0490 c. Mean = .0097, standard deviation = .0539 d. Portfolio 2 has the largest expected value (.0111) and the smallest deviation (.0490).
7.78 Mean = .0100, standard deviation = .0464
7.80 a. Mean = .0289, standard deviation = .1282 b. Mean = .0261, standard deviation = .1406 c. Mean = .0292, standard deviation = .1534 d. Portfolio 3 has the largest expected value (.0292). e. Portfolio 1 has the smallest standard deviation (.1282).
7.84 a. .2668 b. 1029 c. .0014
7.86 a. .26683 b. .10292 c. .00145
7.88 a. .2457 b. .0819 c. .0015
7.90 a. .1711 b. .0916 c. .9095 d. .8106
7.92 a. .4219 b. .3114 c. .25810
7.94 a. .0646 b. .9666 c. .9282 d. 22.5
7.96 .0081
7.98 .1244
7.100 .00317
7.102 a. .3369 b. .75763
7.104 a. .2990 b. .91967
7.106 a. .69185 b. .12519 c. .44069
7.108 a. .05692 b. .47015
7.110 a. .1353 b. .1804 c. .0361
7.112 a. .0302 b. .2746 c. .3033
7.114 a. .1353 b. .0663
7.116 a. .20269 b. .26761
7.118 .6703
7.120 a. .4422 b. .1512
7.122 a. .2231 b. .7029 c. .5768
7.124 a. .8 b. .4457
7.126 a. .0993 b. .8088 c. .8881
7.128 .0473
7.130 .0064
7.132 a. .00793 b. .56 c. 4.10
7.134 a. .1612 b. .0095 c. .0132
7.136 a. 1.46, 1.49 b. 2.22, 1.45
7.138 .08755
7.140 .95099, .04803, .00097, .00001, 0, 0
- Chapter 8**
- 8.2** a. .1200 b. .4800 c. .6667 d. 1867
8.4 b. 0 c. .25 d. .005
8.6 a. .1667 b. .3333 c. 0
8.8 57 minutes
8.10 123 tons
8.12 b. .5 c. .25
- 8.14** b. .25 c. .33
8.16 .9345
8.18 .0559
8.20 .0107
8.22 .9251
8.24 .0475
8.26 .1196
8.28 .0010
8.30 0
8.32 1.70
8.34 .0122
8.36 .4435
8.38 a. .6759 b. .3745 c. .1469
8.40 .6915
8.42 a. .2023 b. .3372
8.44 a. .1056 b. .1056 c. .8882
8.46 Top 5%: 34.4675, Bottom 5%: 29.5325
8.48 .1151
8.50 a. .1170 b. .3559 c. .0162 d. 4.05 hours
8.52 9,636 pages
8.54 a. .3336 b. .0314 c. .0436 d. \$32.88
8.56 a. .0099 b. \$12.88
8.58 132.80 (rounded to 133)
8.60 .5948
8.62 .0465
8.64 171
8.66 873
8.68 .8159
8.70 a. .2327 b. .2578
8.74 a. .5488 b. .6988 c. .1920 d. 0
8.76 .1353
8.78 .8647
8.80 .4857
8.82 .1889
8.84 a. 2.750 b. 1.282 c. 2.132 d. 2.528
8.86 a. 1.6556 b. 2.6810 c. 1.9600 d. 1.6602
8.88 a. .1744 b. .0231 c. .0251 d. .0267
8.90 a. 17.3 b. 50.9 c. 2.71 d. 53.5
8.92 a. 33.5705 b. 866.9111 c. 24.3976 d. 261.058
8.94 a. .4881 b. .9158 c. .9988 d. .9077
8.96 a. 2.84 b. 1.93 c. 3.60 d. 3.37
8.98 a. 1.5204 b. 1.5943 c. 2.8397 d. 1.1670
8.100 a. .1050 b. .1576 c. .0001 d. .0044
- Chapter 9**
- 9.2** a. 1/36 b. 1/36
9.4 The variance of \bar{X} is smaller than the variance of X .
9.6 No, because the sample mean is approximately normally distributed.
9.8 a. .1056 b. .1587 c. .0062
9.10 a. .4435 b. .7333 c. .8185
9.12 a. .1191 b. .2347 c. .2902
9.14 a. 15.00 b. 21.80 c. 49.75

C-5 APPENDIX C

- 9.18 a. .0918 b. .0104 c. .00077
9.20 a. .3085 b. 0
9.22 a. .0038 b. It appears to be false.
9.26 .1170
9.28 .9319
9.30 a. 0 b. .0409 c. .5
9.32 .1056
9.34 .0035
9.36 a. .1151 b. .0287
9.38 .0096; the commercial is dishonest.
9.40 a. .0071
b. The claim appears to be false.
9.42 .0066
9.44 The claim appears to be false.
9.46 .0033
9.48 .8413
9.50 .8413
9.52 .3050
9.54 1

Chapter 10

- 10.10 a. 200 ± 19.60 b. 200 ± 9.80
c. 200 ± 3.92
d. The interval narrows.
10.12 a. 500 ± 3.95 b. 500 ± 3.33
c. 500 ± 2.79
d. The interval narrows.
10.14 a. $10 \pm .82$ b. 10 ± 1.64
c. 10 ± 2.60
d. The interval widens.
10.16 a. 400 ± 1.29 b. 200 ± 1.29
c. 100 ± 1.29
d. The width of the interval is unchanged.
10.18 Yes, because the variance decreases as the sample size increases.
10.20 a. 500 ± 3.50
10.22 LCL = 36.82, UCL = 50.68
10.24 LCL = 6.91, UCL = 12.79
10.26 LCL = 12.83, UCL = 20.97
10.28 LCL = 10.41, UCL = 15.89
10.30 LCL = 249.44, UCL = 255.32
10.32 LCL = 11.86, UCL = 12.34
10.34 LCL = .494, UCL = .526
10.36 LCL = 18.66, UCL = 19.90
10.38 LCL = 579,545, UCL = 590,581
10.40 LCL = 25.62, UCL = 28.76
10.48 a. 1,537 b. 500 ± 10
10.52 2,149
10.54 1,083
10.56 217

Chapter 11

- 11.2 H_0 : I will complete the Ph.D.
 H_1 : I will not be able to complete the Ph.D.
11.4 H_0 : Risky investment is more successful.
 H_1 : Risky investment is not more successful.
11.6 O. J. Simpson

All p-values and probabilities of Type II errors were calculated manually using Table 3 in Appendix B.

- 11.8 $z = .60$; rejection region: $z > 1.88$; p-value = .2743; not enough evidence that $\mu > 50$.

- 11.10 $z = 0$; rejection region: $z < -1.96$ or $z > 1.96$; p-value = 1.0; not enough evidence that $\mu \neq 100$
11.12 $z = -1.33$; rejection region: $z < -1.645$; p-value = .0918; not enough evidence that $\mu < 50$
11.14 a. .2743 b. .1587 c. .0013
d. The test statistic decreases and the p-value decreases.
11.16 a. .2112 b. .3768 c. .5764
d. The test statistic increases and the p-value increases.
11.18 a. .0013 b. .0028 c. .1587
d. The test statistic decreases and the p-value increases.
11.20 a. $z = 4.57$, p-value = 0
b. $z = 1.60$, p-value = .0548.
11.22 a. $z = -.62$, p-value = .2676
b. $z = -1.38$, p-value = .0838
11.24 p-values: .5, .3121, .1611, .0694, .0239, .0062, .0015, 0, 0
11.26 a. $z = 2.30$, p-value = .0214
b. $z = .46$, p-value = .6456
11.28 $z = 2.11$, p-value = .0174; yes
11.30 $z = -1.29$, p-value = .0985;
yes
11.32 $z = .95$, p-value = .1711; no
11.34 $z = 1.85$, p-value = .0322; no
11.36 $z = -2.06$, p-value = .0197; yes
11.38 $z = 1.65$, p-value = .0495; yes
11.40 $z = 2.26$, p-value = .0119; no
11.42 $z = -1.22$, p-value = .1112; no
11.44 $z = 3.33$, p-value = 0; yes
11.46 $z = -2.73$, p-value = .0032; yes
11.48 .1492
11.50 .6480
11.52 a. .6103 b. .8554
c. β increases.
11.56 a. .4404 b. .6736
c. β increases.
11.60 p-value = .9931; no evidence that the new system will not be cost effective.
11.62 .1170
11.64 .1635 (with $\alpha = .05$)

The answers for the exercises in Chapters 12 through 19 were produced in the following way. In exercises where the statistics are provided in the question or in Appendix A, the solutions were produced manually. The solutions to exercises requiring the use of a computer were produced using Excel. When the test result was calculated manually and the test statistic is normally distributed (z statistic), the p-value was computed manually using the normal table (Table 3 in Appendix B). The p-value for all other test statistics was determined using Excel.

Chapter 12

- 12.4 a. 1500 ± 59.52
b. 1500 ± 39.68
c. 1500 ± 19.84
d. Interval narrows
12.6 a. $10 \pm .20$ b. $10 \pm .79$
c. 10 ± 1.98 d. Interval widens
12.8 a. 63 ± 1.77 b. 63 ± 2.00
c. 63 ± 2.71 d. Interval widens

- 12.10 a. $t = -3.21$, p-value = .0015
b. $t = -1.57$, p-value = .1177
c. $t = -1.18$, p-value = .2400
d. t increases and p-value increases
12.12 a. $t = .67$, p-value = .5113
b. $t = .52$, p-value = .6136
c. $t = .30$, p-value = .7804
d. t decreases and p-value increases
12.14 a. $t = 1.71$, p-value = .0448
b. $t = 2.40$, p-value = .0091
c. $t = 4.00$, p-value = .0001
d. t increases and p-value decreases
12.16 a. 175 ± 28.60 b. 175 ± 22.07
c. The normal distribution is narrower than the Student t distribution.
12.18 a. 350 ± 11.52
b. 350 ± 11.52
c. When n is large, the normal distribution is virtually identical to the Student t distribution.
12.20 a. $t = -1.30$, p-value = .1126
b. $z = -1.30$, p-value = .0964
c. The normal distribution is narrower than the Student t distribution.
12.22 a. $t = 1.58$, p-value = .0569
b. $z = 1.58$, p-value = .0571
c. When n is large, the normal distribution is virtually identical to the Student t distribution.
12.24 LCL = 14,422, UCL = 33,680
12.26 $t = -4.49$, p-value = .0002; yes
12.28 LCL = 18.11, UCL = 35.23
12.30 $t = -2.45$, p-value = .0186; yes
12.32 LCL = 427 million,
UCL = 505 million
12.34 LCL = \$727,350 million,
UCL = \$786,350 million
12.36 LCL = 2.31, UCL = 3.03
12.38 LCL = \$98,265 million,
UCL = \$104,154 million
12.40 $t = .51$, p-value = .3061; no
12.42 $t = 2.28$, p-value = .0127; yes
12.44 LCL = 650,958 million,
UCL = 694,442 million
12.46 LCL = \$38,138, UCL = \$42,467
12.48 LCL = 1.32, UCL = 1.41
12.50 $t = 1.11$, p-value = .1327; no
12.52 LCL = \$55,426, UCL = \$61,391
12.54 $t = -2.98$, p-value = .0015; yes
12.56 $t = 20.95$, p-value = 0; yes
12.58 $t = 3.20$, p-value = .0007; yes
12.60 LCL = \$53,790, UCL = \$58,094
12.62 $t = -7.87$, p-value = 0; yes
12.64 LCL = 4.80, UCL = 5.12
12.68 a. $\chi^2 = 72.60$, p-value = .0427;
yes
b. $\chi^2 = 35.93$, p-value = .1643;
no
c. Decreasing the sample size decreases the test statistic and increases the p-value of the test.
12.70 a. LCL = 7.09, UCL = 25.57
b. LCL = 8.17, UCL = 19.66
c. Increasing the sample size narrows the interval.
12.72 $\chi^2 = 7.57$, p-value = .4218; no

- 12.74** LCL = 7.31, UCL = 51.43
12.76 $\chi^2 = 305.81$; $p\text{-value} = .0044$; yes
12.78 $\chi^2 = 86.36$; $p\text{-value} = .1863$; no
12.82 a. $.48 \pm .0692$ b. $.48 \pm .0438$
c. $.48 \pm .0310$
d. The interval narrows.
12.84 a. $z = .61$, $p\text{-value} = .2709$
b. $z = .87$, $p\text{-value} = .1922$
c. $z = 1.22$, $p\text{-value} = .1112$
d. The $p\text{-value}$ decreases.
12.86 752
12.88 a. $75 \pm .0260$
b. The interval is narrower.
c. Yes, because the interval estimate is better than specified.
12.90 a. $.75 \pm .03$
b. Yes, because the sample size was chosen to produce this interval.
12.92 a. $.5 \pm .0346$
b. The interval is wider.
c. No, because the interval estimate is wider (worse) than specified.
12.94 $z = -1.47$, $p\text{-value} = .0708$; yes
12.96 $z = .33$, $p\text{-value} = .3707$; no
12.98 LCL = .1332, UCL = .2068
12.100 LCL = 0 (increased from $-.0018$), UCL = .0312
12.102 LCL = 0 (increased from $-.0037$), UCL = .0191
12.104 LCL = .0924, UCL = .1460
12.106 LCL = 5,940, UCL = 9,900
12.108 $z = -1.58$, $p\text{-value} = .0571$; no
12.110 LCL = 3.452 million, UCL = 3.749 million
12.112 $z = 1.40$, $p\text{-value} = .0808$; no
12.114 LCL = 3.89 million, UCL = 5.21 million
12.116 a. LCL = .861 million, UCL = 1.17 million
12.118 a. LCL = 104,094,270, UCL = 112,755,571
b. LCL = 10,051,434, UCL = 14,677,058
12.120 LCL = 43,282,406, UCL = 50,442,144
12.122 $z = -7.61$, $p\text{-value} = 0$; yes
12.124 $z = 2.79$, $p\text{-value} = .0027$; yes
12.126 LCL = 83,670,760, UCL = 93,708,606
12.128 LCL = 109,788,778, UCL = 119,955,414
12.130 LCL = 24,171,797, UCL = 29,613,579
12.132 $z = -3.83$, $p\text{-value} = .0001$; yes
12.134 $z = 5.05$, $p\text{-value} = 0$; yes
12.136 LCL = 21,870,611, UCL = 24,397,798
12.138 a. LCL = .2711, UCL = .3127
b. LCL = 32,729,361, UCL = 37,751,646
12.140 LCL = 29,359,008, UCL = 41,918,139
12.142 LCL = \$8,354, UCL = \$15,573
12.144 a. $t = 3.04$, $p\text{-value} = .0015$; yes
b. LCL = 30.68, UCL = 33.23
c. The costs are required to be normally distributed.

- 12.146** $\chi^2 = 30.71$, $p\text{-value} = .0435$; yes
12.148 LCL = .3718, UCL = .4428
12.150 LCL = 9.92, UCL = 10.66
12.152 a. LCL = 69.03, UCL = 74.73
b. $t = 2.74$, $p\text{-value} = .0043$ yes
12.154 $z = .64$, $p\text{-value} = .2611$; no
12.156 LCL = 26.44, UCL = 27.55
12.158 LCL = .5818, UCL = .6822
12.160 LCL = 69,833,339, UCL = 86,316,357
12.162 $z = -1.33$, $p\text{-value} = .0912$; yes
12.164 a. $t = -2.97$, $p\text{-value} = .0018$; yes
b. $\chi^2 = 101.58$, $p\text{-value} = .0011$; yes
12.166 LCL = 49,800 UCL = 72,880
12.168 a. LCL = -5.54 , UCL = 29.61
b. $t = -.473$, $p\text{-value} = .3210$; no
12.170 $t = .908$, $p\text{-value} = .1823$; no
12.172 $t = .959$, $p\text{-value} = .1693$; no
12.174 $t = 2.44$, $p\text{-value} = .0083$; yes
12.176 a. LCL = .6135, UCL = .7107
b. LCL = 26,823, UCL = 37,144
c. LCL = 4.67, UCL = 5.79
d. LCL = 1.41, UCL = 1.84
- For all exercises in Chapter 13 and all chapter appendixes, we employed the F-test of two variances at the 5% significance level to decide which one of the equal-variances or unequal-variances t-test and estimator of the difference between two means to use to solve the problem. Additionally, for exercises that compare two populations and are accompanied by data files, our answers were derived by defining the sample from population 1 as the data stored in the first column (often column A). The data stored in the second column represent the sample from population 2. Paired differences were defined as the difference between the variable in the first column minus the variable in the second column.*

Chapter 13

- 13.6** a. $t = .43$, $p\text{-value} = .6703$; no
b. $t = .04$, $p\text{-value} = .9716$; no
c. The t-statistic decreases and the p-value increases.
d. $t = 1.53$, $p\text{-value} = .1282$; no
e. The t-statistic increases and the p-value decreases.
f. $t = .72$, $p\text{-value} = .4796$; no
g. The t-statistic increases and the p-value decreases.
13.8 a. $t = .62$, $p\text{-value} = .2689$; no
b. $t = 2.46$, $p\text{-value} = .0074$; yes
c. The t-statistic increases and the p-value decreases.
d. $t = .23$, $p\text{-value} = .4118$
e. The t-statistic decreases and the p-value increases.
f. $t = .35$, $p\text{-value} = .3624$
g. The t-statistic decreases and the p-value increases.
13.12 $t = -2.04$, $p\text{-value} = .0283$; yes
13.14 $t = -1.59$, $p\text{-value} = .1368$; no
13.16 $t = 1.12$, $p\text{-value} = .2761$; no
13.18 $t = 1.55$, $p\text{-value} = .1204$; no
- 13.20** a. $t = 2.88$, $p\text{-value} = .0021$; yes
b. LCL = .25, UCL = 4.57
13.22 $t = .94$, $p\text{-value} = .1753$; switch to supplier B.
13.24 a. $t = 2.94$, $p\text{-value} = .0060$; yes
b. LCL = 4.31, UCL = 23.65
c. The times are required to be normally distributed.
13.26 $t = 7.54$, $p\text{-value} = 0$; yes
13.28 $t = .90$, $p\text{-value} = .1858$; no
13.30 $t = -2.05$, $p\text{-value} = .0412$; yes
13.32 $t = 1.16$, $p\text{-value} = .2467$; no
13.34 $t = -2.09$, $p\text{-value} = .0189$; yes
13.36 $t = 6.28$, $p\text{-value} = 0$; yes
13.38 $t = 12.37$, $p\text{-value} = 0$; yes
13.40 $t = 2.49$, $p\text{-value} = .0080$; yes
13.42 LCL = 11,896, UCL = 20,430
13.44 LCL = $-.245$, UCL = .392
13.46 LCL = .630, UCL = 1.765
13.48 $t = .502$, $p\text{-value} = .3078$; no
13.50 $t = -3.08$, $p\text{-value} = .0011$; yes
13.52 LCL = .291, UCL = 1.038
13.54 LCL = $-12,386$, UCL = -991 ; on average conservatives earn between \$991 and \$12,386 more than liberals.
13.56 $t = -1.81$, $p\text{-value} = .0353$; yes
13.58 $t = 3.11$, $p\text{-value} = .0010$; yes
13.60 $t = 8.93$, $p\text{-value} = 0$; yes
13.62 $t = .276$, $p\text{-value} = .3916$; no
13.64 $t = -2.12$, $p\text{-value} = .0101$; yes
13.66 $t = -4.27$, $p\text{-value} = 0$; yes
13.68 $t = -3.06$, $p\text{-value} = .0012$; yes
13.70 $t = 2.04$, $p\text{-value} = .0418$; yes
13.72 $t = -.20$, $p\text{-value} = .4222$; no
13.74 $t = 7.09$, $p\text{-value} = 0$; yes
13.76 $t = -.145$, $p\text{-value} = .8845$; no
13.78 $t = .314$, $p\text{-value} = .3768$; no
13.80 $t = -1.69$, $p\text{-value} = .4330$; no
13.82 LCL = 1.128, UCL = 1.825
13.84 $t = .604$, $p\text{-value} = .2735$; no
13.86 $t = -4.65$, $p\text{-value} = 0$; yes
13.88 $t = 9.20$, $p\text{-value} = 0$; yes
13.90 Experimental
13.96 $t = -3.22$, $p\text{-value} = .0073$; yes
13.98 $t = 1.98$, $p\text{-value} = .0473$; yes
13.100 a. $t = 1.82$, $p\text{-value} = .0484$; yes
b. LCL = $-.66$, UCL = 6.82
13.102 $t = -3.70$, $p\text{-value} = .0005$; yes
13.104 a. $t = -16.92$, $p\text{-value} = 0$; yes
b. LCL = -64.48 , UCL = -50.12 ; mean savings lies between \$50.12 and \$64.48
c. Differences are normally distributed.
13.106 $t = -1.52$, $p\text{-value} = .0647$; no
13.108 $t = 2.08$, $p\text{-value} = .0210$; yes
13.110 The matched pairs experiment reduced the variation caused by different drivers.
13.112 Salary offers and undergraduate GPA are not as strongly linked as are salary offers and MBA GPA.
13.114 $t = 22.10$, $p\text{-value} = 0$; yes
13.116 LCL = 6.80, UCL = 23.87
13.120 a. $F = .50$, $p\text{-value} = .0669$; yes
b. $F = .50$, $p\text{-value} = .2071$; no
c. The value of the test statistic is unchanged but the conclusion did change.

- 13.122** $F = .50$, $p\text{-value} = .3179$; no
13.124 $F = 3.23$, $p\text{-value} = .0784$; no
13.126 $F = 2.08$, $p\text{-value} = .0003$; yes
13.128 $F = .31$, $p\text{-value} = 0$; yes
13.132 a. $z = 1.07$, $p\text{-value} = .2846$
 b. $z = 2.01$, $p\text{-value} = .0444$
 c. The $p\text{-value}$ decreases.
13.134 $z = 1.70$, $p\text{-value} = .0446$; yes
13.136 $z = 3.62$, $p\text{-value} = 0$; yes
13.138 $z = -2.85$, $p\text{-value} = .0022$; yes
13.140 $z = -4.04$, $p\text{-value} = 0$; yes
13.142 $z = 2.00$, $p\text{-value} = .0228$; yes
13.144 $z = -1.19$, $p\text{-value} = .1170$; no
13.146 $z = 1.97$, $p\text{-value} = .0244$; yes
13.148 $z = 1.79$, $p\text{-value} = .0367$; yes
13.150 $z = -2.15$, $p\text{-value} = .0158$; yes
13.152 a. $z = 3.35$, $p\text{-value} = 0$; yes
 b. LCL = .0668, UCL = .3114
13.154 $z = 4.24$, $p\text{-value} = 0$; yes
13.156 $z = 1.50$, $p\text{-value} = .0664$; no
13.158 $z = 3.64$, $p\text{-value} = .0001$; yes
13.160 $z = 2.04$, $p\text{-value} = .0207$; yes
13.162 $z = -1.25$, $p\text{-value} = .2112$; no
13.164 $z = 2.98$, $p\text{-value} = .0028$; yes
13.166 $z = 7.76$, $p\text{-value} = 0$; yes
13.168 $z = 2.00$, $p\text{-value} = .0225$, yes
13.170 $z = 1.57$, $p\text{-value} = .1166$; no
13.172 $z = -3.72$, $p\text{-value} = .0002$; yes
13.174 $z = 2.89$, $p\text{-value} = .0019$; yes
13.176 $z = -2.96$, $p\text{-value} = .0015$; yes
13.178 $z = -1.51$, $p\text{-value} = .1314$; no
13.180 $z = 4.65$, $p\text{-value} = 0$; yes
13.182 $z = -3.69$, $p\text{-value} = 0$; yes
13.184 a. $z = 2.49$, $p\text{-value} = .0065$;
 yes
 b. $z = .89$, $p\text{-value} = .1859$; no
 c. $z = 2.61$, $p\text{-value} = .0045$;
 yes
13.186 $t = 15.82$, $p\text{-value} = 0$; yes
13.188 $t = -6.09$, $p\text{-value} = 0$; yes
13.190 $z = -2.30$, $p\text{-value} = .0106$;
 yes
13.192 a. $t = -1.06$, $p\text{-value} = .2980$;
 no
 b. $t = -2.87$, $p\text{-value} = .0040$;
 yes
13.194 $z = 2.26$, $p\text{-value} = .0119$; yes
13.196 $z = -4.28$, $p\text{-value} = 0$; yes
13.198 $t = -4.53$, $p\text{-value} = 0$; yes
13.200 a. $t = 4.14$, $p\text{-value} = .0001$; yes
 b. LCL = 1.84, UCL = 5.36
13.202 $t = -2.40$, $p\text{-value} = .0100$; yes
13.204 $z = 1.20$, $p\text{-value} = .1141$; no
13.206 $t = 14.07$, $p\text{-value} = 0$; yes
13.208 $t = -2.40$, $p\text{-value} = .0092$; yes
13.210 $t = .71$, $p\text{-value} = .4763$; no
13.212 $z = 1.57$, $p\text{-value} = .0578$; no
13.214 $z = 12.67$, $p\text{-value} = 0$; yes
13.216 $z = 16.47$, $p\text{-value} = 0$; yes
13.218 $t = 2.85$, $p\text{-value} = .0025$;
 yes
13.220 $z = -3.54$, $p\text{-value} = .0002$;
 yes
13.222 $t = -2.13$, $p\text{-value} = .0171$;
 yes
13.224 $z = -.45$, $p\text{-value} = .6512$; no
13.226 LCL = -1967, UCL = 3948
13.228 LCL = -0.382, UCL = .0018
13.230 $z = -.290$, $p\text{-value} = .7722$; no

Chapter 14

- 14.4** $F = 4.82$, $p\text{-value} = .0377$; yes
14.6 $F = 3.91$, $p\text{-value} = .0493$; yes
14.8 $F = .81$, $p\text{-value} = .5224$; no
14.10 a. $F = 2.94$, $p\text{-value} = .0363$;
 evidence of differences
 b. The times for each form must
 be normally distributed with
 the same variance.
 c. The histograms are approxi-
 mately bell-shaped and the
 sample variances are similar.
14.12 $F = 3.32$, $p\text{-value} = .0129$; yes
14.14 $F = 1.17$, $p\text{-value} = .3162$; no
14.16 $F = 1.33$, $p\text{-value} = .2675$; no
14.18 a. Ages: $F = 25.60$,
 $p\text{-value} = 0$;
 evidence of differences
 b. Incomes: $F = 7.37$, $p\text{-value} =$
 .0001; evidence of differences
 c. Education: $F = 1.82$, $p\text{-value} =$
 .1428; not enough evidence
 of differences.
14.20 $F = .26$, $p\text{-value} = .7730$; no
14.22 Reading: $F = 182.43$, $p\text{-value} = 0$;
 evidence of differences.
 Mathematics: $F = 353.45$,
 $p\text{-value} = 0$; evidence of
 differences.
 Science: $F = 121.0$, $p\text{-value} = 0$;
 evidence of differences
14.24 $F = 6.66$, $p\text{-value} = .0013$; yes
14.26 $F = 4.01$, $p\text{-value} = .0184$; yes
14.28 $F = 3.10$, $p\text{-value} = .0453$; yes
14.30 $F = 10.11$, $p\text{-value} = 0$; yes
14.32 $F = 87.39$, $p\text{-value} = 0$; yes
14.34 $F = 3.09$, $p\text{-value} = .0260$; yes
14.36 $F = .968$, $p\text{-value} = .4067$; no
14.38 $F = 11.59$, $p\text{-value} = 0$; yes
14.40 $F = 17.10$, $p\text{-value} = 0$; yes
14.42 $F = 37.47$, $p\text{-value} = 0$; yes
14.44 a. μ_1 and μ_2 , μ_1 and μ_4 , μ_1 and
 μ_5 , μ_2 and μ_4 , μ_3 and μ_4 , μ_3
 and μ_5 , and μ_4 and μ_5 differ.
 b. μ_1 and μ_5 , μ_2 and μ_4 , μ_3 and
 μ_4 , and μ_4 and μ_5 differ.
 c. μ_1 and μ_2 , μ_1 and μ_5 , μ_2 and
 μ_4 , μ_3 and μ_4 , and μ_4 and μ_5
 differ.
14.46 a. BA and BBA differ.
 b. BA and BBA differ.
14.48 a. The means for Forms 1 and 4
 differ.
 b. No means differ.
14.50 a. Lacquers 2 and 3 differ.
 b. Lacquers 2 and 3 differ.
14.52 No fertilizers differ.
14.54 Independents and Republicans
 differ.
14.56 Democrats and Republicans differ.
14.58 Bonferroni method with $\alpha =$
 .05/C with $C = 1$: moderates and
 conservatives differ.
14.60 Liberals and moderates differ
 and liberals and conservatives
 differ.
14.62 All pairs differ except left high
 school and high school and high
 school and junior college.
- 14.64** No pair of years differs.
14.66 Democrats and Republicans differ
 and Republicans and Independents
 differ.
14.68 All three groups differ.
14.70 a. $F = 16.50$, $p\text{-value} = 0$;
 treatment means differ
 b. $F = 4.00$, $p\text{-value} = .0005$;
 block means differ
14.72 a. $F = 7.00$, $p\text{-value} = .0078$;
 treatment means differ
 b. $F = 10.50$, $p\text{-value} = .0016$;
 treatment means differ
 c. $F = 21.00$, $p\text{-value} = .0001$;
 treatment means differ
 d. F -statistic increases and
 $p\text{-value}$ decreases.
14.74 a. SS(Total)14.9, SST = 8.9,
 SSB = 4.2, SSE = 1.8
 b. SS (Total)14.9, SST = 8.9,
 SSE = 6.0
14.76 $F = 1.65$, $p\text{-value} = .2296$; no
14.78 a. $F = 123.36$, $p\text{-value} = 0$; yes
 b. $F = 323.16$, $p\text{-value} = 0$; yes
14.80 a. $F = 21.16$, $p\text{-value} = 0$; yes
 b. $F = 66.02$, $p\text{-value} = 0$; ran-
 domized block design is best.
14.82 a. $F = 10.72$, $p\text{-value} = 0$; yes
 b. $F = 6.36$, $p\text{-value} = 0$; yes
14.84 $F = 354.97$, $p\text{-value} = 0$; yes
14.86 $F = 44.74$, $p\text{-value} = 0$; yes
14.88 $F = 9.53$; evidence that factors
 A and B interact.
14.90 a. $F = .31$, $p\text{-value} = .5943$; no
 evidence that factors A and B
 interact.
 b. $F = 1.23$, $p\text{-value} = .2995$;
 no evidence of differences bet-
 ween the levels of factor A.
 c. $F = 13.00$, $p\text{-value} = .0069$;
 evidence of differences bet-
 ween the levels of factor B.
14.92 $F = .21$, $p\text{-value} = .8915$; no
 evidence that educational level
 and gender interact. $F = 4.49$,
 $p\text{-value} = .0060$; evidence of
 differences between educational
 levels. $F = 15.00$, $p\text{-value} =$
 .0002; evidence of a difference
 between men and women.
14.94 a. 12 treatments
 b. 2 factors, tax form and income
 group
 c. There are $a = 4$ forms and
 $b = 3$ income groups.
 d. $F = 1.04$, $p\text{-value} = .4030$; no
 e. $F = 2.56$, $p\text{-value} = .0586$; no
 f. $F = 4.11$, $p\text{-value} = .0190$;
 yes
14.96 a. Factor A is the drug mixture
 and factor B is the schedule.
 b. The response variable is the
 improvement index.
 c. There are $a = 4$ drug mixtures
 and $b = 2$ schedules.
 d. Test for interaction: $F=7.27$,
 $p\text{-value} = .0007$; evidence
 that schedules and drug mix-
 tures interact.

- 14.98** Both machines and alloys are sources of variation.
- 14.100** The only source of variation is skill level.
- 14.102** $F = 7.63$, $p\text{-value} = 0$; yes
- 14.104** $F = 13.79$, $p\text{-value} = 0$; use the typeface that was read the fastest.
- 14.106** $F = 7.72$, $p\text{-value} = .0070$; yes
- 14.108 a.** $F = 136.58$, $p\text{-value} = 0$; yes
b. All three means differ from one another. Pure method is best.
- 14.110** $F = 14.47$, $p\text{-value} = 0$; yes
- 14.112** $F = 13.84$, $p\text{-value} = 0$; yes
- 14.114** $F = 1.62$, $p\text{-value} = .2022$; no
- 14.116** $F = 2.70$, $p\text{-value} = .0684$; no
- 14.118** $F = 39.93$, $p\text{-value} = 0$; yes
- 14.120** $F = 45.49$, $p\text{-value} = 0$; yes
- 14.122** $F = 211.61$, $p\text{-value} = 0$; yes

Chapter 15

- 15.2** $\chi^2 = 2.26$, $p\text{-value} = .6868$; no evidence that at least one p_i is not equal to its specified value.
- 15.6** $\chi^2 = 9.96$, $p\text{-value} = .0189$; evidence that at least one p_i is not equal to its specified value.
- 15.8** $\chi^2 = 6.85$, $p\text{-value} = .0769$; not enough evidence that at least one p_i is not equal to its specified value.
- 15.10** $\chi^2 = 14.07$, $p\text{-value} = .0071$; yes
- 15.12** $\chi^2 = 33.85$, $p\text{-value} = 0$; yes
- 15.14** $\chi^2 = 6.35$, $p\text{-value} = .0419$; yes
- 15.16** $\chi^2 = 5.70$, $p\text{-value} = .1272$; no
- 15.18** $\chi^2 = 21.22$, $p\text{-value} = 0$; yes
- 15.20** $\chi^2 = 97.05$, $p\text{-value} = 0$; yes
- 15.22** $\chi^2 = 19.10$, $p\text{-value} = 0$; yes
- 15.24** $\chi^2 = 4.77$, $p\text{-value} = .0289$; yes
- 15.26** $\chi^2 = 4.41$, $p\text{-value} = .1110$; no
- 15.28** $\chi^2 = 2.36$, $p\text{-value} = .3087$; no
- 15.30** $\chi^2 = 19.71$, $p\text{-value} = .0001$; yes
- 15.32** $\chi^2 = .64$, $p\text{-value} = .4225$; no
- 15.34** $\chi^2 = 41.77$, $p\text{-value} = 0$; yes
- 15.36** $\chi^2 = 43.36$, $p\text{-value} = 0$; yes
- 15.38** $\chi^2 = 20.89$, $p\text{-value} = .0019$; yes
- 15.40** $\chi^2 = 1.22$, $p\text{-value} = .9761$; no
- 15.42** $\chi^2 = 311.4$, $p\text{-value} = 0$; yes
- 15.44** $\chi^2 = 11.82$, $p\text{-value} = .0080$; yes
- 15.46** $\chi^2 = 22.49$, $p\text{-value} = .0002$; yes
- 15.48** $\chi^2 = 25.90$, $p\text{-value} = 0$; yes
- 15.50** $\chi^2 = 5.87$, $p\text{-value} = .0531$; no
- 15.52** $\chi^2 = 24.52$, $p\text{-value} = 0$; yes
- 15.54** $\chi^2 = 116.46$, $p\text{-value} = 0$; yes
- 15.56** $\chi^2 = 5.89$, $p\text{-value} = .0525$; no
- 15.58** $\chi^2 = 35.21$, $p\text{-value} = 0$; yes
- 15.60** $\chi^2 = 9.87$, $p\text{-value} = .0017$; yes
- 15.62** $\chi^2 = 506.76$, $p\text{-value} = 0$; yes
- 15.64** Phone: $\chi^2 = .235$, $p\text{-value} = .8891$; no
Not on phone: $\chi^2 = 3.18$, $p\text{-value} = .2044$; no
- 15.66** $\chi^2 = 3.20$, $p\text{-value} = .2019$; no
- 15.68** $\chi^2 = 5.41$, $p\text{-value} = .2465$; no
- 15.70** $\chi^2 = 20.38$, $p\text{-value} = .0004$; yes
- 15.72** $\chi^2 = 86.62$, $p\text{-value} = 0$; yes
- 15.74** $\chi^2 = 4.13$, $p\text{-value} = .5310$; no
- 15.76** $\chi^2 = 9.73$, $p\text{-value} = .0452$; yes
- 15.78** $\chi^2 = 4.57$, $p\text{-value} = .1016$; no

- 15.80 a.** $\chi^2 = .648$, $p\text{-value} = .4207$; no
b. $\chi^2 = 7.72$, $p\text{-value} = .0521$; no
c. $\chi^2 = 23.11$, $p\text{-value} = 0$; yes
- 15.82** $\chi^2 = 4.51$, $p\text{-value} = .3411$; no

Chapter 16

- 16.2** $\hat{y} = 9.107 + .0582x$
- 16.4** $\hat{y} = -24.72 + .9675x$
- 16.6 b.** $\hat{y} = 3.635 + .2675x$
- 16.8** $\hat{y} = 7.460 + .0899x$
- 16.10** $\hat{y} = 7.286 + .1898x$
- 16.12** $\hat{y} = 4.040 + .44.97x$
- 16.14** $\hat{y} = 458.4 + 64.05x$
- 16.16** $\hat{y} = 20.64 - .3039x$
- 16.18** $\hat{y} = 89.81 + .0514x$
- 16.22** $t = 10.09$, $p\text{-value} = 0$; evidence of linear relationship
- 16.24 a.** 1.347
b. $t = 3.93$, $p\text{-value} = .0028$; yes
c. $LCL = .0252$, $UCL = .0912$
d. .6067
- 16.26** $t = 6.55$, $p\text{-value} = 0$; yes
- 16.28 a.** 5.888 **b.** .2892
c. $t = 4.86$, $p\text{-value} = 0$; yes
d. $LCL = .1756$, $UCL = .3594$
- 16.30** $t = 2.17$, $p\text{-value} = .0305$; yes
- 16.32** $t = 7.50$, $p\text{-value} = 0$; yes
- 16.34 a.** 3,287
b. $t = 2.24$, $p\text{-value} = .0309$; yes
c. .1167
- 16.36** $s_e = 191.1$; $R^2 = .3500$;
 $t = 10.39$, $p\text{-value} = 0$
- 16.38** $t = -3.39$, $p\text{-value} = .0021$; yes
- 16.40 a.** .0331
b. $t = 1.21$, $p\text{-value} = .2319$; no
- 16.42** $t = 4.86$, $p\text{-value} = 0$; yes
- 16.44** $t = 7.49$, $p\text{-value} = 0$; yes
- 16.46** $t = 15.37$, $p\text{-value} = 0$; yes
- 16.48** $t = 6.58$, $p\text{-value} = 0$; yes
- 16.50** $t = 5.34$, $p\text{-value} = 0$; yes
- 16.52** $t = -7.22$, $p\text{-value} = 0$; yes
- 16.54** $t = .845$, $p\text{-value} = .3982$; no
- 16.56** $t = 16.90$, $p\text{-value} = 0$; yes.
The average increase in total family income for each additional earner in the family lies between \$16,281 and \$20,553.
- 16.58** $t = 24.19$, $p\text{-value} = 0$; yes
- 16.60** $t = -.0769$, $p\text{-value} = .4694$; no
- 16.62** $t = -12.90$, $p\text{-value} = 0$; yes
- 16.64** $t = 20.84$, $p\text{-value} = 0$; yes
- 16.66** 11.10, 16.42
- 16.70 a.** 2,086, 16,200
b. 7,166, 11,120
- 16.72 a.** -.3 (changed to 0), 23.52
b. 9.85, 13.37
- 16.74** 10.26, 11.86
- 16.76** 7.03, 22.73
- 16.78** 5,659, 7,817
- 16.80** 691.0, 738.2
- 16.82** 12.20, 24.22
- 16.84** 93.58, 94.26
- 16.86** Lower prediction limit = 0 (increased from -45,097);
Upper prediction limit = 83,220
 $LCL = 16,466$, $UCL = 21,657$

- 16.88** In all cases the linear relationship is far too weak to produce accurate predictions.

- 16.90** Lower prediction limit = 0 (increased from -2.14),
Upper prediction limit = 8.90
 $LCL = 3.21$, $UCL = 3.55$

- 16.92** Lower prediction limit = 10.27,
Upper prediction limit = 71.30
 $LCL = 39.35$, $UCL = 42.22$

- 16.94** Lower prediction limit = 18,474,
Upper prediction limit = 195,377
 $LCL = 100,921$, $UCL = 112,930$

- 16.96** Lower prediction limit = 0 (increased from -.89),
Upper prediction limit = 5.42
 $LCL = 2.18$, $UCL = 2.36$

- 16.98** Lower prediction limit = 11.28,
Upper prediction limit = 22.20
 $LCL = 16.43$, $UCL = 17.05$

- 16.100** In all cases the linear relationship is far too weak to produce accurate predictions.

- 16.120 a.** $\hat{y} = 115.24 + 2.47x$
c. .5659
d. $t = 4.84$, $p\text{-value} = .0001$; yes
e. Lower prediction limit = 318.1,
Upper prediction limit = 505.2

- 16.122 a.** $t = 21.78$, $p\text{-value} = 0$; yes
b. $t = 11.76$, $p\text{-value} = 0$; yes

- 16.124** $t = 3.01$, $p\text{-value} = .0042$; yes

- 16.126** $t = 1.67$, $p\text{-value} = .0522$; no

- 16.128** $t = -9.88$, $p\text{-value} = 0$; yes

Chapter 17

- 17.2 a.** $\hat{y} = 13.01 + .194x_1 + 1.11x_2$
b. 3.75 **c.** .7629
d. $F = 43.43$, $p\text{-value} = 0$; evidence that the model is valid.
f. $t = .97$, $p\text{-value} = .3417$; no
g. $t = 9.12$, $p\text{-value} = 0$; yes
h. 23,39 **i.** 49,65
- 17.4 c.** $s_e = 6.99$, $R^2 = .3511$; model is not very good.
- d.** $F = 22.01$, $p\text{-value} = 0$; evidence that the model is valid.
- e.** Minor league home runs: $t = 7.64$, $p\text{-value} = 0$; Age: $t = .26$, $p\text{-value} = .7961$; Years professional: $t = 1.75$, $p\text{-value} = .0819$. Only the number of minor league home runs is linearly related to the number of major league home runs.
- f.** 9.86 (rounded to 10), 38.76 (rounded to 39)
g. 14.66, 24.47
- 17.6 b.** .2882
- c.** $F = 12.96$, $p\text{-value} = 0$; evidence that the model is valid.
- d.** High school GPA: $t = 6.06$, $p\text{-value} = 0$; SAT: $t = .94$, $p\text{-value} = .3485$; Activities: $t = .72$, $p\text{-value} = .4720$
- e.** 4.45, 12.00 (actual value = 12.65; 12 is the maximum)
- f.** 6.90, 8.22

- 17.8 b.** $F = 29.80$, $p\text{-value} = 0$; evidence that the model is valid.
d. House size : $t = 3.21$, $p\text{-value} = .0014$; Number of children: $t = 7.84$ $p\text{-value} = 0$
 Number of adults at home: $t = 4.48$, $p\text{-value} = 0$

- 17.10 b.** $F = 67.97$, $p\text{-value} = 0$; evidence that the model is valid.
d. 65.54, 77.31
e. 68.75, 74.66

- 17.12 a.** $\hat{y} = -28.43 + 6.04x_1 + 3.74x_2$
b. $s_e = 7.07$ and $R^2 = .8072$; the model fits well.
d. 35.16, 66.24
e. 44.43, 56.96

- 17.14 b.** $F = 24.48$, $p\text{-value} = 0$; yes
c.

Variable	<i>t</i>	<i>p</i> -value
UnderGPA	.524	.6017
GMAT	8.16	0
Work	3.00	.0036

- 17.16 b.** $F = 206.79$, $p\text{-value} = 0$; evidence that the model is valid.
c. PAEDUC: $t = 8.73$, $p\text{-value} = 0$
 MAEDUC: $t = 6.82$, $p\text{-value} = 0$

- 17.18 b.** $F = 11.06$, $p\text{-value} = 0$; evidence that the model is valid.
c. AGE: $t = 2.98$, $p\text{-value} = .0030$
 EDUC: $t = -4.62$, $p\text{-value} = 0$
 CHILDS: $t = -1.41$, $p\text{-value} = .1583$
 HRS1: $t = -3.77$, $p\text{-value} = .0002$
d. 5.43% of the variation in TVHOURS is explained by the model.

- 17.20 a.** $F = 35.06$, $p\text{-value} = 0$; evidence that the model is valid.
b.

Variable	<i>t</i> -statistic	<i>p</i> -value
AGE	.404	.6864
EDUC	7.89	0
HRS	7.10	0
CHILDS	1.61	.1084
AGEKDBRN	4.90	0
YEARSJOB	5.85	0
MOREDAYS	1.36	.1754
NUMORG	1.37	.1713

- 17.22 b.** $F = 11.72$, $p\text{-value} = 0$; enough evidence that the model is valid.
c.

Variable	<i>t</i> -statistic	<i>p</i> -value
DAYS 1	3.33	.0009
DAYS 2	.81	.4183
DAYS 3	1.41	.1582
DAYS 4	3.00	.0027
DAYS 5	3.05	.0024
DAYS 6	3.71	.0002

- 17.44** $d_L = 1.16$, $d_U = 1.59$; $4 - d_L = 2.84$, $4 - d_U = 2.41$; evidence of negative first-order autocorrelation

- 17.46** $d_L = 1.46$, $d_U = 1.63$; evidence of positive first-order autocorrelation.

- 17.48** $4 - d_U = 2.27$, $4 - d_L = 2.81$; no evidence of negative first-order autocorrelation.

- 17.50 c.** $d = .7859$; evidence of first-order autocorrelation.

- 17.52** $d = 2.2003$; $d_L = 1.30$, $d_U = 1.46$, $4 - d_U = 2.70$, $4 - d_L = 2.54$; no evidence of first-order autocorrelation.

- 17.54 b.** $t = 1.72$, $p\text{-value} = .0974$; no

- c.** $t = 4.64$, $p\text{-value} = .0001$; yes
d. $s_e = 63.08$ and $R^2 = .4752$; the model fits moderately well.

- f.** 69.2, 349.3

- 17.56 b.** $R^2 = .6123$; the model fits moderately well.

- c.** $F = 21.32$, $p\text{-value} = 0$; evidence that the model is valid.

- d.** Vacancy rate: $t = -4.58$, $p\text{-value} = .0001$; yes
 Unemployment rate: $t = -4.73$, $p\text{-value} = .0001$; yes

- e.** The error is approximately normally distributed with a constant variance.

- f.** $d = 1.28$; no evidence of first-order autocorrelation.

- g.** \$14.18, \$23.27

Chapter 18

- 18.4 a.** First-order model: Demand = $\beta_0 + \beta_1$ Price + ϵ ; Second-order model: Demand = $\beta_0 + \beta_1$ Price + β_2 Price² + ϵ
c. The second-order model fits better.

d. 269.3

- 18.6 a.** MBA GPA = $\beta_0 + \beta_1$

UnderGPA + β_2

GMAT + β_3 Work + β_4

UnderGPA × GMAT + ϵ

- b.** $F = 18.43$, $p\text{-value} = 0$; $s_e = .790$ and $R^2 = .4674$.

The model is valid, but the fit is relatively poor.

- 18.8 c.** Both models fit equally well. The standard errors of estimate and coefficients of determination are quite similar.

- 18.10 a.** Yield = $\beta_0 + \beta_1$ Pressure + β_2 Temperature + β_3 Pressure² + β_4 Temperature² + β_5 Pressure Temperature + ϵ

- c.** $S_e = 512$ and $R^2 = .6872$. The model's fit is good.

- 18.14** I_1 : $t = -1.54$, $p\text{-value} = .1269$; I_2 : $t = 2.93$, $p\text{-value} = .0043$;

- I_3 : $t = .166$, $p\text{-value} = .8684$. Only I_2 is statistically significant. However, this allows us to answer the question affirmatively.

- 18.16 c.** $t = -5.56$, $p\text{-value} = 0$; yes

- 18.18 b.** $t = -1.43$, $p\text{-value} = .1589$; no

- d.** I_1 : $t = 1.61$, $p\text{-value} = .1130$; I_2 : $t = 3.01$, $p\text{-value} = .0039$

- 18.20 c.** $s_e = 4.20$ and $R^2 = .5327$

- f.** 1.39, 18.49

- 18.22 a.** R^2 increased from .3270 to .6385 and the standard error of estimate decreased from 8.02 to 5.90. The model has improved.

- b.** 150.5, 174.1

- c.** 162.6, 186.3

- d.** The model is still useless.

- 18.24 b.** $b_4 = 1505.6$; after removing the effect of age, education, and weekly hours of work people who work for themselves earn on average \$1505.60 less than people who work for someone else.

- c.** $t = .468$, $p\text{-value} = .6402/2 = .3201$; no

- 18.26 a.** $t = -6.15$, $p\text{-value} = 0$; yes

- b.** $t = 6.17$, $p\text{-value} = 0$; yes

- 18.28 a.** $t = -5.06$, $p\text{-value} = 0$; yes

- b.** $t = 4.23$, $p\text{-value} = 0$; yes

- 18.30** Compare whites and others: $t = 1.42$, $p\text{-value} = .1545$. Compare blacks and others: $t = 5.90$, $p\text{-value} = 0$; evidence that there are differences blacks and others after removing the effects of age and education.

- 18.32** $t = 2.45$, $p\text{-value} = .0144$; yes

- 18.34 a.** $F = 344.0$, $p\text{-value} = 0$.
b. $t = 1.72$, $p\text{-value} = .0440$; yes

- 18.36** 26 cents

- 18.44 c.** $F = 54.14$, $p\text{-value} = 0$; yes

- 18.46 b.** $F = 14.91$, $p\text{-value} = 0$; yes

- 18.48 c.** $s_e = 87.98$, $R^2 = .1893$; the model fits poorly.

Chapter 19

- 19.2 a.** $z = 1.66$, $p\text{-value} = .0485$; yes

- b.** $z = 0$, $p\text{-value} = .5$; no

- 19.4** $T = 118$; no

- 19.6 a.** $z = 3.61$, $p\text{-value} = .0004$; yes

- b.** $z = 3.61$, $p\text{-value} = .0004$; yes

- 19.8** $z = 1.16$, $p\text{-value} = .1230$; no

- 19.10** $z = -1.42$, $p\text{-value} = .0778$; no

- 19.12** $z = 1.964$, $p\text{-value} = .0500$; yes

- 19.14** $z = .80$, $p\text{-value} = .2119$; no

- 19.16** $z = .80$, $p\text{-value} = .4238$; no

- 19.18** $z = .080$; no

- 19.20** $z = 2.20$, $p\text{-value} = .0278$; yes

- 19.22** $z = -1.39$, $p\text{-value} = .0816$; no

- 19.24** $z = 1.15$, $p\text{-value} = .2504$; no

- 19.26** $z = 1.42$, $p\text{-value} = .0772$; no

- 19.28** $z = .684$, $p\text{-value} = .2470$; no

- 19.30** $z = -.742$, $p\text{-value} = .2291$; no

- 19.32** $z = -3.71$, $p\text{-value} = .0002$; yes

- 19.34** $z = 5.95$, $p\text{-value} = 0$; yes
19.36 $z = -1.57$; $p\text{-value} = .0582$; yes
19.38 $z = 2.31$, $p\text{-value} = .0104$; yes
19.40 $z = 1.58$, $p\text{-value} = .0571$; no
19.42 $T = 34.5$; no
19.44 a. $z = 1.00$, $p\text{-value} = .1587$; no
b. $z = 1.00$, $p\text{-value} = .1587$; no
c. Identical results
19.46 a. $z = -2.06$, $p\text{-value} = .0396$; yes
b. $z = -.52$, $p\text{-value} = .6032$; no
c. The sign test ignores the magnitudes of the differences
19.48 $z = -5.25$, $p\text{-value} = 0$; yes
19.50 $z = 2.22$, $p\text{-value} = .0132$; yes
19.52 $T = 111$; no
19.54 $z = -2.24$, $p\text{-value} = .0125$; no
19.56 $z = 1.51$, $p\text{-value} = .0655$; no
19.58 $z = -7.40$, $p\text{-value} = 0$; yes
19.60 $H = 1.56$; no
19.62 $H = 6.30$; yes
19.64 $H = 4.46$, $p\text{-value} = .1075$; no
19.66 $F_r = 7.74$, $p\text{-value} = .0517$; yes
19.68 a. $F_r = 8.00$, $p\text{-value} = .0460$; yes
b. $F_r = 8.00$, $p\text{-value} = .0460$; yes
c. All codes that preserve the order produce the same results.
19.70 $H = 6.81$, $p\text{-value} = .0333$; yes
19.72 $F_r = 9.42$, $p\text{-value} = .0242$; yes
19.74 $F_r = 2.63$, $p\text{-value} = .2691$; no
19.76 $H = 14.04$, $p\text{-value} = .0029$; yes
19.78 $F_r = 5.28$, $p\text{-value} = .0715$; no
19.80 $H = 6.96$, $p\text{-value} = .0733$; no
19.82 $H = 4.34$, $p\text{-value} = .2269$; no
19.84 $H = 18.73$, $p\text{-value} = .0009$; yes
19.86 $H = 29.97$, $p\text{-value} = 0$; yes
19.88 $H = 7.54$, $p\text{-value} = .1098$; no
19.90 $H = 3.03$, $p\text{-value} = .2200$; no
19.92 $H = 33.69$, $p\text{-value} = 0$; yes
19.94 $z = 1.61$, $p\text{-value} = .1074$; do not reject the null hypothesis.
19.96 $r_S = .6931$; no
19.98 $r_S = .2250$; no
19.100 $z = -.20$, $p\text{-value} = .8412$; no
19.102 $z = .54$, $p\text{-value} = .2931$; no
19.104 $z = 3.87$, $p\text{-value} = .0001$; yes
19.106 $z = 5.52$, $p\text{-value} = 0$; yes
19.108 $z = -.195$, $p\text{-value} = 0$; yes
19.110 $z = -4.62$, $p\text{-value} = 0$; yes
19.112 $z = -.122$, $p\text{-value} = .4514$; no
19.114 $z = 3.30$, $p\text{-value} = .0005$; yes
19.116 $z = -5.25$, $p\text{-value} = 0$; yes
19.118 $z = 9.64$, $p\text{-value} = 0$; yes
19.120 $z = -1.04$, $p\text{-value} = .1499$; no
19.122 $z = -3.58$, $p\text{-value} = .0002$; yes
19.124 $H = 3.55$, $p\text{-value} = .1699$; no
19.126 $H = 14.87$, $p\text{-value} = .0213$; yes
19.128 $z = 1.12$, $p\text{-value} = .1309$; no
19.130 $z = 1.05$, $p\text{-value} = .2960$; no
19.132 $z = 2.86$, $p\text{-value} = .0021$; yes
19.134 $z = -2.43$, $p\text{-value} = .0075$; yes

- 19.136** $H = 42.59$, $p\text{-value} = 0$; yes
19.138 $z = -10.06$, $p\text{-value} = 0$; yes

Chapter 20

- 20.2** 38.8, 35.4, 35.8, 38.8, 44.4, 46.8, 48.8, 46.2
20.4 19.00, 21.67, 24.33, 26.67, 26.67, 26.33, 24.67, 24.33, 21.00, 19.00
20.8 12.00, 16.80, 16.16, 22.43, 18.09, 16.42, 23.28, 21.46, 22.69, 15.74
20.10 38.00, 38.50, 38.85, 39.47, 40.12, 40.91, 41.82, 42.53, 42.88, 43.09; there appears to be a gradual upward trend.
20.14 33.20, 34.80, 34.00, 37.00, 36.40, 35.20, 33.00, 36.20, 34.80, 37.00, 39.40, 44.20, 44.40, 45.00, 46.00, 43.60
20.16 18.00, 19.60, 22.56, 25.94, 28.76, 25.26, 30.35, 28.61, 27.17, 30.70, 36.02, 33.21, 36.33, 35.00, 41.80, 43.08
20.18 The quadratic model would appear to be the best model.
20.20 Linear model:
 $\hat{y} = -4.96 + 2.38t$ ($R^2 = .81$)
Quadratic model: $\hat{y} = 3.14 - 2.48t + .54t^2$ ($R^2 = .98$)
The quadratic trend line fits better.
20.22 .675, .892, .864, 1.212, 1.357
20.24 .839, 1.058, 1.270, .833
20.26 b. $\hat{y} = 49,661 - 25.04 \text{ Year}$
20.28 1.404, .517, .515, .621, .675, 1.145, 2.123
20.30 MAD = 4.60, SSE = 125
20.32 MAD = 9.6, SSE = 552
20.34 191.1, 331.2, 418.5, 169.2
20.36 540.5
20.38 43.08
20.40 30.71, 23.38, 22.67, 19.21
20.42 a. 17,775 **b.** 17,146
20.44 349.20, 323.16, 318.28, 367.60
20.46 136.47, 121.44, 88.60, 164.81
20.50 .646, 1.045, 1.405, .904

Chapter 21

- 21.6** 81
21.8 22
21.10 a. .6603 **b.** .0361
21.12 19,250
21.14 5.36
21.16 770,000
21.18 3.83
21.20 a. .3659 **b.** .0179
21.24 Zone boundaries: 170.10, 173.77, 177.44, 181.10, 184.77, 188.43, 192.10
21.26 c. The process is out of control at samples 29 and 30.
d. A level shift occurred.
21.28 The process is under control.
21.30 The process is under control.

- 21.32 a.** The process is out of control.
b. The process is out of control at sample 19.
c. The width became too small.
21.34 The process is out of control at sample 23 (S chart).
21.36 .92
21.38 The process went out of control at sample 29.
21.40 The process is under control.
21.42 Index = .53. The value of the index is low because the statistics used to calculate the control limits and centerline were taken when the process was out of control.
21.44 Centerline = .0324; control limits: 0, .07. The process is out of control at sample 25.
21.46 Centerline = .0383; control limits: 0, .0959. The process is out of control at samples 25 and 30.
21.48 Centerline = .0257; control limits: .0045, .047. The process is out of control at sample 28.
21.50 Centerline = .0126; control limits: 0, .0275. The process is out of control at sample 24.

Chapter 22

- 22.6 a₁**
22.8 a. Bake 2 cakes
b. Bake 2 cakes
22.10 Pay flat fee.
22.12 Order 200 shirts.
22.14 a. Build a medium size plant.
b. Build a medium size plant.
22.16 Don't produce
22.18 32.5
22.20 a. 10
b. 2
22.22 $I_1: .50, .50, 0$
 $I_2: .268, .357, .375$
 $I_3: .172, .345, .483$
 $I_4: .109, .435, .456$
22.24 a. $I_1: a_3; I_2: a_1$
b. 3.191
22.26 .30
22.28 As the prior probabilities become more diverse EVSI decreases.
22.30 4.1 million
22.32 a. Switch to rock and roll.
b. 194,000
22.34 Don't proceed with recycling venture.
22.36 38,104
22.38 c. Produce Battery 2
d. 50,000
22.40 315
22.42 Don't sample; install 25 telephones.
22.44 Rave review: Release in North America; Lukewarm response: Sell to European distributor; Poor response: Sell to European distributor.

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