R Textbook Companion for Mathematical Statistics and Data Analysis by John A. Rice¹

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Book Description

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R numbering policy used in this document and the relation to the above book.

Exa Example (Solved example)

Eqn Equation (Particular equation of the above book)

For example, Exa 3.51 means solved example 3.51 of this book. Sec 2.3 means an R code whose theory is explained in Section 2.3 of the book.

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Chapter 1

Probability

R code Exa 1.3.A Probability of coin toss

```
1 #Page 6
2
3 P_A = 0.5
4 P_B = 0.5
5 P_int = 0.25
6
7 prob = P_A + P_B -P_int
8
9 print(prob)
```

R code Exa 1.3.B AIDS infection

```
1 #Page 6
2
3 library(MASS)
4
5 P_A1 = fractions(1/500)
6 P_A2 = fractions(1/500)
```

```
7
8
9 prob_sum = P_A1 + P_A2
10
11 print(prob_sum)
```

R code Exa 1.4.A Atleast one head in two toss

```
1 #Page 7
2
3 P_one = 0.25
4
5 P_one_head = P_one *3
6
7 print(P_one_head)
```

R code Exa 1.4.B Simpsons Paradox

```
#Page 7

p_blck1 = 5/(5+6)
p_white1 = 3/(3+4)

print(round(max(p_blck1,p_white1),3))

p_blck2 = 6/(6+3)
p_white2 = 9/(9+5)

print(round(max(p_blck2,p_white2),3))

p_blck_sum = (5+6)/(5+6+6+3)
p_white_sum = (3+9)/(3+4+9+5)
```

```
16 print(round(max(p_blck_sum,p_white_sum),3))
```

R code Exa 1.4.1.A Combinations

```
1 #Page 8
2
3 Face_val = 13
4 suit = 4
5
6 combination = Face_val * suit
7
8 print(combination)
```

R code Exa 1.4.1.B Class representatives selection

```
1 #Page 8
2
3 boy = 12
4 girl = 18
5
6 total_ways = boy * girl
7
8 print(total_ways)
```

R code Exa 1.4.1.C 8 bit words

```
1 #Page 8
2
3 choice_one_bit = 2
```

```
5 choice_all_bit = runif(8,2,2)
6
7 total_choices = prod(choice_all_bit)
8
9 print(total_choices)
```

R code Exa 1.4.2.A Children lineup

```
1 #Page 10
2
3 total_lineup = factorial(5)
4
5 print(total_lineup)
```

R code Exa 1.4.2.B Different lines for lineup

```
1 #Page 10
2
3 total_lineup = choose(10,5) * factorial(5)
4
5 print(total_lineup)
```

R code Exa 1.4.2.C Choosing license plates

```
1 #Page 10
2
3 total_letters = 26
4
5 ways_letter_sample = total_letters^3
```

R code Exa 1.4.2.D Choosing license plates without duplicates

```
1 #Page 10
3 total_letters = 26
5 ways_letter_sample = total_letters^3
7 total_numbers = 10
9 ways_number_sample = total_numbers^3
10
11 total_plates = ways_letter_sample * ways_number_
     sample
12
13 print(total_plates)
14
15 letter_chosing = choose(total_letters,3)*factorial
      (3)
16
17 number_chosing = choose(total_numbers,3)*factorial
      (3)
18
19 chosing_without_replace = letter_chosing * number_
      chosing
20 print(chosing_without_replace)
```

R code Exa 1.4.2.E Birthday Problem

```
#Page 10

prob = function(n){

A_comp = choose(365,n)*factorial(n)

p_A_comp = A_comp / 365**n

p_A = 1 - p_A_comp

return(p_A)

}

age = c(4,16,23,32,40,56)

bthdy = data.frame(age,prob(age))

print(round(bthdy,3))
```

R code Exa 1.4.2.F Sharing birthday

```
1 #Page 10
2
3 prob = function(n){
4
5    n_A_comp = 364**n
6    p_A_comp = n_A_comp / 365**n
7    p_A = 1 - p_A_comp
8    return(p_A)
```

```
9 }
10
11 func_people = function(n) prob(n)-0.5
12
13 num_people = uniroot(func_people, lower = 0, upper = 365)
14
15 print(num_people)
```

R code Exa 1.4.2.G California Lottery

```
#Page 12

tot_num = 49
num_choose = 6

tot_way = choose(tot_num,num_choose)
print(tot_way)

new_rul_tot = 53

tot_way_new_rule = choose(new_rul_tot,num_choose)
print(tot_way_new_rule)
```

R code Exa 1.4.2.I Capture Recapture Method

```
1 #Page 13
2
3 prob = function(n){
4
5   total_grp = choose(n,20)
6   no_evnt = choose(10,4)*choose(n-10,16)
7   liklihood = no_evnt/total_grp
```

```
8    return(liklihood)
9  }
10
11    n = seq(20,100)
12
13    plot(n,prob(n))
14
15    print(max(prob(n)))
```

R code Exa 1.4.2.J Seven member committe

```
1 #Page 15
2
3 library(iterpc)
4
5 way = multichoose(c(3,2,2))
6
7 print(way)
```

R code Exa 1.4.2.K Nucleotide sequence

```
1 #Page 15
2
3 library(iterpc)
4
5 way = multichoose(c(2,4,3))
6
7 print(way)
```

R code Exa 1.5.A Urn both red

```
#Page 17

library(MASS)

p_r1 = fractions(3/4)
p_r2_r1 = fractions(2/3)

p_intersect = p_r1*p_r2_r1

print(p_intersect)
```

R code Exa 1.5.B Cloudy and raining probability

```
1 #Page 18
2
3 p_a_b = 0.3
4 p_b = 0.2
5
6 p_intersect = p_a_b*p_b
7
8 print(p_intersect)
```

R code Exa 1.5.C Red ball selection from urn

```
1 #Page 19
2
3 library(MASS)
4
5 p_r1 = fractions(3/4)
6 p_r2_r1 = fractions(2/3)
7 p_r2_b1 = 1
8 p_b1 = 1 - p_r1
```

```
10 p_r2 = p_r2_r1*p_r1 + p_r2_b1*p_b1
11
12 print(p_r2)
```

R code Exa 1.5.D Occupation problem Glass and Hall

R code Exa 1.5.E Coronary artery disease Diamond and Forrester

```
1 #Page 20
2
3 cname = c("d+", "d-")
4
5
6 val = c(0.42, 0.96, 0.24, 0.02, 0.2, 0.02, 0.15, 0)
```

```
7
8 prob_matrix = matrix(val, ncol = 2, byrow = TRUE )
9 colnames(prob_matrix) = cname
10
11 print(prob_matrix)
12
13 cval1 = c(0.05, 0.95)
14
15 prob_t0 = sum(prob_matrix[1,]*cval1)
16 prob_t1 = sum(prob_matrix[2,]*cval1)
17
18 prob_dplus_t0 = prob_matrix[1, 'd+']*cval1[1]/prob_t0
19 prob_dplus_t1 = prob_matrix[2, 'd+']*cval1[1]/prob_t1
20
21
22 print(c(prob_dplus_t0, prob_dplus_t1))
23
24 \text{ cval2} = c(0.92, 0.08)
25
26 \text{ prob}_t0_2 = \text{sum}(\text{prob}_matrix}[1,]*\text{cval2})
27 \text{ prob}_t1_2 = sum(prob\_matrix[2,]*cval2)
28
29 prob_dplus_t0_2 = prob_matrix[1, 'd+']*cval2[1]/prob_
      t0_2
30 prob_dplus_t1_2 = prob_matrix[2, 'd+']*cval2[1]/prob_
      t1_2
31
32 print(c(prob_dplus_t0_2, prob_dplus_t1_2))
```

R code Exa 1.5.F Polygraph Test

```
1 #Page 21
2
3 p_t = 0.99
4 p_plus_t = 0.14
```

```
5
6  p_t_plus = (p_plus_t*p_t)/(p_plus_t*p_t + (1-p_plus_t)*(1- p_t))
7
8  print(round(p_t_plus,2))
```

R code Exa 1.6.A Ace and Diamond probability

```
1 #Page 23
2
3 library(MASS)
4
5 p_a = fractions(4/52)
6 p_d = fractions(1/4)
7
8 p_intersect = p_a*p_d
9
10 print(p_intersect)
```

R code Exa 1.6.D No AIDS infection

```
#Page 24

p_transmit = 1/500

p_no_transmit = 1 - p_transmit

p_no_infection = round(p_no_transmit**500,2)

print(p_no_infection)

p_infection = round(1 - p_no_infection,2)
```

```
13 print(p_infection)
```

R code Exa 1.6.F Circuit fail

```
1 #Page 25
2
3 circuit = function(n,p){
4    (1-p)**n
5 }
6
7 n = 10
8 p = 0.05
9
10 circuit_work = round(circuit(n,p),2)
11 circuit_fail = 1 - circuit_work
12
13 print(c(circuit_work, circuit_fail))
14
15 system_fail = p**10
16
17 print(system_fail)
```

Chapter 2

Random Variables

R code Exa 2.1.2.A Tay Sachs disease

```
1 #Page 38
2
3 k = seq(0,4)
4
5 p_k = data.frame(k,p_k = round(dbinom(k,4,0.25),3))
6
7 print(p_k)
```

R code Exa 2.1.2.B Message receiving error

```
1 #Page 39
2
3 binom_approx = function(n,k,p){
4    r = seq(0,k)
5    sum(choose(n,r)*(p**r)*((1-p)**(n-r)))
6 }
7
8 p_2_error = binom_approx(5,2,0.1)
```

```
10 print(p_2_error)
```

R code Exa 2.1.3.A State lottery frequency function

```
1 #Page 40
2
3 p = 1/9
4
5 ticket = seq(1,50)
6
7 plot(ticket, dgeom(ticket,p), ylab = "p(x)")
```

R code Exa 2.1.3.B Distribution of ticket

```
1 #Page 41
2
3 neg_bino_2 = function(k,p){
4   (k-1)*p**2*(1-p)**(k-2)
5 }
6
7 x = seq(1,50)
8 p = 1/9
9
10 plot(x,neg_bino_2(x,p))
```

R code Exa 2.1.4.A Lottery mass function

```
1 #Page 42
```

```
3 k = seq(0,6)
4
5 data.frame(k, p_k = dhyper(k,6,47,6))
```

R code Exa 2.1.5.A Binomial and poisson approximation

```
1 #page 44
2
3 k = seq(0,11)
4 prob = 1/36
5
6 p_binom = round(dbinom(k, size = 100, p = prob),4)
7
8 p_pois = round(dpois(k, lambda = 100*prob),4)
9
10 approximation = data.frame(k, binomial_probability = p_binom, poisson_probability = p_pois)
11
12 print(approximation)
13
14 #The answer may slightly vary due to rounding off values.
```

R code Exa 2.1.5.B Horse kick fatalities

```
1 #Page 45
2
3 death = seq(0,4)
4
5 freq = c(109,65,22,3,1)
6
7 rel_freq = freq/sum(freq)
8
```

```
9 p_pois = round(dpois(death, lambda = 0.61),3)
10
11 kicks = data.frame(death, freq, rel_freq,p_pois)
12
13 print(kicks)
```

R code Exa 2.1.5.C Telephone call poisson process

```
#Page 46
2
3 lambda_process = 0.5
4
5 parameter = 5*lambda_process
6
7 p_no_call = round(exp(-parameter),3)
8
9 p_one_call = round(dpois(1,lambda = parameter),3)
10
11 print(c(p_no_call, p_one_call))
```

R code Exa 2.1.5.D Poisson process simulation

```
1 #Page 46
2
3 a1 = rpois(20, lambda = 25)
4 a2 = rpois(20, lambda = 25)
5 a3 = rpois(20, lambda = 25)
6 a4 = rpois(20, lambda = 25)
7
8 par(mfrow = c(2,2))
9 plot(a1/mean(a1))
10 plot(a2/mean(a2))
11 plot(a3/mean(a3))
```

R code Exa 2.2.C Quartile of distribution Function

```
1 #Page 48
2
4 F = function(n) {
    if (n < 0) return(0) else if (n <= 1) return(n^2)
         else return(1)
6 }
8 F_inv = function(n){
     if (n < 0) return(0) else if ( n <= 1) return(sqrt
        (n)) else return(1)
10 }
11
12 \text{ median} = F_{inv}(0.5)
13 low_quart = F_inv(0.25)
14 up_quart = F_inv(0.75)
15
16 print(round(c(median, low_quart, up_quart),3))
```

R code Exa 2.3.A Standardized IQ scores

```
8 print(prob)
9
10 #The answer may slightly vary due to rounding off
     values
```

R code Exa 2.3.B Normal probability

```
1 #Page 61
2
3
4 prob = round(pnorm(1) - pnorm(-1),2)
5
6 print(prob)
```

R code Exa 2.3.D CDF of uniform distribution

```
1 #Page 62
2
3 F = expression(1 - 1/v)
4
5 f = D(F, "v")
6
7 print(f)
```

Chapter 3

Joint Distributions

R code Exa 3.3.A Joint density plot

```
#Page 75

library(Ryacas)
bi_density = function(x,y) (x^2 + x*y)*12/7

x = yac_symbol("x")
y = yac_symbol("y")

integrand = integrate(bi_density(x,y), y, 0, "x")

prob = integrate(integrand, x, 0, 1)
print(prob)

x = y = seq(0,1, length = 10)
z = outer(x,y,bi_density)

persp(x,y,z,theta = 30, phi = 30,ticktype = "detailed")
```

R code Exa 3.3.B Marginal Disstribution

```
#Page 76

library(Ryacas)
bi_density = function(x,y) (x^2 + x*y)*12/7

x = yac_symbol("x")
y = yac_symbol("y")

marginal_x = simplify(integrate(bi_density(x,y), y, 0, 1))

marginal_y = simplify(integrate(bi_density(x,y), x, 0, 1))

marginal_y = simplify(integrate(bi_density(x,y), x, 0, 1))
```

R code Exa 3.3.C Farlie Morgenstern Family

```
#Page 77

#Page 77

#Page 77

##Page 77
```

```
13 z_neg_1 = outer(x,y,function(x,y) eval(h_neg_1))
14 z_1 = outer(x,y,function(x,y) eval(h_1))
15
16
17 persp(x,y,z_neg_1,theta = 30, phi = 30,ticktype = "detailed")
18 persp(x,y,z_1,theta = 30, phi = 30,ticktype = "detailed")
```

R code Exa 3.3.E Random point in a disk

```
1 #Page 81
2
3 library(Ryacas)
4
5 disk = function(x) (sqrt(1 - x^2))
6 area = function(x,y) 1/pi + 0*x*y
7
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 marginal = integrate(area(x,y), y, as.character(-disk(x)), as.character(disk(x)))
12
13 print(marginal)
14
15 #The answer may vary due to difference in representation.
```

R code Exa 3.5.1.A Conditional Distribution frequency

```
1 #Page 87
```

```
3 library(MASS)
4
5 disc = fractions(c(1/8, 2/8, 1/8, 0, 0, 1/8, 2/8, 1/8))
6
7 table = fractions(matrix(disc, byrow = TRUE, nrow = 2))
8
9 p_y_1 = sum(table[,2])
10
11 p_0_1 = table[1,2]/p_y_1
12 p_1_1 = table[2,2]/p_y_1
13
14 print(fractions(c(p_0_1, p_1_1)))
```

R code Exa 3.6.2.B Jacobian finding

```
1 #Page 102
2
3 library(Ryacas)
4
5 r = function(x,y) (sqrt(x^2 + y^2))
6 theta = function(x,y) (atan(y/x))
7
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 drdx = deriv(r(x,y),"x")
12 drdy = deriv(r(x,y), "y")
13 dthetadx = deriv(theta(x,y), "x")
14 dthetady = deriv(theta(x,y), "y")
15
16 J = simplify(drdx*dthetady) - simplify(drdy*dthetadx
)
```

```
18 print(J)
19
20 #The answer may vary due to difference in
    representation.
```

R code Exa 3.7.D Distribution of Range

```
1 #Page 106
2
3 library(Ryacas)
5 integrand = function(n,r,v) n*(n-1)*r^(n-2) +0*v
7 n = yac_symbol("n")
8 r = yac_symbol("r")
9 v = yac_symbol("v")
10
11 f_r = integrate(integrand(n,r,v), v, 0, "1-r")
12
13 print(f_r)
14
15 F_r = integrate(f_r, r, 0, "r")
16
17 print(F_r)
19 #The answer may vary due to difference in
     representation.
```

R code Exa 3.7.E Tolerance Interval

```
1 #Page 106
2
3 n = 100
```

```
4 alpha = 0.95
5
6 prob_q = round(1 - n*alpha^(n-1) + (n-1)*alpha^n,2)
7
8 print(prob_q)
```

Chapter 4

Expected Values

R code Exa 4.1.A Roulette

```
1 #Page 116
2
3 library(MASS)
4
5 freq = c(1,-1)
6 prob = c(18/38, 20/38)
7
8 expectation = fractions(sum(freq*prob))
9
10 print(expectation)
```

R code Exa 4.1.H Cauchy pseudorandom generator

```
1 #Page 119
2
3 set.seed(30)
4
5 n = seq(1,500)
```

```
7 x_n = rnorm(500)
8 x_c = rcauchy(500)
9
10 g_n = c()
11 c_n = c()
12
13 for (i in n) {
     g_i = mean(x_n[1:i])
14
     c_i = mean(x_c[1:i])
15
16
17
     g_n = c(g_n, g_i)
18
     c_n = c(c_n, c_i)
19 }
20
21 \quad par(mfrow = c(2,1))
22 plot(n, abs(g_n), ylim = c(0,1))
24 \text{ plot}(n,c_n)
25
26 #The answer may vary due to difference in
      representation.
```

R code Exa 4.1.2.B Coupon Collection

```
1 #Page 127
2
3 library(Ryacas)
4
5 e_xr = function(n,r) n/(n-r+1)
6
7 n = 10
8 r = yac_symbol("r")
9
10 e_x = sum(e_xr(n,r), r, 1, n)
```

```
11
12  print(round(as_r(e_x),1))
13
14  e_x_appox = function(n) n*(log(n) -digamma(1))
15
16  print(round(e_x_appox(n), 1))
```

R code Exa 4.1.2.C Group Testing

```
1 #Page 129
2
3 prop_n = function(k,p) 1 + 1/k -p^k
4
5 p = 0.99
6 k = seq(1,20)
7
8 prop = prop_n(k,p)
9
10 plot(k, prop, ylab = "Proportion")
```

R code Exa 4.2.C Uniform Distribution Variance

```
1 #Page 132
2
3 library(MASS)
4
5 e_x = 1/2
6
7 e_x2 = integrate(function(x) x^2, 0, 1)
8
9 var_x = fractions( e_x2$value - (e_x)^2 )
10
11 print(var_x)
```

R code Exa 4.3.A Bivariate covariance

```
1 #Page 138
3 library(Ryacas)
4 library (MASS)
6 bi_f = function(x,y) 2*x + 2*y - 4*x*y
8 x = yac_symbol("x")
9 y = yac_symbol("y")
10
11 e_{xy} = integrate(bi_f(x,y)*x*y, x, 0, 1)
12 e_xy = integrate(e_xy, y, 0, 1)
13
14 print(e_xy)
16 e_x = e_y = 1/2
17
18 cov_xy = fractions(as_r(e_xy) - e_x*e_y)
19
20 print(cov_xy)
```

R code Exa 4.3.D Bivariate correlation coefficient

```
1 #Page 142
2
3 library(MASS)
4
5 var_x = var_y = 1/12
6 cov_xy = -1/36
```

```
7
8 corr_coef = fractions(cov_xy/sqrt(var_x*var_y))
9
10 print(corr_coef)
```

R code Exa 4.4.1.E Random Sums

```
1 #Page 151
2
3 E_x = 1000
4 var_n = 900
5
6 E_n = 900
7 var_x = 500
8
9 var_t = E_x^2 * var_n + E_n * var_x^2
10
11 sd = sqrt(var_t)
12
13 cat(sd, var_t)
```

R code Exa 4.6.B Accuracy of approximations

```
1 #Page 163
2 library(MASS)
3
4 g_x = function(x) sqrt(x)
5 x = seq(0,2,0.001)
6 plot(x, g_x(x), type = "1")
7
8 e_y = fractions(integrate(g_x, 0,1)$value)
9 print(e_y)
10 e_y2 = 1/2
```

```
11
12 \text{ var_y} = e_y^2 - e_y^2
13 print(var_y)
14 sd_y = sqrt(var_y)
15 print(c("Exact results", round(e_y,3), round(var_y
      ,3), round(sd_y,3)))
16
17 g_1x = D(expression(sqrt(p)), "p")
18 g_2x = D(g_1x, p)
19
20
21 \text{ mu} = 1/2
22 \text{ var} = 1/12
23
24
25 app_e_y = g_x(mu) + 1/2*var*eval({p = mu; g_2_x})
26 app_var_y = var * eval(\{p = mu; g_1_x\})^2
27 app_sd_y = sqrt(app_var_y)
28 print(c("Approximate Results", round(app_e_y,3),
      round(app_var_y,3), round(app_sd_y,3)))
```

Chapter 5

Limit Theorems

R code Exa 5.2.A Monte Carlo Integration

```
1 #Page 179
2
3 set.seed(1)
4 I_f = round(pnorm(1) - pnorm(0),4)
5
6 x = runif(1000)
7
8 app_I_f = 1/1000*(1/sqrt(2*pi))*sum(exp(-x^2/2))
9
10 cat("Exact", I_f, "Approximation", app_I_f)
11
12 #The answer may vary due to difference in representation.
```

R code Exa 5.3.B Particle emission from poisson process

```
1 #Page 183
```

R code Exa 5.3.C Approximating uniform distribution as Normal density

```
1 #Page 185
3 set.seed(39)
4 \times = c()
6 for(i in 1:1000){
    x_i = runif(12, -1/2, 1/2)
     x = append(x, sum(x_i))
9 }
10
11 miu = mean(x)
12 \text{ sd} = \text{sqrt}(\text{var}(x))
13
14 freq = hist(x, xlim = c(-4,6))
15 height = max(freq$counts)/dnorm(miu,miu,sd)
16 curve(dnorm(x,miu,sd)*height, add = TRUE, col = "
      dark blue")
17
18 #The answer may vary due to difference in
      representation
```

R code Exa 5.3.E Measurement Error

```
1 #Page 186
```

R code Exa 5.3.F Normal Approximation to Binomial Density

```
#Page 187

2
3 p = 0.5
4 n = 100
5
6 miu = n*p
7 sd = sqrt(n*p*(1-p))
8
9 x = 60
10
11 prob_approx = 1 - pnorm((x - miu)/sd)
12
13 print(round(prob_approx,4))
```

Chapter 7

Survey Sampling

R code Exa 7.3.1.A Simulation of sampling distribution

```
1
2 sample = function(n) replicate(500, mean(runif(n, 0, 2000)))
3
4 par(mfrow = c(4,1))
5 hist(sample(8), xlim = c(0,2000))
6 hist(sample(16), xlim = c(0,2000))
7 hist(sample(32), xlim = c(0,2000))
8 hist(sample(64), xlim = c(0,2000))
```

R code Exa 7.3.1.B Sampling without replacement

```
1 #Page 209
2
3 var = 589.7
4 n = 32
5
6 N = 393
```

```
7
8 var_sample = var/sqrt(n)*sqrt(1 - (n-1)/(N-1))
9
10 print(round(var_sample,1))
```

R code Exa 7.3.1.C Sampling result applied to estimation

```
1 #Page 209
2
3 var = 589.7
4 n = 32
5 p = 0.654
6
7 N = 393
8
9 population_corr = sqrt(1 - (n-1)/(N-1))
10 std_error = sqrt(p*(1-p)/n)*population_corr
11
12 print(round(std_error,2))
```

R code Exa 7.3.2.A Standard Error of estimate

```
1 #Page 213
2
3 var = 589.7
4 n = 50
5
6 s = 614.53
7 X_bar = 938.5
8
9 N = 393
10
11 var_sample = s^2/n*(1 - n/N)
```

```
12 sd = sqrt(var_sample)
13
14 cat(var_sample,sd)
```

R code Exa 7.3.2.B Estimated standard error of true value

```
1 #Page 213
2
3 X_bar = 938.5
4
5 N = 393
6
7 s_x = 81.19
8
9 T = N*X_bar
10 s = N*s_x
11
12 cat(round(T), round(s))
```

R code Exa 7.3.2.C Standard error of Variance

```
1 #Page 213
2
3 p = 0.654
4 p_hat = 26/50
5
6 n = 50
7
8 N = 393
9
10 var_p_hat = p_hat*(1-p_hat)/(n-1)*(1 - n/N)
11
12 sd_p_hat = sqrt(var_p_hat)
```

```
13
14 error = 2*sd_p_hat
15
16 cat(round(sd_p_hat,3),round(error,3))
```

R code Exa 7.3.3.A CLT Approximation

```
1 #Page 215
2
3 var = 589.7
4 n = 64
5
6 X_bar = 938.5
7
8 N = 393
9
10 var_sample = var^2/n*(1 - n/N)
11 sd = round(sqrt(var_sample),1)
12
13 prob = round(1 - pnorm(100/sd),3)
14
15 cat(sd,prob)
```

R code Exa 7.3.3.B Standard error of sample mean

```
1 #Page 216
2
3 n = 50
4 sd_x = 78
5
6 X_bar = 938.35
7 c = 123.9
```

```
9 prob = round(2 - 2*pnorm(c/sd_x),2)
10
11 print(prob)
```

R code Exa 7.3.3.C Hospital discharge problem estimate error

```
1 #Page 216
2
3 p_hat = 0.52
4 p = 0.65
5
6 n = 50
7 N = 393
8
9 c = abs(p_hat - p)
10
11 sd_p = sqrt(p*(1-p)/n*(1-(n-1)/(N-1)))
12
13 prob_estimate = round(2*(1 - pnorm(2.03)),2)
14
15 print(prob_estimate)
```

R code Exa 7.3.3.D Error of condominium units

```
1 #Page 219
2
3 N = 8000
4 n = 100
5
6 s = 0.8
7 X_bar = 1.6
8
9 s_x = round(s/sqrt(n)*sqrt(1 - n/N),2)
```

```
10
11 z = abs(qnorm(0.025))
12
13 cat("CI for X_bar (", round(X_bar - z*s_x,2), round(
      X_bar + z*s_x,2), ")")
14
15 T = round(N*X_bar)
16 s_t = round(N*s_x)
17
18 cat("CI for Total (", round(T - z*s_t), round(T + z*
      s_t), ")")
19
20 p_hat = 0.12
21 s_p = round(sqrt(p_hat*(1-p_hat)/(n-1)*(1 - n/N)), 2)
22
23 cat("CI for population proportion (", round(p_hat -
      z*s_p,2), round(p_hat + z*s_p,2), ")")
24
25 \text{ T_p = round}(N*p_hat)
26 \text{ s_tp = round}(N*s_p)
27
28 cat ("CI for number population planning (", round (T_p)
       - z*s_tp), round(T_p + z*s_tp), ")")
```

R code Exa 7.3.3.E Error of owners selling

```
1 #Page 220
2
3 z = 1.96
4 N = 8000
5
6 p_hat = 0.12
7
8 correction = z*N*sqrt(p_hat*(1-p_hat))/200
9 n = 1 + round(correction**2)
```

```
10
11 print(n)
```

R code Exa 7.4.A Mortgage payment R standard error

```
1 #Page 223
2
3 n = 10
4 N = 100
5 X_bar = 3100
6 \ Y_bar = 868
7 s_y = 250
8 s_x = 1200
9 \text{ row} = 0.85
10 R = 0.28
11
12 s_r = round(1/n*(1 - (n-1)/(N-1))/X_bar*
     sqrt(R^2*s_x^2 + s_y^2 - 2*R*row*s_x*s_y),3)
13
14
15 print(c("s_r",s_r))
16
17 cat("CI for r (", R - z*s_r, R + z*s_r, ")")
18
19 #The answer may slightly vary due to rounding off
      values.
```

R code Exa 7.4.D Precision of ratio estimate

```
1 #Page 226
2
3 miu_x = 274.8
4 miu_y = 814.6
5 r = 2.96
```

```
6
7 \text{ sd}_x = 213.2
8 \text{ sd}_y = 589.7
9 \text{ row} = 0.91
10
11 n = 64
12 N = 500
13
14 var_y_bar = (r^2*sd_x^2 + sd_y^2 - 2*r*row*sd_x*sd_y
      )/n
15
16 sd_y_bar = sqrt(var_y_bar)
17
18 print(sd_y_bar)
19
20 \text{ sd} = 589.7
21 sd_y_bar_simple = sd*sqrt((1-(n-1)/(N-1))/n)
22
23 print(sd_y_bar_simple)
24
25 ratio = (var_y_bar*n) /sd^2
26
27 print(round(ratio,4))
28
29 #The answer may slightly vary due to rounding off
      values.
```

R code Exa 7.5.2.A Size stratification of Hospitals

```
1 #Page 230
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
```

```
7
8 hospital = data.frame(N,W,miu,sd)
9
10 var = 4*sum(W^2*sd^2)
11 sd_x_s = sqrt(var)
12
13 print(sd_x_s)
```

R code Exa 7.5.2.B CI for population mean of Hospital strata

```
1 #Page 231
3 N = c(98,98,98,99)
4 \text{ W} = \mathbf{c}(0.249, 0.249, 0.249, 0.251)
5 \text{ miu} = c(182.9, 526.5, 956.3, 1591.2)
6 \text{ sd} = c(103.4, 204.8, 243.5, 419.2)
8 hospital = data.frame(N,W,miu,sd)
10 x_bar = c(240.6, 507.4, 865.1, 1716.5)
11 \text{ s_var} = c(6827.6, 23790.7, 42573, 152099)
12
13 \, n = 10
14
15 X_s = mean(x_bar)
16 var_x = round(1/n*sum(W^2*(1 - (n-1)/(N-1))*s_var)
      , 1)
17
18 sd_x = sqrt(var_x)
19
20 cat(X_s, var_x, sd_x)
21 cat("CI for X_{bar} (", round(X_{s} - 1.96*sd_{x}, 2),
      round(X_s + 1.96*sd_x, 2), ")")
22
23 \text{ T_s} = \text{sum}(N)*X_s
```

R code Exa 7.5.3.A Weight allocation of hospital strata

```
1 #Page 234
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 weight = W*sd/sum(W*sd)
11
12 print(round(weight,3))
```

R code Exa 7.5.3.B Proportional allocation of Hospital strata

```
1 #Page 236
2
3 N = c(98,98,98,99)
4 W = c(0.249, 0.249, 0.249, 0.251)
5 miu = c(182.9,526.5,956.3,1591.2)
6 sd = c(103.4, 204.8, 243.5, 419.2)
7
8 hospital = data.frame(N,W,miu,sd)
9
10 var_ratio = 1 + sum(W*(sd-mean(sd))^2)/sum(W*sd)^2
```

```
11
12 print(round(var_ratio,3))
13
14 #The answer may vary due to rounding off values
```

R code Exa 7.5.3.C Optimal allocation improvement

```
#Page 237

N = c(98,98,98,99)
W = c(0.249, 0.249, 0.249, 0.251)
miu = c(182.9,526.5,956.3,1591.2)
sd = c(103.4, 204.8, 243.5, 419.2)

hospital = data.frame(N,W,miu,sd)

var_ratio = 1 + sum(W*(miu-mean(miu))^2)/sum(W*sd^2)

print(round(var_ratio,3))

#The answer may vary due to rounding off values
```

Chapter 8

Estimation of Parameters and Fitting of Probability Distributions

R code Exa 8.4.A Moments of Poisson Distribution

R code Exa 8.4.C Fitting of Gamma Distribution

```
1 #Page 263
2
3 X_bar = 0.224
4 sigma_hat_2 = 0.1338
5
6 lambda_hat = round(X_bar/sigma_hat_2,3)
7 alpha_hat = round(X_bar^2/sigma_hat_2,3)
8
9 print(c(lambda_hat,alpha_hat))
```

R code Exa 8.4.D Method of moments distribution of Angular Distribution

```
1 #Page 119
2
3 library(Ryacas)
4
5 f = function(x,a) x*(1 + a*x)/2
6
7 x = yac_symbol("x")
8 a = yac_symbol("a")
9
10 miu = integrate(f(x,a),"x",-1,1)
11
12 print(simplify(miu))
```

R code Exa 8.5.1.A Hardy Weinberg Equilibrium

```
1 #Page 273
2
3 x = c(342,500,187)
4
5 theta_hat = (2*x[3] + x[2])/(2*sum(x))
```

```
6
7 print(round(theta_hat,4))
```

R code Exa 8.5.3.A MLE simulation of mu and sigma squared

```
1 #Page 279
2
3 library(plotrix)
4 x_bar = c()
5 \text{ sd_hat} = c()
7 for(i in 1:20){
     x = rnorm(11, mean = 10, sd = 9)
     print(mean(x))
     x_bar = c(x_bar, mean(x))
10
     sd_hat = c(sd_hat, sd(x))
11
12 }
13
14 \, n = 11
15 \text{ alpha} = 0.9
16 lower_sd = n*sd_hat^2/qchisq(alpha/2, df = n-1)
17 upper_sd = n*sd_hat^2/qchisq(1-alpha/2, df = n-1)
18
19 plotCI(x = 1:20, y = sd_hat, li = upper_sd, ui =
      lower_sd, y_lim = c(7,12)
```

R code Exa 8.5.3.B Poisson distribution MLE

```
1 #Page 282
2
3 X_bar = 24.9
4 n = 23
5 alpha = 0.9
```

```
6
7 s_lamda = round(sqrt(X_bar/n),2)
8 print(s_lamda)
9
10 z = abs(qnorm((1-alpha)/2))
11
12 uplim = round(X_bar + z*s_lamda,2)
13 lowlim = round(X_bar - z*s_lamda,2)
14
15 cat("CI for lambda hat is (", lowlim, uplim, ")")
```

R code Exa 8.5.3.C Hardy Weinberg Equilibrium

```
1 #page 283
2
3 theta_hat = 0.4247
4 n = 1029
5
6 s_theta = sqrt(theta_hat*(1 - theta_hat)/(2*n))
7
8 cat("CI for theta (", round(theta_hat - 1.96*s_theta, 3), round(theta_hat + 1.96*s_theta, 3), ")")
```

 $\bf R$ code Exa $\bf 8.5.3.D$ Bootstrap estimate of Hardy Weinberg equilibrium problem

```
1 #Page 284
2
3 quan_25 = 0.403
4 quan_975 = 0.446
5
6 theta_hat = 0.425
```

```
8 d = quan_25 - theta_hat
9 d_bar = quan_975 - theta_hat
10
11 cat("CI for theta", theta_hat - d_bar, theta_hat - d
)
```

R code Exa 8.5.3.E Bootstrap to find CI for Gamma Distribution

```
1 #Page 285
2
3 quan_50 = 0.419
4 quan_950 = 0.538
5
6 alpha_bar = 0.471
7
8 d = quan_50 - alpha_bar
9 d_bar = quan_950 - alpha_bar
10
11 cat("CI for theta", alpha_bar - d_bar, alpha_bar - d_bar)
```

R code Exa 8.7.A Muon decay

```
1 #Page 299
2
3 alpha = seq(0.1,0.9,0.1)
4 alpha = append(alpha,0.95)
5
6 eff = 2*alpha^3/(3-alpha^2)*(1/(log((1+alpha)/(1-alpha)) - 2*alpha))
7
8 print(data.frame(alpha, round(eff,3)))
```

R code Exa 8.7.1.A Approximation to insect count problem

```
1 # Page 304
2 x = 0:7
3 \quad count = c(70, 38, 17, 10, 9, 3, 2, 1)
5 \quad lambda = sum(count*x)/150
6 pois_dist = round(dpois(x,lambda)*150,1)
8 neg_dist_prob = function(m,k,n){
     if(n == 0) p = (1 + (m/k)) **(-k)
10
     else p = (k + n -1)/n*(m/(k+m))* neg_dist_prob(m,k)
        ,(n-1))
11 }
12
13 m = 1.146
14 k = 1.025
15 neg_bin_dist = round(sapply(x, neg_dist_prob, m = m,
      k = k) * 150, 1)
16
17 data.frame(Number_per_leaf = x, Observed_Count =
      count , Poisson_Distribution = pois_dist , Negative
      _Binomial_Distribution = neg_bin_dist)
18
19 # The answer may slightly vary due to rounding off
      values
```

Chapter 9

Testing Hypotheses and Assessing Goodness of Fit

R code Exa 9.5.A Hardy Weinberg Equilibrium data fitting

R code Exa 9.5.B Chi squared statistic of Bacterial Clumps

```
1 #Page 344
3 n = 400
4 \text{ no} = c(0:10,19)
5 \text{ freq} = c(56,104,80,62,42,27,9,9,5,3,2,1)
  lambda = sum(no*freq)/n
9 print(lambda)
10
11 o = c(freq[1:7], sum(freq[8:length(freq)]))
12 e = round(dpois(no[1:7], lambda = lambda)*n,1)
13 e = append(e, round(400*(ppois(10, lambda)-ppois(6,
      lambda)),1))
14 x_2 = round((o-e)^2/e, 2)
15
16 table = data.frame(o,e,x_2)
17 print(table)
18
19 chi_sq = sum(x_2)
20 print(chi_sq)
```

R code Exa 9.5.C Fishers Reexamination of Mendels Data

```
1 #Page 345
2
3 o = c(315,108,102,31)
4 freq = c(9/16,3/16,3/16,1/16)
5 n = 556
```

```
7 e = freq*n
8
9 table = data.frame(o,e)
10
11 log_lambda = 2*sum(o*log(o/e))
12
13 print(round(log_lambda,3))
```

R code Exa 9.6.A Poisson Dispersion test of Asbestos Fibers

R code Exa 9.6.B Poisson Distribution fitting of Bacterial clumps

```
1 #Page 348
2
3 n = 400
4 no = c(0:10,19)
5 freq = c(56,104,80,62,42,27,9,9,5,3,2,1)
6
```

```
7 x_bar = sum(no*freq)/n
9 print(lambda)
10
  var_hat = sum(no^2*freq)/n - x_bar^2
11
12
13 print(var_hat)
14
15 T = n*var_hat/x_bar
16 print(T)
17
18 	 df = n-1
19 P_val = (T - df)/sqrt(2*df)
20
21 \text{ pob} = 1 - pnorm(P_val)
22 print(pob)
```

R code Exa 9.8.A Michelsons determinations of the velocity of light

```
1 #Page 355
3
  data = c(850, 960, 880, 890, 890, 740,
            940, 880, 810, 840, 900, 960,
4
5
            880, 810, 780, 1070, 940, 860,
            820, 810, 930, 880, 720, 800,
6
7
            760, 850, 800, 720, 770, 810,
8
            950, 850, 620, 760, 790, 980,
9
            880, 860, 740, 810, 980, 900,
10
            970, 750, 820, 880, 840, 950,
            760, 850, 1000, 830, 880, 910,
11
            870, 980, 790, 910, 920, 870,
12
13
            930, 810, 850, 890, 810, 650,
            880, 870, 860, 740, 760, 880,
14
            840, 880, 810, 810, 830, 840,
15
16
            720, 940, 1000, 800, 850, 840,
```

```
17 950, 1000, 790, 840, 850, 800,

18 960, 760, 840, 850, 810, 960,

19 800, 840, 780, 870)

20 qqnorm(data)
```

 ${f R}$ code Exa 9.8.B Normal probability plot of double exponential distribution

```
1 #Page 356
2
3 library(nimble)
4
5 rand = rdexp(500)
6 qqnorm(rand)
```

R code Exa 9.8.C Gamma probability plot of rainfall distribution

```
1 #Page 357
2
3 rand = rgamma(500,5)
4 qqnorm(rand)
```

Chapter 10

Summarizing Data

R code Exa 10.2.1.A Chemical properties of beeswax

```
1 #Page 378
3 \text{ data} = c(63.78, 63.45, 63.58, 63.08, 63.40, 64.42,
     63.27, 63.10,
            63.34, 63.50, 63.83, 63.63, 63.27, 63.30,
4
               63.83, 63.50,
            63.36, 63.86, 63.34, 63.92, 63.88, 63.36,
5
               63.36, 63.51,
            63.51, 63.84, 64.27, 63.50, 63.56, 63.39,
               63.78, 63.92,
7
            63.92, 63.56, 63.43, 64.21, 64.24, 64.12,
               63.92, 63.53,
            63.50, 63.30, 63.86, 63.93, 63.43, 64.40,
8
               63.61, 63.03,
            63.68, 63.13, 63.41, 63.60, 63.13, 63.69,
9
               63.05, 62.85,
10
            63.31, 63.66, 63.60)
11 empirical = ecdf(data)
12 plot(empirical)
```

R code Exa 10.2.2.A Study of the lifetimes of guinea pigs infected with varying doses of tubercle bacilli

```
1 #Page 381
2
3
  control_life = c(18, 36, 50, 52, 86, 87, 89, 91,
                     102, 105, 114, 114, 115, 118, 119,
                        120,
                     149, 160, 165, 166, 167, 167, 173,
5
                        178,
                     189, 209, 212, 216, 273, 278, 279,
6
                        292,
7
                     341, 355, 367, 380, 382, 421, 421,
                        432,
                     446, 455, 463, 474, 506, 515, 546,
8
                        559,
                     576, 590, 603, 607, 608, 621, 634,
9
                        634,
10
                     637, 638, 641, 650, 663, 665, 688,
                        725,
11
                     735)
   dose_1 = c(76, 93, 97, 107, 108, 113, 114, 119,
12
               136, 137, 138, 139, 152, 154, 154, 160,
13
               164, 164, 166, 168, 178, 179, 181, 181,
14
               183, 185, 194, 198, 212, 213, 216, 220,
15
16
              225, 225, 244, 253, 256, 259, 265, 268,
17
              268, 270,
                         283, 289, 291, 311, 315, 326,
               326, 361,
                         373, 373,
                                    376, 397, 398, 406,
18
19
              452, 466, 592, 598)
20
   dose_2 = c(72, 72, 78, 83, 85, 99, 99, 110,
21
22
               113, 113, 114, 114, 118, 119, 123, 124,
23
               131, 133, 135, 137, 140, 142, 144, 145,
               154, 156, 157, 162, 162, 164, 165, 167,
24
```

```
171, 176, 177, 181, 182, 187, 192, 196,
25
              211, 214, 216, 216, 218, 228, 238, 242,
26
              248, 256, 257, 262, 264, 267, 267, 270,
27
              286, 303, 309, 324, 326, 334, 335, 358,
28
29
              409, 473, 550)
30
   dose_3 = c(10, 33, 44, 56, 59, 72, 74, 77,
31
32
              92, 93, 96, 100, 100, 102, 105, 107,
               107, 108, 108, 108, 109, 112, 113, 115,
33
               116, 120, 121, 122, 122, 124, 130, 134,
34
               136, 139, 144, 146, 153, 159, 160, 163,
35
               163, 168, 171, 172, 176, 183, 195, 196,
36
37
               197, 202, 213, 215, 216, 222, 230, 231,
               240, 245, 251, 253, 254, 254, 278, 293,
38
              327, 342, 347, 361, 402, 432, 458, 555)
39
40
   dose_4 = c(43, 45, 53, 56, 56, 57, 58, 66,
41
               67, 73, 74, 79, 80, 80, 81, 81,
42
              81, 82, 83, 83, 84, 88, 89, 91,
43
              91, 92, 92, 97, 99, 99, 100, 100,
44
               101, 102, 102, 102, 103, 104, 107, 108,
45
               109, 113, 114, 118, 121, 123, 126, 128,
46
               137, 138, 139, 144, 145, 147, 156, 162,
47
48
               174, 178, 179, 184, 191, 198, 211, 214,
              243, 249, 329, 380, 403, 511, 522, 598)
49
50
51
   dose_5 = c(12, 15, 22, 24, 24, 32, 32, 33,
              34, 38, 38, 43, 44, 48, 52, 53,
52
              54, 54, 55, 56, 57, 58, 58, 59,
53
              60, 60, 60, 60, 61, 62, 63, 65,
54
              65, 67, 68, 70, 70, 72, 73, 75,
55
              76, 76, 81, 83, 84, 85, 87, 91,
56
              95, 96, 98, 99, 109, 110, 121, 127,
57
               129, 131, 143, 146, 146, 175, 175, 211,
58
               233, 258, 258, 263, 297, 341, 341, 376)
59
60
   emp_fn_cl = ecdf(control_life)
   emp_fn_d1 = ecdf(dose_1)
```

```
63 \text{ emp\_fn\_d2} = \text{ecdf(dose\_2)}
64 \text{ emp}_fn_d3 = ecdf(dose_3)
65 \text{ emp\_fn\_d4} = \text{ecdf(dose\_4)}
66 \text{ emp_fn_d5} = \text{ecdf(dose_5)}
67
68 emp_val_cl = (emp_fn_cl(control_life))
69 emp_val_d1 = emp_fn_d1(dose_1)
70 emp_val_d2 = emp_fn_d2(dose_2)
71 \text{ emp\_val\_d3} = \text{emp\_fn\_d3}(\text{dose\_3})
72 emp_val_d4 = emp_fn_d4(dose_4)
73 emp_val_d5 = emp_fn_d5(dose_5)
74
75 surv_val_cl = 1 - emp_val_cl
76 \text{ surv\_val\_d1} = 1 - \text{emp\_val\_d1}
77 \text{ surv\_val\_d2} = 1 - \text{emp\_val\_d2}
78 \text{ surv\_val\_d3} = 1 - \text{emp\_val\_d3}
79 \text{ surv\_val\_d4} = 1 - \text{emp\_val\_d4}
80 \text{ surv\_val\_d5} = 1 - \text{emp\_val\_d5}
81
82
83 plot(x = control_life, y =surv_val_cl, type = "l",
      xlim = c(0,800)
84 lines(x = dose_1, y =surv_val_d1, type = "l", xlim =
       c(0,800), lty = 2, add = TRUE)
c(0,800), lty = 3, add = TRUE)
86 lines(x = dose_3, y =surv_val_d3, type = "l", xlim =
       c(0,800), lty = 4, add = TRUE)
  lines(x = dose_4, y =surv_val_d4, type = "l", xlim =
       c(0,800), lty = 5, add = TRUE)
  lines(x = dose_5, y =surv_val_d5, type = "l", xlim =
       c(0,800), lty = 6, add = TRUE)
```

R code Exa 10.2.2.B empirical survival functions of Guinea pig test

```
1 #Page 384
2
   control_life = c(18, 36, 50, 52, 86, 87, 89, 91,
                     102, 105, 114, 114, 115, 118, 119,
4
                        120,
                     149, 160, 165, 166, 167, 167, 173,
5
                        178,
                     189, 209, 212, 216, 273, 278, 279,
6
                        292,
                     341, 355, 367, 380, 382, 421, 421,
7
                        432,
                     446, 455, 463, 474, 506, 515, 546,
8
                        559,
                     576, 590, 603, 607, 608, 621, 634,
9
                        634,
10
                     637, 638, 641, 650, 663, 665, 688,
                        725,
                     735)
11
12
   dose_1 = c(76, 93, 97, 107, 108, 113, 114, 119,
13
               136, 137, 138, 139, 152, 154, 154, 160,
               164, 164, 166, 168, 178, 179, 181, 181,
14
               183, 185, 194, 198, 212, 213, 216, 220,
15
               225, 225, 244, 253, 256, 259, 265, 268,
16
               268, 270, 283, 289, 291, 311, 315, 326,
17
               326, 361, 373, 373, 376, 397, 398, 406,
18
19
               452, 466, 592, 598)
20
   dose_2 = c(72, 72, 78, 83, 85, 99, 99, 110,
21
               113, 113, 114, 114, 118, 119, 123, 124,
22
               131, 133, 135, 137, 140, 142, 144, 145,
23
               154, 156, 157, 162, 162, 164, 165, 167,
24
25
               171, 176, 177, 181, 182, 187, 192, 196,
               211, 214, 216, 216, 218, 228, 238, 242,
26
27
               248,
                    256,
                         257, 262, 264, 267, 267, 270,
28
               286, 303, 309, 324, 326, 334, 335, 358,
               409, 473, 550)
29
30
31 \text{ dose\_3} = c(10, 33, 44, 56, 59, 72, 74, 77,
```

```
32
              92, 93, 96, 100, 100, 102, 105, 107,
               107, 108, 108, 108, 109, 112, 113, 115,
33
               116, 120, 121, 122, 122, 124, 130, 134,
34
               136, 139, 144, 146, 153, 159, 160, 163,
35
               163, 168, 171, 172, 176, 183,
                                              195, 196,
36
               197, 202, 213, 215, 216, 222, 230, 231,
37
                         251, 253, 254, 254, 278, 293,
38
              240, 245,
39
              327, 342, 347, 361, 402, 432, 458, 555)
40
   dose_4 = c(43, 45, 53, 56, 56, 57, 58, 66,
41
               67, 73, 74, 79, 80, 80, 81, 81,
42
              81, 82, 83, 83, 84, 88, 89, 91,
43
              91, 92, 92, 97, 99, 99, 100, 100,
44
               101, 102, 102, 102, 103, 104, 107, 108,
45
               109, 113, 114, 118, 121, 123, 126, 128,
46
47
               137, 138, 139, 144, 145, 147, 156, 162,
               174, 178, 179, 184, 191, 198, 211, 214,
48
              243, 249, 329, 380, 403, 511, 522, 598)
49
50
   dose_5 = c(12, 15, 22, 24, 24, 32, 32, 33,
51
              34, 38, 38, 43, 44, 48, 52, 53,
52
              54, 54, 55, 56, 57, 58, 58, 59,
53
              60, 60, 60, 60, 61, 62, 63, 65,
54
55
              65, 67, 68, 70, 70, 72, 73, 75,
              76, 76, 81, 83, 84, 85, 87, 91,
56
              95, 96, 98, 99, 109, 110, 121, 127,
57
58
               129, 131, 143, 146, 146, 175, 175,
              233, 258, 258, 263, 297, 341, 341, 376)
59
60
   emp_fn_cl = ecdf(control_life)
61
   emp_fn_d1 = ecdf(dose_1)
   emp_fn_d2 = ecdf(dose_2)
63
   emp_fn_d3 = ecdf(dose_3)
   emp_fn_d4 = ecdf(dose_4)
65
66
   emp_fn_d5 = ecdf(dose_5)
67
   emp_val_cl = emp_fn_cl(control_life)
68
   emp_val_d1 = emp_fn_d1(dose_1)
```

```
70 \text{ emp\_val\_d2} = \text{emp\_fn\_d2}(\text{dose\_2})
71 \text{ emp\_val\_d3} = \text{emp\_fn\_d3(dose\_3)}
72 \text{ emp\_val\_d4} = \text{emp\_fn\_d4}(\text{dose\_4})
73 \text{ emp\_val\_d5} = \text{emp\_fn\_d5}(\text{dose\_5})
74
75 \text{ surv\_val\_cl} = \frac{\log 10}{10} (1 - \exp_val\_cl)
76 surv_val_d1 = log10(1 - emp_val_d1)
77 surv_val_d2 = log10(1 - emp_val_d2)
78 surv_val_d3 = log10(1 - emp_val_d3)
79 surv_val_d4 = log10(1 - emp_val_d4)
80 \text{ surv\_val\_d5} = \frac{\log 10}{1 - \exp_val\_d5}
81
82
83 plot(x = control_life, y =surv_val_cl, type = "l",
      xlim = c(0,800)
84 lines(x = dose_1, y =surv_val_d1, type = "l", xlim =
       c(0,800), lty = 2, add = TRUE)
  lines(x = dose_2, y =surv_val_d2, type = "l", xlim =
       c(0,800), lty = 3, add = TRUE)
  lines(x = dose_3, y =surv_val_d3, type = "l", xlim =
       c(0,800), lty = 4, add = TRUE)
  lines(x = dose_4, y =surv_val_d4, type = "l", xlim =
       c(0,800), lty = 5, add = TRUE)
  lines(x = dose_5, y =surv_val_d5, type = "l", xlim =
       c(0,800), lty = 6, add = TRUE)
```

R code Exa 10.4.2.A Cumulative binomial probabilities of Platinum data

```
1 #Page 396
2
3 k = 5:9
4 n = 26
5
6 p_binom = round(pbinom(k,26,0.5),4)
7 data.frame(k,p_binom)
```

```
8
9 r = 8
10
11 P_lessk = round(pbinom(r,26,0.5),4) - round(dbinom(r,26,0.5),4)
12 print(P_lessk)
13
14 i = 19
15 P_great = 1 - round(pbinom(i-1,26,0.5),4)
16 print(P_great)
```

Comparing two Samples

R code Exa 11.2.1.A Difference in Latent Heat of Fusion

```
1 #Page 423
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03, 80.03,
      80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
      79.95, 79.97)
6 heat = data.frame(A,B = c(B,rep(NA, length(A)-length
      (B))))
8 X_bar_A = round(mean(A),3)
9 X_bar_B = round(mean(B),3)
10
11 \text{ sd}_A = \text{round}(\text{sd}(A), 3)
12 \text{ sd}_B = \text{round}(\text{sd}(B), 3)
13
14 cat(X_bar_A, X_bar_B, sd_A, sd_B)
16 \text{ var_p} = ((length(A)-1)*sd_A^2 + (length(B)-1)*sd_B
      ^2)/(length(A) + length(B) - 2)
17 sd_p = round(sqrt(var_p),3)
```

```
18
19 print(sd_p)
20
21 diff = round(X_bar_A - X_bar_B,2)
22 s_diff = round(sd_p*sqrt(1/length(A) + 1/length(B))
      ,3)
23
24 cat(diff, s_diff)
25
26 \text{ boxplot(heat, ylim = c(79.94, 80.06))}
27
28 \text{ t_val} = \text{round(abs(qt(0.025, df = length(A) + length())})
      B) -2)),3)
29
30 print(t_val)
32 cat("CI for mean diff is (", round(diff - t_val*s_
      diff,3), round(diff + t_val*s_diff,3), ")")
```

R code Exa 11.2.1.B Two sided alternative of mean test of two methods

```
#Page 425

2

3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
        80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)

4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
        79.95, 79.97)

5

6 X_bar_A = round(mean(A),2)

7 X_bar_B = round(mean(B),2)

8 print(X_bar_A)

9

10 sd_A = round(sd(A),3)

11 sd_B = round(sd(B),3)

12
```

```
13 var_p = ((length(A)-1)*sd_A^2 + (length(B)-1)*sd_B
      ^2)/(length(A) + length(B) - 2)
14 sd_p = round(sqrt(var_p),3)
15
16 diff = round(X_bar_A - X_bar_B,2)
17 s_diff = round(sd_p*sqrt(1/length(A) + 1/length(B))
      , 3)
18
19 t_stat = round(diff/s_diff,3)
20
21 print(t_stat)
22
23 \text{ t_val} = abs(qt(0.005, df = length(A) + length(B) -
      2))
24
25 print(t_val)
```

R code Exa 11.2.1.C Mean test without assumption of equal variance

```
1 #Page 428
2
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03,80.03,
        80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
        79.95, 79.97)
5
6 X_bar_A = round(mean(A),3)
7 X_bar_B = round(mean(B),3)
8
9 n = length(A)
10 m = length(B)
11
12 var_A = round(var(A),5)
13 var_B = round(var(B),5)
```

```
15 diff = round(X_bar_A - X_bar_B,2)
16 s_diff = round(sqrt(var_A/n + var_B/m),4)
17
18 t_stat = abs(diff)/sqrt(var_A/n + var_B/m)
19 print(t_stat)
20
21 df = round(((var_A/n) + (var_B/m))^2/(((var_A/n)^2/(
     n-1)) + ((var_B/m)^2/(m-1)),1)
22
23 print(df)
24
25 t_val = qt(0.995, df = df)
26
27 print(t_val)
28
29 # The answer may slightly vary due to rounding off
      values.
```

R code Exa 11.2.2.A Power vs del plot for iron retention experiment

```
1 #Page 434
2
3 del = 1
4 sd = 5
5
6 z = qnorm(0.1)
7
8 n = round(((1.96 - z)*sd/del)^2 * 2)
9
10 print(n)
```

R code Exa 11.2.3.A Mann Whitney test of latent heat of fusion

```
1 #Page
         437
3 A = c(79.98, 80.04, 80.02, 80.04, 80.03, 80.03,
     80.04, 79.97, 80.05, 80.03, 80.02, 80, 80.02)
4 B = c(80.02, 79.94, 79.98, 79.97, 79.97, 80.03,
     79.95, 79.97)
5
6 n = length(A)
7 m = length(B)
9 rn_A = rank(append(A,B), ties.method = "average")
10 A_{rank} = rn_A[1:n]
11 B_{rank} = rn_A[14:21]
12
13 print(list(A_rank, B_rank))
14
15 R = sum(B_rank)
16 R_{dash} = \min(m,n)*(m+n+1) - R
17
18 print(c(R,R_dash))
19
20 R_star = min(R,R_dash)
21
22 print(R_star)
```

R code Exa 11.2.3.B Normal Distribution of Rank sum method

```
1 #Page 441
2
3 n = 13
4 m = 8
5
6 T = 51
7
8 E_T = min(m,n)*(m+n+1)/2
```

```
9 sigma_T = sqrt(m*n*(m+n+1)/12)
10
11 print(c(E_T, sigma_T))
12
13 t_test = round((T-E_T)/sigma_T,2)
14
15 p_val = round(2*pnorm(t_test),3)
16
17 print(c(t_test,p_val))
```

R code Exa 11.3.1.A Study of effect of cigarette smoking on platelet aggregation

```
1 #Page 446
3 before = c(25, 25, 27, 44, 30, 67, 53, 53, 52, 60, 28)
4 after = c(27,29,37,56,46,82,57,80,61,59,43)
5 n = length(before)
7 diff = after - before
9 print(data.frame(before, after, difference = diff))
10
11 D_bar = mean(diff)
12 sd_D_bar = sqrt(var(diff)/n)
13
14 print(c(D_bar,sd_D))
15
16 t = round(abs(qt(0.05, df = 10)), 3)
17
18 cat("CI for D_bar (", round(D_bar - t*sd_D,3), round
      (D_bar + t*sd_D,3), ")")
19
20 plot (before, after)
```

The Analysis of Variance

R code Exa 12.2.1.A F statistic applied to the tablet data

```
1 #Page 483
3 I = 7
4 J = 10
5 \text{ lab} = \text{matrix}(c(4.13, 3.86, 4.00, 3.88, 4.02, 4.02,
      4.00,
                  4.07, 3.85, 4.02, 3.88, 3.95, 3.86,
                     4.02,
                  4.04, 4.08, 4.01, 3.91, 4.02, 3.96,
                     4.03,
                  4.07, 4.11, 4.01, 3.95, 3.89, 3.97,
8
                     4.04,
                  4.05, 4.08, 4.04, 3.92, 3.91, 4.00,
9
                  4.04, 4.01, 3.99, 3.97, 4.01, 3.82,
10
                     3.81,
                  4.02, 4.02, 4.03, 3.92, 3.89, 3.98,
11
                     3.91,
12
                  4.06, 4.04, 3.97, 3.90, 3.89, 3.99,
                     3.96,
                  4.10, 3.97, 3.98, 3.97, 3.99, 4.02,
13
```

```
4.05,
14
                    4.04, 3.95, 3.98, 3.90, 4.00, 3.93,
                        4.06), byrow = TRUE, nrow = J, ncol
15
16 \text{ mean} = \text{mean}(lab)
17 \text{ mean_i} = c()
18 \text{ ss_w} = 0
19 residue = c()
20
21 for(i in 1:7){
      y_i = mean(lab[,i])
22
23
      mean_i = c(mean_i,y_i)
      residue = c(residue, lab[,i]-mean_i[i])
24
      ss_w = ss_w + sum((lab[,i]-mean_i[i])^2)
25
26 }
27
28 \text{ ss_b} = \text{round}(10*\text{sum}((\text{mean_i} - \text{mean})^2), 3)
29
30 ss_total = round(sum((lab-mean)^2),3)
31
32 	 df = c(I-1, I*(J-1), I*J-1)
33 \text{ ss} = c(ss_b, ss_w, ss_total)
34 \text{ ms} = \text{round}(\text{ss/df}, 4)
35 f = ss_b/(I-1)/(ss_w/(I*(J-1)))
36
37 var_tab = data.frame(df,ss,ms,f)
38
39 print(var_tab)
40
41 qqnorm(residue,
            ylab="Oredered Residuals", xlab="Normal
42
               Quantiles")
```

R code Exa 12.2.2.1.A Turkey method application to Tablet data

```
1 #Page 486
3 library(dplyr)
4 I = 7
5 J = 10
6 \text{ lab} = \text{matrix}(c(4.13, 3.86, 4.00, 3.88, 4.02, 4.02,
      4.00,
                   4.07, 3.85, 4.02, 3.88, 3.95, 3.86,
7
                      4.02,
                   4.04, 4.08, 4.01, 3.91, 4.02, 3.96,
8
                      4.03,
9
                   4.07, 4.11, 4.01, 3.95, 3.89, 3.97,
                   4.05, 4.08, 4.04, 3.92, 3.91, 4.00,
10
                      4.10,
                   4.04, 4.01, 3.99, 3.97, 4.01, 3.82,
11
                      3.81,
12
                   4.02, 4.02, 4.03, 3.92, 3.89, 3.98,
                   4.06, 4.04, 3.97, 3.90, 3.89, 3.99,
13
                      3.96,
                   4.10, 3.97, 3.98, 3.97, 3.99, 4.02,
14
                      4.05,
                   4.04, 3.95, 3.98, 3.90, 4.00, 3.93,
15
                      4.06), byrow = TRUE, nrow = J,
                      ncol = I)
16 \text{ mean_i} = c()
17
18 for(i in 1:7){
     y_i = mean(lab[,i])
19
20
     mean_i = c(mean_i, y_i)
21 }
22
23 i = 1:7
24 labs_df = data.frame(labs =i, means = mean_i)
25 labs_df = arrange(labs_df, desc(means))
26 print(labs_df)
27
```

R code Exa 12.3.3.A An experimental study of drugs

```
1 #Page 501
3 I = 7
4 J = 10
   itch_{data} = matrix(c(174, 263, 105, 199, 141, 108,
      141,
                    224, 213, 103, 143, 168, 341, 184,
6
7
                    260, 231, 145, 113, 78, 159, 125,
8
                    255, 291, 103, 225, 164, 135, 227,
                    165, 168, 144, 176, 127, 239, 194,
9
                    237, 121, 94, 144, 114, 136, 155,
10
11
                    191, 137, 35, 87, 96, 140, 121,
12
                    100, 102, 133, 120, 222, 134, 129,
                    115, 89, 83, 100, 165, 185, 79,
13
14
                    189, 433, 237, 173, 168, 188, 317),
                       byrow = TRUE, ncol = 7)
15
16 itch = data.frame(no_drug = itch_data[,1], placebo =
       itch_data[,2], papaverine = itch_data[,3],
```

```
17
                       nmorphine = itch_data[,4], amino =
                           itch_data[,5], pentobarbital =
                           itch_data[,6],
18
                       tripelennamine = itch_data[,7],
                          row.names = c("BG","JF","BS","
                          SI", "BW", "TS", "GM", "SS", "MU", "
                          OS"))
19 boxplot(itch)
20
21 stack_data = stack(itch)
22 stack_data <- cbind(stack_data, subject = rep(</pre>
      rownames(itch),ncol(itch)))
23 one.way <- aov(values~ind+subject, data = stack_data
      )
24
25 summary (one.way)
26
27 y = unname(sort(residuals(one.way)))
28 qqnorm(y, pch = 20, xlim = c(-3,3), ylim = c
      (-100, 150),
           xlab = "Normal quantiles", ylab = "Ordered
29
              Quantiles",
           main = "")
30
31
32 	 df = 54
33 nrange = 7
34 s = 3095
35 \text{ qt} = \text{qtukey}(0.95, \text{nrange}, \text{df})
36 error_var = qt*sqrt(s/J)
37 print(error_var)
38
39 # The answer may slightly vary due to rounding off
      values.
```

R code Exa 12.3.4.A Friedman test on itching data

```
1 #Page 504
2
3 I = 7
4 J = 10
  itch_data = matrix(c(174, 263, 105, 199, 141, 108,
      141,
                    224, 213, 103, 143, 168, 341, 184,
6
7
                    260, 231, 145, 113, 78,159, 125,
8
                    255, 291, 103, 225, 164, 135, 227,
9
                    165, 168, 144, 176, 127, 239, 194,
                    237, 121, 94, 144, 114, 136, 155,
10
11
                    191, 137, 35, 87, 96, 140, 121,
12
                    100, 102, 133, 120, 222, 134, 129,
13
                    115, 89, 83, 100, 165, 185, 79,
14
                    189, 433, 237, 173, 168, 188, 317),
                       byrow = TRUE, ncol = 7)
15
  itch_data = data.frame(no_drug = itch_data[,1],
      placebo = itch_data[,2], papaverine = itch_data
      [,3],
17
                           nmorphine = itch_data[,4],
                              amino = itch_data[,5],
                              pentobarbital = itch_data
                              [,6],
18
                           tripelennamine = itch_data
                              [,7], row.names = c("BG","
                              JF", "BS", "SI", "BW", "TS", "
                             GM", "SS", "MU", "OS"))
19
20 rank_df = lapply(as.data.frame(t(itch_data)), rank,
      ties.method = "average")
21 rank_df = as.data.frame(rank_df, row.names = names(
      itch_data))
22 itch_rank = as.data.frame(t(rank_df))
23 itch_rank = rbind(itch_rank, Average = as.data.
      frame(lapply(itch_rank, mean)))
24 print(itch_rank)
25
```

```
26 R_bar = mean(unlist(itch_rank[-1,]))
27 R_sum = sum((itch_rank[11,]-R_bar)**2)
28 Q = 12*J*R_sum/(I*(I+1))
29
30 cat(R_bar, R_sum, Q)
```

The Analysis of categorical data

R code Exa 13.5.B Cell Phones and Driving

Linear Least squares

R code Exa 14.2.2.B Environmental impact study

```
1 # Page 551
3 \text{ env\_table} = \text{data.frame}(\text{Depth} = \text{c}(0.34, 0.29, 0.28,
      0.42, 0.29, 0.41, 0.76, 0.73, 0.46, 0.4),
                            Rate = c(0.636, 0.319, 0.734,
4
                                1.327, 0.487, 0.924,
                               7.35, 5.89, 1.979, 1.124))
5 plot(env_table)
7 env_reg = lm(Rate ~ Depth , data = env_table)
8 residue = resid(env_reg)
10 plot(env_table$Depth, residue, xlab = "Depth", ylab
     = "Residuals")
11
12 log_table = log(env_table, base = 10)
13 plot(log_table)
14
15 env_log_reg = lm(Rate ~ Depth, data = log_table)
16 log_residue = resid(env_log_reg)
17 plot(log_table$Depth, log_residue, xlab = "Depth",
```

R code Exa 14.4.5.B A quadratic model for stream flow data

```
1 # Page 579
2
3 \text{ env\_table} = \text{data.frame}(\text{Depth} = c(0.34, 0.29, 0.28,
      0.42, 0.29, 0.41, 0.76, 0.73, 0.46, 0.4),
4
                           Rate = c(0.636, 0.319, 0.734,
                               1.327, 0.487, 0.924,
                              7.35, 5.89, 1.979, 1.124))
5 env_table$Depth_2 = env_table$Depth**2
7 quadratic_model = lm(Rate ~ Depth + Depth_2, data =
      env_table)
8 summary(quadratic_model)
9
10 residuals = resid(quadratic_model)
11 plot(env_table$Depth, residuals, xlim = c(0.2,0.8),
     ylim = c(-0.6, 0.4), xlab = "Depth")
12
13 x = matrix(c(rep(1,nrow(env_table)), env_table$Depth
      , env_table$Depth_2), ncol = 3)
14 y = matrix(env_table$Rate, ncol = 1)
15
16 sum_bb = solve(t(x)%*%x)
17
18 corr_matrix = diag(3)
19
20 for (i in 1:3){
     for(j in 1:3) if (i != j) corr_matrix[i,j] = sum_
21
        bb[i,j]/sqrt(sum_bb[i,i]*sum_bb[j,j])
22 }
23
24 print(round(corr_matrix,2))
```