

Visualising Distribution



Learning Outcomes

By the end of this lesson, you should be able to

- Identify the patterns of **distribution**
- Use and explain the various **data comparing approaches**
- Explain and apply the techniques and best practices used

Introduction to Distribution

What is Distribution?

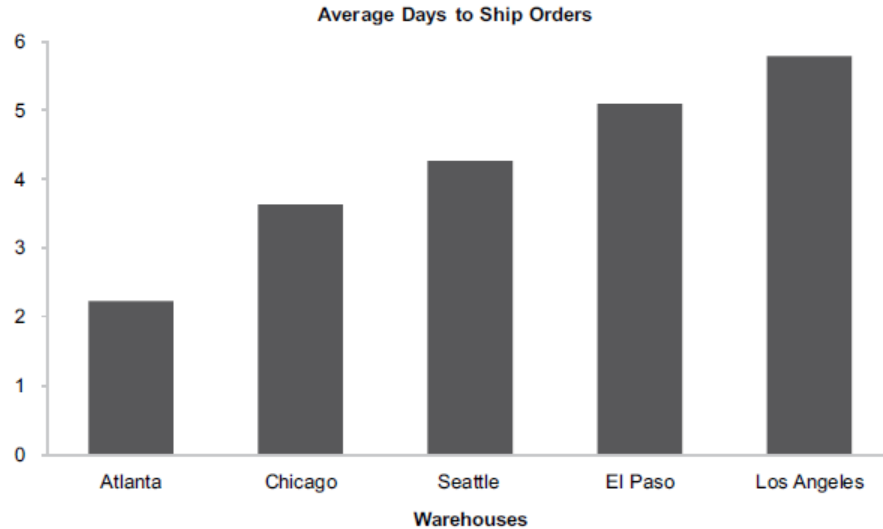
■ Still remember mean, median and mode?

- **Mean** – sum of all data points divided by the total number of points
- **Median** – order data from least to greatest and mark the halfway point
- **Mode** – number that occurs the most
- They describe **how parts of your data are distributed**

■ BUT you are **not** looking at the **full distribution**.

Salary(\$)			
1800			
1800	Mean	3483.333	
2000	Median	2150	
2300	Mode	1800	
3000			
10000			

Introduction to Distribution



With an average shipment timeline of 4.2 days, the Seattle warehouse could be keeping some customers waiting 10 days or more, but this fact would remain hidden in the graph above.

Introduction to Distribution

What is Distribution?

- Examining sets of quantitative values to see how the values are distributed from lowest to highest
- Compare and contrast how multiple sets of values are distributed

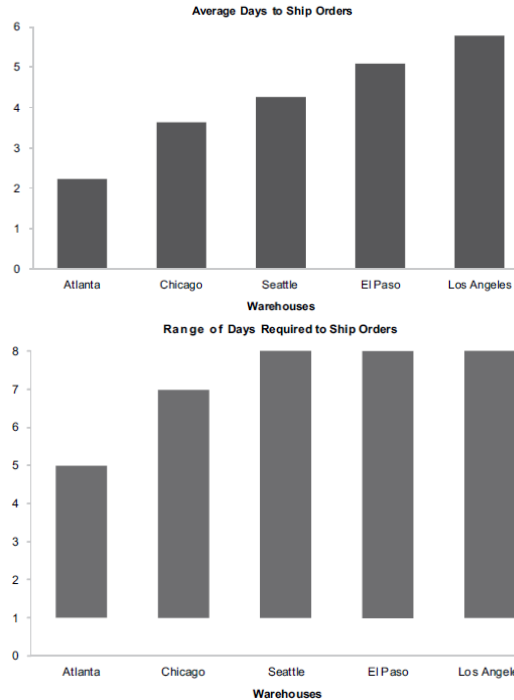
Salary(\$)				
1800				
1800		Mean	3483.333	
2000		Median	2150	
2300		Mode	1800	
3000				
10000				

1800	2
2000	1
2300	1
3000	1
10000	1

Introduction to Distribution

Average days to Ship Orders tells us nothing about variability –
Atlanta : 2.1 days; Seattle : 4.2 days

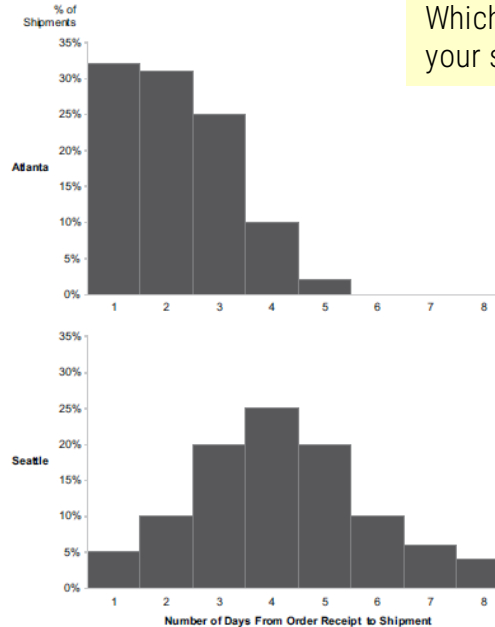
Range of days tells us the spread but we have no idea of the distributions – Atlanta is 1-5 days, Seattle is 1-8 days



Introduction

With distribution, we can tell that most orders are shipped from Atlanta on the same day, with a decreasing number of shipments as days increases

Seattle has symmetrical distribution and greatest percentage on the fourth day



Which one will you choose for your singles' day's order?

Describing Distribution

Visual Characteristic of Distributions

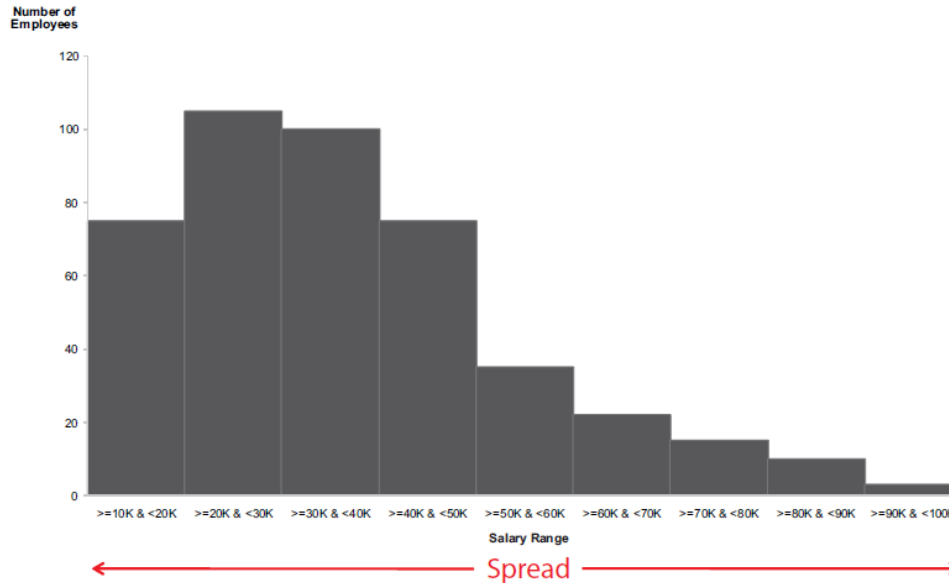
- ▶ Spread
- ▶ Center
- ▶ Shape

Statistical Summaries of Distributions

- ▶ 3-value summary of distribution
- ▶ 5-value summary of distribution

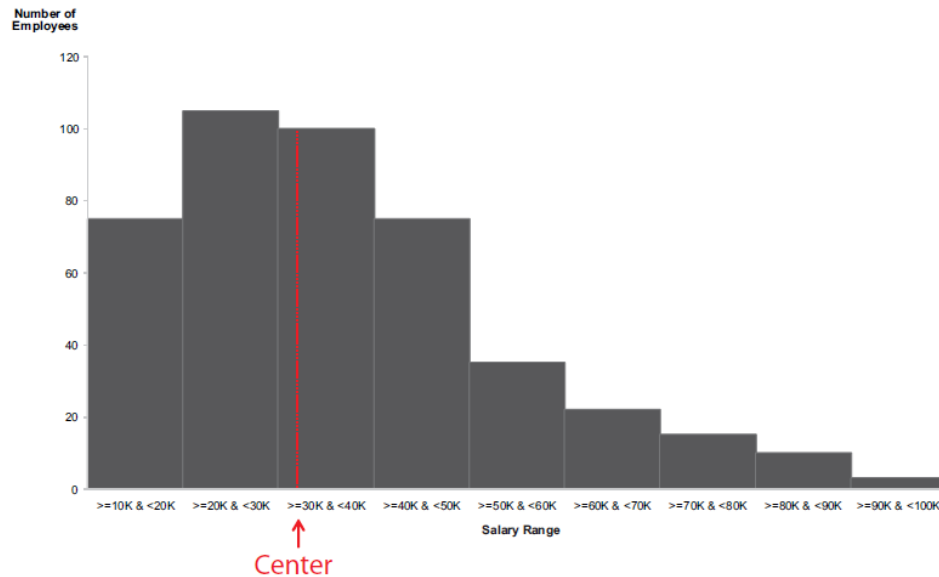
Visual Characteristic

Spread – lowest value, highest value and distance between them



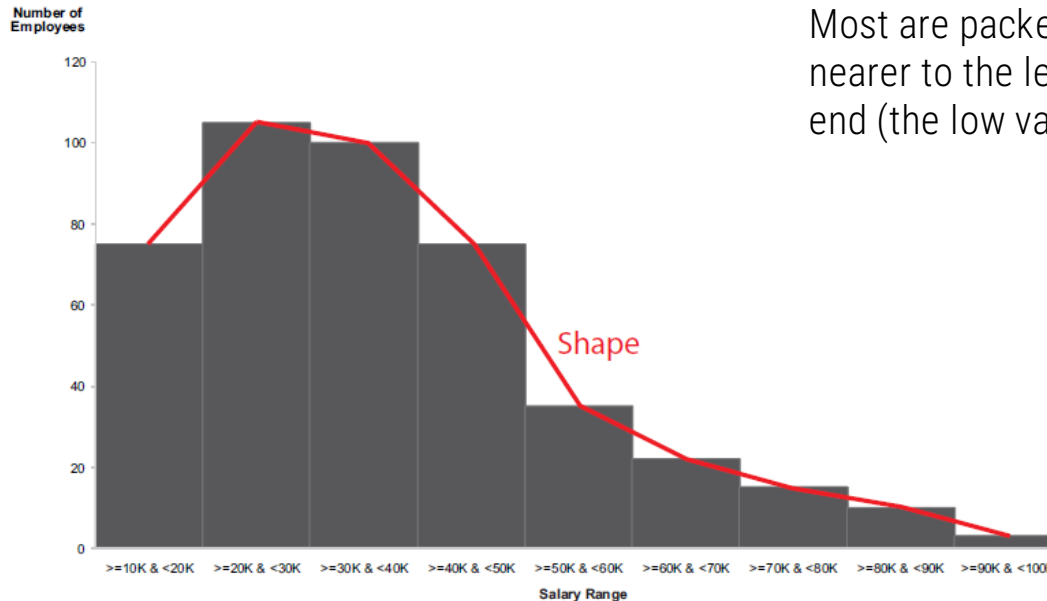
Visual Characteristic

Center – estimate of middle set of values or value that is most typical



Visual Characteristic

Shape – where the values are located



Most are packed nearer to the left end (the low values)

Statistical Summaries

3-value summary of distribution



5-value summary of distribution



Distribution Patterns

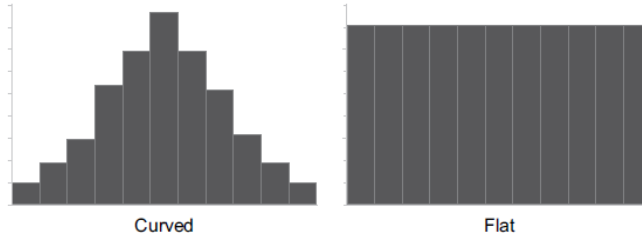
■ Shape

- ▷ Curved or flat?
- ▷ If curved, upward or downward?
- ▷ If curved upward, single or multiple peaked?
- ▷ If single peaked, symmetrical or skewed?
- ▷ Concentrations?
- ▷ Gaps?

■ Outliers

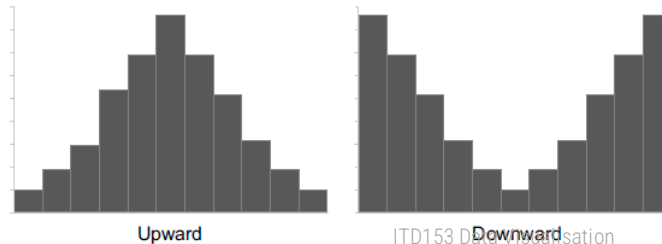
Distribution Patterns

Curved or flat?



Upward : Number of items or frequency begins relatively low, increases to a peak and then decreases until relatively low. E.g., IQ distribution across population

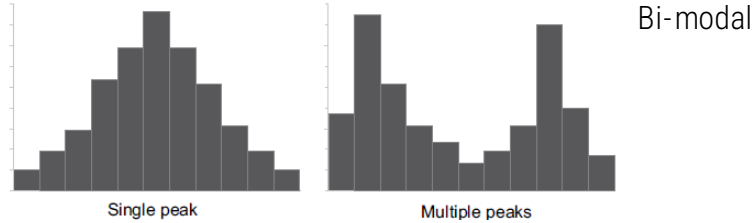
If curved, upward or downward?



Downward – less common. E.g., amount of leisure time people enjoy throughout their lives ?

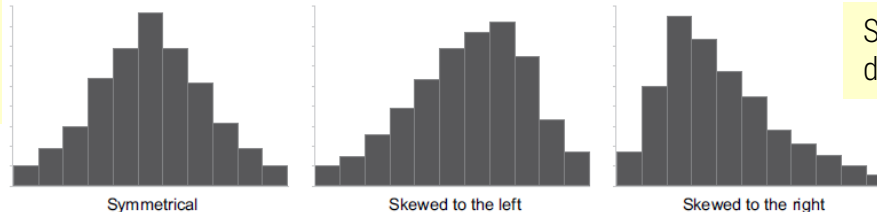
Distribution Patterns

If curved upward, one or two peaks?



If single peaked, symmetrical or skewed?

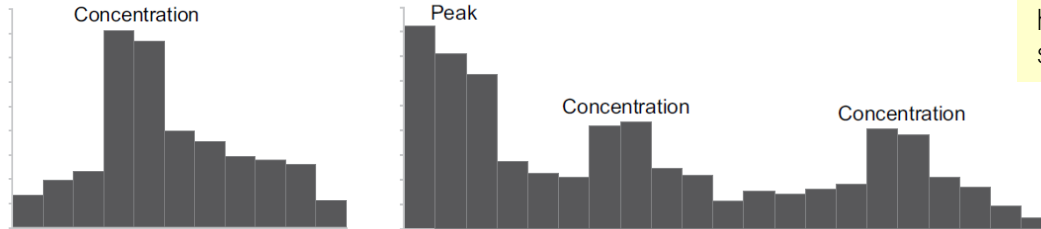
Normal distribution or bell-shaped



Skew refers to direction of the tail

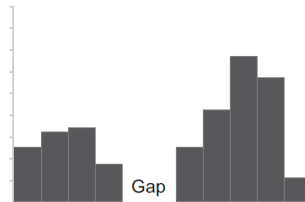
Distribution Patterns

Concentrations?



Predominant peak on the left, distribution is skewed to the right but there are also high concentration near middle and end – should investigate

Gaps?

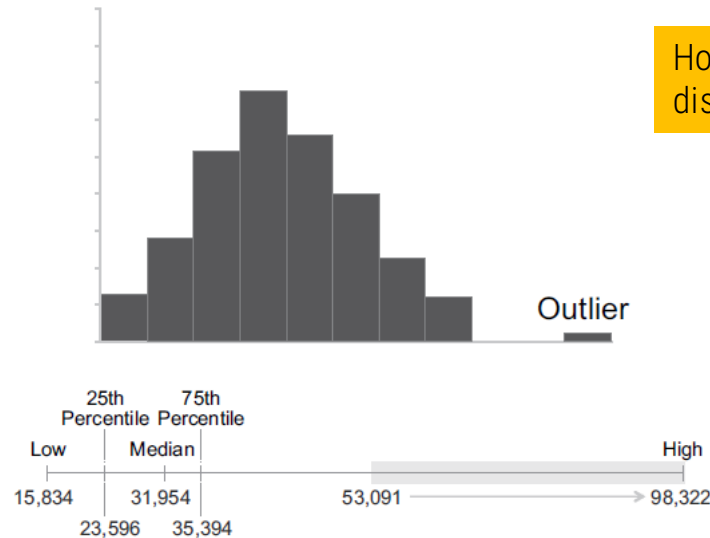


No sales to the age groups near the middle of the distribution, why?

Distribution Patterns

Outliers

How to identify outliers in distribution?



Good rule of thumb : Taking the mid-spread , the distance between the 25th and 75th percentiles – multiplying it by 1.5 and adding it to 75th percentile to mark the upper threshold

Distribution Displays

Single Distribution Displays

- ▷ Histograms
- ▷ Frequency Polygons
- ▷ Strip Plots
- ▷ Stem-and-Leaf Plots

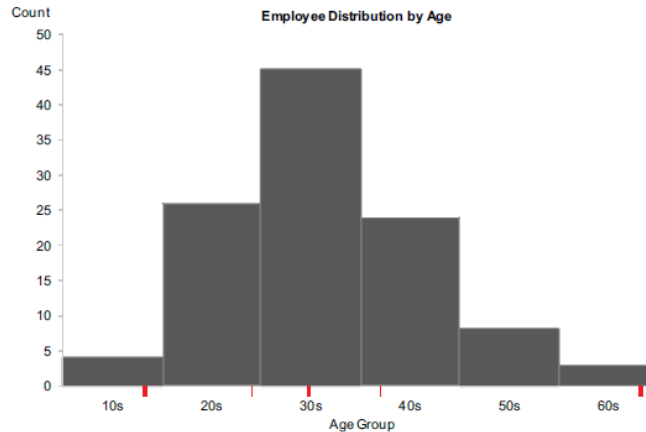
Multiple Distribution Displays

- ▷ Box Plots
- ▷ Multiple strip plots
- ▷ Frequency polygons
- ▷ Distribution deviation graphs

Histograms

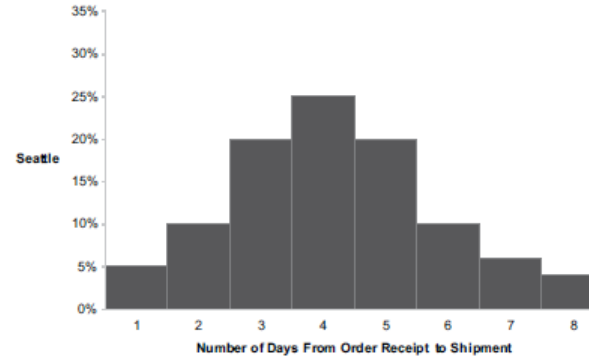
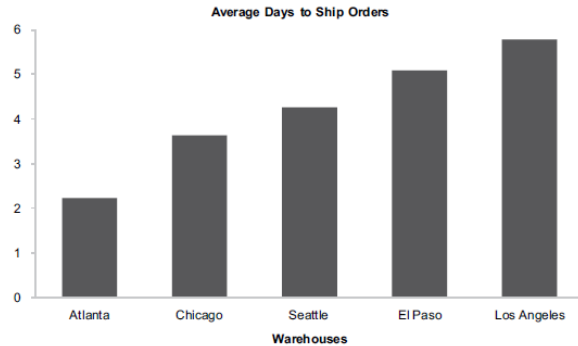
Single Distribution

- When bars are used to display a distribution
- X-axis – categorical scale; Y-axis – quantitative scale



3 thick red lines – low, median and high values and 2 thin red lines – 25th and 75th percentiles.

Bar chart *VS* Histogram

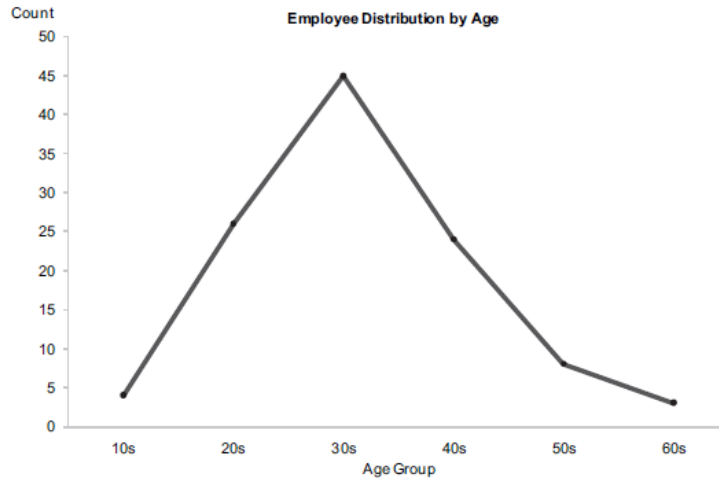


Histograms are used to show **distributions** of variables while bar charts are used to compare variables. Histograms plot **binned quantitative data** while bar charts plot categorical data. Bars can be **reordered** in bar charts but not in histograms

Frequency Polygons

Single Distribution

- Essentially line chart on categorical scale to display a distribution.
- Benefit – focus on the shape



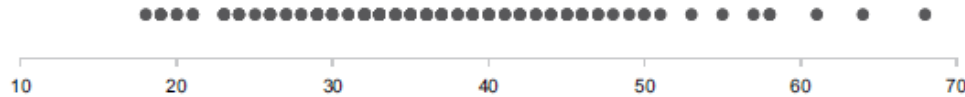
Does not support magnitude comparison between intervals as well as the histogram

Strip Plots

Single Distribution

One dimensional scatterplot

Can see low and high value
but no shape distribution



Stem and Leaf Plots

Single Distribution

Stem Leaf

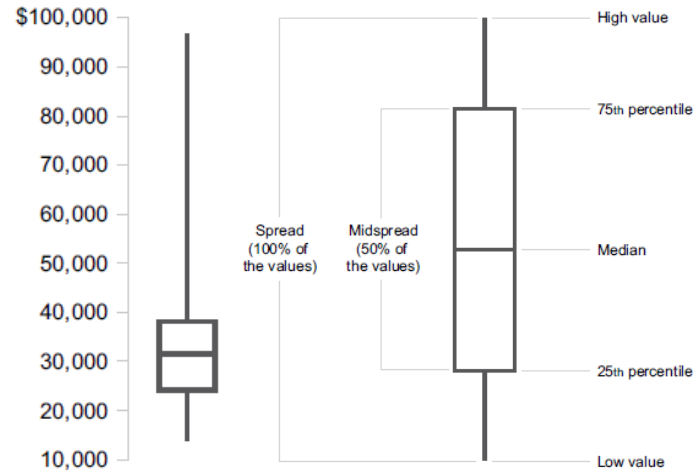
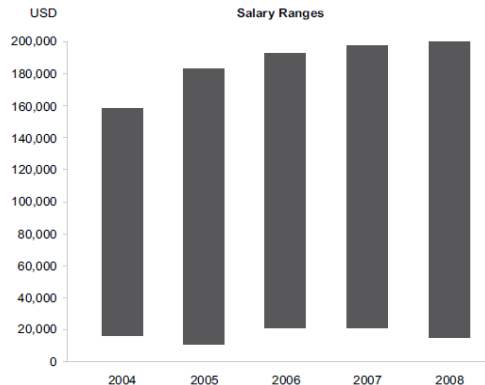
1	8 9 9 9
2	0 0 1 1 3 3 3 4 4 4 5 6 6 6 6 6 7 7 8 8 9 9 9 9 9
3	0 0 0 0 1 1 2 2 2 2 2 3 3 3 3 3 3 3 3 4 4 4 4 5 5 5 5 6 6 6 6 6 7 7 7 7 7 8 8 9 9 9 9 9
4	0 0 0 0 1 1 2 2 2 3 3 4 4 5 5 5 6 6 6 6 7 7 8 9
5	0 0 1 3 5 7 8 8
6	1 4 8

E.g. Distribution of employees' age.
How to read?
Top row : 1 – 18; 3 - 19

Box plots

Multiple Distribution

Range bars are never adequate as they reveals the distribution's spread while ignoring its center and shape.



Box plots

Multiple Distribution

What does this plots tell about Female vs Male Salary Distribution?

► List the facts first

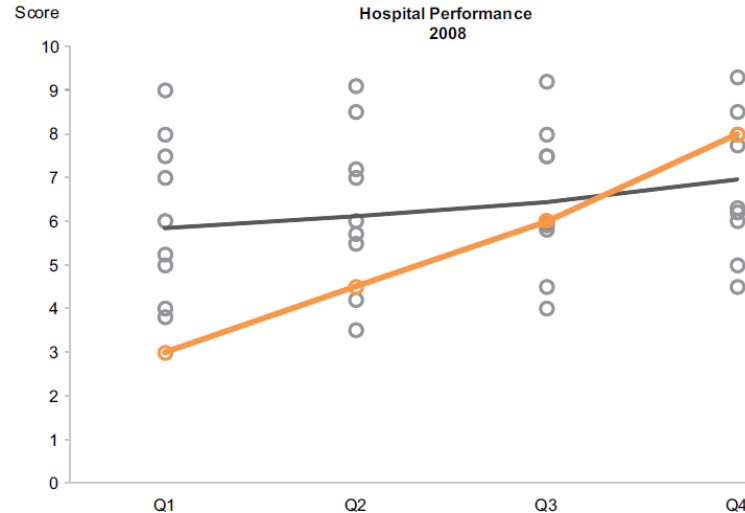
- women are typically paid less than men in all salary grades
- The disparity in salaries between men and women becomes increasingly greater as salaries increase
- Salaries vary the most for women in the higher salary grades



Multiple Strip Plots

Multiple Distribution

Health-care performances of 10 hospitals differed from one-another and changed through time.

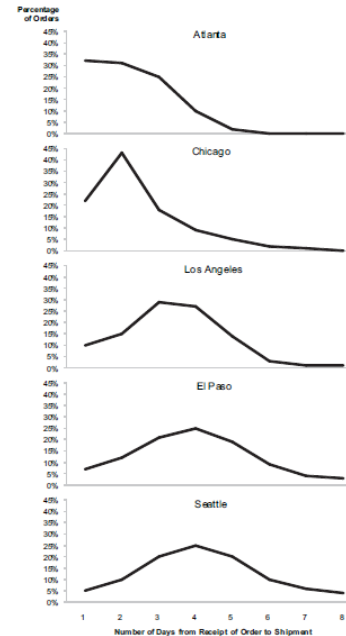
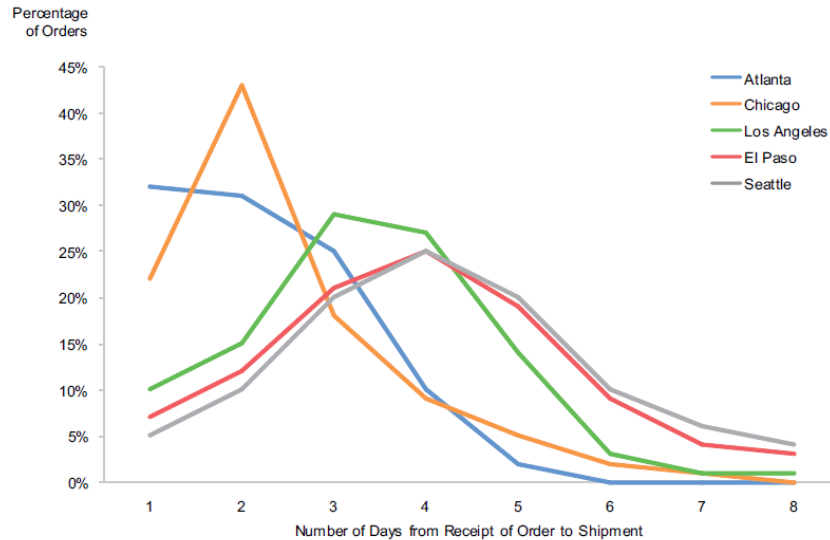


Ability to click on any dot and have the full series of values is nice feature

Frequency Polygons

Multiple Distribution

Compare shapes of multiple distributions

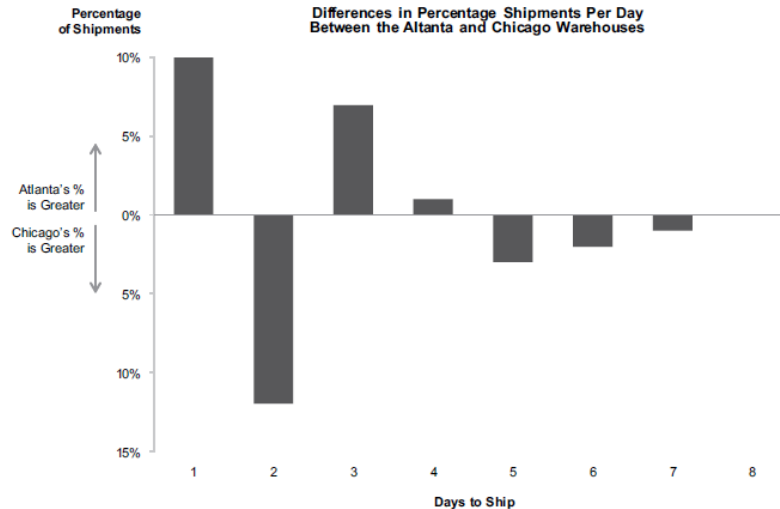


Trellis arrangement of line graphs

Distribution Deviation Graphs

Multiple Distribution

When we want to focus on how two distributions differ, display the differences directly (can be in percentage)



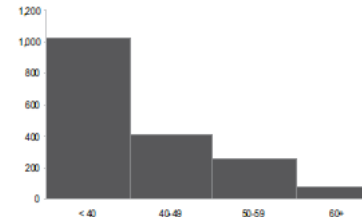
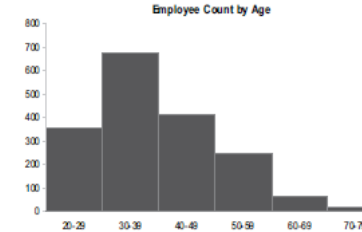
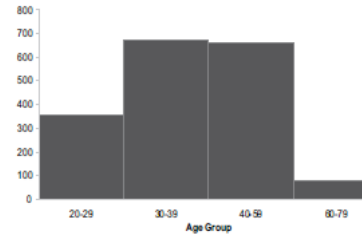
There is no need to care about the shapes of the two distributions as we only care about how they differ

Distribution Analysis Techniques and Best Practices

- Keeping the intervals consistent
- Selecting the best interval
- Using measures that are resistant to outliers

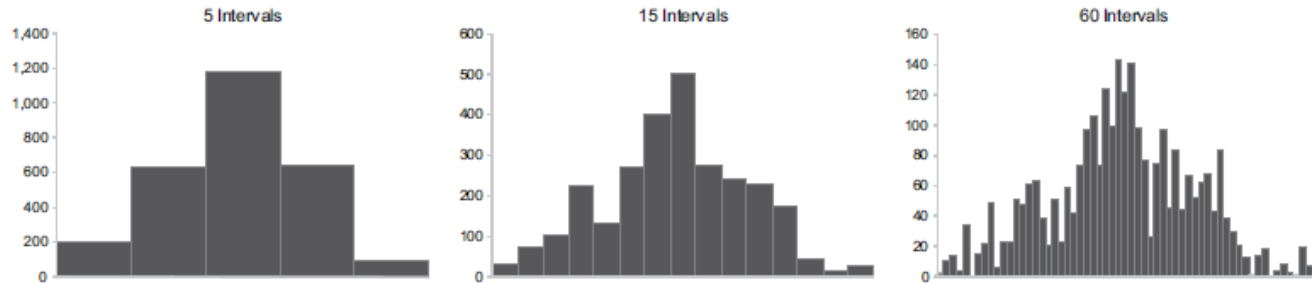
Keeping Intervals Consistent

- The size of the intervals along the categorical scale must be equals.
- Break this rule only when vast majority of values fall within a particular range



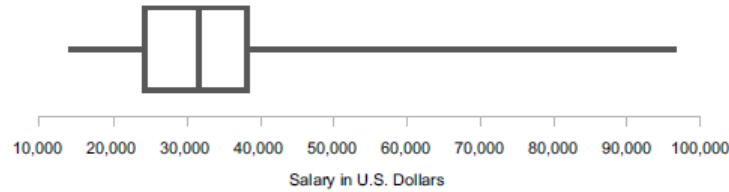
Selecting Best Interval

- Determine how large to make the interval or the number of intervals to use.
- Too many intervals → raggedly shaped distribution
- Too few intervals → too generalized, loss of variations



Resistant to Outliers

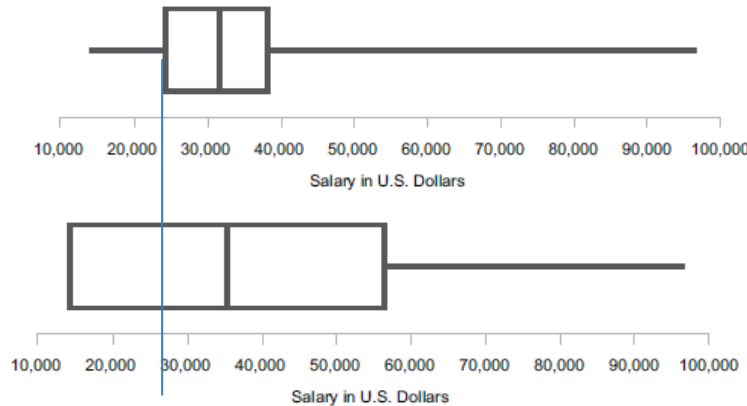
- Median and percentiles is recommended as it is more resistant than mean and standard deviation.



- The center is median and ends of box represent the 25th and 75th percentiles.
- With the extremely high salaries, long tail formed by the right whisker but didn't influence the median

Resistant to Outliers

- In the second plot, the center represents the mean. The end of the box represent one standard deviation below and above the mean.
- Mean is higher susceptible to outliers. Single outlier can shift the mean significantly



Salary(\$)		
1800		
1800	Mean	3483.333
2000	Median	2150
2300	Mode	1800
3000		
10000		

How can mean be used?

Summary

- Visual Characteristics and Statistical Summaries of Distributions
- Distribution patterns
- How to display distribution data
- Techniques and best practices to consider for distribution analysis