

Data Visualization

Part 1

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Outline

- Introduction
- Time-series
- Part-to-whole and Ranking
- Deviation

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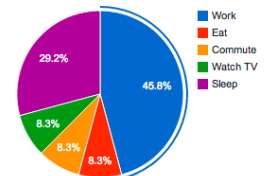
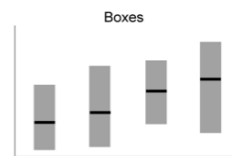
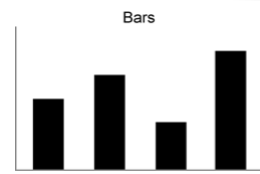
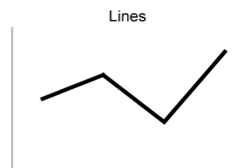
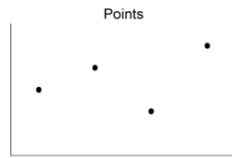


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Visual Encoding

- Points
- Lines
- Bars
- Boxes
- Areas
- Colors



Source: [2]

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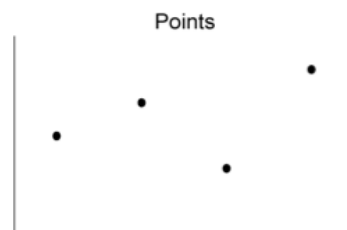


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Points

- Smallest part to represent values
- Can be many shapes: dots, squares, x's, etc.
- Stress on individual values
- Encode two quantitative values
 - Example: dot plot, scatter plot



Source: [2]

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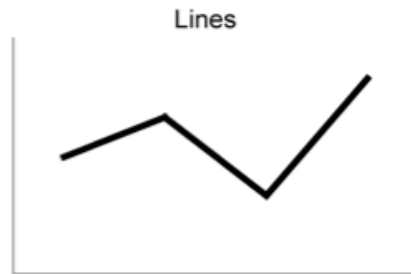


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Lines

- Show movement from one value to the next
- Link individual values into series
- Good for displaying trends and patterns



Source: [2]

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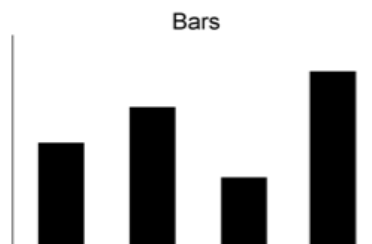


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Bars

- Strongly emphasize on individual values
- Good at comparing individual values



Source: [2]

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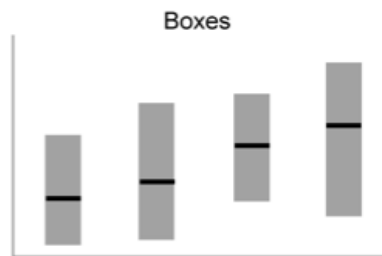


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Boxes

- Both ends have values
 - Encapsulate minimum and maximum quantitative values
- Good for distribution of values
- Can add markers for 25%, 50%, 75% percentile



Source: [2]

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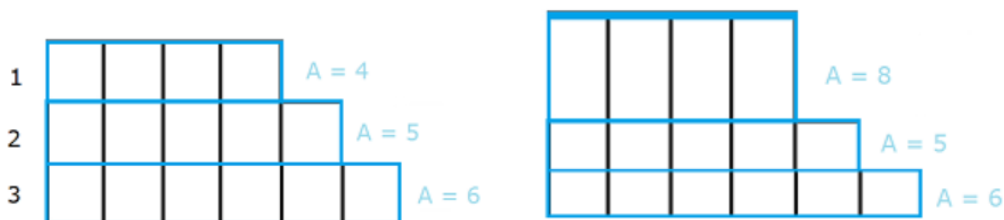


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Areas

- Present values in two dimensions
- Ratio of area must be accurately presented in its value



Source: <http://www.statisticshowto.com/area-principle-in-statistics/>

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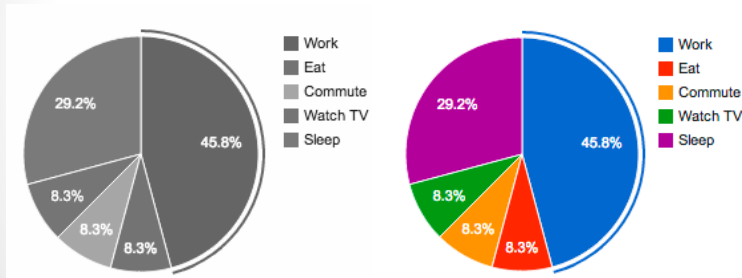
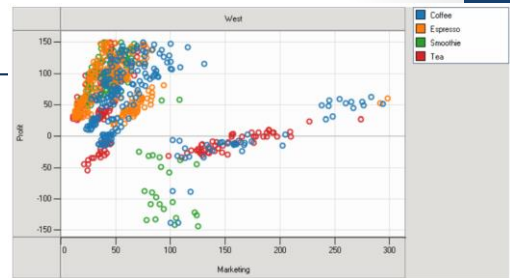


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Colors

- Help enhance graph
- Distinguish different components better



Source: https://www.perceptualedge.com/articles/b-eye/choosing_colors.pdf
 Image Sources: <https://www.w3.org/TR/respimg-usecases/>, https://www.perceptualedge.com/articles/b-eye/choosing_colors.pdf

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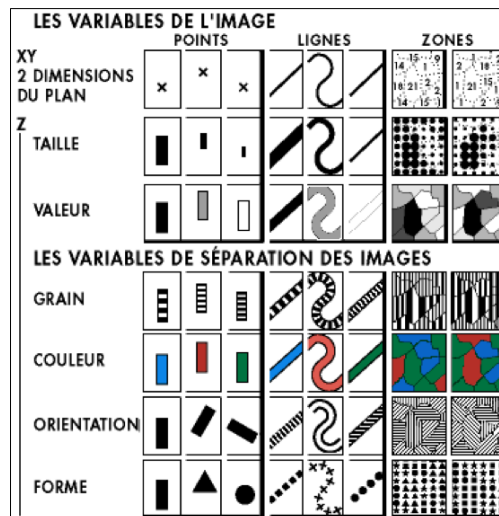


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Visual-Encoding Options

- There are 8 choices to vary!
 - Position
 - Length
 - Area
 - Volume
 - Intensity
 - Texture
 - Color
 - Orientation
 - Shape



Source: [2]

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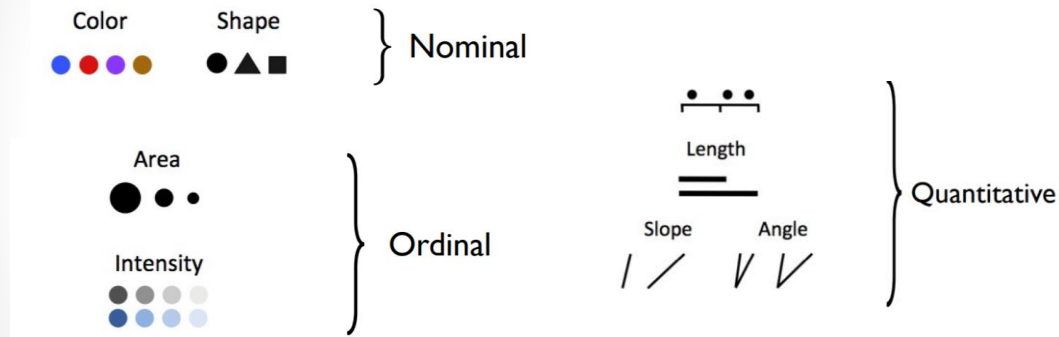


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Visual-Encoding for Data Types

- For different data types



Source: [3]

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Visualization

- Visual display to show relationships among attributes
 - Relationships: trend, pattern, etc.
- Graph selection and design process

1. Choose your graph objective and what you want to convey from your graph
2. Identify your data
 - Data types: nominal, ordinal, interval, ratio
 - Number of variables: single, double, multiple
3. Choose graph type
4. Add on graph components
5. Revise until the goal objective is satisfied

Source: [1]

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Common Graph Objectives

- Timeseries
- Part-to-whole and Ranking
- Deviation
- Distribution
- Correlation
- Network
- Geo-visualization

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Outline

- Introduction
- Time-series
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- Deviation

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Time-Series Displays

- Commonly used

- Line graph
- Bar graph

- Others

- Radar graph
- Heatmap

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Line Graph

- ✓ Display patterns

- ✓ Show exceptions



- To see change during continuous period of time



Used to display
time-series

- Features

- Length clearly display flow
- Slope shows track of change

Image source: Figure 7.12, [1]

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Line Graph (cont.)

- Commonly use with time-series to see trend & patterns

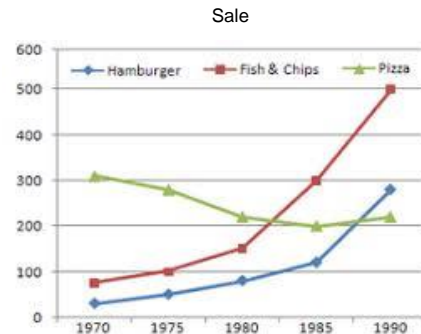
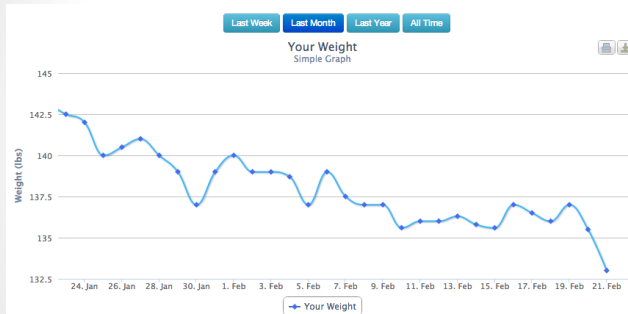


Image sources: http://www.weightgrapher.com/static/simple_graph.png
https://encrypted-tbn0.gstatic.com/images?q=tbn:ANd9GcQrZPoqPYVDOaW2n_Ka3Ekme8ADTL5fDIJp4JcQXNzuZosQ-2Q

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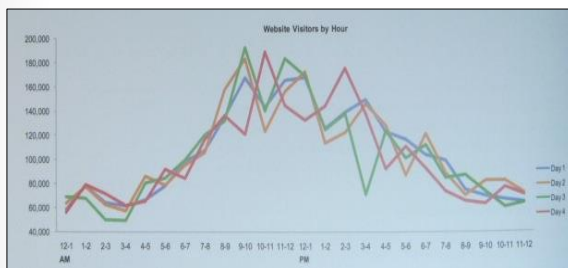


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Line Graph (cont.)

- Can be used to display cycle
- Plot multiple time-series on to same timeframe



Number website users

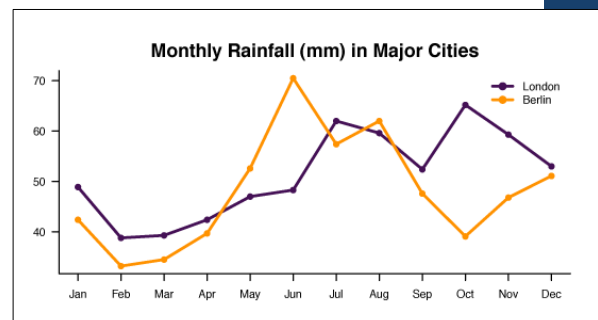


Image source: Figures 7.18, 7.19, [1]

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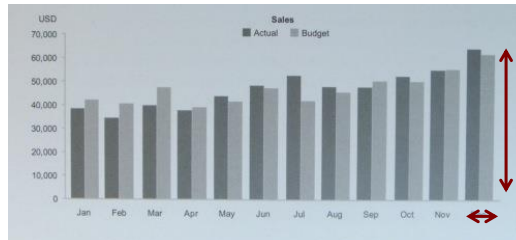


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Bar Graph

- ✓ Emphasize individual values
- ✓ Compare individual values



- To see or compare individual values
- Features
 - Height/length represents values
 - Width distinguishes different items

Image source: Figure 7.14, [1]

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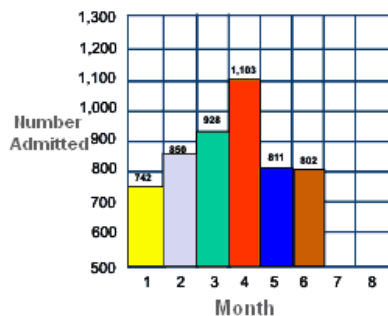
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Example : Line vs. Bar

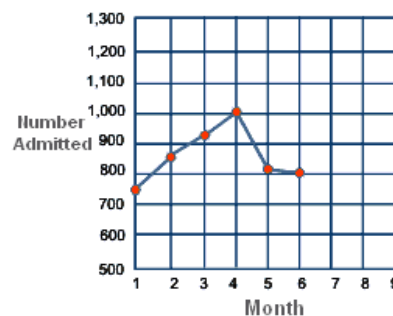
Emergency Department Admissions per Month

Bar Graph



Compare month by month

Line Graph



See trend of change

Image source: http://www.qualitytrainingportal.com/resources/problem_solving/images/bar_charts.gif

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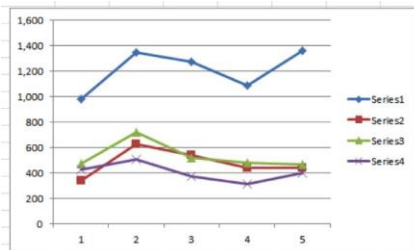
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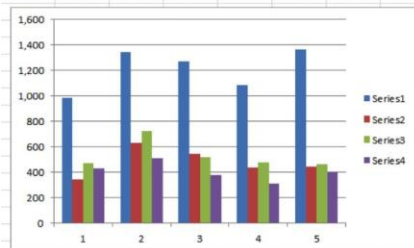
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Example 3 : Line vs. Bar



- Line graph
 - See change over time in bar graph of each series more clearly



- Bar graph
 - See comparison of different series in same time more clearly

Image source: <http://online-behavior.com/sites/default/files/imagecache/Content/articles/line-graph.jpg>

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Time-Series Displays

- Commonly used
 - Line graph
 - Bar graph
- Others
 - Radar graph
 - Heatmap

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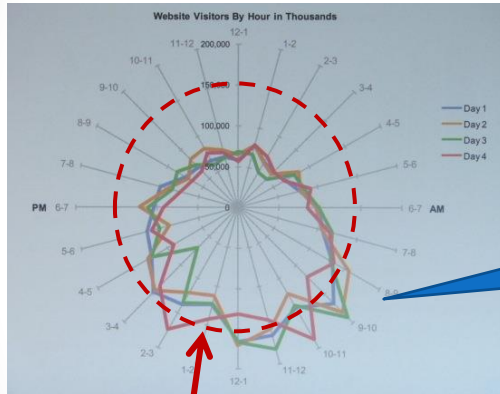


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Radar Graph

- ✓ Compare multiple variables



- Also call spider/web/star/polar graphs
- Plot variables around center

Almost the same pattern among 4 days
Many visitors during 9 AM-1PM

- For cycle/time-series, variables = times
- Avoid comparison with too many series

- Feature: Circular shape represents cyclical nature of time

Image source: Figure 7.18, [1]

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Radar Graph (cont.)

- Example: Comparison between radar and line graphs



Maximum website users
occur around 9:00-12:00

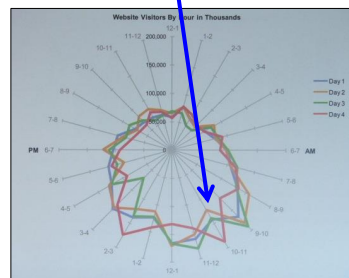


Image source: Figures 7.18, 7.19, [1]

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Example 2 : Radar Graph

Excel: Spider chart

- Example 2: Comparison between radar and line graphs

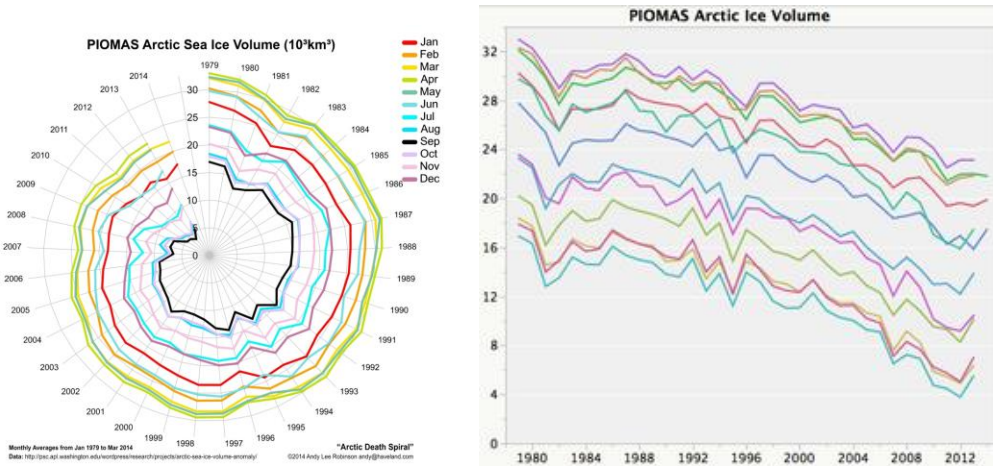


Image source: http://junkcharts.typepad.com/junk_charts/2014/04/an-overused-chart-why-it-fails-and-how-to-fix-it.html

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Heatmap

✓ Analyze patterns of large number of series in cycles

✓ Show exception of multiple series

- To analyze multiple series
 - For comparison between many series, heatmap works better than radar graphs
- Feature
 - Color represents values

Blue = Sleep, Yellow = Awake

Sleeping patterns of a child during one month

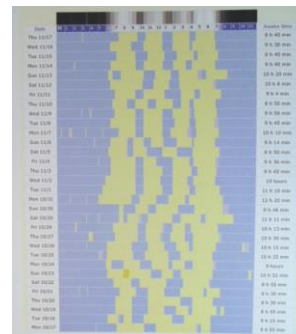


Image source: Figure 7.21, [1]

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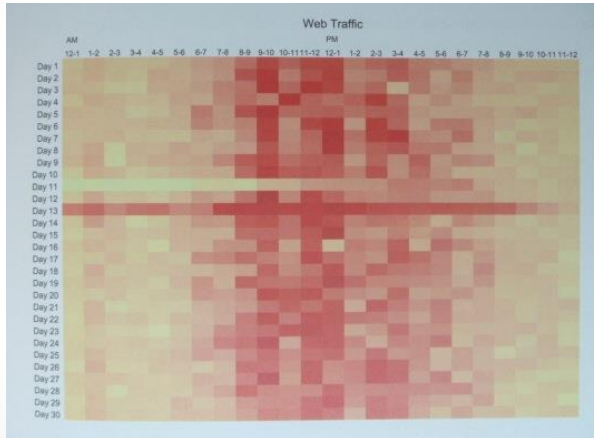


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Heatmap (cont.)

- Example 2: Multiple colors



Web Traffic

Excel:
Conditioning formatting

Image source: Figure 7.22, [1]

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Outline

- Introduction
- Time-series
- Part-to-whole and Ranking
- Deviation

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Displays for Part-to-Whole and Ranking

- Common graphs
 - Pie chart
 - Bar graph
- Other graphs
 - Donut chart
 - Stacked bar graph
 - Stacked area graph
 - Radar graph

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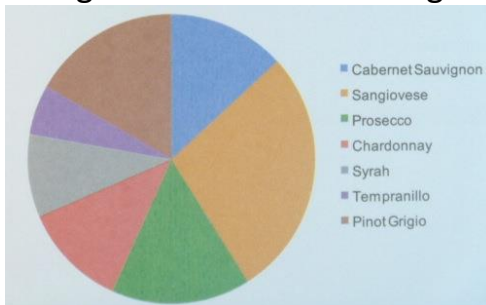


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Pie Chart

- Part-to-whole is normally displayed in pie graph
- Difficulty in
 - Comparison between slices
 - Linking between slices and legends



It is also difficult to identify percent amount.

How about adding numbers?

Image source: Figure 8.4, [1]

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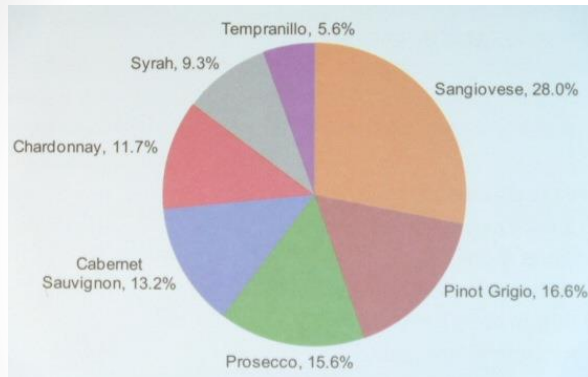
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Pie Chart (cont.)



- We can also use table.

| Wine | Percent |
|--------------------|---------|
| Sangiovese | 28.0% |
| Pinot Grigio | 16.6% |
| Prosecco | 15.6% |
| Cabernet Sauvignon | 13.2% |
| Chardonnay | 11.7% |
| Syrah | 9.3% |
| Tempranillo | 5.6% |
| Total | 100.0% |

Image source: Figures 8.5, 8.6, [1]

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Pie Chart (cont.)

- To use pie chart:
 - Use compare parts to whole
 - Not to compare parts to parts
 - No part overlapping
 - Not too many sections/parts (< 5-7 sections)
 - Sort from max to min (Generally, starting from 90° and turn clockwise)
 - Clear labels
 - Sum of all parts = 100%
 - Avoid 3D, donut, or splitting pie chart

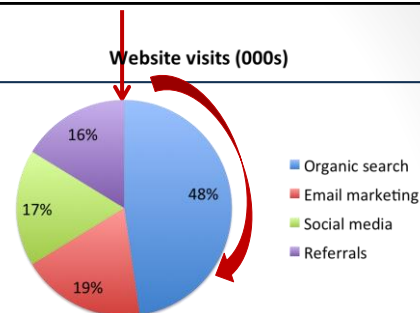


Image source: <http://www.f1f9.com/blog/please-stop-using-pie-charts>

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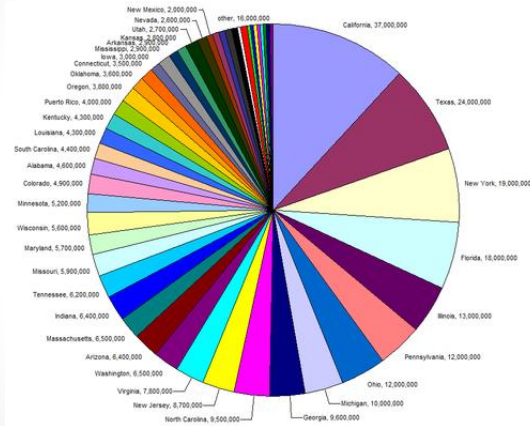


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Pie Chart (cont.)

Population in 50 states in U.S.



- If too many sections, make the labels clear.

Image source: <https://eagereyes.org/techniques/pie-charts>

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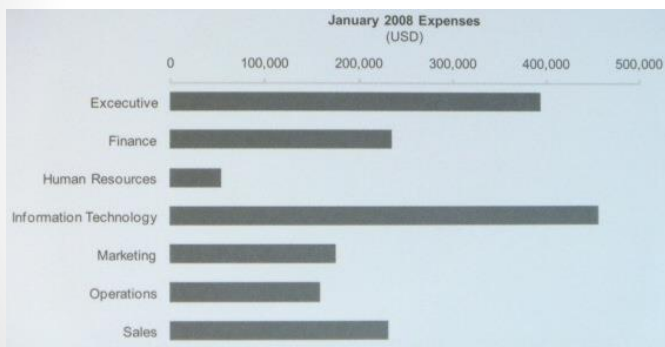


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Bar Graph

- Questions:
 - How much percent of expense did each department spend?
 - Which department proportionally spent the most money?



- We are looking portion, compared to whole?
- We can rank portion.

Image source: Figure 8.1, [1]

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Bar Graph (cont.)

- Turn into percent of expense
- After sorting, we find that IT department spends the most money.

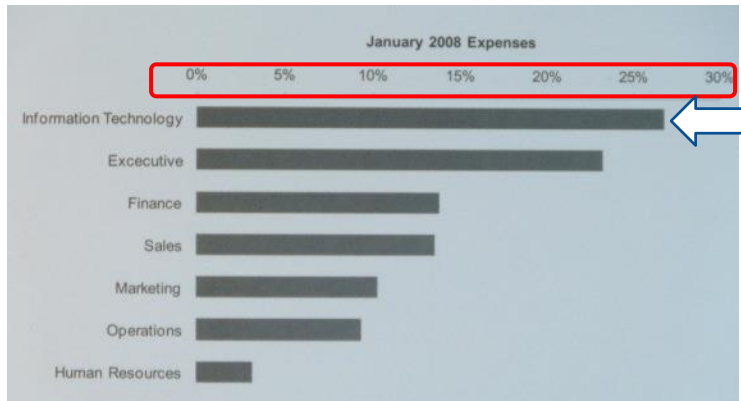


Image source: Figure 8.2, [1]

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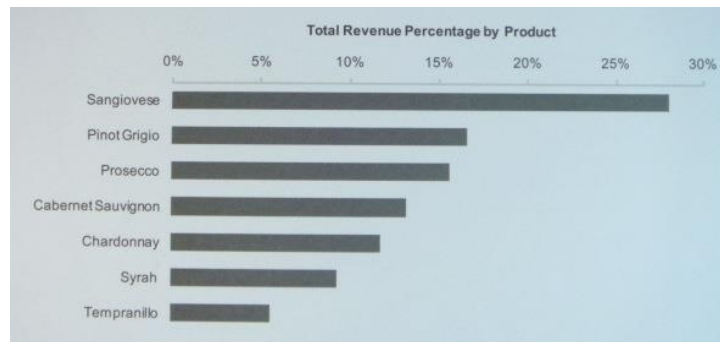
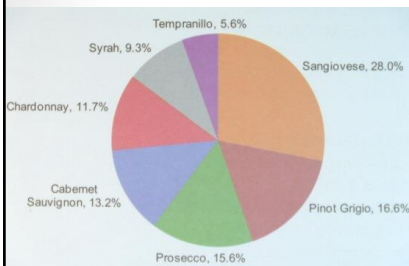
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Bar Graph

- Can be used to present both part-to-whole and ranking

Same data as the previous pie graph



Drawback of bar graph? Narrow long bars.

Image source: Figure 8.7, [1]

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Pie vs. Bar Graphs : Example



Image source: <http://www.f1f9.com/blog/please-stop-using-pie-charts>

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Pie vs. Bar: Example 2

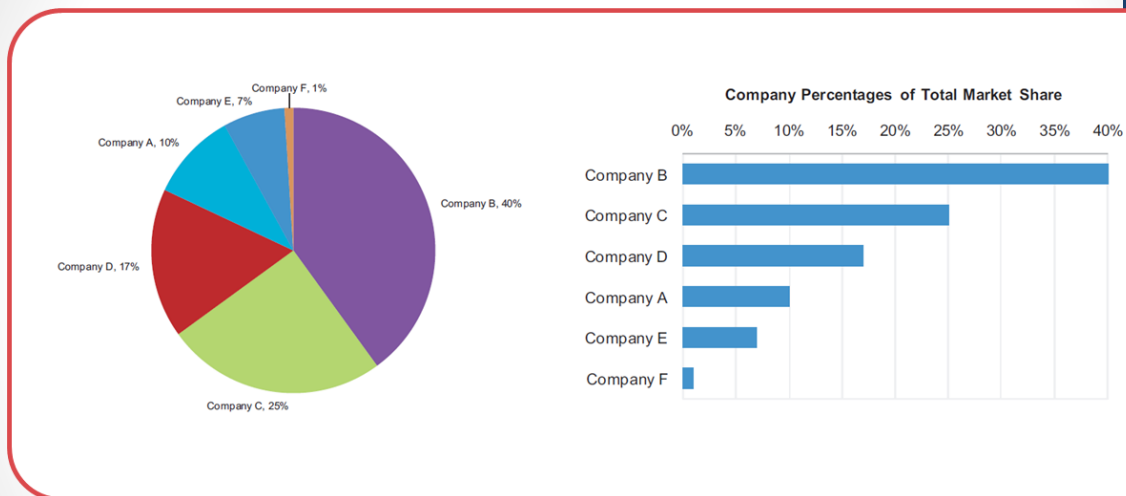


Image source: <http://speakingppt.com/wp-content/uploads/2012/10/stephen-few-pie-vs-bar.png>

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Displays for Part-to-Whole and Ranking

- Common graphs

- Pie chart
- Bar graph

- Other graphs

- Donut chart
- Stacked bar graph
- Stacked area graph
- Radar graph

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Donut Chart

- Similar to pie chart but
- Con: missing centric area and hard to distinguish sections

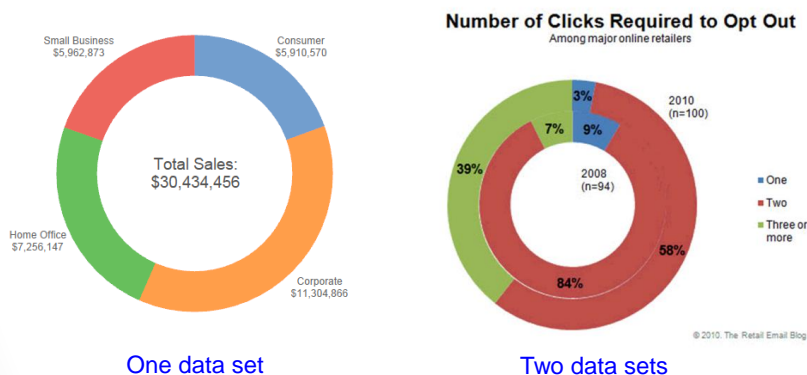


Image sources: Figures <https://www.interworks.com/sites/default/files/blog/u150/donut.png>
<https://danjharrington.wordpress.com/2011/11/11/death-to-the-doughnut-chart/>

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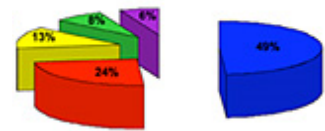
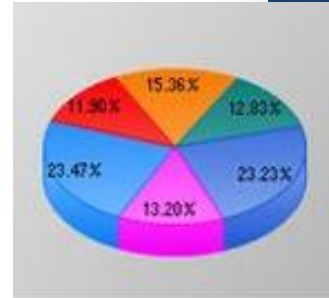
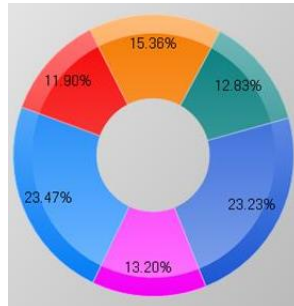
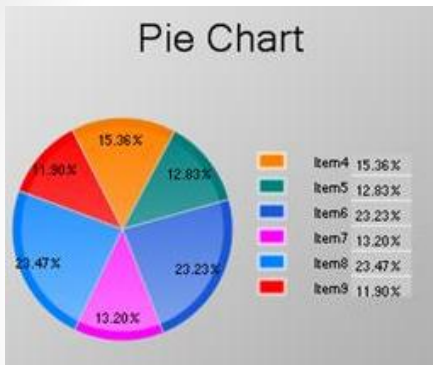
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Pie Chart vs. Donut (cont.)



- Donut, Splitting, or 3D degrades readability
- Avoid them!

Image source: http://www.codeproject.com/KB/GDI-plus/simple_pie_chart_control/PieChart1.JPG/

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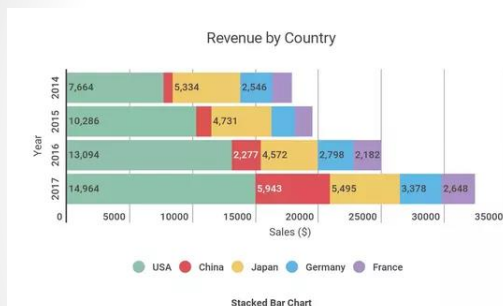


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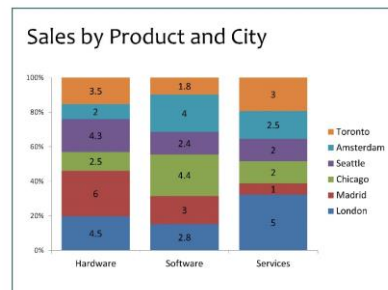
41

Stacked Bar Graph

- Can compare with total summation or 100%



Compare with total sum
Values are actual values



Compare with 100%
Values are in percentage

Image sources: <https://qph.fs.quoracdn.net/main-qimg-d91aedca098bbf3250b5c38ad9b1a02f>
<http://speakingpowerpoint.files.wordpress.com/2011/05/slide4.jpg>

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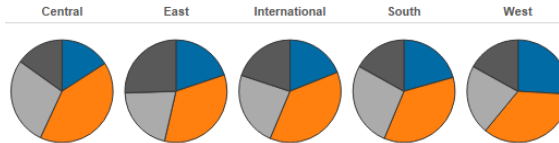
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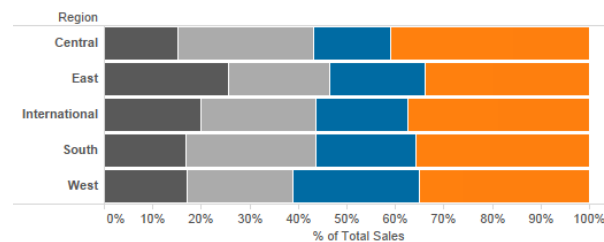
Pie vs. Stacked Bar Graph

- Example

Sales by Region: Pies



Sales by Region: Stacked



Compare with 100%

Image source: <http://gravyanecdote.com/tableau/pie-or-stacked-bar/>

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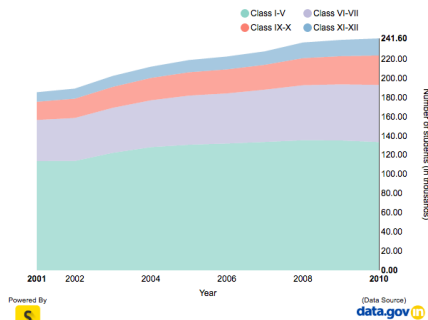
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Stacked Area Graph

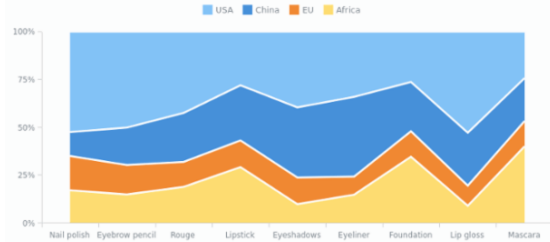
- Can compare with total summation or 100%

Student enrollments in India (2001-10)



Compare from total sum

Regional ratio of cosmetic products sales



Compare from 100%

Image sources: <https://blog.socialcops.com/academy/resources/visualizing-time-series-data/>
https://www.anychart.com/products/anychart/gallery/Area_Charts/

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Radar Graph

- Plot of multi-variate data
- Place variables around center
 - Variables can be nominal data
- Use same scale to compare each category

| Employment Candidate Review | | | |
|-----------------------------|--------------|------------|-------------|
| Rating Areas | Candidates | | |
| | Karen Fortou | Mike Rafun | Jack Nymbul |
| Experience | 4.00 | 4.50 | 2.50 |
| Communication | 3.50 | 2.00 | 5.00 |
| Friendliness | 4.00 | 2.00 | 4.50 |
| Subject matter knowledge | 4.00 | 5.00 | 2.50 |
| Presentation | 3.00 | 1.50 | 2.75 |
| Education | 3.50 | 4.50 | 2.00 |
| Average Rating | 3.67 | 3.25 | 3.21 |

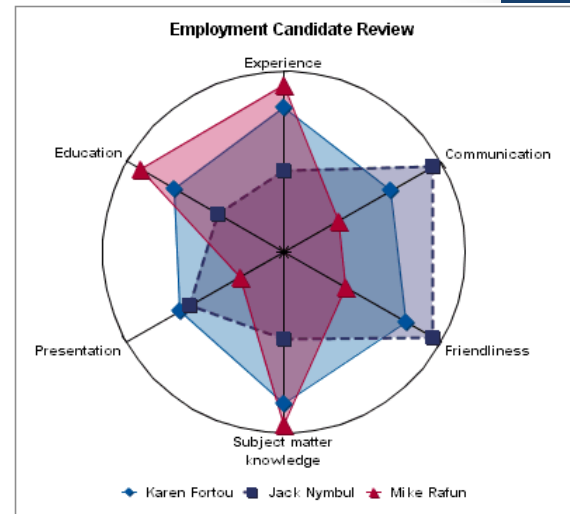


Image source: <http://www.perceptualedge.com/example4.php>

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Example : Radar Graph

- Hotel Comparison

OSAT = overall satisfaction
Value = money-worth

โรงแรม Kinuya Hotel ทำเลสะดวก ทั้งเดินทาง จั๊บจ่ายชื้อของ และกลับนารีตะ

โรงแรม Asakusa Hotel Wasou ห้องแคปซูล หอึง 900 บาท/คืน

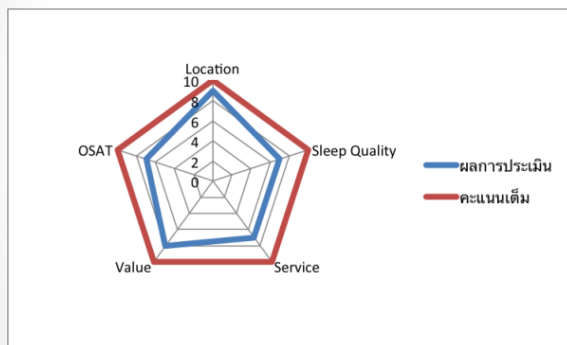


Image source: <http://www.japan50.com/2014/kinuya-hotel/>
<http://www.japan50.com/2014/asakusa-hotel-wasou/>

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Outline

- Introduction
- Time-series
- Part-to-whole and Ranking
- Deviation

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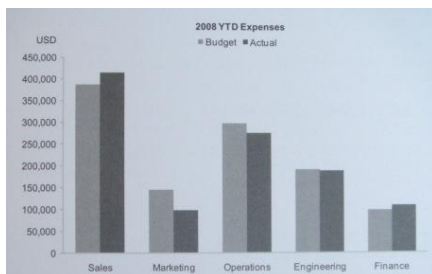


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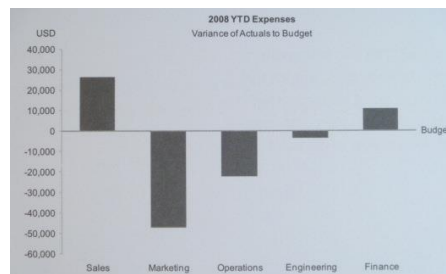
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Deviation Analysis

- How much values are different from reference values
- Example: budget vs. actual expenses



Original graph



Display difference amount between budget and actual

Reference = budget

Image source: Figures 9.1, 9.2 [1]

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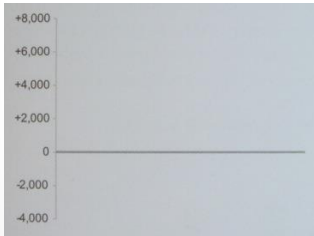


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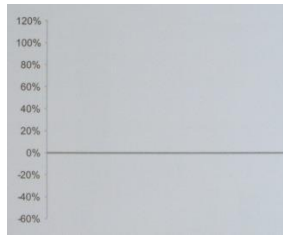
48

Reference Line

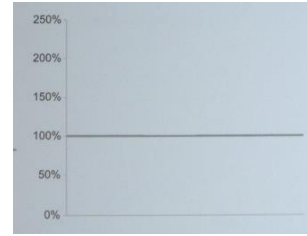
- Required feature in deviation
- Commonly used values
 - Zero
 - Zero or hundred percent
 - Exact reference value



Zero



0%



100%

Image source: Figure 9.3 [1]

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Deviation Displays

- Bar graph
- Line graph

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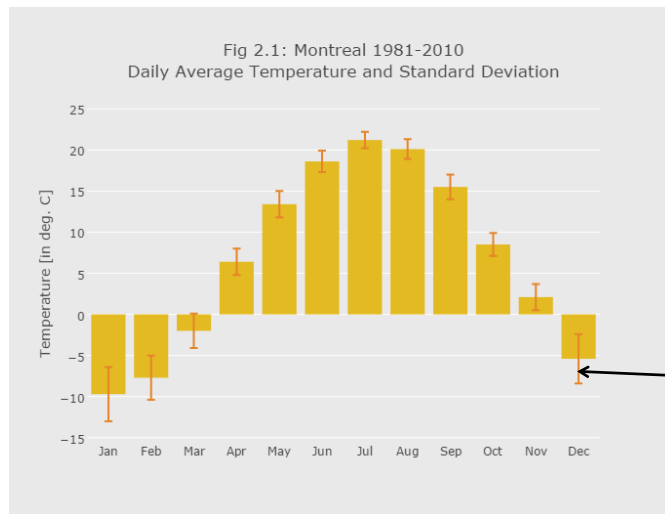
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Example 1 : Bar Graph



- Compare **average temperature** in 12 months

Reference = 0°C

Added confidence interval

Image source: <https://plot.ly/python/bar-charts-tutorial/>

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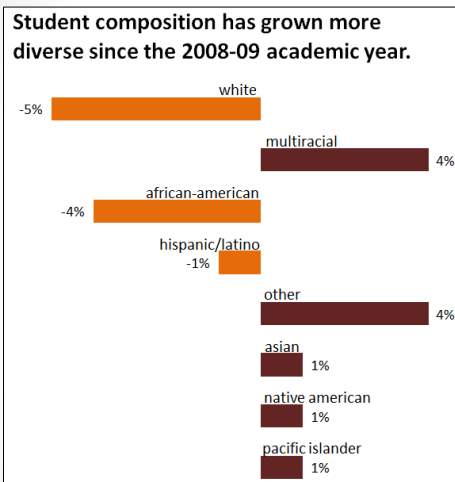
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Example 2 : Bar Graph



- Compare **change in student composition**
- Sort from maximum to minimum **absolute change**
 - Put majority change first
- No line plotted in graph

Reference = 0%

Image source: http://betterevaluation.org/evaluation-options/split_axis_bar_graph/

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Line Graph

- Example : Change of gold price between 1970-2013

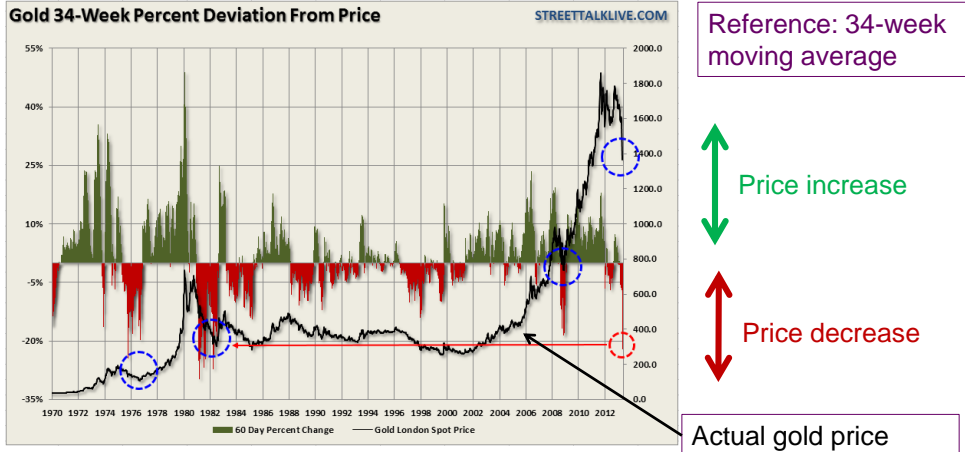


Image source: <http://www.pragcap.com/the-gold-crash-what-its-not-telling-us/>

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Bar vs. Line Graph

- Bar graph focuses on exact values
- Line graph focuses on change in deviation
- Example 1:

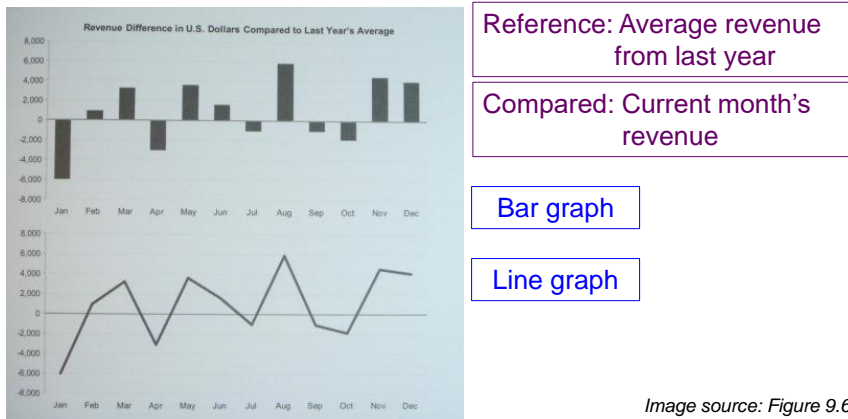


Image source: Figure 9.6, [1]

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Reference

1. Now You See It: Simple Visualization Techniques for Quantitative Analysis, Stephen Few, Analytics Press, 2009
2. Multidimensional Visualization, Maneesh Agrawala, 2011
3. http://saravanan-thirumuruganathan.github.io/cse5334Spring2015/slides/02_IntroToViz/2_IntroToViz_final.pdf

