

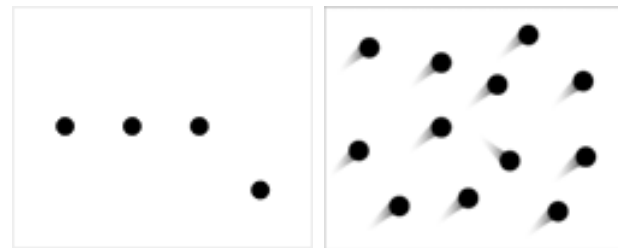
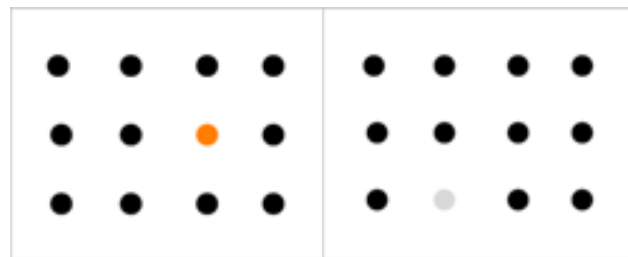
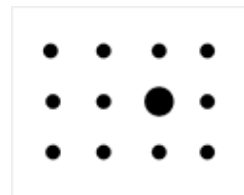
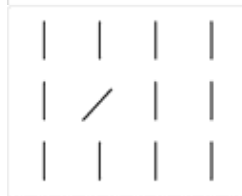
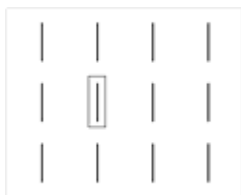
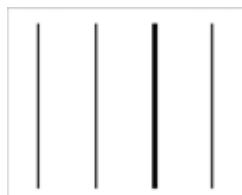
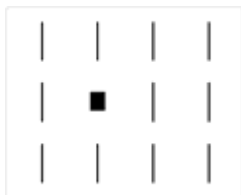
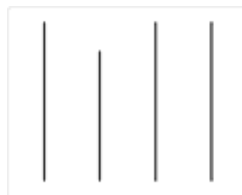
# Data Visualization

## Visual Business Analytics

### Choosing Charts based on Data Type

Raghavshyam Ramamurthy  
Vivek Anand

# Preattentive Attributes



# Preattentive Attributes

Allows more  
accurate comparisons

2D position along common, aligned scale



2D position along common, but unaligned scales



Length



Slope



Angle



Area



Colour intensity



Allows more  
generic comparisons

Volume



Colour hue



# Measure Dimension

One Measure + One Dimension

One Measure + Date

One Measure + Geo Spatial

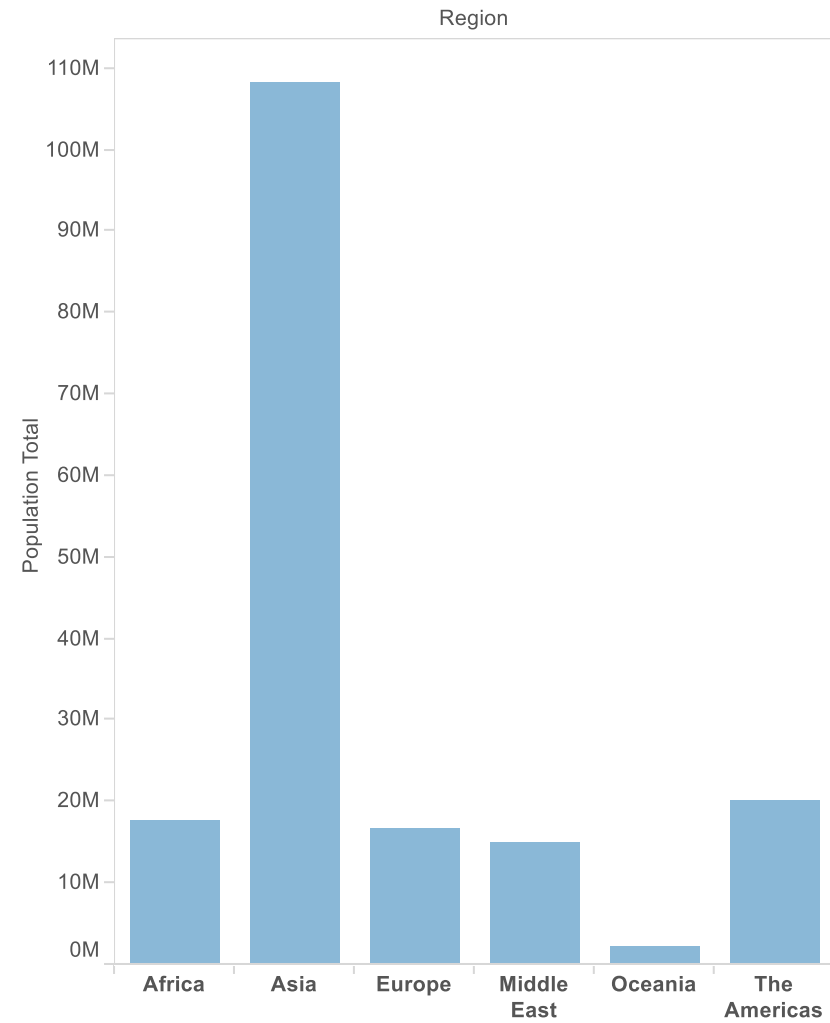
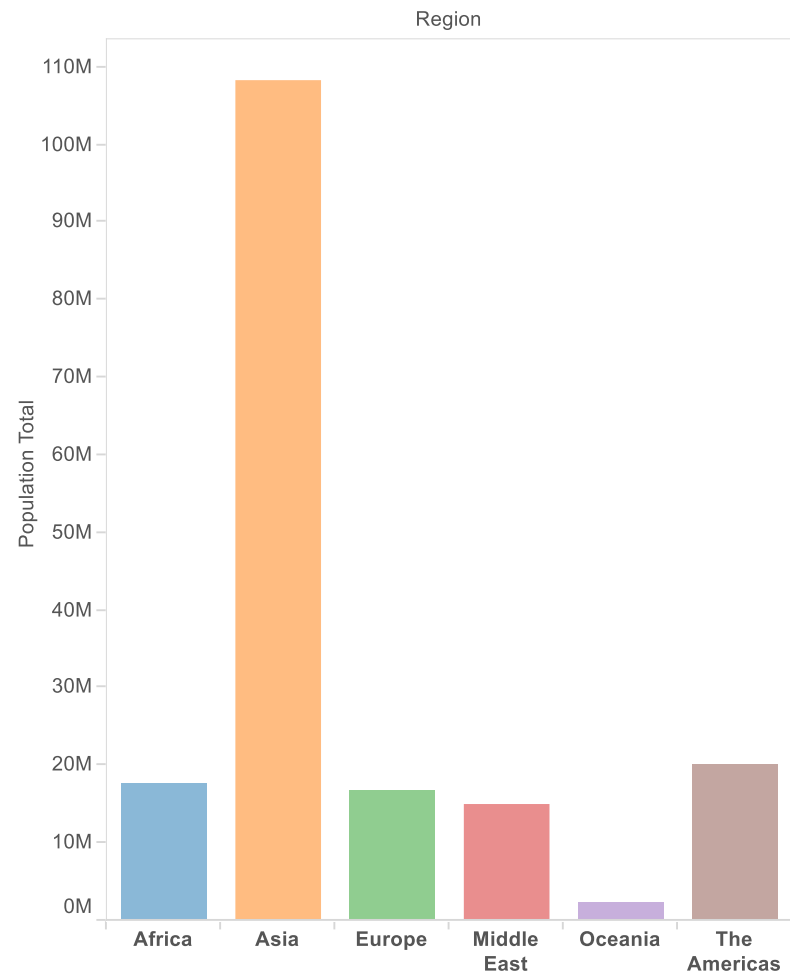
One Measures

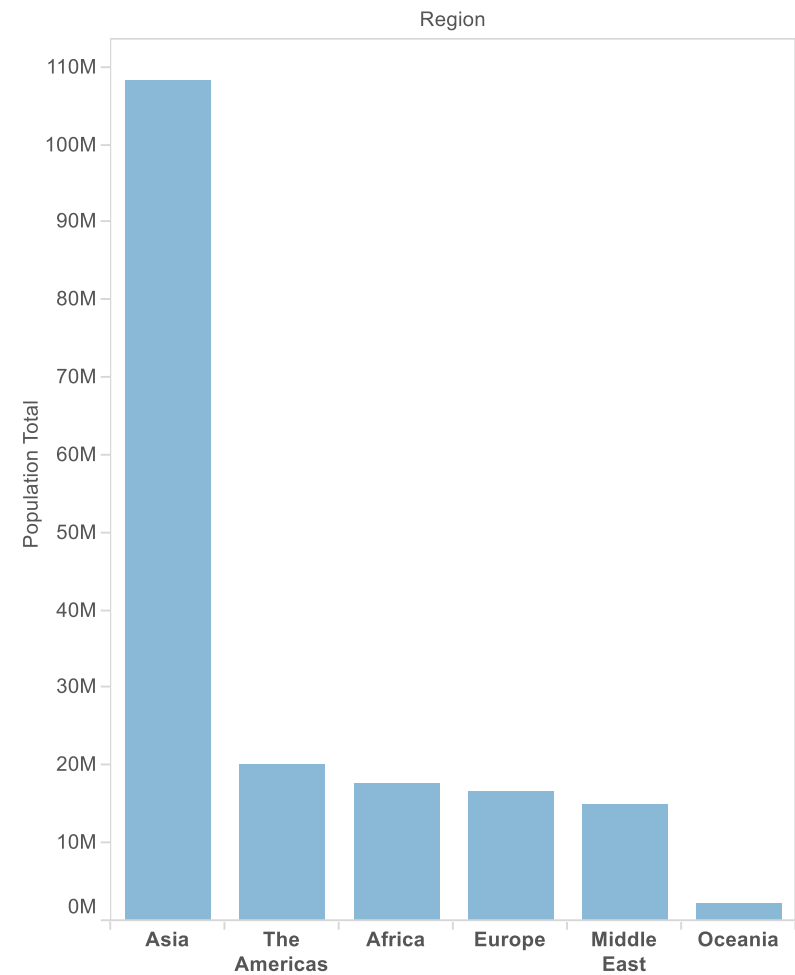
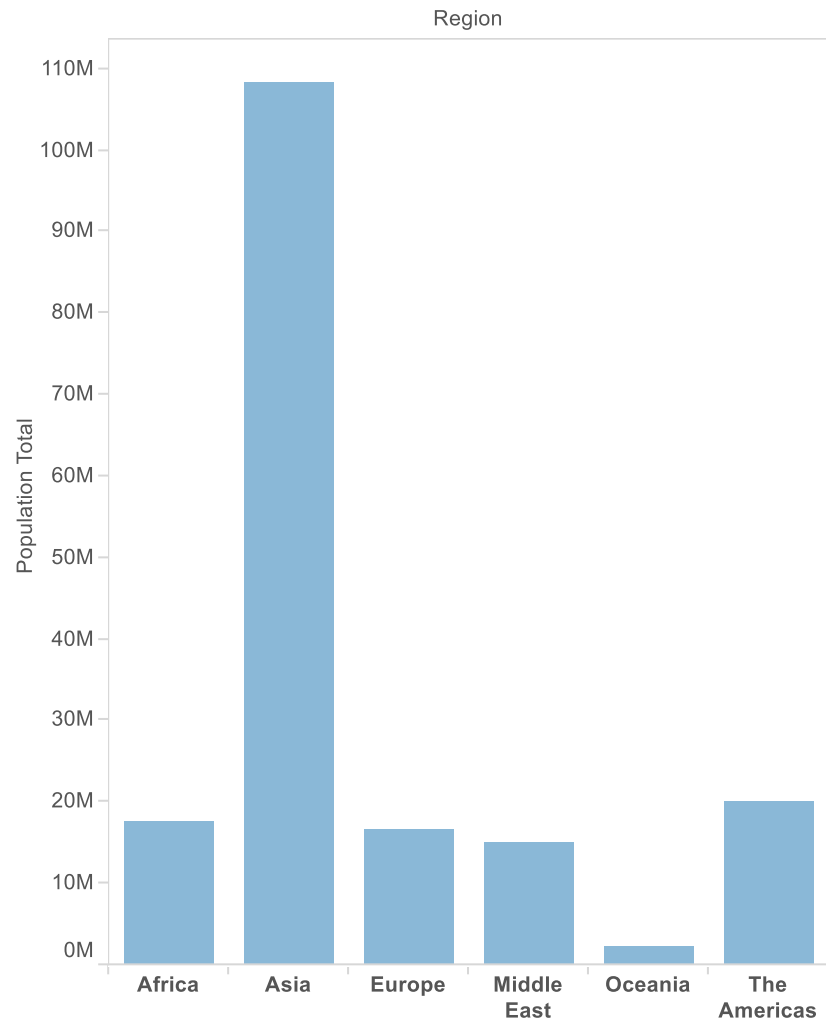
2 Measures

One Measure + Many Dimensions

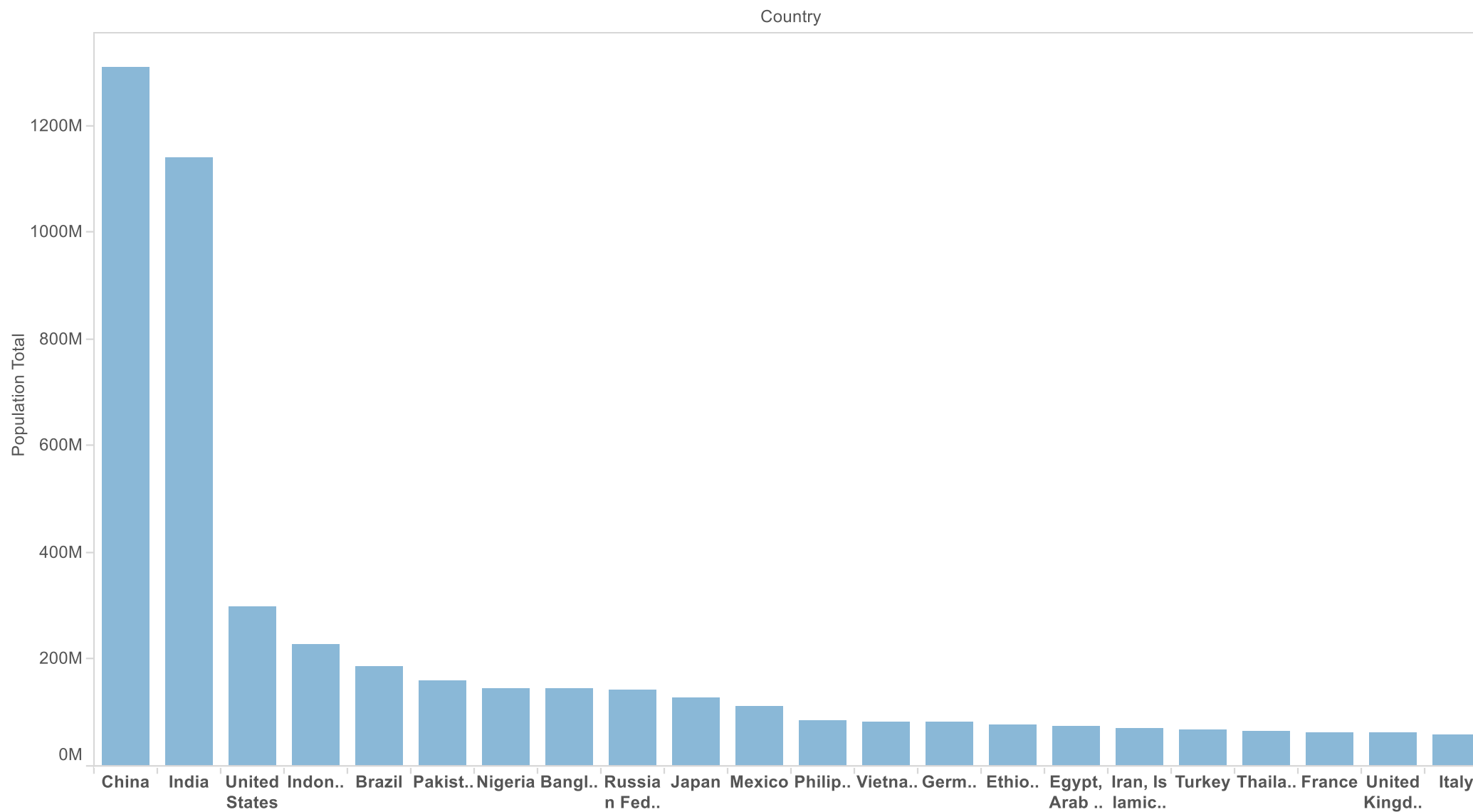
One Dimension + Many Measures

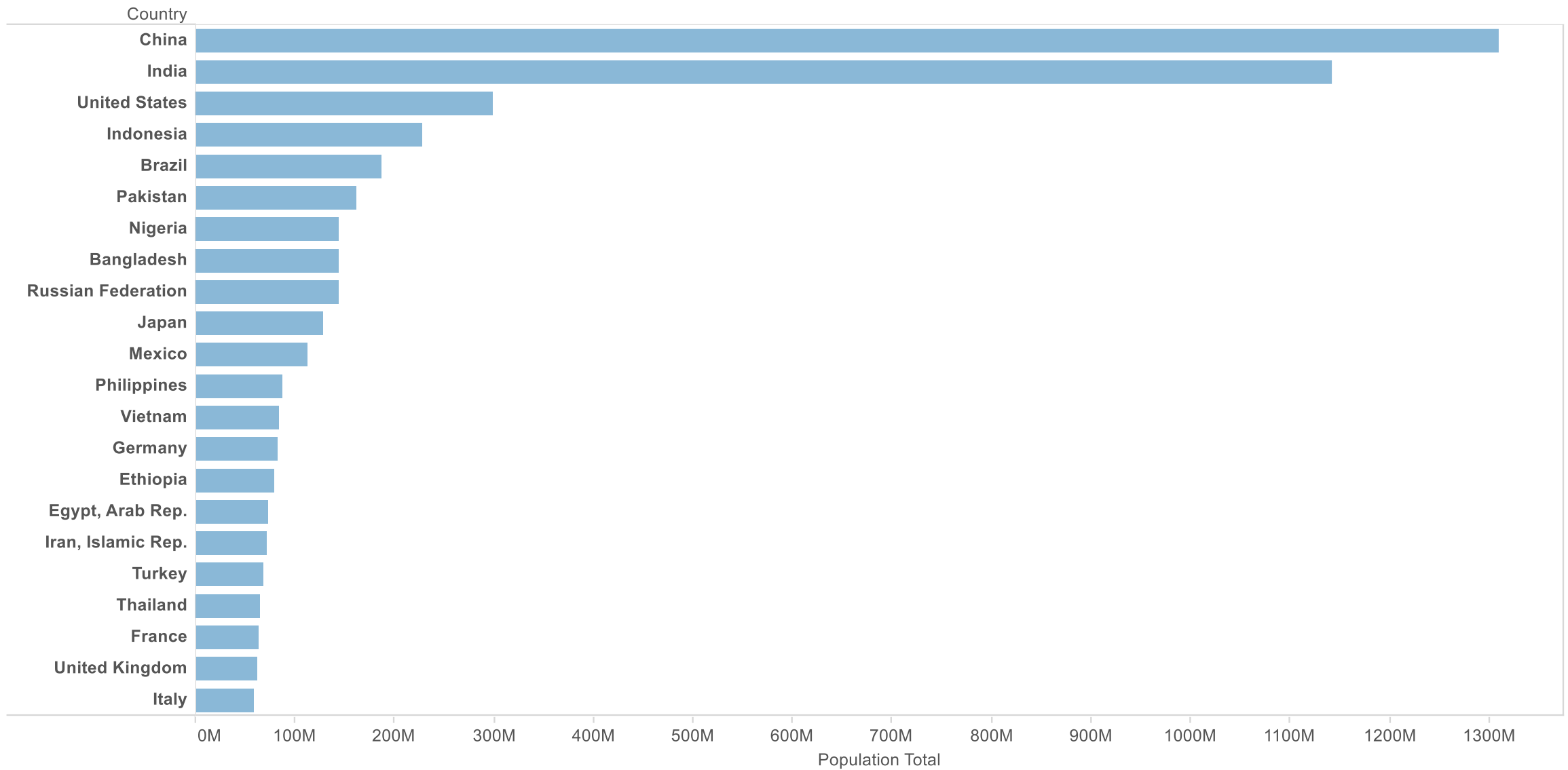
# One Measure + One Dimension

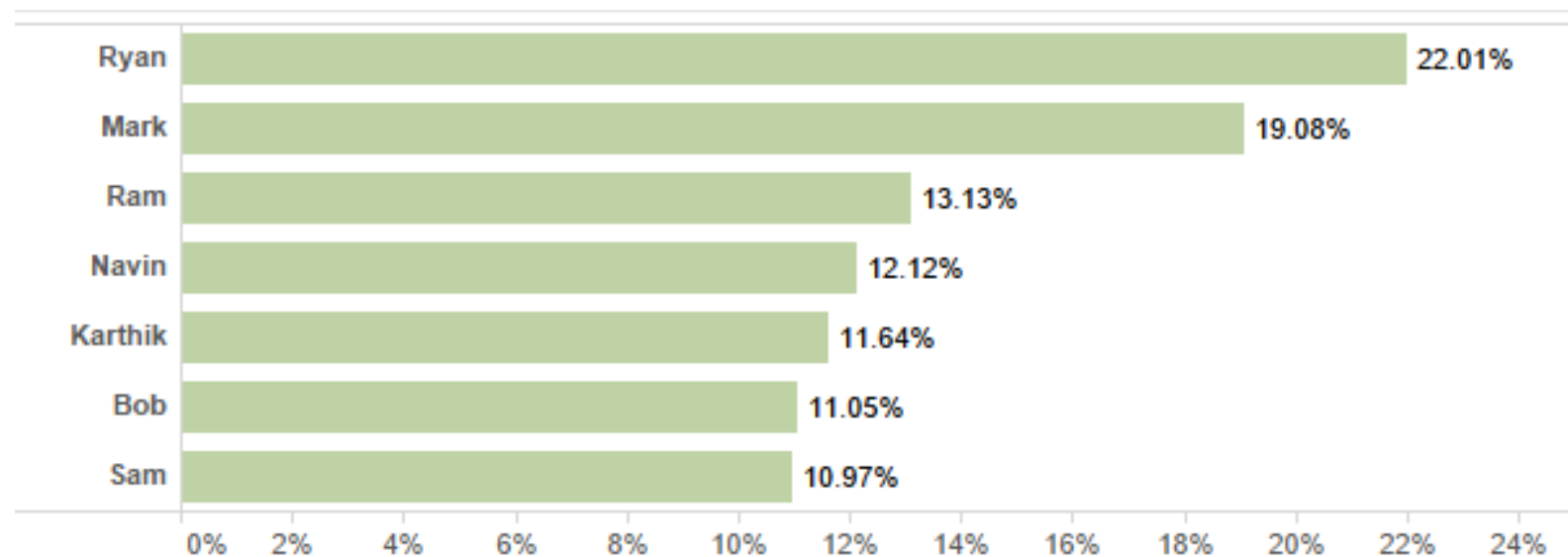
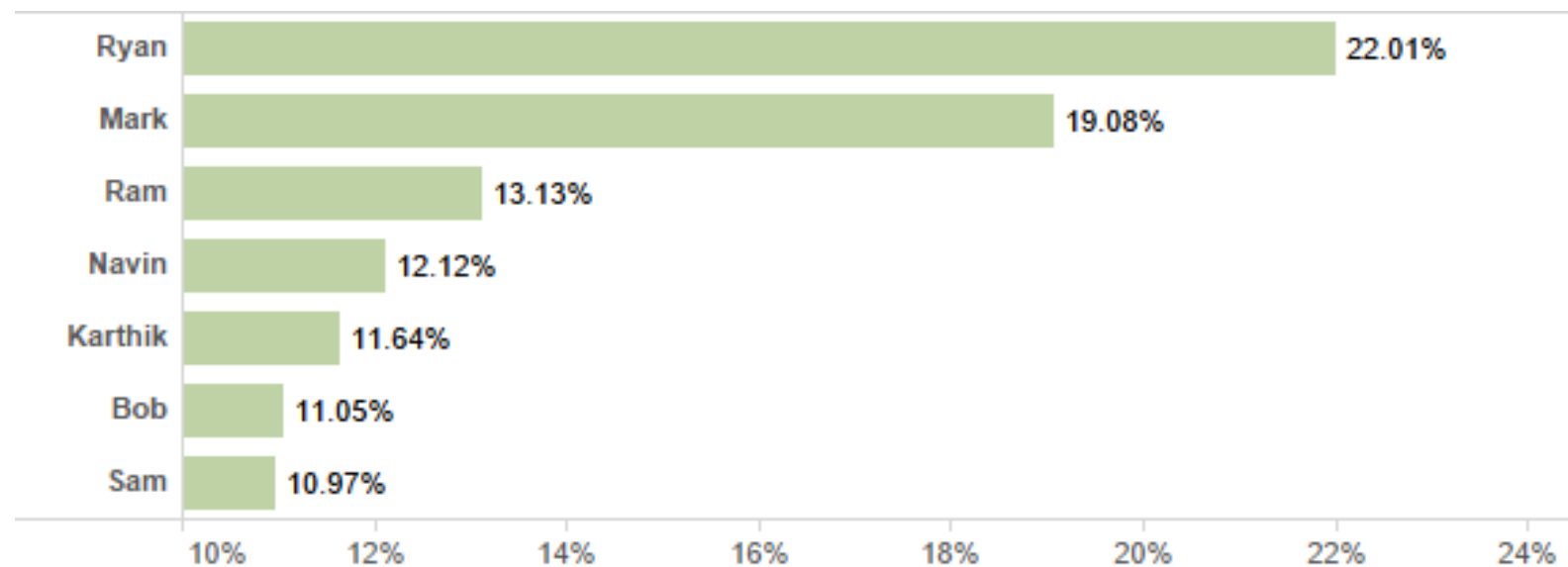


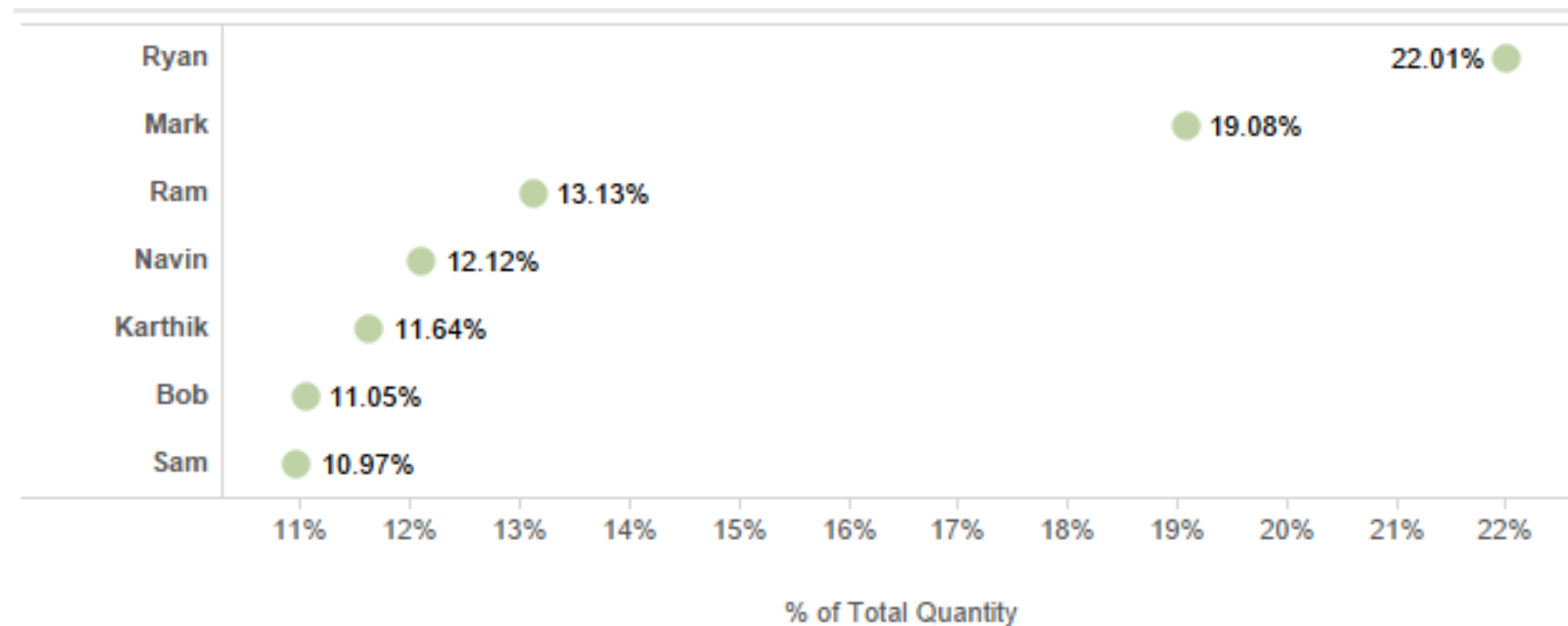
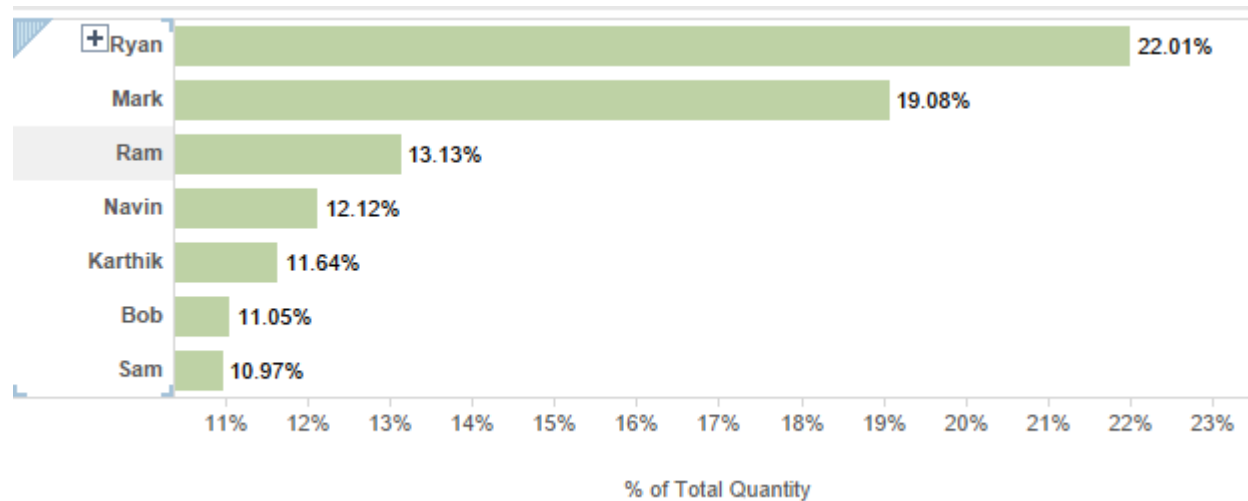


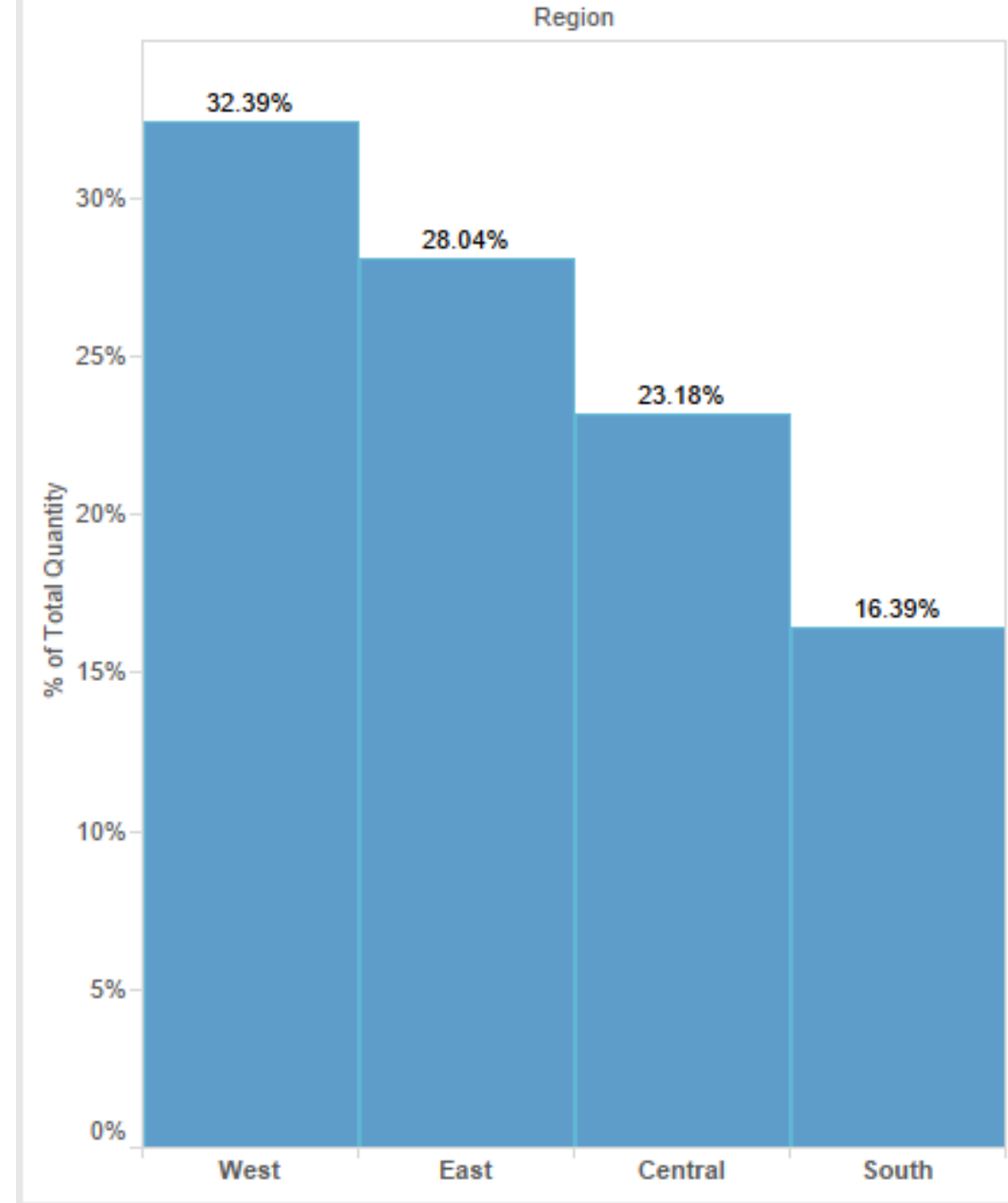


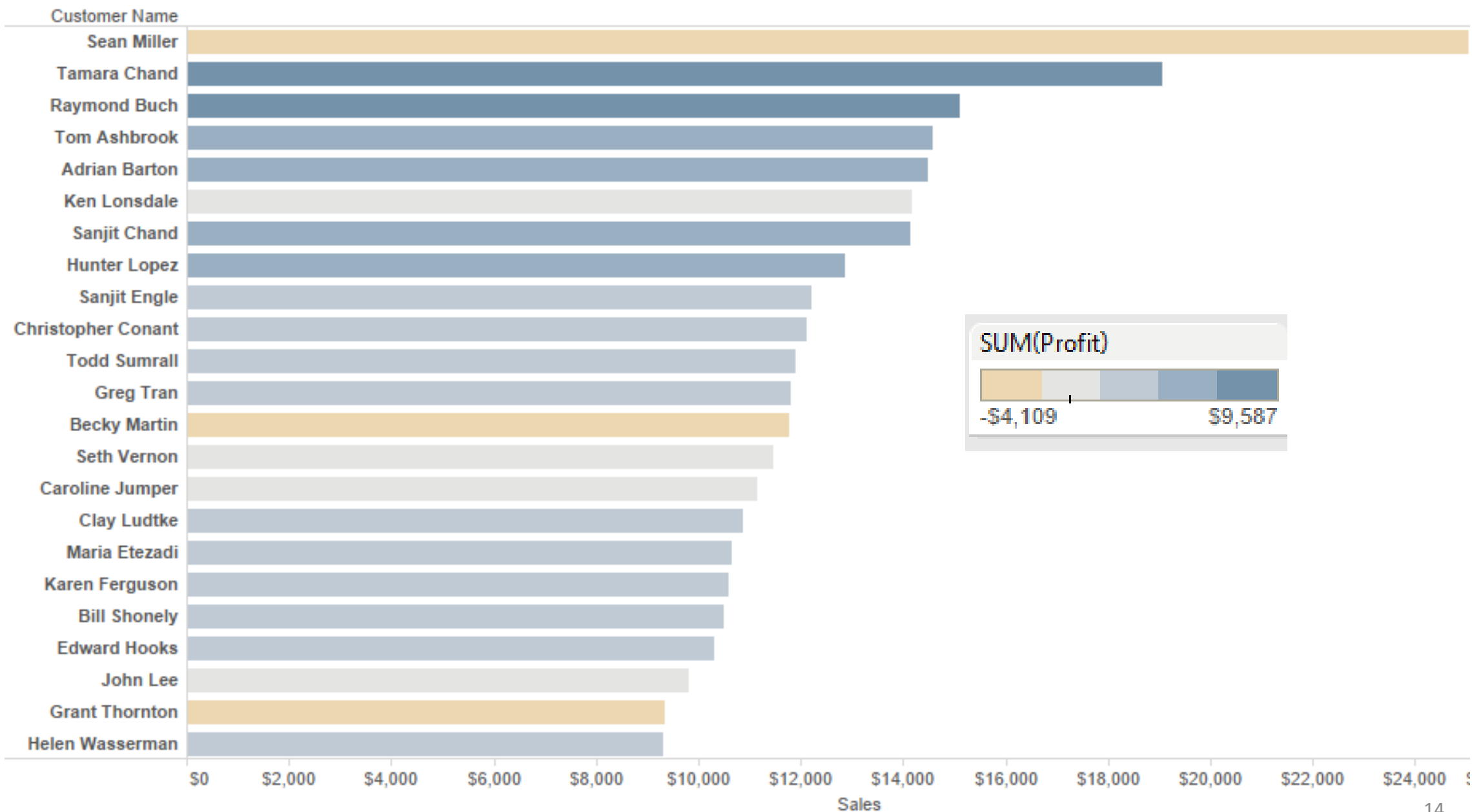


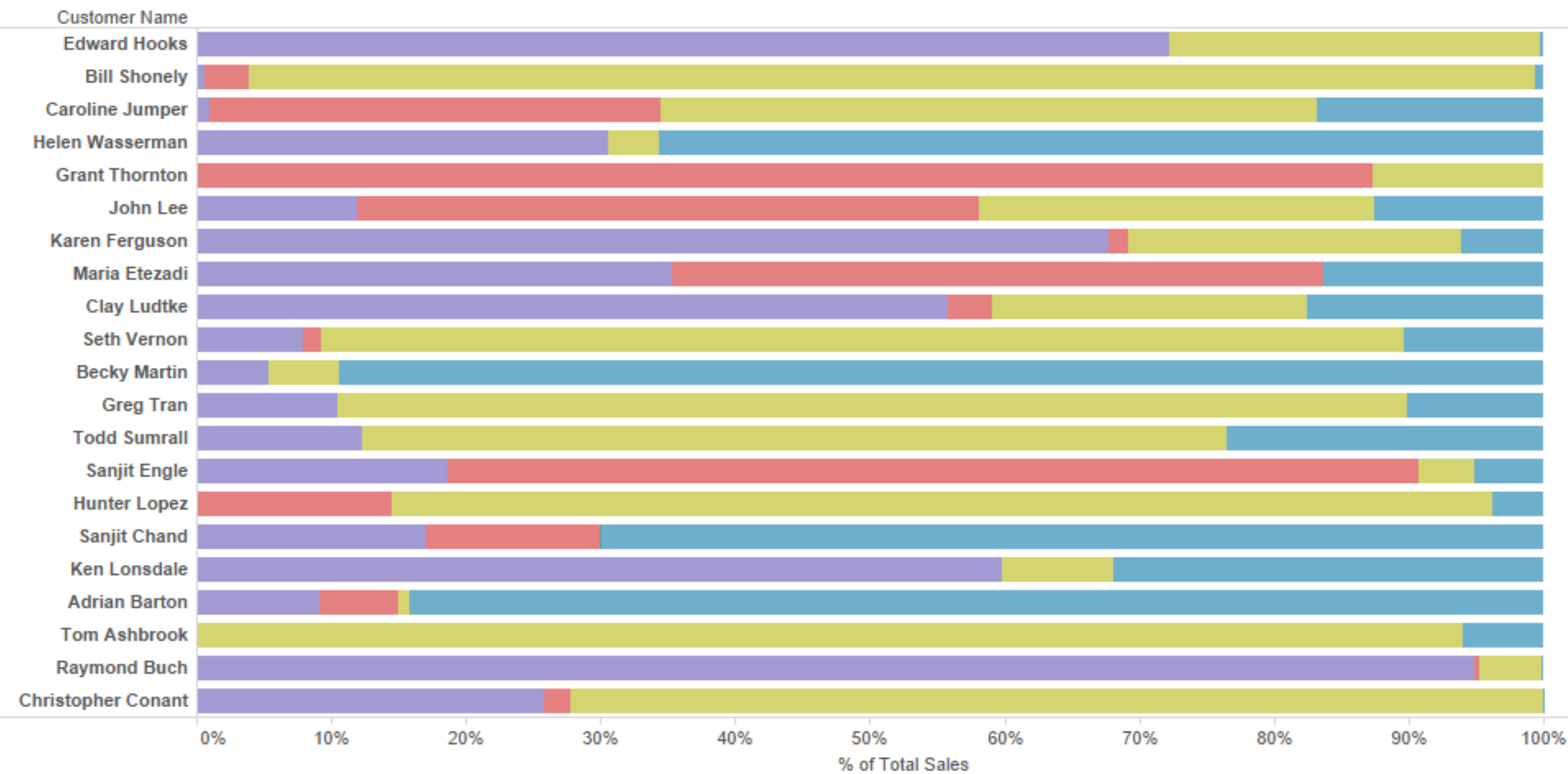








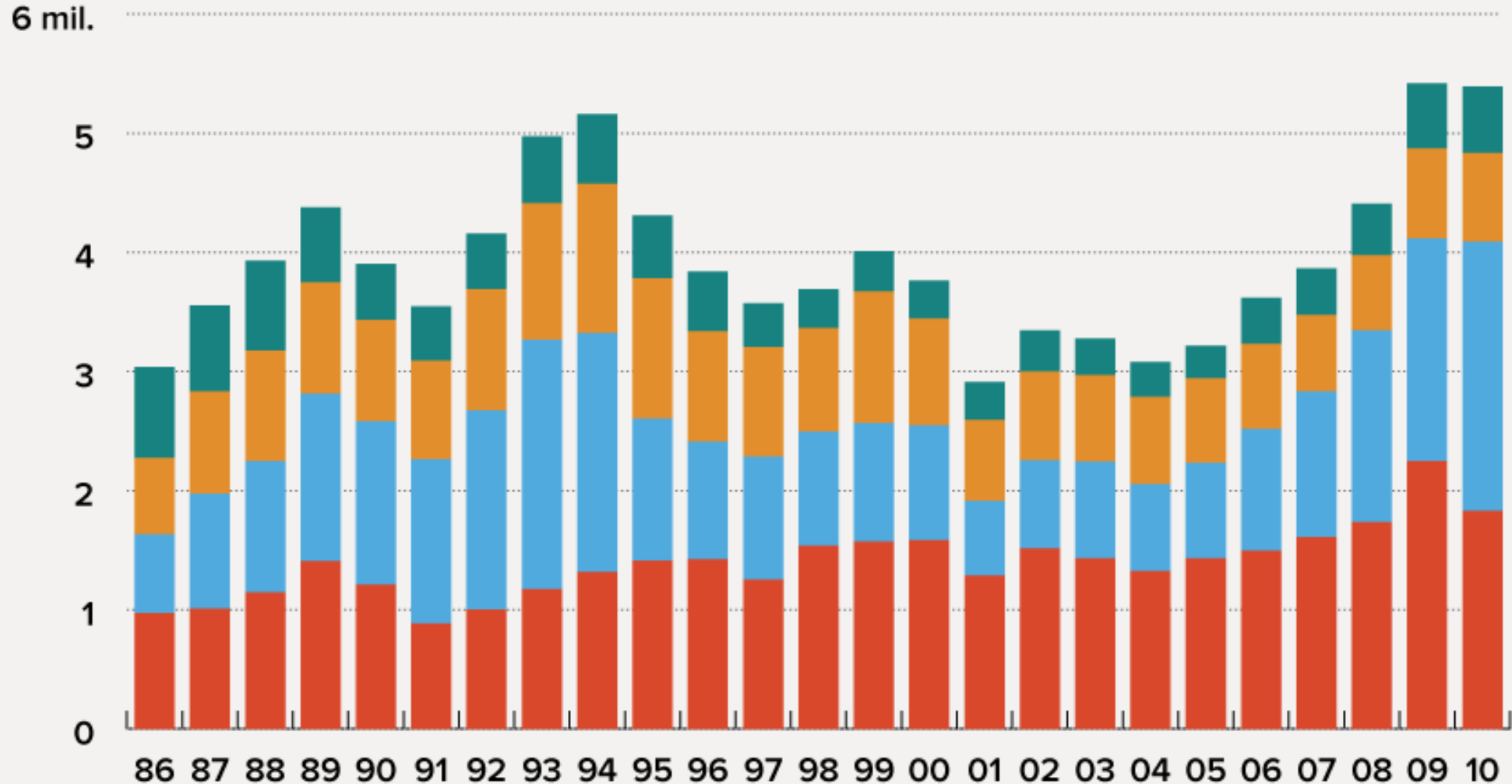




# U.S. Gun Manufacturing By Type: 1986-2010

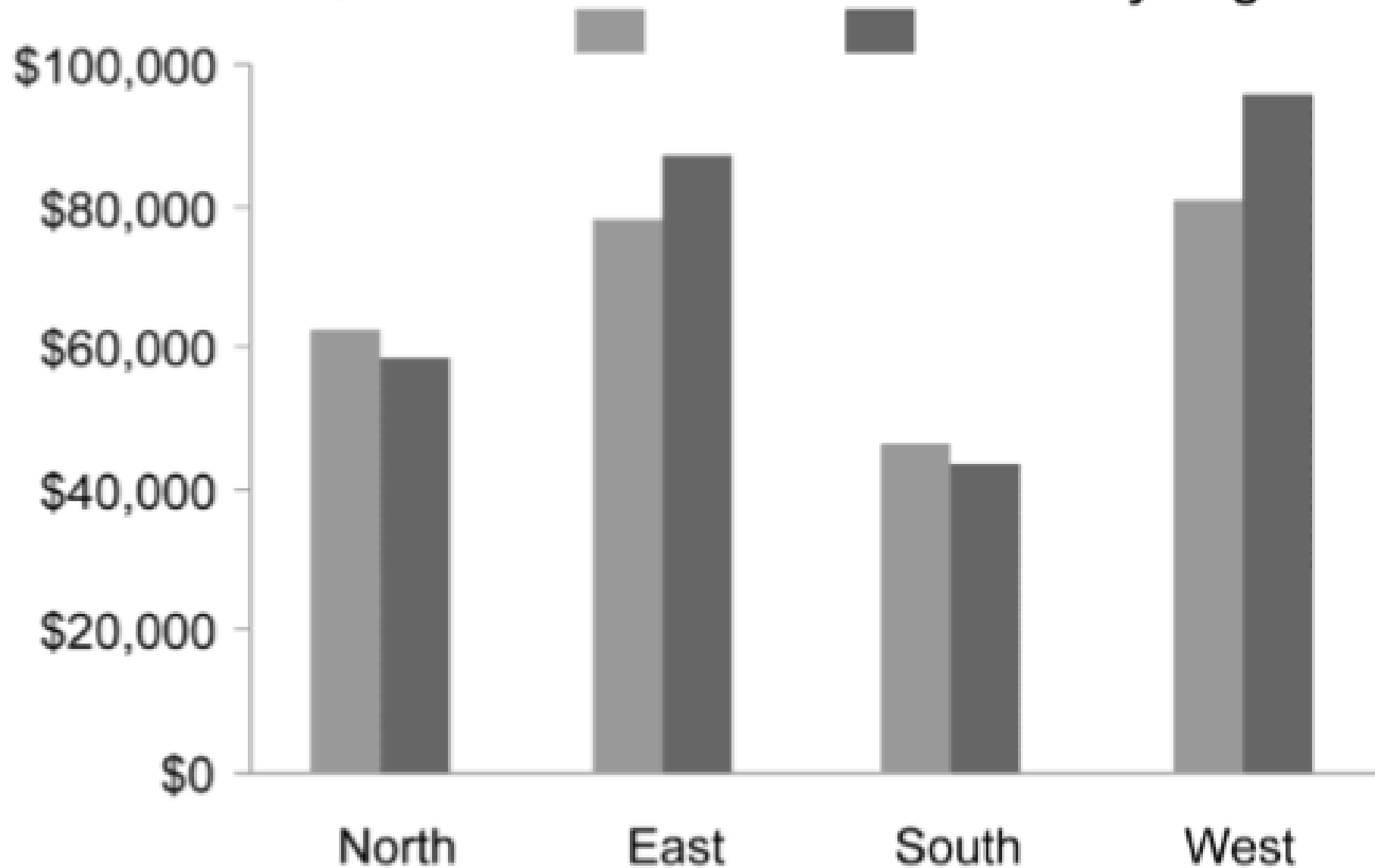
Guns Made (Millions)

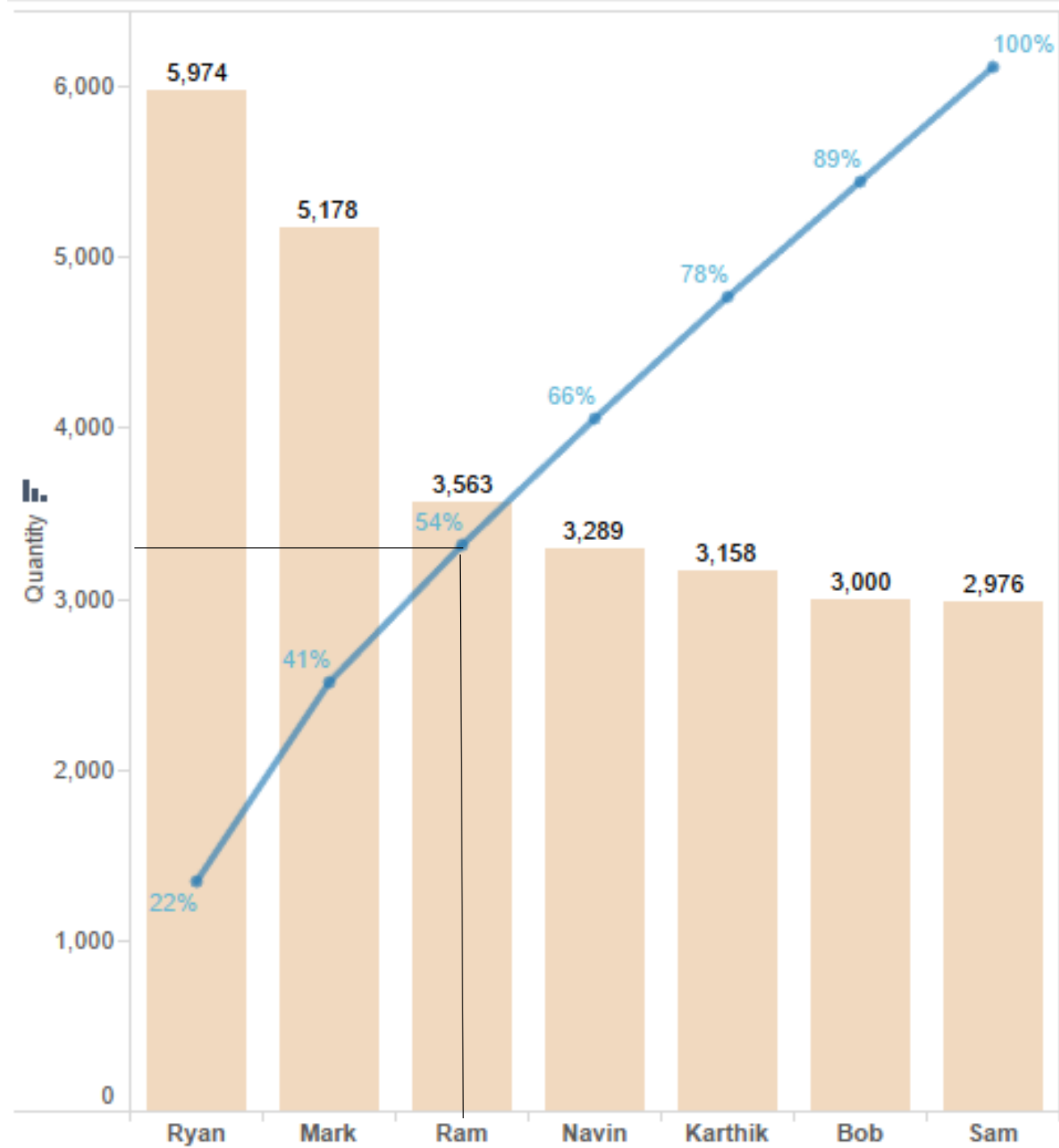
Rifles | Pistols | Shotguns | Revolvers

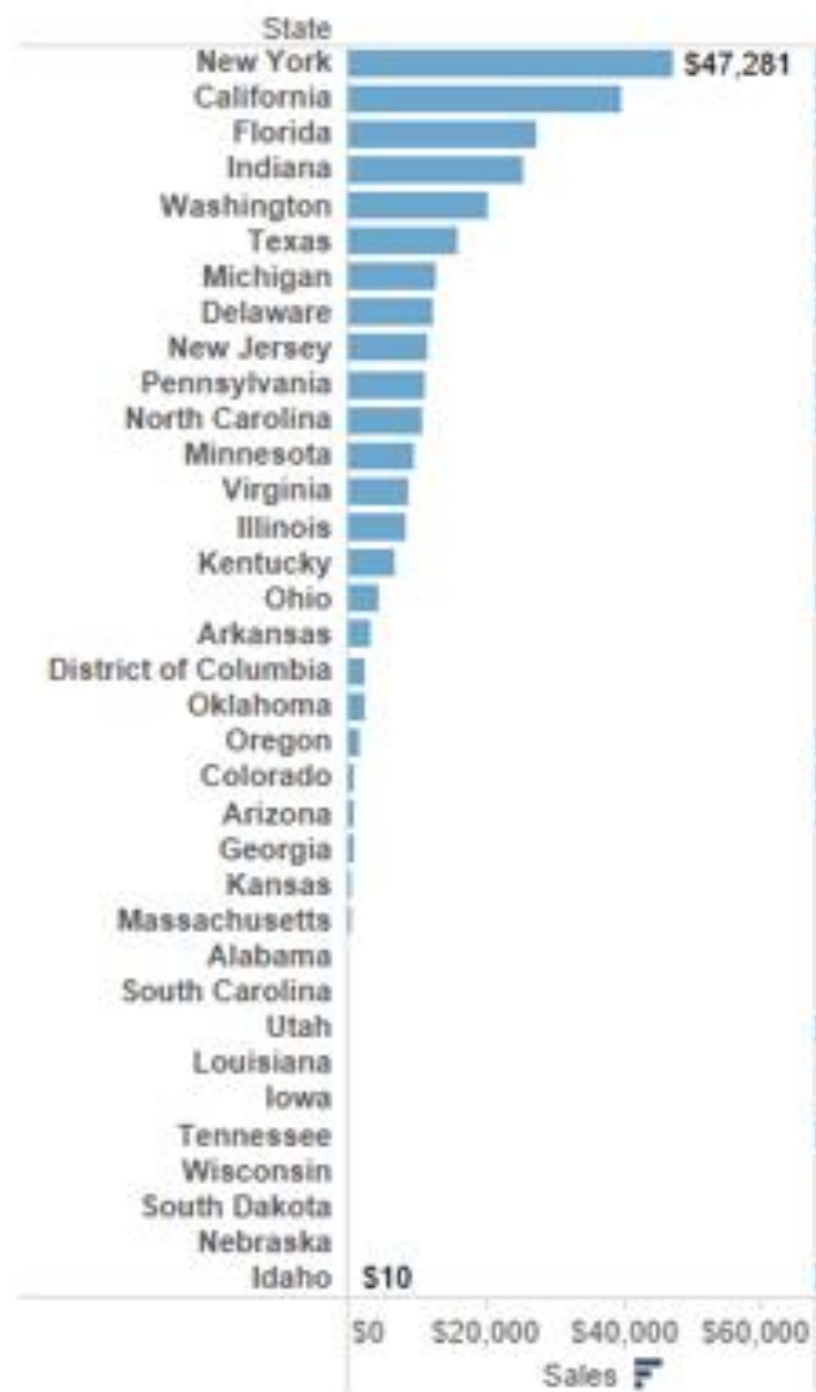


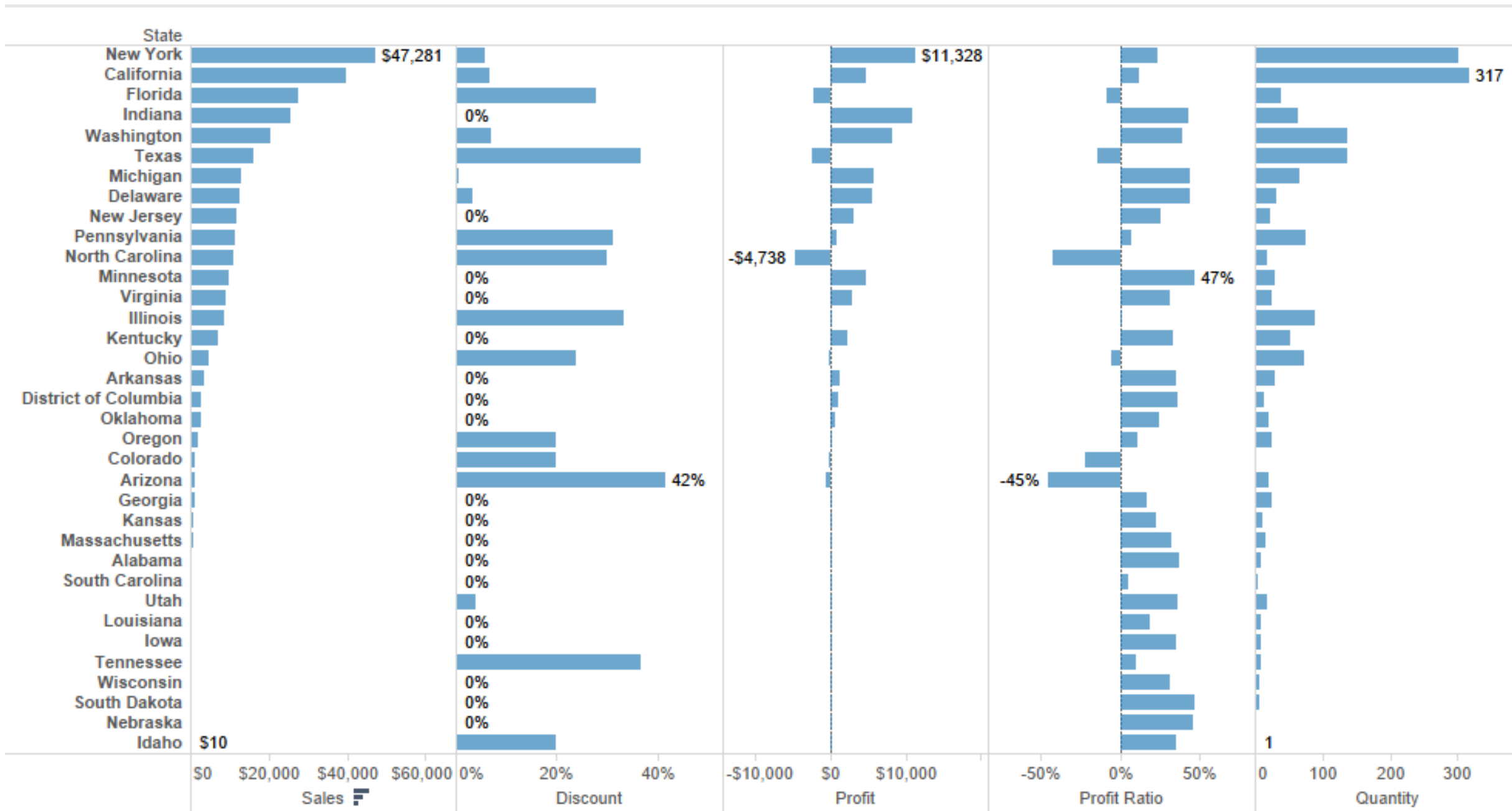


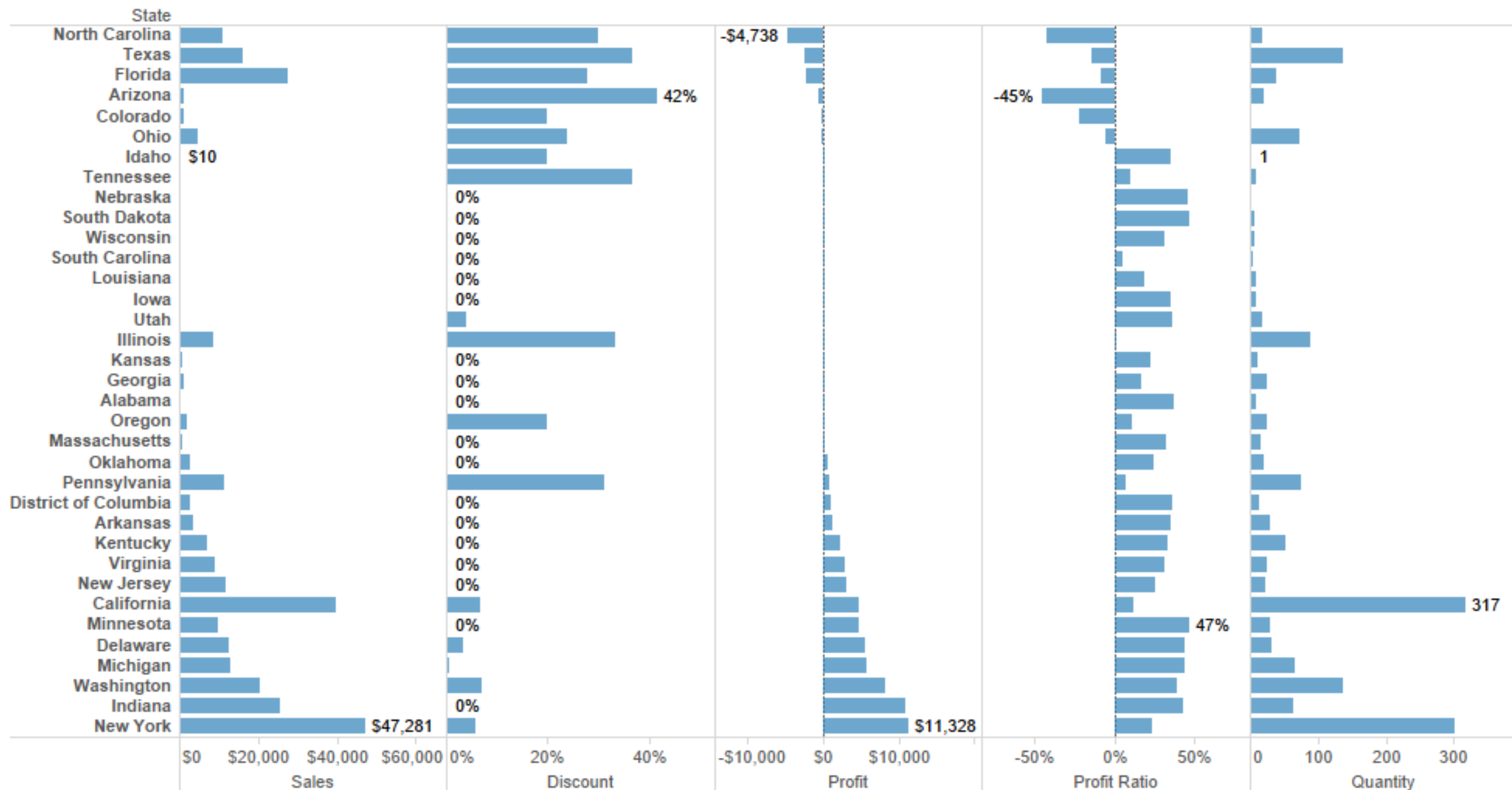
**Q1 2003 Planned vs. Actual Sales by Region**

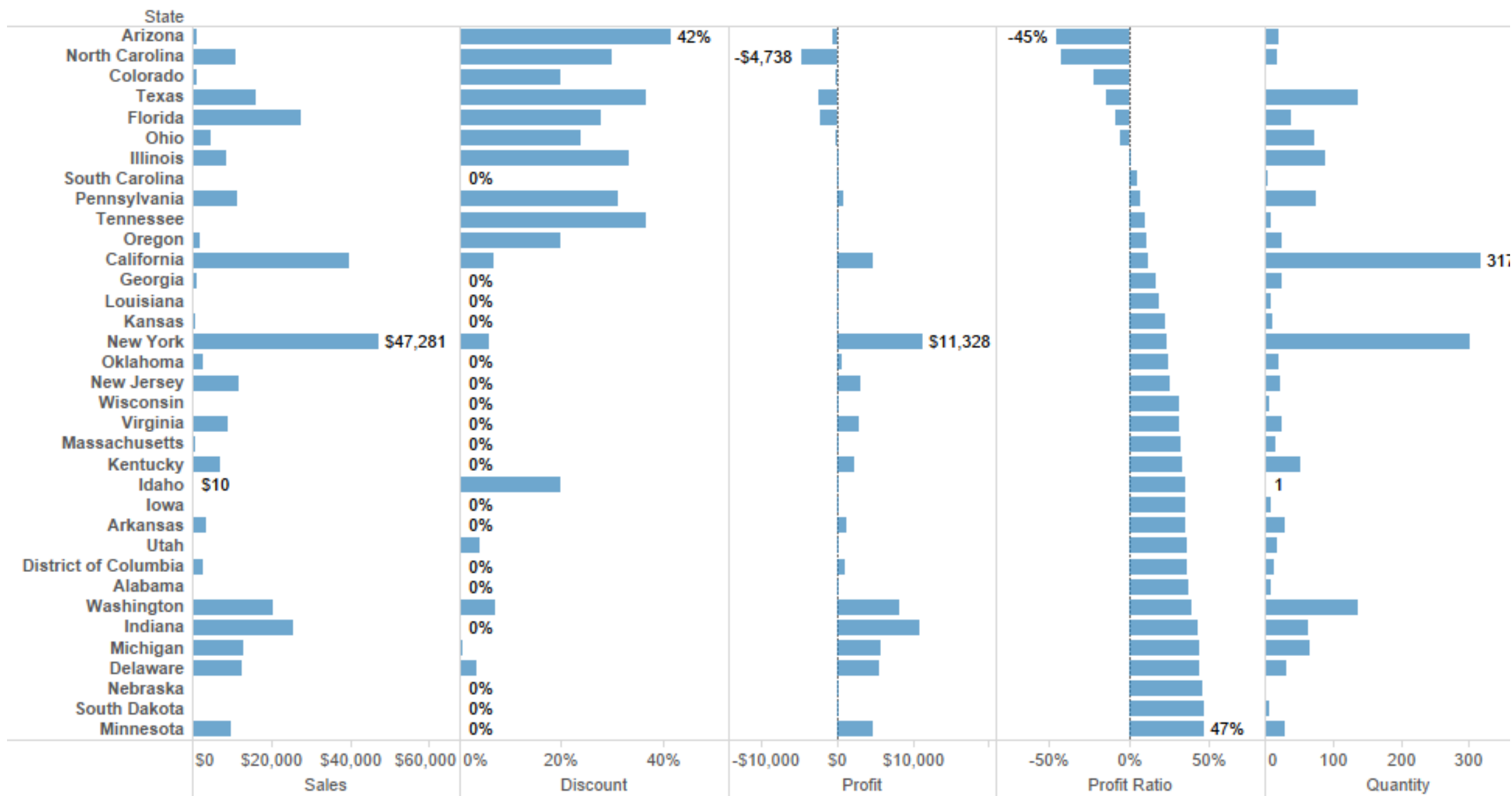










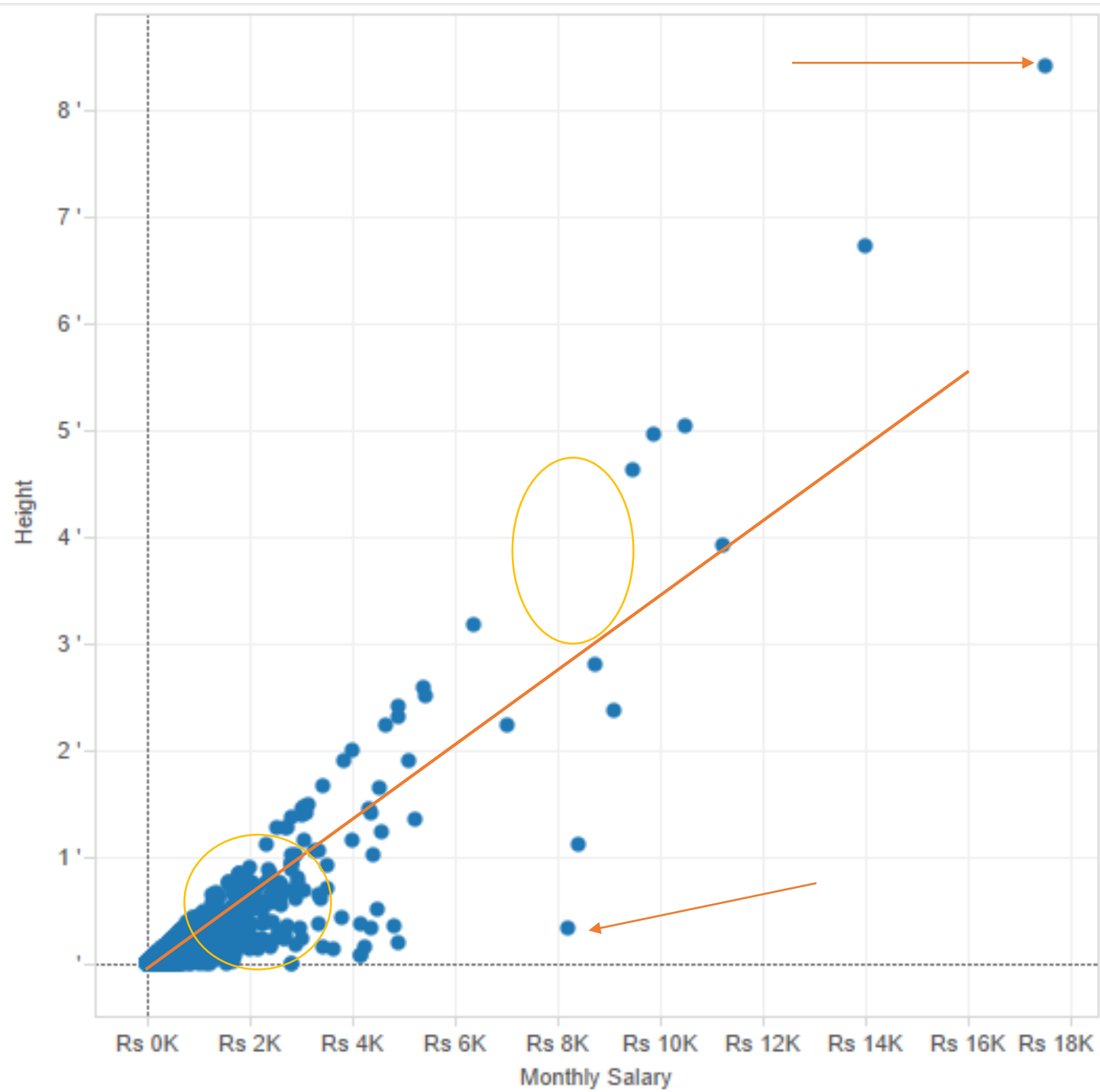


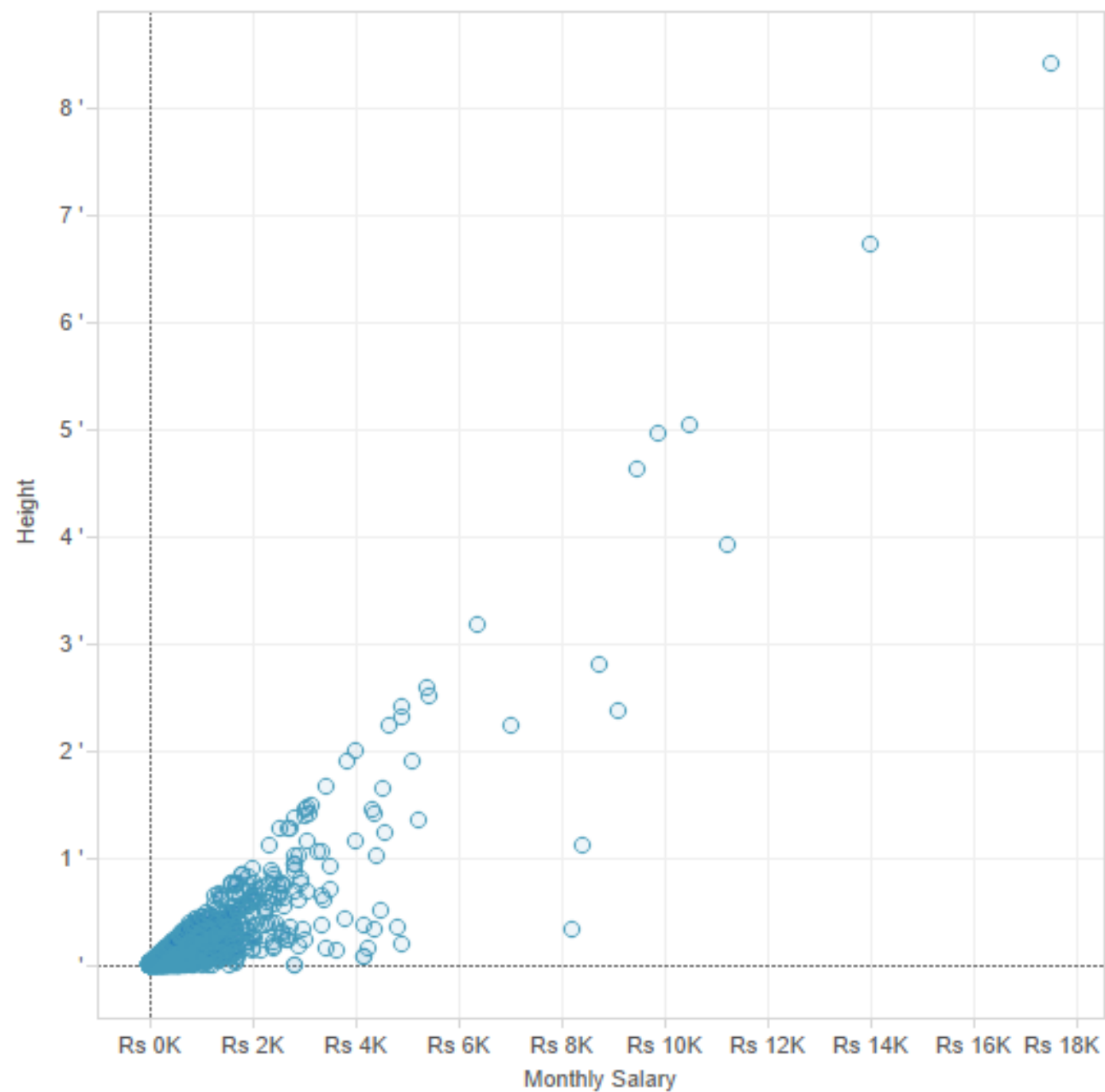
# Bars

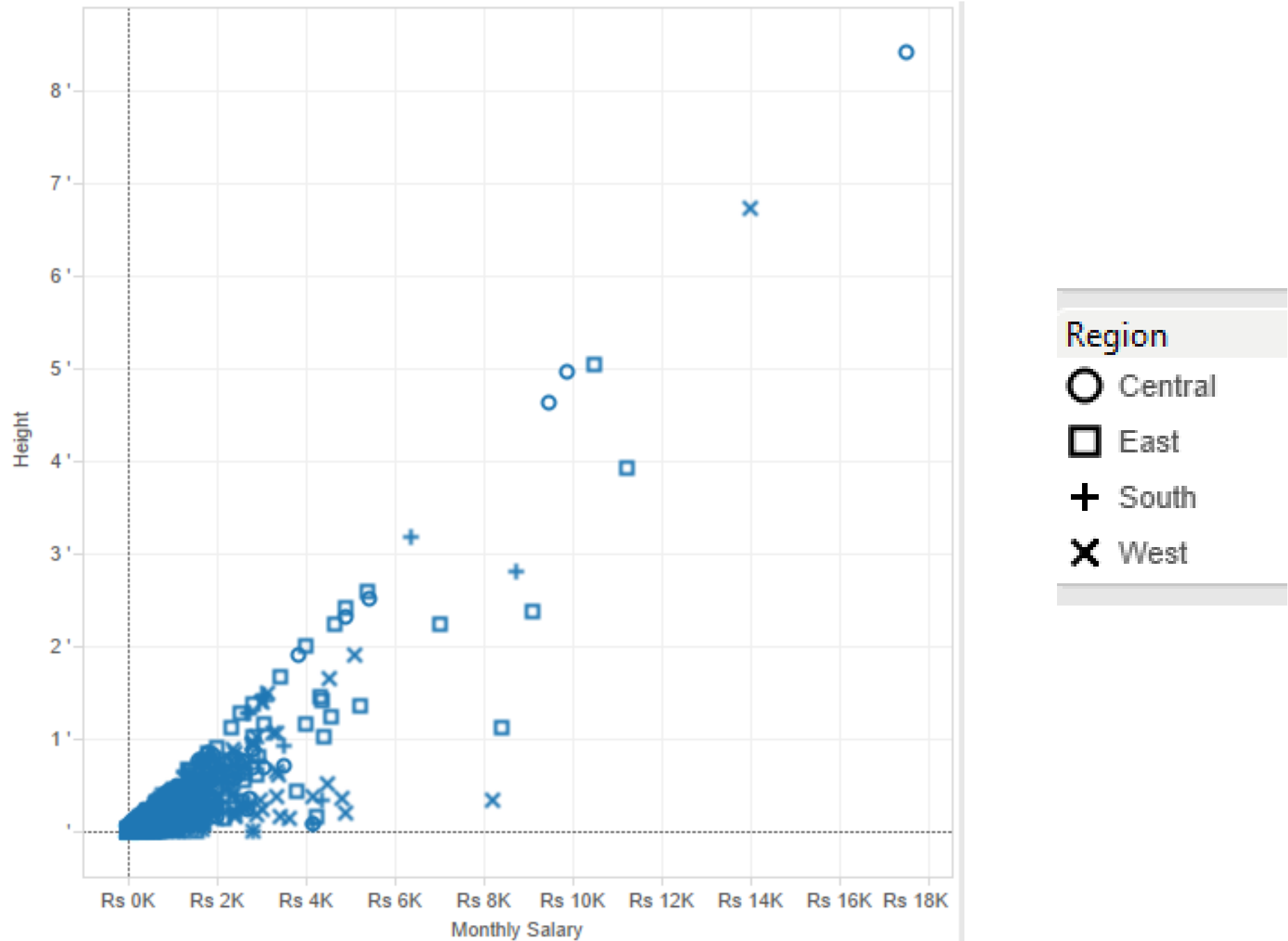
- Compare
- Category
- Rank
- High/Lows
- Correlation
- Part to Whole

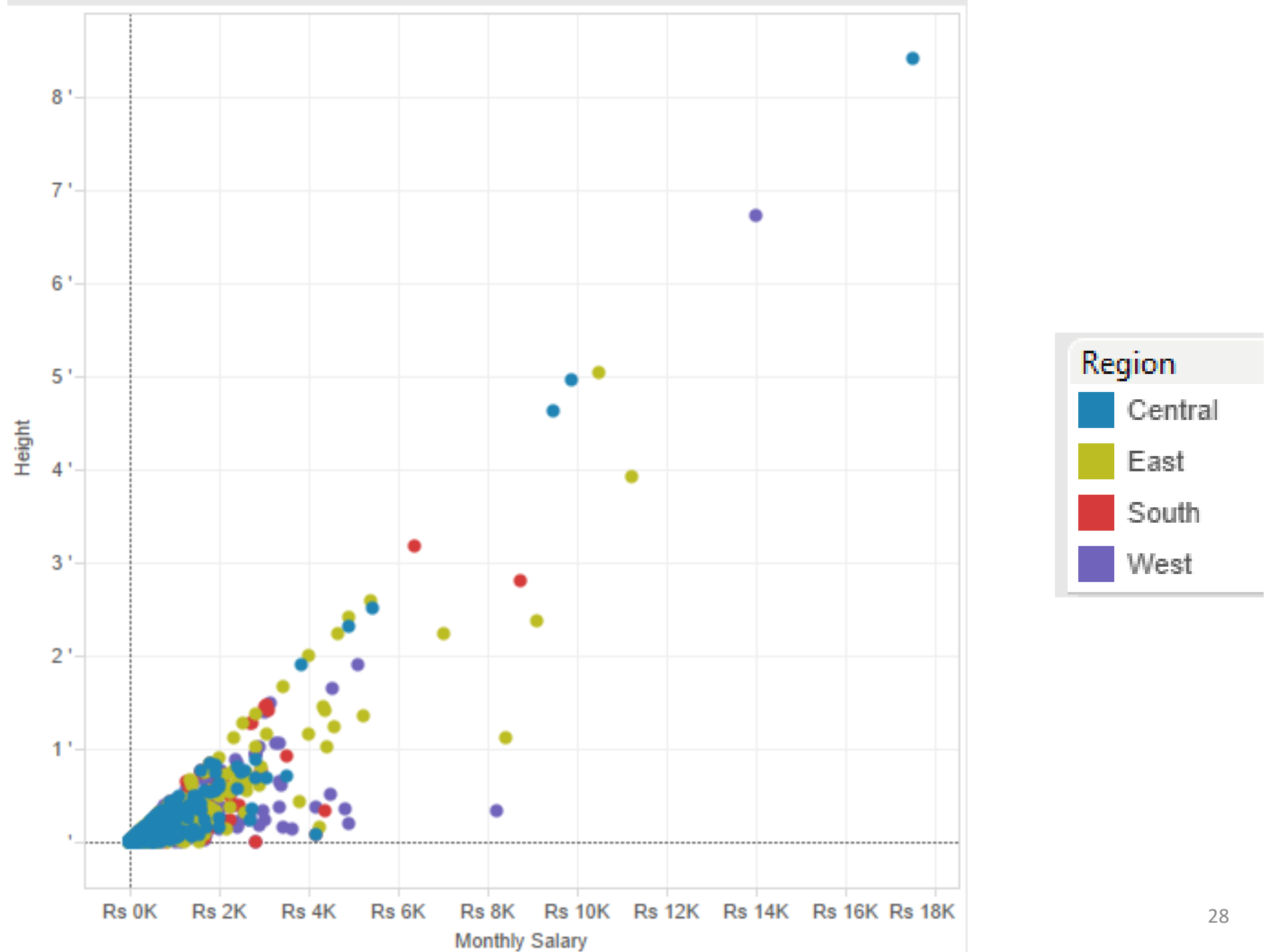
One Measure + One Measure

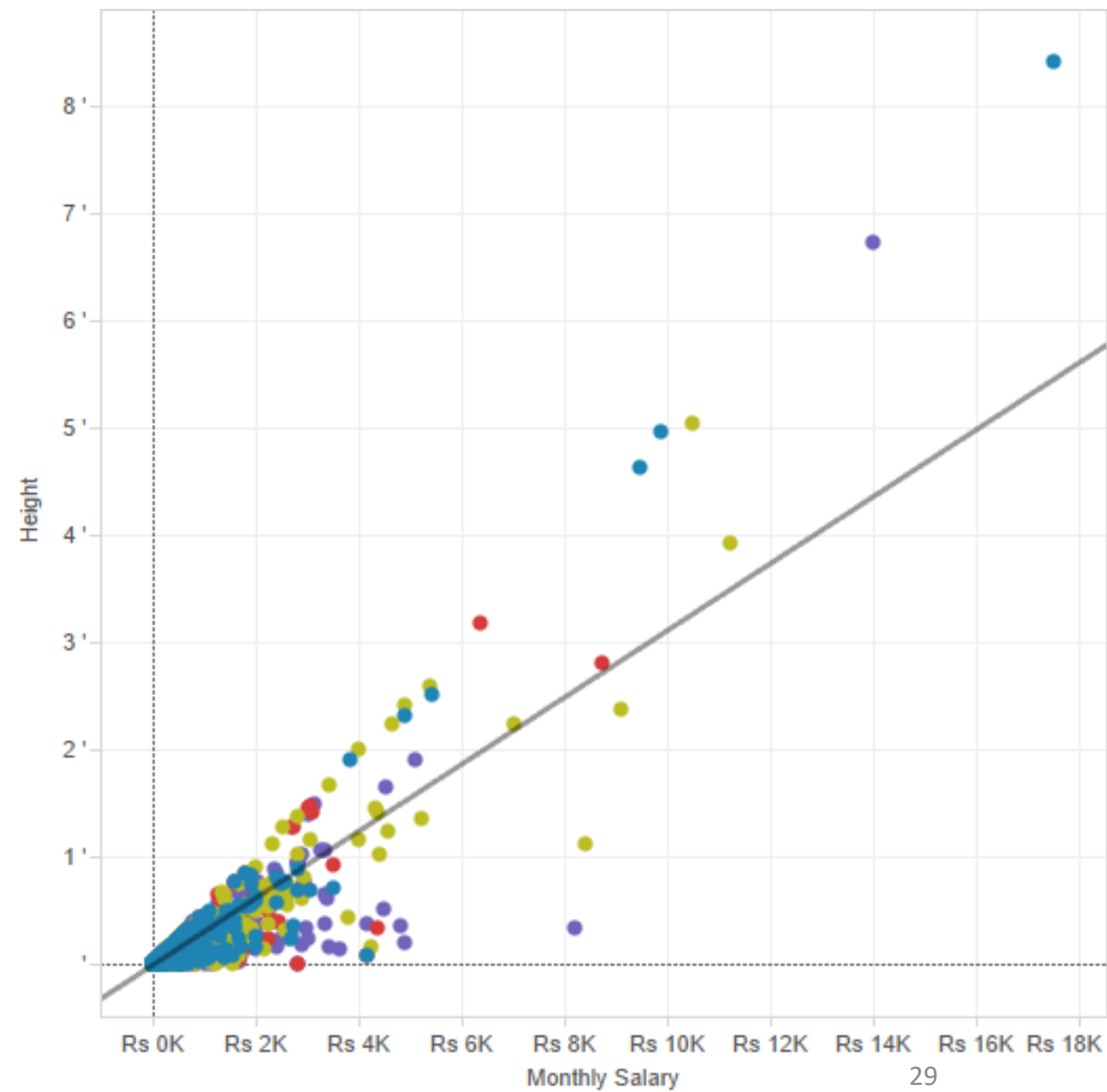
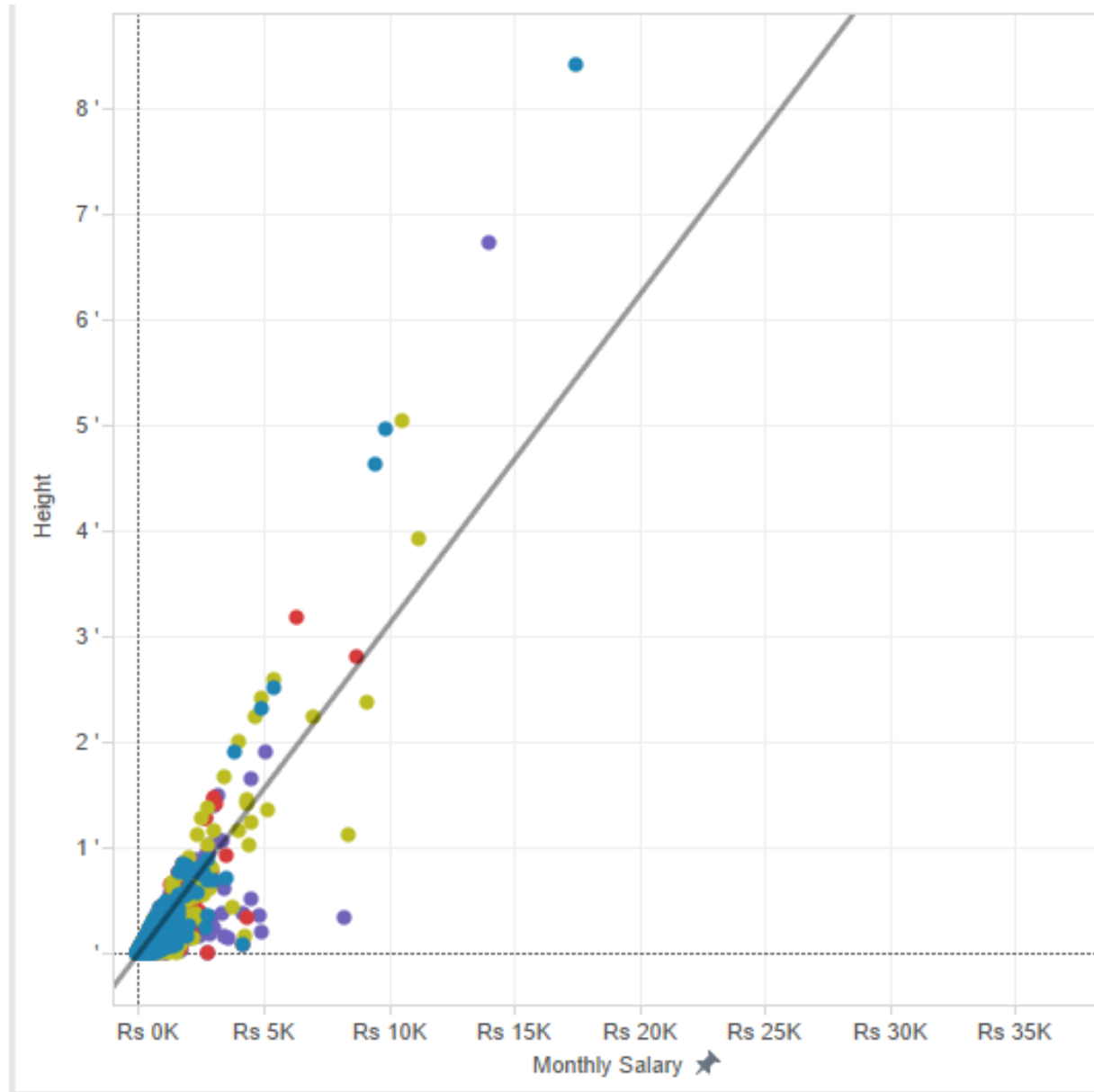








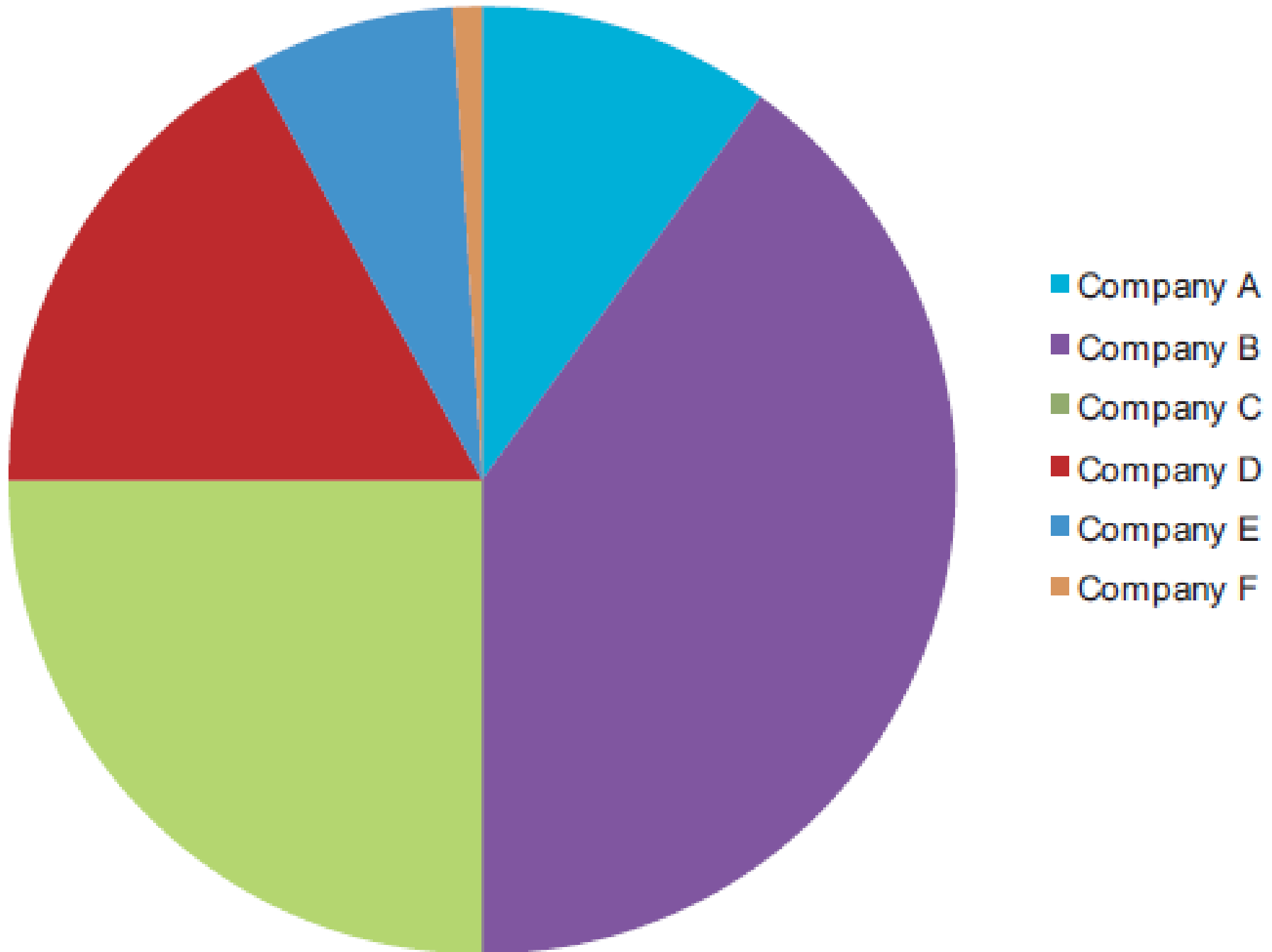




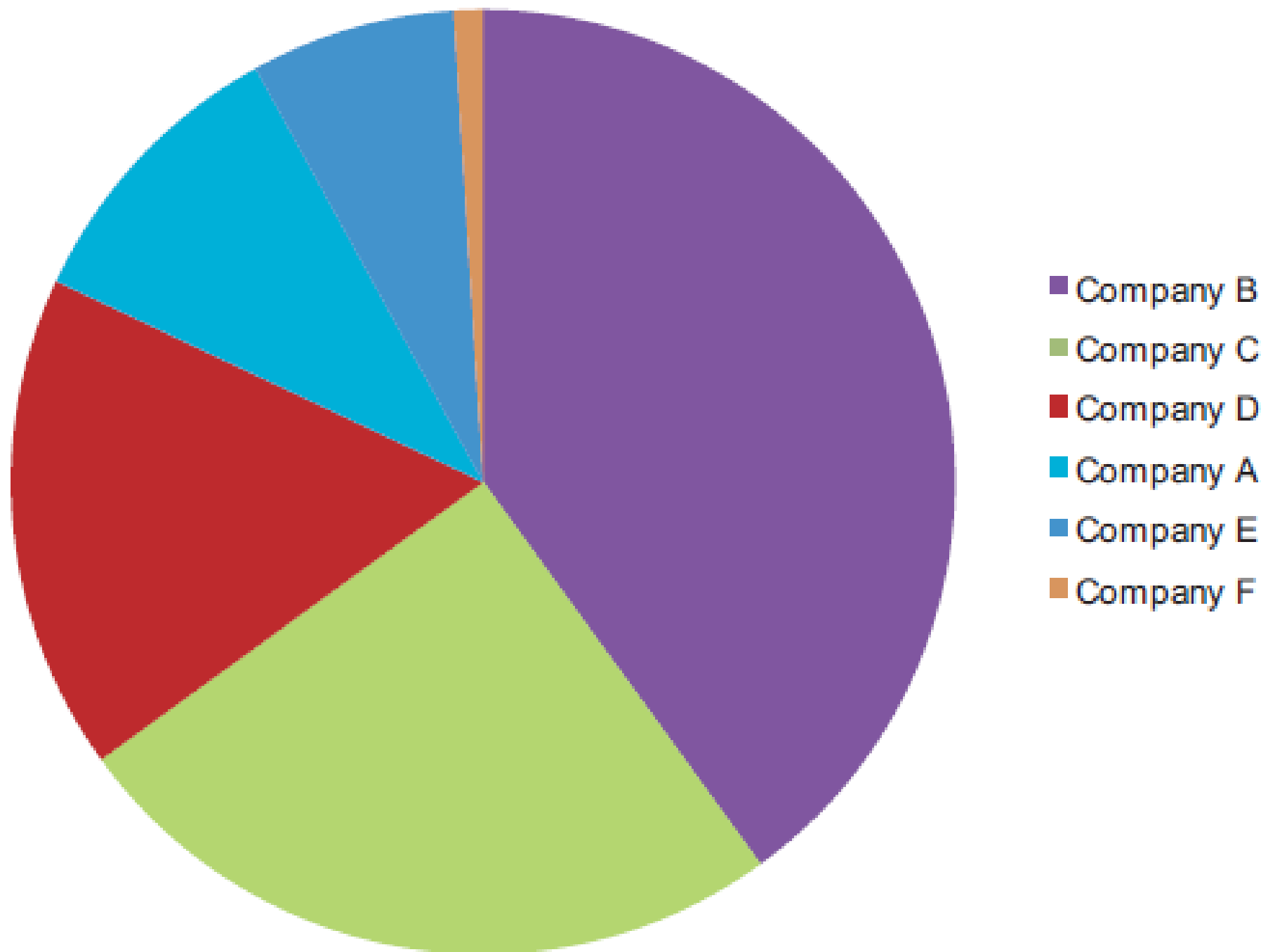
# ScatterPlot

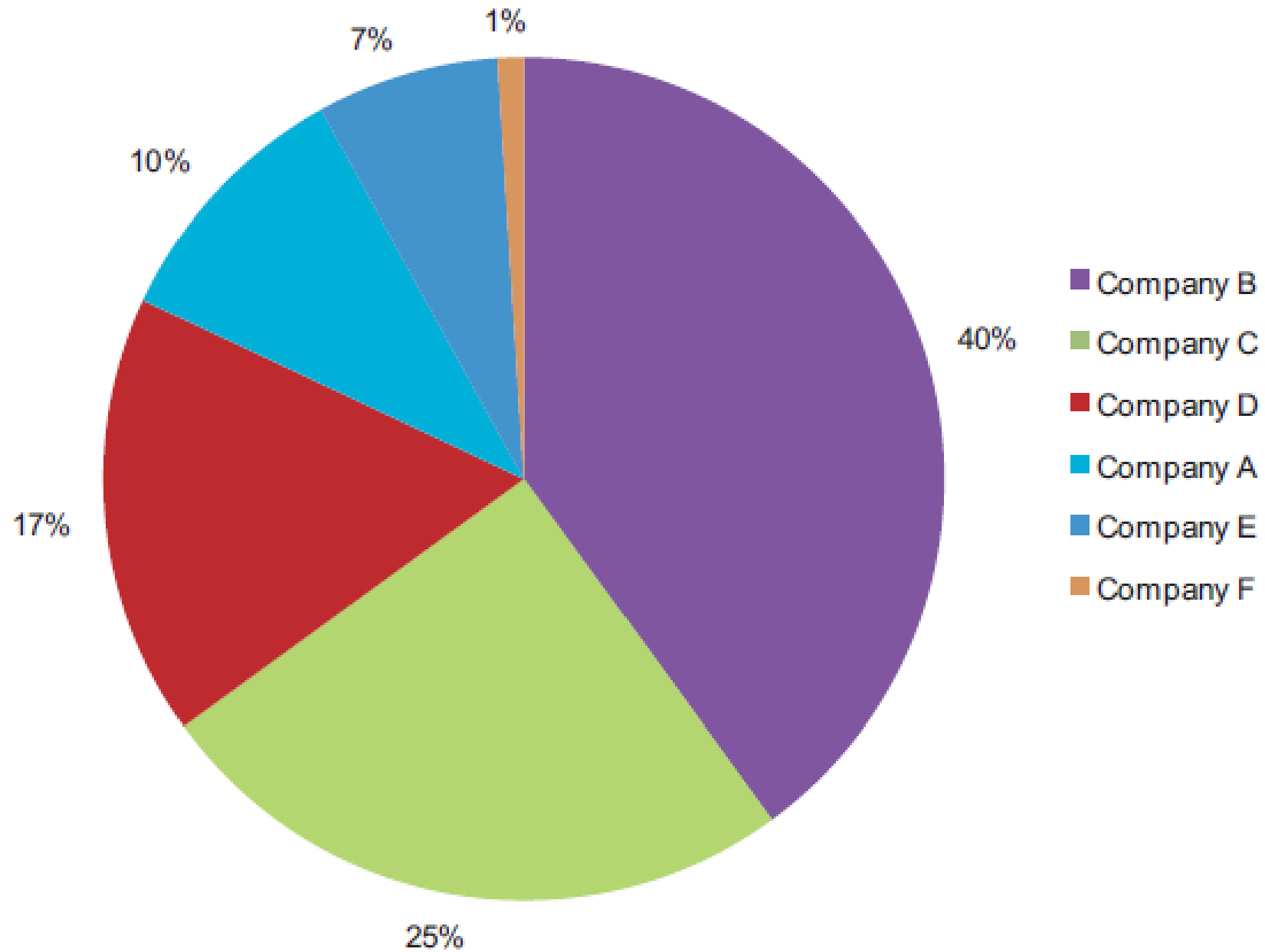
- Trend
- Concentrations
- Gaps
- Outliers
- Groups/Clusters
- Relationship

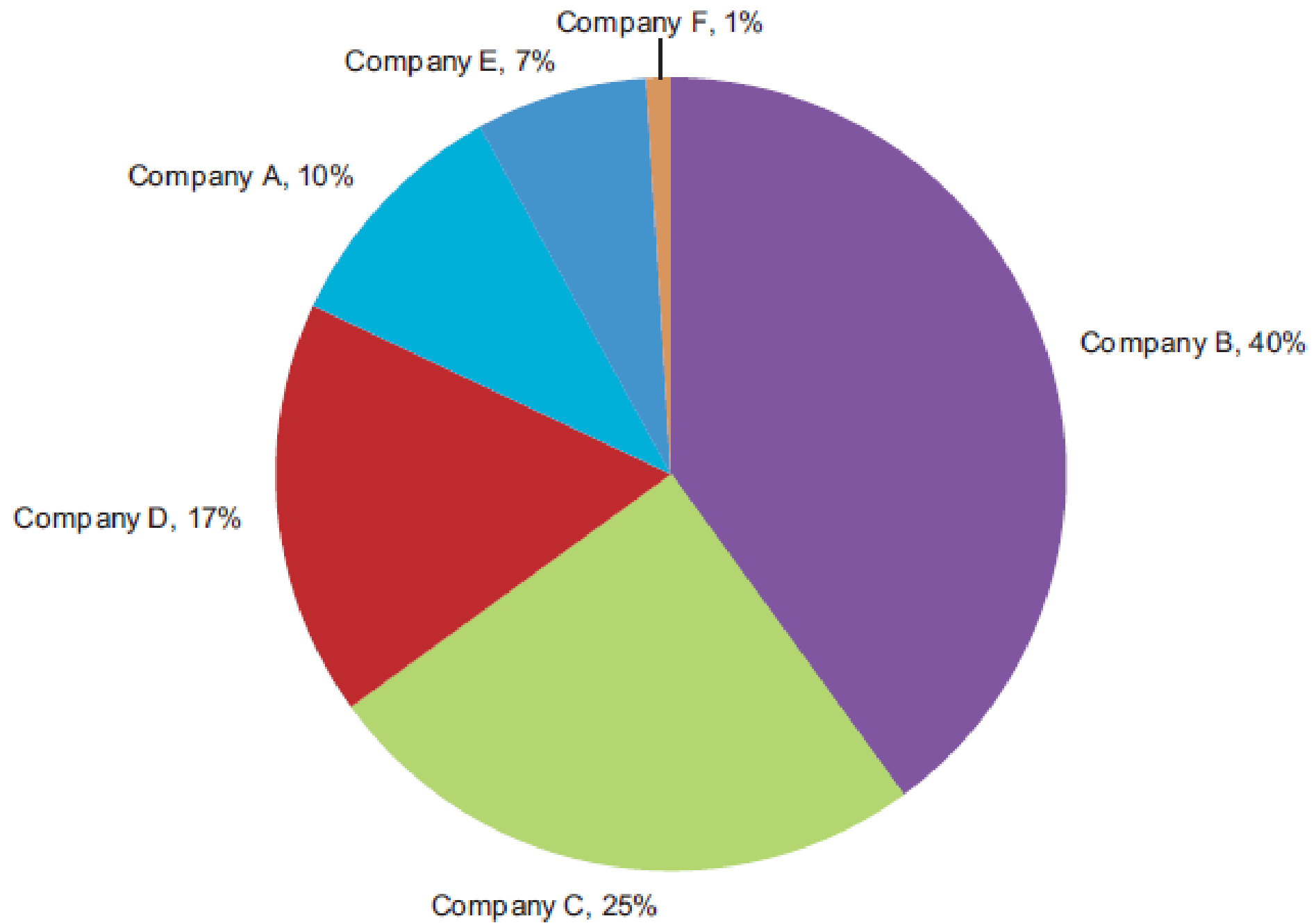




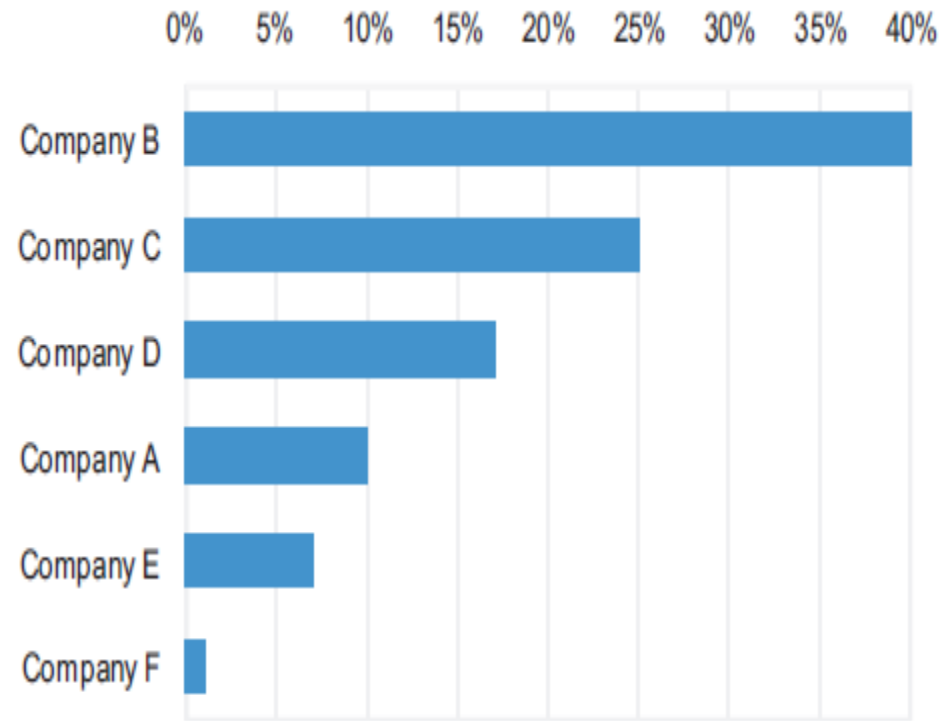
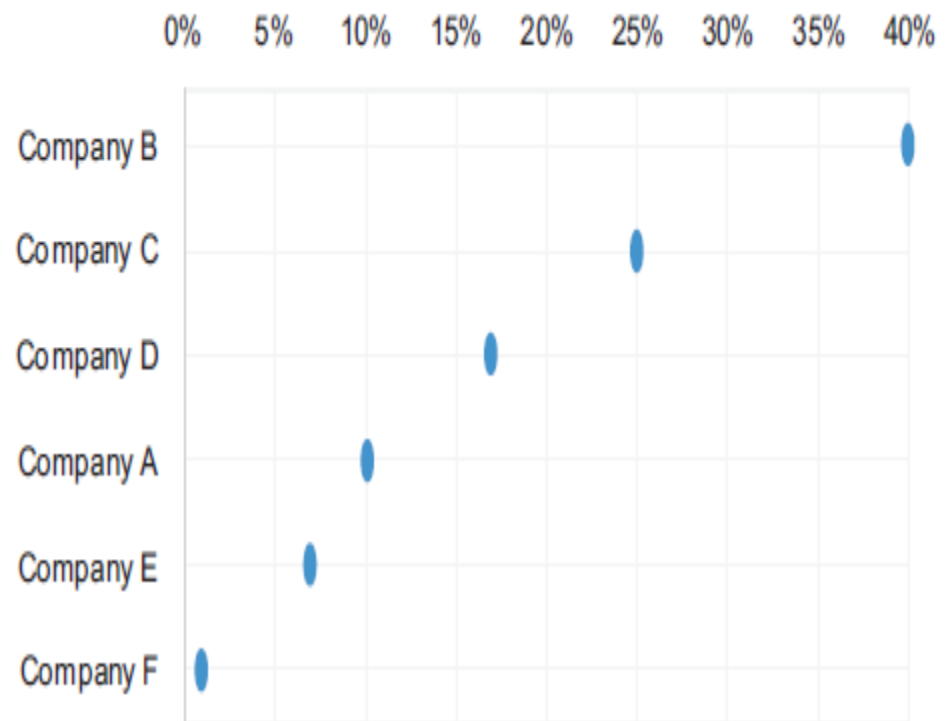


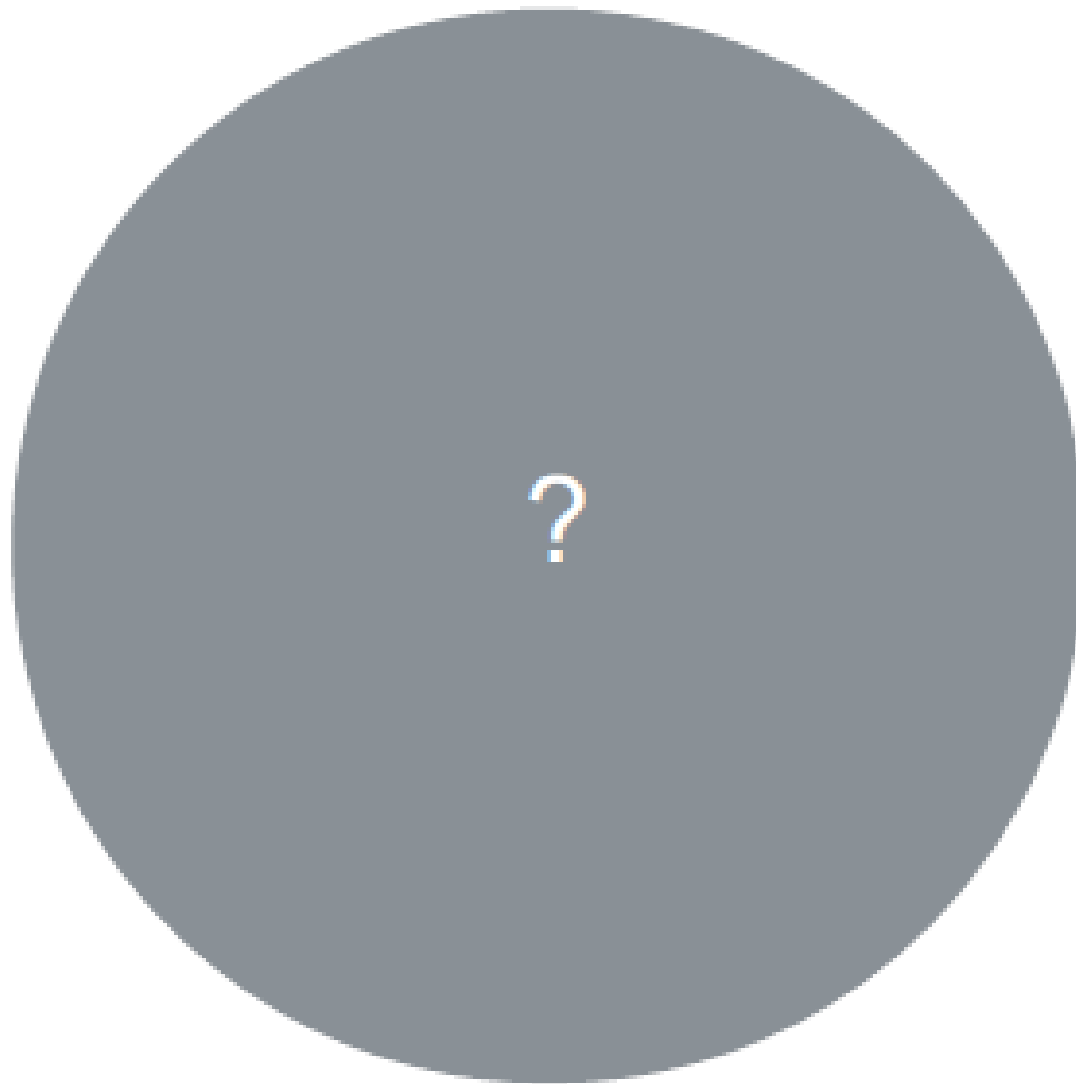




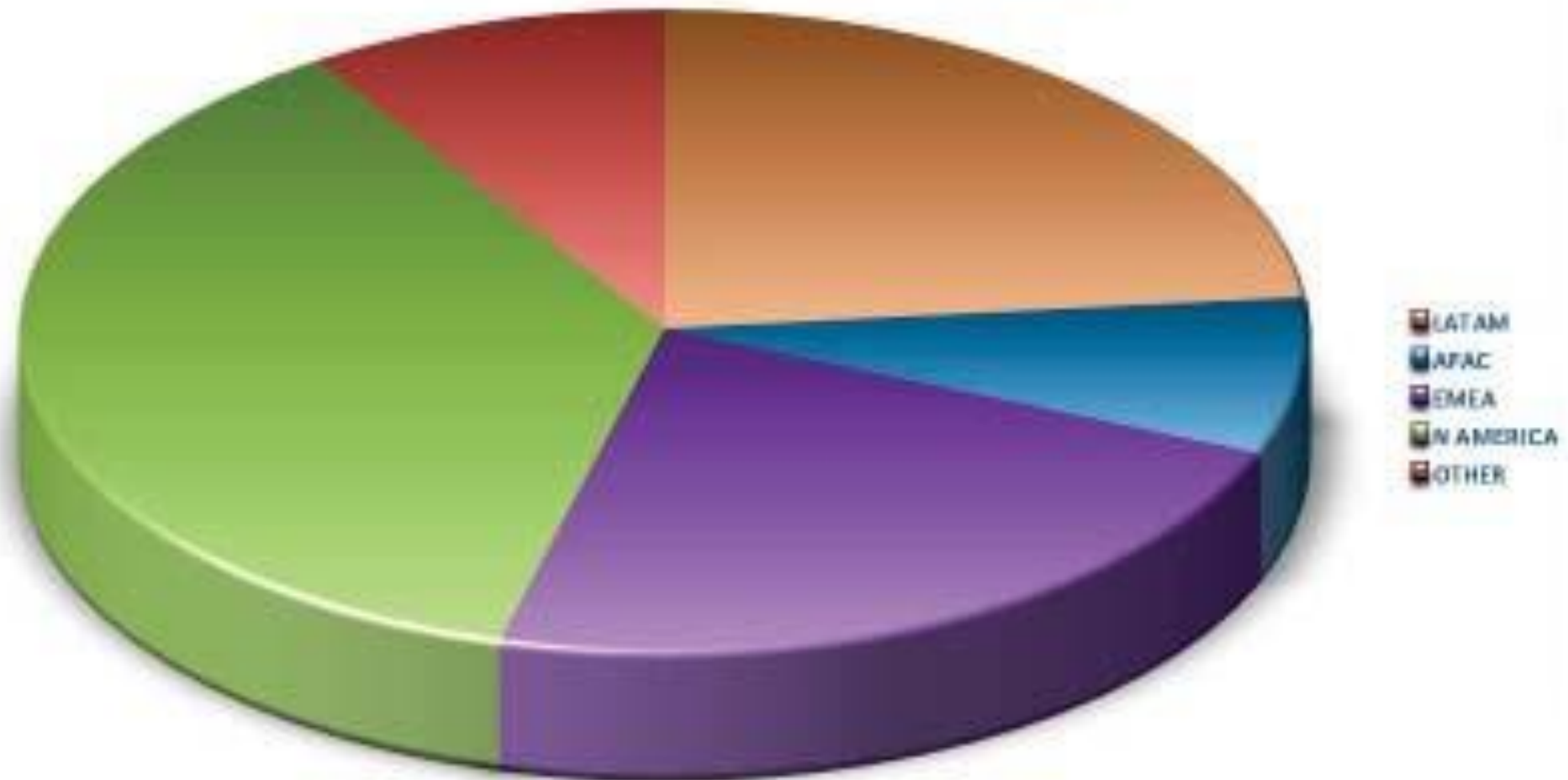


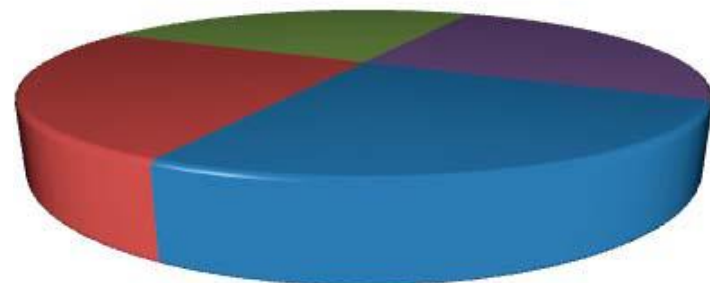
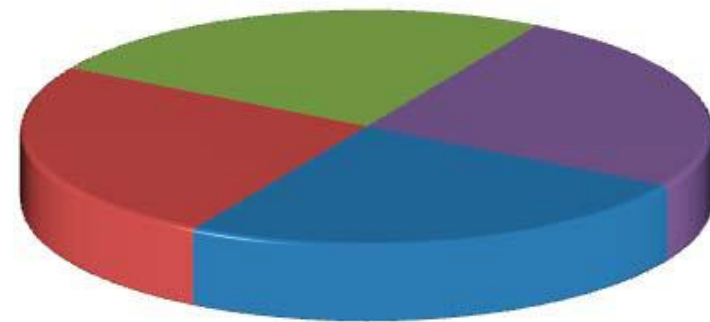
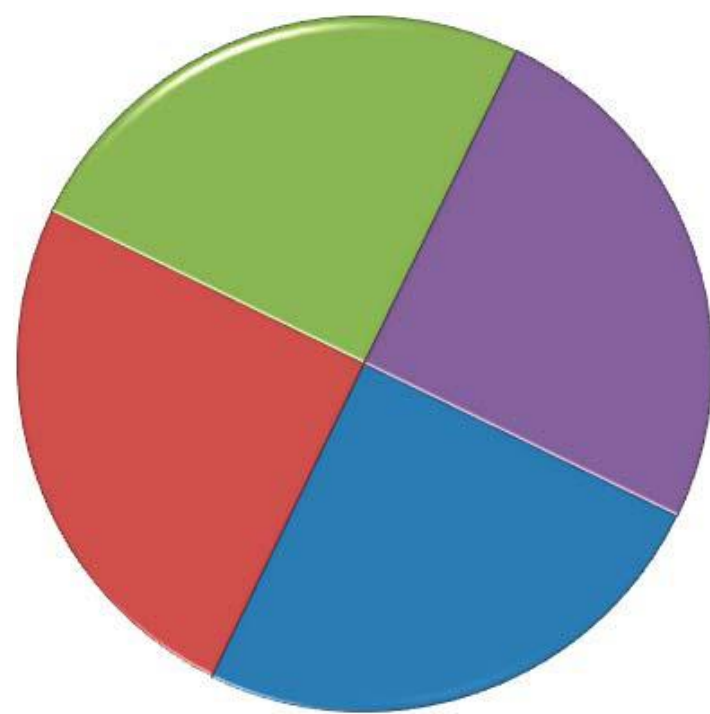
Companies	Percentage
Company B	40%
Company C	25%
Company D	17%
Company A	10%
Company E	7%
Company F	1%
Total	100%



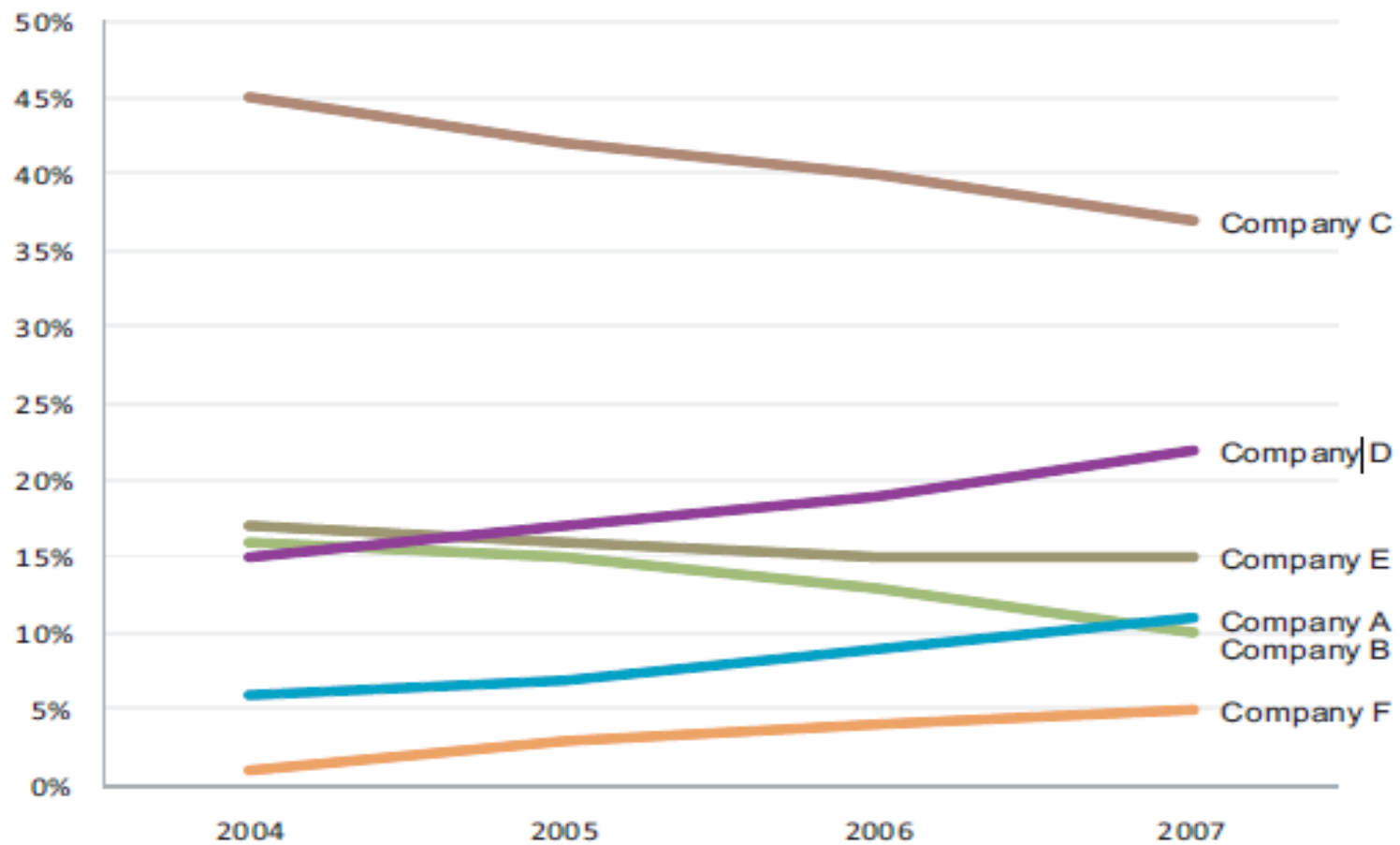
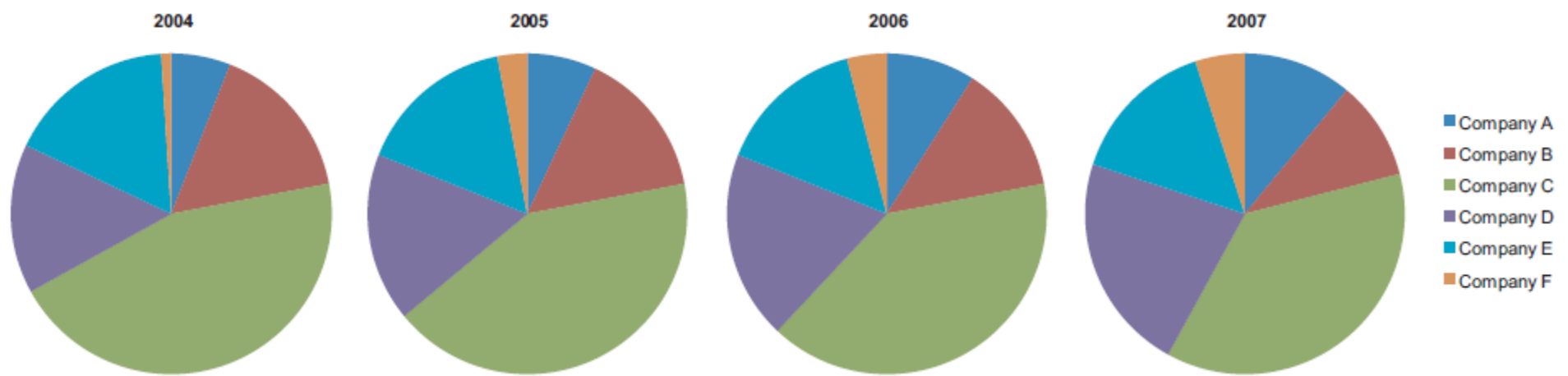


Evidence Break Out By Geography

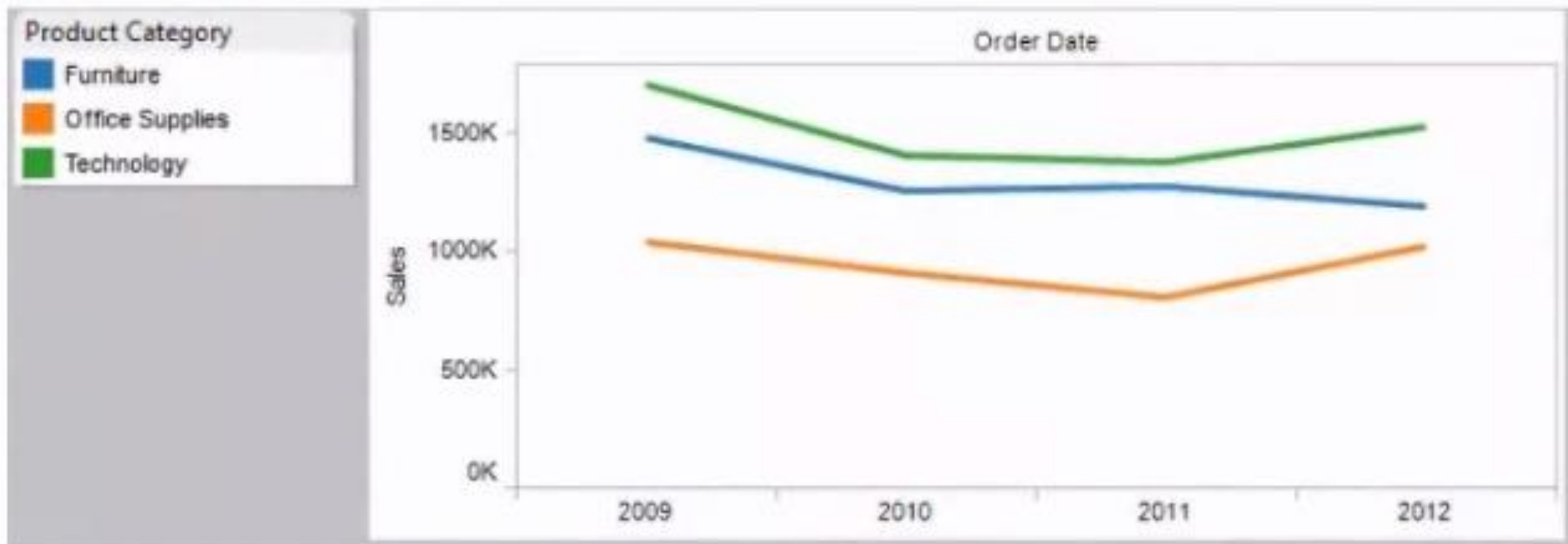


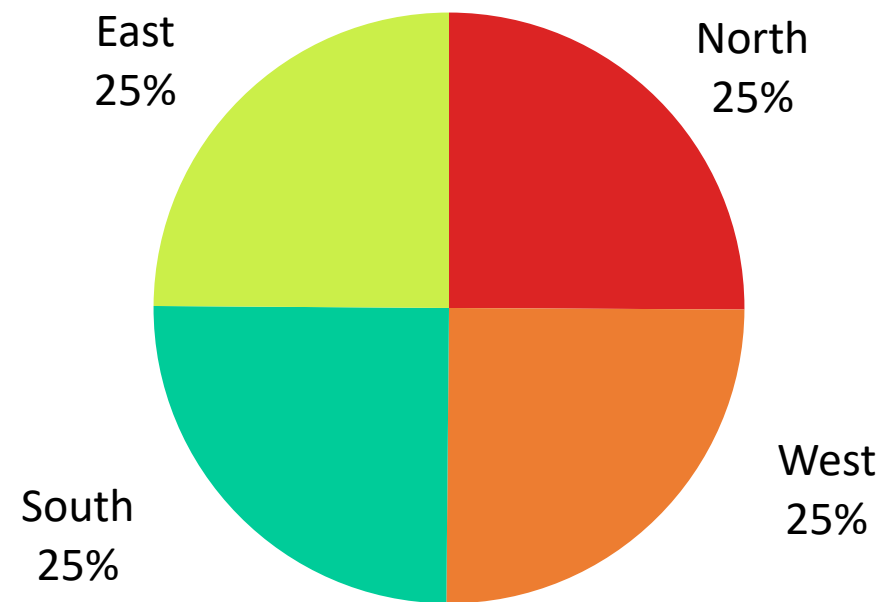


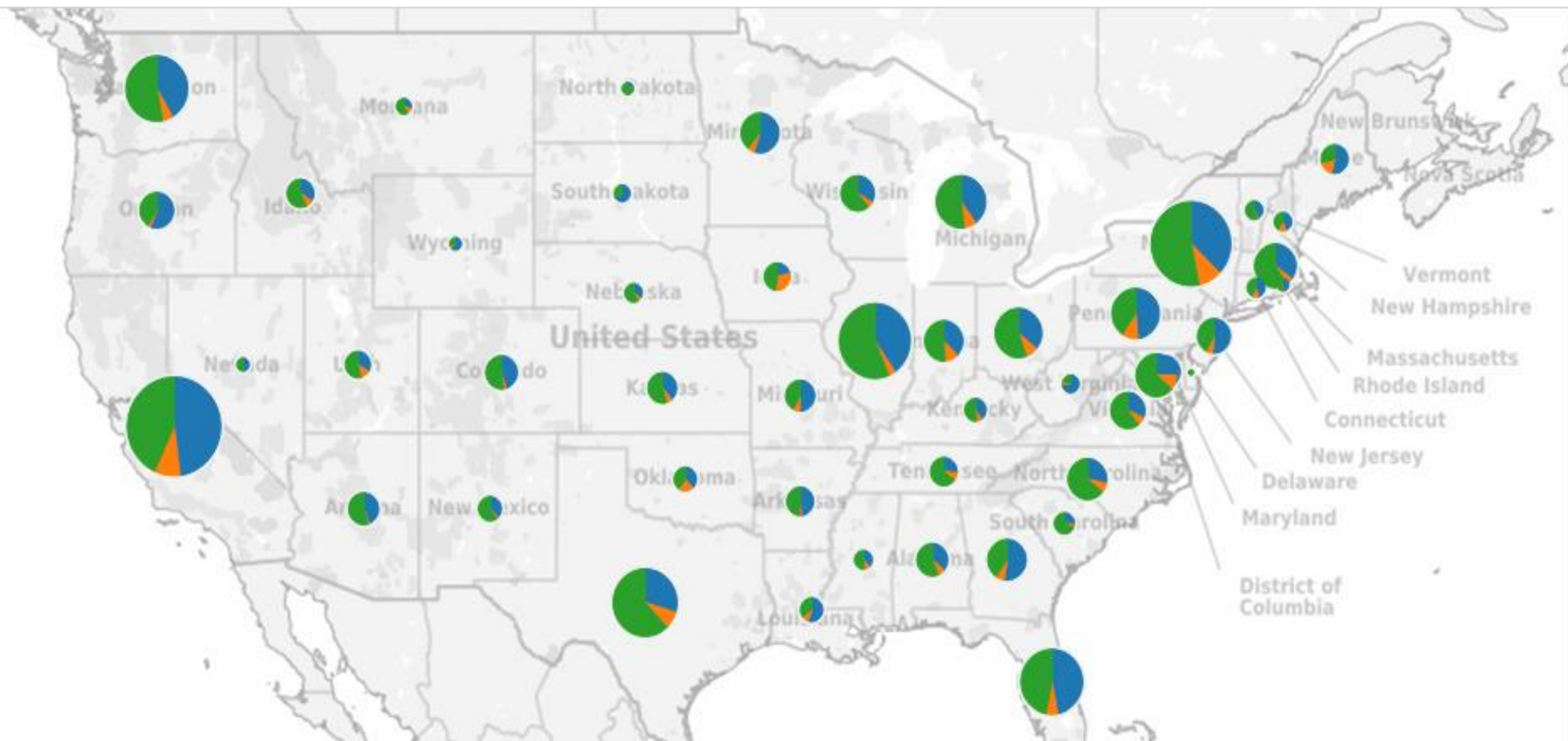


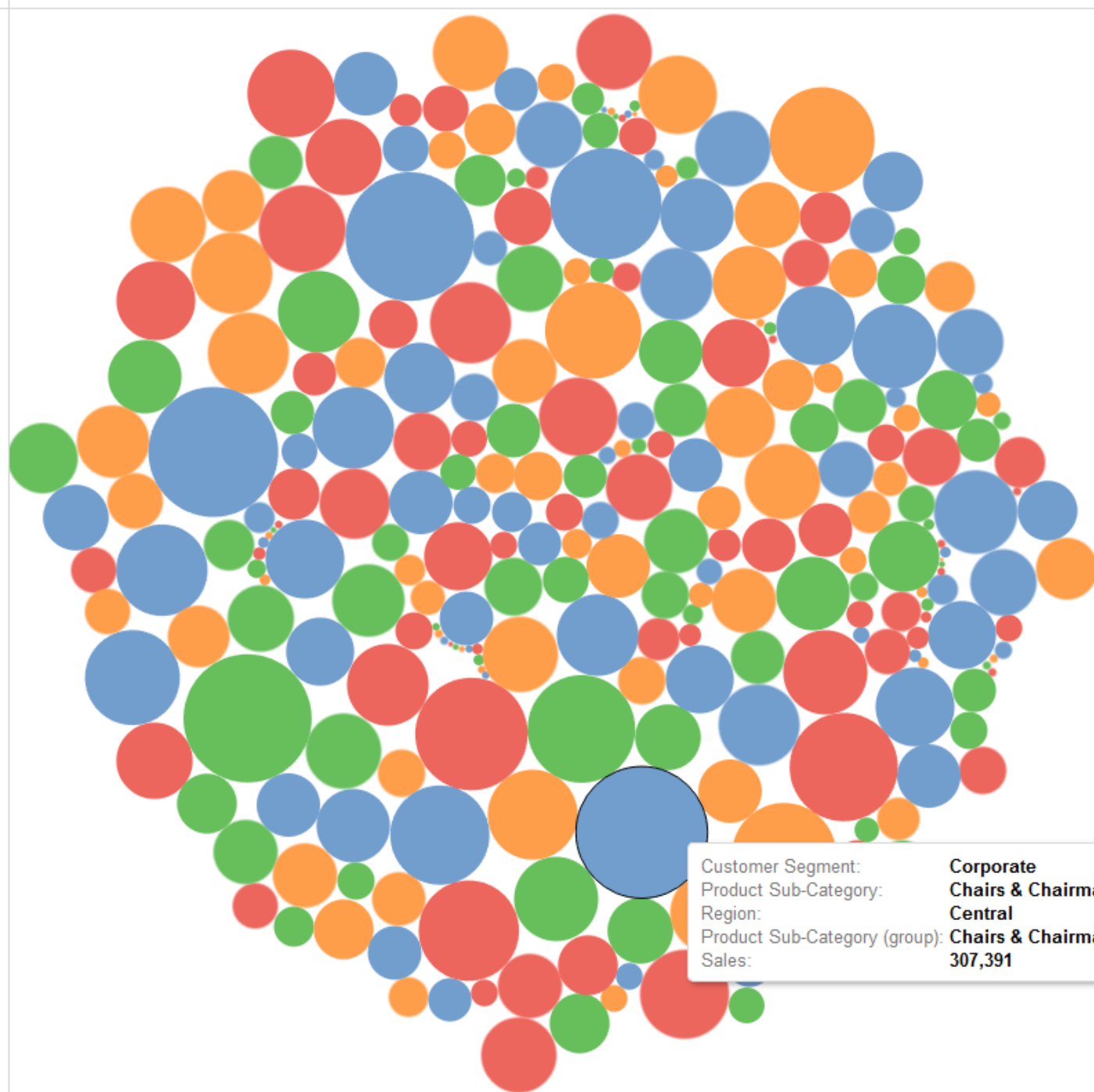












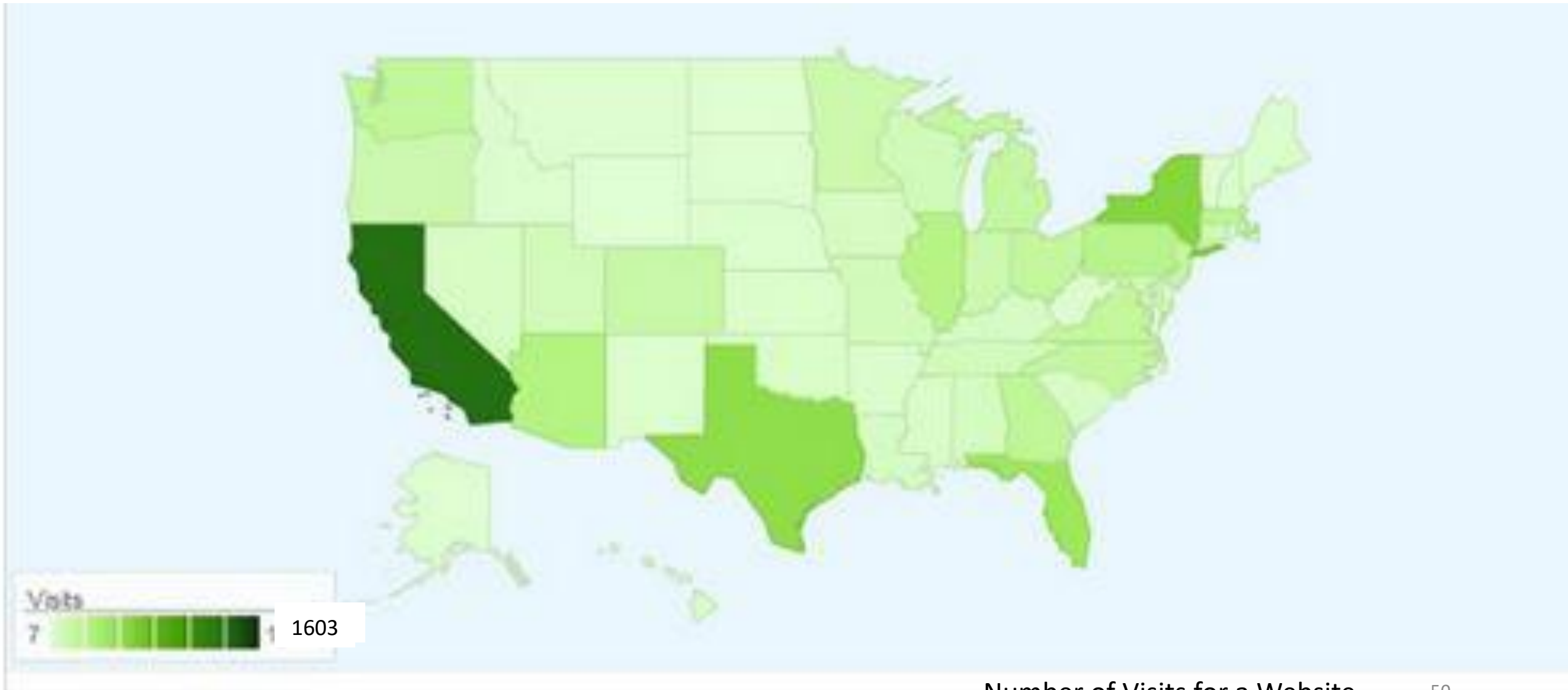
# Pie

- Part to Whole – Intuitive
- Angles not difficult to interpret
- Constrained for Space – Geospatial
- Large volume of data - Bubble

# Geo Spatial

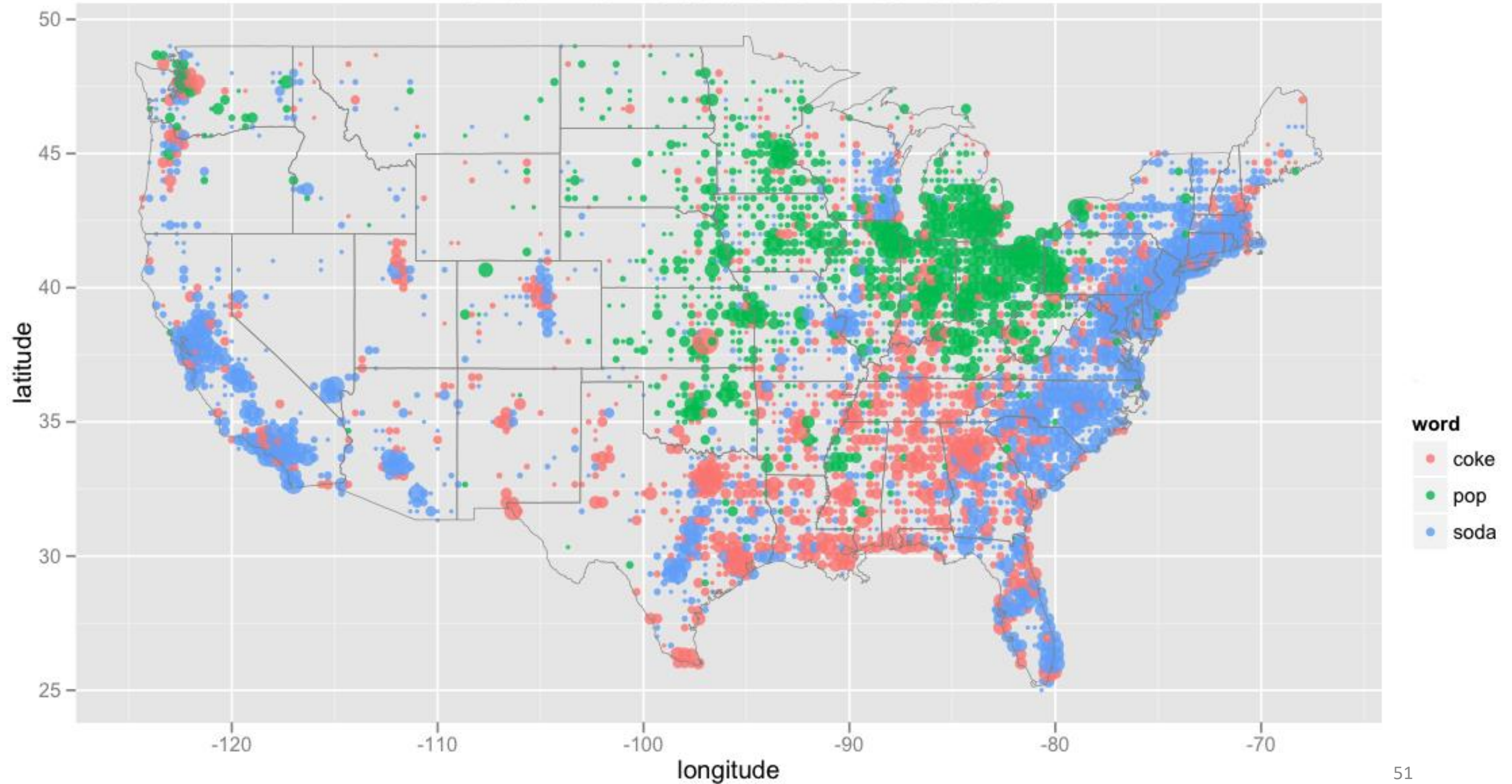






Number of Visits for a Website

## Soft drink terms across the United States



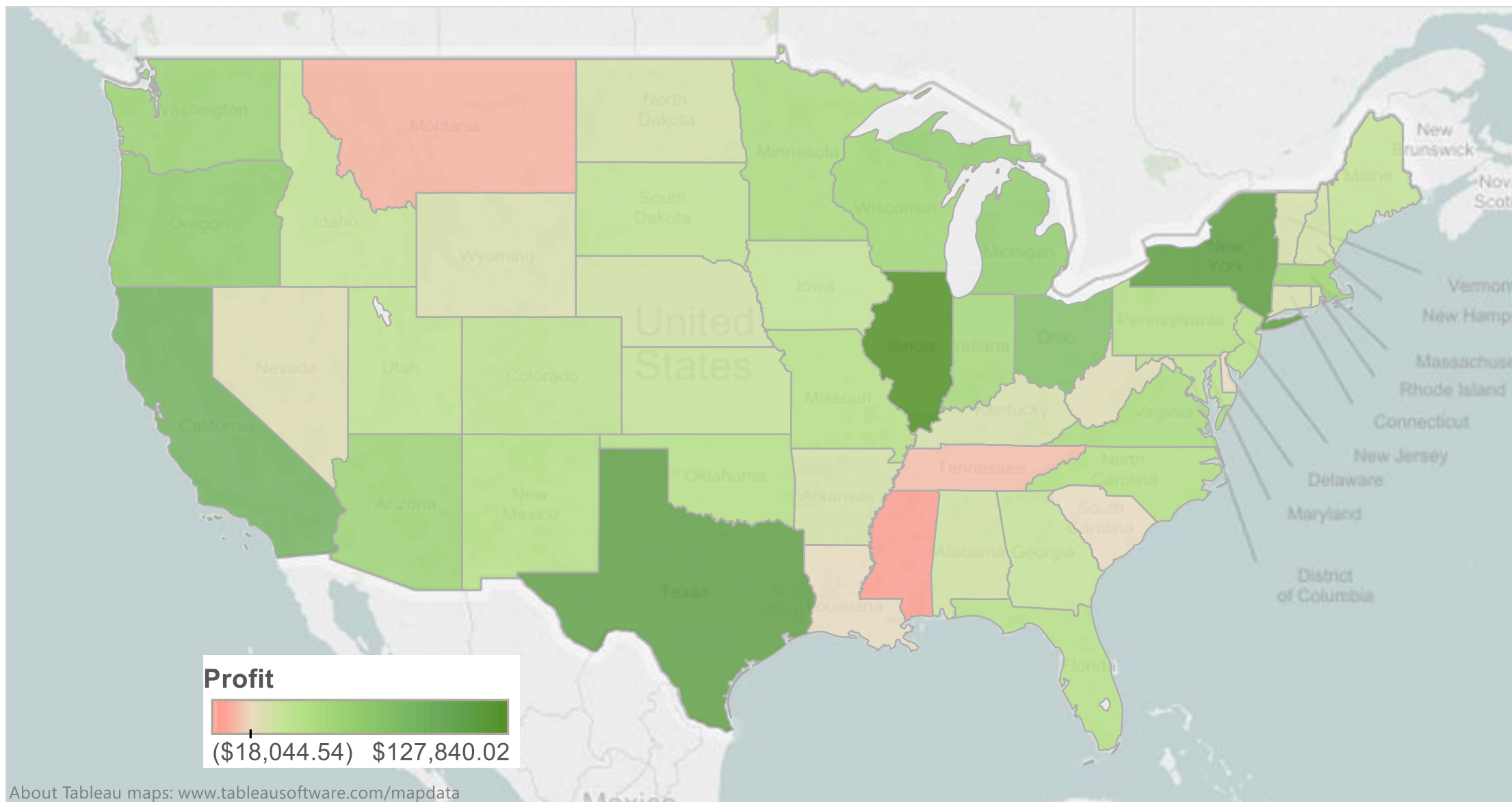
## Coverage of Telecom Service Providers

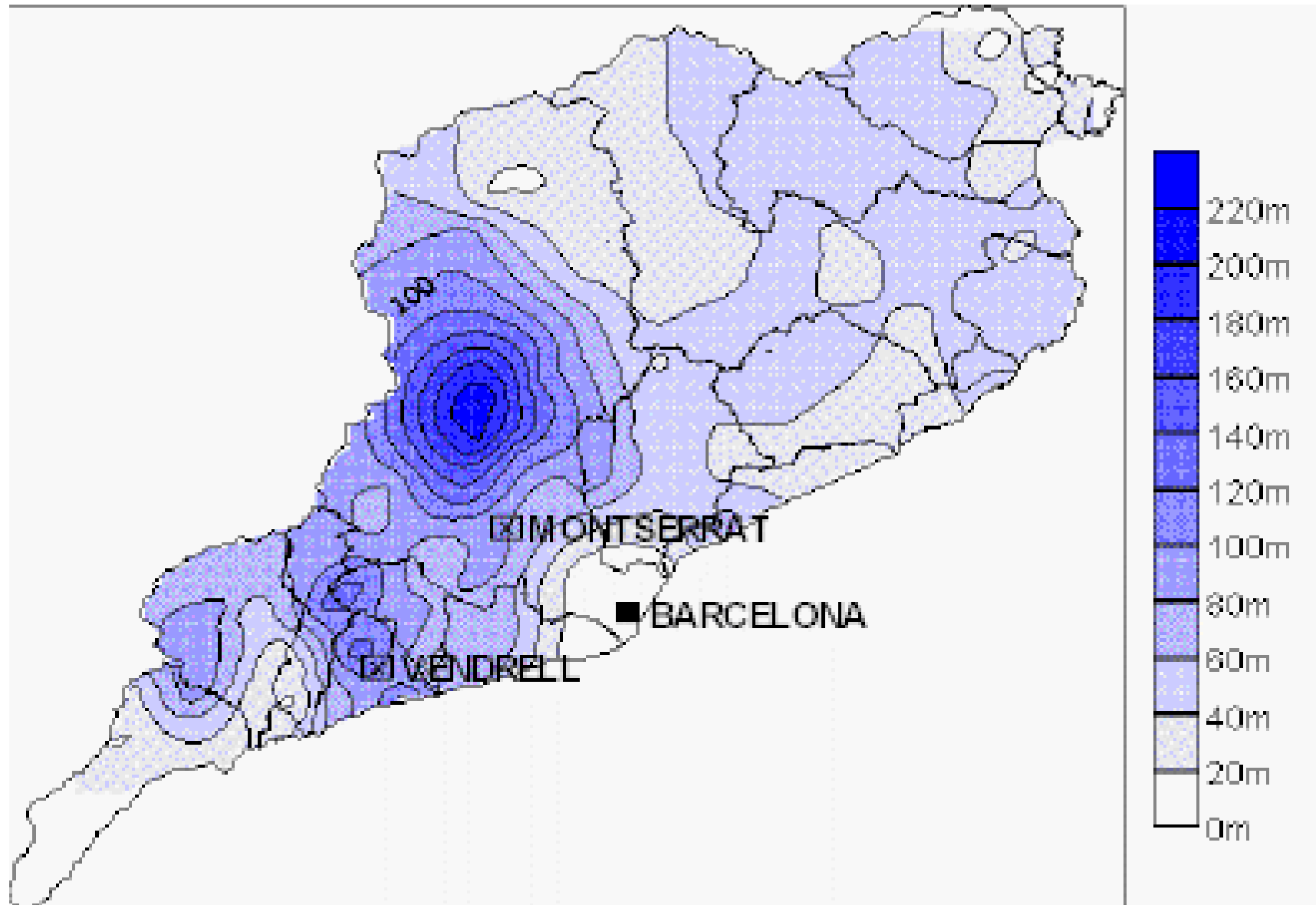




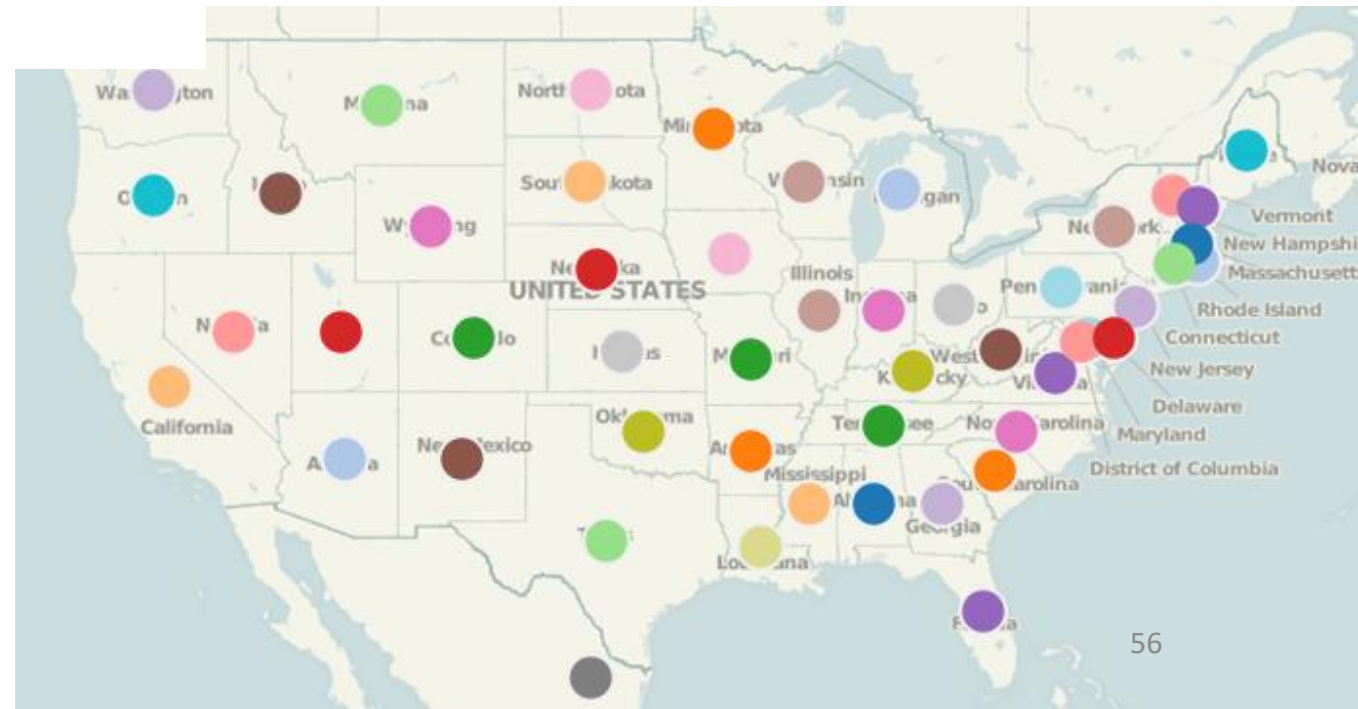
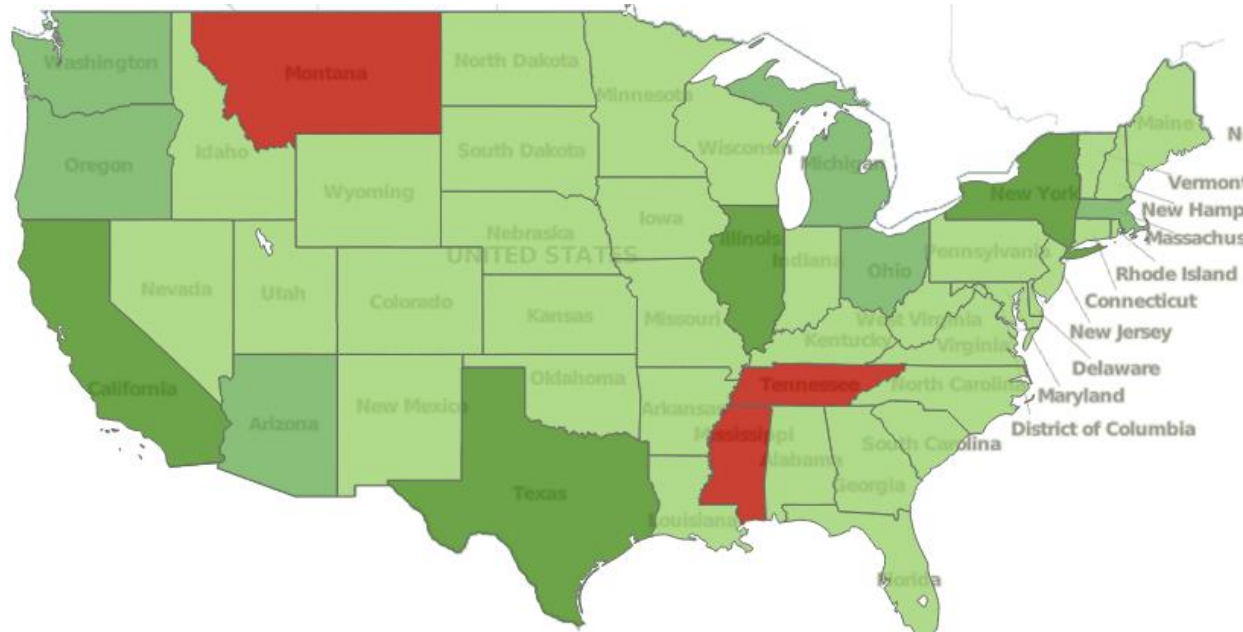
## Routes of a European Airline



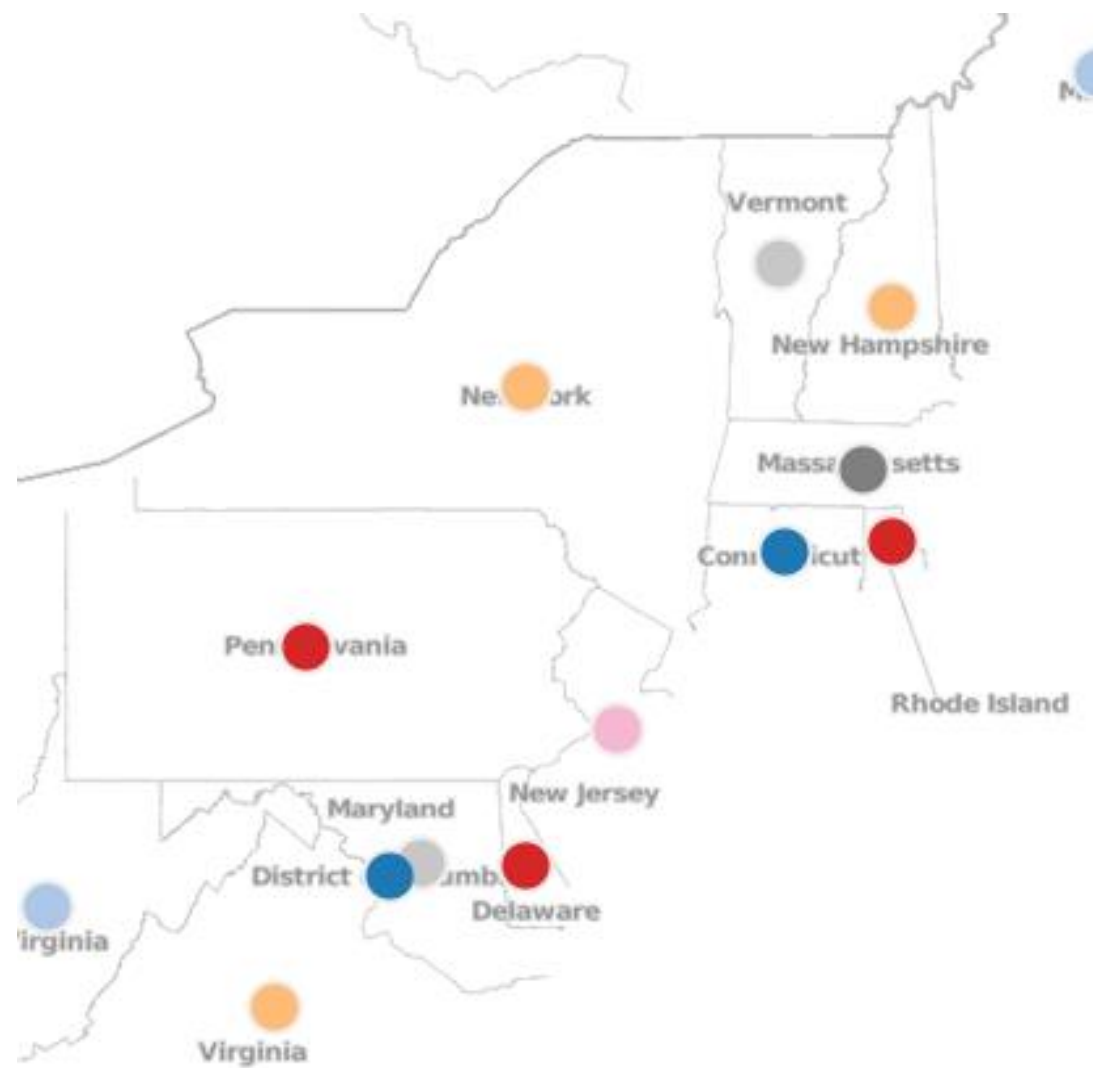
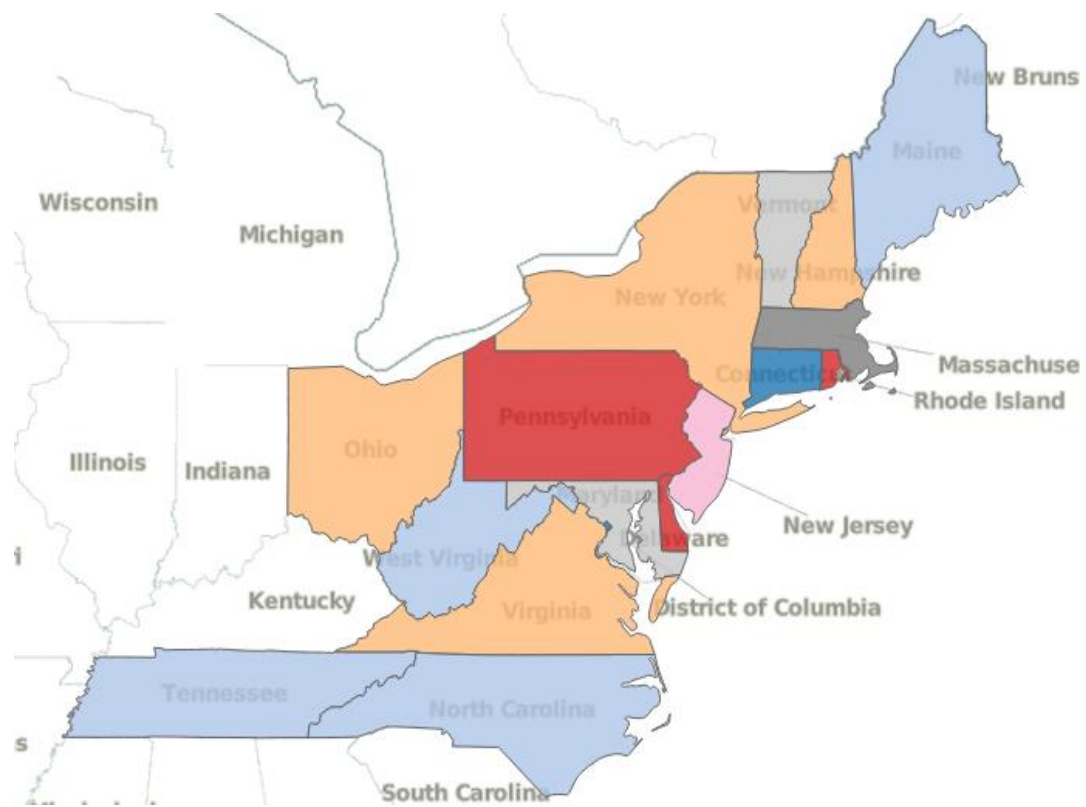




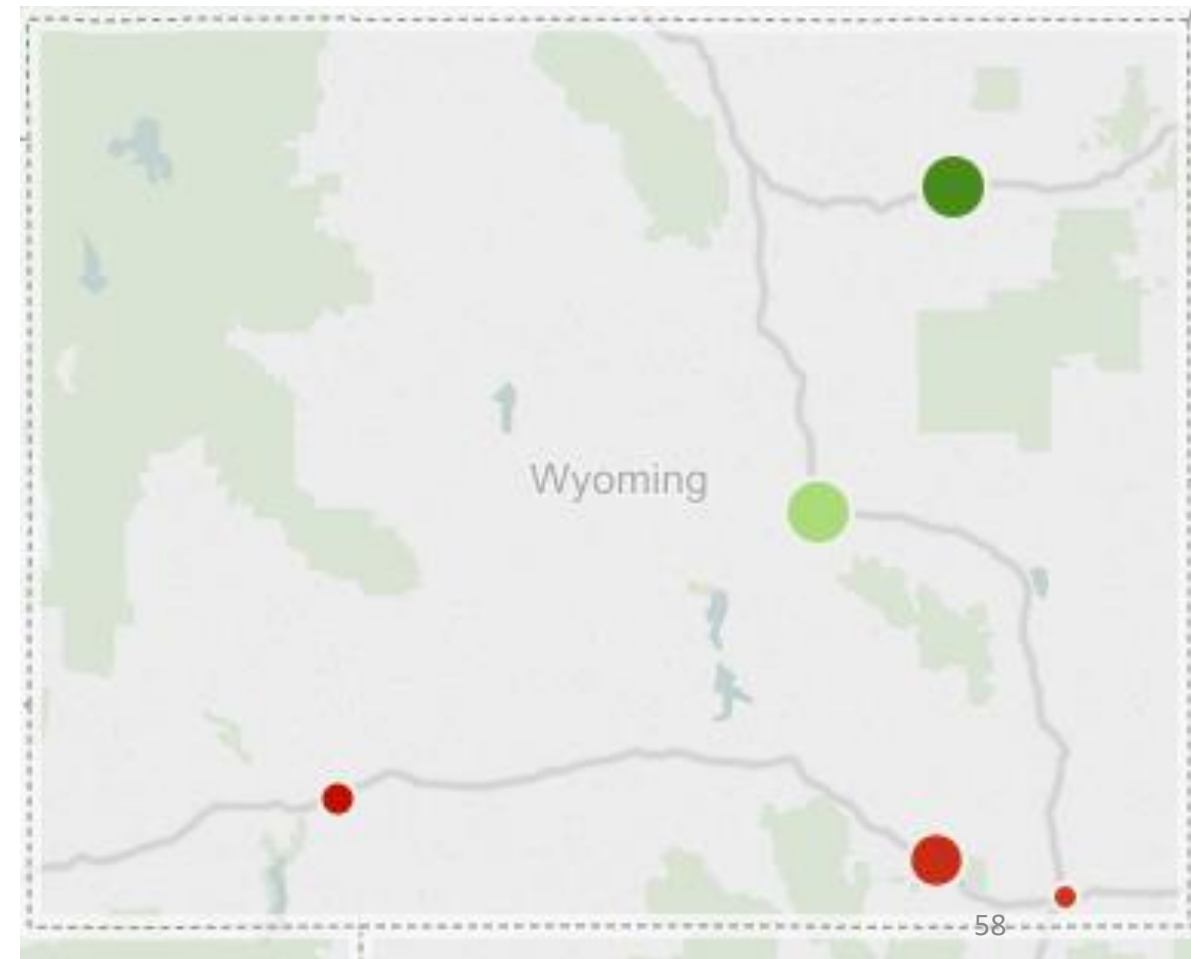
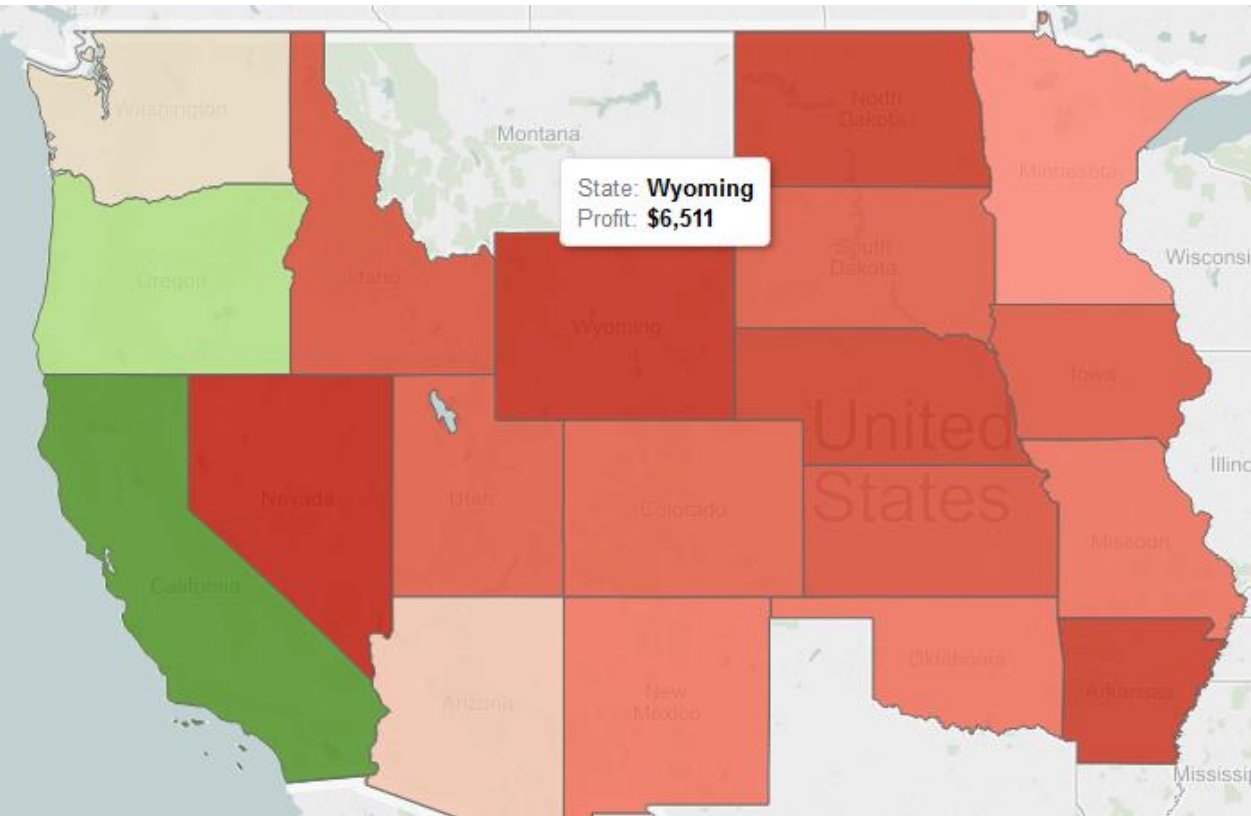
# Color Choice





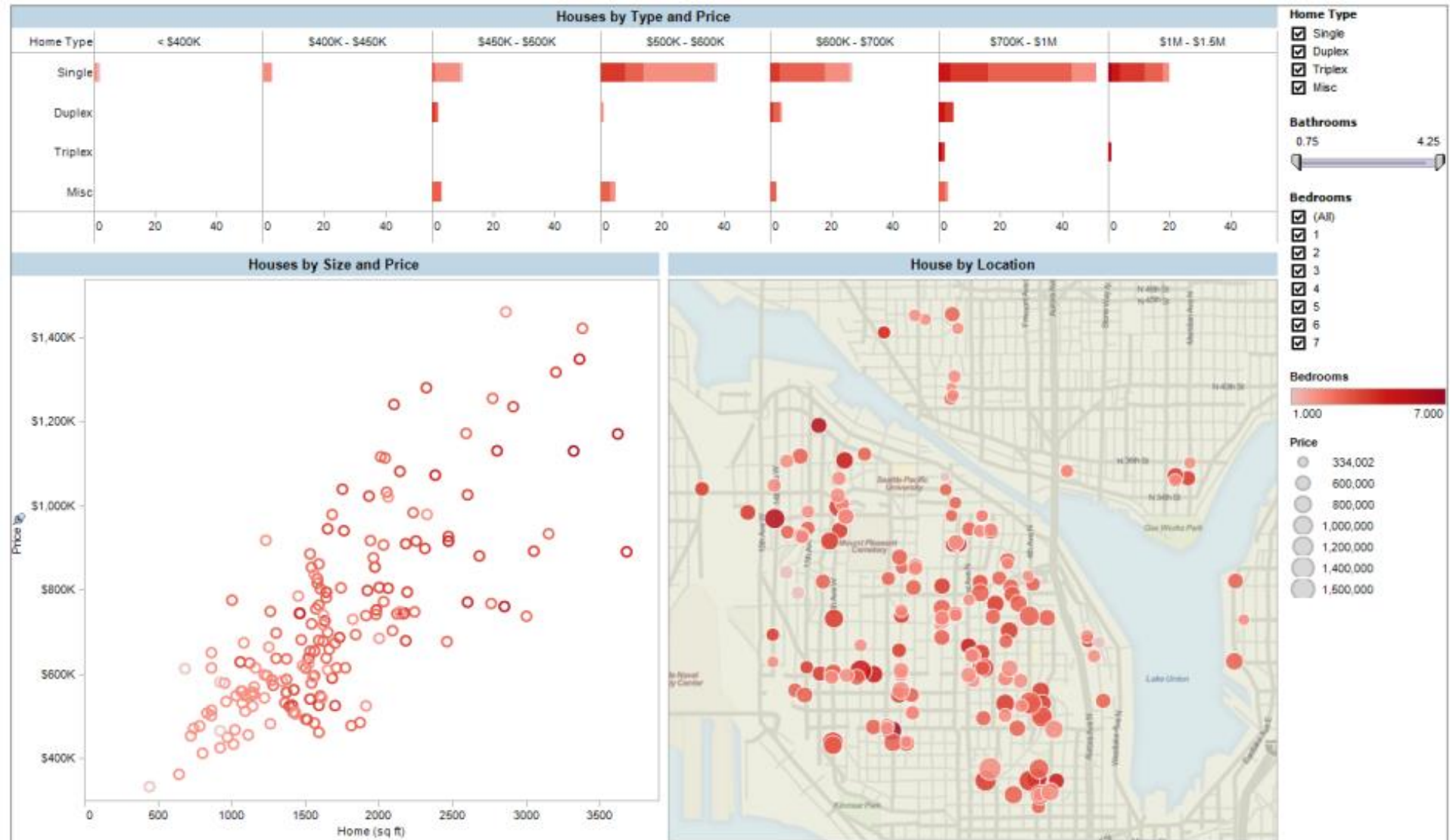


## From high level to localization



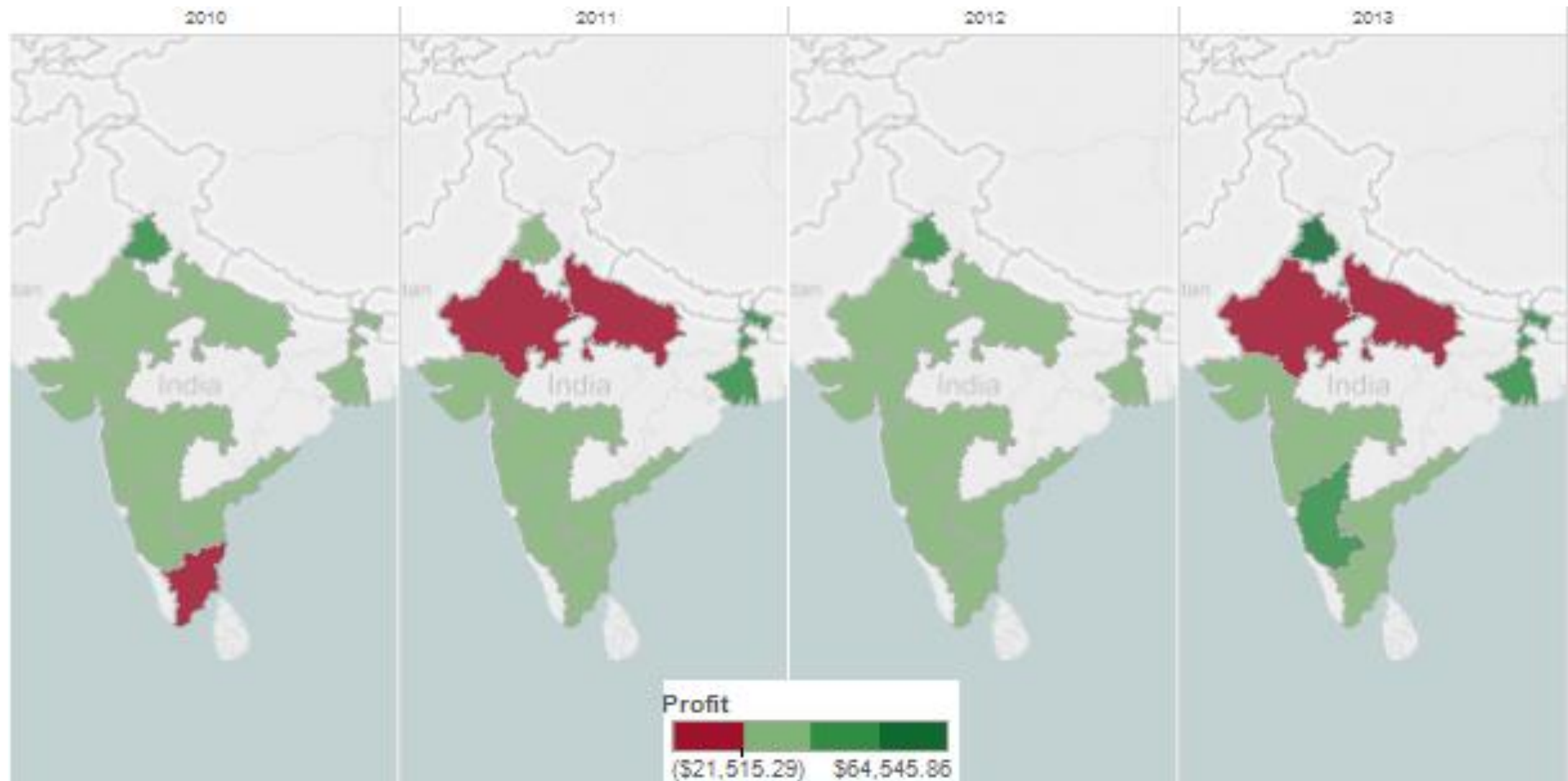


# Utilize Multiple Displays

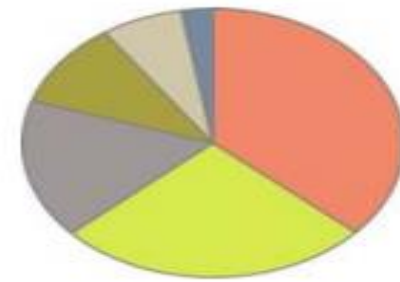
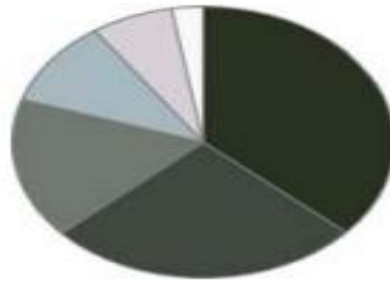
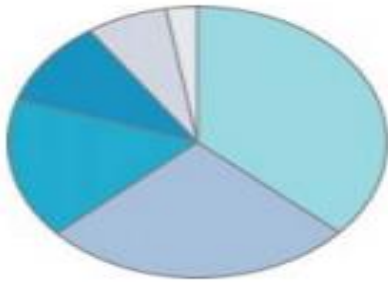




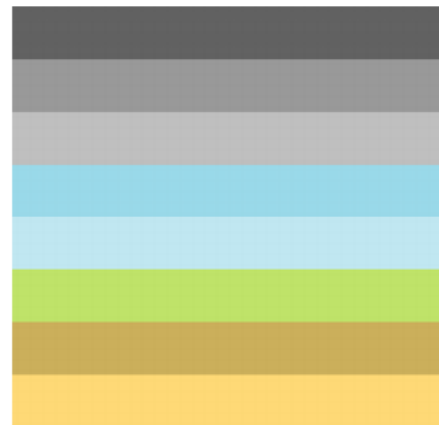
# Integrate Geo-spatial Analysis with Time Series



# Nature's Colors



Nature's Colors



Saturated Colors

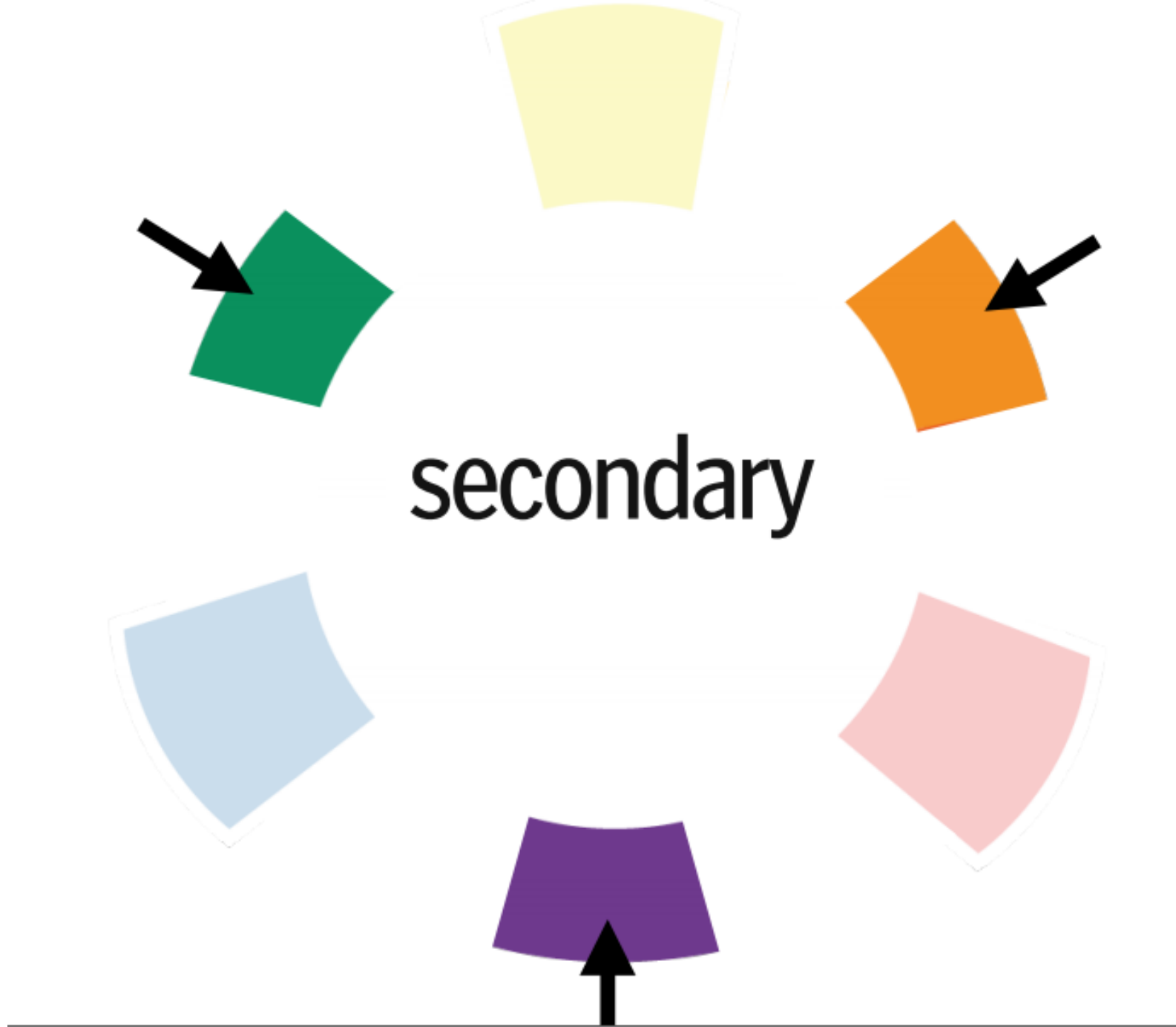




RED

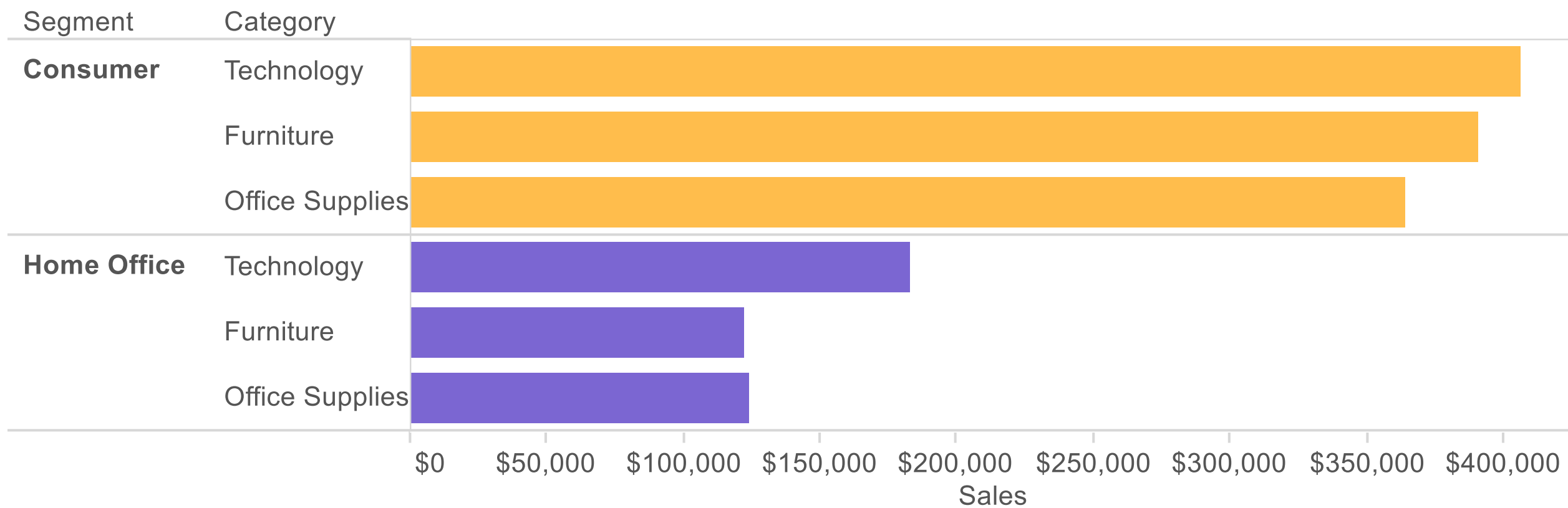
YELLOW

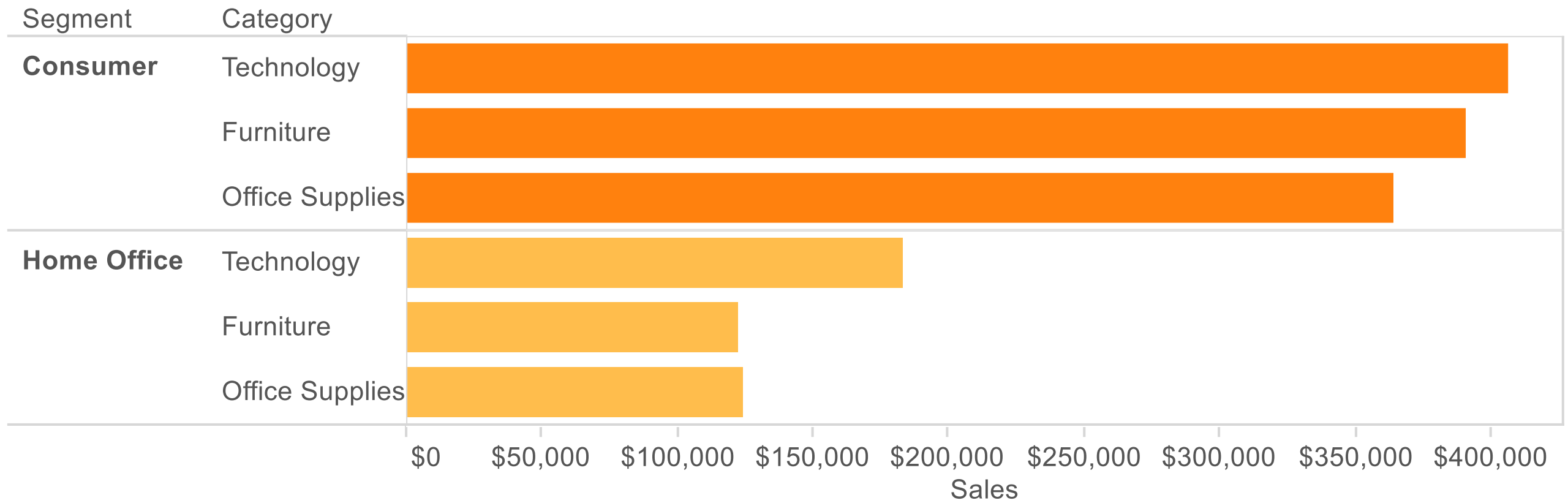
BLUE







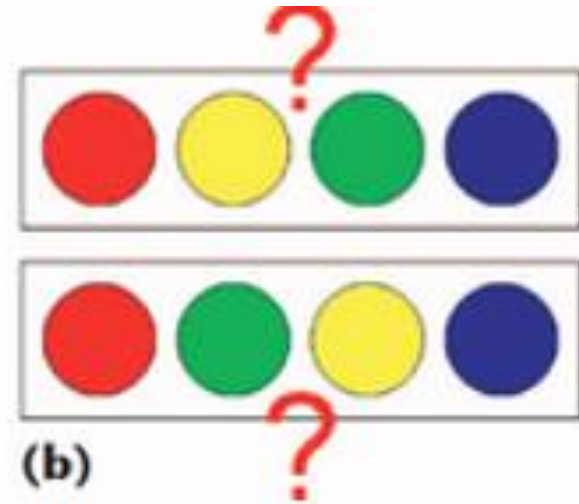
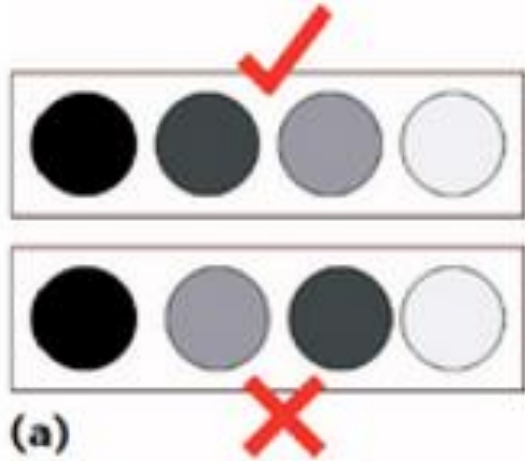








## Color Choices



## Use of sequential colors for Quantitative scales

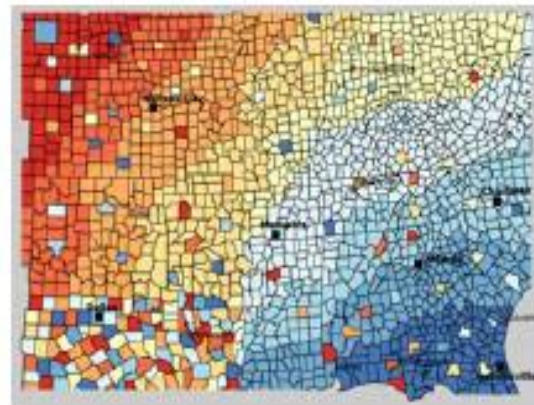


We do not perceive hues sequentially.

But we do perceive color intensities sequentially.

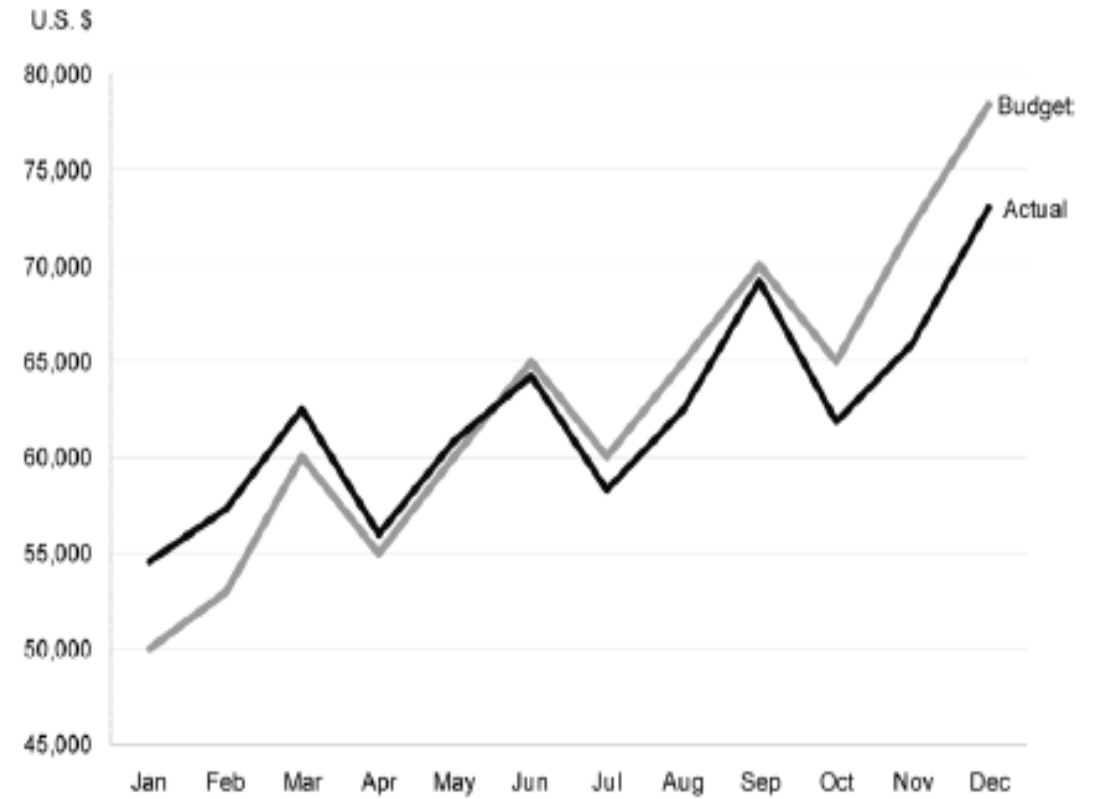
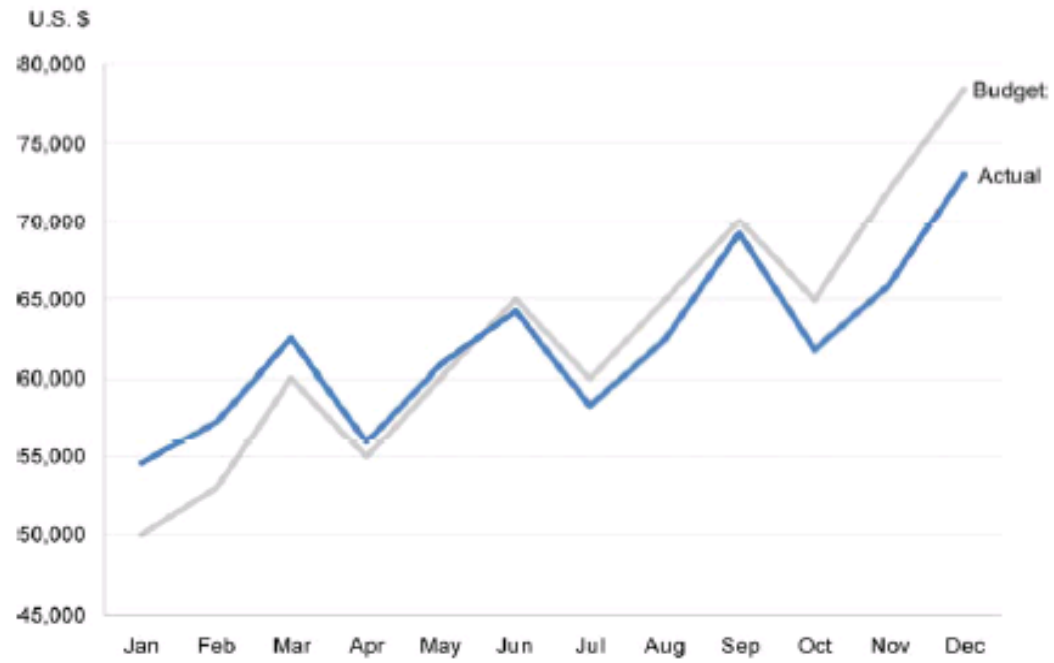


Single sequence scale



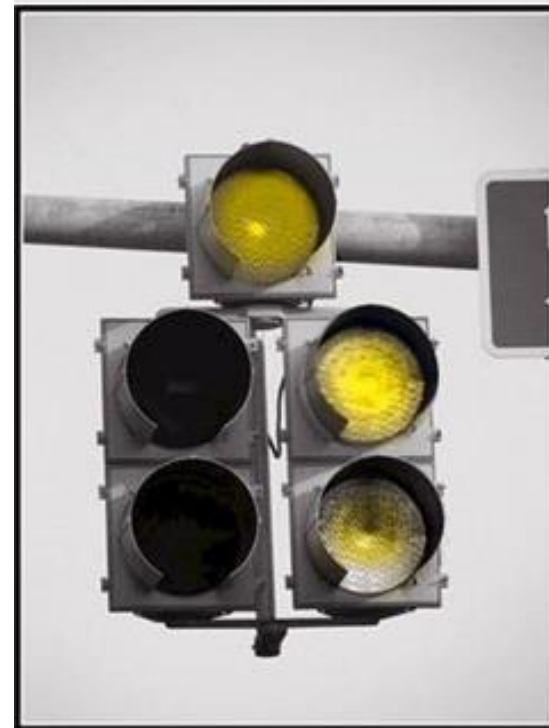
Diverging sequential scale

# Color Choices





# Color Choices



# GEO SPATIAL

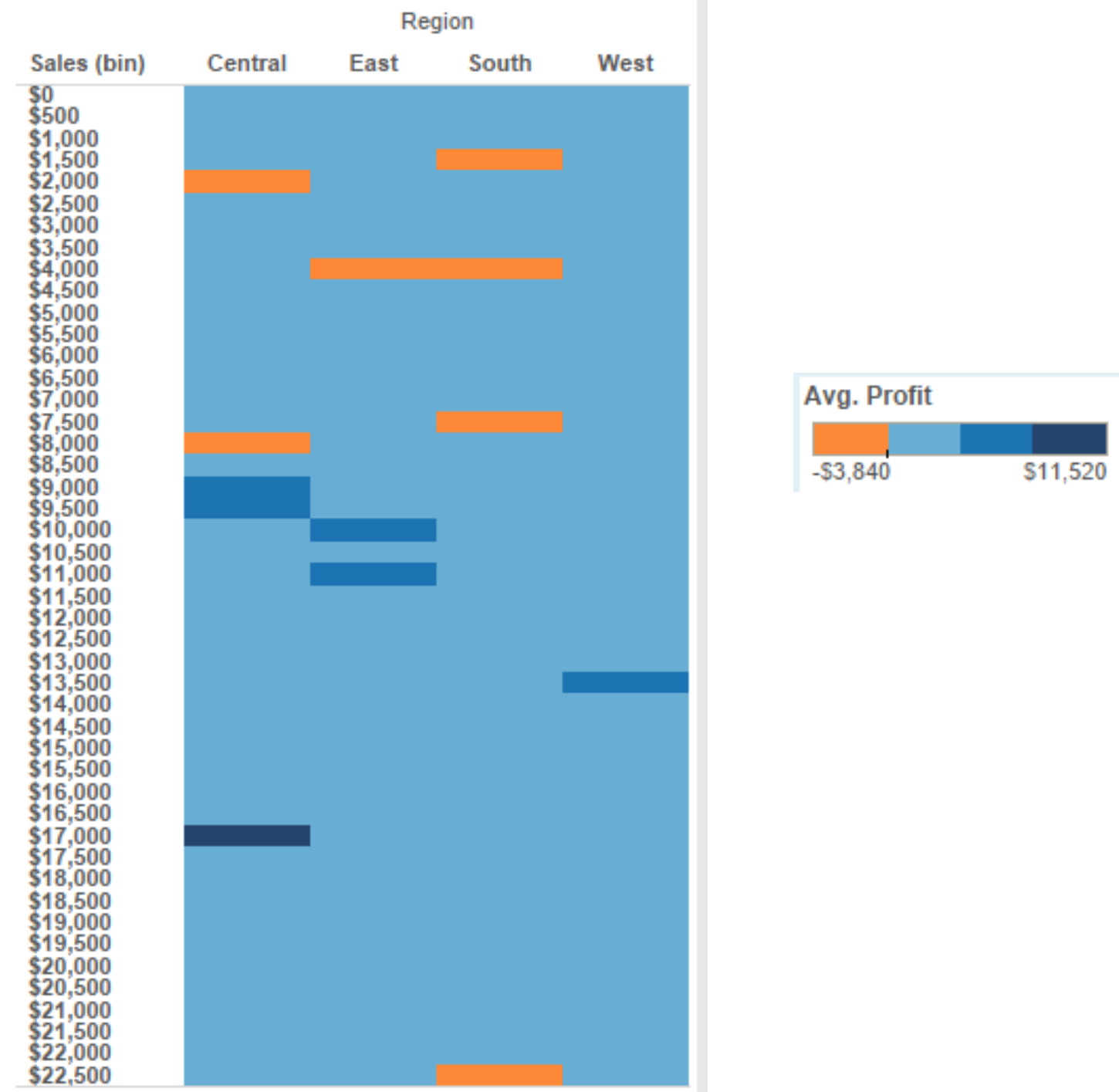
- GPS, Country, State, City
- Locations
- Branches/Plants/Offices
- High level Overview
- As filters
- Concentrations
- Penetration

Distribution – 1 Measure + 1 Dimension

Heat Map



Albania					
Austria					
Belarus					
Belgium					
Bulgaria					
Croatia					
Cyprus					
Czechoslovakia					
Denmark					
Estonia					
Finland					
France					
Germany					
Gibraltar					
Gibraltar					
Greece					
Hungary					
Ireland					
Italy					
Latvia					
Lithuania					
Luxembourg					
Monaco					
Netherlands					
Norway					
Poland					
Portugal					
Romania					
Russia					
Serbia					
Slovenia					
Spain					
Sweden					
Switzerland					
Turkey					
United Kingdom					
Yugoslavia					
	Population	Life exp/male	Life exp/female	GDP m\$	GDP/capita m\$
					Unemployment(ppm)

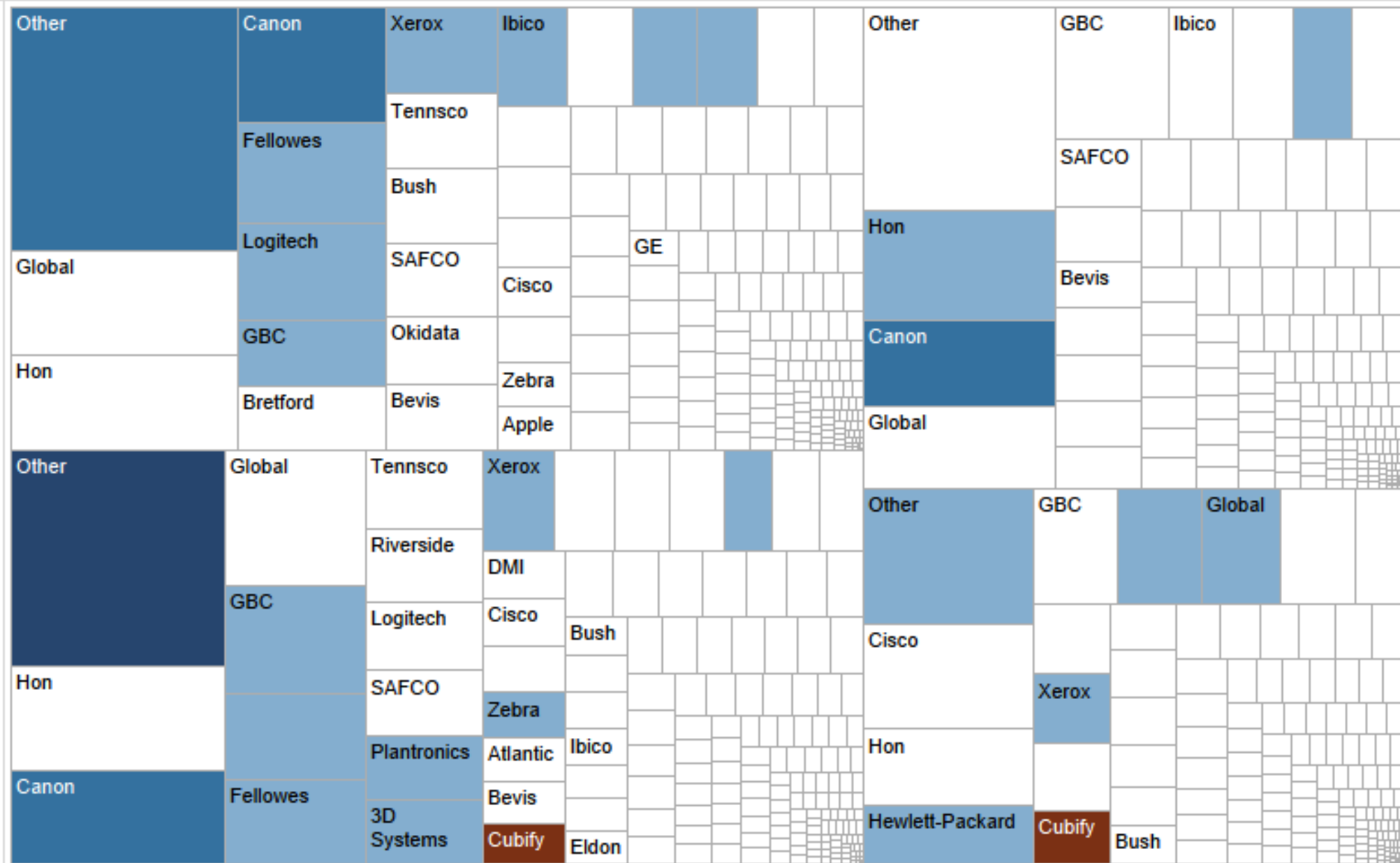


# Heat Map or Highlight Table

- Overview
- Large Volume
- Where to begin
- Relationship
- Outliers

# Distribution – 2 Measures + 1 Dimension (Part to Whole)





SUM(Profit) ▼

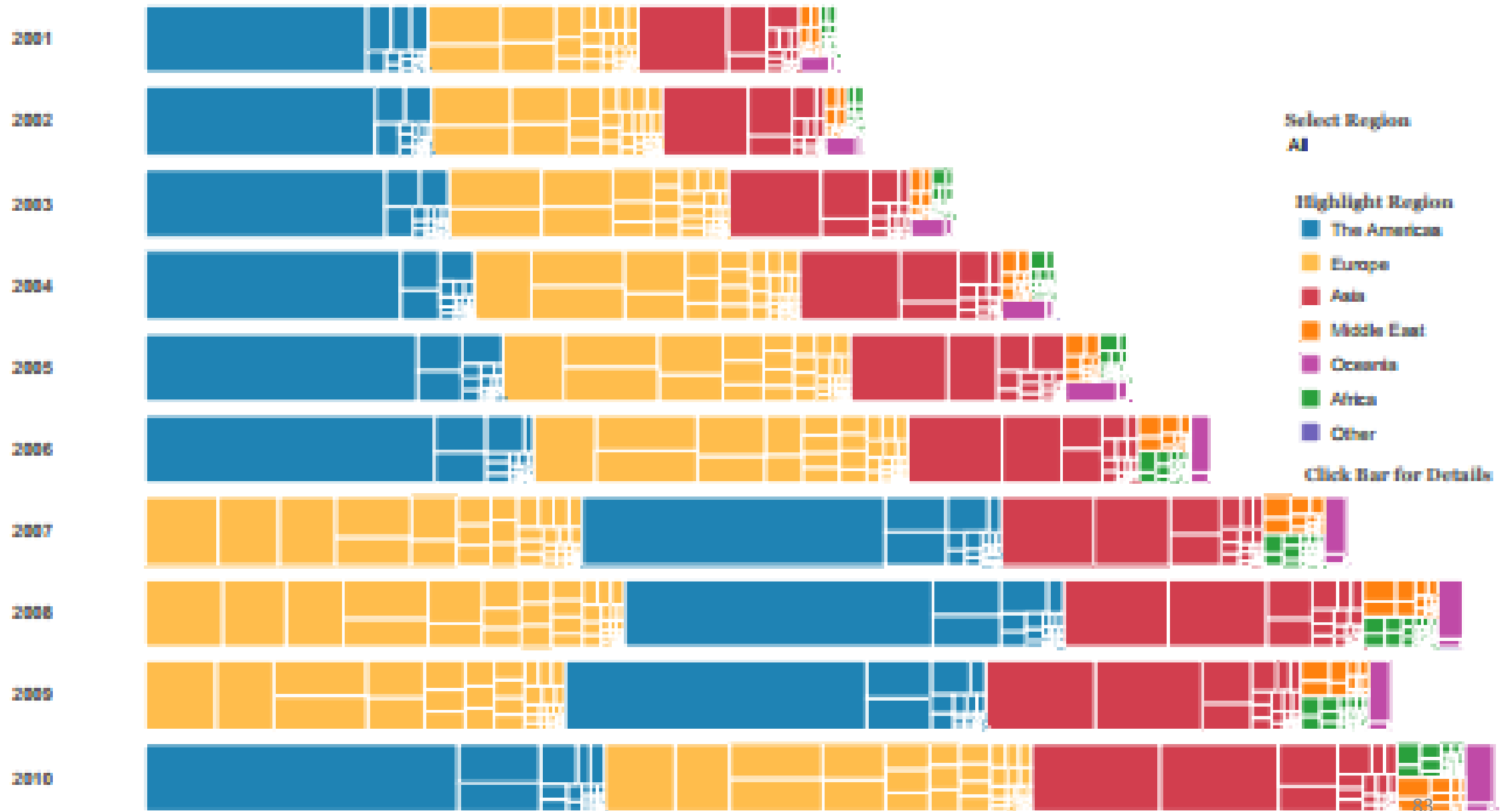


-\$9,240

\$21,560



## World GDP Through Time



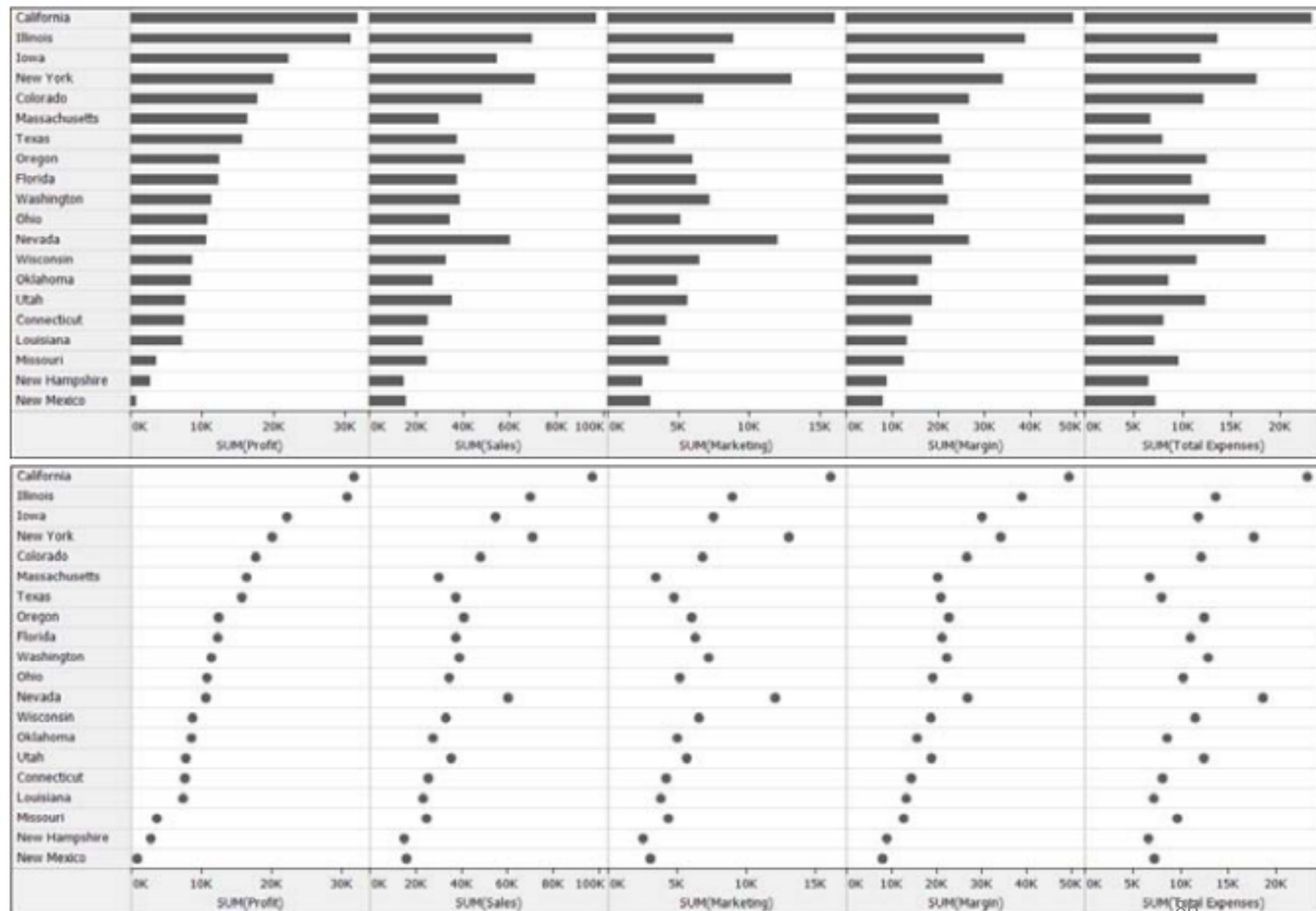
# Tree Map

- At a glance
- Volume
- Hierarchy
- Part to Whole - Lot

# Multivariate

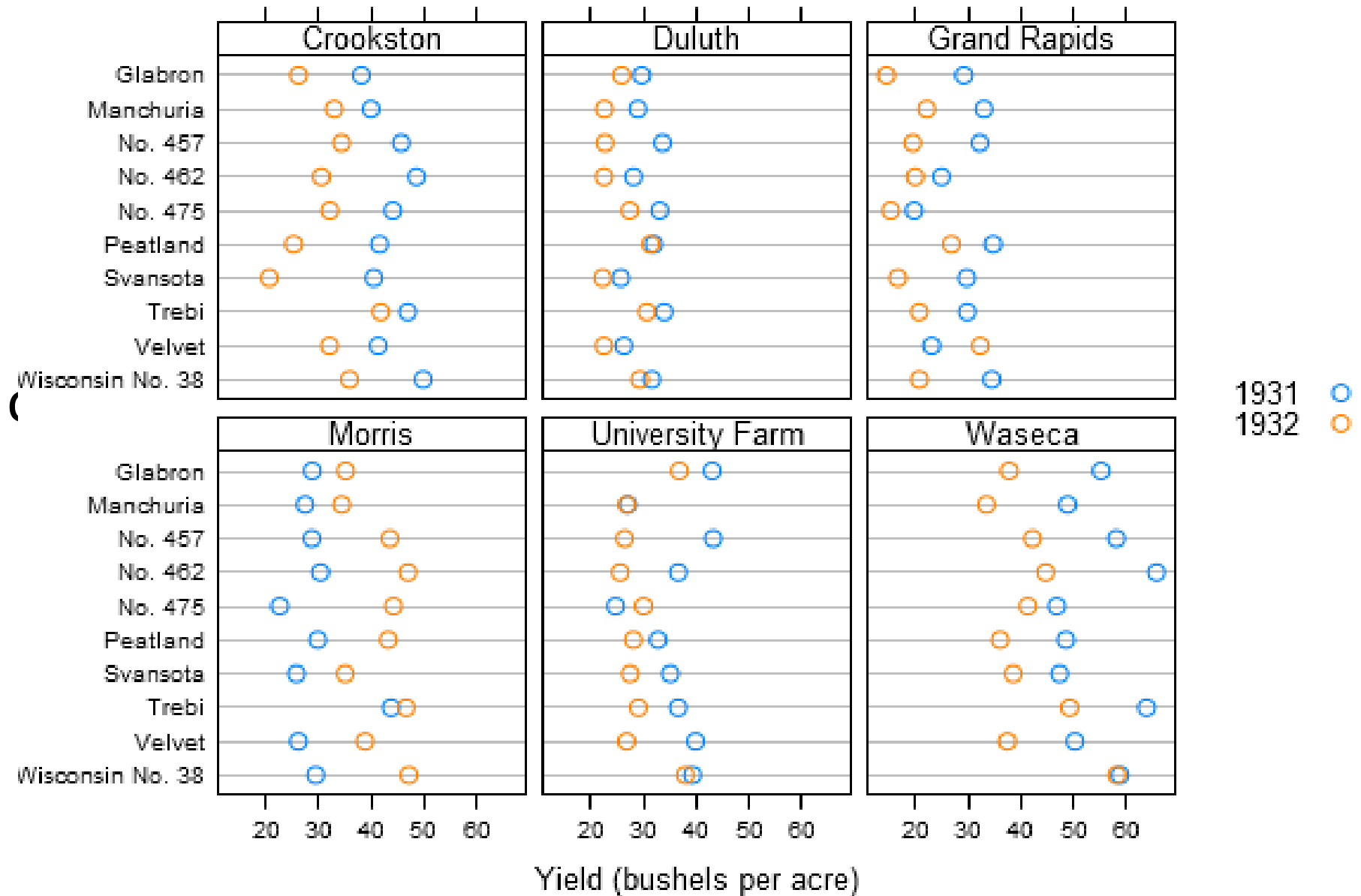
# Table Lens

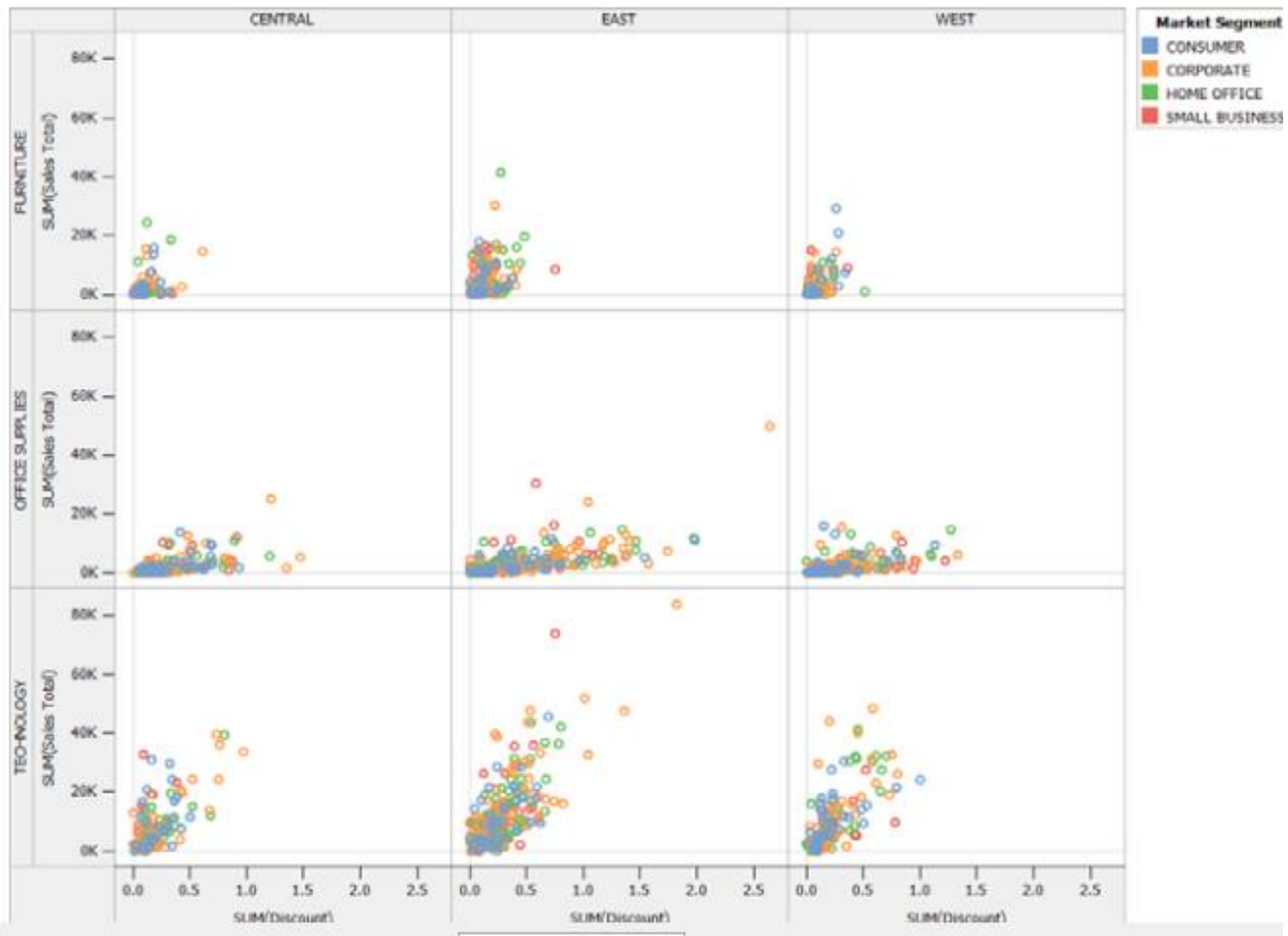
- Multi Variate
- Tabular structure
- Compare
- Correlation
- Large Data sets



## Small Multiples

- Single variation (one condition)
- Dependency
- Detect Patterns
- Large Volume



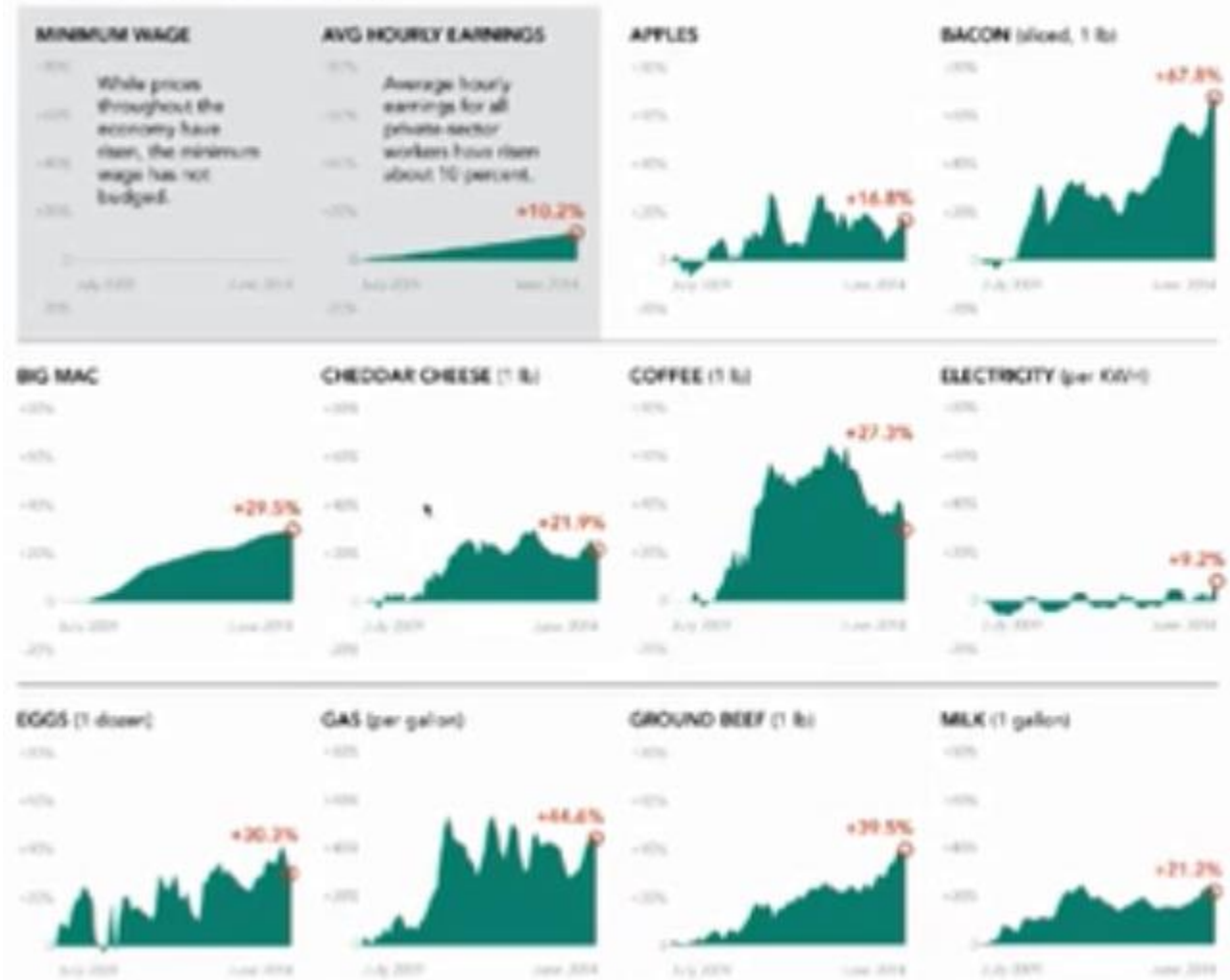




## Life Gets More Expensive, Minimum Wage Stagnates

The minimum wage has been stagnant since July 24, 2009, when the federal minimum wage rose from \$6.55 to \$7.25 per hour. On the 5th anniversary of that wage hike, here's a look at how expensive some other stuff has gotten while the minimum wage has stayed exactly the same. For comparison, the Consumer Price Index has risen about 9 percent in the past 5 years, excluding food and energy prices.

PERCENT CHANGE IN CURRENT DOLLARS

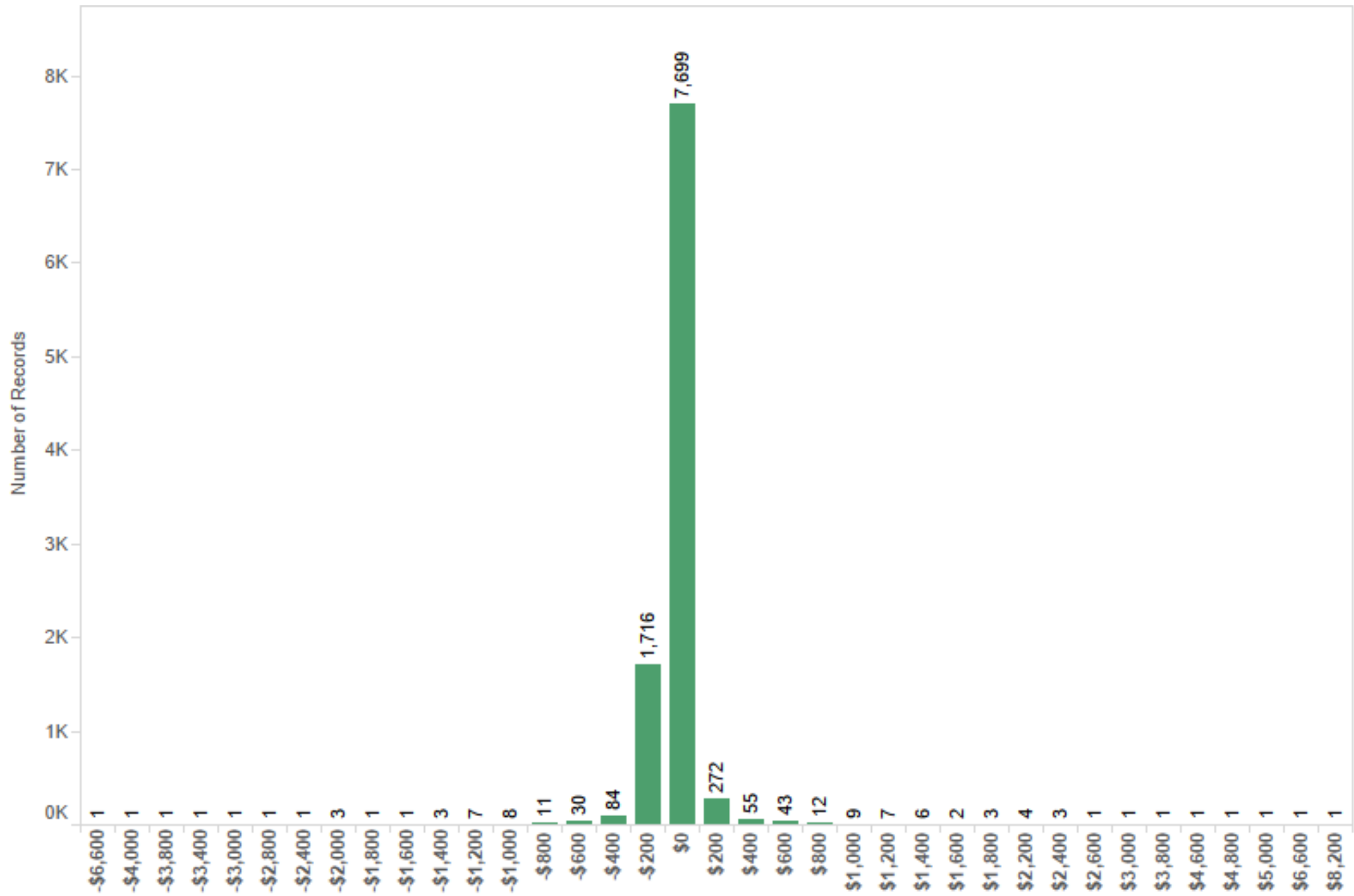


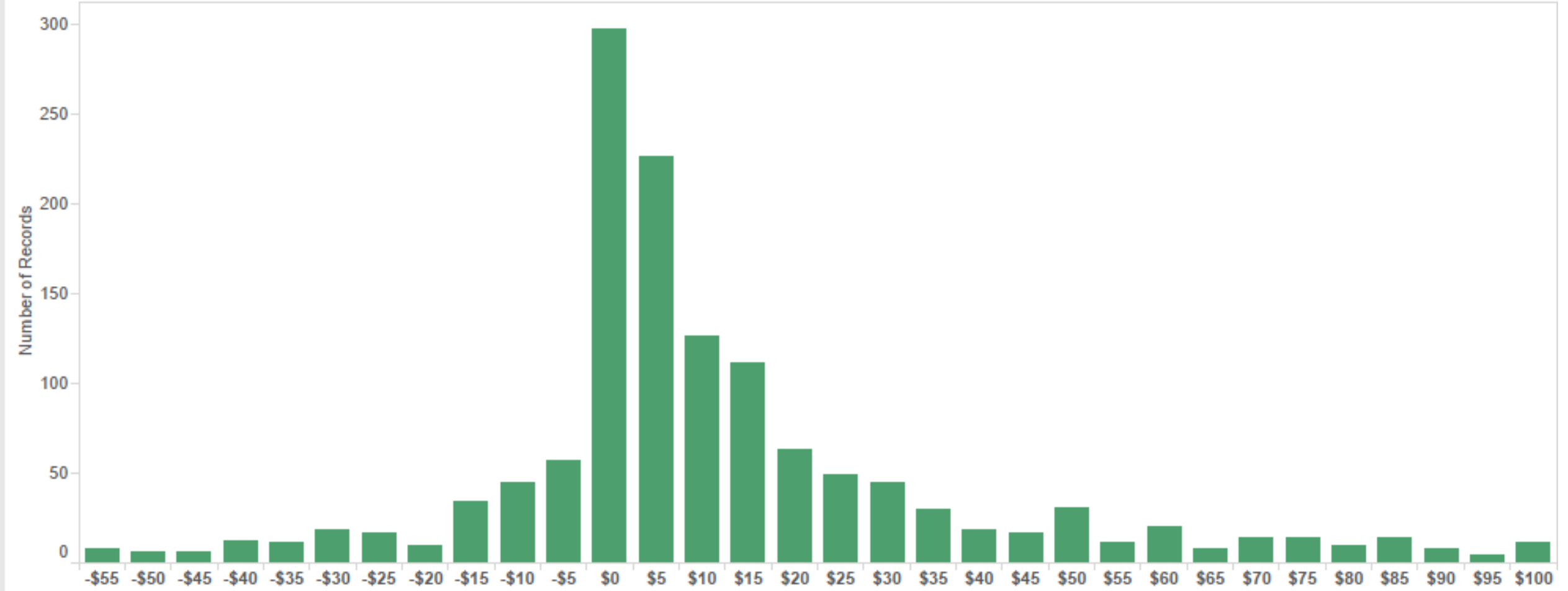


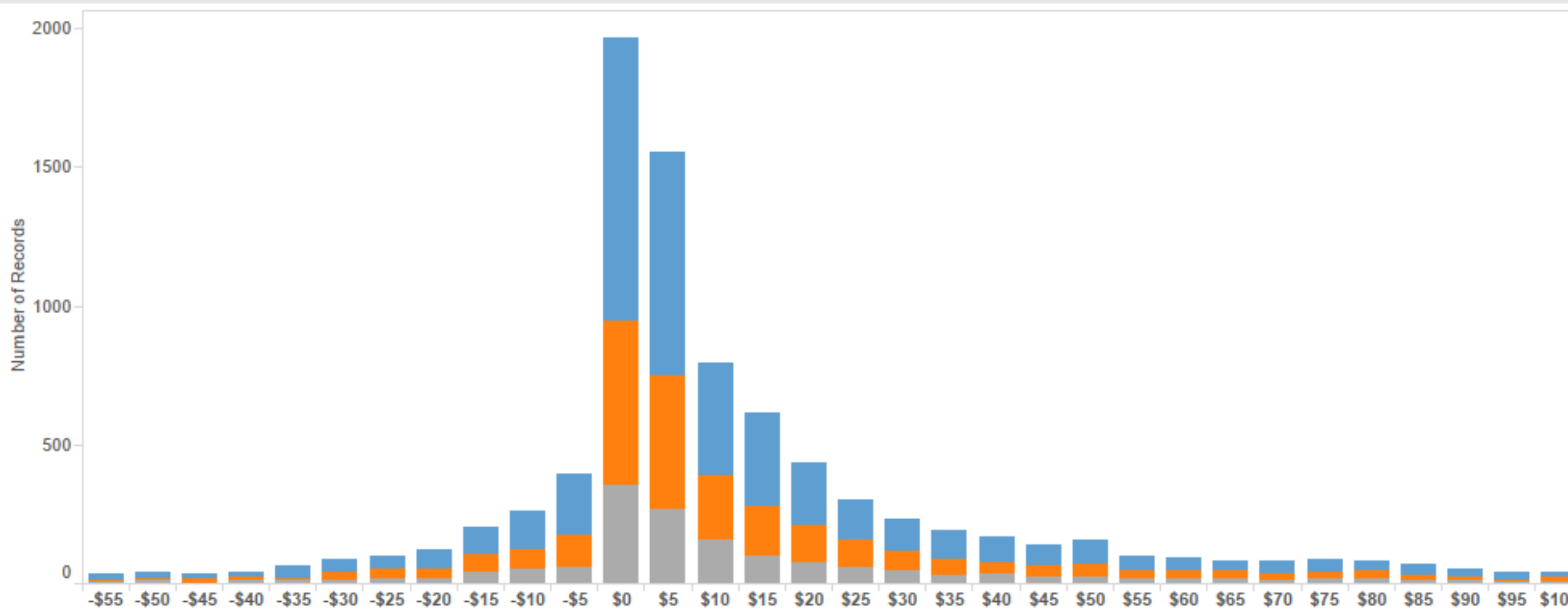
# Multivariate

- At a glance
- Large Volume
- Bite Sized Info Views
- Vary one – keep everything else constant

# One Measure







Ship Mode

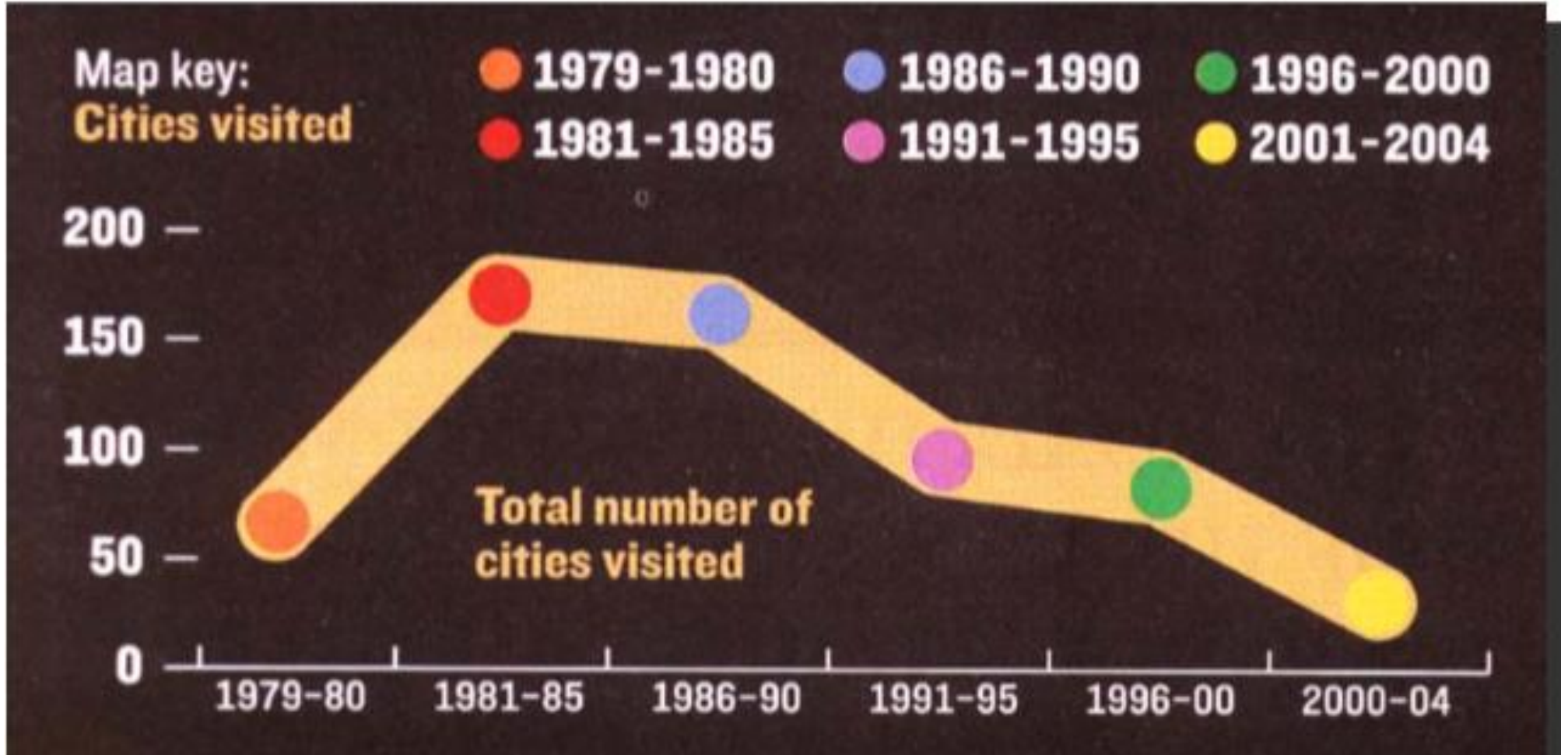
- ☐ (All)
- ☒ First Class
- ☐ Same Day
- ☐ Second Class
- ☐ Standard Class

Segment

- ☒ Consumer
- ☒ Corporate
- ☒ Home Office

Region

- ☒ (All)
- ☒ Central
- ☒ East
- ☒ South
- ☒ West





# Histogram

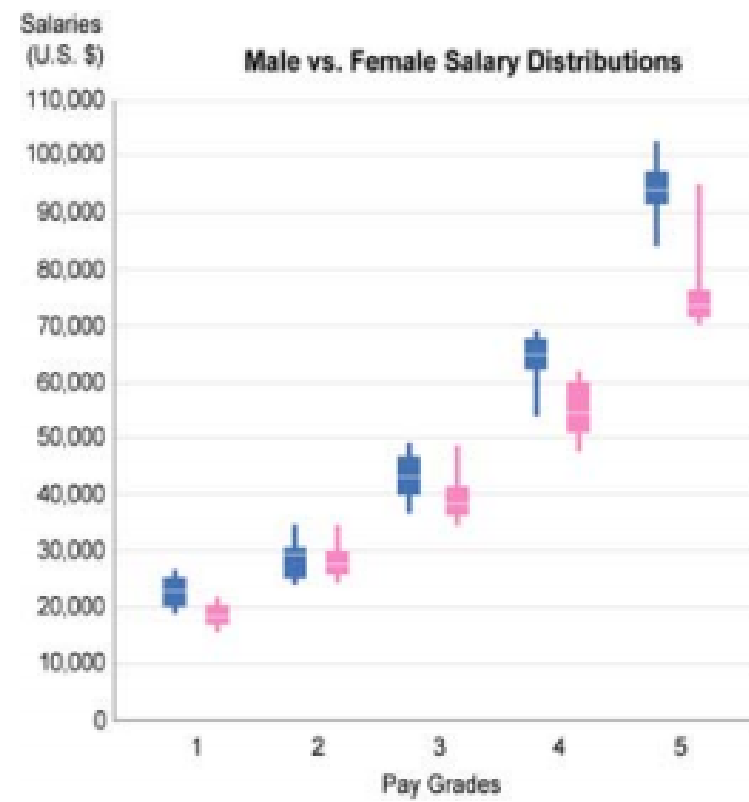
- Distribution
- Intervals
- Grouping
- Outliers
- Categorize

# Distribution – 1 Measure

## Box Plots







# Two Weeks of Home Sales

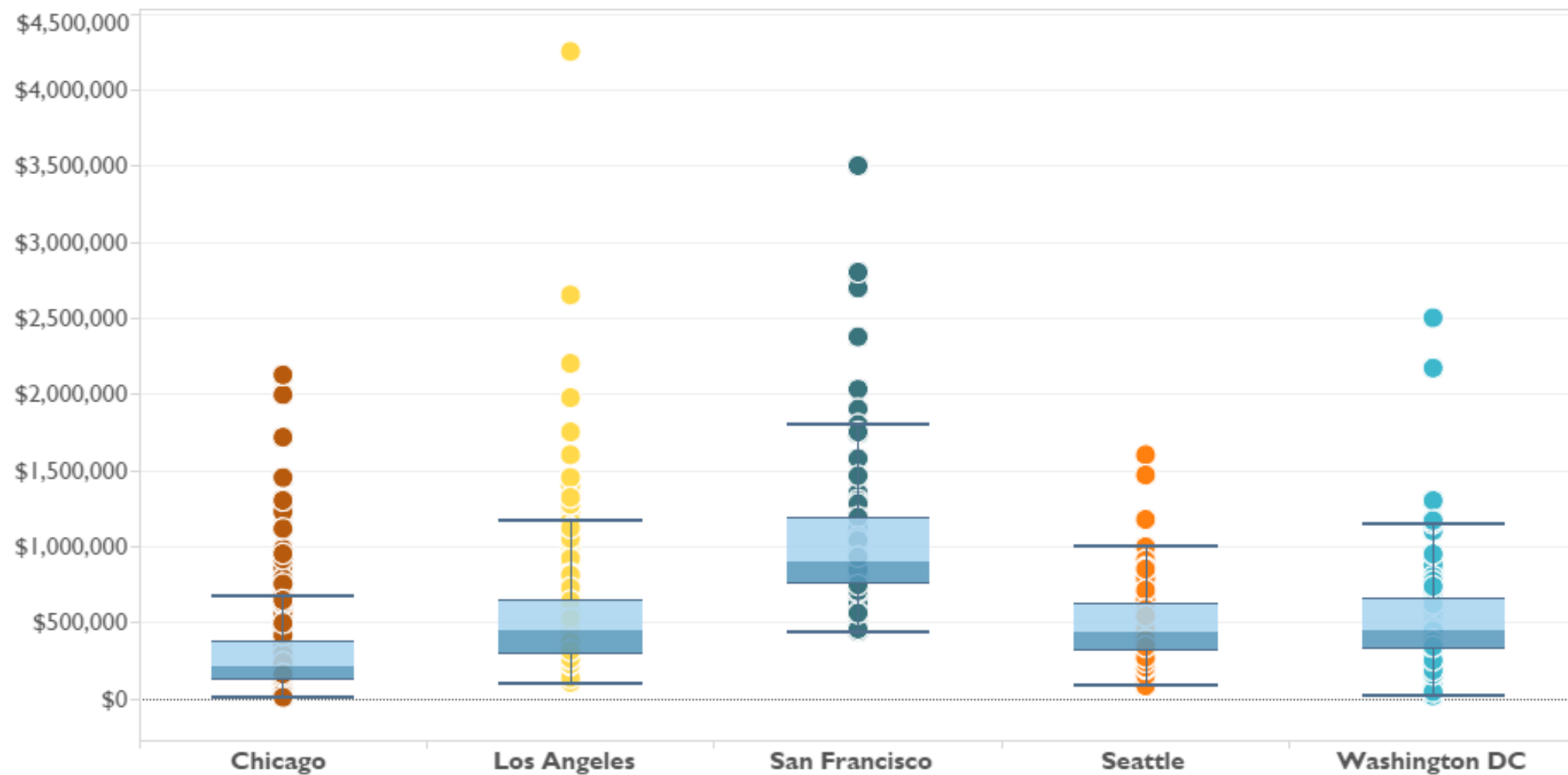
HOME TYPE

(All) ▼

Filter Date Range

9/16/13

10/1/13



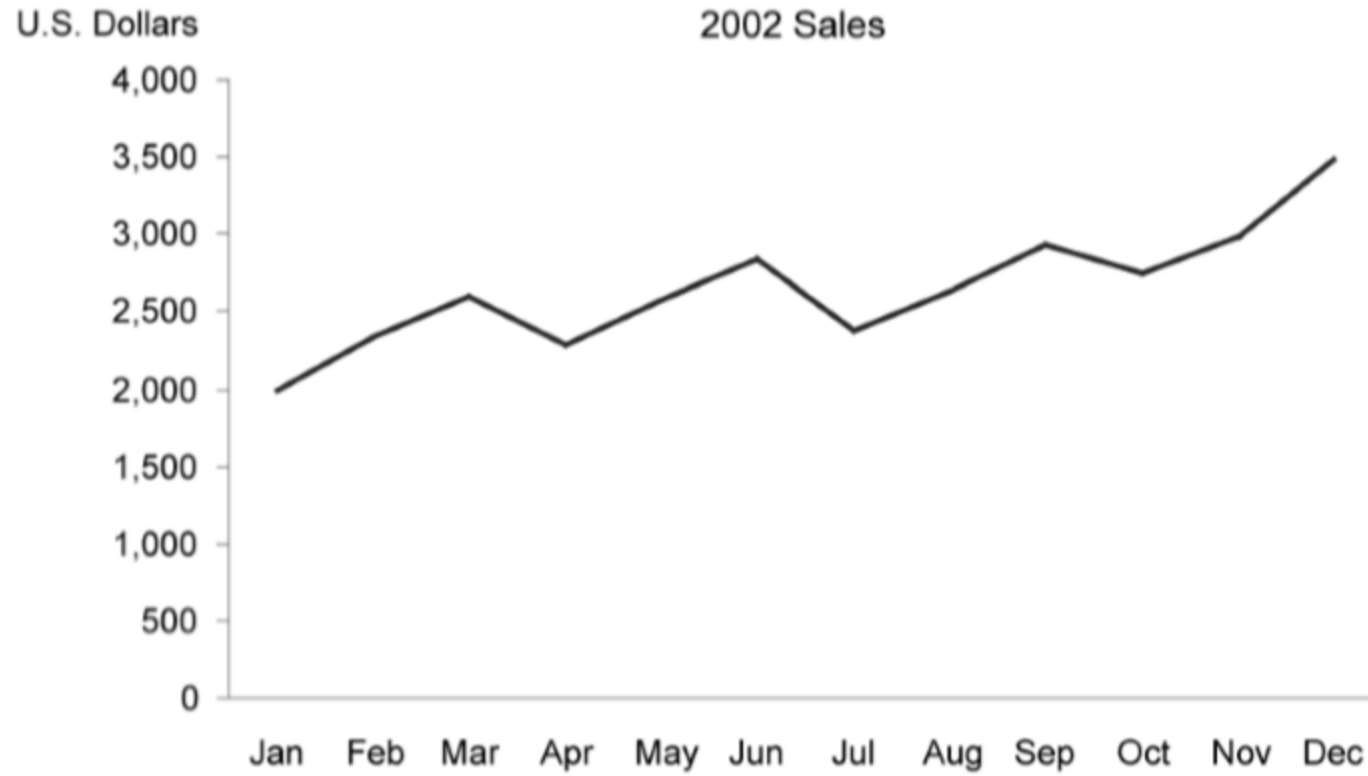
# Box Plot

- Distribution
- Range
- Outlier
- Compare categories
- Performance Comparison
- Large volumes of data

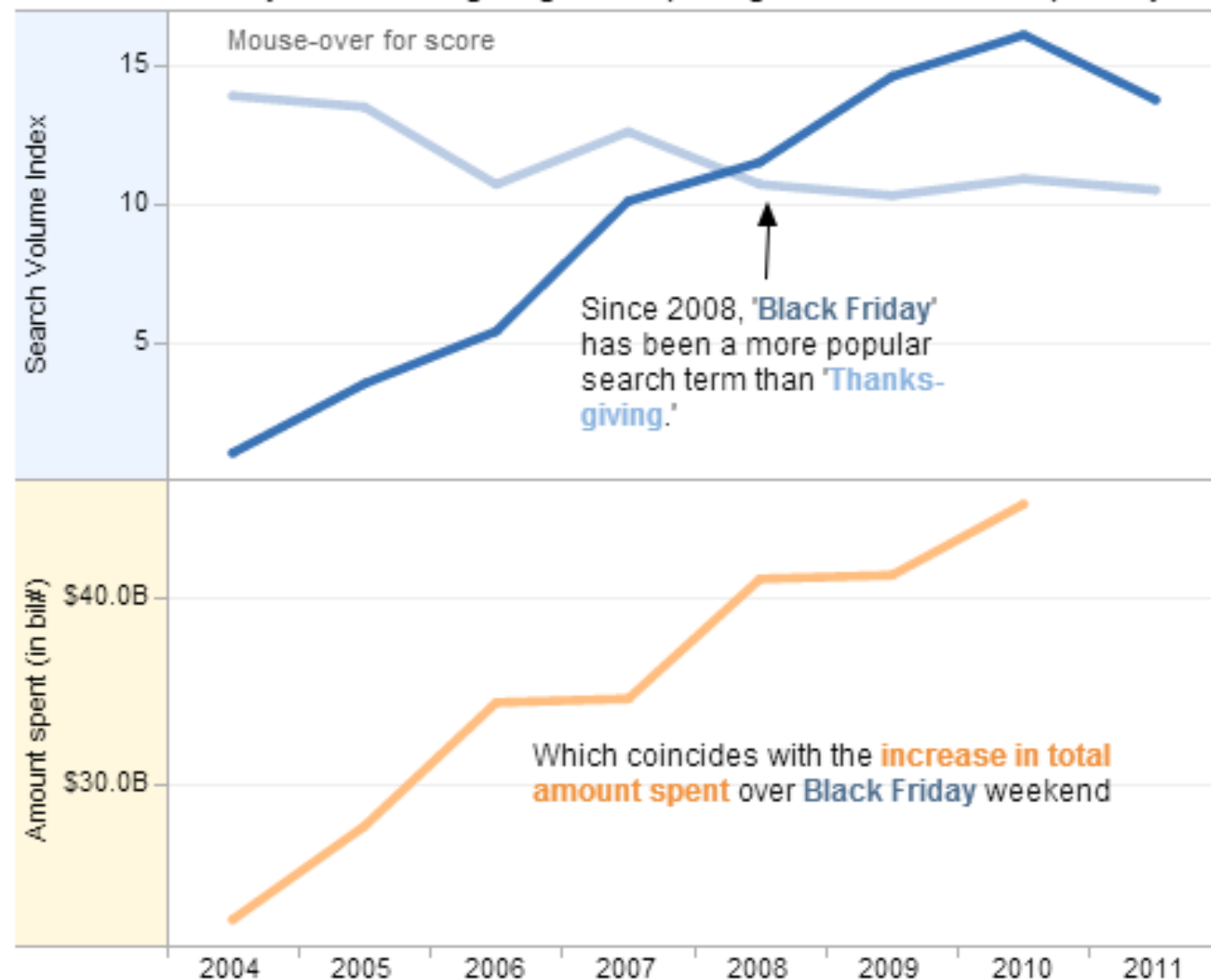
# Date + 1 Measure



# Strength of Lines



# Black Friday & Thanksgiving: Comparing Search Term Popularity



Color Legend:

- 'Black Friday'
- 'Thanksgiving'
- Total Amount Spent (in \$bil)

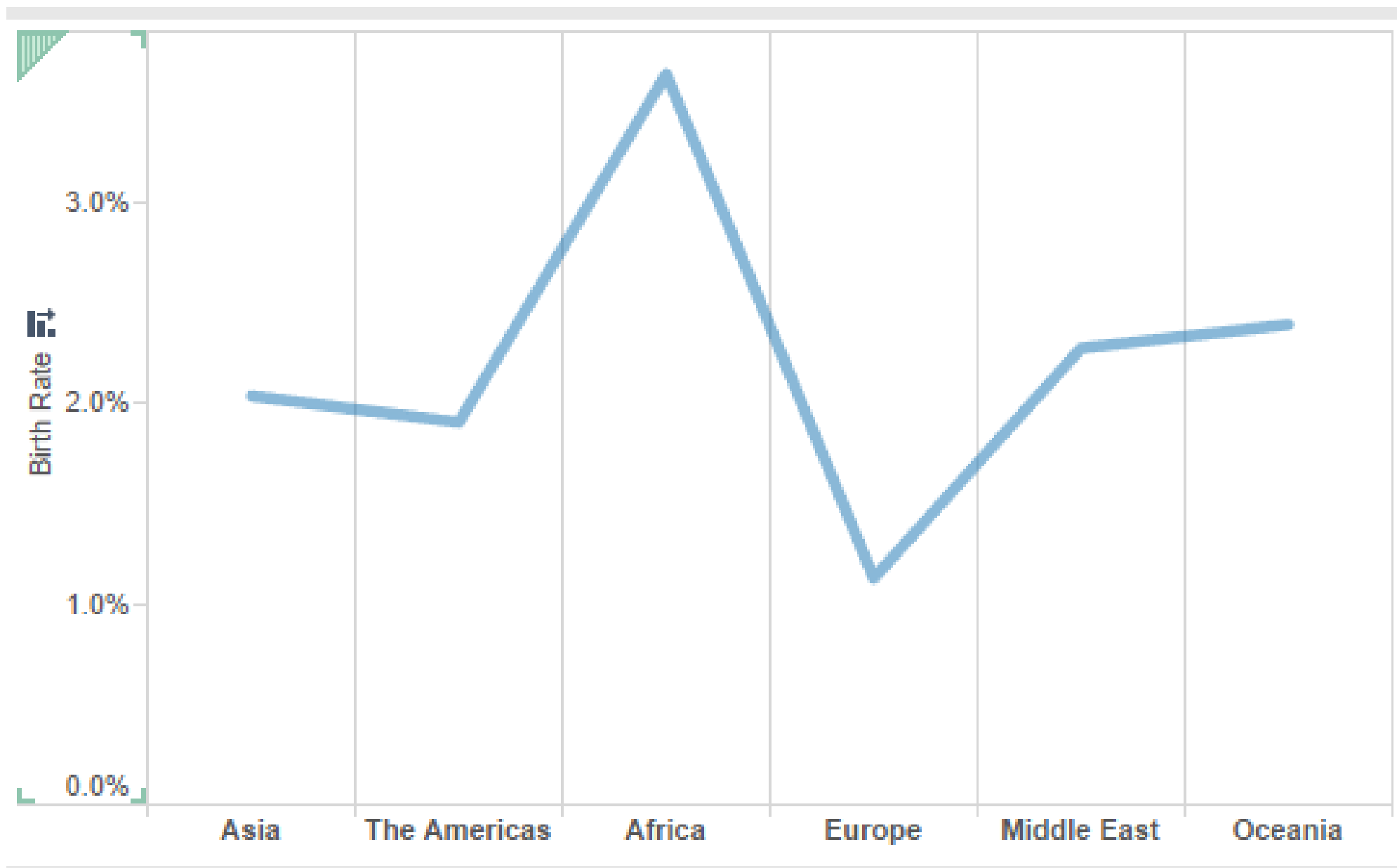
In the beginning of Nov. 2011, 'Black Friday' was already a more searched term on Google than 'Thanksgiving.'

Filter Years:

1/4/2004

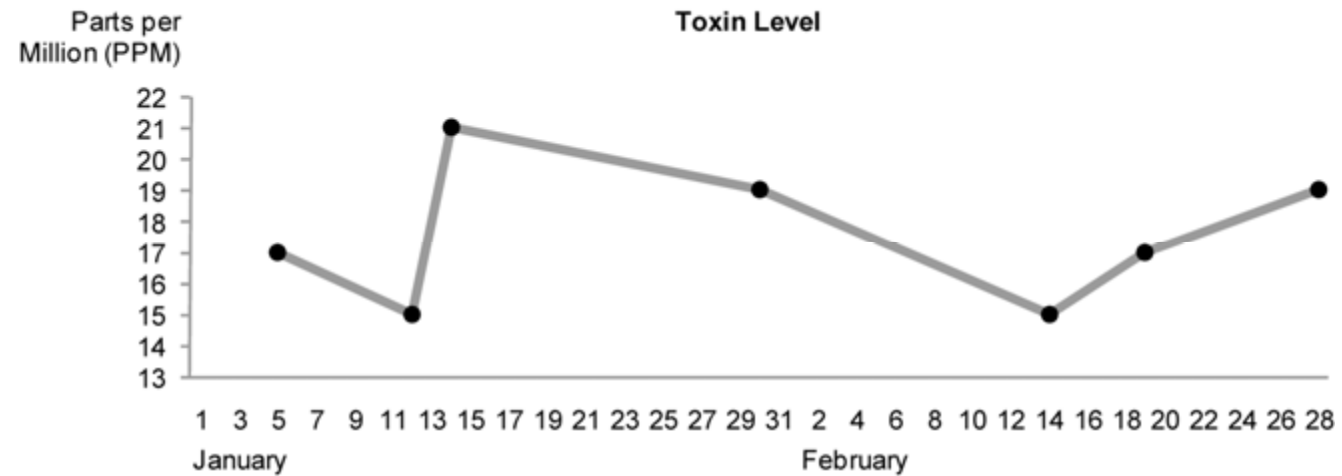
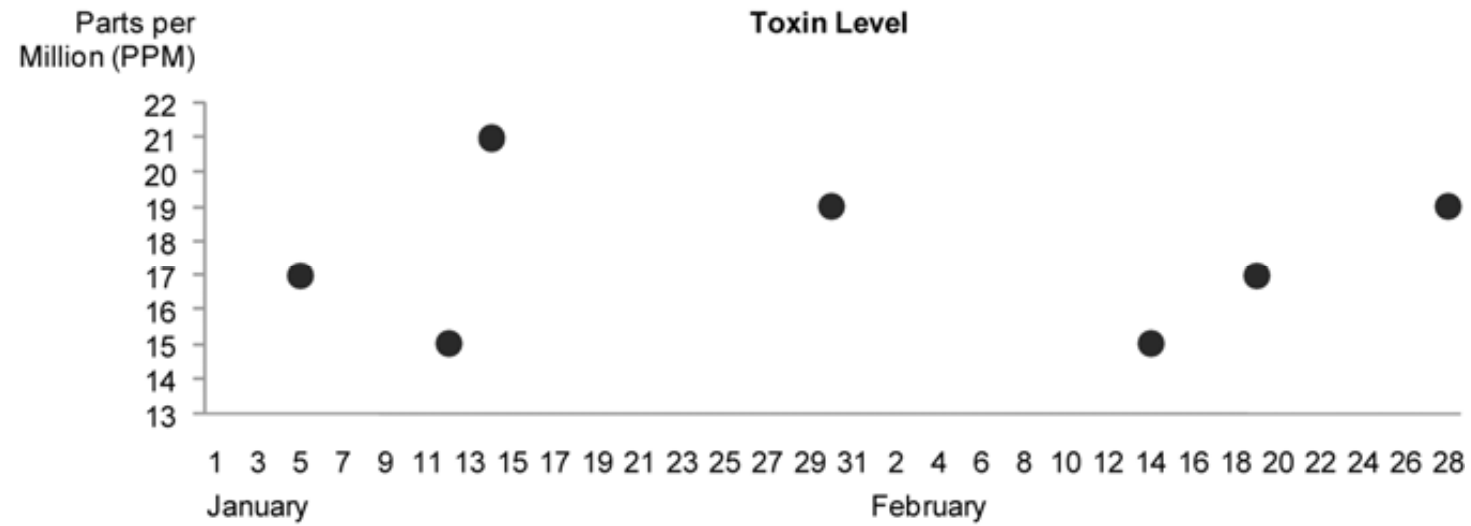
11/13/2011

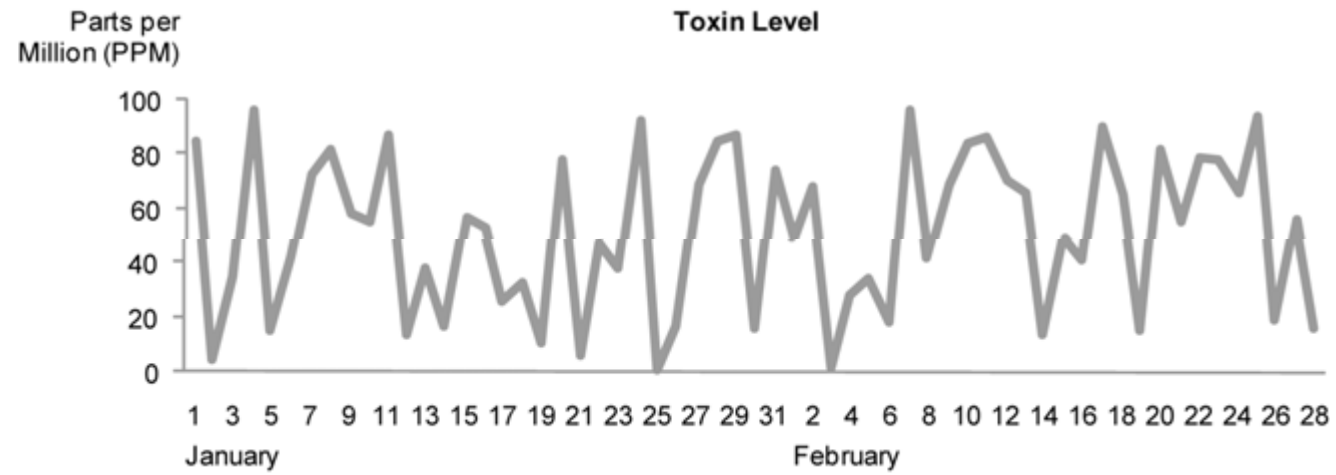
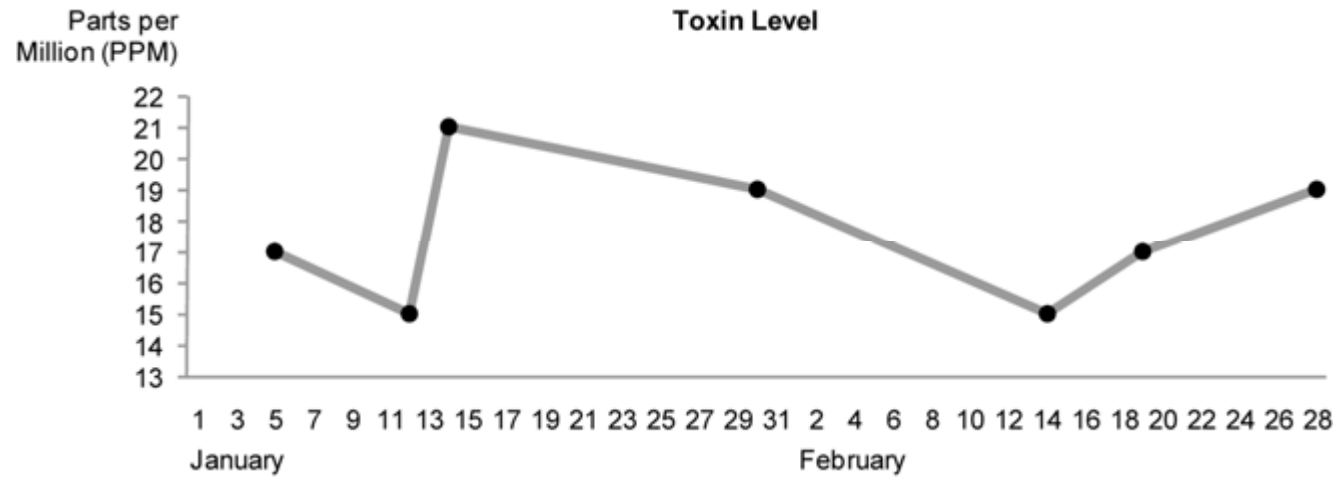


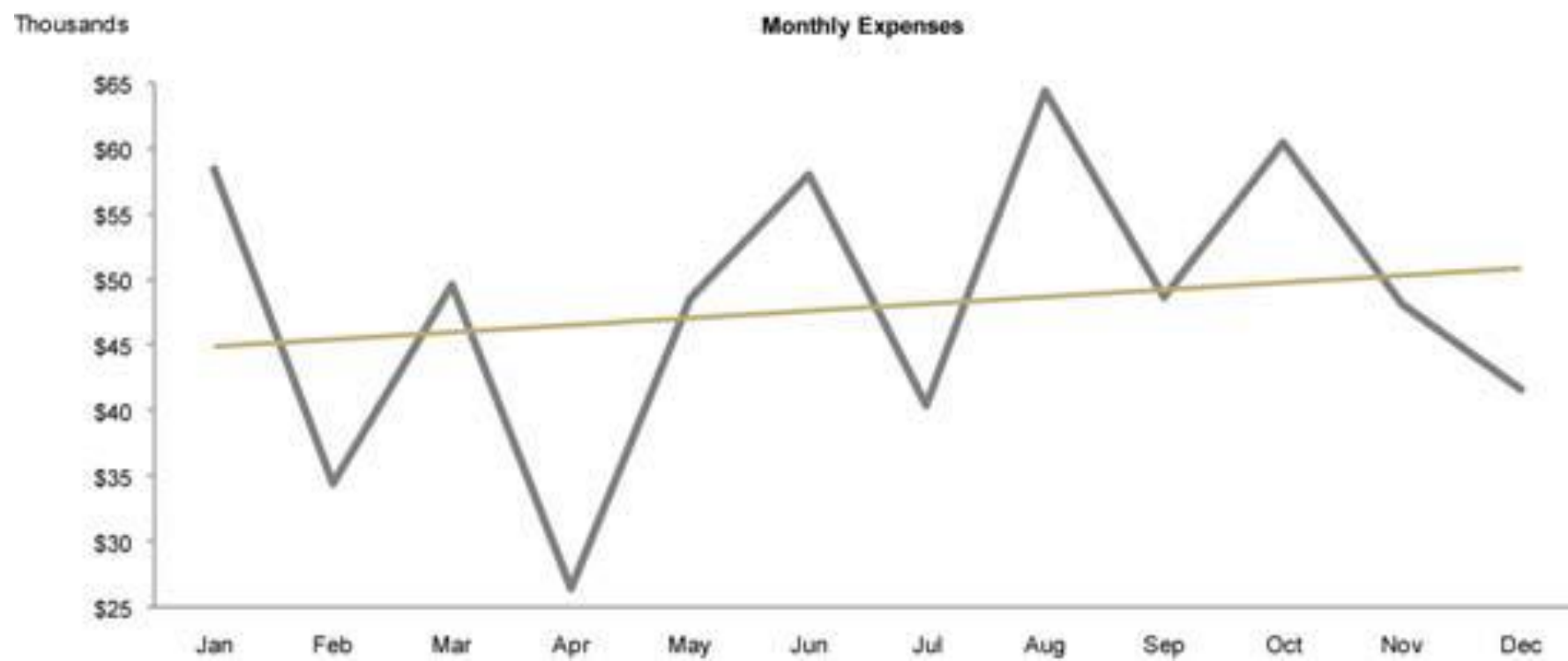




# Dot plots for irregular intervals

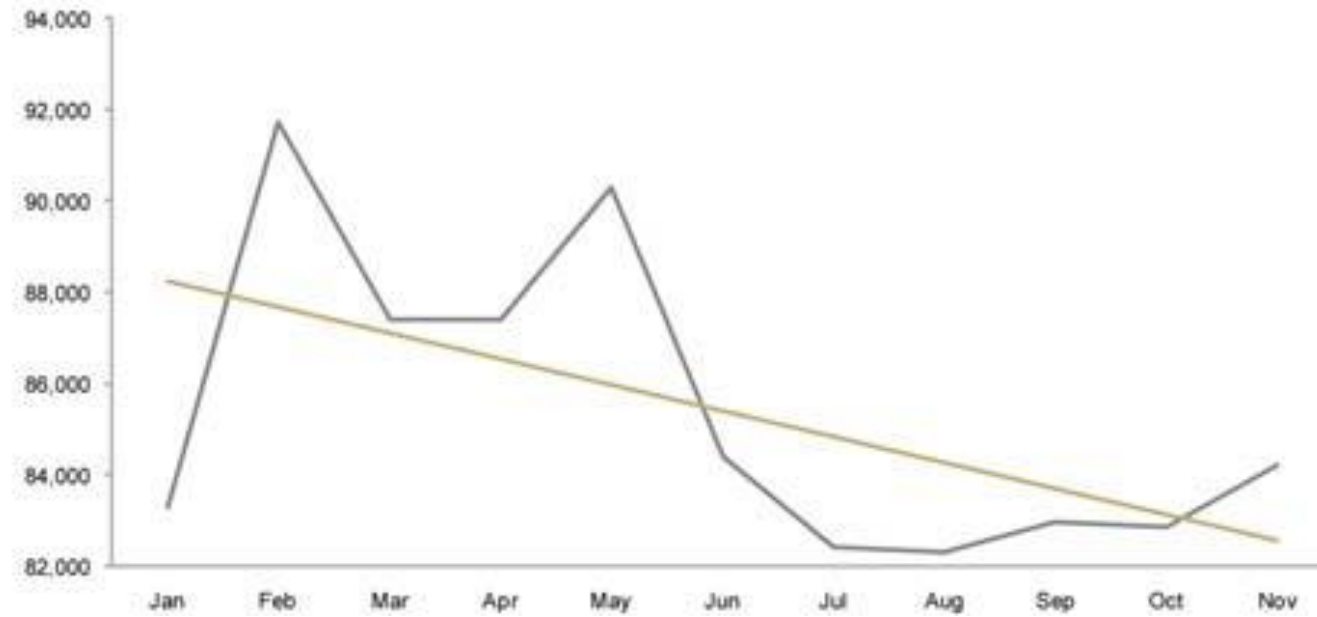






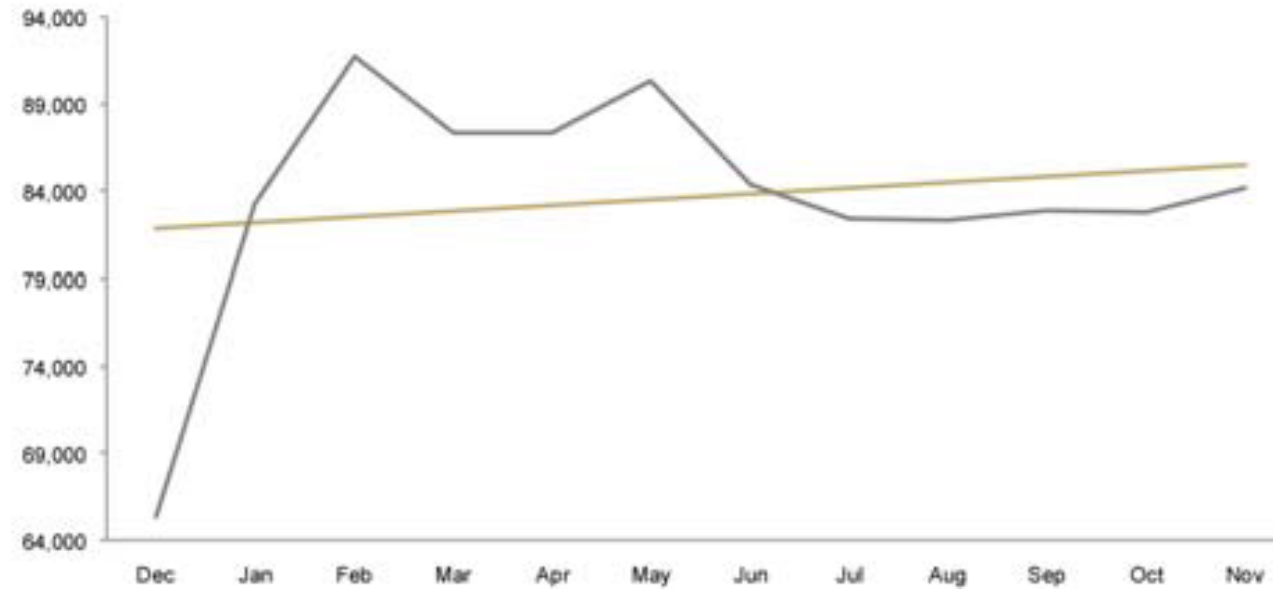
U.S. Dollars

2007 YTD Expenses



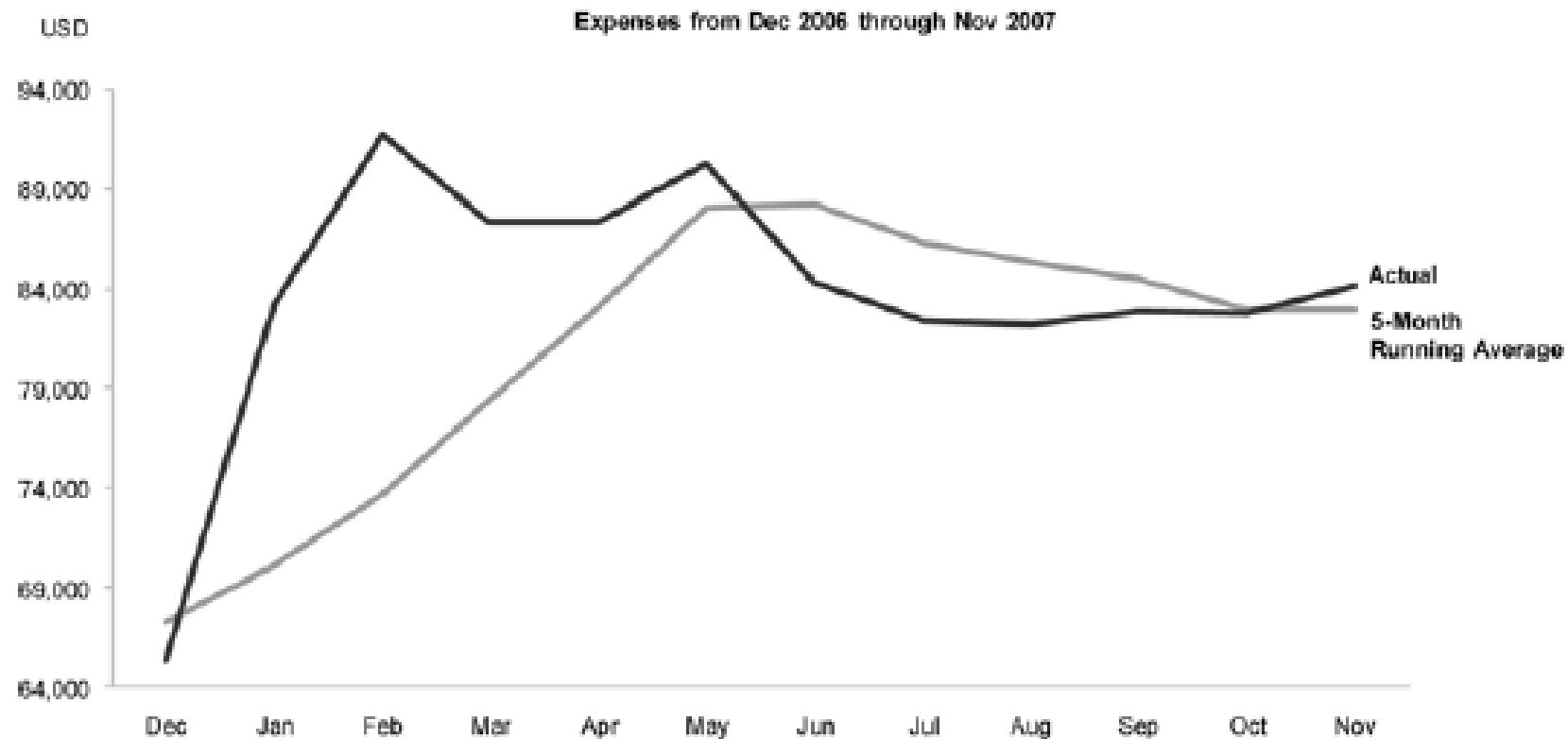
U.S. Dollars

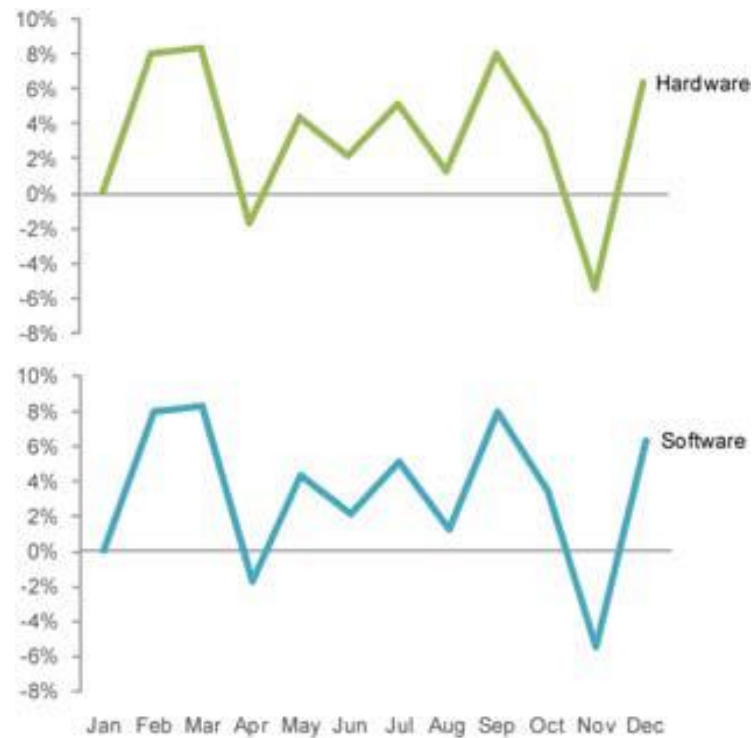
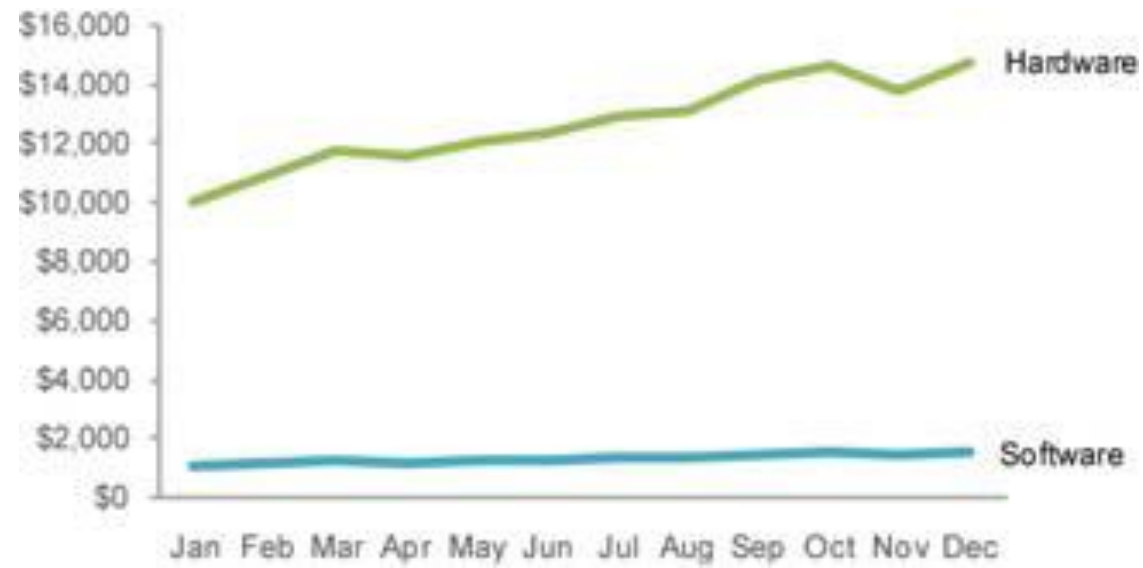
Last 12 Months of Expenses  
Dec 2006 - Nov 2007

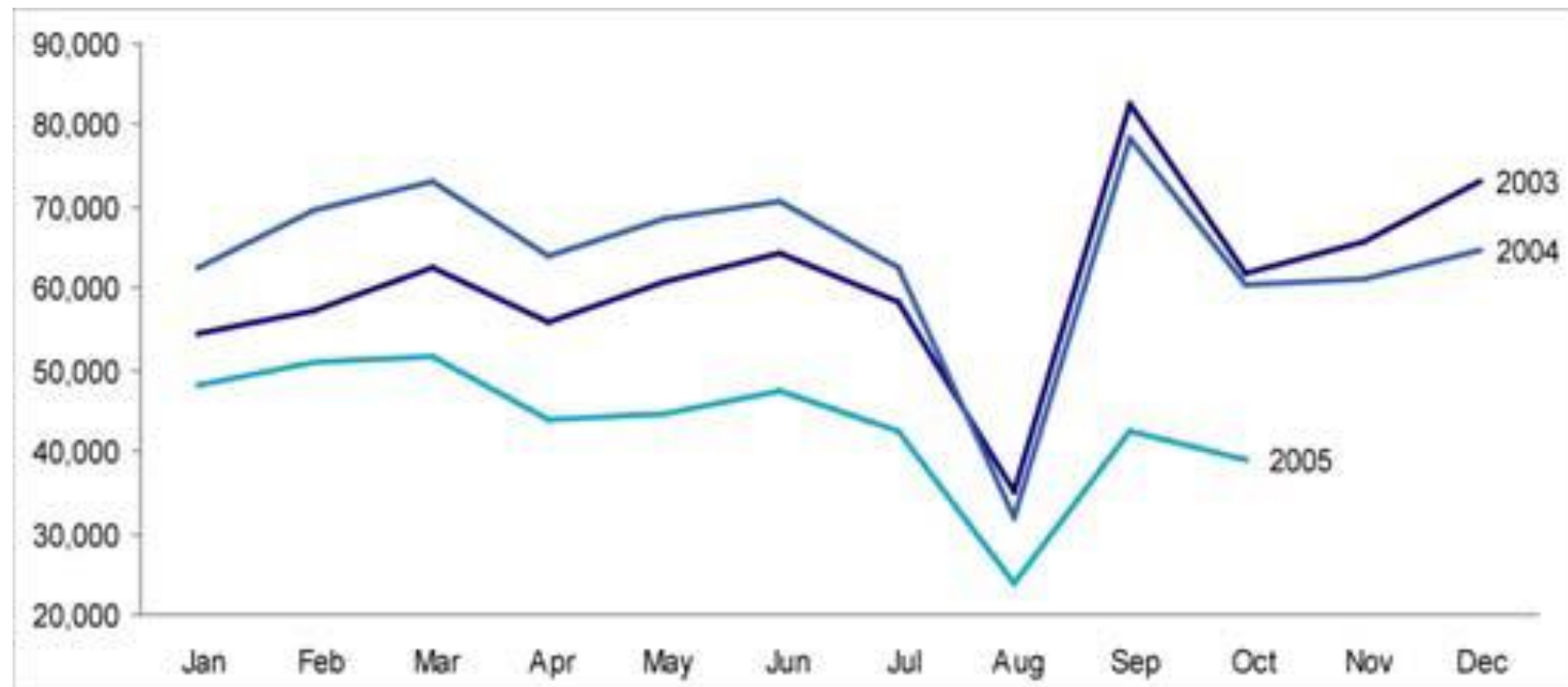
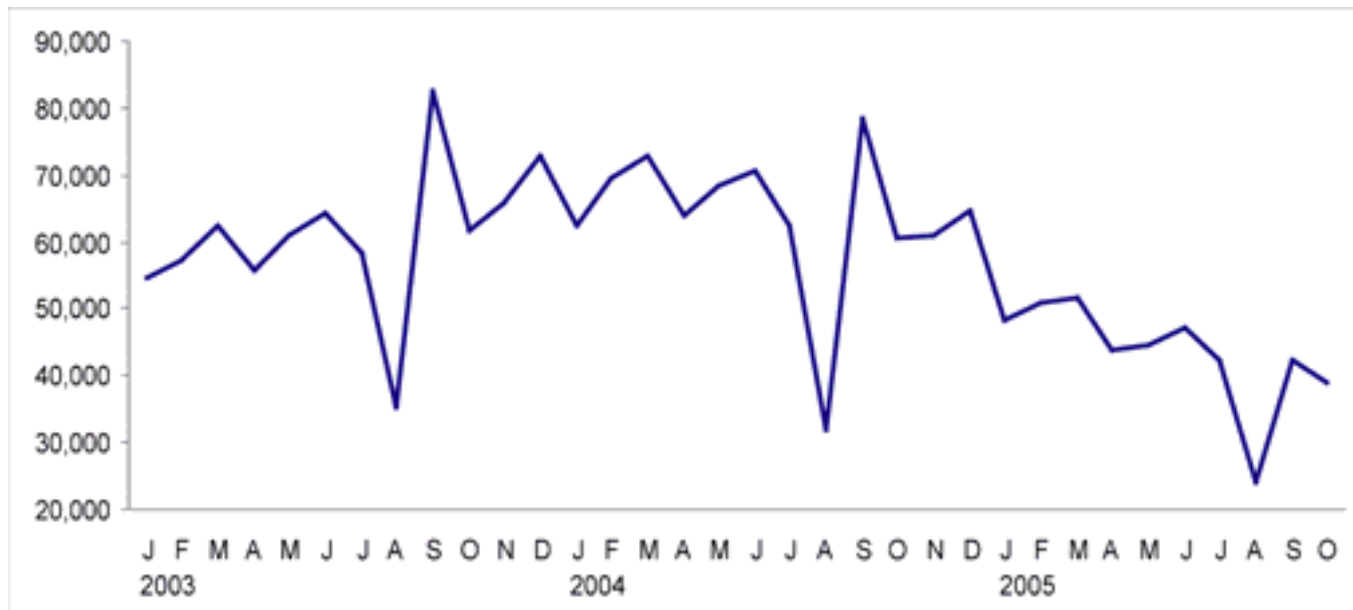


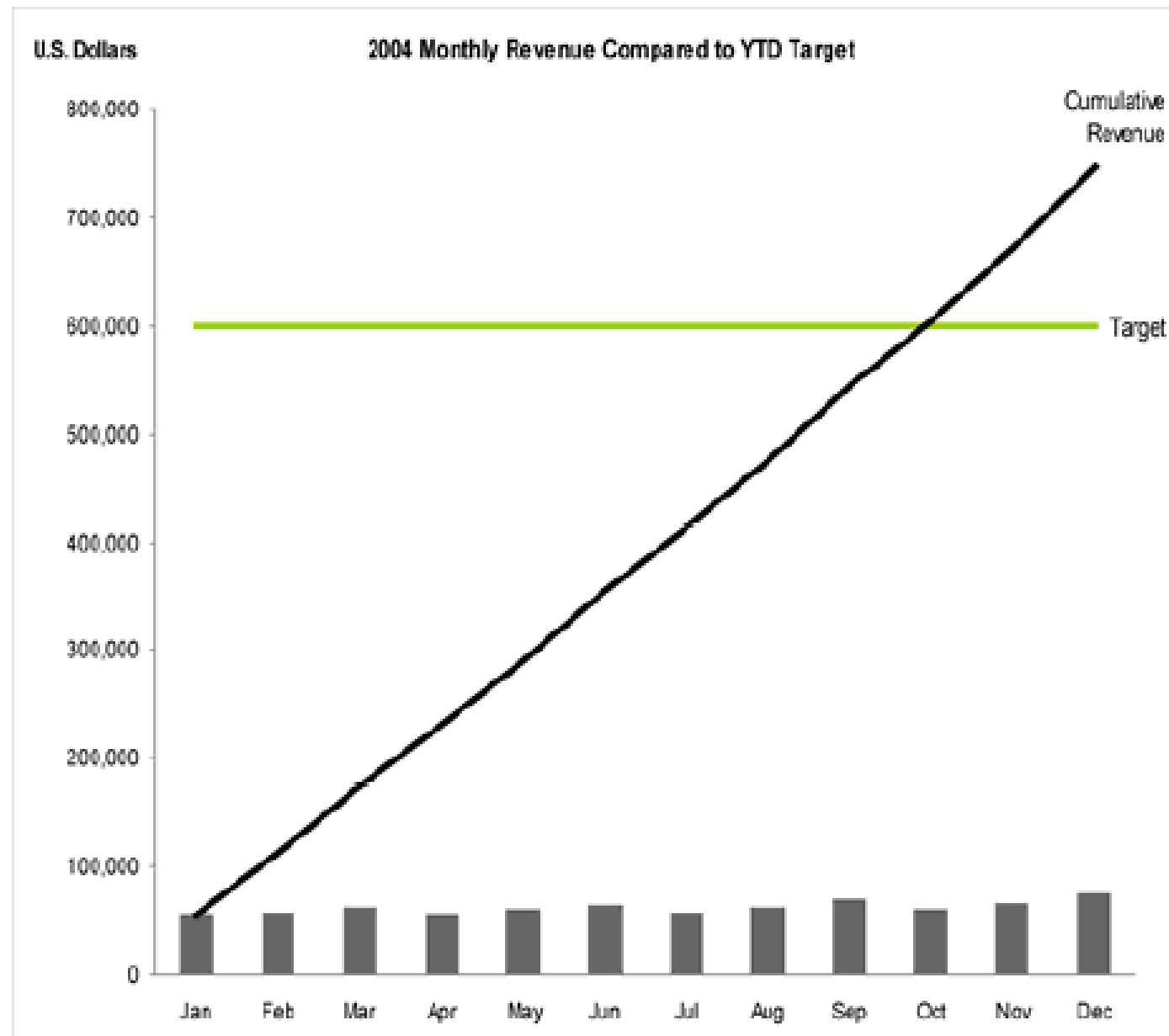


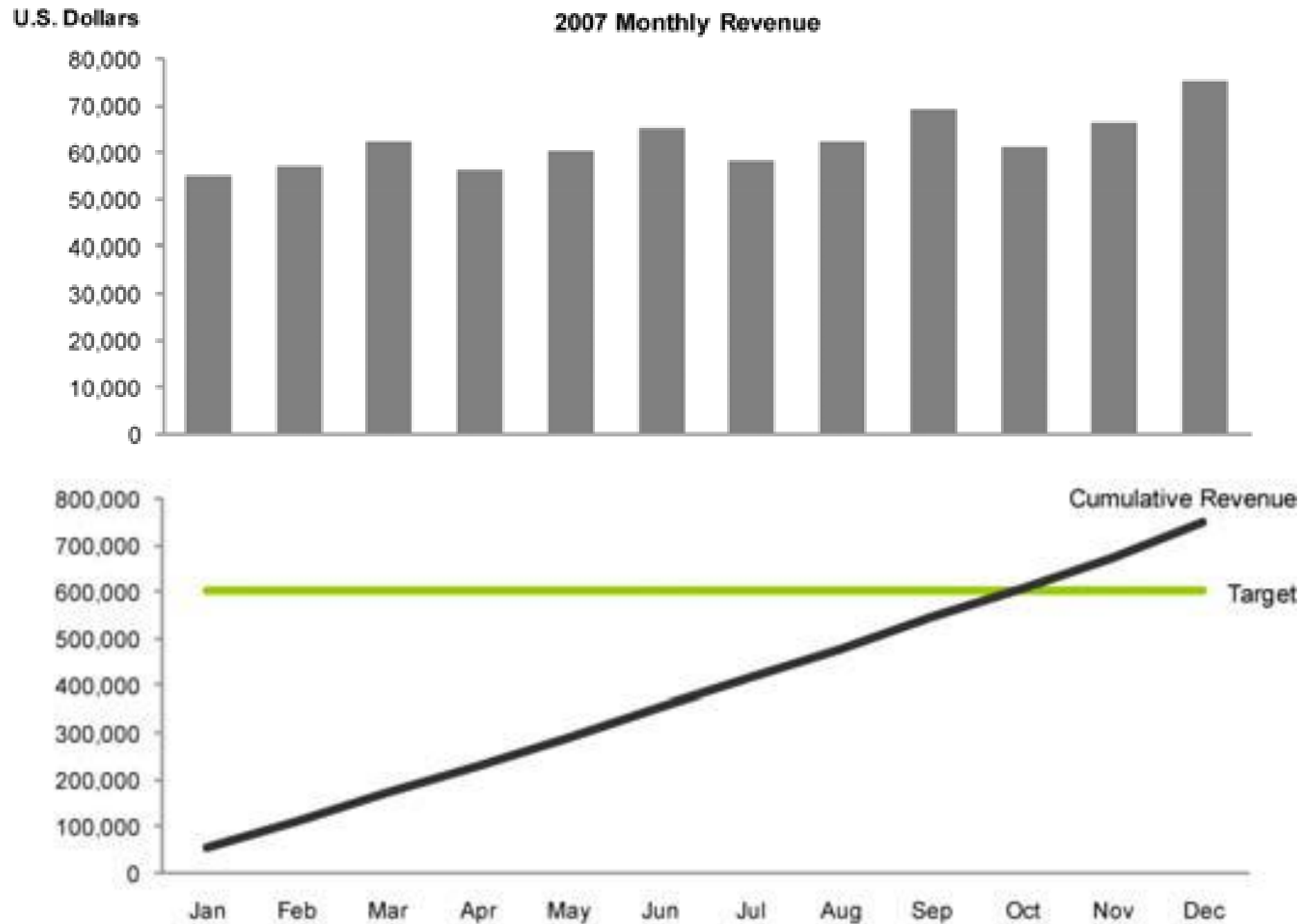
## Using running averages to smooth trends



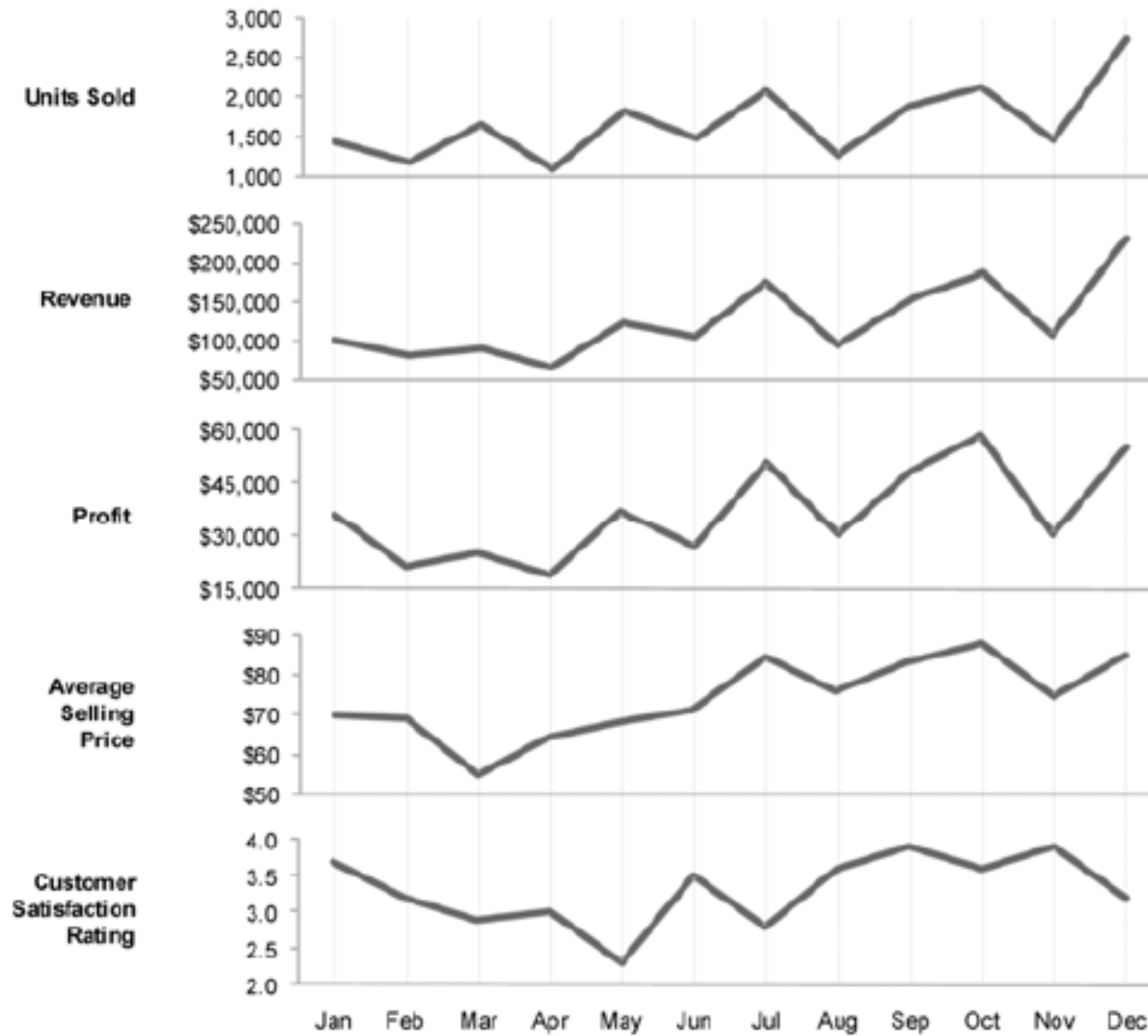


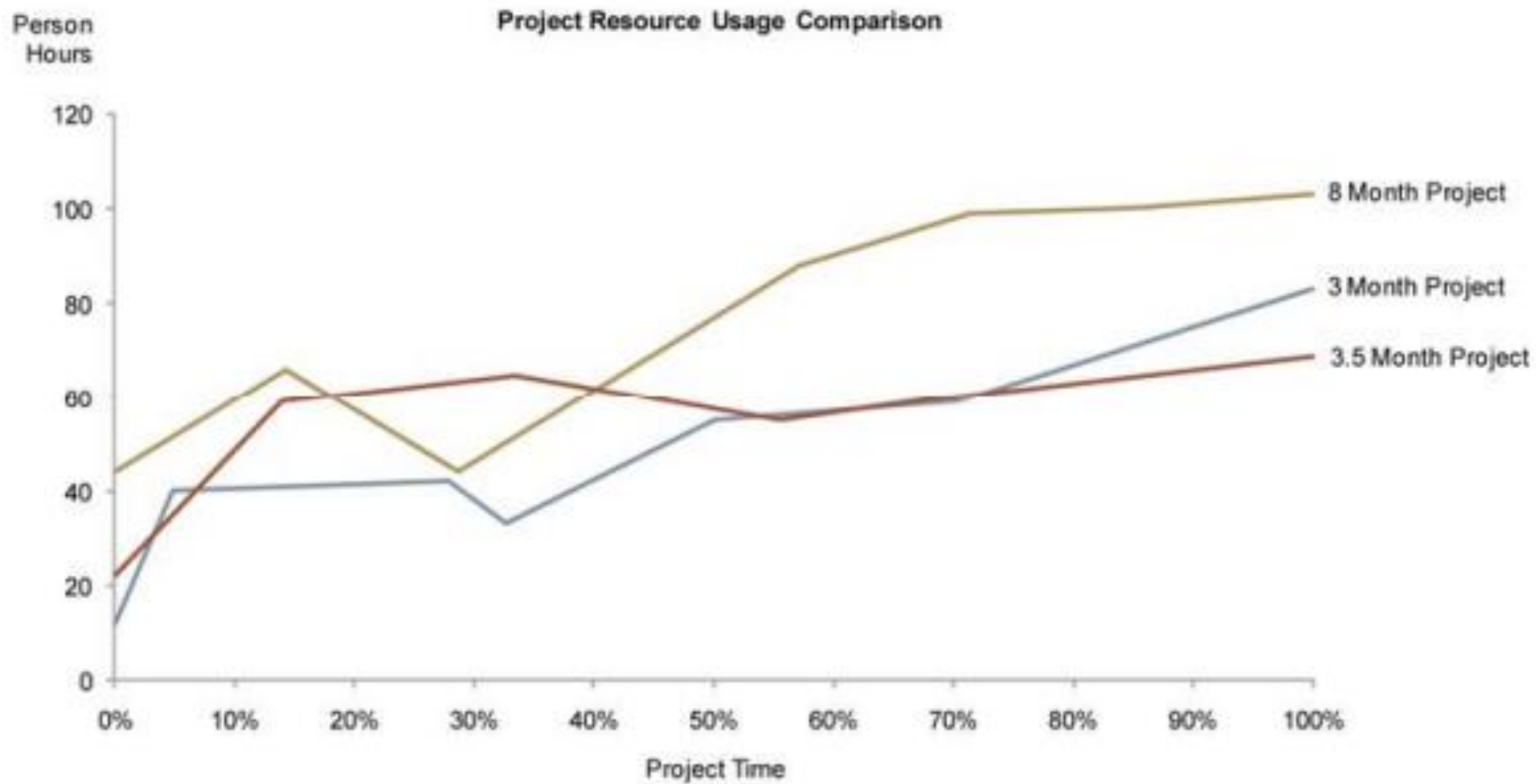






# Compare multiple related variables





# Lines

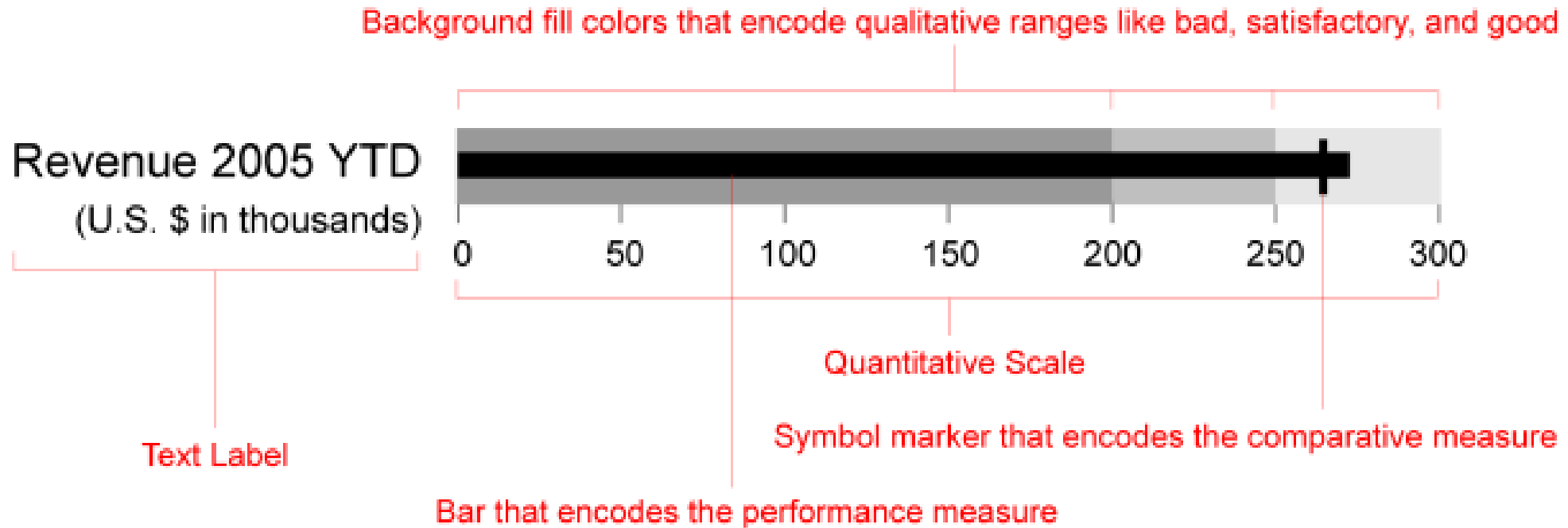
- Trend
- Straightforward
- Pattern
- Sequence
- Seasonality
- Time



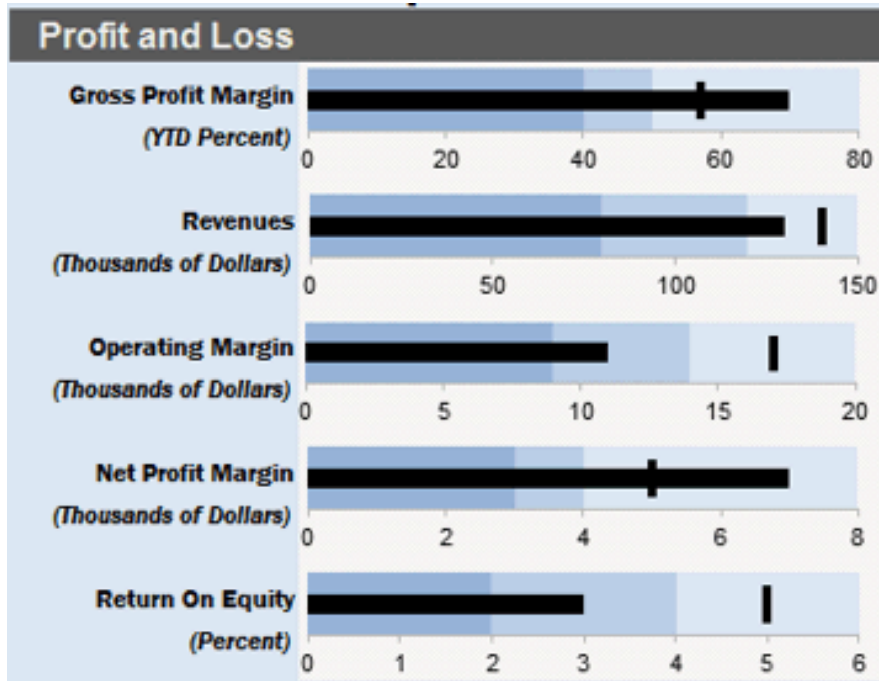
# Deviation: 2 Measures

Actual Vs Plan (Target)

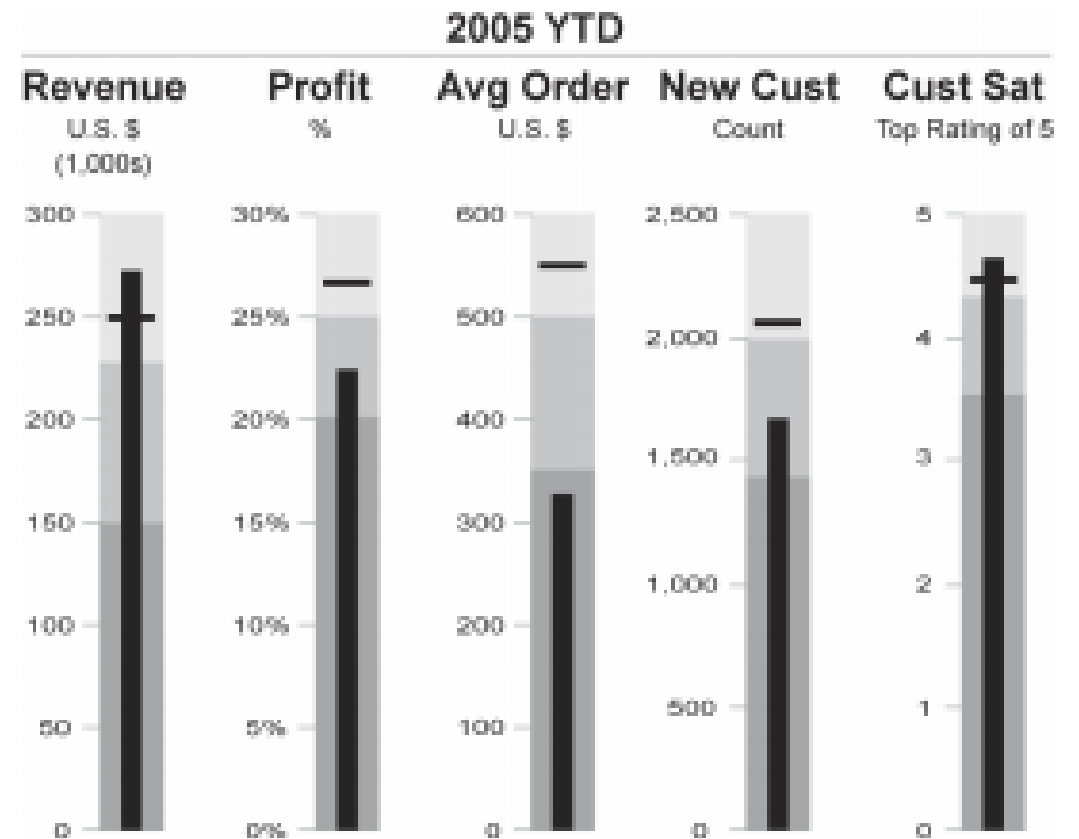
# Bullet Charts



# Bullet Charts

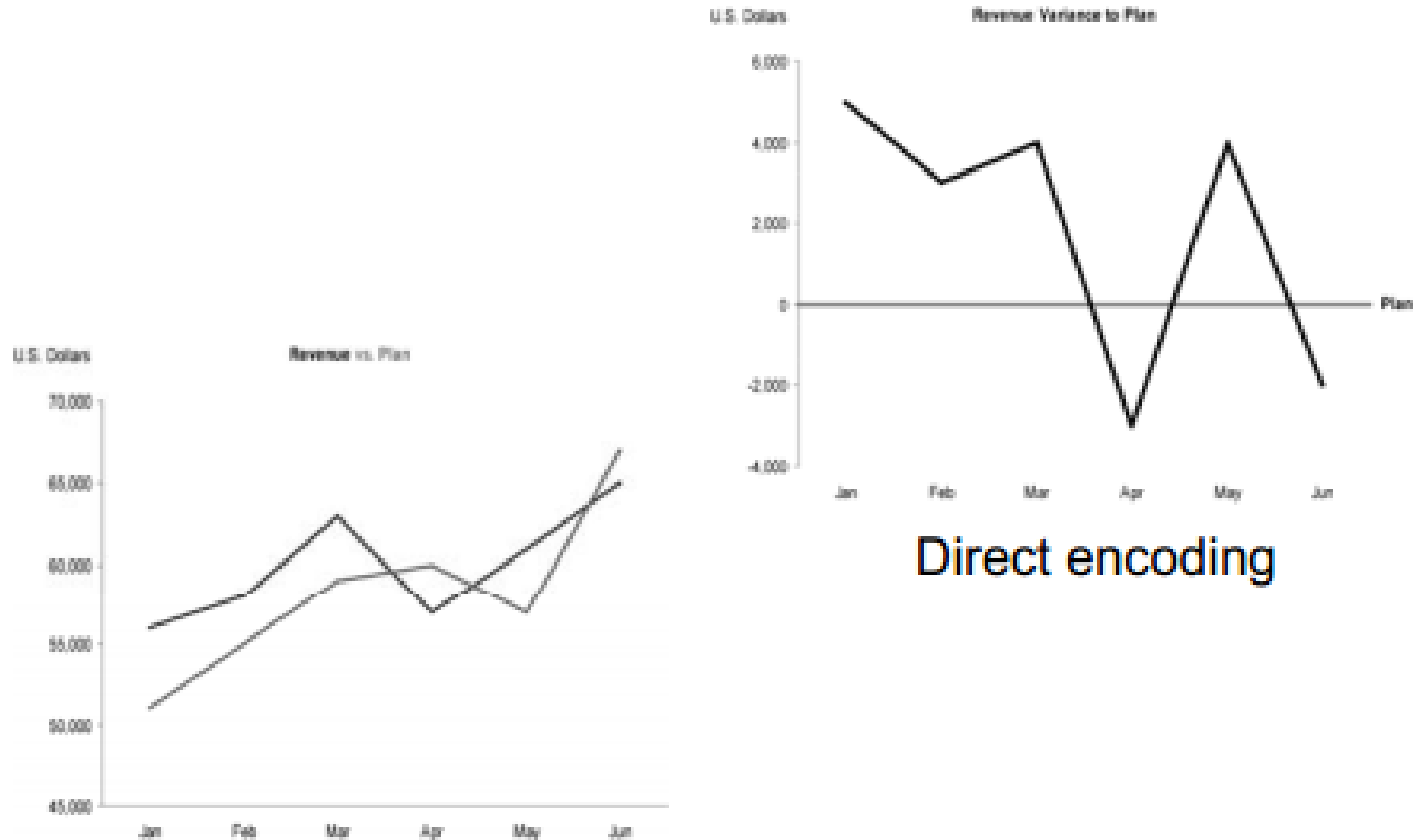


Source: [http://exceluser.com/excel\\_dashboards/bullet-graph.htm](http://exceluser.com/excel_dashboards/bullet-graph.htm)



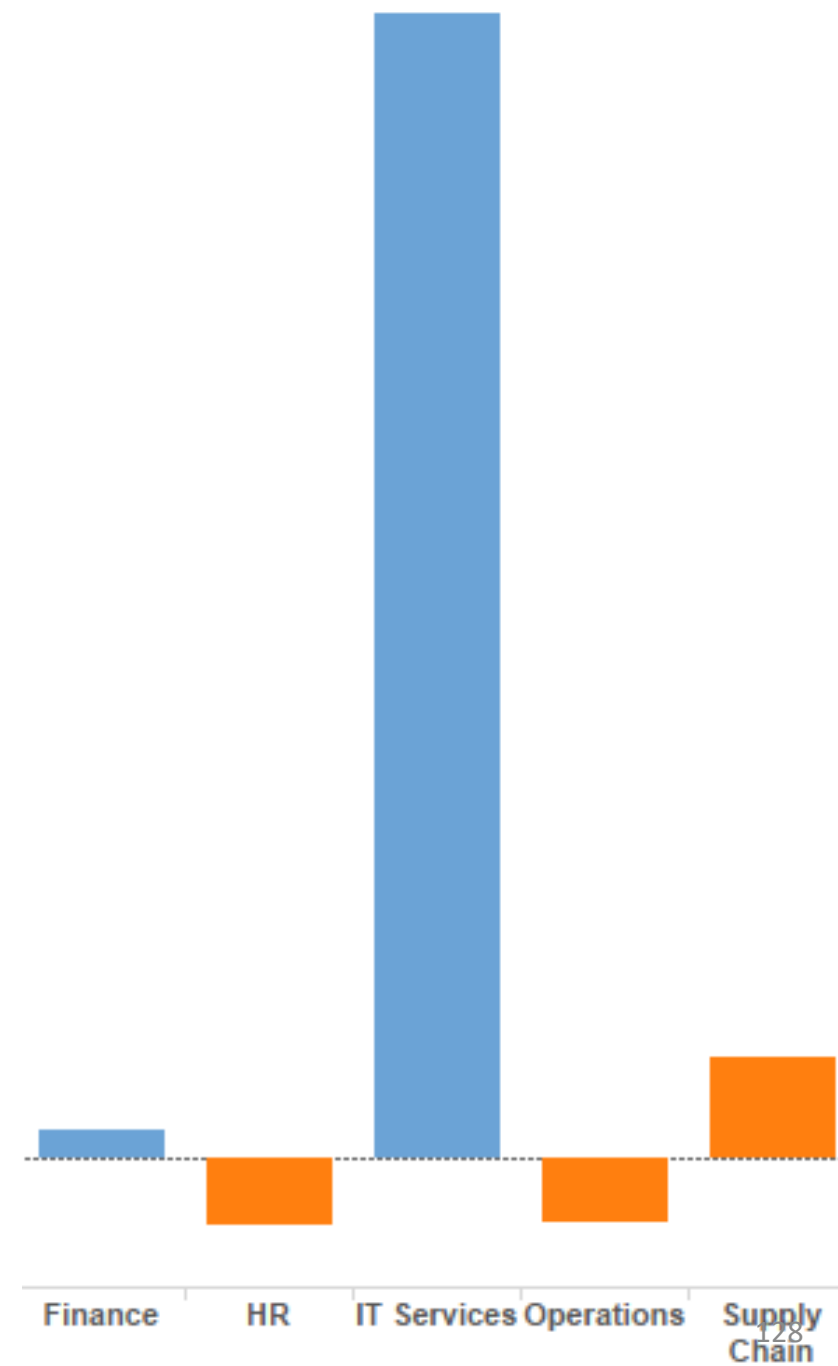
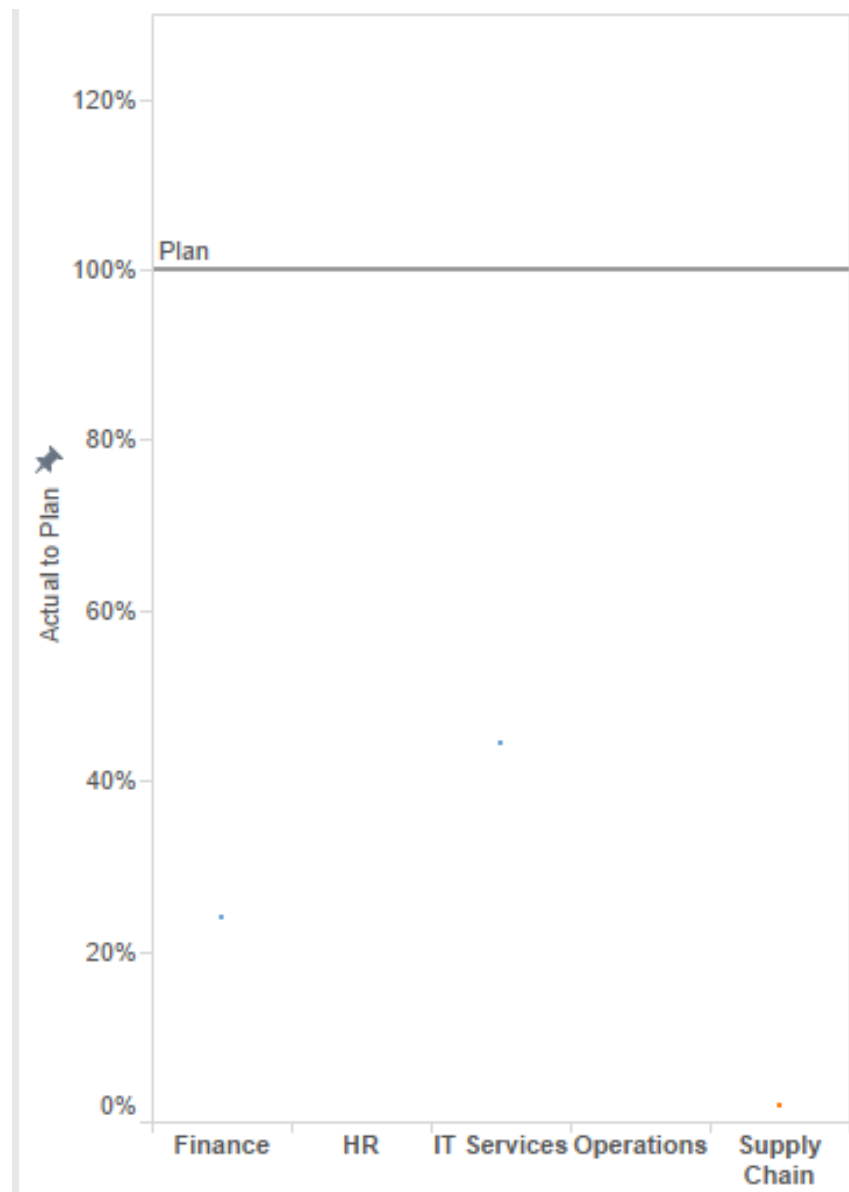
Source: [http://www.bioteams.com/2010/10/08/transform\\_your\\_online.html](http://www.bioteams.com/2010/10/08/transform_your_online.html)

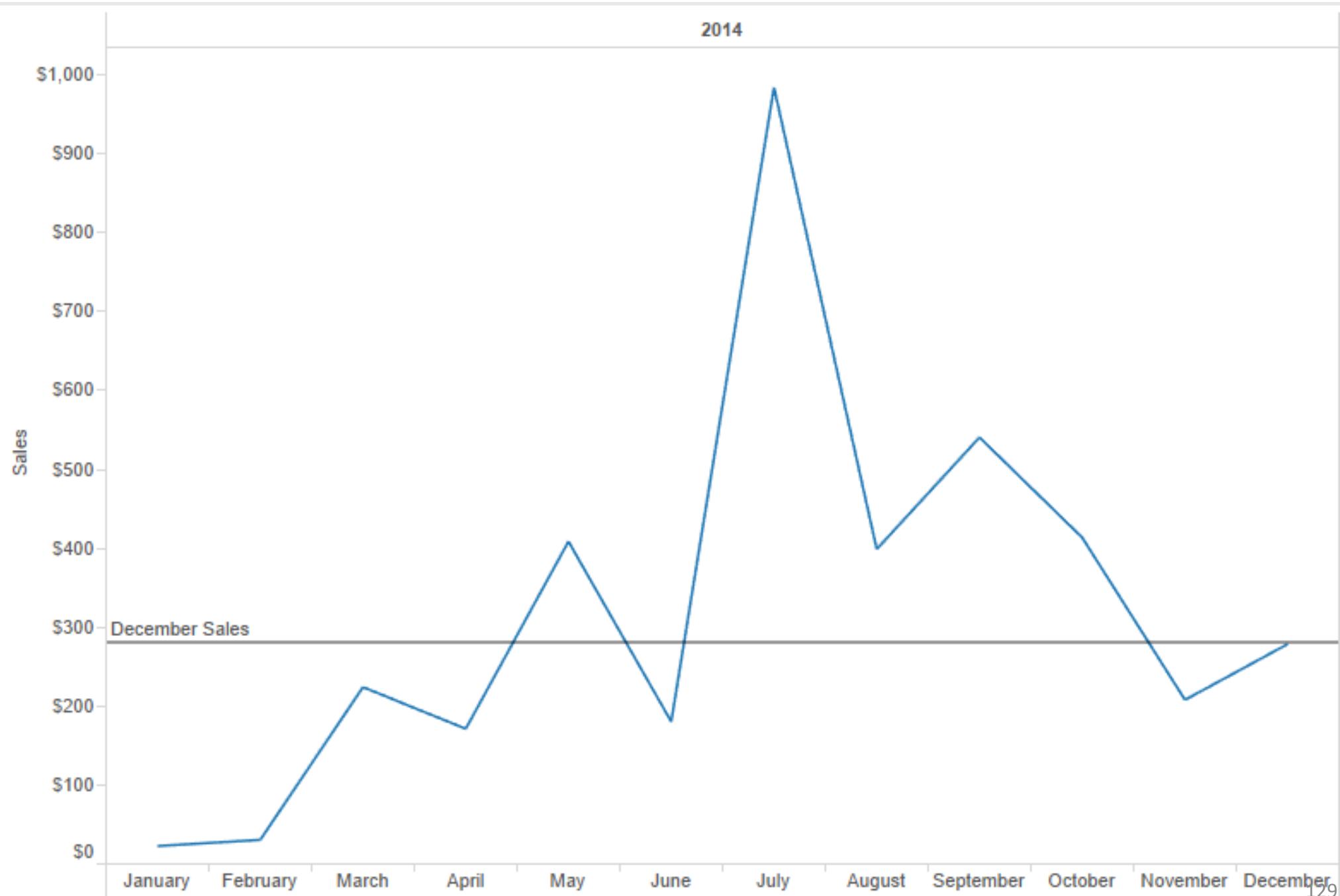
# Deviations



Direct encoding

Indirect encoding

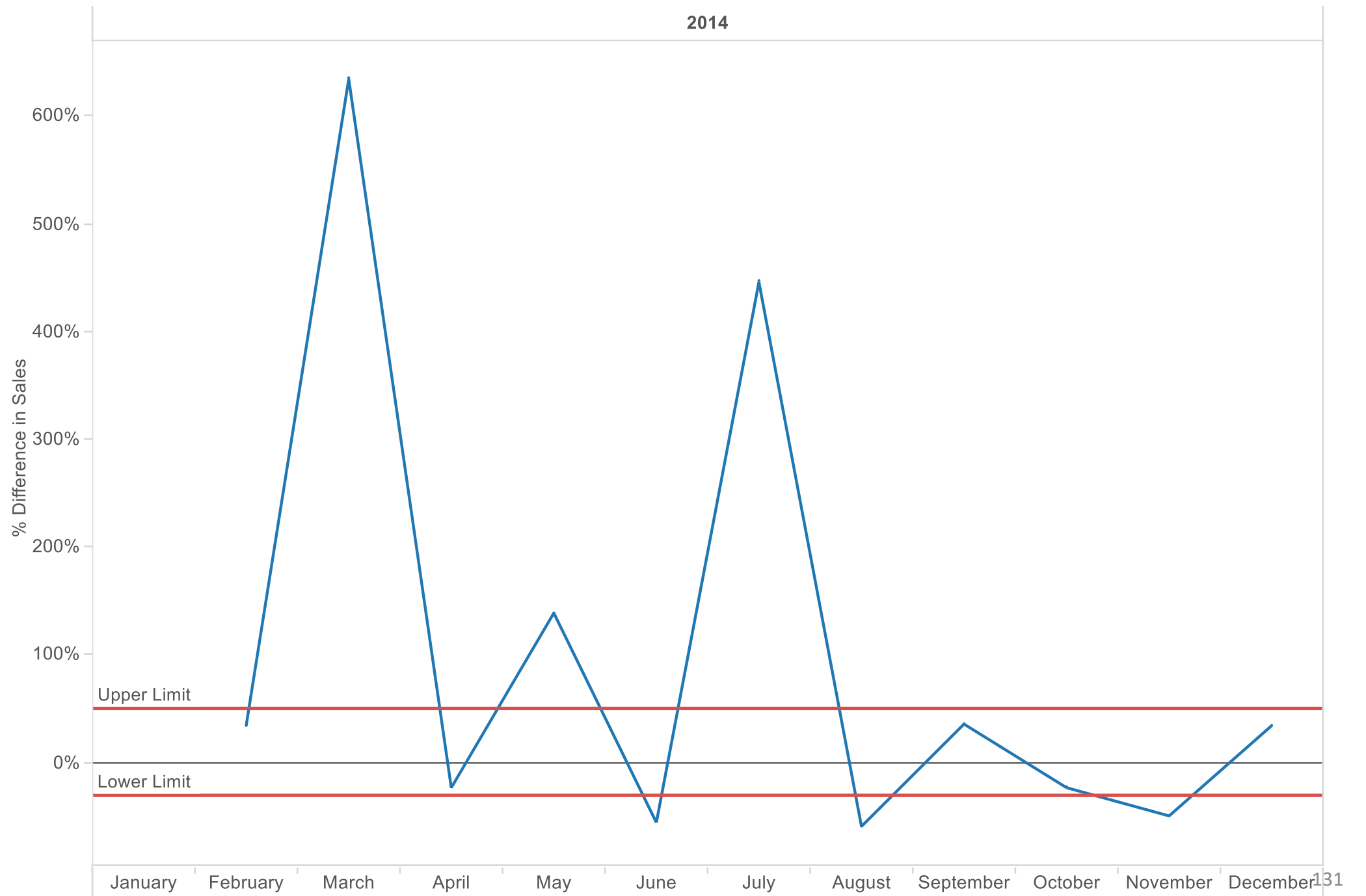




# Deviations



2014





# Deviation

- Plan to Actual
- Ranges
- Rate of Change
- Comparison
- Normalizing
- Variance
- Reference Lines