

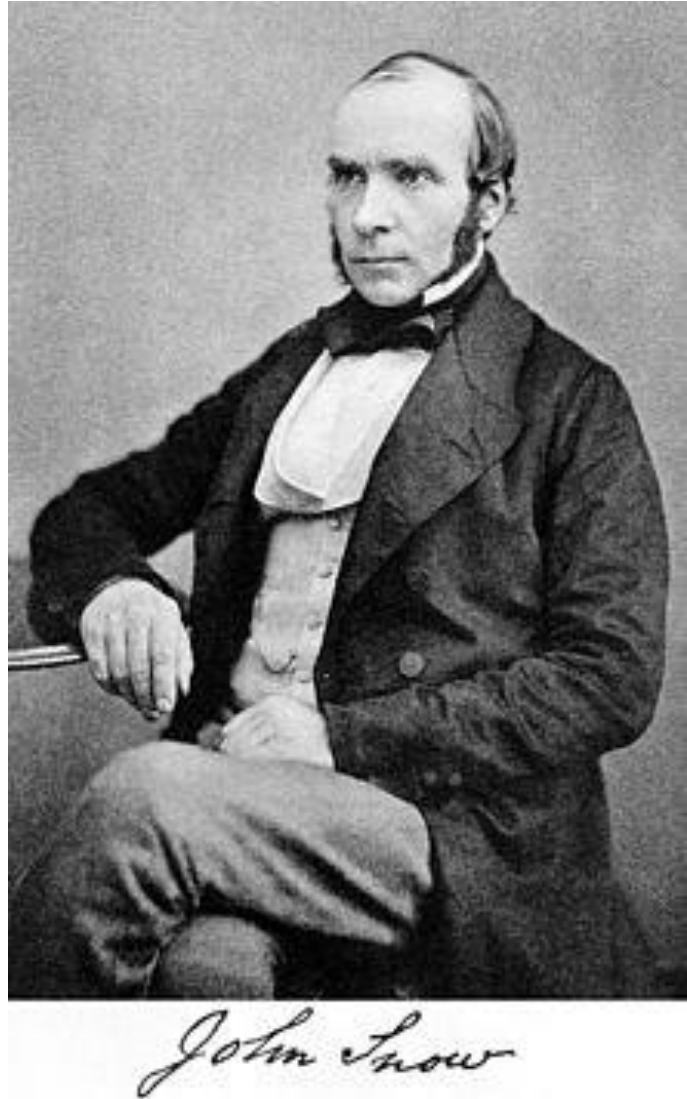
# Data Management for Data Science

Lecture 24: Data Visualization

Prof. Asoc. Endri Raço



# John Snow



**Hypothesis at the time:**  
Diseases such as cholera and bubonic plague are caused by pollution or a noxious form of "bad air".

**John Snow's Research:**  
The source of the outbreak was the public water pump  
[On the Mode of Communication of Cholera]

# How did he do it?

Death/Survival in cholera in  
19th century London by  
district and water company.

St. Savior, Southwark	1	0	19211
St. Savior, Southwark	1	1	406
St. Savior, Southwark	2	0	14129
St. Savior, Southwark	2	1	72
St. Olave, Southwark	1	0	18361
St. Olave, Southwark	1	1	277
St. Olave, Southwark	2	0	0
St. Olave, Southwark	2	1	0
St. George, Southwark	1	0	24651
St. George, Southwark	1	1	388
St. George, Southwark	2	0	23613
St. George, Southwark	2	1	99
Bermondsey	1	0	57063
Bermondsey	1	1	821
Bermondsey	2	0	1785
Bermondsey	2	1	0
Newington	1	0	31482
Newington	1	1	458
Newington	2	0	33473
Newington	2	1	58
Lambeth	1	0	54457
Lambeth	1	1	525
Lambeth	2	0	83648
Lambeth	2	1	138
Wandsworth	1	0	18122
Wandsworth	1	1	268
Wandsworth	2	0	3863
Wandsworth	2	1	7
Campberwell	1	0	23120
Campberwell	1	1	352
Campberwell	2	0	10445
Campberwell	2	1	33
Rotherhithe	1	0	14744
Rotherhithe	1	1	207
Rotherhithe	2	0	0
Rotherhithe	2	1	0

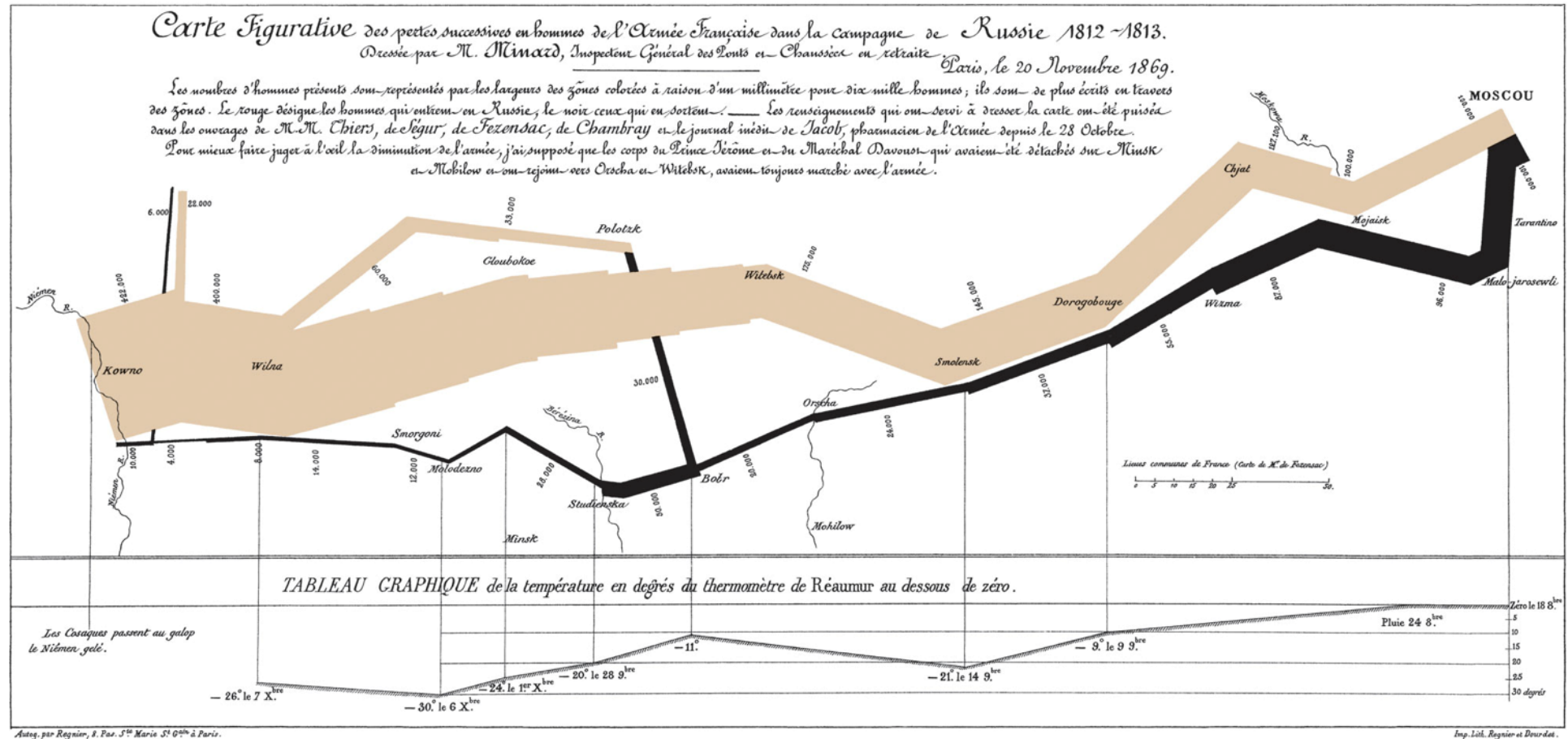
# How did he do it?



Snow's **data visualization** study is regarded as the founding event of the science of epidemiology.



# Charles Joseph Minard 1869 Napoleon's March



According to Tufte: "It may well be the best statistical graphic ever drawn."

5 variables: Army Size, location, dates, direction, temperature during retreat

<https://news.nationalgeographic.com/2017/03/charles-minard-cartography-infographics-history/>

# Interactivity to Educate

- The famous Gapminder Video, Hans Rosling:  
200 Countries, 200 Years, 4 Minutes
- [https://www.youtube.com/watch?feature=player\\_embedded&v=jbkSRLYSojo](https://www.youtube.com/watch?feature=player_embedded&v=jbkSRLYSojo)

# Outline

## Visualization:

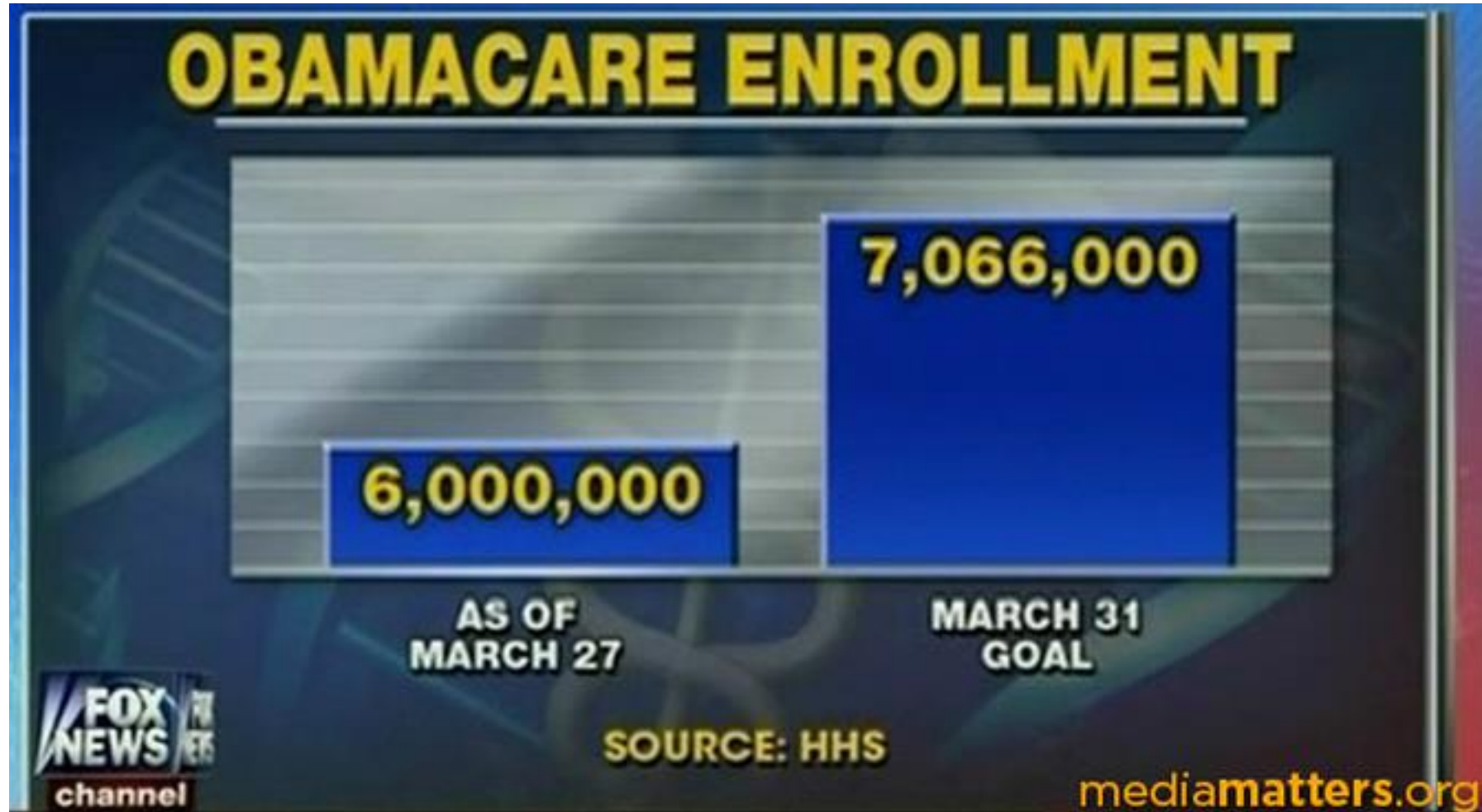
- Some great examples
- Some counter-examples
- Principles for Visualization Design
- Visualization Toolkits preview



# Some Anti-Examples

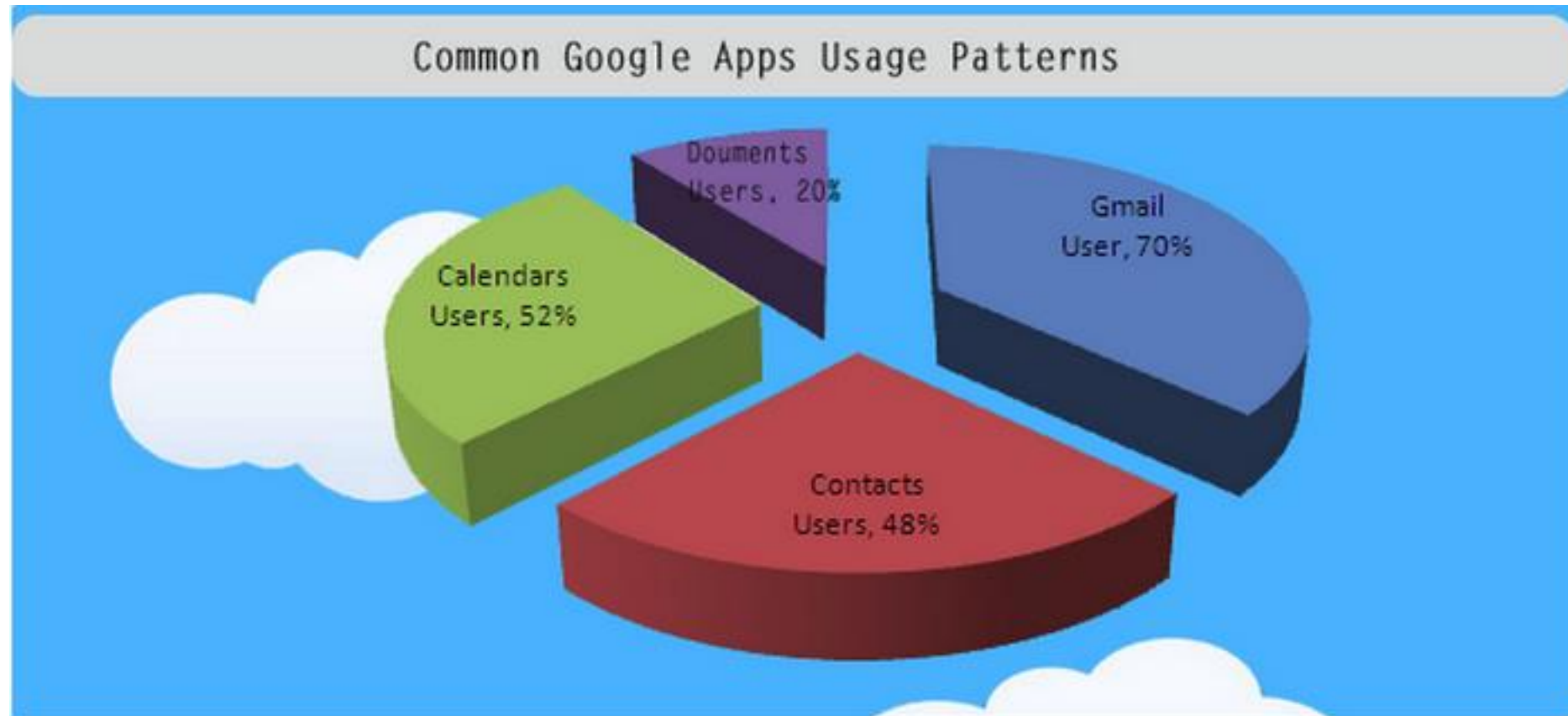
- Courtesy of WTFViz.net

# Visualization to Educate?



from wtfviz.net

# Pie in the Sky?



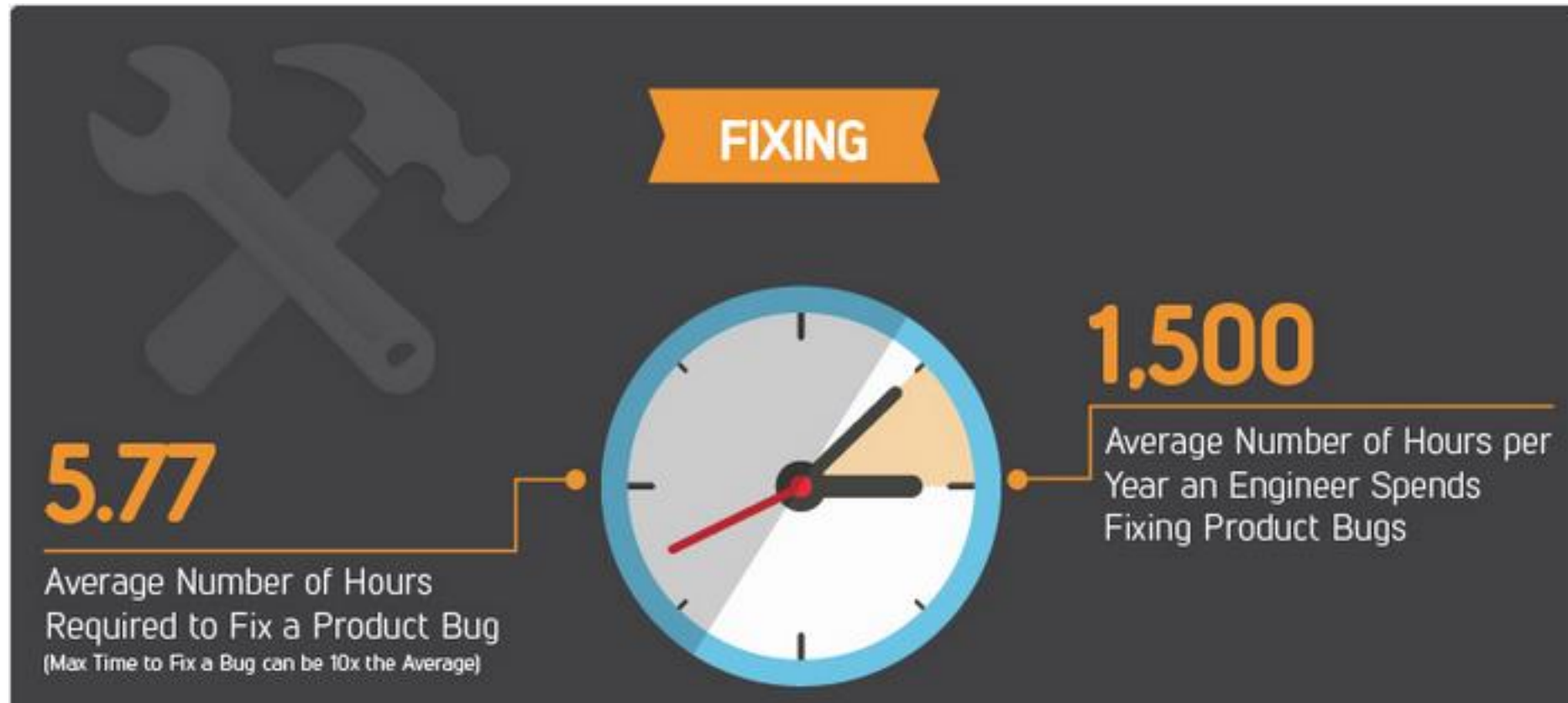
from wtfviz.net

90% of US Households Consume Peanut Butter



from wtfviz.net

# Needs Fixing



# Outline

## Visualization:

- Some great examples
- Some counter-examples
- Principles for Visualization Design
- Visualization Toolkits preview

# Visualization Definitions

- “Transformation of the symbolic into the geometric”  
[McCormick et al. 1987]
- “... finding the artificial memory that best supports our natural means of perception.” [Bertin 1967]
- “The use of computer-generated, interactive, visual representations of data to amplify cognition.”  
[Card, Mackinlay, & Shneiderman 1999]



# Uses for Data Viz

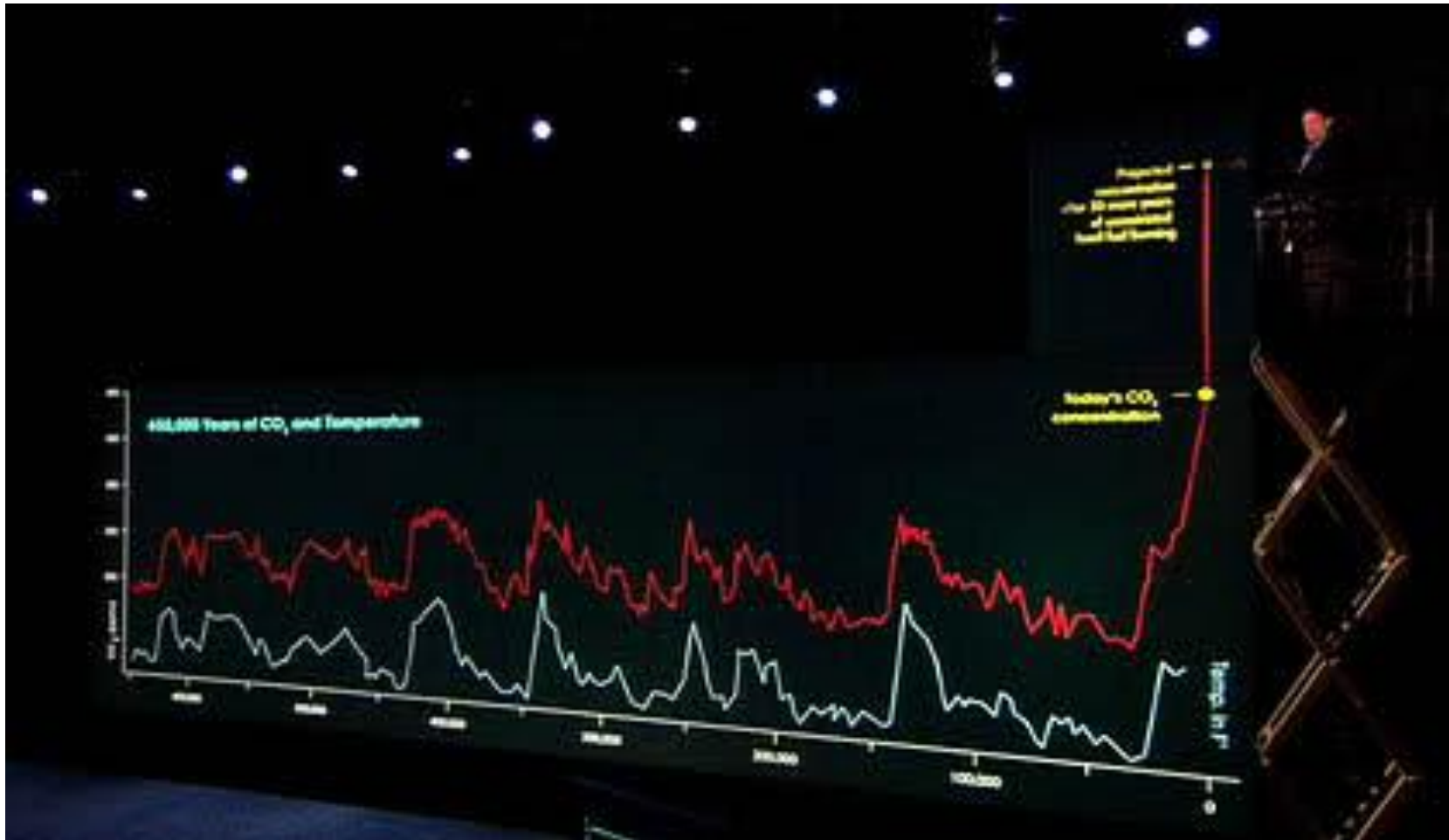
## A: Support reasoning about information (analysis)

- Finding relationships
- Discover structure
- Quantifying values and influences
- Should be part of a query/analyze cycle

## B: Inform and persuade others (communication)

- Capture attention, engage
- Tell a story visually
- Focus on certain aspects, and omit others

# Uses for Data Viz

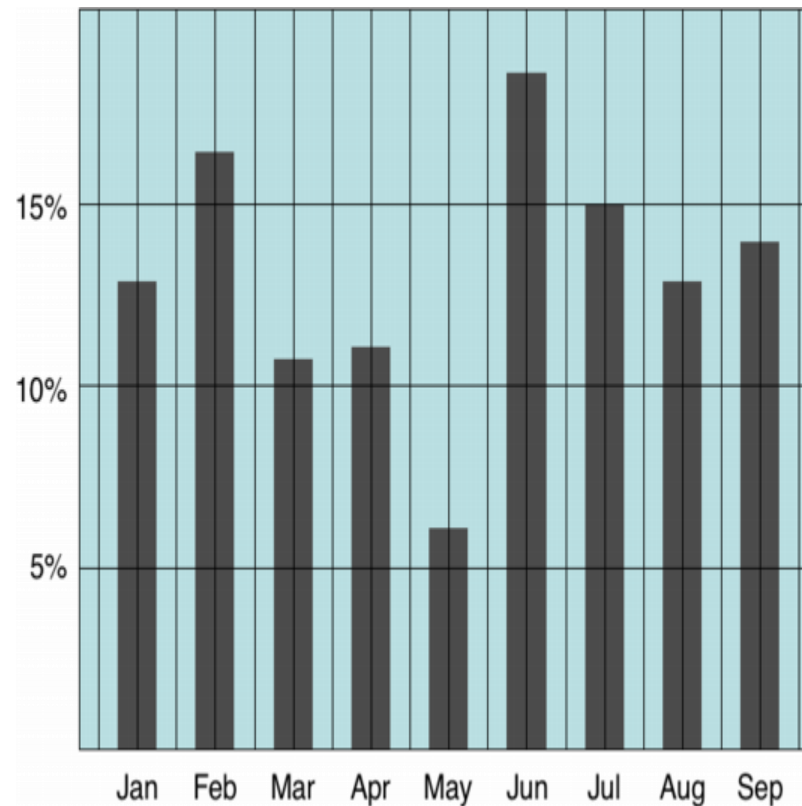


# Principle 1

- Simplify !

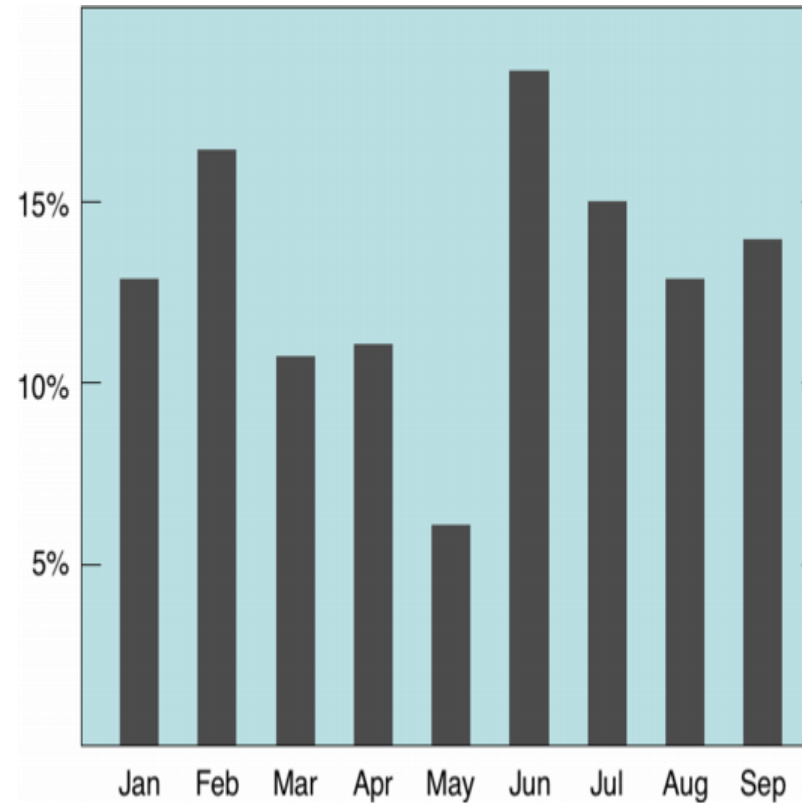
# Chart Design: Simplifying

- Example from Tim Bray



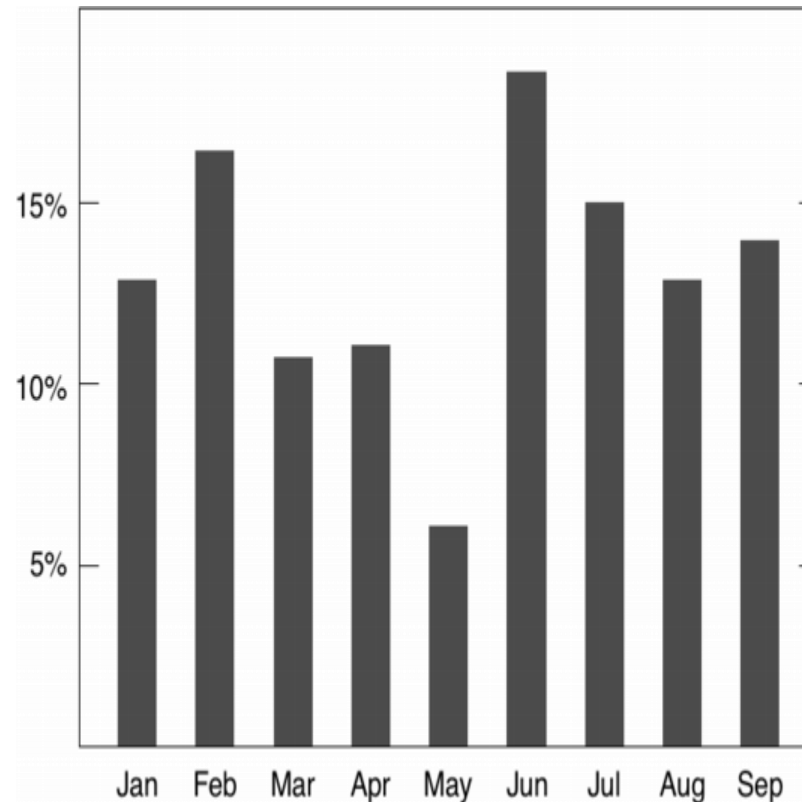
# Chart Design: Simplifying

- Example from Tim Bray



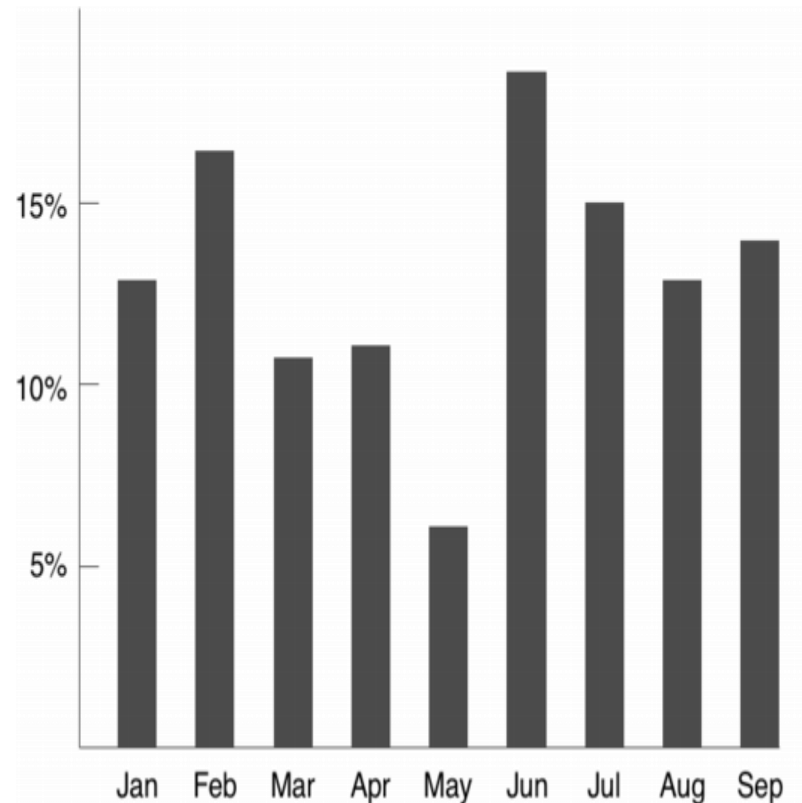
# Chart Design: Simplifying

- Example from Tim Bray



# Chart Design: Simplifying

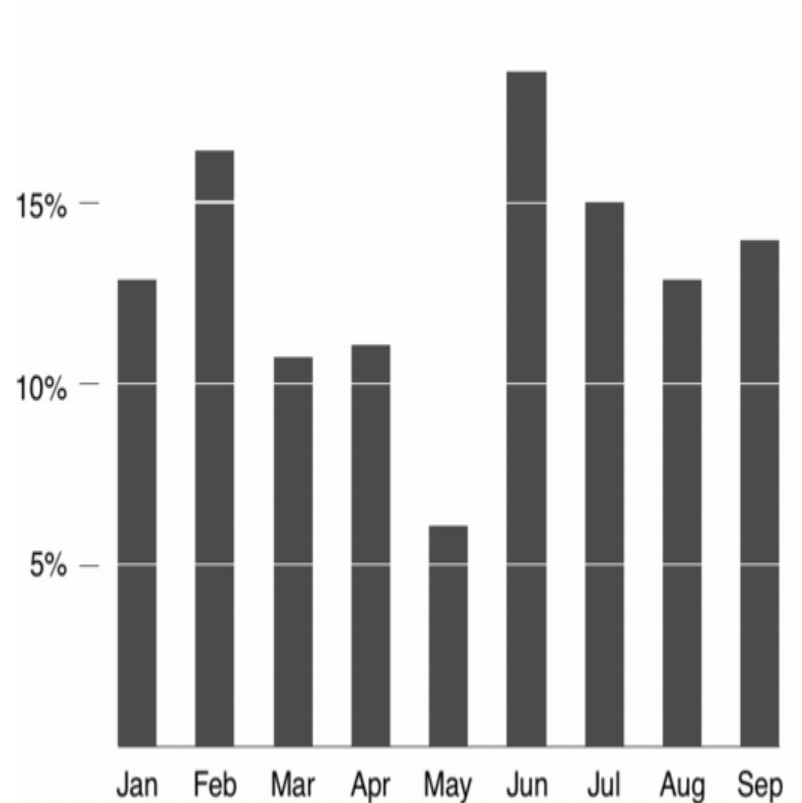
- Example from Tim Bray





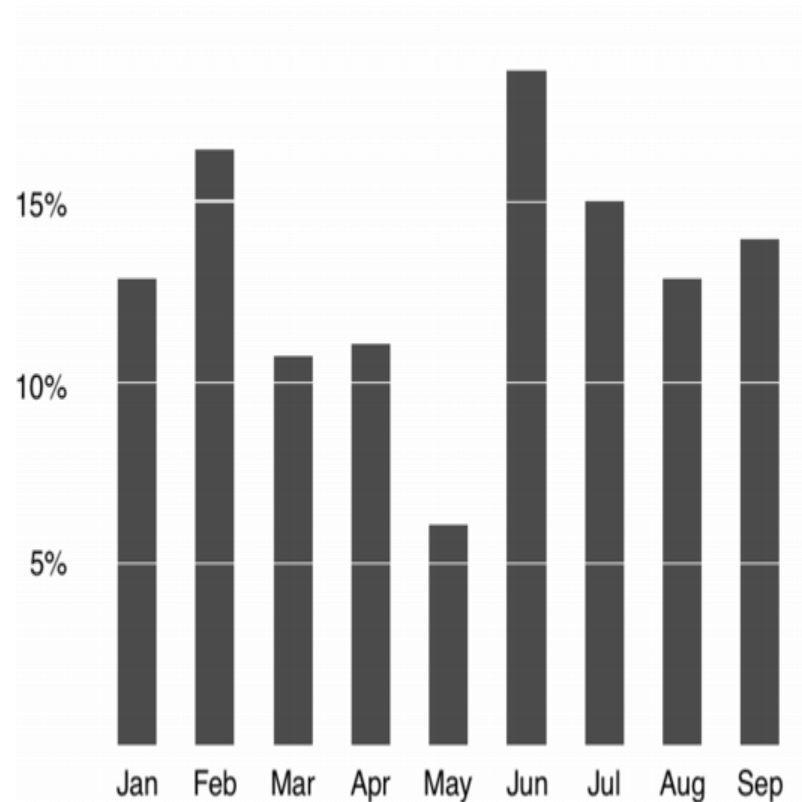
# Chart Design: Simplifying

- Example from Tim Bray



# Chart Design: Simplifying

- Example from Tim Bray

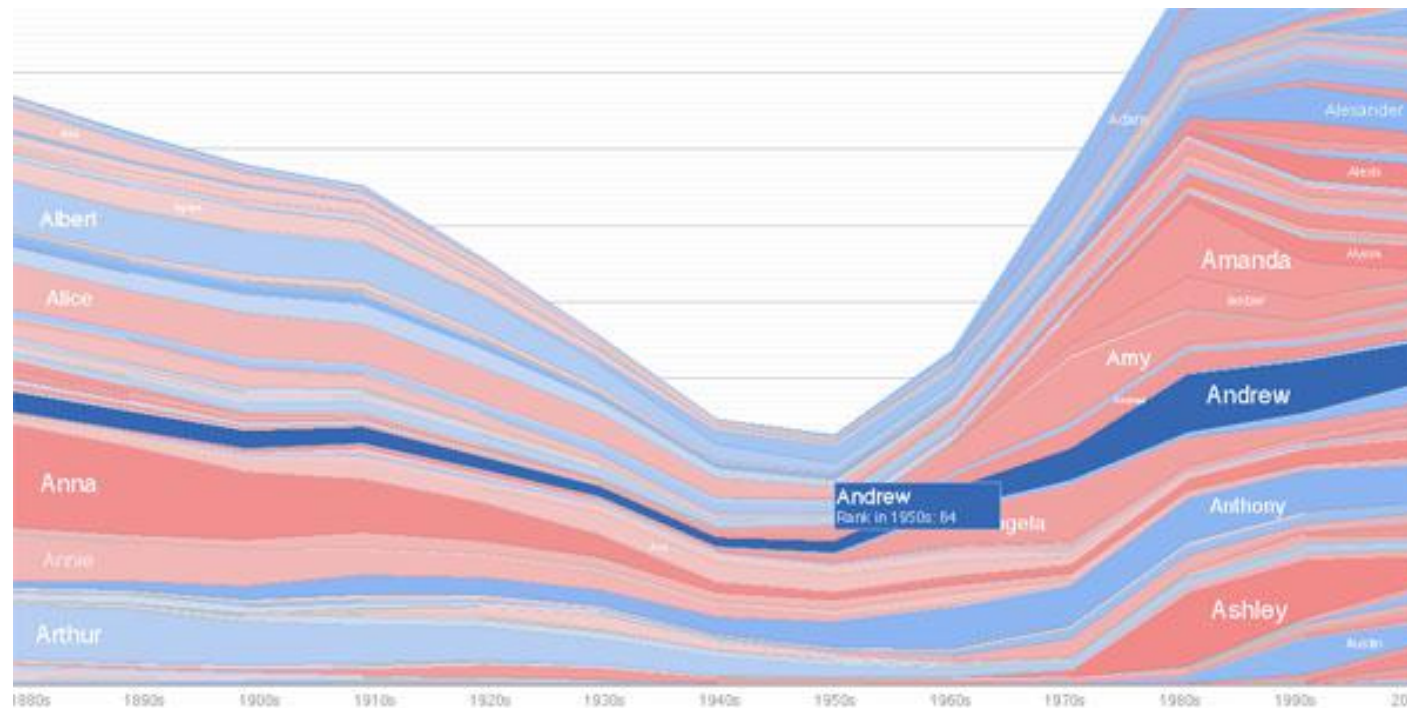


# Principle 1: Simplify

- Tables and charts
  - Reduce chartjunk/tablejunk; increase data-ink ratio
  - Lessons from perception: Limit the number of objects displayed at once
- Beware:
  - Gratuitous 3D
  - Shadows
  - Gratuitous animation
- How do you tell if a feature is gratuitous?  
Ask whether using it reveals more information.

# Interactive Chart Design: Simplifying

- With interactive charts you can keep things very simple by **hiding** and **dynamically revealing** important structure.
- On an interactive chart, you reveal the information most useful for **navigating** the chart.



# Principle 2: Understand Magnitudes



**Which is brighter?**

# Principle 2: Understand Magnitudes

**(128, 128, 128)**

**(144, 144, 144)**



**Which is brighter?**

# Just Noticeable Difference

- JND (Weber's Law)

$$\Delta S = k \frac{\Delta I}{I}$$

- Ratios more important than magnitude
- Most continuous variations in stimuli are perceived in discrete steps





# Steven's Power law

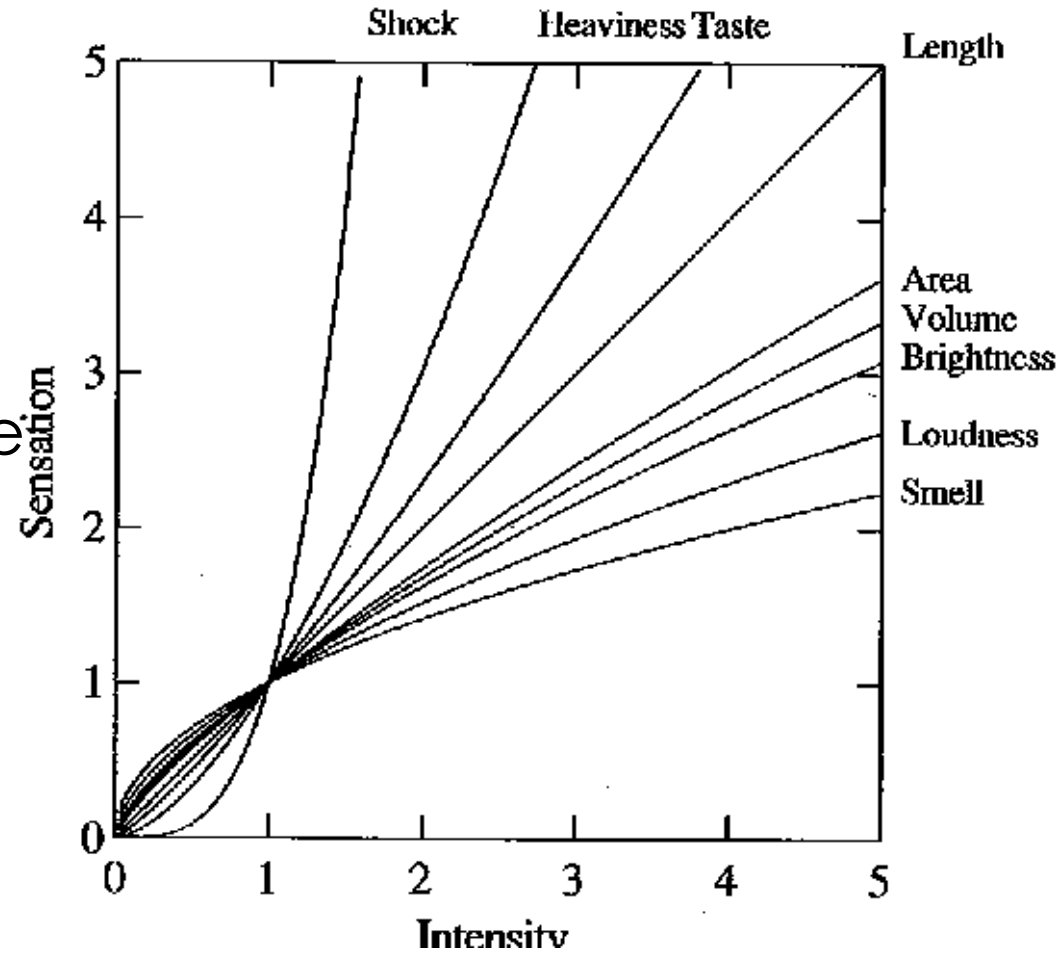
$$S = I^p$$

S = sensation

I = intensity

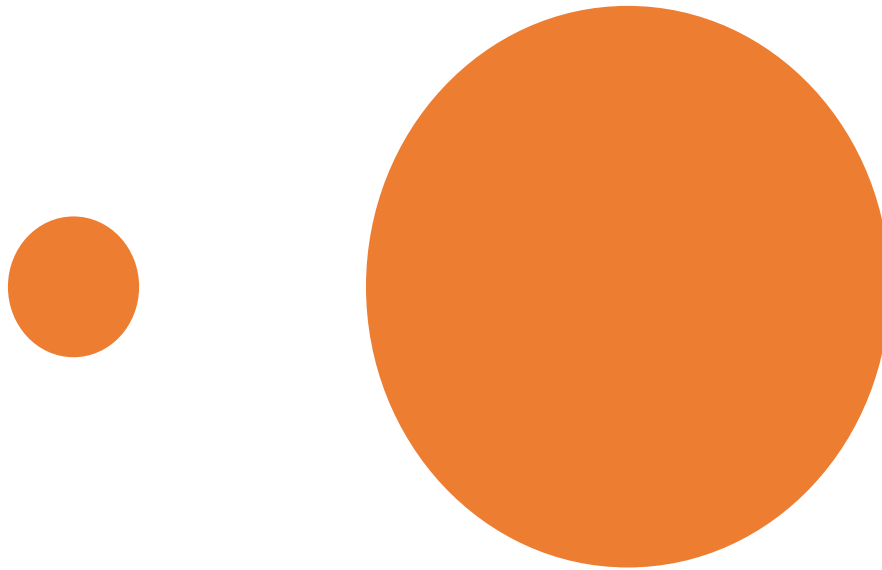
$p < 1$  : underestimate

$p > 1$  : overestimate

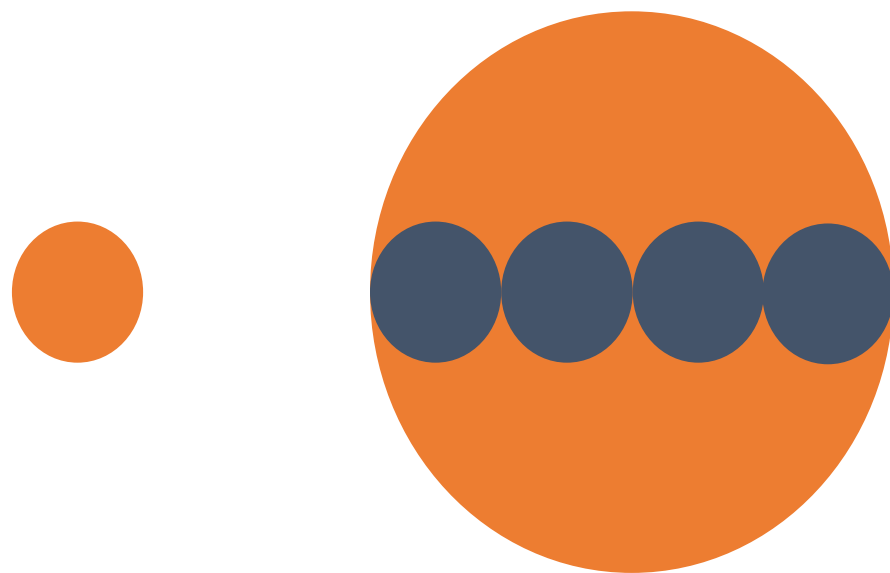


[graph from Wilkinson 99, based on Stevens 61]

[alternate graph : <http://www.undergrad.ahs.uwaterloo.ca/~wchedder/stevenspowerlaw.htm>]



**Compare area of circles**



**Compare area of circles**

# Principle 2: Understand Magnitudes

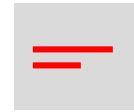
Most accurate



Least accurate



Position (common) scale



Position (non-aligned) scale



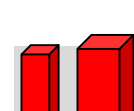
Length



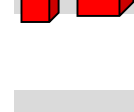
Slope



Angle



Area



Volume



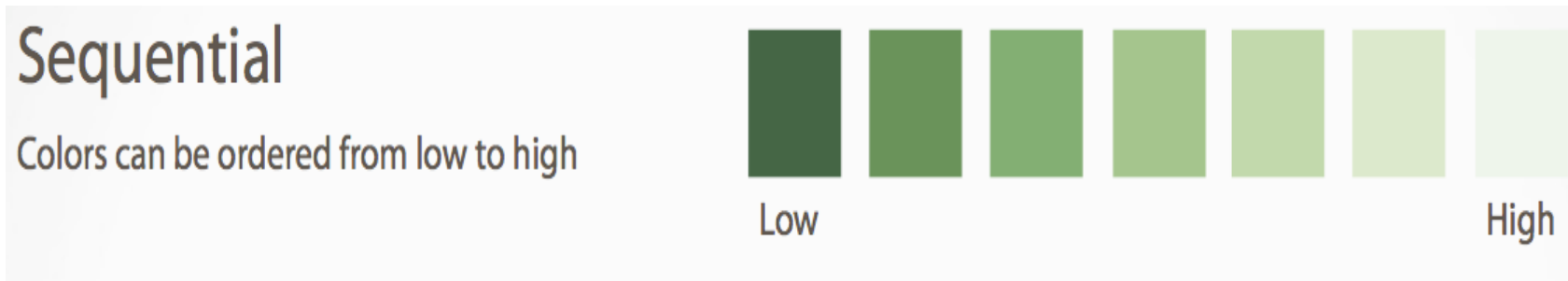
Color hue-saturation-density

# Principle 3: Use Color

- Color
  - Choose colors based on the information you want to convey
    - Sequential
    - Diverging
    - Categorical
  - Use online resources to discover and record your color schemes
    - Color Brewer
    - Kuler
    - Colour Lovers
  - Where possible, use your organization's palette

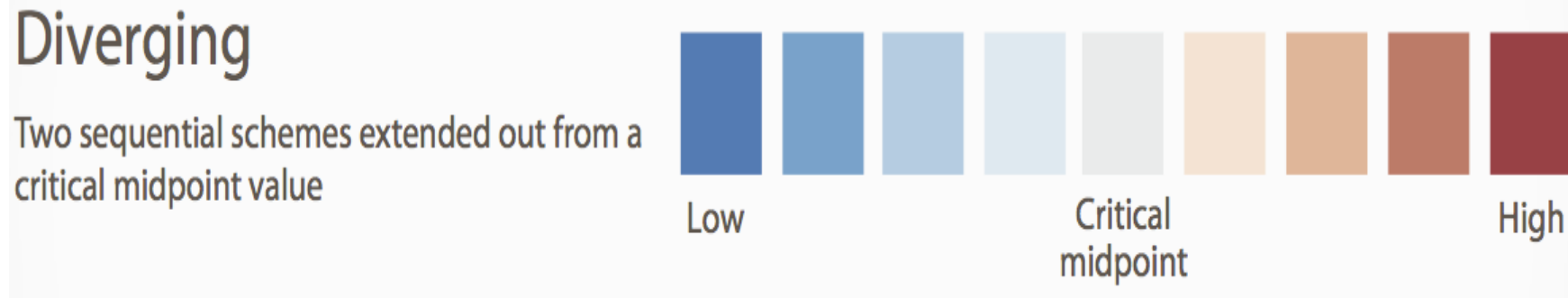
# Principle 3: Use Color

- Color



# Principle 3: Use Color

- Color





# Principle 3: Use Color

- Color

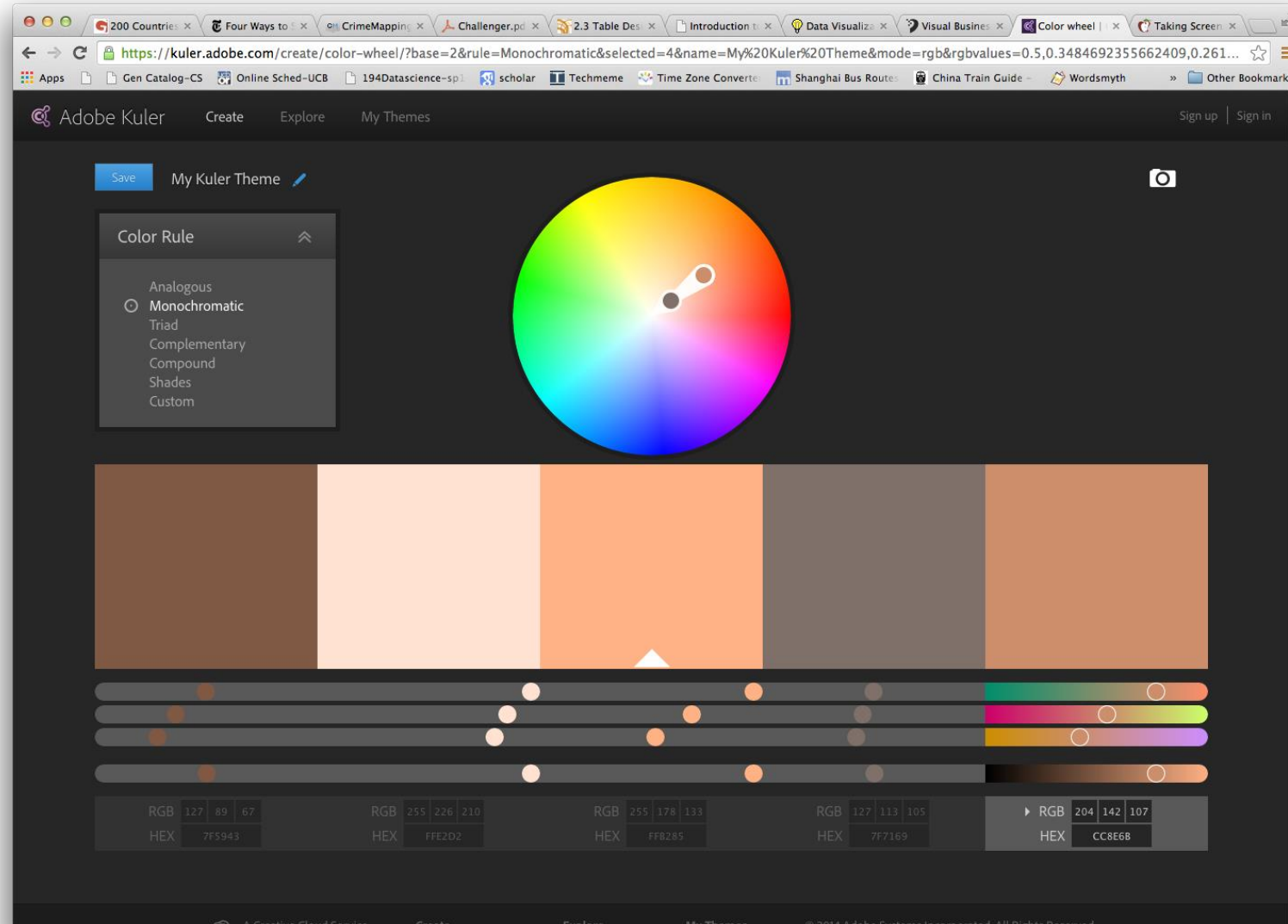
## Categorical

Lots of contrast between each adjacent color



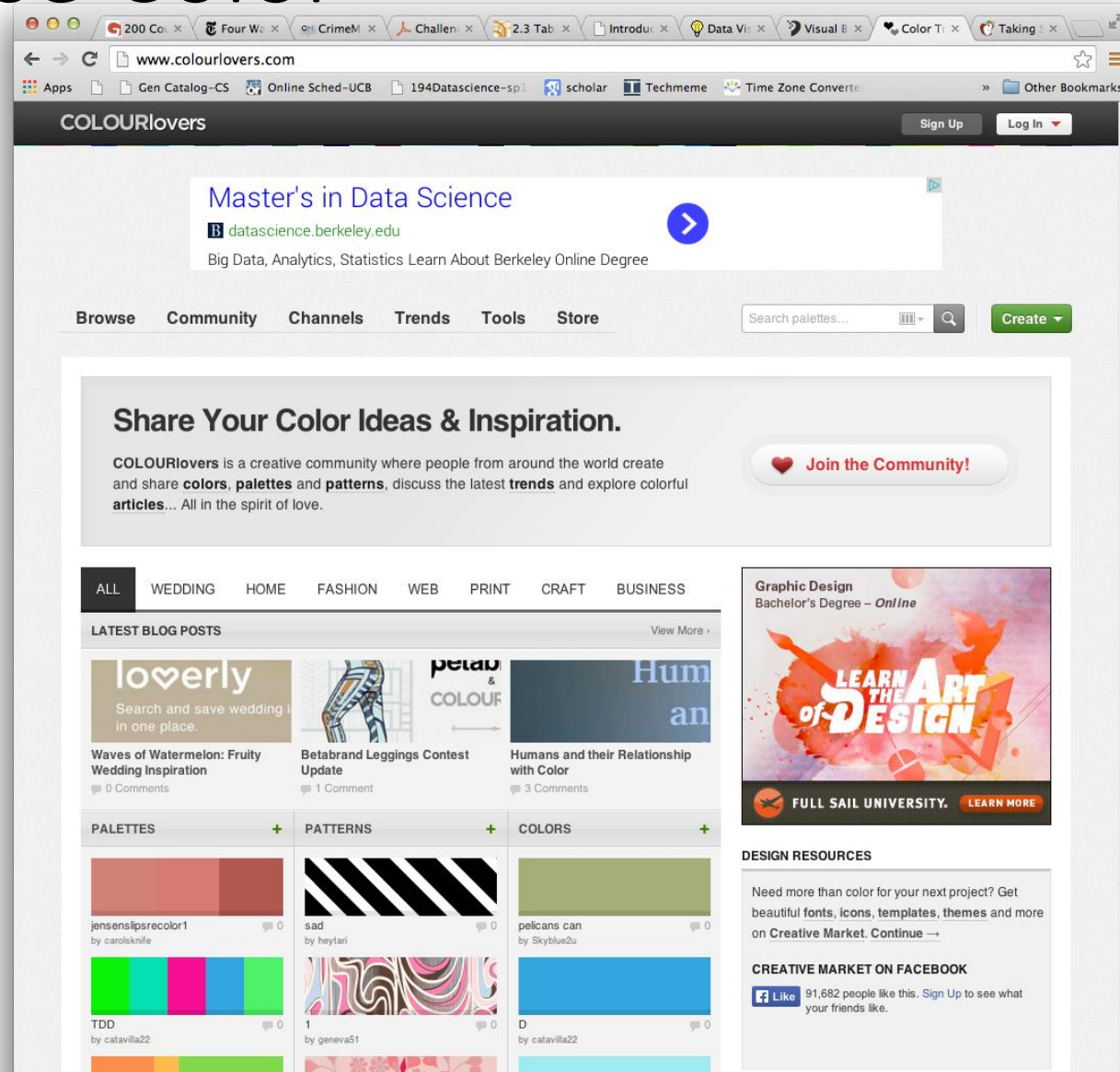
# Principle 3: Use Color

- Color



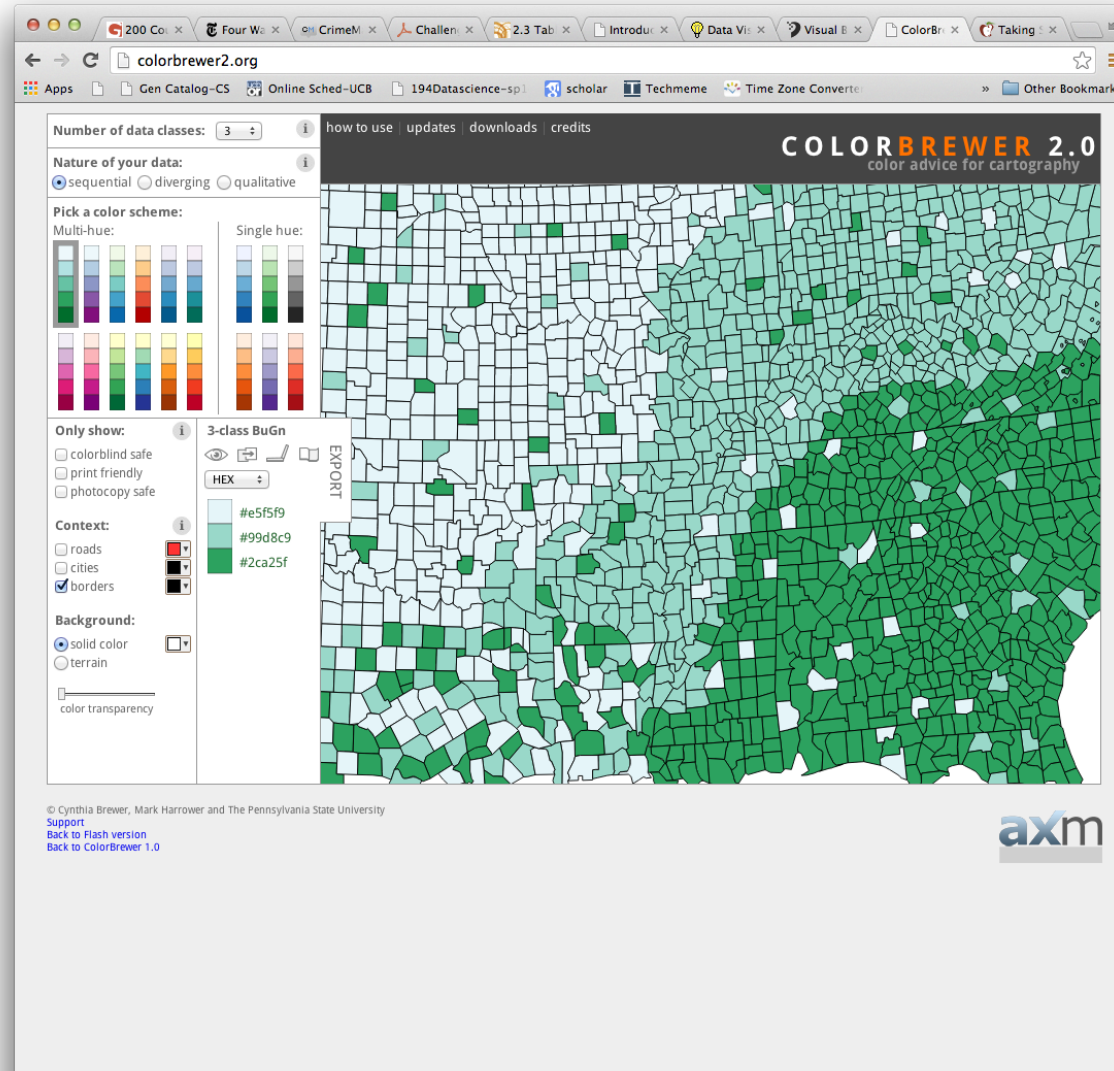
# Principle 3: Use Color

- Color



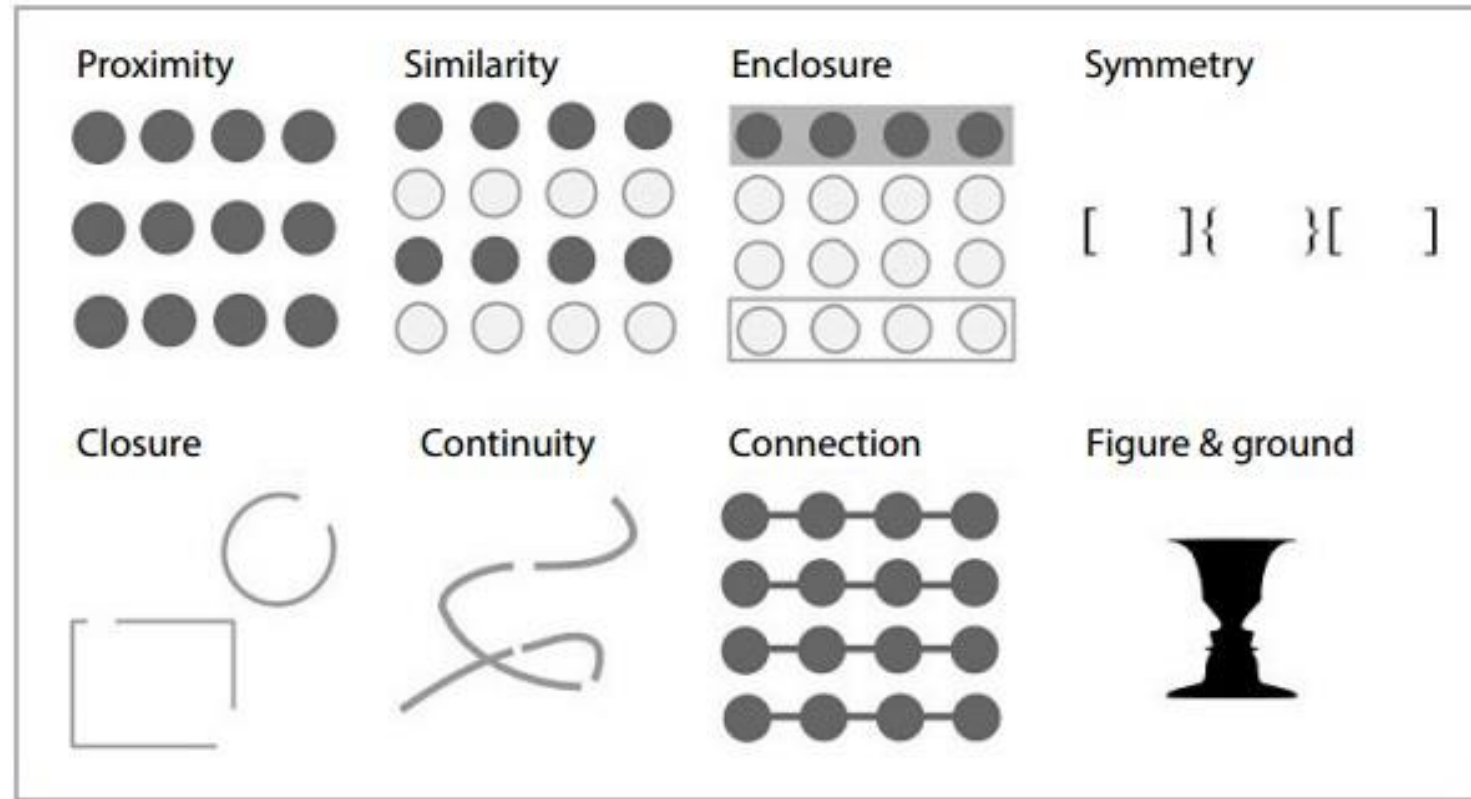
# Principle 3: Use Color

- Color



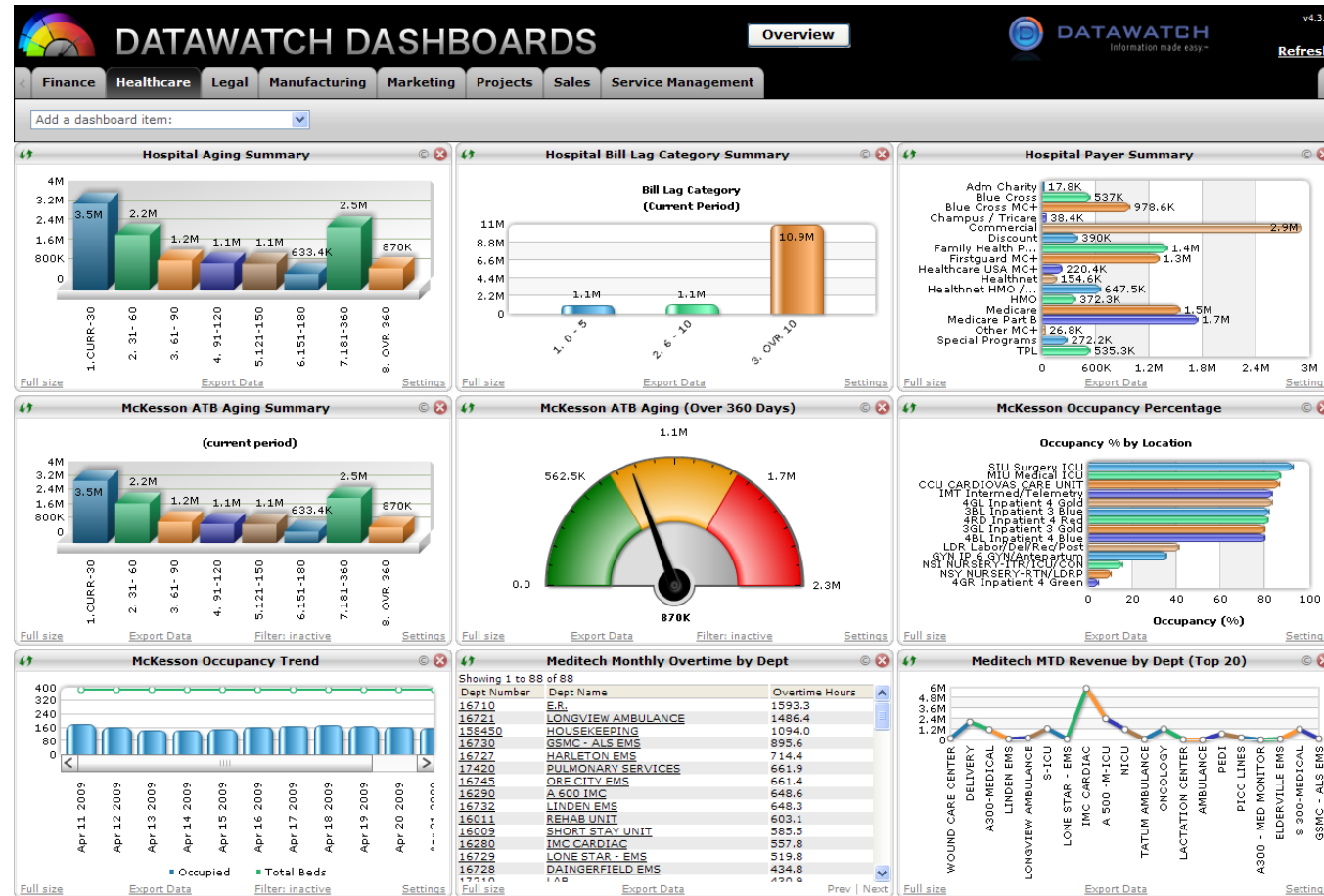
# Principle 4: Use Structure

- Gestalt Psychology principles (1912):



Source <http://blog.fusioncharts.com/2014/03/how-to-use-the-gestalt-principles-for-visual-storytelling-podv/>

# Principle 4: Use Structure (but not like this)



Source <https://www.vocalabs.com/blog/my-dashboard-pet-peeve>

# Principle 4: Use Structure

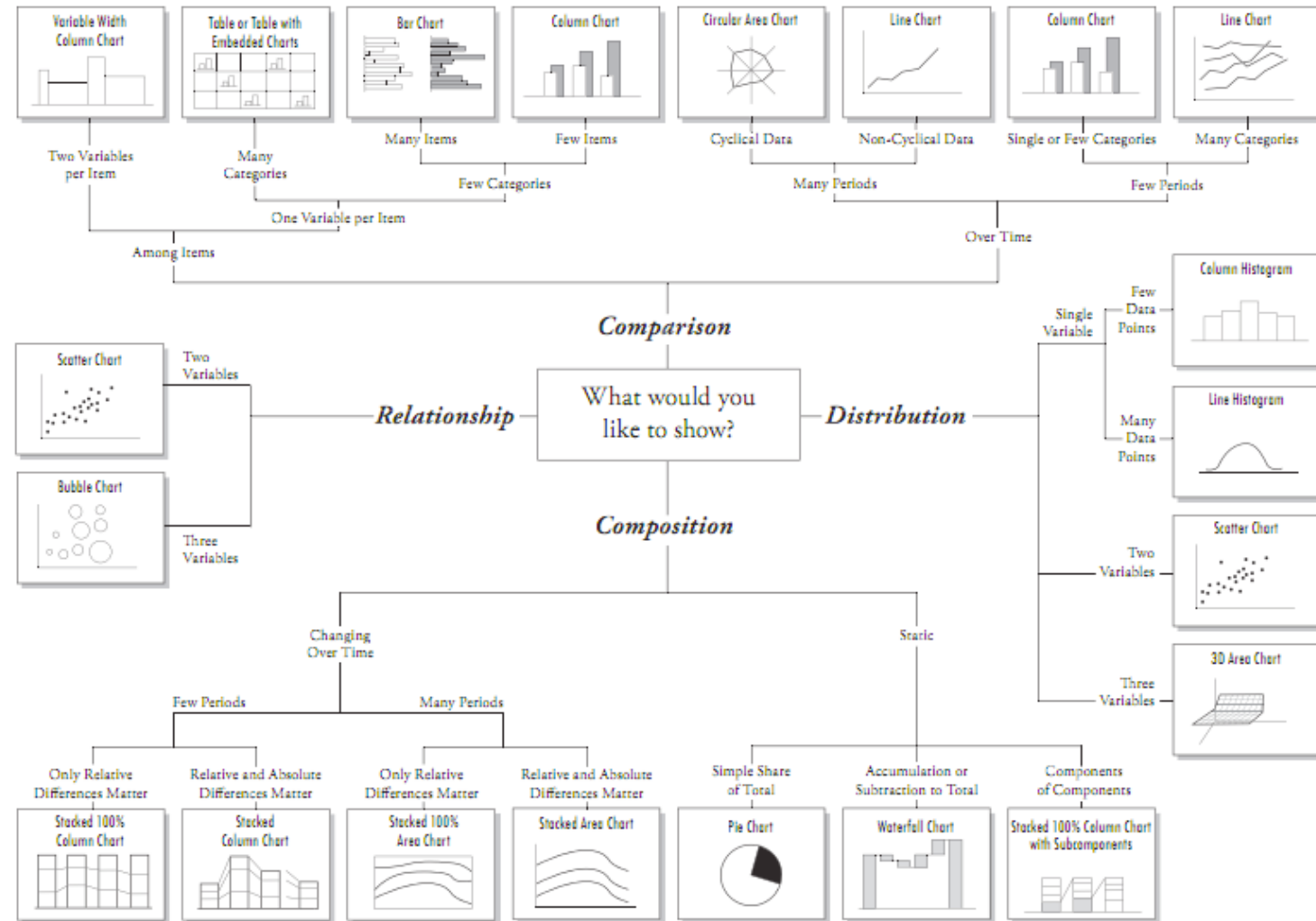


Source <https://www.vocalabs.com/blog/my-dashboard-pet-peeve>



# Chart Selection – Andrew Abela

## Chart Suggestions—A Thought-Starter





# Chart Selection – Juice Analytics

Chart Chooser Data templates for the picking.

## Welcome to the Chart Chooser

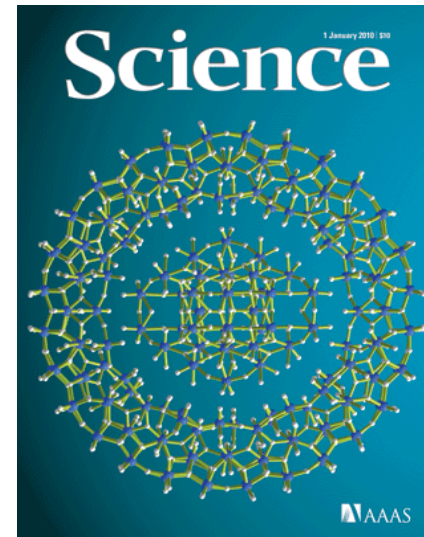
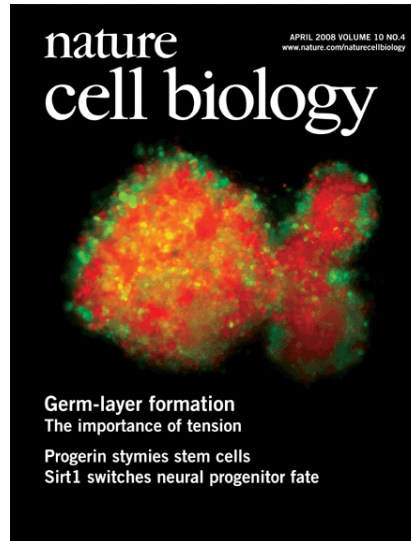
Use the filters to find the right chart type for your needs. Then download as Excel or PowerPoint templates and insert your data.

- ☐ Comparison
- ☐ Distribution
- ☐ Compositor
- ☐ Trend
- ☐ Relationship
- ☐ Table

17 charts selected



# Data Viz in the Sciences



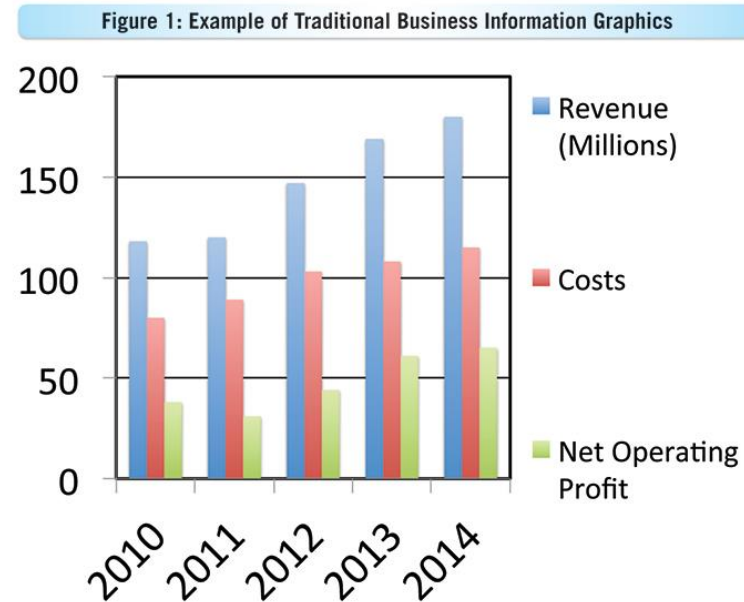
# A case for Ugly visualizations

People instinctively gravitate to attractive visualizations, and they have a better chance of getting on the cover of a journal.

But does this conflict with the goals of visualization?:

- Rapid exploration
- Focus on most important details
- Easy and fast to develop and customize

e.g. Powerpoint vs Keynote



# Outline

## Visualization:

- Some great examples
- Some counter-examples
- Principles for Visualization Design
- Visualization Toolkits preview

# Interactive Toolkits: D3

Without Doubt, the most widely used interactive visualization framework is **D3**, developed around 2011 by Jeff Heer, Mike Bostock and Vadim Ogievetsky.

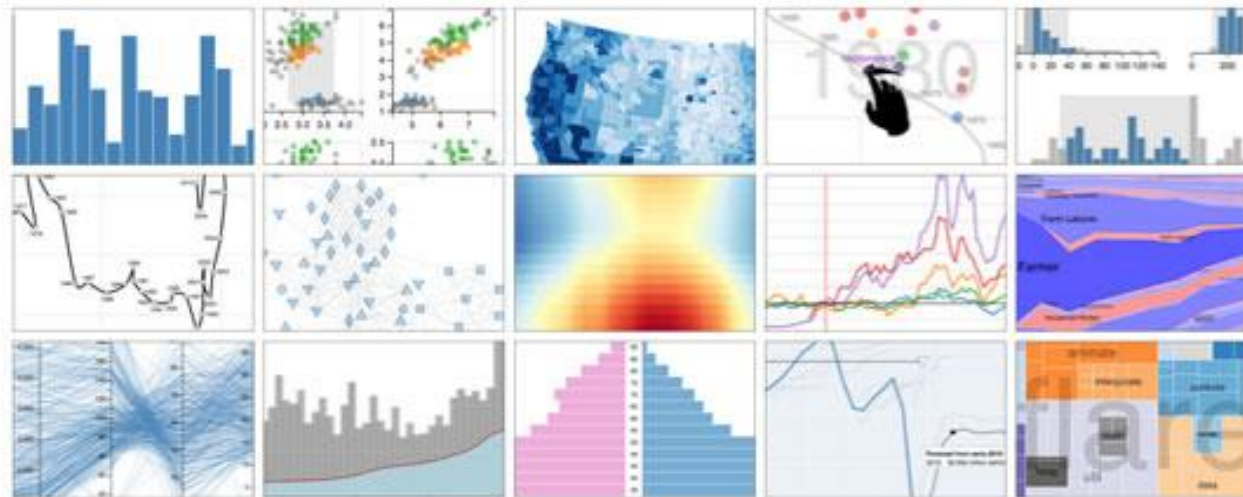
Note from the authors: *D3 is intentionally a low-level system. During the early design of D3, we even referred to it as a "visualization kernel" rather than a "toolkit" or "framework"*



# Interactive Toolkits: Vega

Vega is a “visualization grammar” developed on top of d3.js  
It specifies graphics in JSON format.

**vega**

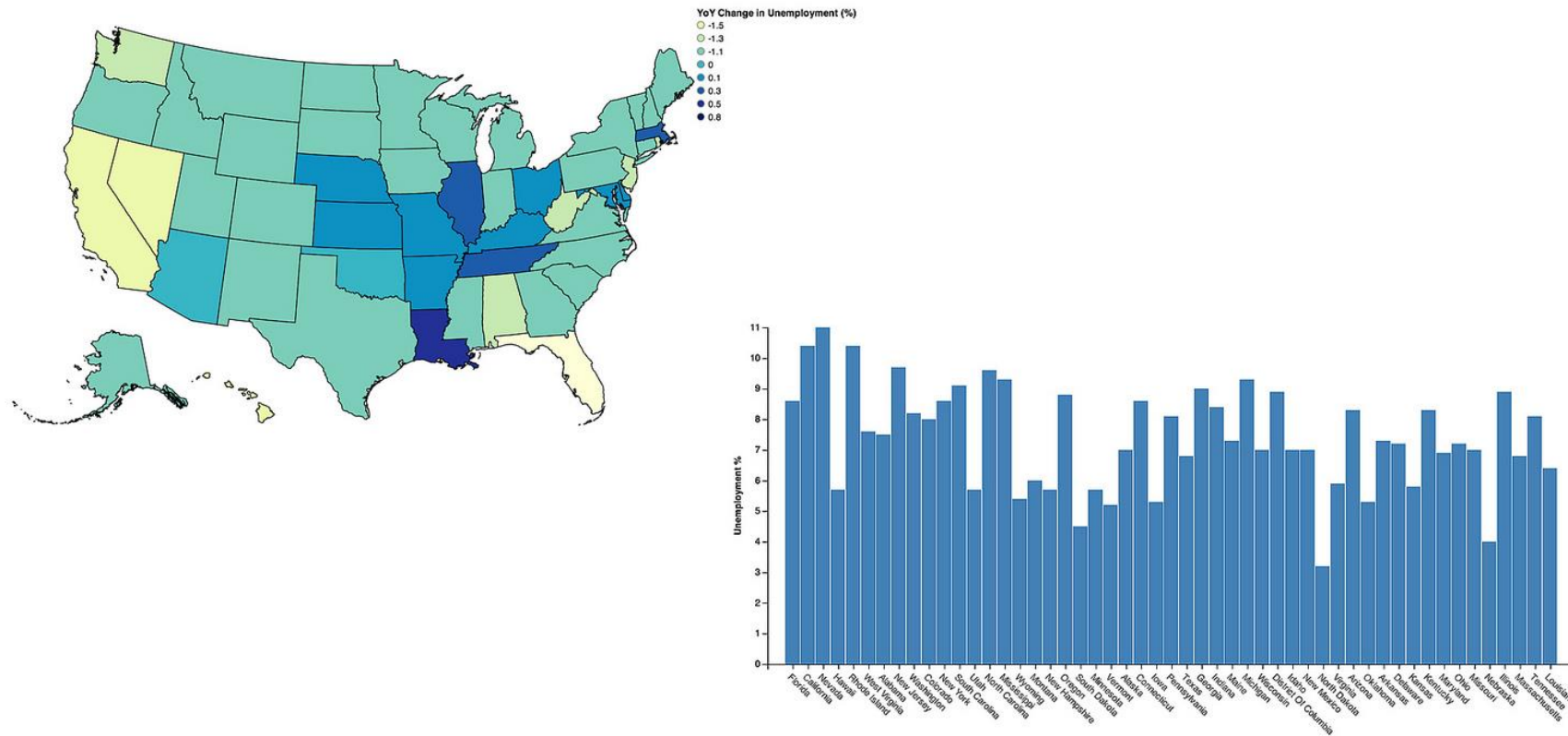


Vega is a *visualization grammar*, a declarative format for creating, saving, and sharing interactive visualization designs.

# Interactive Toolkits: Vincent

Vincent is a Python-to-Vega translator.

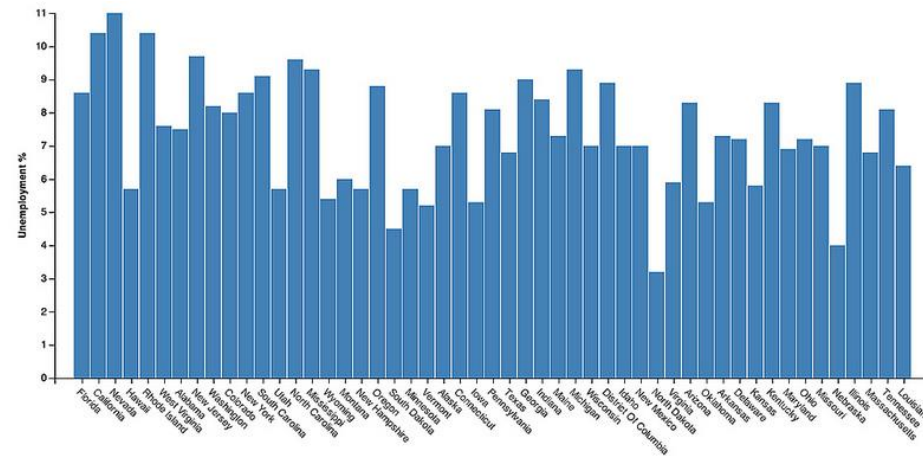
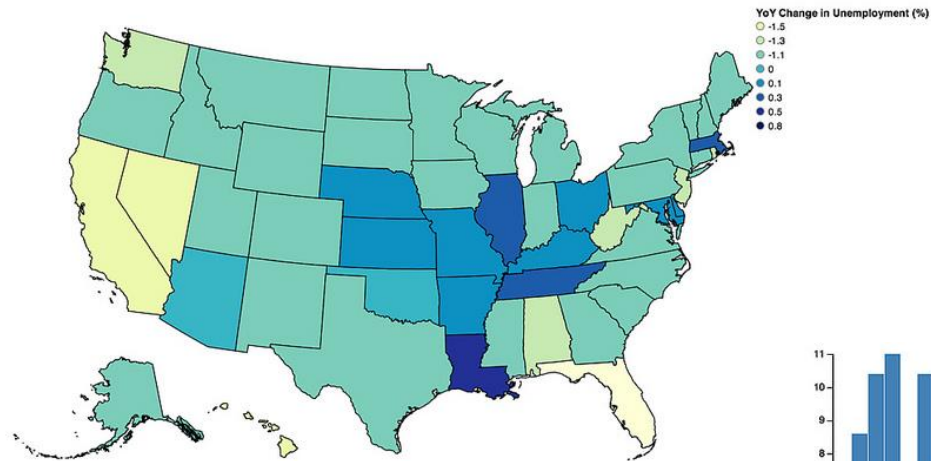
Trivia question: why is it called Vincent? Hint: Vincent+Vega= ?



# Interactive Toolkits: Vincent

Vincent is a Python-to-Vega translator.

Trivia question: why is it called Vincent? Hint: Vincent+Vega= ?





# Bokeh: Another Interactive Viz Library

Bokeh is an independent Viz library focused more heavily on big data visualization. Has both Python and Scala bindings.

