

Slides: <http://brosz.ca/slides/>

Jan 20, 2025

# Data Visualization

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COMMUNITY PLANNING  
STUDIO

Slides: <http://brosz.ca/slides/>

# Visualization Studio

## 34.5 million pixels

- Compare that to HD (2.07 million) or even 4K (8.3 million).

16' (4.9m) wide and 6' (1.8m) tall

- A standard IMAX screen is 22m X 16.1m.

Designed to support research

- Bookable by faculty & grad students at <https://library.ucalgary.ca/services/visualization>

# Topics



What is data visualization?



How do we visualize data / data encoding  
- Visual variables



Data visualization tools

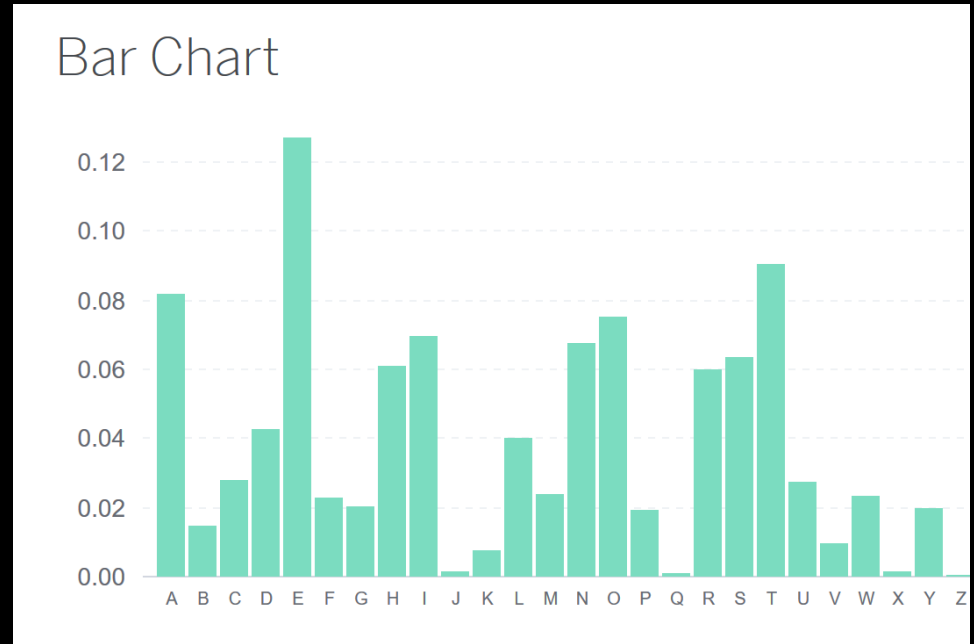


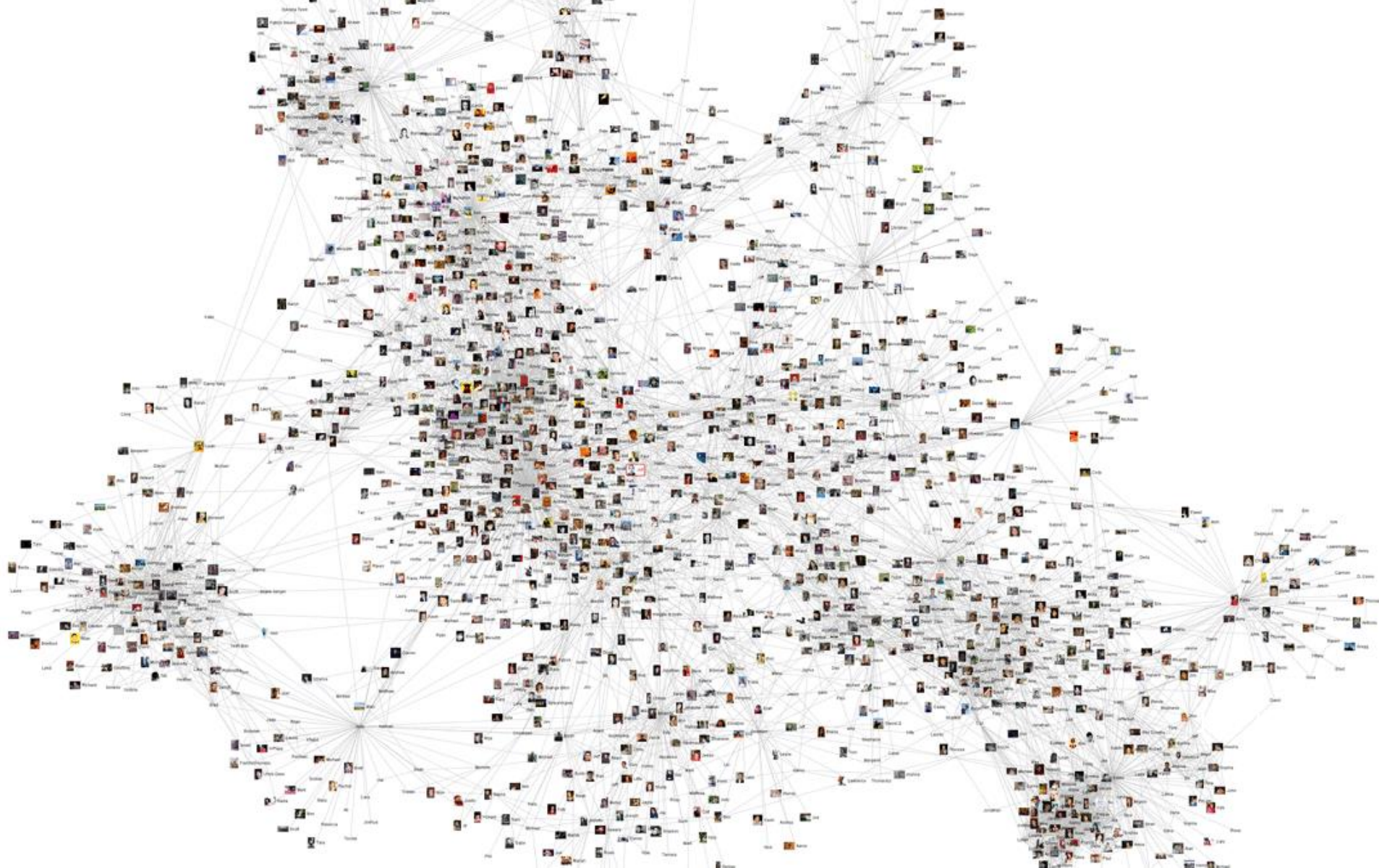
Resources (books & websites)



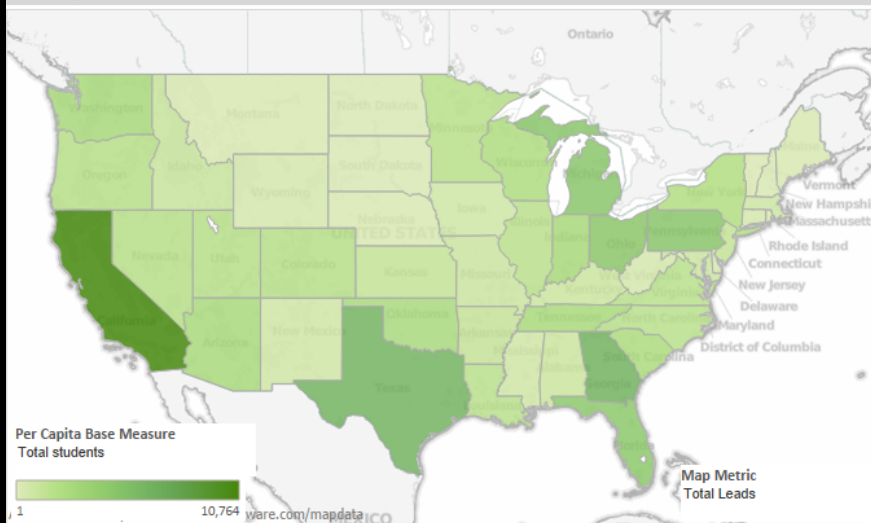
What Is Data  
Visualization?

MORE THAN  
JUST MAKING  
CHARTS  
OR PRETTY  
PICTURES

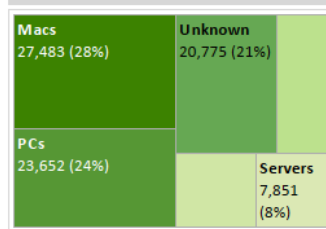




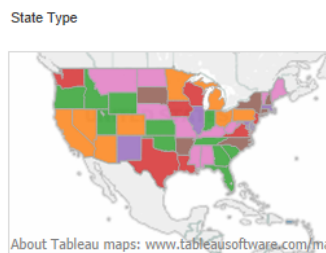
### Leads by State



### Product Area



### Show Classifications Of



### Response Time

Response Time	Convert %	Leads	Converted
< 2 Hrs	6.46%	5,310	343
< 1 Day	4.67%	9,556	446
Later	3.89%	84,134	3,270

### Summary

Lead Gen Budget	\$3,226,785
Leads	99,000
Budget per Lead	\$32.59
Converted	4,059
Budget per Conversion	\$794.97
Convert %	4.10%

### Lead Volume Change

	Leads		WoW Change		YoY Change	
	2012	2013	2012	2013	2012	2013
1	4,475	1,933				-57%
2	3,249	1,645	-27%	-15%		-49%
3	1,714	2,035	-47%	24%		19%
4	1,322	4,854	-23%	139%		267%
5	1,476	2,743	12%	-43%		86%
6	5,300	2,643	259%	-4%		-50%
7	3,624	2,420	-32%	-8%		-33%
8	360	1,888	-90%	-22%		424%
9		1,051	-100%	-44%		
10		1,113		6%		
11	1,196	2,639		137%		121%
12	4,418	2,345	269%	-11%		-47%
13	3,990	2,904	-10%	24%		-27%
14	1,155	2,358	-71%	-19%		104%
15		1,809	-100%	-23%		
16		1,086		-40%		
17		1,193		10%		
18		2,941		147%		
19		2,889		-2%		
20		2,616		-9%		
21		3,358		28%		
22		2,554		-24%		
23		1,188		-53%		
24		1,326		12%		
25		2,515		90%		
26		2,411		-4%		
27		2,166		-10%		
28		2,494		15%		
29		1,742		-30%		

### Filters

Region

State Type

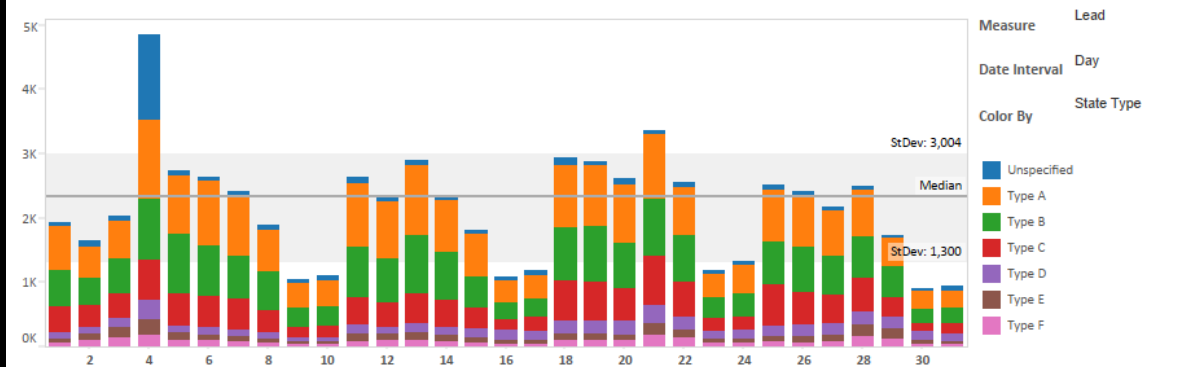
Lead Source

All

Generated By

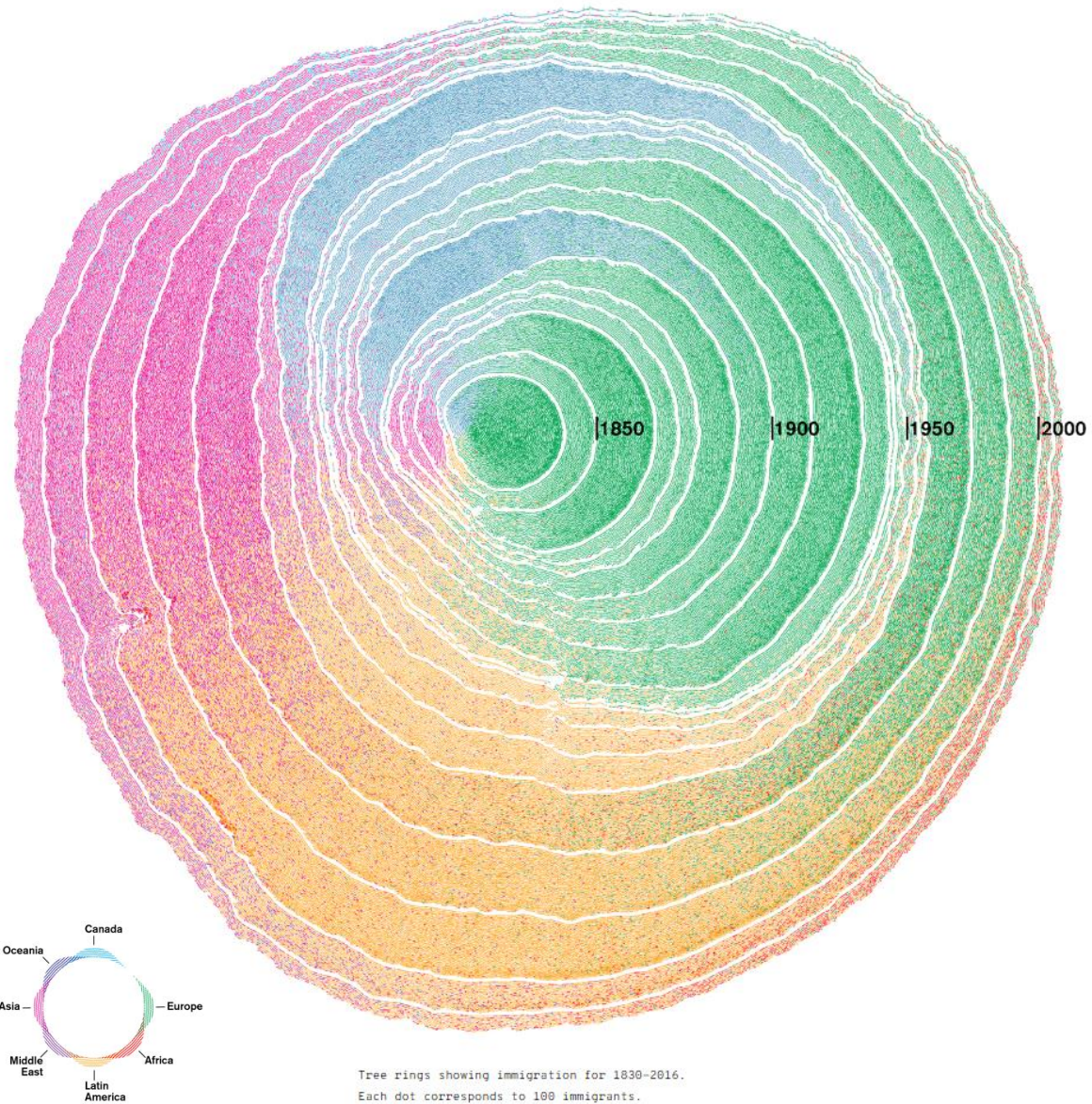
All

### Breakdown Lead By Day



# US Immigration Data

<https://web.northeastern.edu/naturalizing-immigration-dataviz/>





# What is Data Visualization ?

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Visual representation of data

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“Transformation of the symbolic into the geometric” [McCormick et al, 1987]

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“... artificial memory that best supports our natural means of perception” [Bertin, 1967]

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“Use of computer-generated, interactive, visual representations of data to amplify cognition” [Card, Mackinlay, & Shneidermann, 1999]

# Why Data Visualization?

“The ability to take data –

to be able to **understand** it,

to **visualize** it,

to **communicate** it –

that’s going to be a hugely important skill in the next decades,

... because now we really do have essentially free and ubiquitous data.

So the complimentary **scarce factor is the ability to understand** the data and extract value from it.”

Hal Varian, Google’s Chief Economist  
The McKinsey Quarterly, Jan 2009

Set A		Set B		Set C		Set D	
X	Y	X	Y	X	Y	X	Y
10	8.08	10	9.14	10	7.47	8	6.58
8	6.95	8	8.14	8	6.77	8	5.76
13	7.58	13	8.74	13	12.74	8	7.71
9	8.81	9	8.77	9	7.11	8	8.84
11	8.33	11	9.26	11	7.81	8	8.47
14	9.96	14	8.1	14	8.84	8	7.04
6	7.24	6	6.13	6	6.08	8	5.25
4	4.26	4	3.1	4	5.39	19	12.5
12	10.84	12	9.11	12	8.15	8	5.56
7	4.82	7	7.26	7	6.42	8	7.91
5	5.68	5	4.74	5	5.73	8	6.89

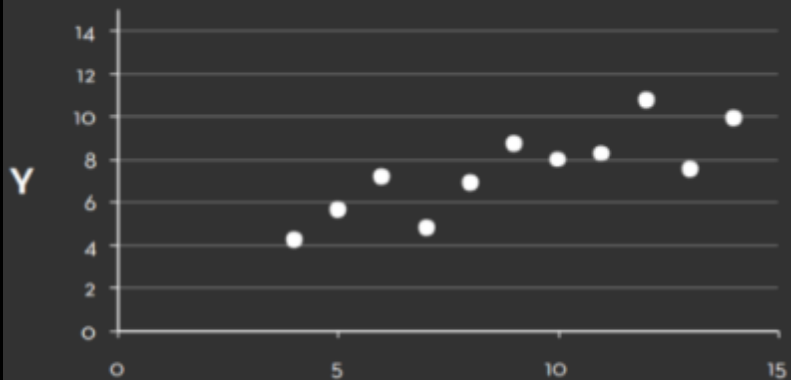
**Summary Statistics**

$\mu_X = 9.0$   $\sigma_X = 3.317$

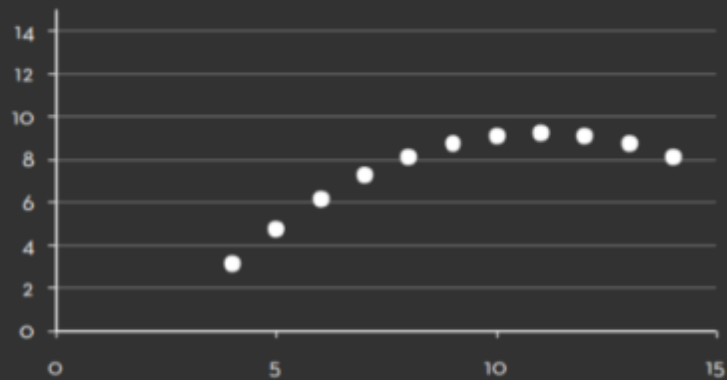
$\mu_Y = 7.5$   $\sigma_Y = 2.03$

Anscombe's Quartet (Anscombe, Francis J., 1973)

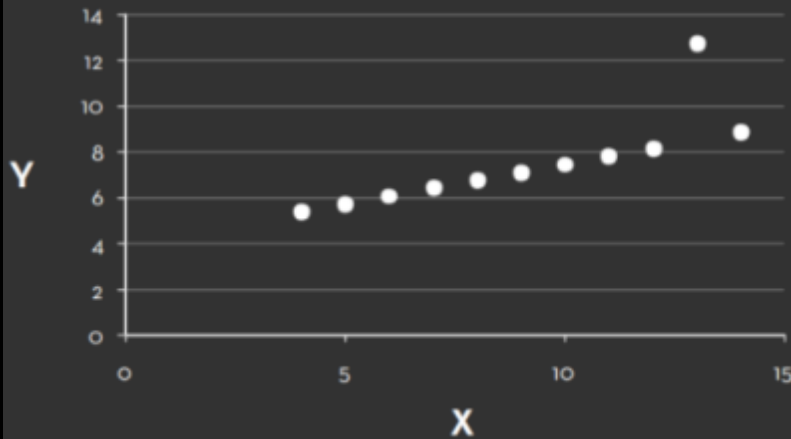
### Set A



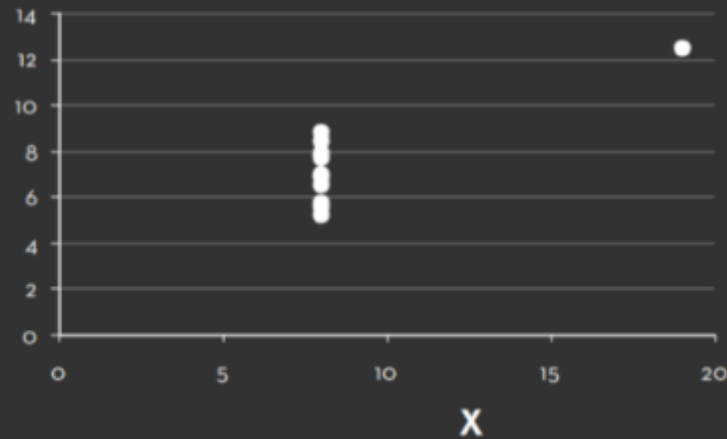
### Set B



### Set C



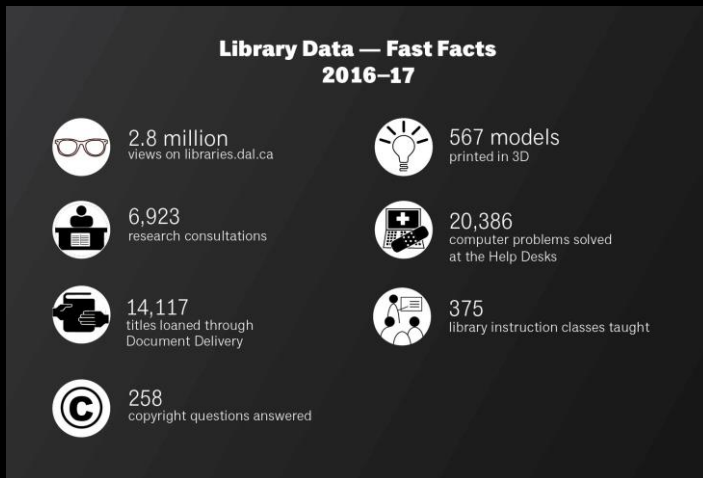
### Set D



# InfoGraphics vs DataGraphics

## DataGraphic

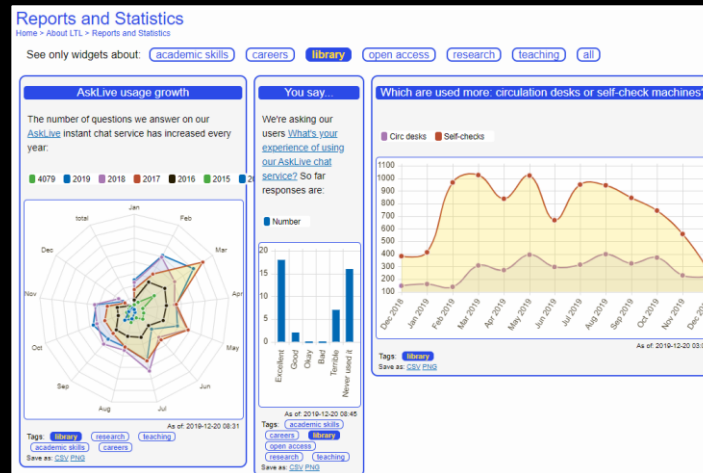
Uses words and numbers to represent quantitative data. Icon-like graphical elements for visual appeal



<https://libraries.dal.ca/about/library-assessment/library-data.html>

## InfoGraphic

Visually encodes quantitative and/or qualitative data into marks, shapes, sizes, colours, etc.



<https://library2.lincoln.ac.nz/dashboard/#library>

# InfoGraphic vs Data Visualizations

**Infographics** tell a premeditated story to guide the audience (subjective).

**Data Visualizations** leave the audience their own conclusions (objective).

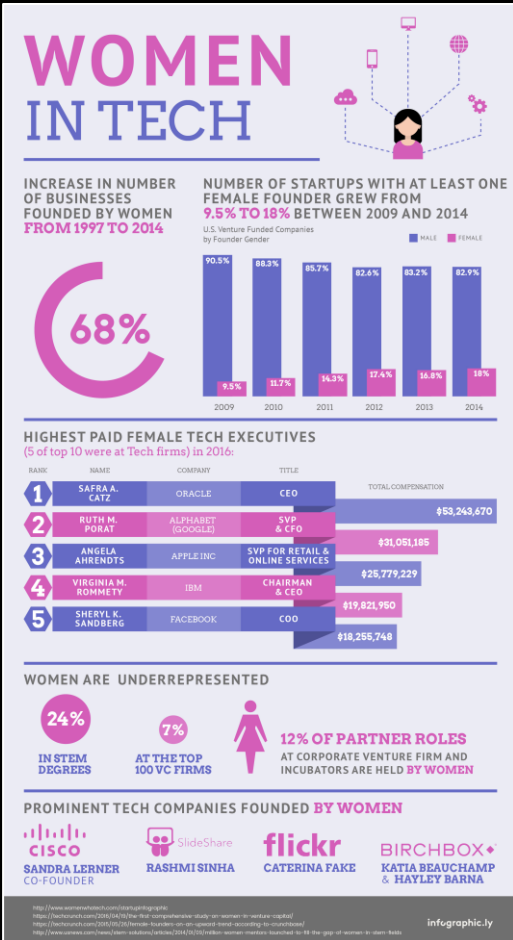
## InfoGraphic

- Best for telling a **premeditated story** and offer **subjectivity**
- Best for **guiding the audience** to conclusions and **point out relationships**
- Created **manually** for one **specific dataset**

## Data Visualization

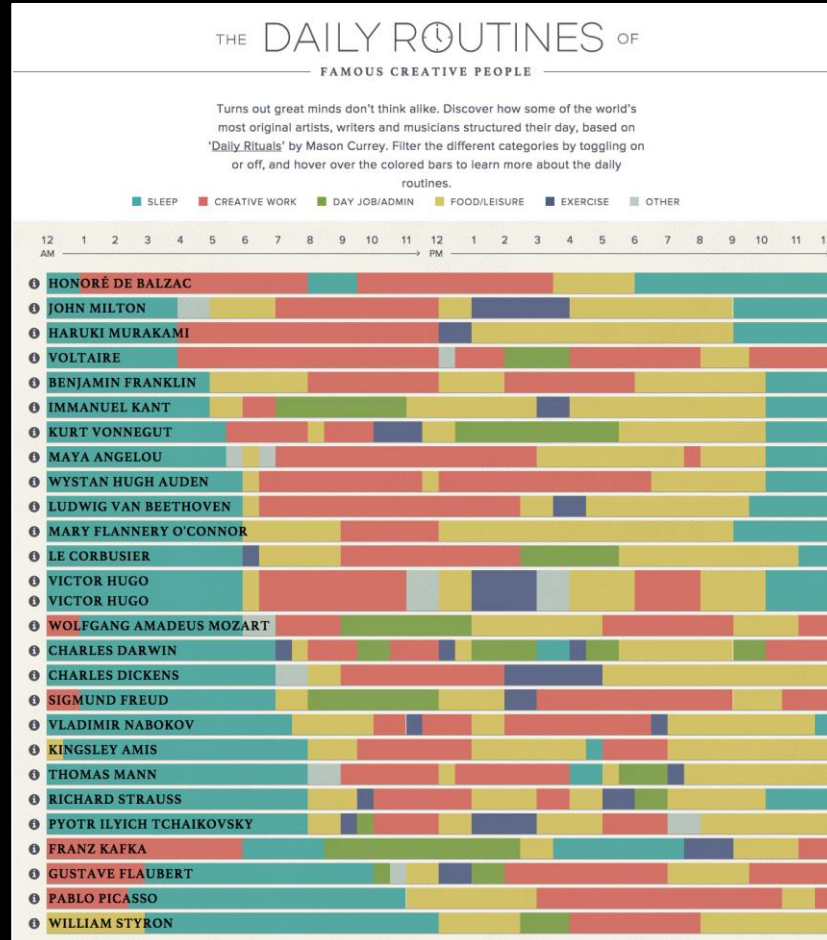
- Best for allowing the audience to **draw their own conclusions**, and offer **objectivity**
- Ideal for understanding **data at a glance**
- **May not** be designed for a **specific data**

# InfoGraphic



From <https://www.entrepreneur.com/article/289932>

# Data Visualization



From <https://podio.com/site/creative-routines>

# How Do We Make a Good Data Visualization?

- **Know the Data**

- Number of attributes
- Date types: ordinal vs ordered (ordinal or quantitative)
- Trustworthiness: bad fields, inaccuracies, missing values

- **Know your purpose (& audience)**

- What do you/they want to see?
- What might you/they want to focus on?

- **Decide how encode the data**

- Ensure information can be decoded accurately
- Human perceptual system
- Display capacity
- Characteristics of data (size, type)
- Task



# Data

Categorical



Ordered

Small Medium Large

Quantitative

1 2 5.29 42 101

# How Do We Make a Good Data Visualization?

- **Know the Data**

- Number of attributes
- Date types: ordinal vs ordered (ordinal or quantitative)
- Trustworthiness: bad fields, inaccuracies, missing values

- **Know your purpose (& audience)**

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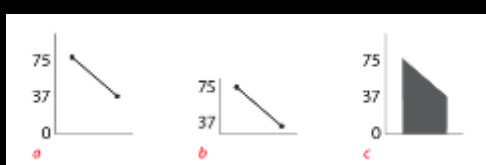
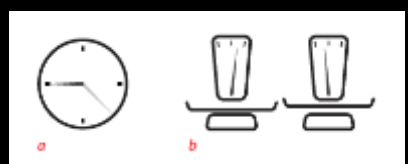
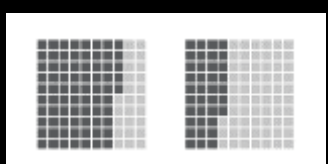
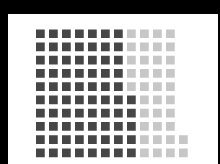
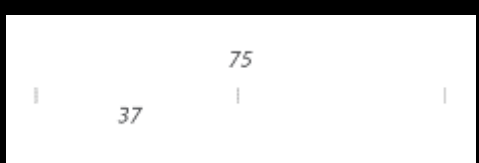
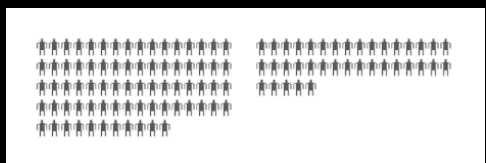
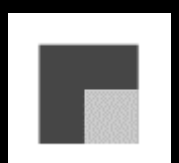
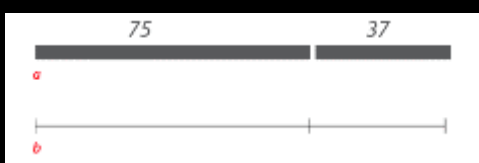
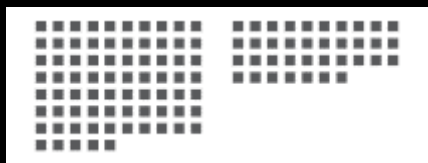
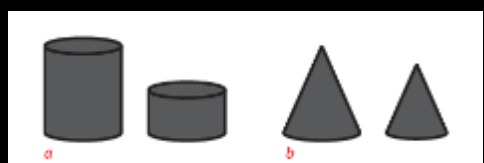
*How do we  
change data symbols  
into geometry?*

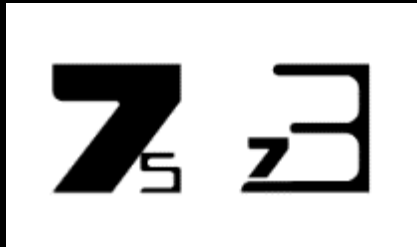
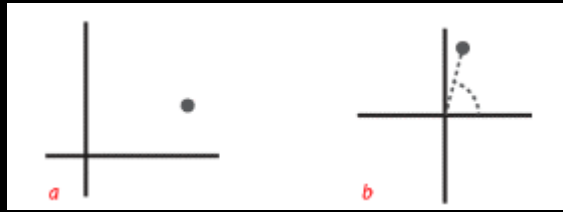
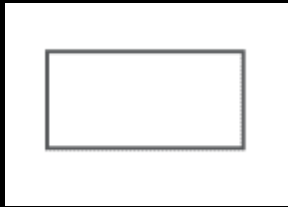
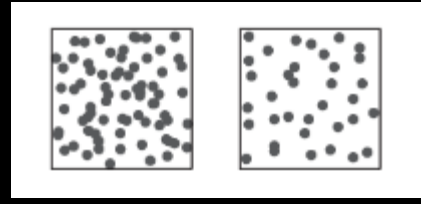
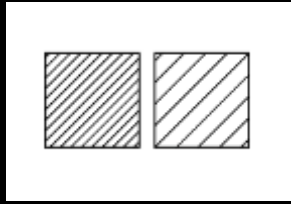
Exercise:

How many ways can you communicate two quantities?

**75** and **37**

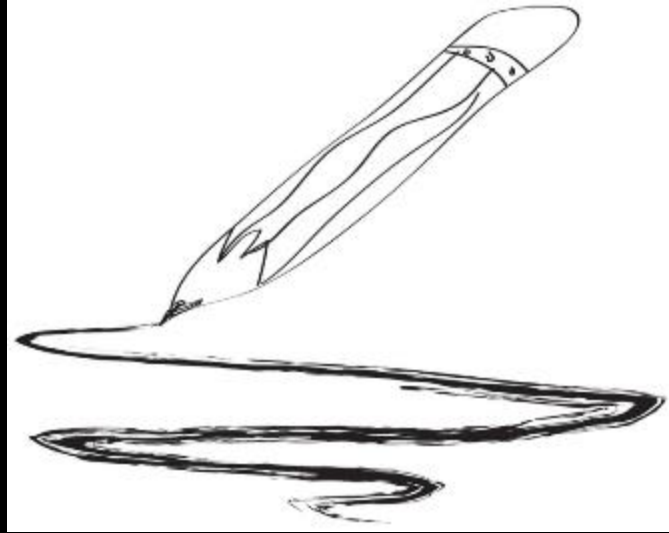
<http://blog.visual.ly/45-ways-to-communicate-two-quantities/>





# Visual Encoding

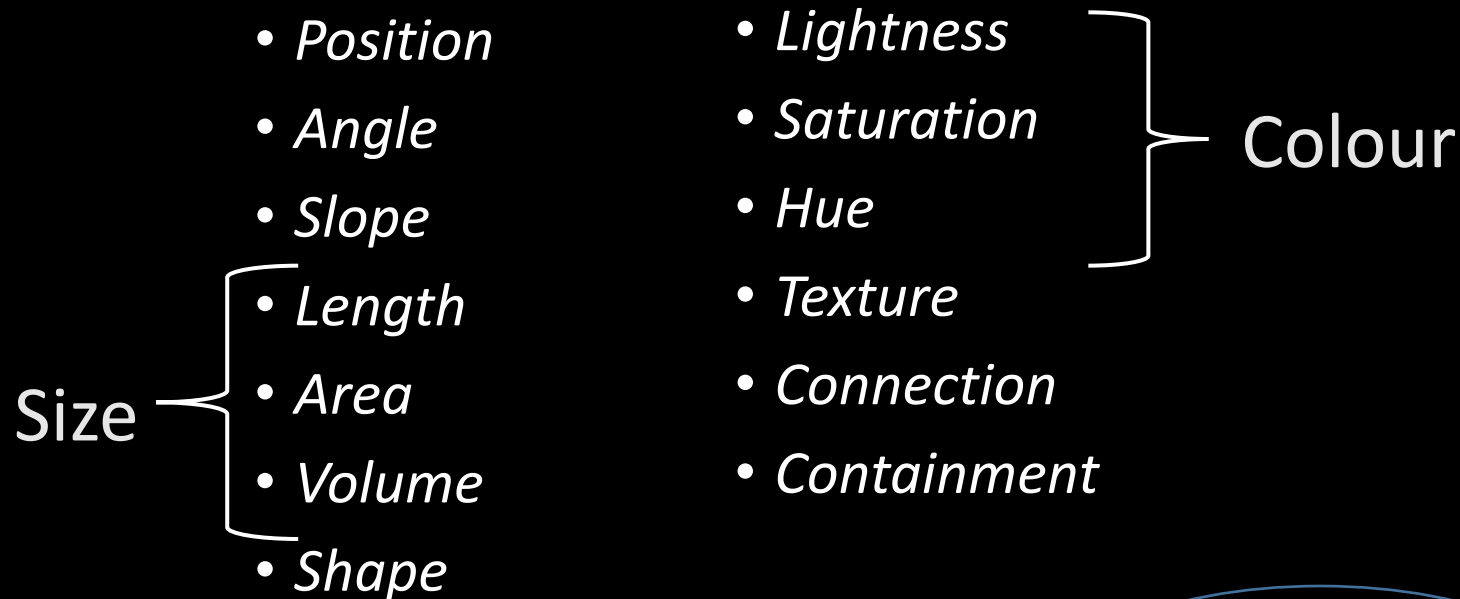
- Marks



- What can we change about a mark?

# Visual Encoding With Visual Variables

## Visual Variables:

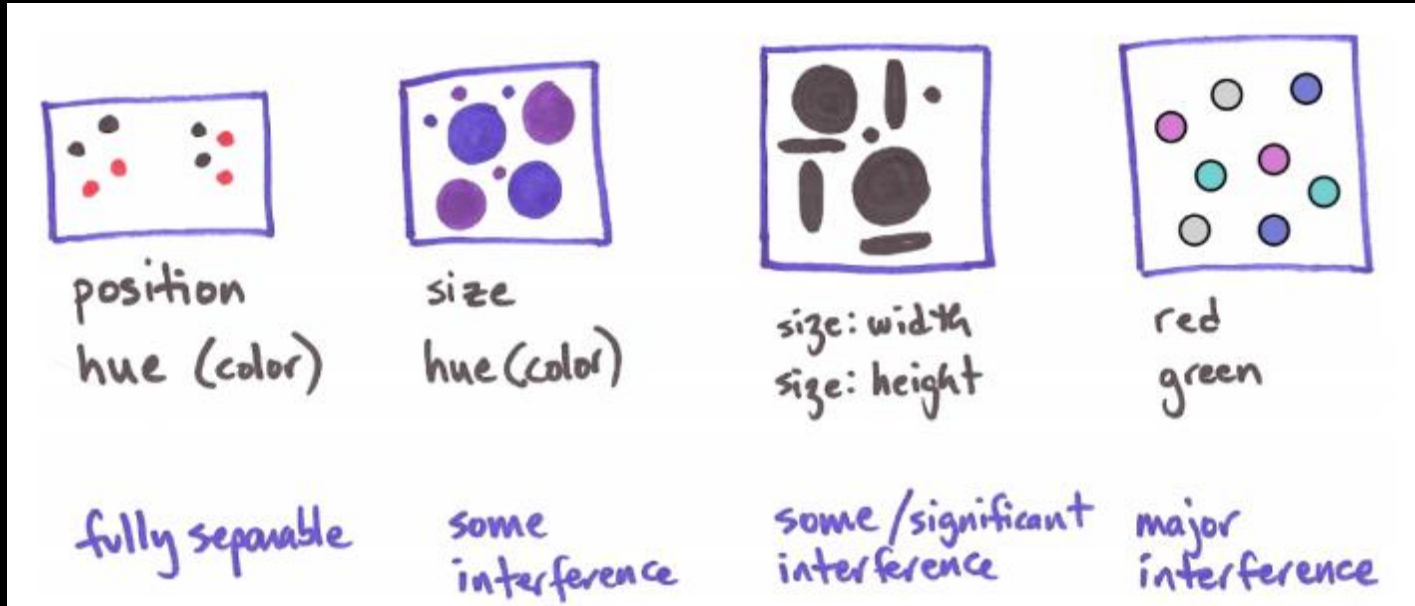


*Independent?*

? : *Opacity*  
? : *"Sketchiness"*

# Visual Encoding

- Are differences perceivable?
- How many bins?
- Ideally all channels would be independent (not so)
  - Interactions between channels





# Perception



## Brain

Visual Cortex: fast & efficient – pre-attentive processing

Cerebral Cortex: slower, less efficient

**Goal:** do as much as possible with Visual Cortex as possible

# Perception

How many 3s?

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

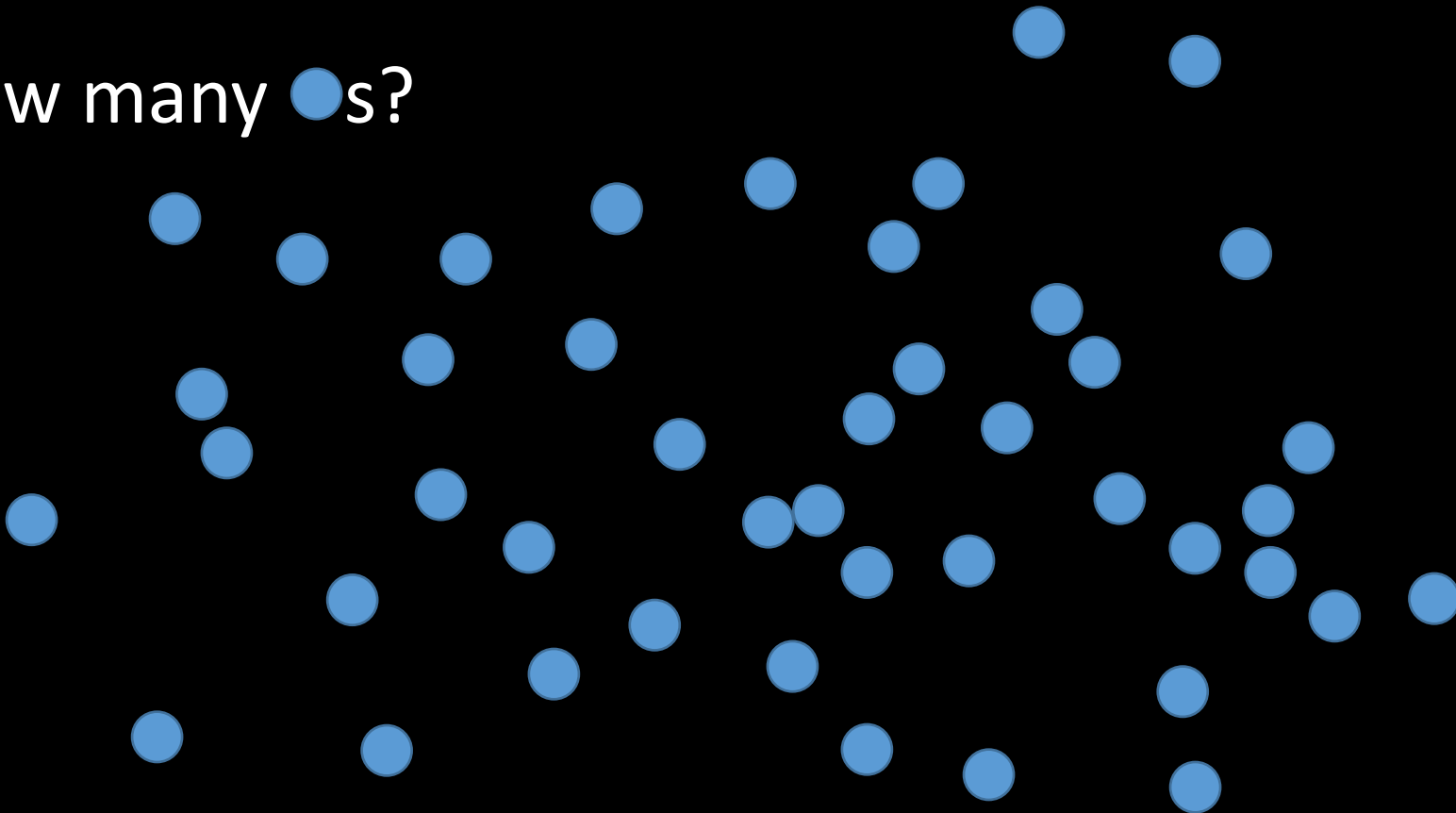
# Perception

How many 3s?

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

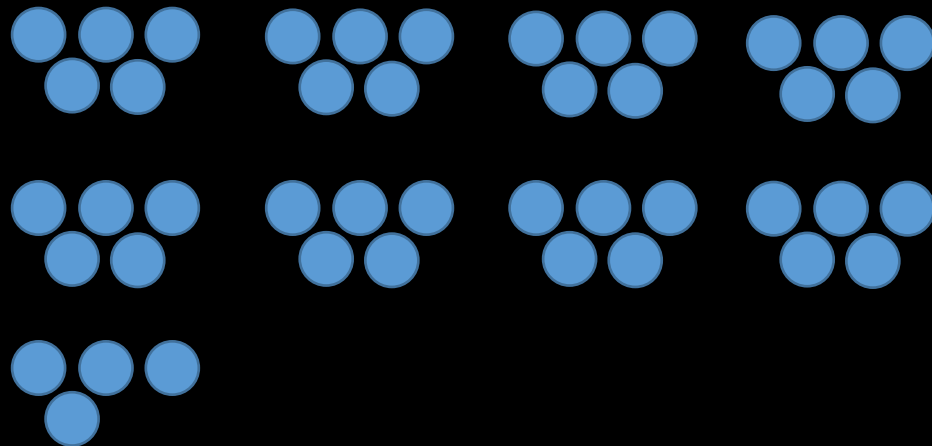
# Perception

How many ●s?

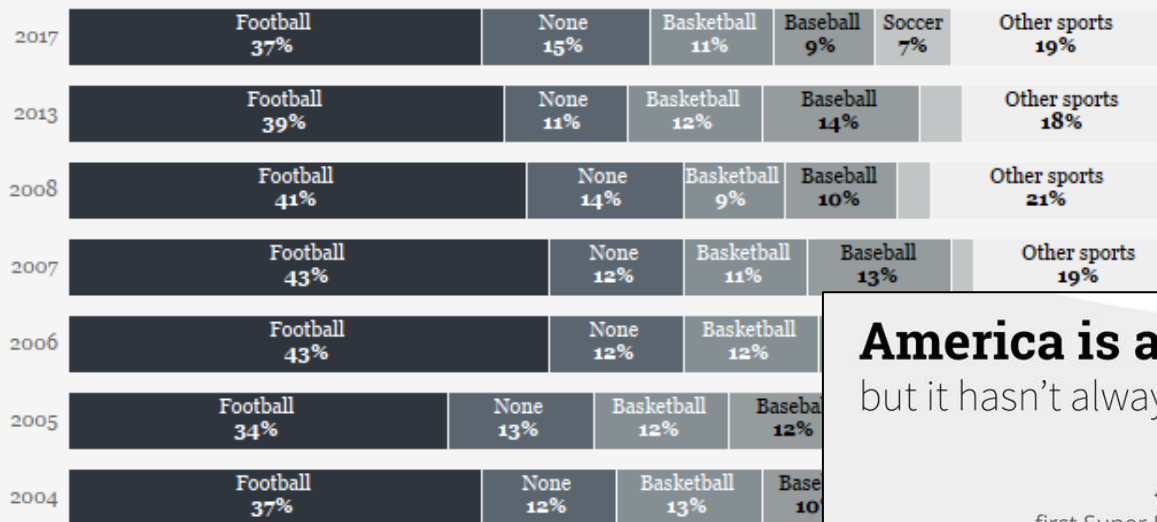


# Perception

How many ●s?



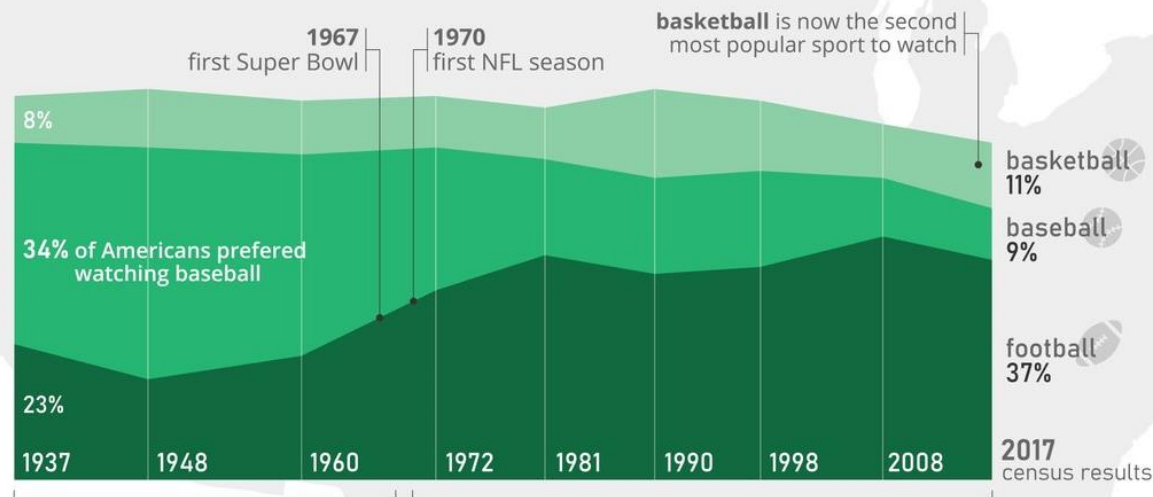
## More than every 6th American has no favorite sport to watch



TOP 5 SPORTS TO WATCH - AND OTHERS

## America is a football country

but it hasn't always been that way



up until the late sixties, **baseball** was the most popular sport to watch

for the past 50 years, football has been the favorite sport of **nearly 40% of Americans**

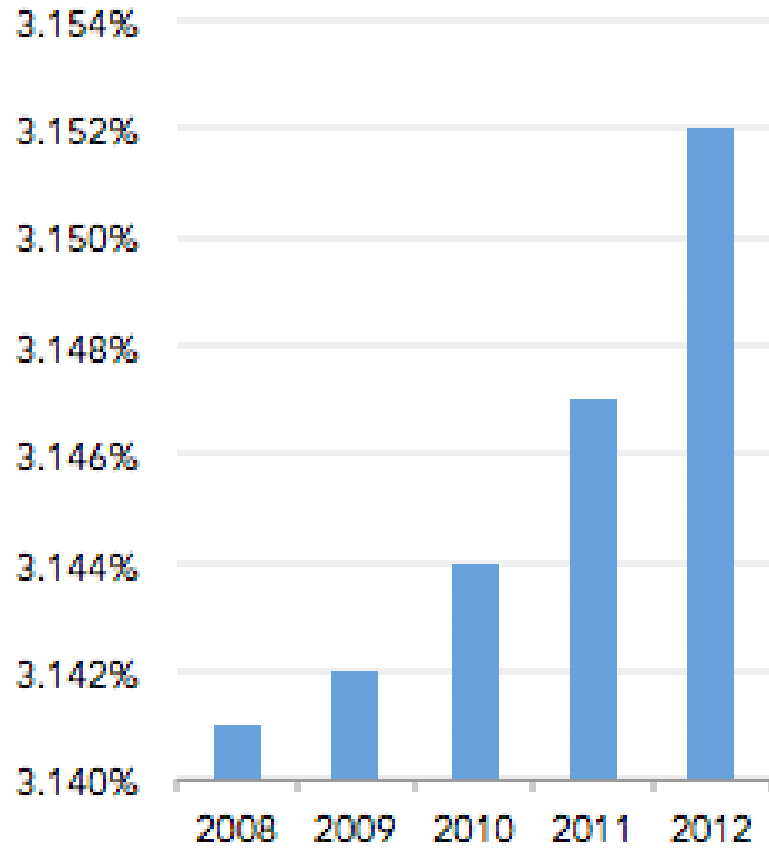
# Visual Encoding works with a Sign System

Images are perceived as a set of signs

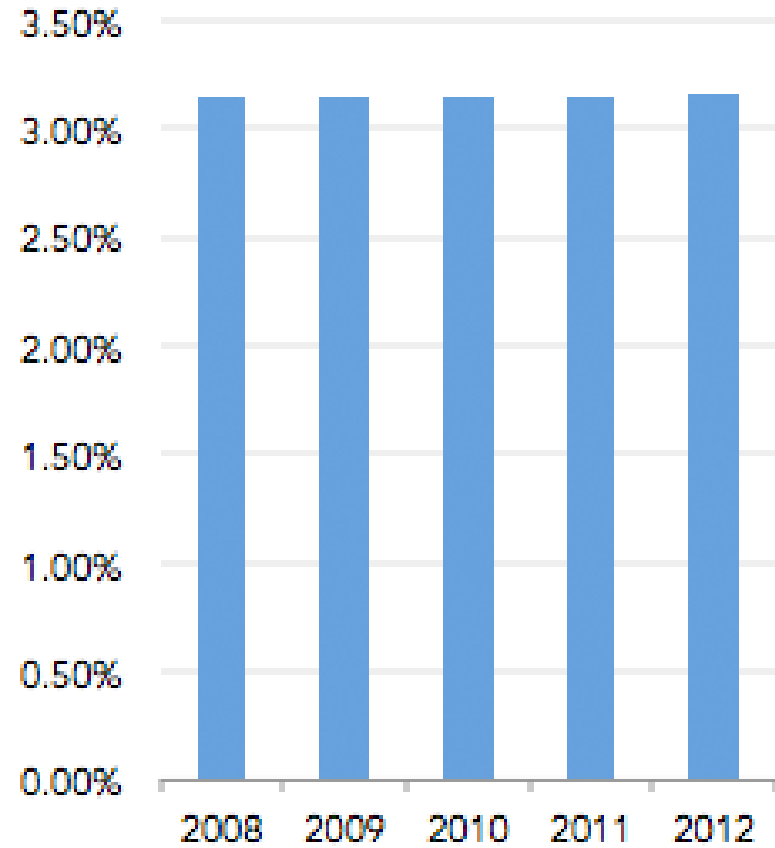
Designer encodes information in signs

Receiver decodes information from signs

### Interest Rates



### Interest Rates





# Visualization ~~Rules~~ Advice

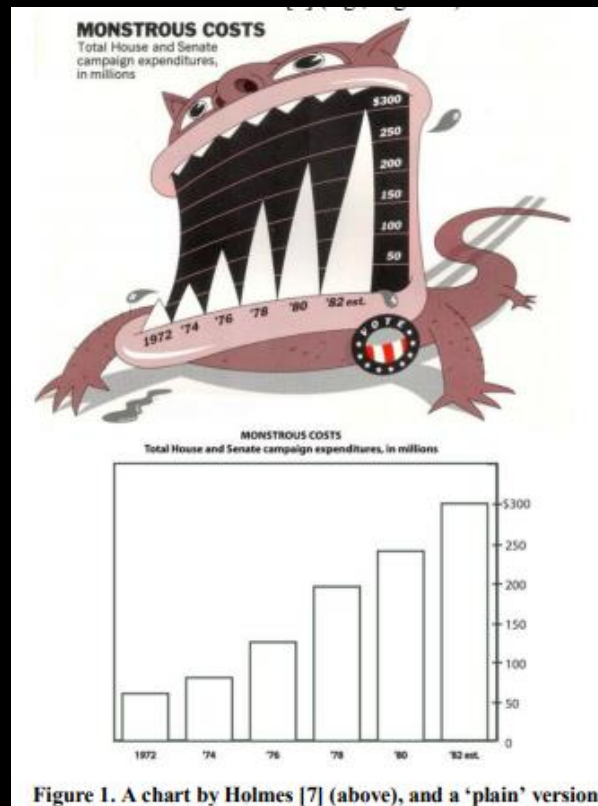
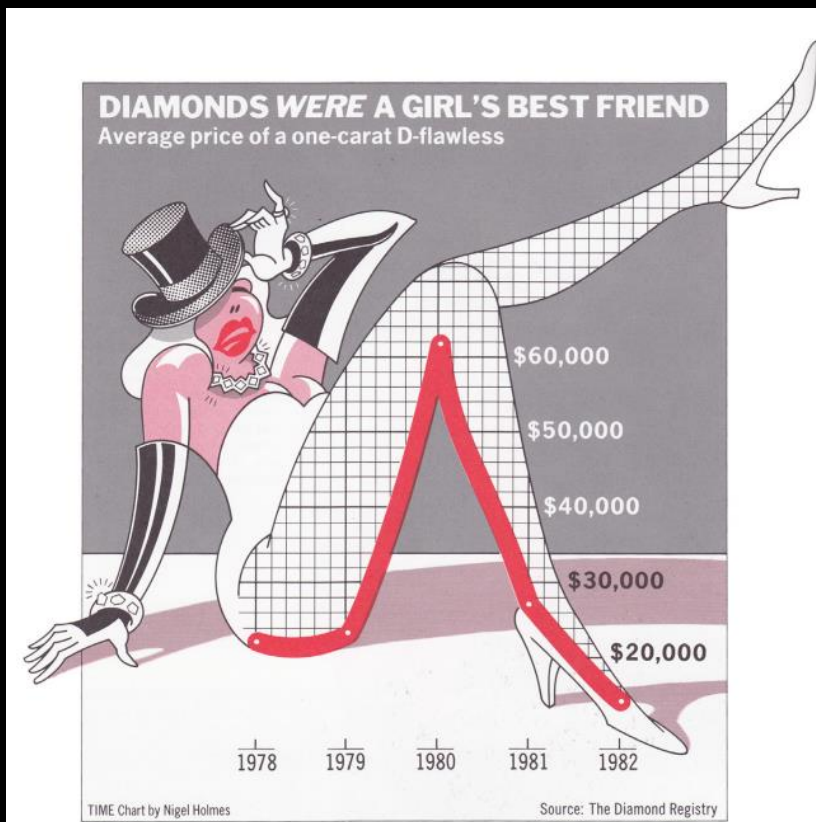
“Avoid chart junk at all costs”

“Bright colors don't work”

“Never use pie charts”

“No rainbow color-maps”

- These are all very situationally dependent
- Make sure you have reasons for breaking them



## Useful Junk? The Effects of Visual Embellishment on Comprehension and Memorability of Charts

Scott Bateman, Regan L. Mandryk, Carl Gutwin,  
Aaron Genest, David McDine, Christopher Brooks

Department of Computer Science, University of Saskatchewan, Saskatoon, Saskatchewan, Canada  
scott.bateman@usask.ca, regan@cs.usask.ca, gutwin@cs.usask.ca,  
aaron.genest@usask.ca, dam085@mail.usask.ca, cab938@mail.usask.ca

# Visual Variable Properties

## 1. Selective

- Is a change of a mark in this variable alone enough to allow us to select it from other marks?

## 2. Associative

## 3. Quantitative

## 4. Order

## 5. Length

# Is Size Selective?

Can you find the big & small Muppets?



# Is Size Selective?

Can you find the big & small Muppets?



# Visual Variable Properties

## 1. Selective

- Is a change of a mark in this variable alone enough to allow us to select it from other marks?

## 2. Associative

- Can we identify a group of marks by this variable?

## 3. Quantitative

## 4. Order

## 5. Length

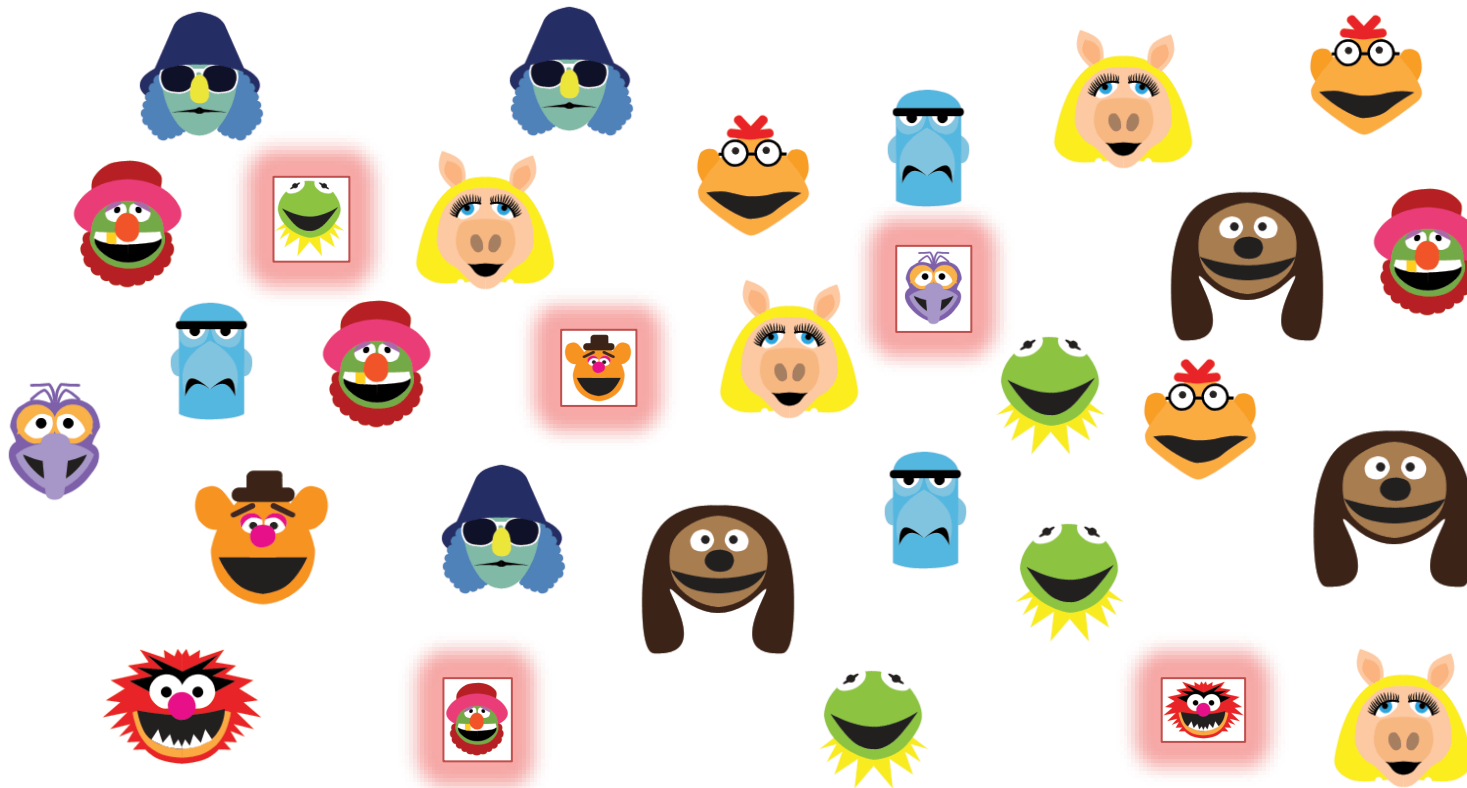
# Is Size Associative?

Can you find the small Muppets?



# Is Size Associative?

Can you find the small Muppets?





# Visual Variable Properties

## 1. Selective

- Is a change of a mark in this variable alone enough to allow us to select it from other marks?

## 2. Associative

- Can we identify a group of marks in this variable?

## 3. Quantitative

- Can the relation between two of these marks be seen as numeric? Can we tell if one is 3X another?

## 4. Order

## 5. Length

# Is Size Quantitative?

What value is Kermit compared to Fozzie?

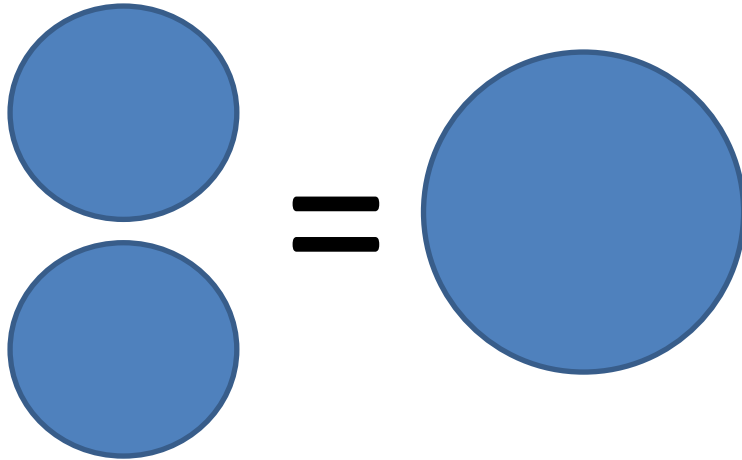
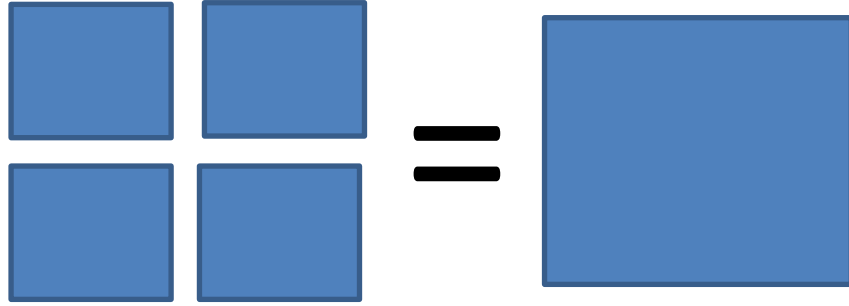


# Is Size Quantitative?

What value is Kermit compared to Fozzy?



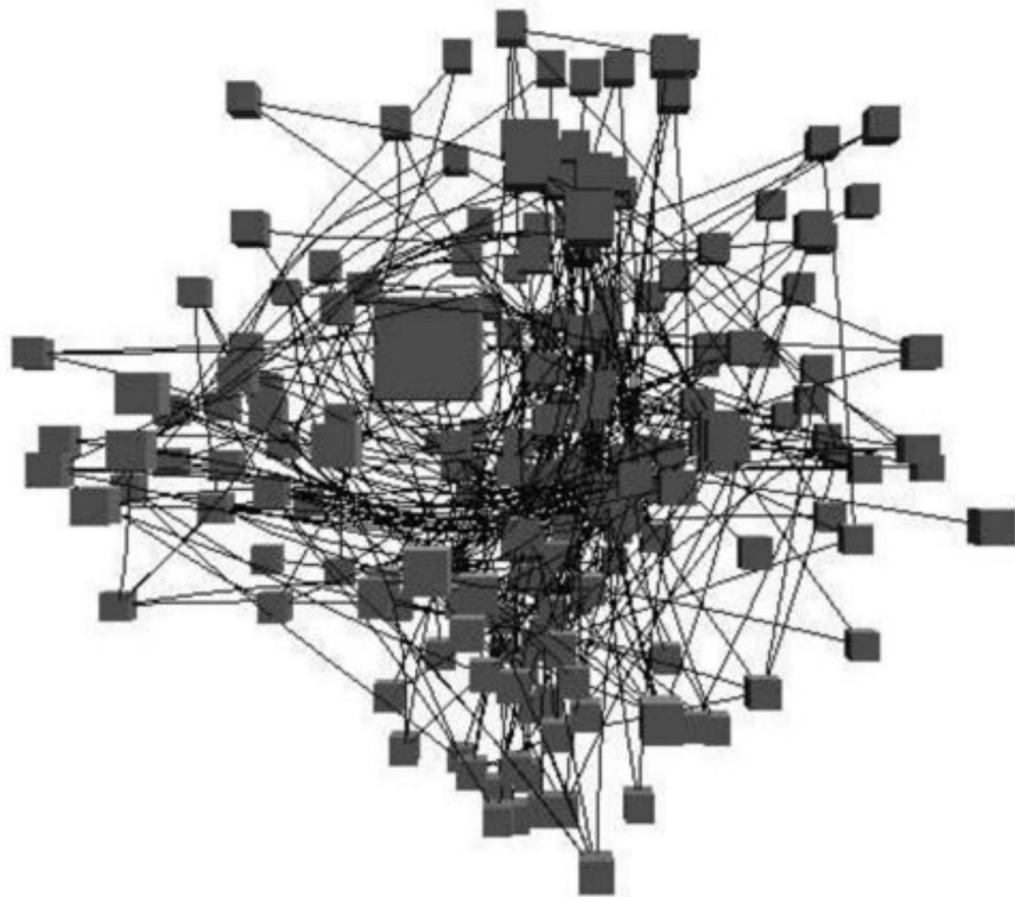
# Is Size Quantitative?



*3D*

Problems

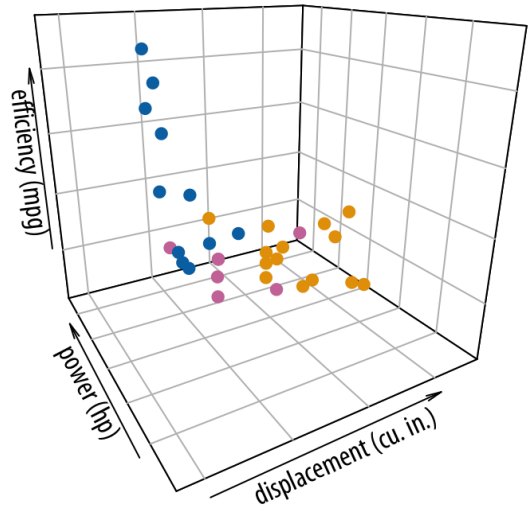
- Comparison
- Occlusion / viewpoint



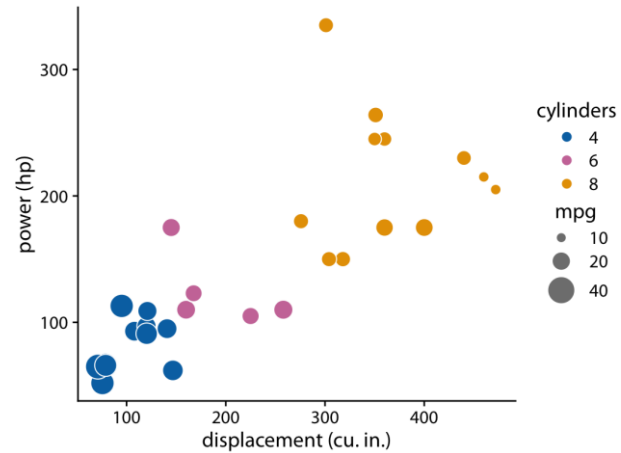
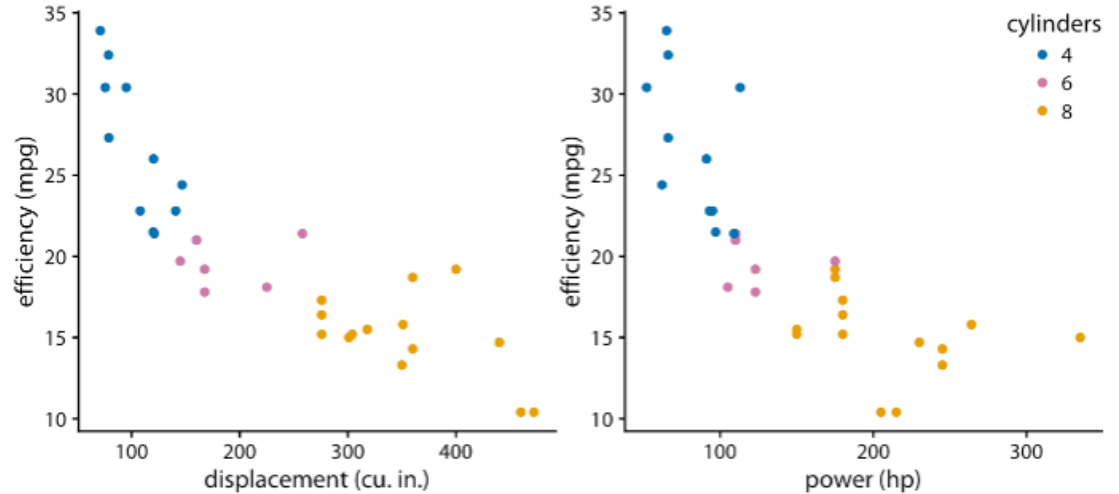
# Avoid 3D

Look for a better solution

b



cylinders ● 4 ● 6 ● 8





# Visual Variable Properties

## 1. Selective

- Is a change of a mark in this variable alone enough to allow us to select it from other marks?

## 2. Associative

- Can we identify a group of marks in this variable?

## 3. Quantitative

- Can the relation between two of these marks be seen as numeric? Can we tell if one is 3X another?

## 4. Order

- Does this variable support ordered reading (more/less)?

## 5. Length



# Is Size Ordered?



# Visual Variable Properties

## 1. Selective

- Is a change of a mark in this variable alone enough to allow us to select it from other marks?

## 2. Associative

- Can we identify a group of marks in this variable?

## 3. Quantitative

- Can the relation between two of these marks be seen as numeric? Can we tell if one is 3X another?

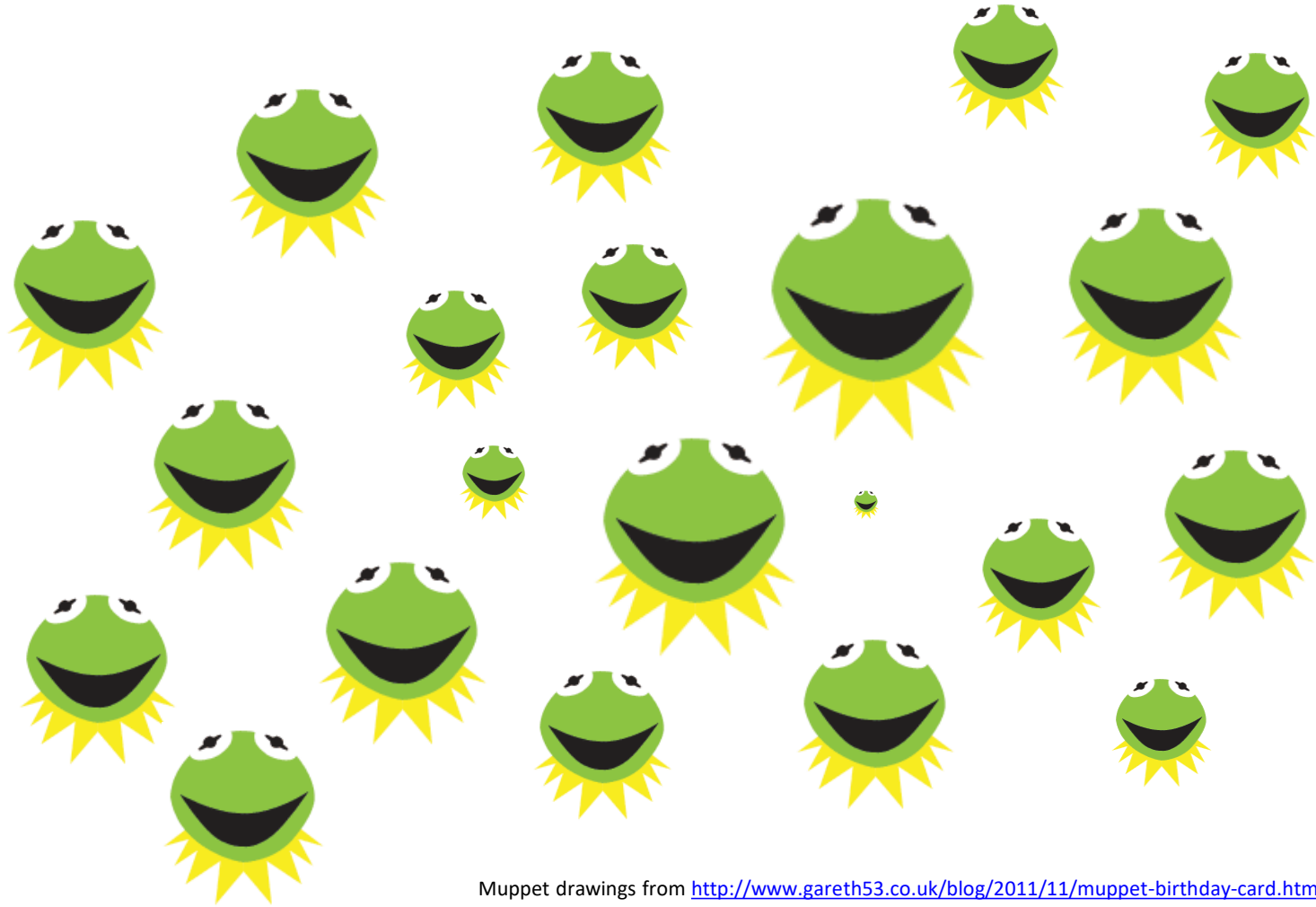
## 4. Order

- Does this variable support ordered reading (more/less)?

## 5. Length

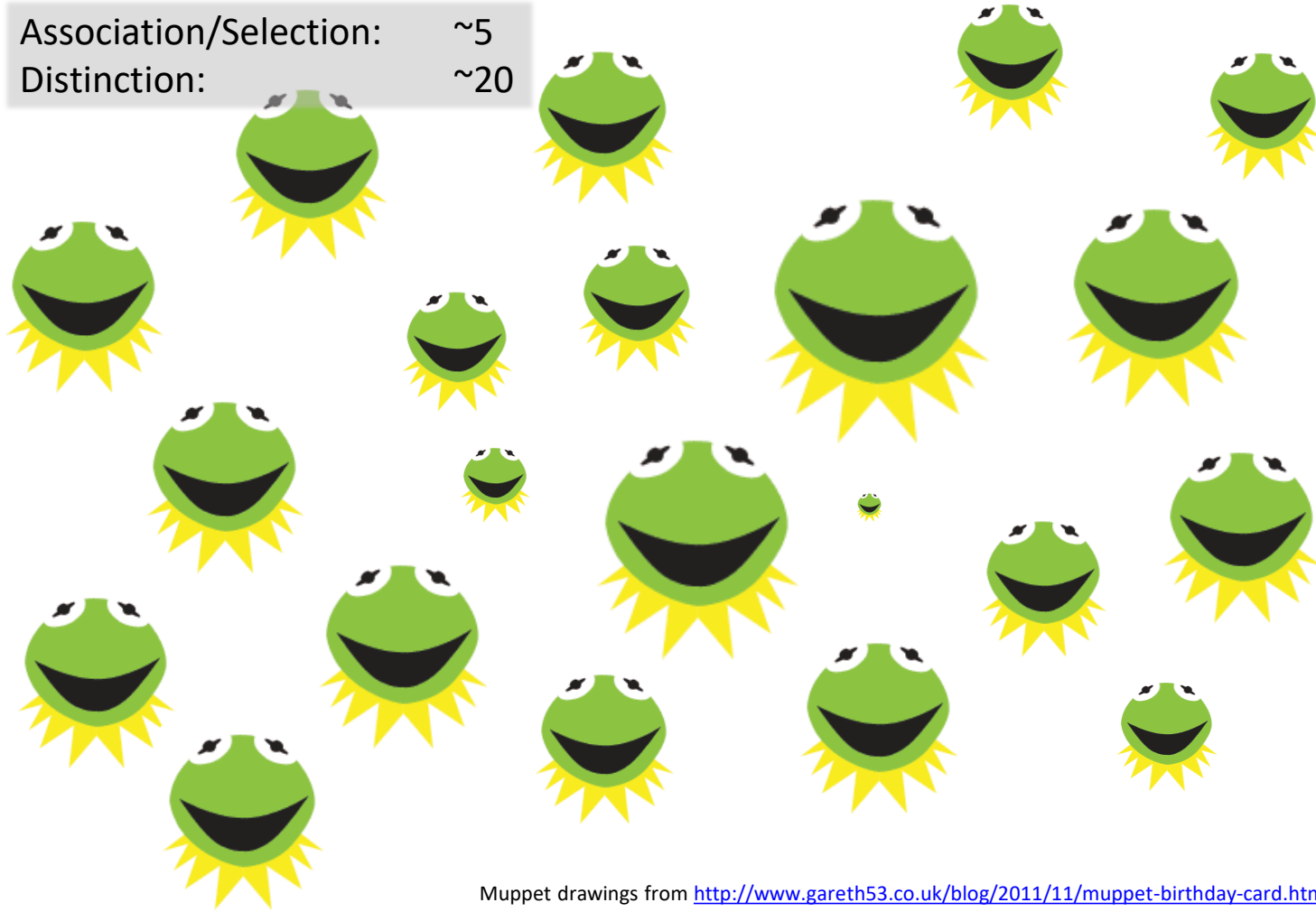
- How many differences in this variable can be discerned?

# *What Length Does Size Have?*



# What Length Does Size Have?

Association/Selection: ~5  
Distinction: ~20



# Visual Encoding Channel Properties

- **Selective**

- Is a change in this variable alone enough to allow us to select it from a group?

- **Associative**

- Can we identify a group of these marks?

- **Quantitative**

- Can the relation between two of these marks be seen as numeric? Can we tell if one is 3X as much as another?

- **Order**

- Does this variable support ordered reading (more/less)?

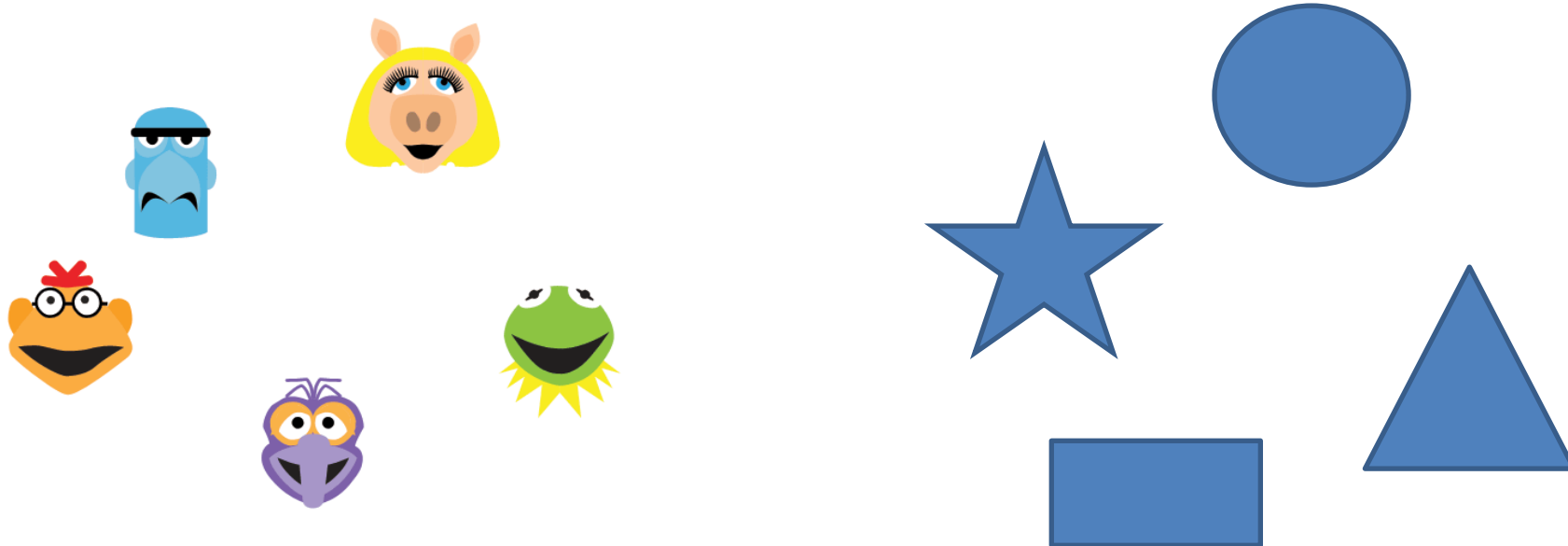
- **Length**

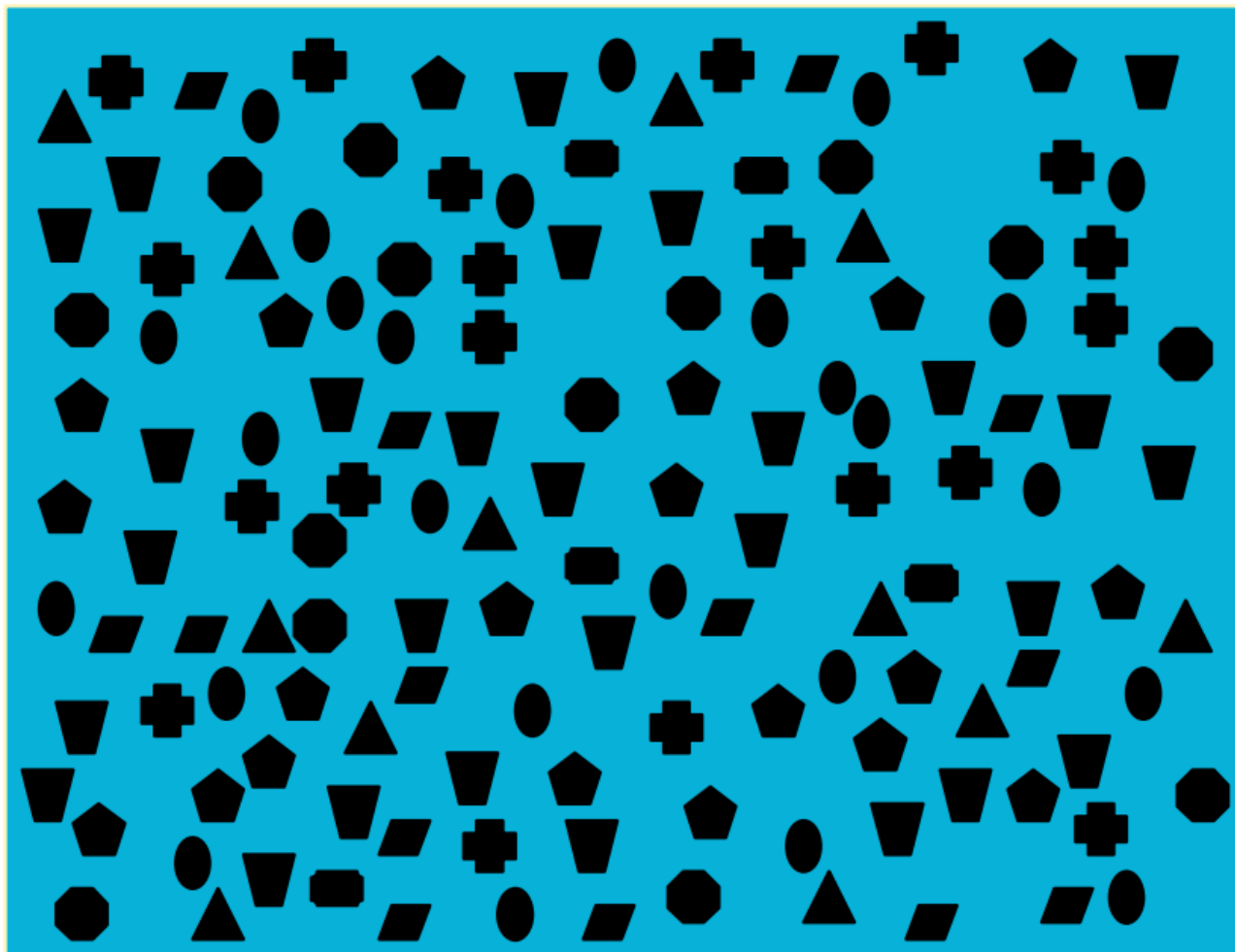
- How many differences in this variable can be discerned?

Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
<b>Position</b>	Yes	Yes	Yes	Yes	Infinite
Shape					
Lightness					
Saturation					
Hue					
Angle					
Texture					



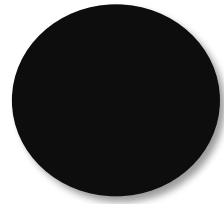
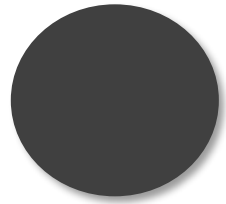
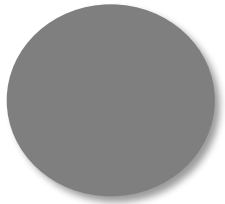
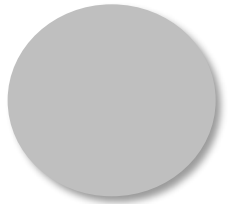
Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
Lightness					
Saturation					
Hue					
Angle					
Texture					

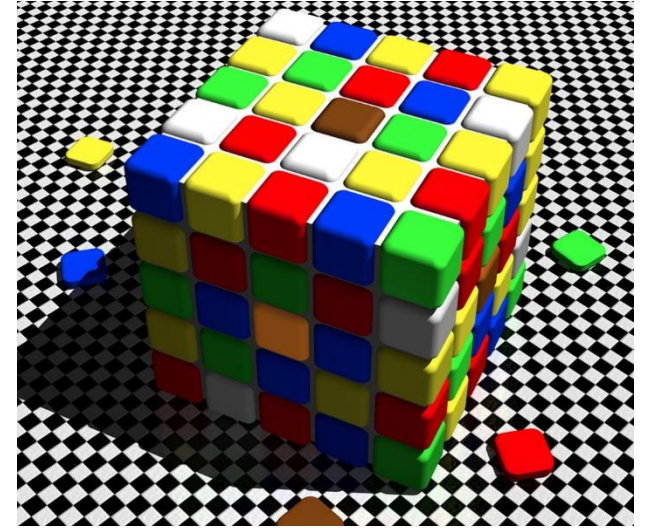
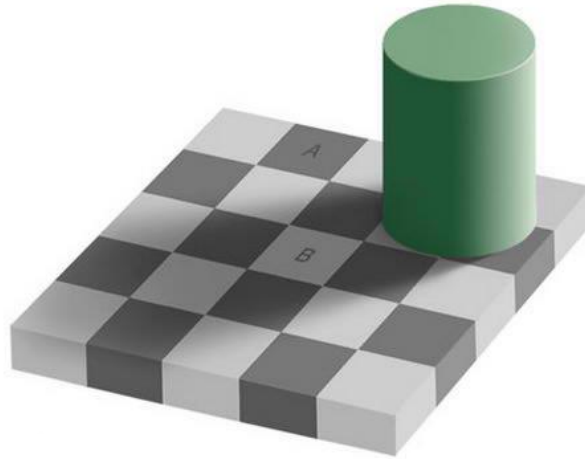
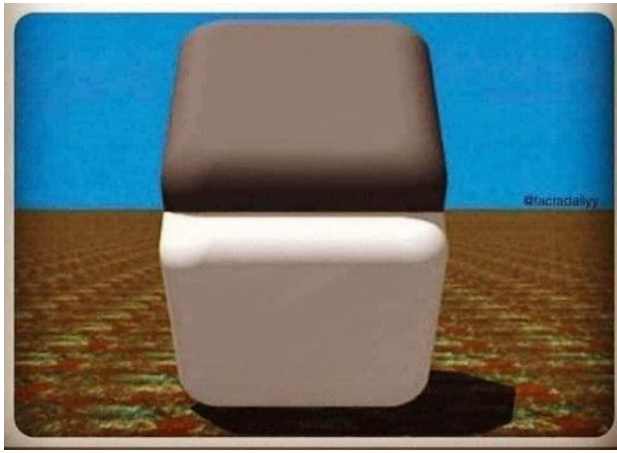






Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
<b>Lightness</b>	Yes	Yes	No	Yes	7 / 10
<b>Saturation</b>	Yes	Yes	No	Yes	7 / 10
Hue					
Angle					
Texture					

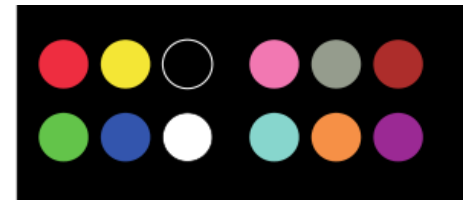
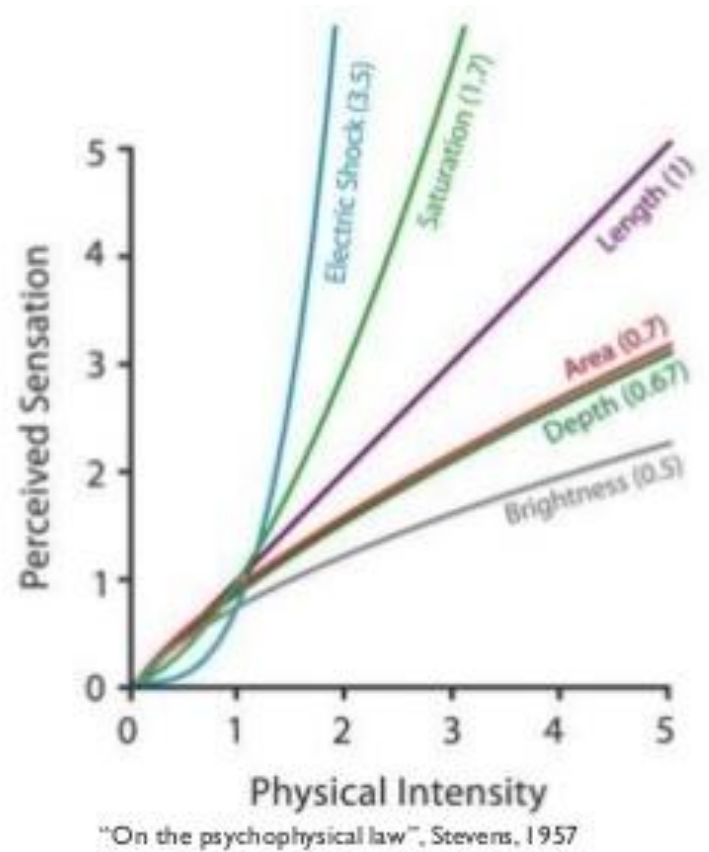




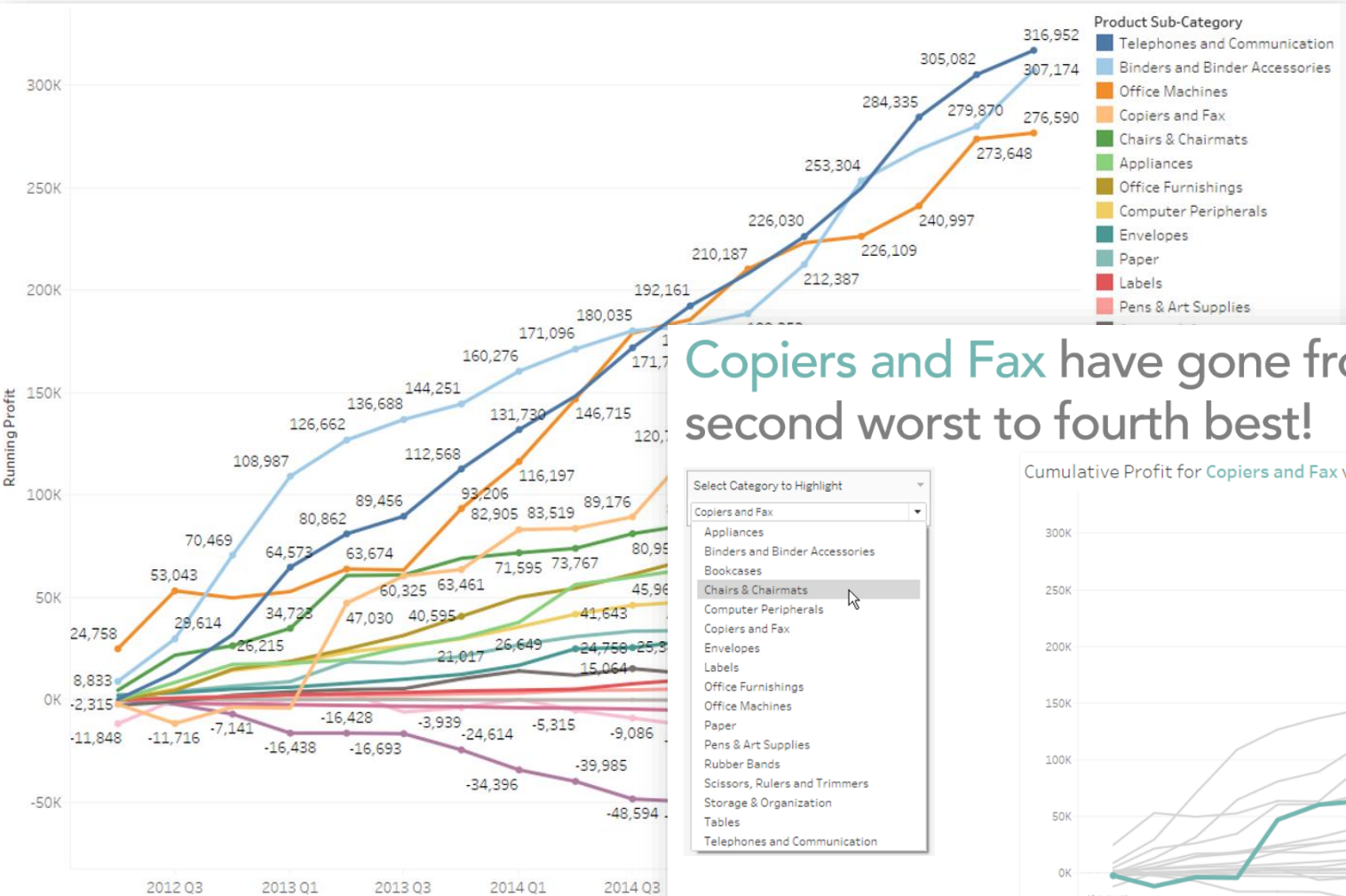
Weber's Law: human perception is fundamentally based on relative judgments, not absolute values.

# Colour

- Use Carefully! Less is more
- Stick to 5-8 colours (less is more)
  - Good contrast
  - Don't clash
  - Works in grayscale and for colour vision deficiencies (no red & green)



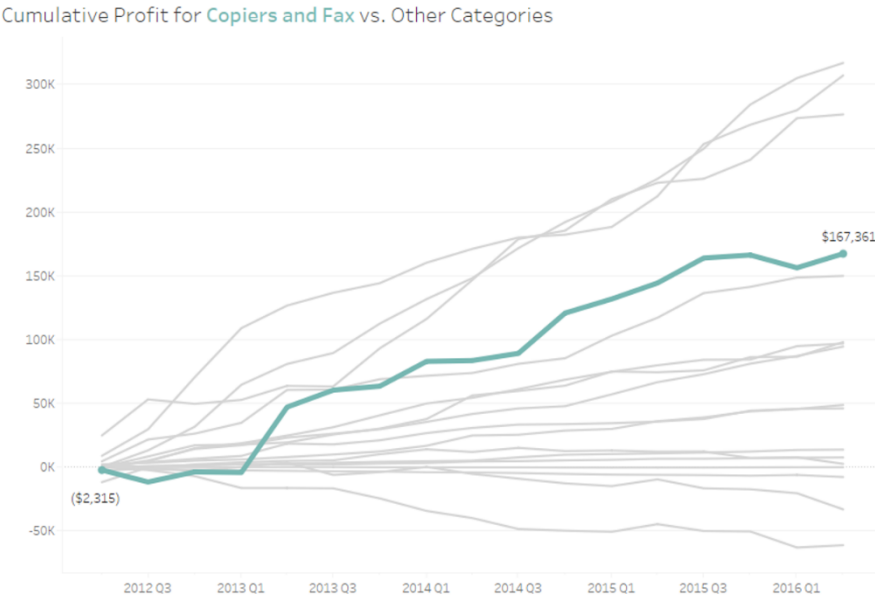
# Too much colour



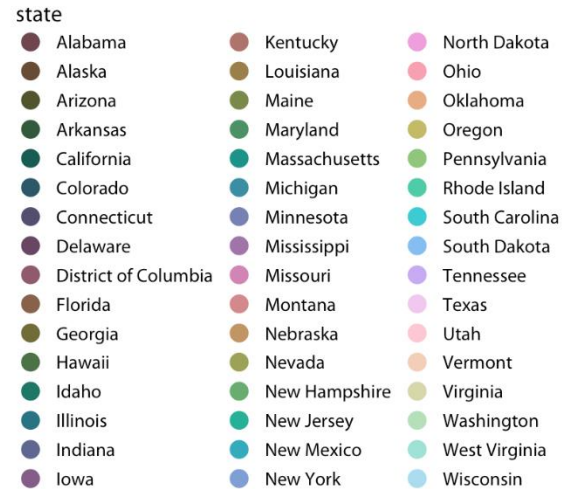
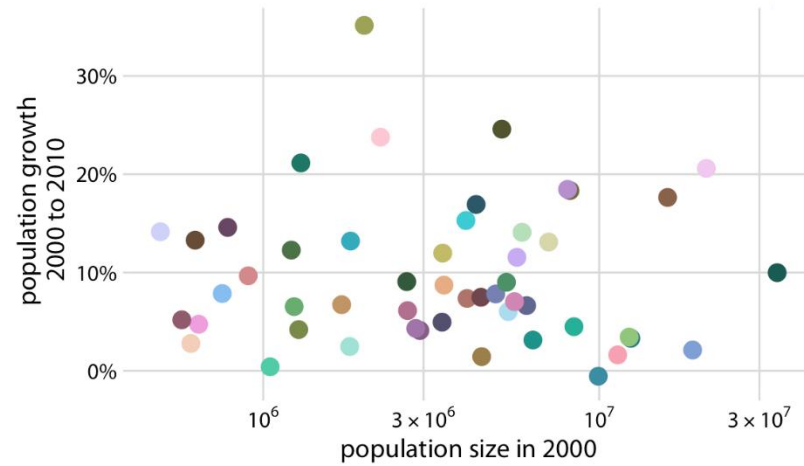
Copiers and Fax have gone from second worst to fourth best!

Select Category to Highlight

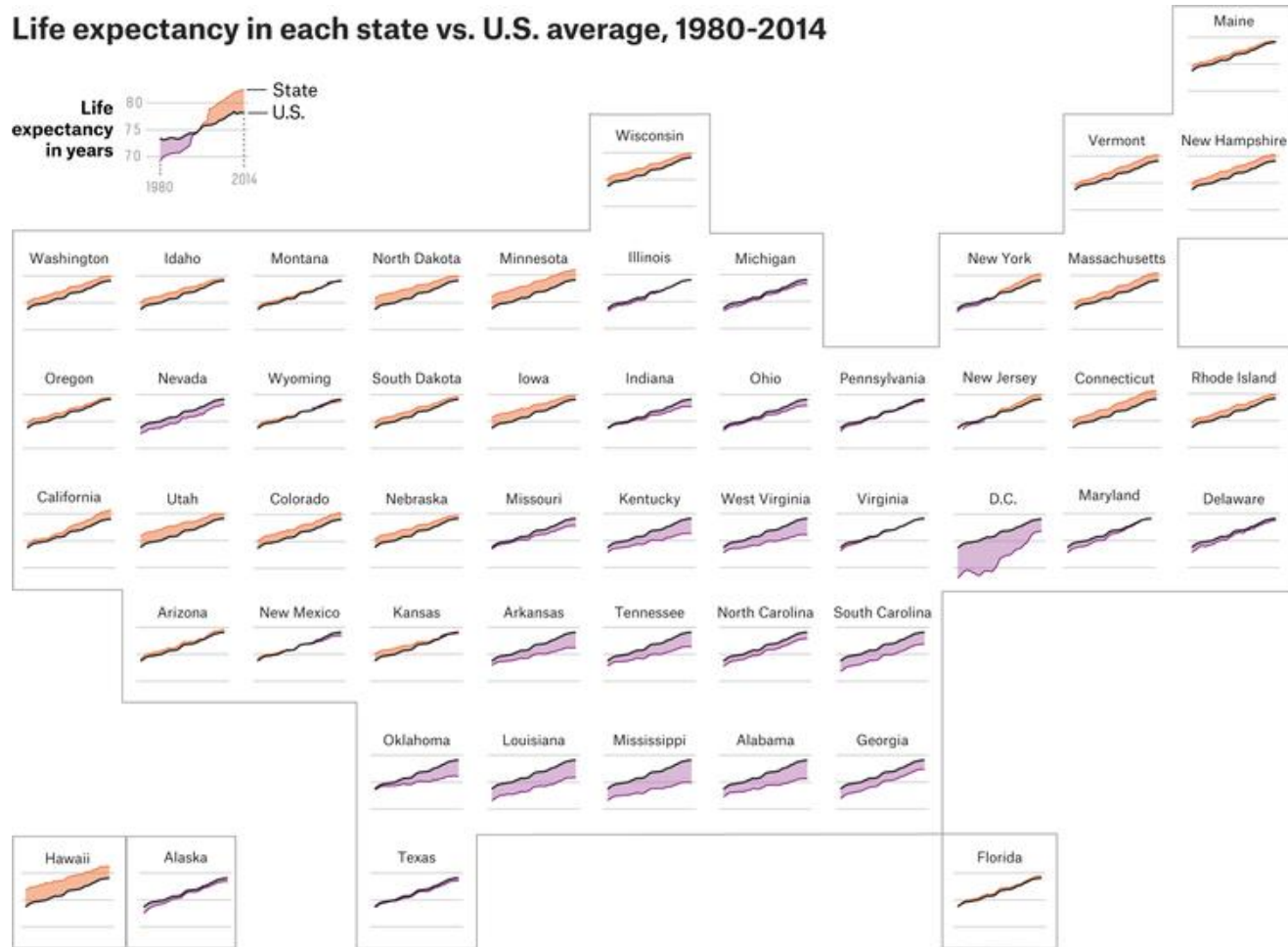
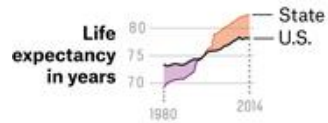
- Copiers and Fax
- Appliances
- Binders and Binder Accessories
- Bookcases
- Chairs & Chairmats
- Computer Peripherals
- Copiers and Fax
- Envelopes
- Labels
- Office Furnishings
- Office Machines
- Paper
- Pens & Art Supplies
- Rubber Bands
- Scissors, Rulers and Trimmers
- Storage & Organization
- Tables
- Telephones and Communication



## Too many colours



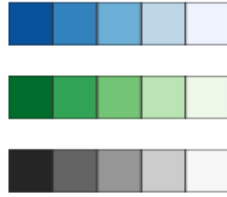
# Life expectancy in each state vs. U.S. average, 1980-2014



# Colour Scales

## Sequential (dark to light or light to dark)

- Quantitative data or ordered qualitative data
- Single or multiple hues



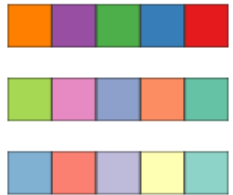
## Diverging (dark in 1 hue to light to dark in a different hue)

- Quantitative data or ordered qualitative data
- Use if there is a meaningful middle point

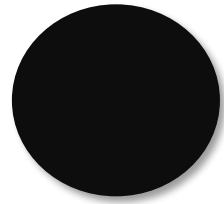
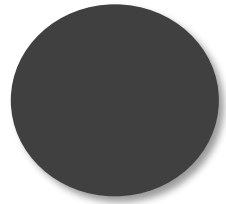
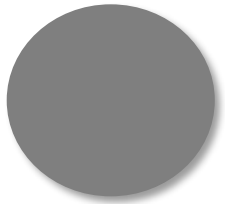
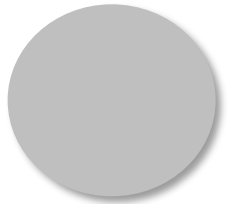


## Categorical

- Qualitative data
- Give hues different brightness so that they appear distinct in grayscale
- Be careful with red & green



Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
<b>Lightness</b>	Yes	Yes	No	Yes	7 / 10
<b>Saturation</b>	Yes	Yes	No	Yes	7 / 10
Hue					
Angle					
Texture					

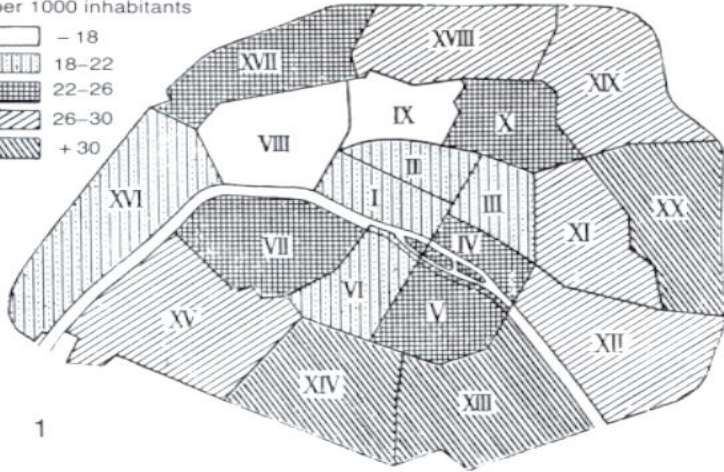
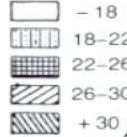




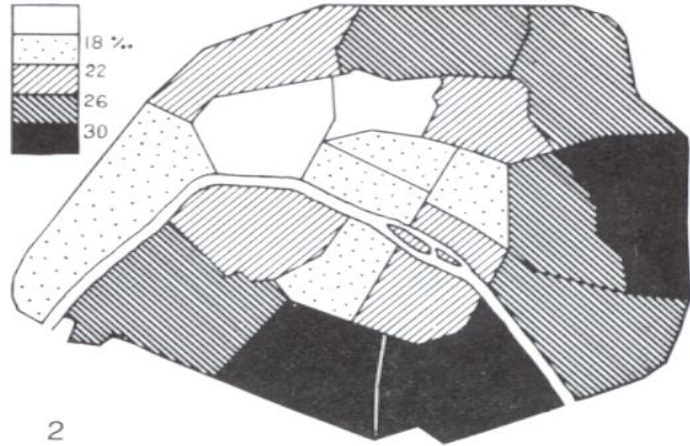
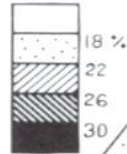
# Lightness & Saturation Are ORDERED, cannot be REORDERED

ANNUAL DEATHS PER 1000 INHABITANTS, PARIS

ANNUAL DEATHS  
per 1000 inhabitants

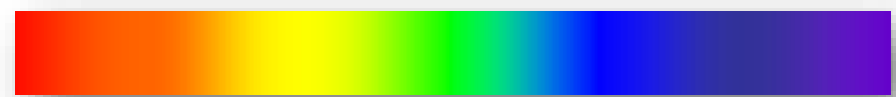
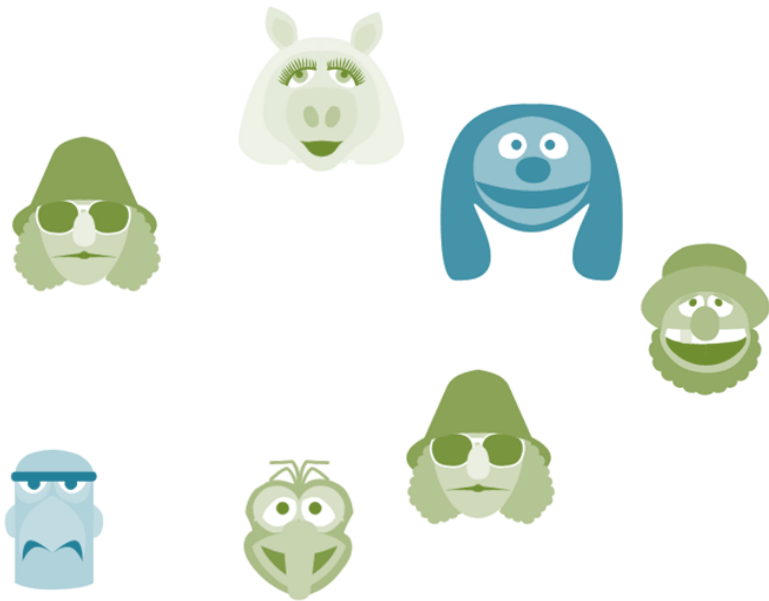


VALUES **NOT ORDERED CORRECTLY** ACCORDING TO SCALE  
INFORMATION HAS TO BE READ POINT BY POINT



VALUES **ORDERED CORRECTLY** MAKE  
THE IMAGE MUCH MORE USEFUL

Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
Lightness	Yes	Yes	No	Yes	7 / 10
Saturation	Yes	Yes	No	Yes	7 / 10
<b>Hue</b>	Yes	Yes	Not advisable	Not advisable	7 / 10
Angle					
Texture					

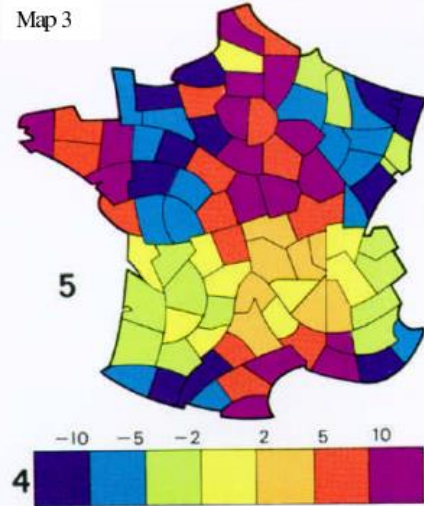


## Rainbow Scale Considerations

Map 1



Map 3

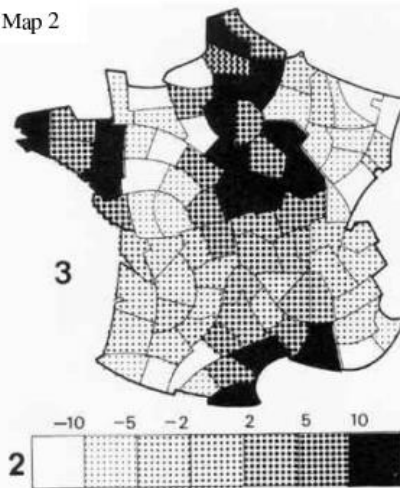


## Rainbow Scale Considerations

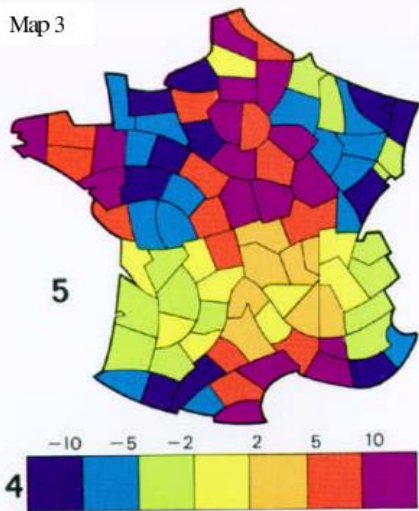
Map 1



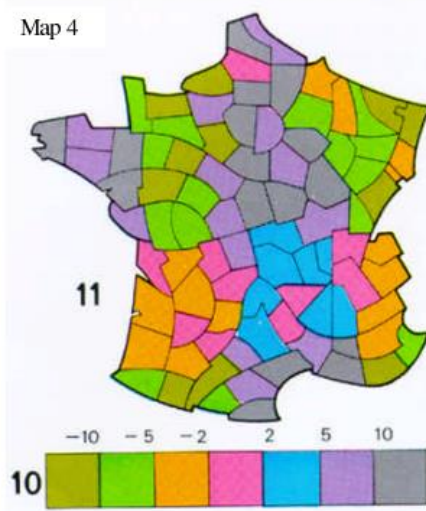
Map 2

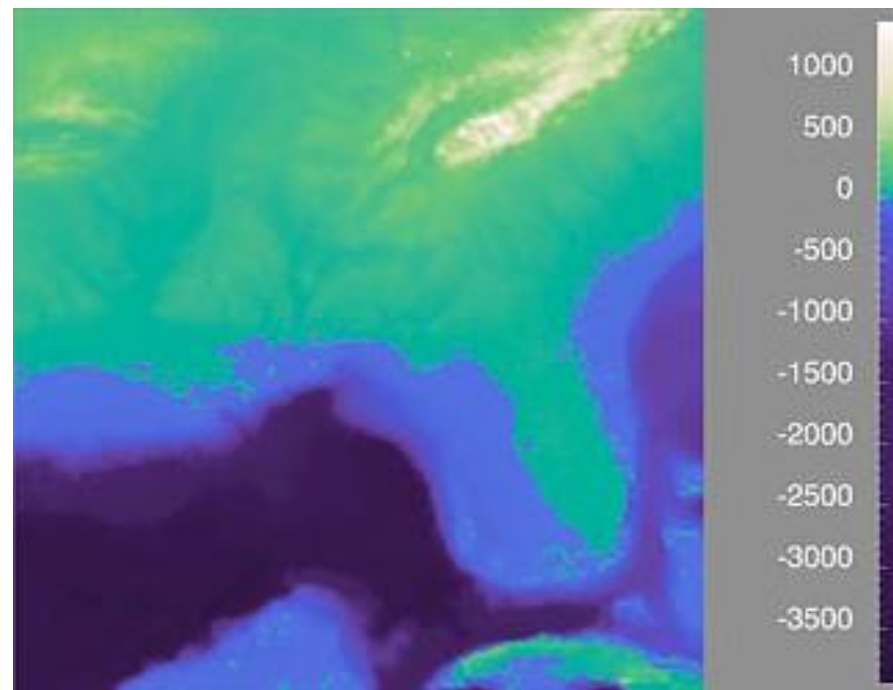
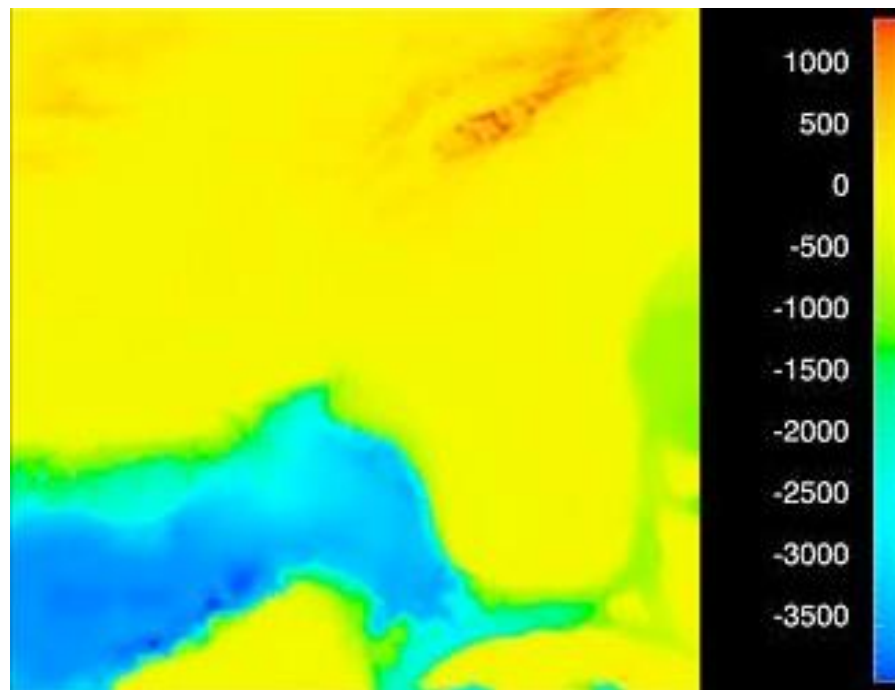


Map 3

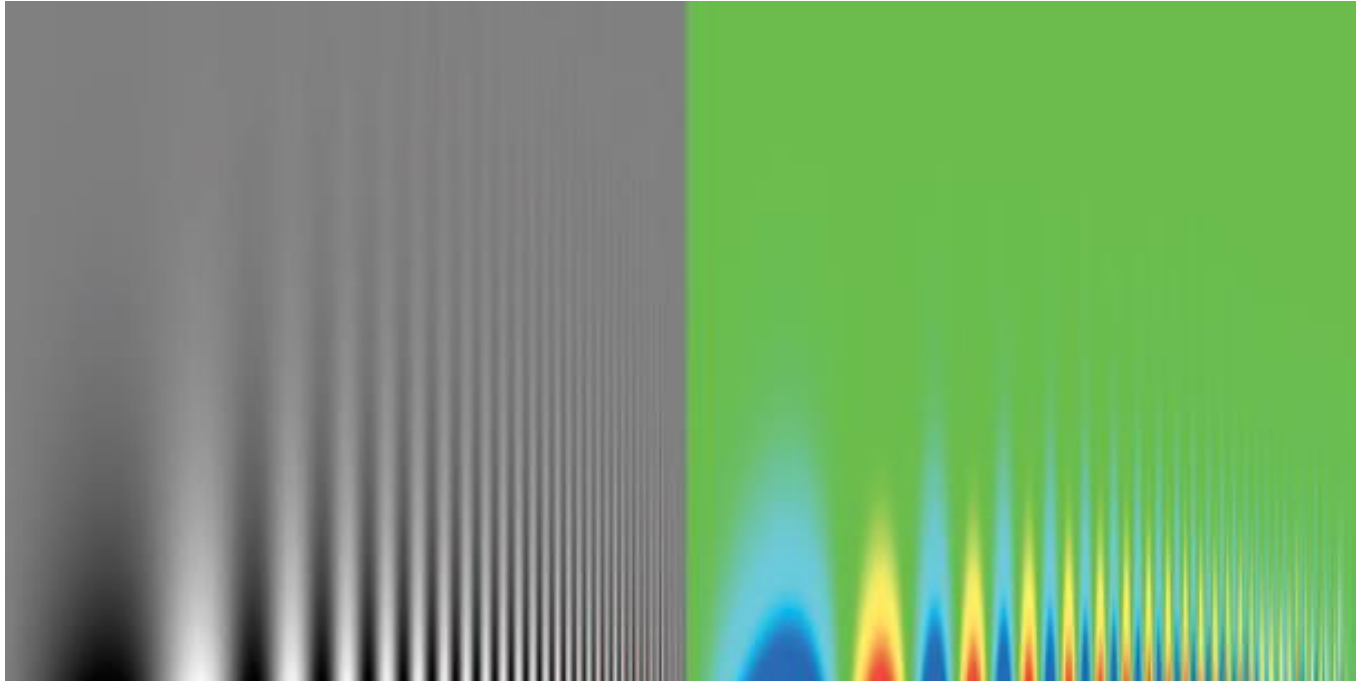


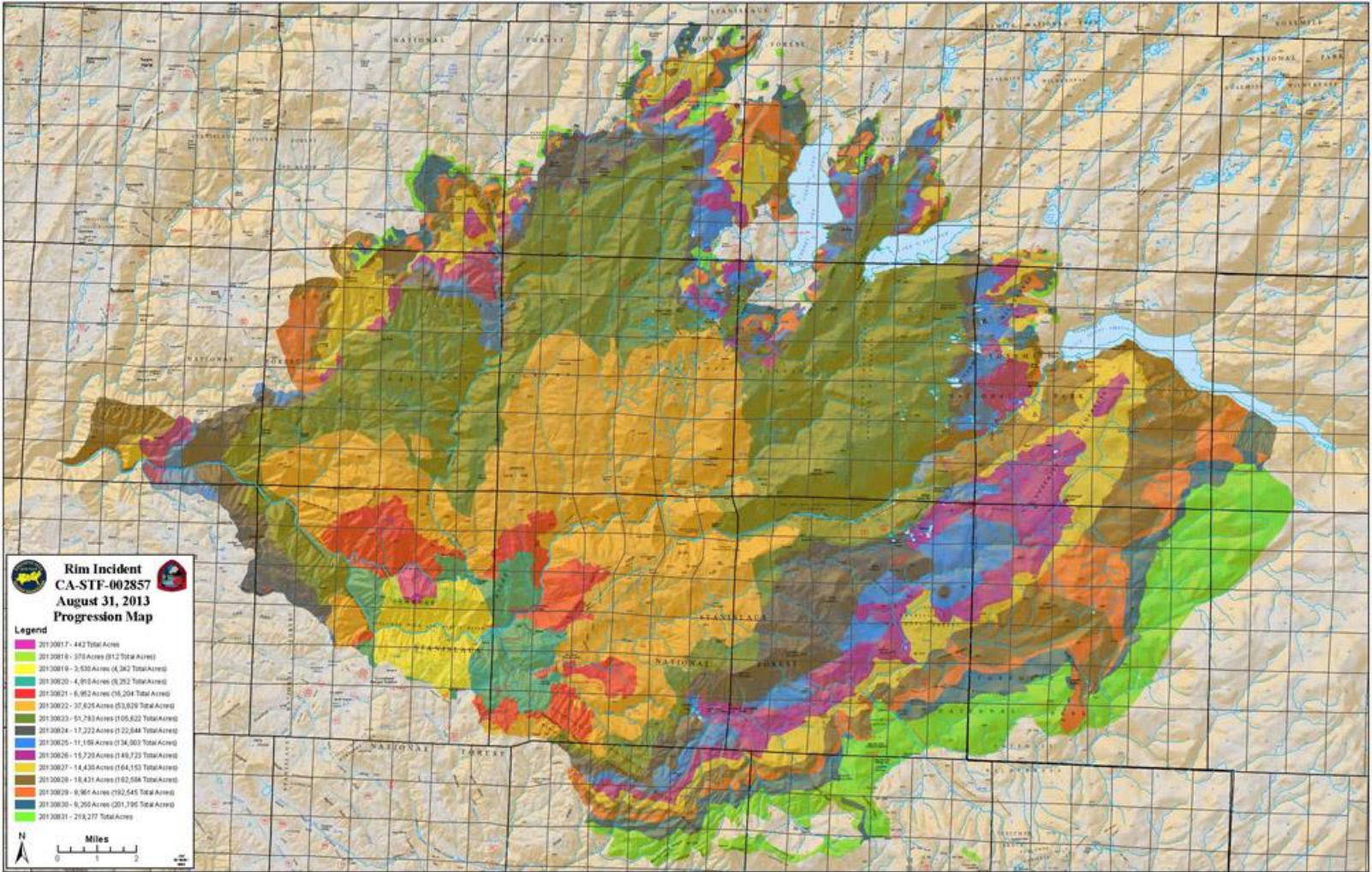
Map 4

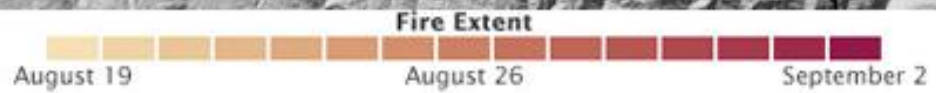
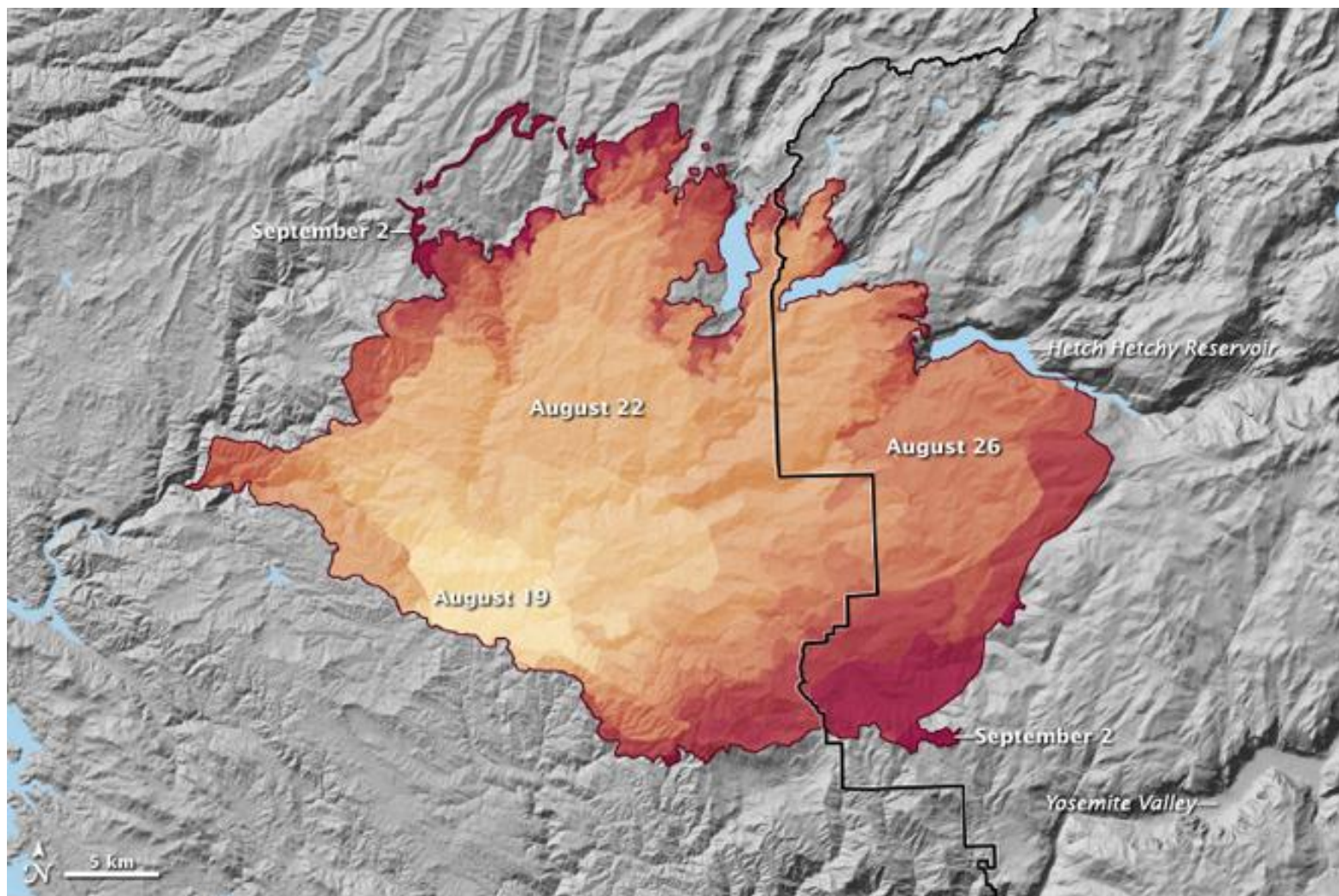




# *Destroys Detail*









Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
Lightness	Yes	Yes	No	Yes	7 / 10
Saturation	Yes	Yes	No	Yes	7 / 10
Hue	Yes	Yes	Not advisable	Not advisable	7 / 10
<b>Angle</b>	<b>Yes</b>	<b>Yes</b>	<b>No</b>	<b>No</b>	<b>4 / 8</b>
Texture					



Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
Lightness	Yes	Yes	No	Yes	7 / 10
Saturation	Yes	Yes	No	Yes	7 / 10
Hue	Yes	Yes	Not advisable	Not advisable	7 / 10
Angle	Yes	Yes	No	No	4 / 8
<b>Texture</b>	<b>Yes</b>	<b>Yes</b>	<b>No</b>	<b>No</b>	<b>Infinite</b>



Variable	Selective	Associative	Quantitative	Order	Length
Size	Yes	Yes	Yes (1D), Mostly (2D), Not likely (3D)	Yes	5/20
Position	Yes	Yes	Yes	Yes	Infinite
Shape	< 5	< 5	No	No	5 / Infinite
Lightness	Yes	Yes	No	Yes	7 / 10
Saturation	Yes	Yes	No	Yes	7 / 10
Hue	Yes	Yes	Not advisable	Not advisable	7 / 10
Angle	Yes	Yes	No	No	4 / 8
Texture	Yes	Yes	No	No	Infinite

***Semiology of Graphics*** by Jacques Bertin. 1967.

M.S.T. Carpendale. [Considering Visual Variables as a Basis for Information Visualisation.](#)

Research report 2001-693-16, Department of Computer science, University of Calgary, 2003.

➔ **Magnitude Channels: Ordered Attributes**

Position on common scale 

Position on unaligned scale 

Length (1D size) 

Tilt/angle 

Area (2D size) 

Depth (3D position) 

Color luminance 

Color saturation 


Curvature 

Volume (3D size) 

Same

Most Effectiveness Least

➔ **Identity Channels: Categorical Attributes**

Spatial region 

Color hue 

Motion 

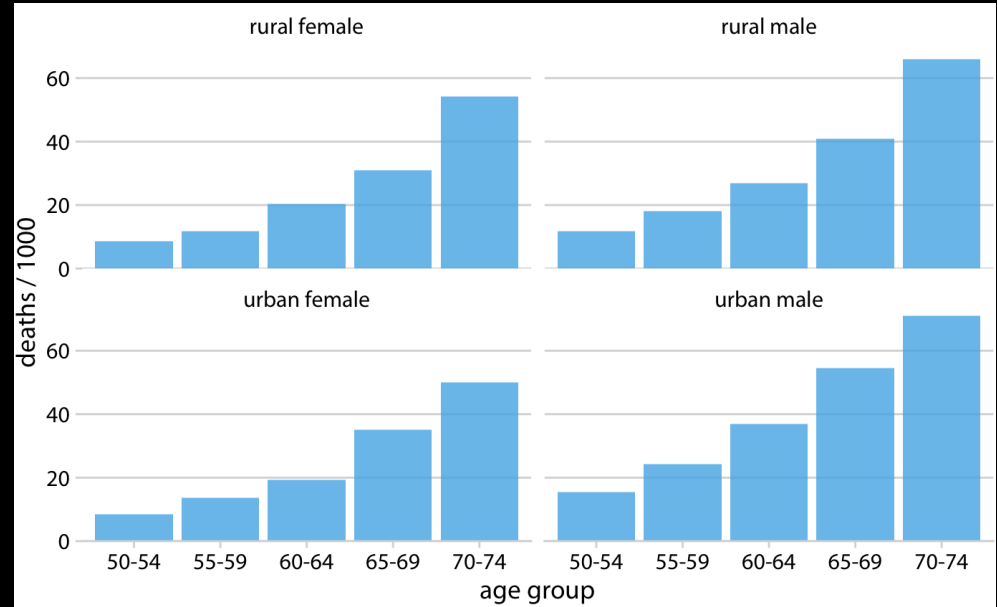
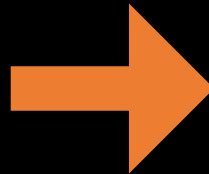
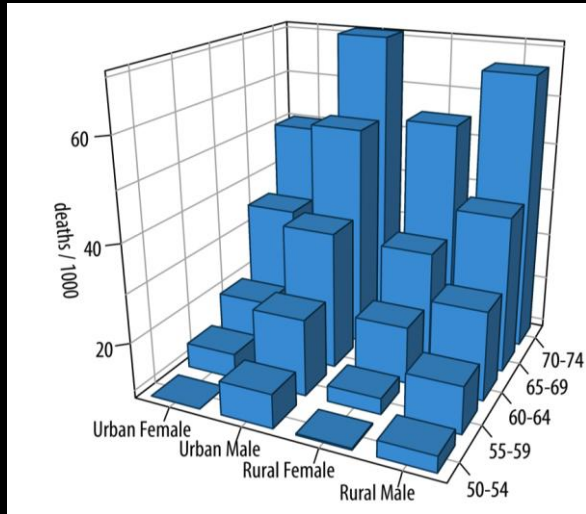
Shape 

# Small Multiples

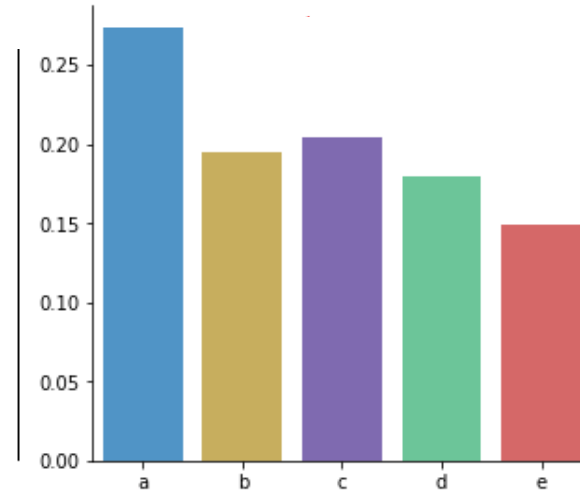
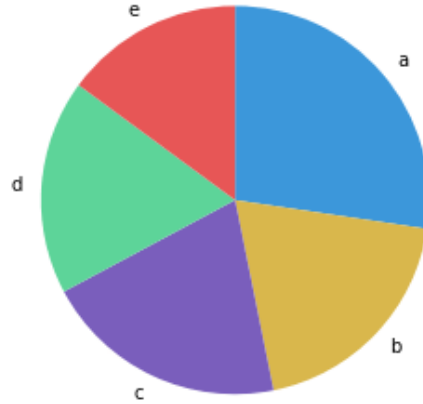
Break complicated charts into smaller, simplified charts

Use alignment and repetition to highlight differences

Needs appear in order and same scales, sizes, & shape



# Pie Charts – Use Carefully



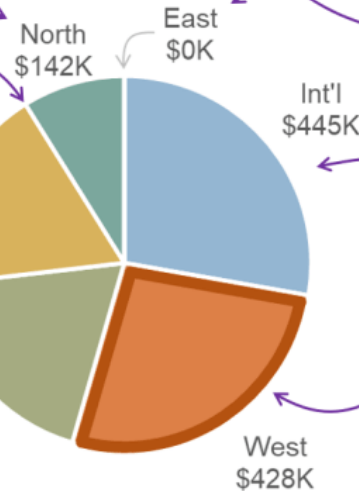
## Donations by Region, 2022

Label slices directly whenever possible (avoid legends). Use leader lines if necessary.

Use thin gaps to separate slices, not border lines (reserve borders for highlighting).

Vary the colors of slices.

Locate labels outside of slices.



Label zero-value parts (unless you're certain that they're truly irrelevant).

Usually, sort the parts, usually from largest to smallest, starting at "12 o'clock," going clockwise.

Avoid highlighting individual slices by "exploding" them. Use borders, darker colors, etc. to highlight.

# Chart Types

<https://datavizcatalogue.com/>

<https://flowingdata.com/chart-types/>



# Data Vis Catalog

## What do you want to show?

Here you can find a list of charts categorised by their data visualization functions or by what you want a chart to communicate to an audience. While the allocation of each chart into specific functions isn't a perfect system, it still works as a useful guide for selecting chart based on your analysis or communication needs.



Comparisons



Proportions



Relationships



Hierarchy



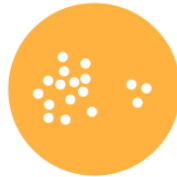
Concepts



Location



Part-to-a-whole



Distribution

## Relationships

Relationships: Visualization methods that show relationships and connections between the data or show correlations between two or more variables.



Heatmap



Marimekko Chart



Parallel Coordinates Plot



Radar Chart



Venn Diagram

For showing connections



Arc Diagram



Brainstorm



Chord Diagram



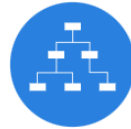
Connection Map



Network Diagram



Non-ribbon Chord Diagram



Tree Diagram

For finding correlations



Bubble Chart



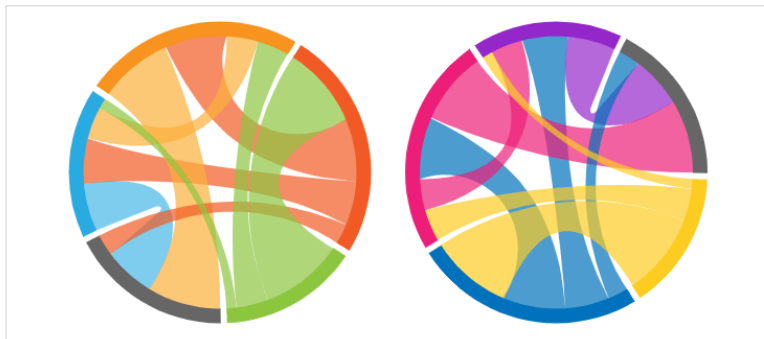
Heatmap



Scatterplot



## Chord Diagram



### Description

This type of diagram visualises the inter-relationships between entities. The connections between entities are used to display that they share something in common. This makes Chord Diagrams ideal for comparing the similarities within a dataset or between different groups of data.

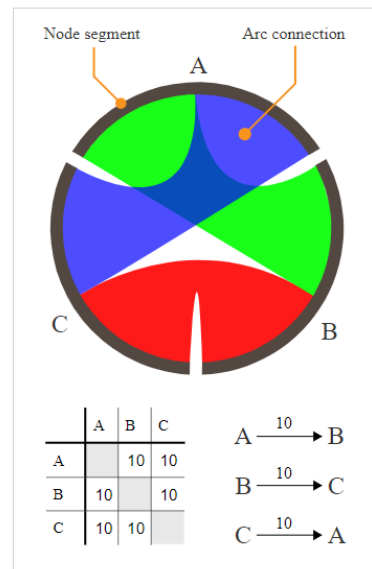
Nodes are arranged along a circle, with the relationships between points connected to each other either through the use of arcs or Bézier curves. Values are assigned to each connection, which is represented proportionally by the size of each arc. Colour can be used to group the data into different categories, which aids in making comparisons and distinguishing groups.

Over-cluttering becomes an issue with Chord Diagrams when there are too many connections displayed.

### Functions

Comparisons Relationships

### Anatomy



# Data Visualization Tools

Mostly free

1. Preparing Data
2. Visualization



# Data Tools:

## Data Wrangler / Trifacta

<http://vis.stanford.edu/wrangler>

<https://www.trifacta.com>

- Interactive tool for cleaning & rearranging
- Suggests changes
- Wrangler: web tool – data to external site (1000 lines)
- Import: text, CSV, JSON
- Export: CSV, JSON, TDE (Tableau)

DataWrangler<sup>alpha</sup>



# Data Tools: Open Refine



<http://openrefine.org/>

- Consolidate spelling
- Auto-detect outliers
- Sorting & filtering
- Auto-suggests changes
- Import: Excel, XML, JSON, RDF, CSV
- Export: Excel, CSV, ODF, HTML

A screenshot of the Open Refine web interface. The browser address bar shows "Google Chrome - googleadsreport.csv". The interface has a top navigation bar with "Home", "Import", "Export", and "Help" buttons. Below the navigation bar, there's a "Using Facets and Filters" section with a Twitter icon and a brief explanation of facets. The main area displays a data table with 1558 rows. The table has columns for "ID", "Name", "Address", "City", "State", "Zip", "Phone", "Fax", "Email", "Website", "Status", "Created", "Updated", "Deleted", "Archived", "Visible", "Selected", "Number of Pages", and "View Profile". The table is currently sorted by "Name" in ascending order. The first few rows of data are visible, showing various entries with their respective attributes.

# Data Tools: Tabula

<http://tabula.nerdpower.org/>

- Extract data from PDFs
- Stand-alone app for Windows/Mac
- Interactively select table
- Output: CSV, Excel



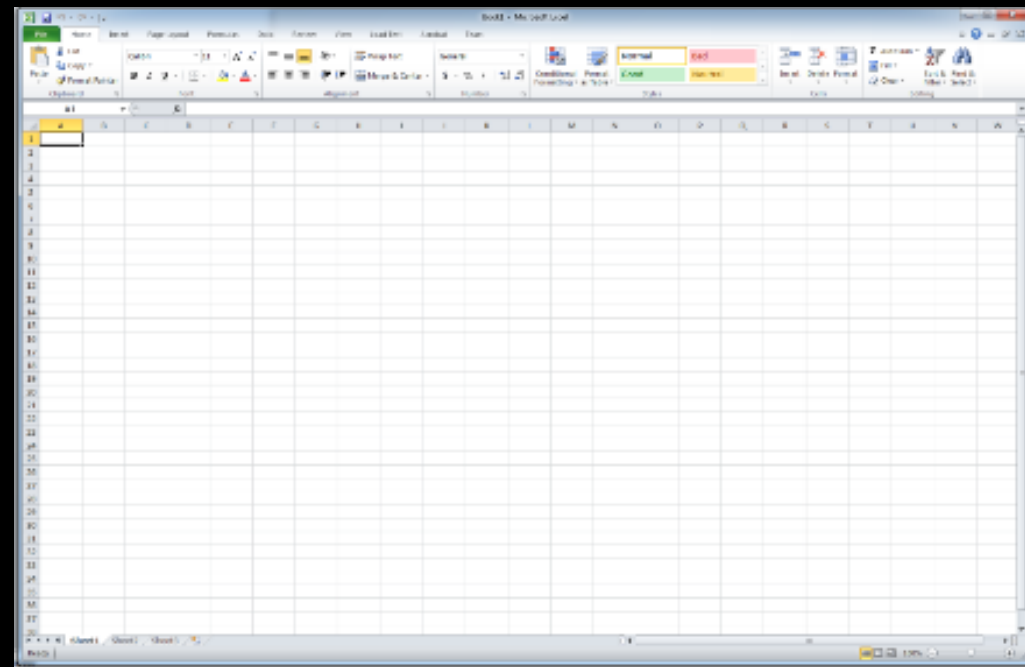


# Visualization Tools

- General Purpose
- Special Purpose
  - Text Analysis
  - Sets
  - Maps
  - Networks / Graphs
- Bespoke
- Colour

# Excel

- Simple charts
- Poor defaults (getting better)
- Hard to customize

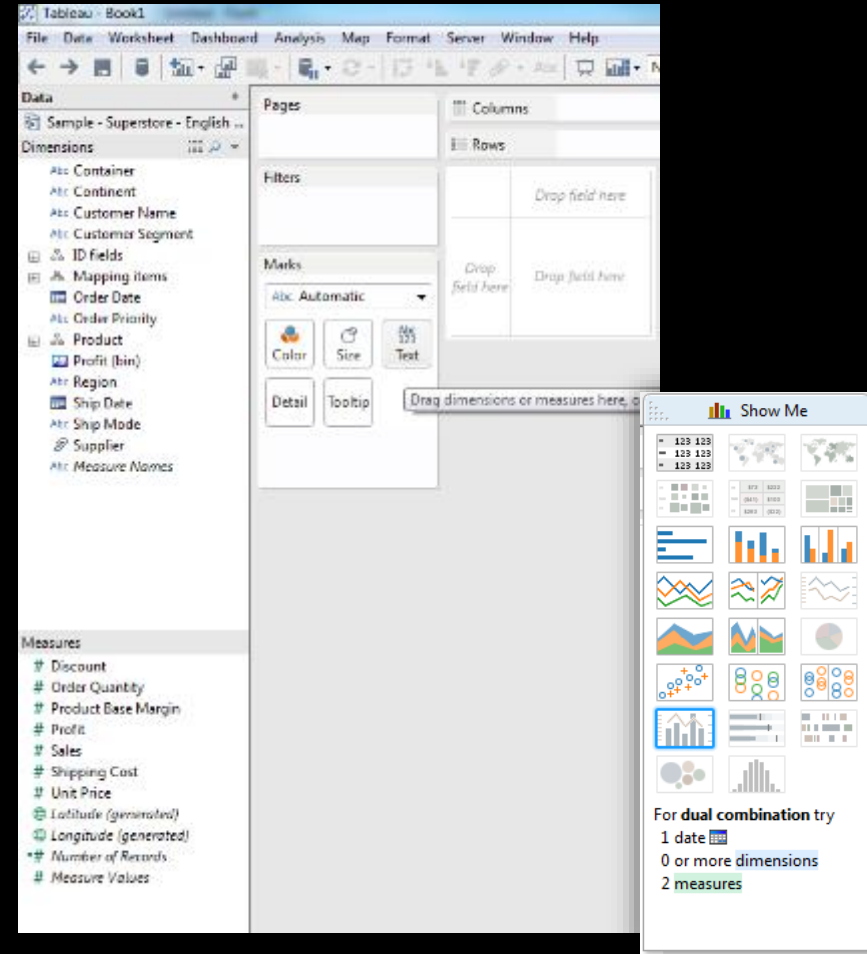


# VIS Tools: Tableau

<http://www.tableau.com/>

## Strengths:

- Many chart types
- Interactive web output
- Access to underlying data
- Many data sources (live)
- Drag & drop – easy to experiment
- Maps
- Good defaults
- Link visualizations
- R can plugin
- Academic Program - Free for students





# Student Program

- Tableau desktop **free** for post-secondary students.
- <http://www.tableau.com/academic>

## Academic Programs



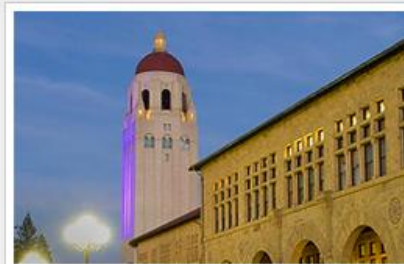
### Tableau for Teaching

Learn more and get licenses



### Tableau for Students

Free access to Tableau Desktop



### Administration

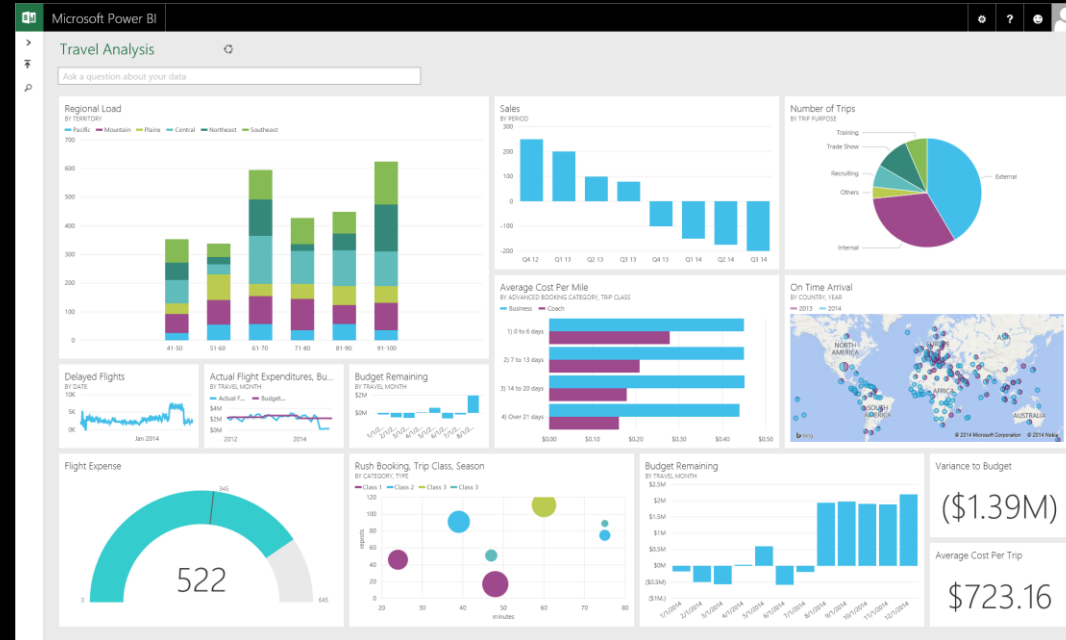
Learn more by visiting our solutions

# VIS Tools : POWER BI



<https://powerbi.microsoft.com/en-us/>

- Similar capabilities as tableau
- Can build plugins
- Better data modeling
- Not as customizable
- Exploration not as easy
- Lots of menus
- Less data capacity than Tableau



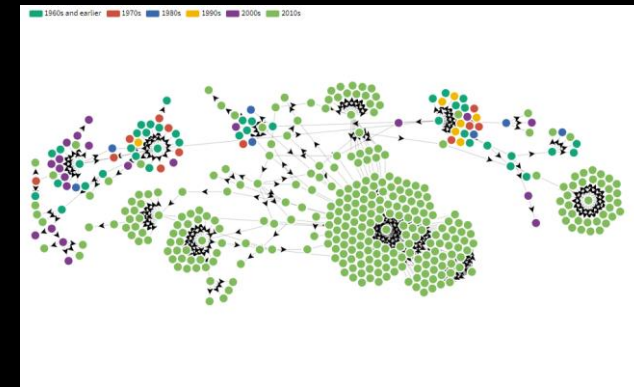
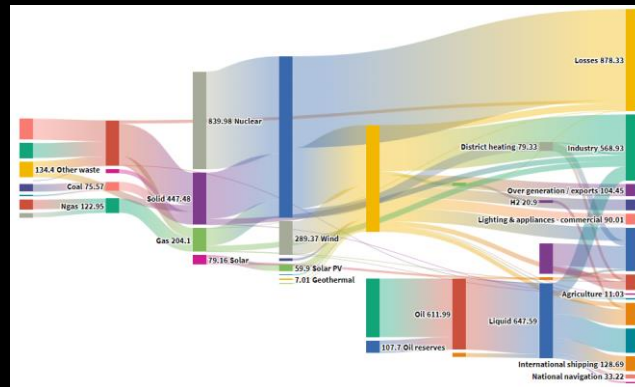
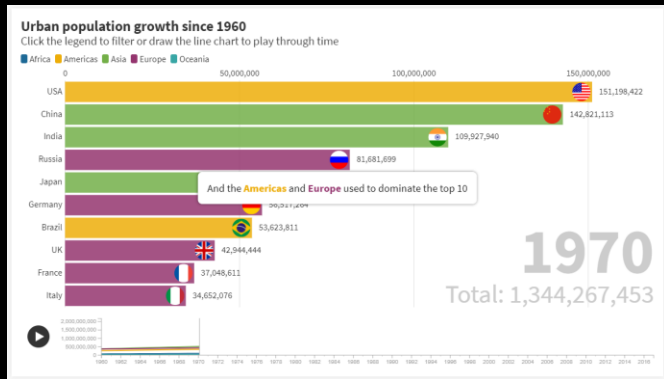
<https://www.em360tech.com/microsoft-power-by-dashboard/>

# VIS Tools: Flourish



<https://flourish.studio/>

- From the data journalism community; focus on storytelling
- Interactive visualizations that can be embedded in website
- Free (data shared publicly), paid otherwise
- Stick to relatively small datasets

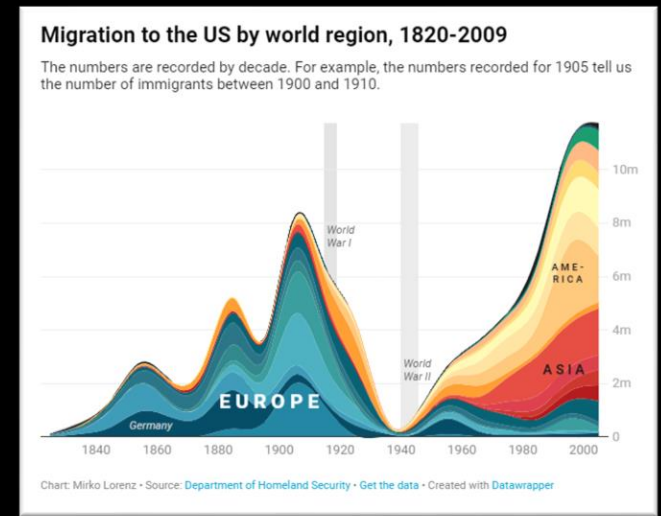
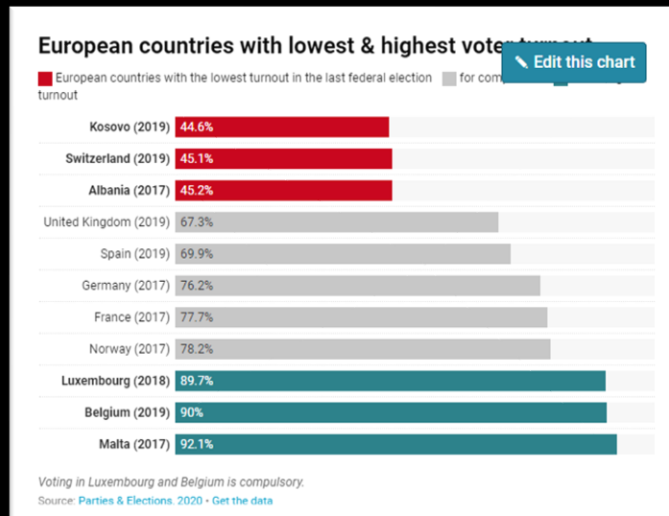
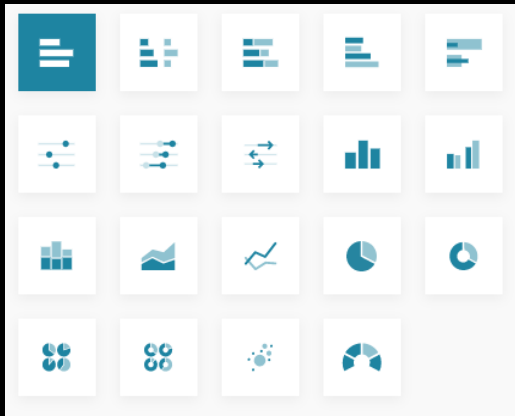


# VIS Tools: Datawrapper

Datawrapper

<https://www.datawrapper.de/>

- 20+ chart types
- Variety of mapping types (choropleth, symbols, locator)
- Free, but results have “created with datawrapper watermark”.



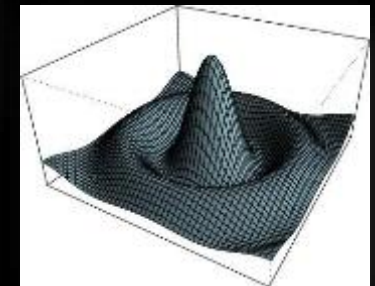
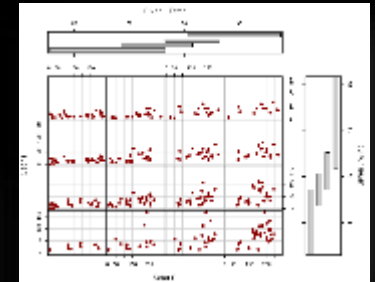
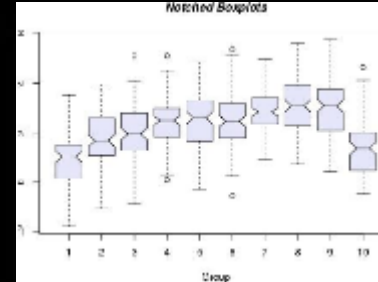


# VIS Tools: R

<http://www.r-project.org/>

- Open-source software for statistics & graphics
- All sorts of advanced stats
  - Regression, linear/nonlinear models, time series analysis, clustering, nonparametric tests
- Data wrangling
- Charts & Plots
- Command line\*
- Many add-ons (> 4400)
- 60+ Resources for R

<http://www.computerworld.com/article/2497464/business-intelligence/60-r-resources-to-improve-your-data-skills.html>

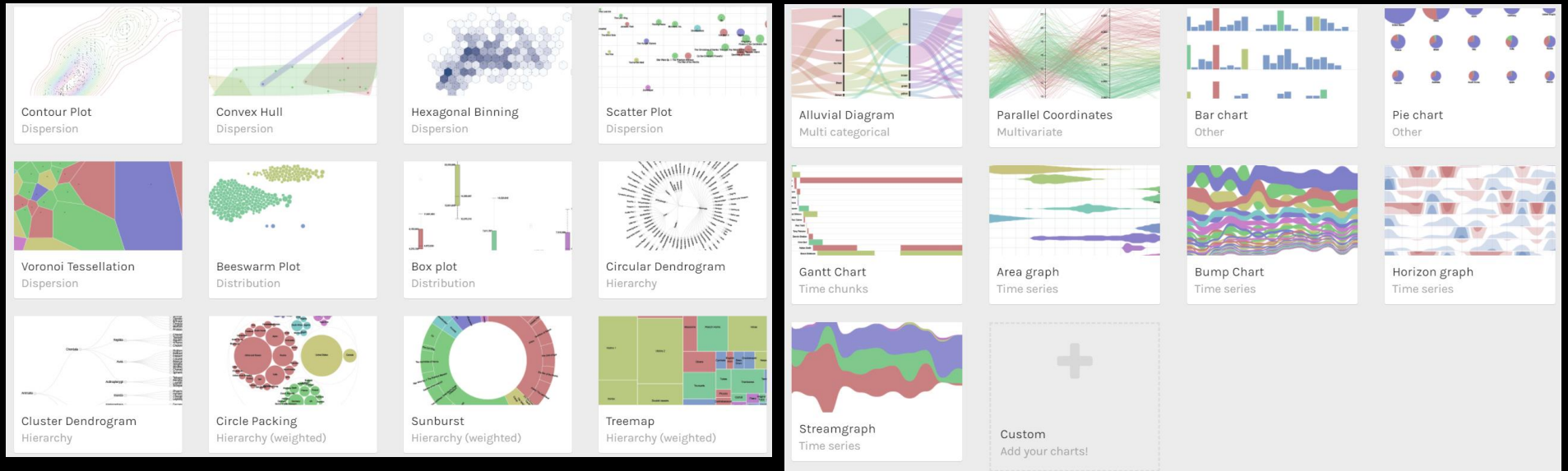


# VIS Tools: RAWGraphs



<https://rawgraphs.io/>

- Create SVG graphics
- Data not uploaded (so remains private)
- 20+ chart types



# Text Analysis: Voyant

<http://voyant-tools.org/>

- Import: txt, HTML, XML, PDF, RTF, & Word
- Lexical analysis
  - frequency and distribution
- Export: XML, tsv, html widgets



The screenshot displays the Voyant Tools interface with three main panels:

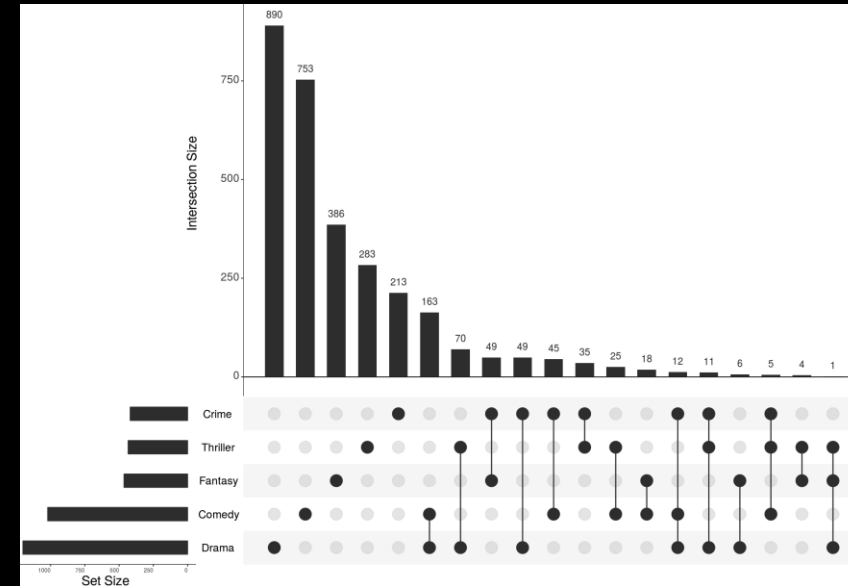
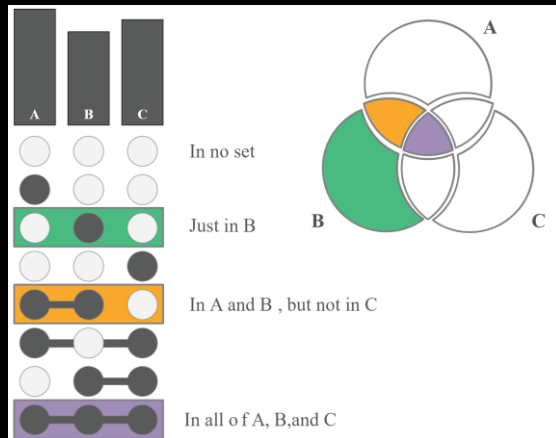
- Word Cloud:** A circular word cloud where the most prominent words are "penfold", "donut", "history", "shops", "donut's", "experience", "franchise", "industry", "delicious", "book", "eating", "annual", "like", "good", "donut", "history", "shops", "donut's", "experience", "franchise", "industry", "delicious", "book", "eating", "annual", "like", "good", "donut".
- Text Preview:** A snippet of text from a document titled "The strange thing about Univer...". The text discusses the work of University of Toronto historian Steve Penfold's new book, "The Donut: A Canadian History", which explores the 200-year history of donuts in Canada. It mentions that Penfold is a food historian and that the book is a history of a culinary food, but not a science or a great culinary history.
- Word Frequency Chart:** A line graph showing the frequency of the word "donut" across different years. The x-axis represents years from 1700 to 2000, and the y-axis represents frequency from 0.00 to 100.00. The chart shows a significant increase in frequency starting around 1900, peaking around 1950, and then fluctuating at a high level until 2000.

# Sets: UpSet



<https://upset.app/implementations/>

- Alternative to Venn diagram when you have 4-30 sets.
  - With fewer than 4, use a Venn diagram (e.g., <https://bioinfogp.cnb.csic.es/tools/venny/index.html>).
- Many implementations
  - Web tool, R library, javascript library, etc

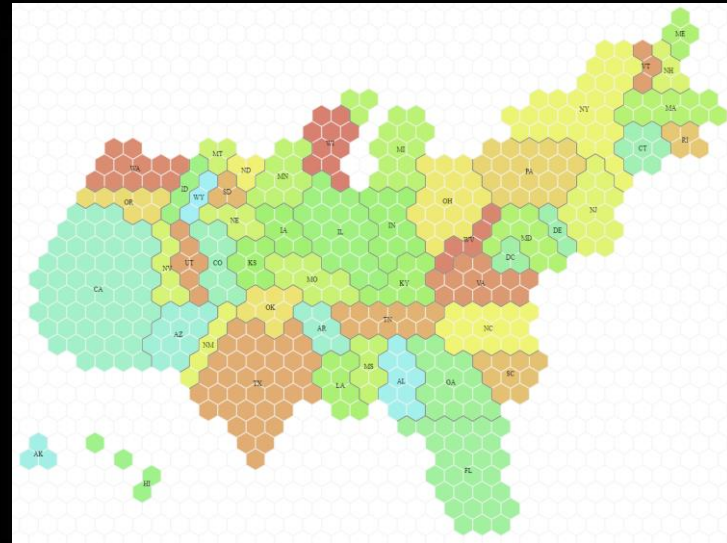
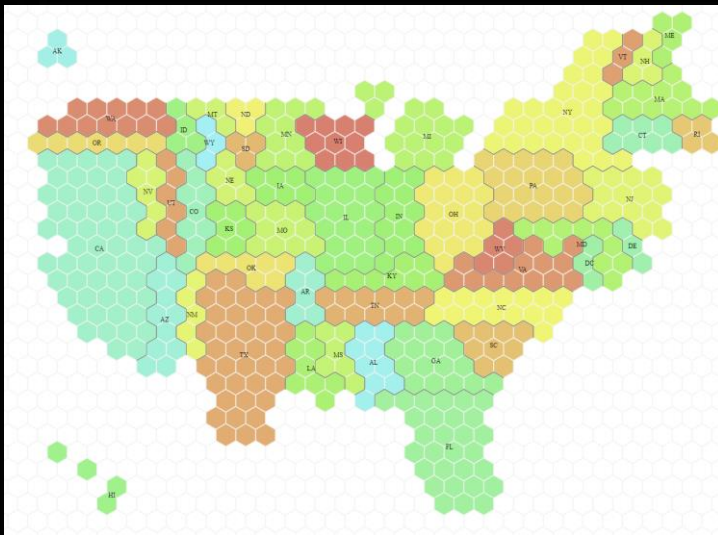




# Maps/GIS: TILEGRAMS

<https://pitchinteractiveinc.github.io/tilegrams/>

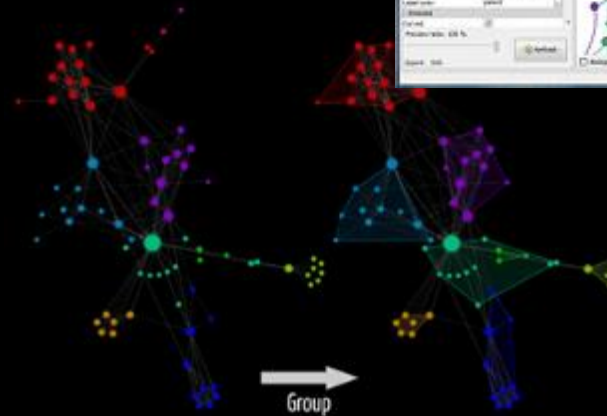
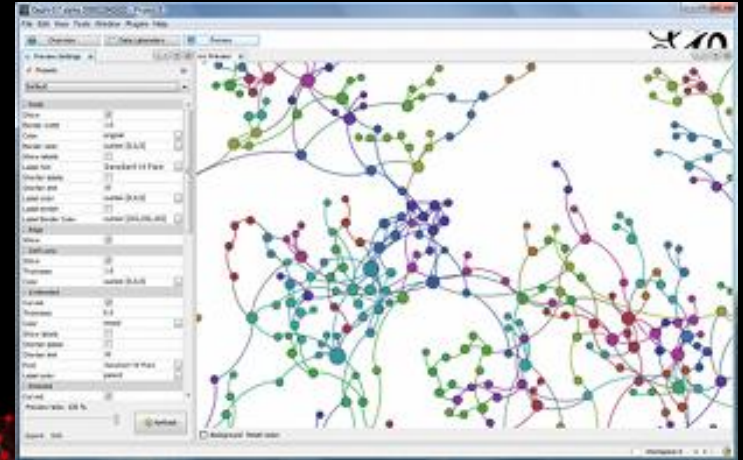
- Generates Cartograms (US, Brazil, Germany, France, Netherlands, Ireland)
- Exports TopoJSON and SVG



# Graphs/Networks: Gephi

<http://gephi.github.io>

- Windows/Linux/OS X
- Can handle 50K nodes & 1000K edges
- Interactive
  - Filter
  - Dynamic layout
  - Clustering/hierarchies

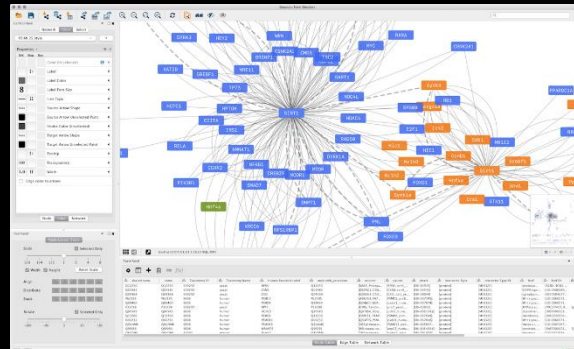
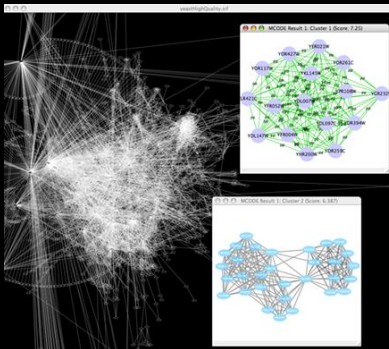
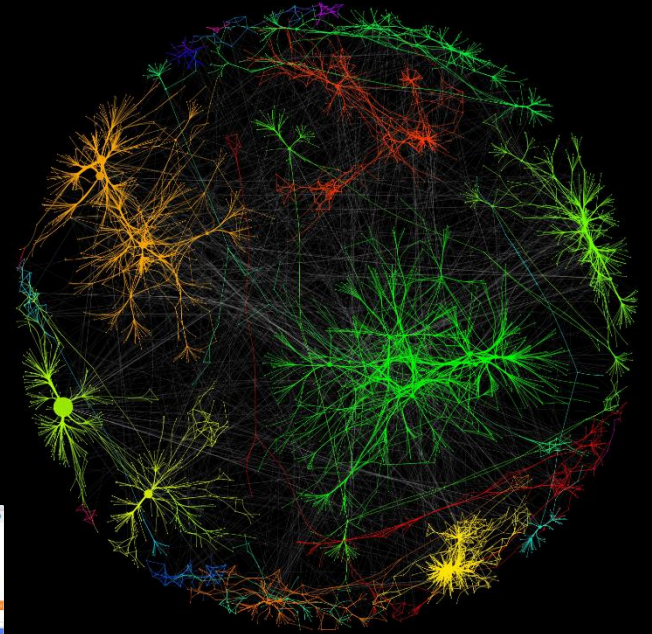


# Graphs/Networks: Cytoscape



<https://cytoscape.org/>

- Windows/Linux/Mac OS/Unix
- Designed for biological research & molecular networks
- Many apps (aka plugins)
- Javascript library - cytoscape.js
- Export: PDF, PS, SVG, PNG, JPG



## Time: Timeline JS

<http://timeline.knightlab.com>

- Interactive, web timelines
- Link in URLs and web resources
- Built upon Google spreadsheet
- Produces embeddable iframe widget

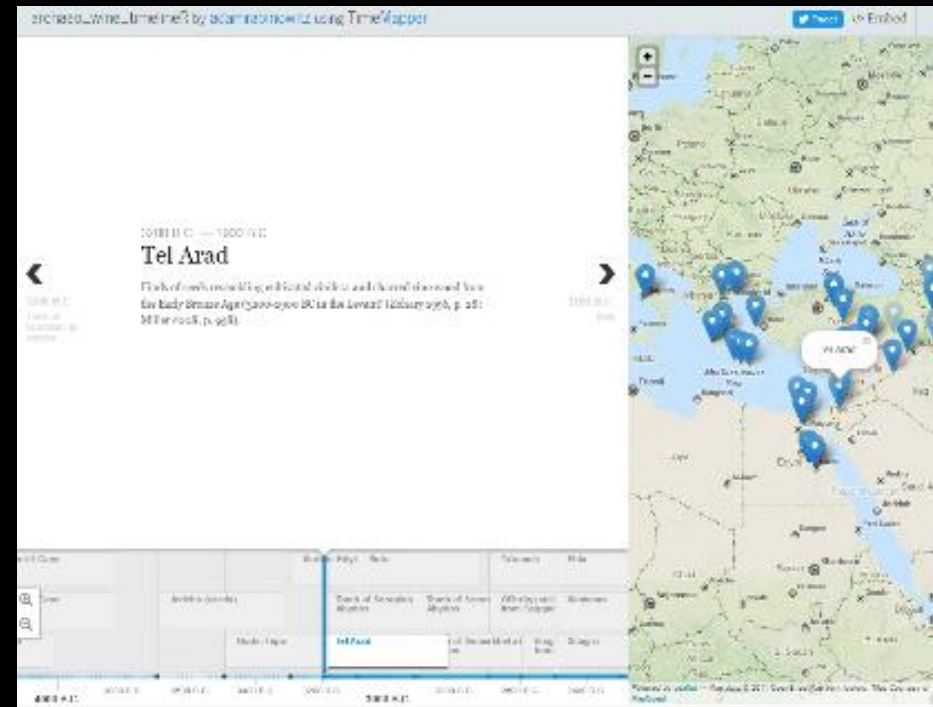
The screenshot displays a Timeline JS interface. At the top, a navigation bar includes left and right arrows, a date 'JULY 16, 2013', and a 'Timeline JS' logo. The main content area features a photograph of a person holding a white banner with the handwritten text 'WE SEE EGYPT AS AN ISLAMIC STATE'. To the right of the photo, the date 'July 16, 2013' is shown above the title 'Interim government', followed by the text 'An interim government without Islamist parties is sworn in.' Below this, a detailed timeline view shows a horizontal axis with a blue vertical line at July 16, 2013. A box labeled 'Interim government' is positioned above the axis at this date. Other boxes for 'MUBARAK'S FALL' and 'Free Economists' are visible at earlier dates. At the bottom, there is a footer with the text: 'The development of Timeline JS was supported by the Knight Foundation. Special thanks to David L. Kirsh for his help with the project. All screens and their services.'

# Time: TimeMapper

<http://timemapper.okfnlabs.org>

- Interactive, web timelines
- Built on Google spreadsheet data
- Adds a map with identified locations
- Creates web page that can be embedded into other sites

**TimeMapper** Elegant timelines and maps created in seconds



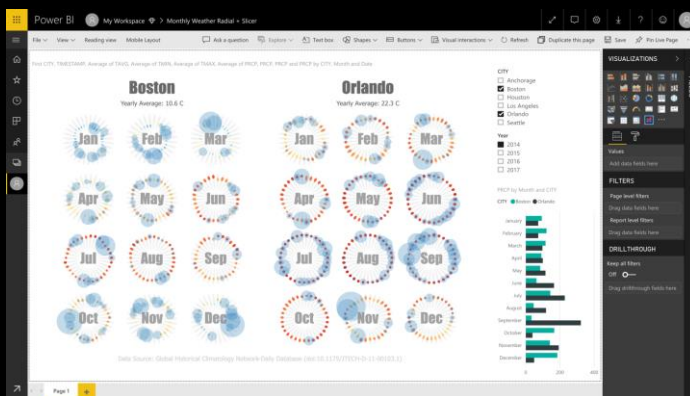
# Bespoke: Charticulator

<https://charticulator.com/>

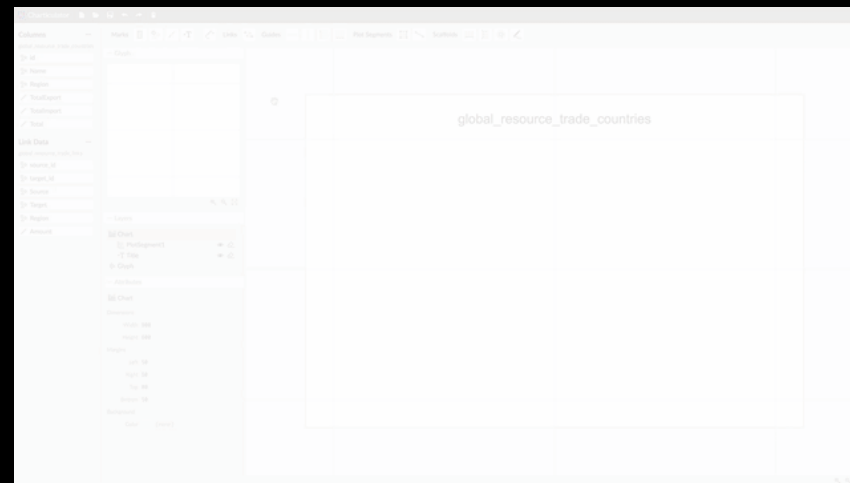
- Microsoft Research
- No coding needed; interactive creation
- Great amount of customization
- Create templates to use with PowerBI



<https://twitter.com/Kocky/status/1081650965193854976>



From <https://charticulator.com/>



From <https://charticulator.com/>

# Colour

## Adobe Color

- <https://color.adobe.com/>
- Pick great colour palettes
- Given this colour pick complementary colours

## ColorBrewer

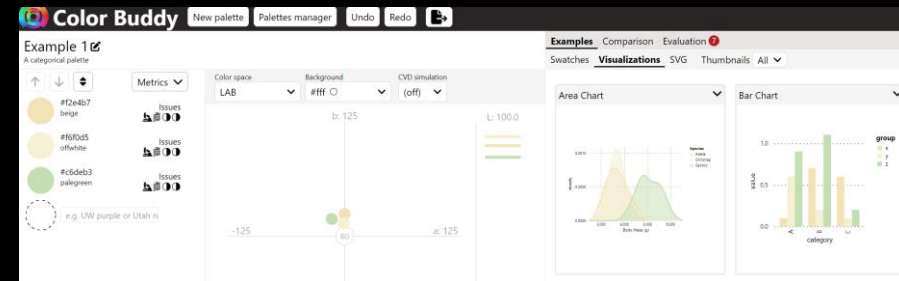
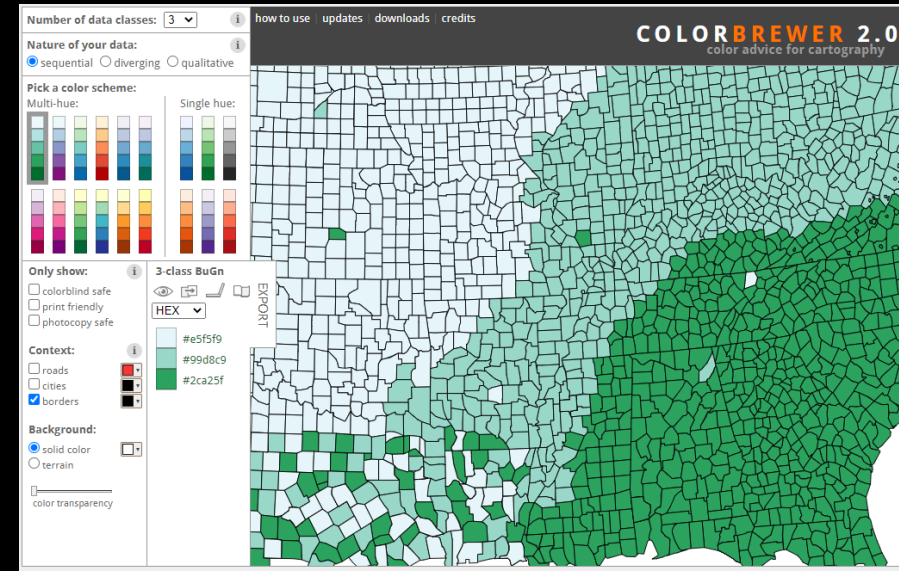
- <http://colorbrewer2.org/>
- Help in choosing colours for maps
- Colourblind, printing, etc.

## Color Buddy

- <https://color-buddy.netlify.app/>
- More options, shows several different types of visualization

## Magic Color Picker

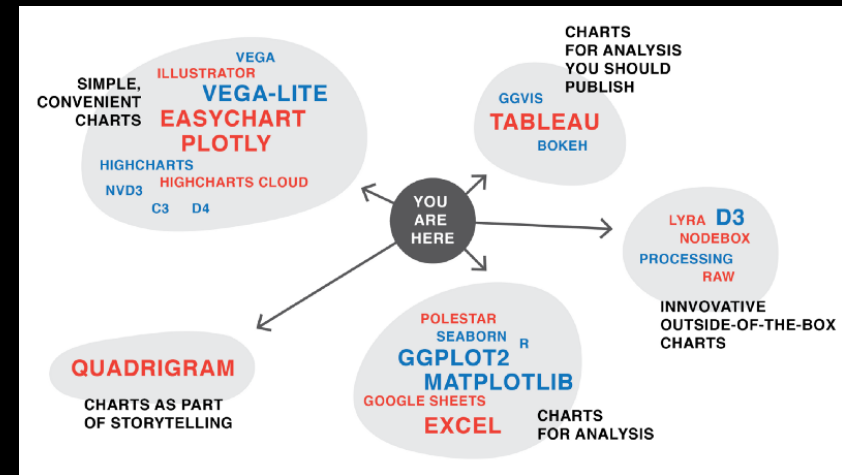
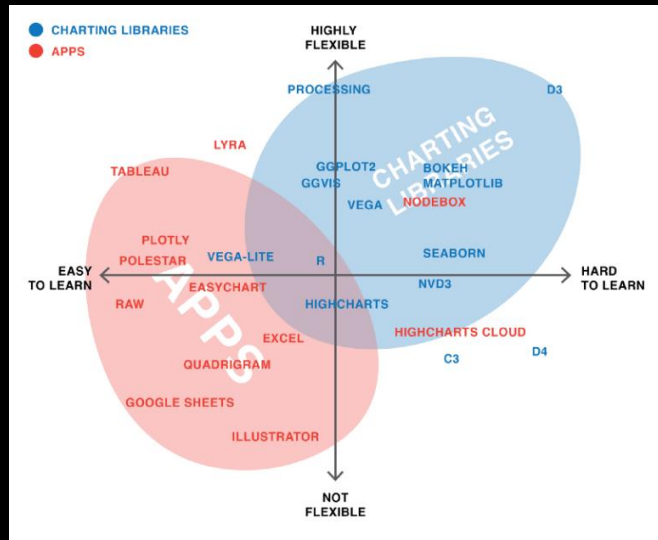
- <https://text2color.com/picker.html>
- AI that changes text to RGB colour codes



# Resources – Data Vis Tools

Visualizing Data - <https://www.visualisingdata.com/resources/>  
120+ visualization tools

Article on picking a vis tool –  
<https://source.opennews.org/articles/what-i-learned-recreating-one-chart-using-24-tools/>





# Visualization Resources: Books

***Semiology of Graphics*** by Jacques Bertin

- *The book on visual variables*

***Visual Display of Quantitative Information, Beautiful Evidence, Visual Explanations, or Envisioning Information*** by Edward Tufte

- *Beautiful examples of historic visualizations*

***Visual Thinking for Design*** by Colin Ware

- Ties perception theory and design processes to visualization practices.

***Beautiful Visualization*** by Steele & Iliinsky

- Combines techniques from artists, designers, scientists, and others.

***Visual Analysis & Design*** by Tamara Munzner

- Good text book by long-time practitioner & prof

# Visualization Resources: Websites

**New York Times** <https://www.nytimes.com/interactive/2024/12/20/us/2024-year-in-graphics.html>

- Dedicated team producing exceptional work.

**Gapminder** <https://www.gapminder.org/>

- Hans Rosling's stat software & data.

**Visualizing Data** <https://www.visualisingdata.com/blog/>

- Quarterly best visualizations posts, the little of visualization design

**Flowing Data** <https://flowingdata.com/>

- Daily posts showing various visualizations created by the site author and elsewhere.

# Questions?

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Data and Visualization Curator

JDLBrosz@UCalgary.ca

Slides: <http://brosz.ca/slides/>