

# The Purpose of Visualization

*Maneesh Agrawala*

**CS 448B: Visualization**  
**Winter 2020**

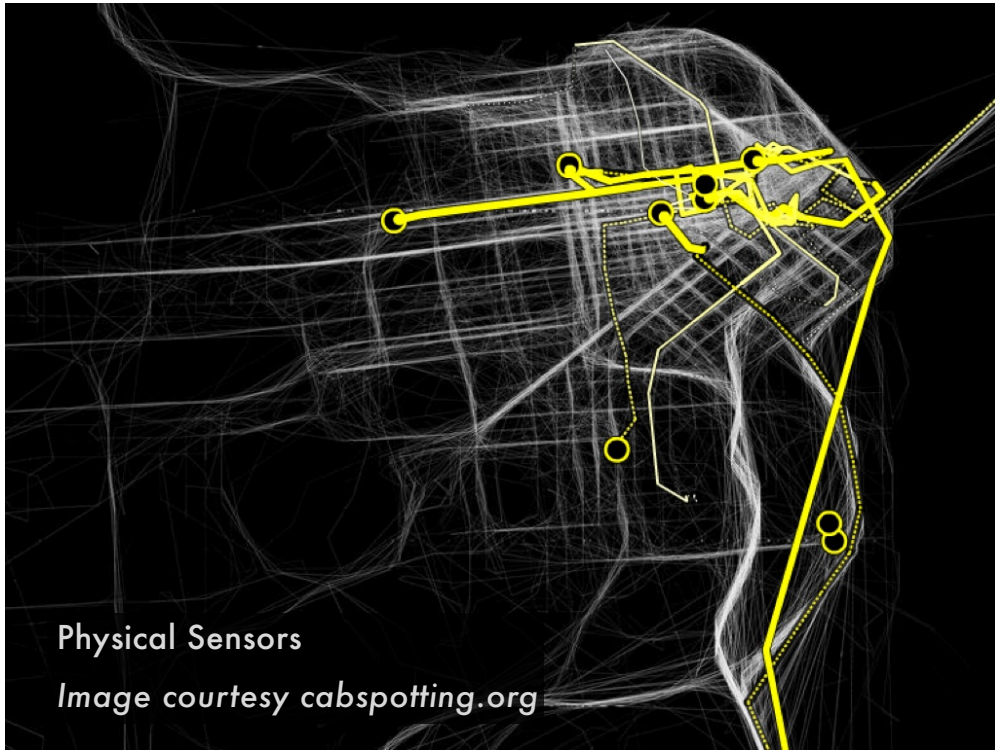
**How much data (bytes)  
did we produce in 2016?**

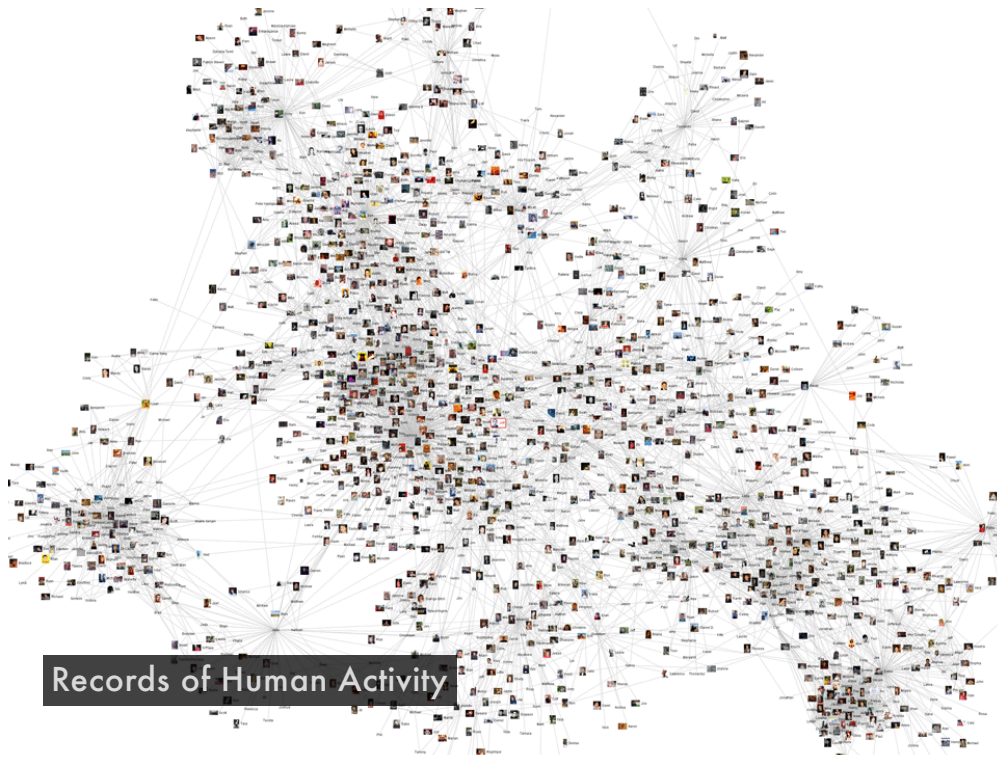
**2016: 16.1 zetabytes**

[Gantz 2017]

**2016: 16.1 zetabytes**  
**10x increase over 5 years**

[Gantz 2017]





Records of Human Activity



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## Abortion

From Wikipedia, the free encyclopedia

*For other uses, see [Abortion \(disambiguation\)](#).*

**Abortion** is the ending of a pregnancy by removal or expulsion of an **embryo** or **fetus** before it can survive outside the uterus.<sup>[note 1]</sup> An abortion that occurs without intervention is known as a **miscarriage** or **spontaneous abortion**. When deliberate steps are taken to end a pregnancy, it is called an **induced abortion**, or less frequently "induced miscarriage". The unmodified word *abortion* generally refers to an induced abortion.<sup>[1][2]</sup> A similar procedure after the fetus has potential to survive outside the womb is known as a "late termination of pregnancy" or less accurately as a "late term abortion".<sup>[3]</sup>

When properly done, abortion is one of the safest procedures in medicine,<sup>[4][5]</sup> but unsafe abortion is a major cause of maternal death, especially in the developing world.<sup>[6]</sup> Making safe abortion legal and accessible reduces maternal deaths.<sup>[7][8]</sup> It is safer than childbirth, which has a 14 times higher risk of death in the United States.<sup>[9]</sup> Modern methods use **medication** or **surgery** for abortions.<sup>[10]</sup> The drug **mifepristone** in combination with **prostaglandin** appears to be as safe and effective as surgery during the **first and second trimester** of pregnancy.<sup>[10][11]</sup> The most common surgical technique involves dilating the cervix and using a **suction device**.<sup>[12]</sup> **Birth control**, such as the **pill** or **intrauterine devices**, can be used immediately following abortion.<sup>[11]</sup> When performed legally and safely on a woman who desires it, induced abortions do not increase the risk of long-term **mental** or physical problems.<sup>[13]</sup> In contrast, **unsafe abortions** (those performed by unskilled individuals, with hazardous equipment, or in unsanitary facilities) cause 47,000 deaths and 5 million hospital admissions each year.<sup>[13][14]</sup> The **World Health Organization** recommends safe and legal abortions be available to all women.<sup>[15]</sup>

Around 56 million abortions are performed each year in the world,<sup>[16]</sup> with about 45% done **unsafely**.<sup>[17]</sup> Abortion rates changed little between 2003 and 2008,<sup>[18]</sup> before which they decreased for at least two decades as access to **family planning** and birth control increased.<sup>[19]</sup> As of 2008, 40% of the world's women had access to legal abortions without limits as to reason.<sup>[20]</sup> Countries that permit abortions have different limits on how late in pregnancy abortion is allowed.<sup>[20]</sup>

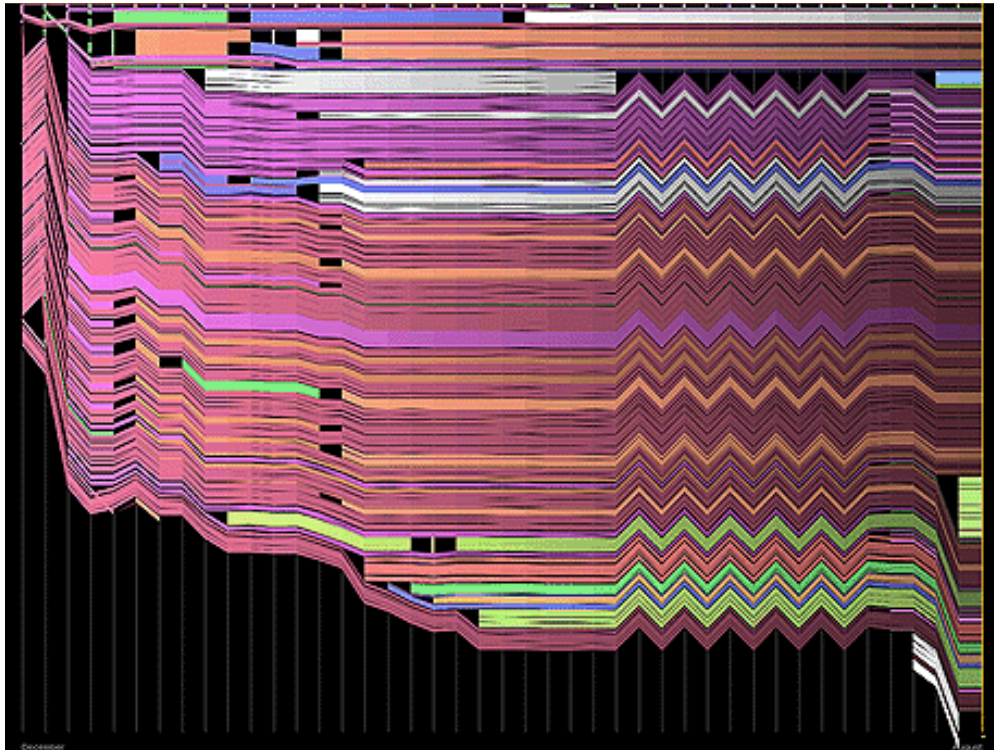
Historically, abortions have been attempted using **herbal medicines**, sharp tools, **forceful massage**, or through other **traditional methods**.<sup>[21]</sup> **Abortion laws** and cultural or religious views of abortions are different around the world. In some areas abortion is legal only in specific cases such as **rape**, **problems with the fetus**, **poverty**, risk to a woman's health, or **incest**.<sup>[22]</sup> There is **debate** over the moral, ethical, and legal issues of abortion.<sup>[23][24]</sup> Those who oppose abortion often argue that an embryo or fetus is a human with a **right to life**, and they may compare abortion to **murder**.<sup>[25][26]</sup> Those who support the legality of abortion often hold that it is part of a woman's **right to make decisions about her own body**.<sup>[27]</sup> Others favor legal and accessible abortion as a public health measure.<sup>[28]</sup>

Abortion	
<b>Other names</b>	Induced miscarriage, termination of pregnancy
<b>Specialty</b>	Obstetrics and gynecology
<b>ICD-10-PCS</b>	O04 <span>ⓘ</span>
<b>ICD-9-CM</b>	779.6 <span>ⓘ</span>
<b>MeSH</b>	D000028
<b>MedlinePlus</b>	007382
	<span>[<a href="#">edit on Wikidata</a>]</span>

Wikipedia: Collaborative Creation

- 1.1 Induced
- 1.2 Spontaneous



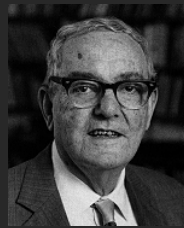


“The ability to take data—to be able to **understand** it, to **process** it, to **extract value** from it, to **visualize** it, to **communicate** it—that’s going to be a hugely important skill in the next decades, ... because now we really do have **essentially free and ubiquitous data**. So the complimentary scarce factor is the ability to understand that data and extract value from it.”



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

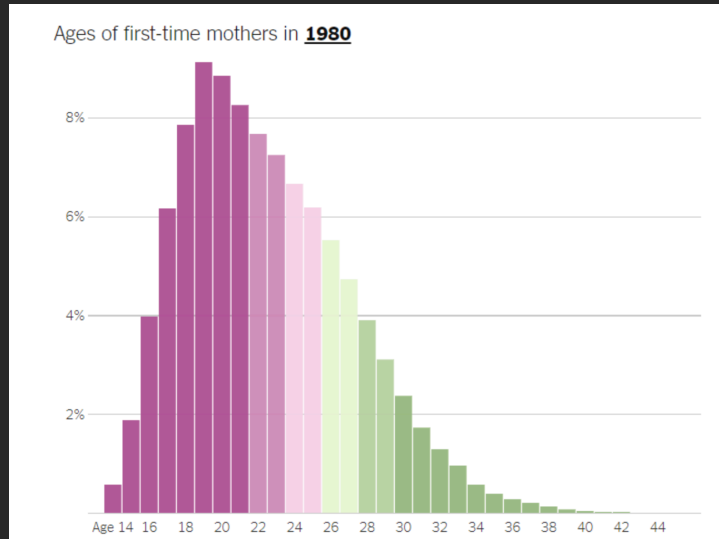
“What information consumes is rather obvious:  
**it consumes the attention of its recipients.**  
Hence a wealth of information creates a poverty  
of attention, and a need to allocate that  
attention efficiently among the overabundance of  
information sources that might consume it.”



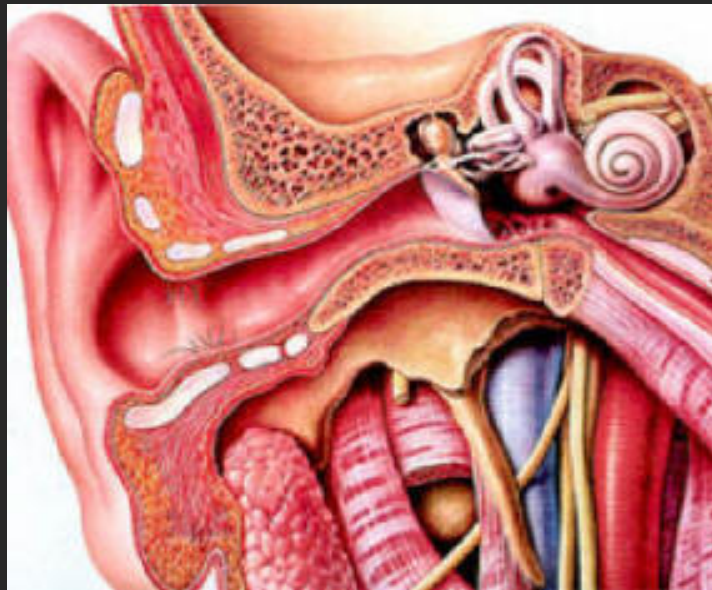
*Herb Simon*  
as quoted by Hal Varian  
Scientific American  
September 1995

**What is visualization?**

# Examples



# Examples





## Examples

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## What is visualization?

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**“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]**

### Set A

X	Y
10	8.04
8	6.95
13	7.58
9	8.81
11	8.33
14	9.96
6	7.24
4	4.26
12	10.84
7	4.82
5	5.68

### Set B

X	Y
10	9.14
8	8.14
13	8.74
9	8.77
11	9.26
14	8.1
6	6.13
4	3.1
12	9.11
7	7.26
5	4.74

### Set C

X	Y
10	7.46
8	6.77
13	12.74
9	7.11
11	7.81
14	8.84
6	6.08
4	5.39
12	8.15
7	6.42
5	5.73

### Set D

X	Y
8	6.58
8	5.76
8	7.71
8	8.84
8	8.47
8	7.04
8	5.25
19	12.5
8	5.56
8	7.91
8	6.89

#### Summary Statistics

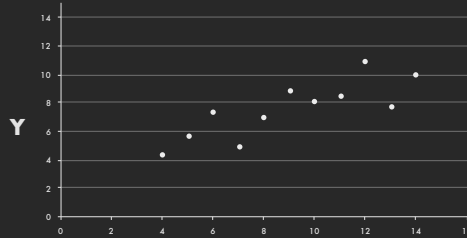
$$u_X = 9.0 \quad \sigma_X = 3.317$$
$$u_Y = 7.5 \quad \sigma_Y = 2.03$$

#### Linear Regression

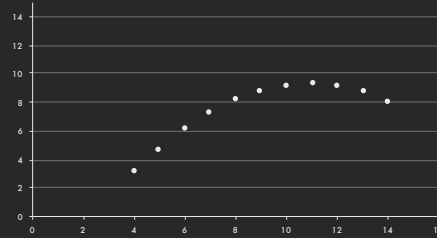
$$Y = 3 + 0.5 X$$
$$R^2 = 0.67$$

[Anscombe 73]

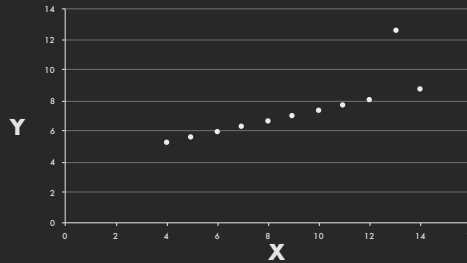
### Set A



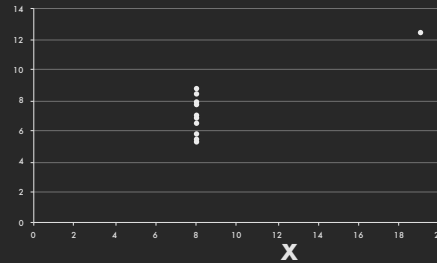
### Set B



### Set C



### Set D



**Why do we create visualizations?**

**Why do we create visualizations?**

## **Why do we create visualizations?**

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- **Answer questions (or discover them)**
- **Make decisions**
- **See data in context**
- **Expand memory**
- **Support graphical calculation**
- **Find patterns**
- **Present argument**
- **Tell a story**
- **Inspire**

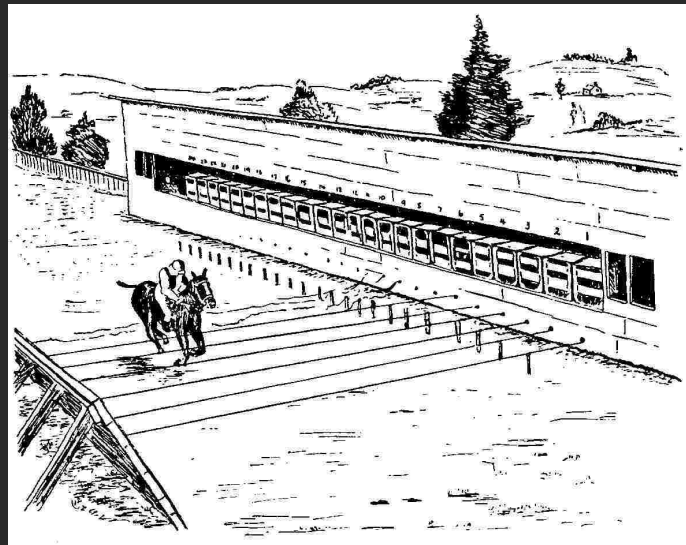
**Record Information**

## Answer question



Gallop, Bay Horse "Daisy" [Muybridge 1884-86]

## Answer question



Gallop, Bay Horse "Daisy" [Muybridge 1884-86]

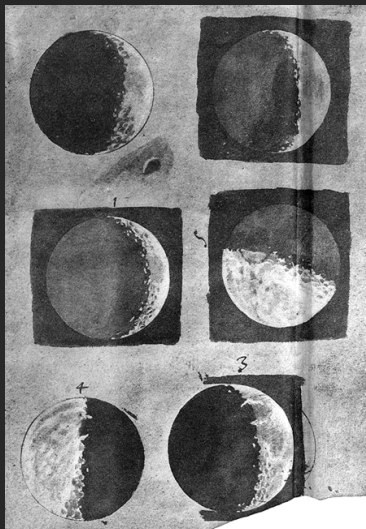
## Photographs: Phases of the moon

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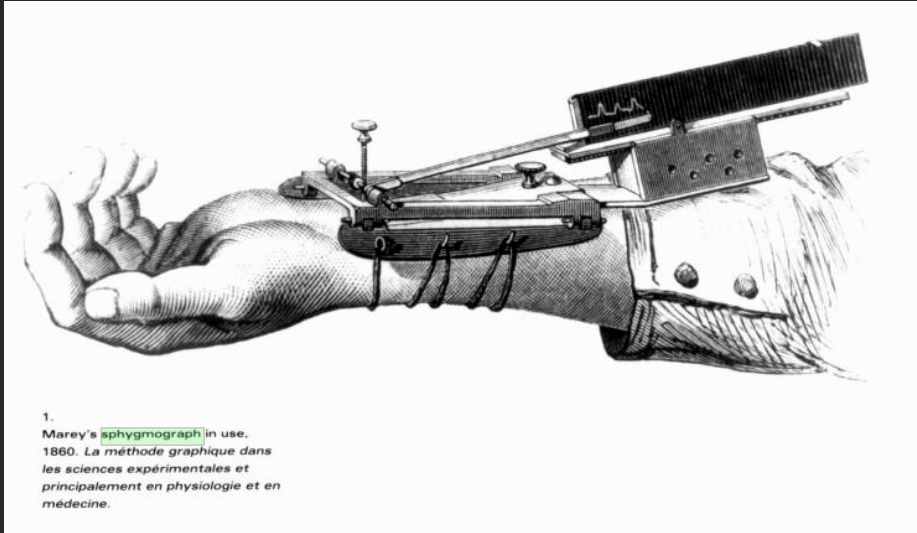
## Drawing: Phases of the moon

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Galileo's drawings of the phases of the moon from 1616  
<http://galileo.rice.edu/sci/observations/moon.html>

## Other recording instruments



Marey's sphygmograph [from Braun 83]

# Support Reasoning

# Make a decision: Challenger

HISTORY OF O-RING DAMAGE ON SRM FIELD JOINTS

SRM No.	Erosion Depth (in.)	Cross Sectional View		Top View		Clocking Location (deg)
		Perimeter Affected (deg)	Nominal Dia. (in.)	Length of Max Erosion (in.)	Total Heat Affected Length (in.)	
61A LH Center Field**	None	None	0.280	None	None	36°-55°
61A LH Outer Field**	None	None	0.280	None	None	33°-11°
61C LH Forward Field**	0.010	154.0	0.280	4.25	5.25	163
61C RH Center Field (prtg)***	0.038	130.0	0.280	12.50	56.75	354
61C RH Center Field (sec)***	None	45.0	0.280	None	23.50	354
410 RH Forward Field	0.028	110.0	0.280	3.00	None	275
41C LH Aft Field*	None	None	0.280	None	None	--
41B LH Forward Field	0.040	217.0	0.280	3.00	14.50	381
575-2 RH Aft Field	0.053	116.0	0.280	--	--	90

\*Hot gas path detected in putty. Indication of heat on O-ring, but no damage.  
 \*\*Soot behind primary O-ring.  
 \*\*\*Soot behind primary O-ring, heat affected secondary O-ring.

Clocking location of leak check port - 0 deg.

OTHER SRM-15 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY AND NO SOOT NEAR OR BEYOND THE PRIMARY O-RING.  
 SRM-22 FORWARD FIELD JOINT HAD PUTTY PATH TO PRIMARY O-RING, BUT NO O-RING EROSION AND NO SOOT BLOWBY. OTHER SRM-22 FIELD JOINTS HAD NO BLOWHOLES IN PUTTY.

**BLOW BY HISTORY**

SRM-15 WORST BLOW-BY

- 2 CASE JOINTS (90°) (110°) AEC
- MUCH WORSE VIBRALLY THAN SRM-22

SRM-22 BLOW-BY

- 2 CASE JOINTS (30-40°)

SRM-13A, 15, 16A, 18, 23A 24A

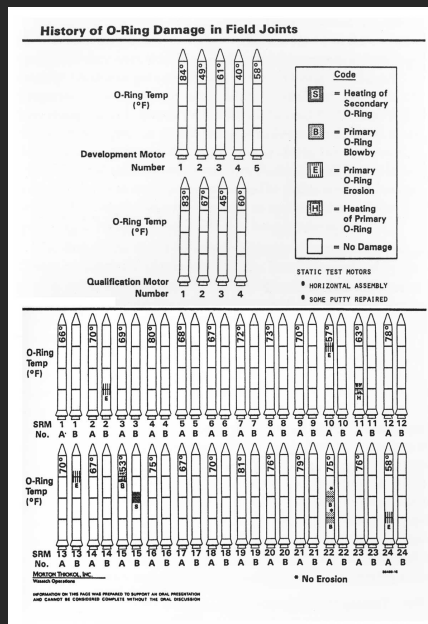
- NOZZLE BLOW-BY

HISTORY OF O-RING TEMPERATURES (DEGREES-F)

MOTOR	MBT	AMB	O-RING	WIND
DM-4	68	36	47	10 MPH
DM-2	76	45	52	10 MPH
DM-3	72.5	40	48	10 MPH
DM-4	76	48	51	10 MPH
SRM-15	52	64	53	10 MPH
SRM-22	77	78	75	10 MPH
SRM-25	55	26	29	10 MPH
			27	25 MPH

2 of 13 pages of material faxed to NASA by Morton Thiokol [from Tufte 1997]

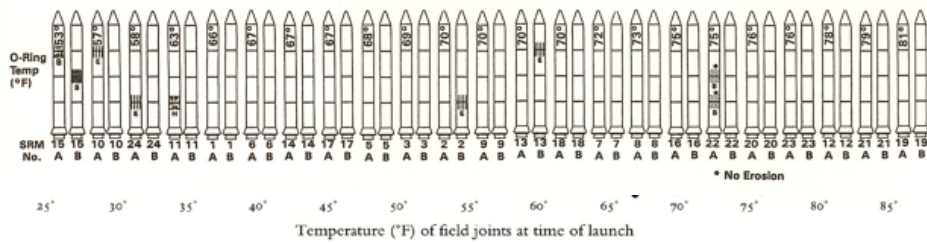
# Make a decision: Challenger





# Make a decision: Challenger

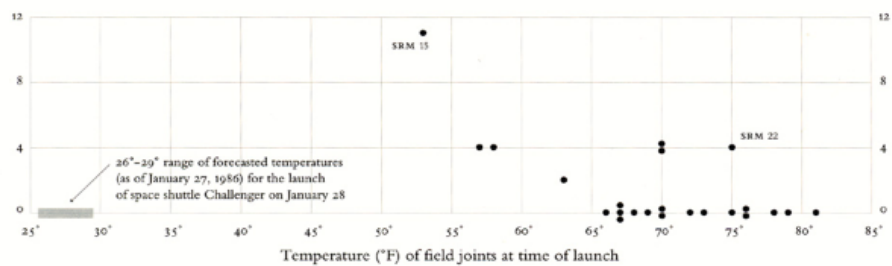
O-ring damage index, each launch



Visualizations drawn by Tufte show how low temperatures damage O-rings [Tufte 97]

# Make a decision: Challenger

O-ring damage index, each launch



Visualizations drawn by Tufte show how low temperatures damage O-rings [Tufte 97]

## See data in context: Cholera outbreak



In 1854 John Snow plotted the position of each cholera case on a map. [from Tufte 83]

## See data in context: Cholera outbreak



Used map to support hypothesis Broad St. pump was the cause. [from Tufte 83]

## Expand memory: Multiplication

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Class Exercise

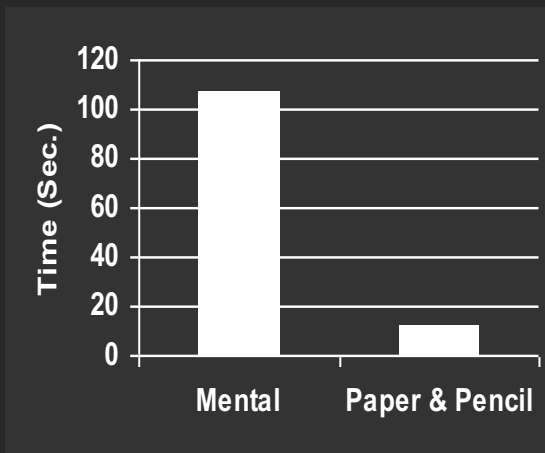
## Expand memory: Multiplication

---

$$\begin{array}{r} 34 \\ \times 87 \\ \hline \end{array}$$

# Expand memory: Multiplication

$$\begin{array}{r} 34 \\ \times 87 \\ \hline 238 \\ 2720 \\ \hline 2958 \end{array}$$

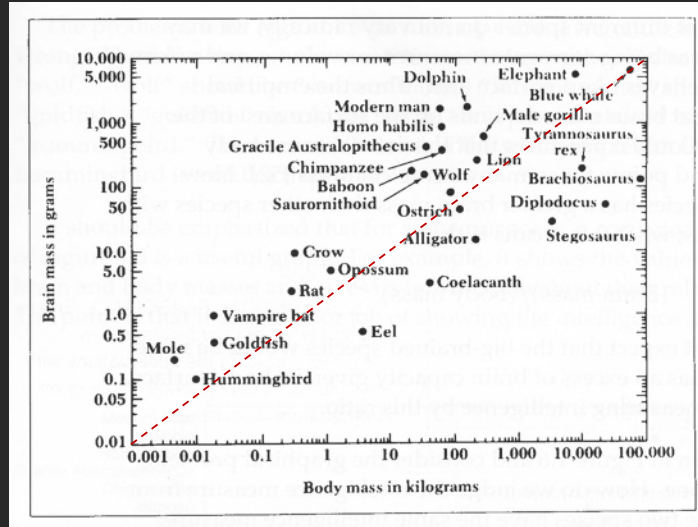


# Most powerful brain?

A screenshot of a Microsoft Excel spreadsheet titled 'animal.xls'. The spreadsheet contains a table with the following columns: ID, Name, Body Weight, and Brain Weight. The data is as follows:

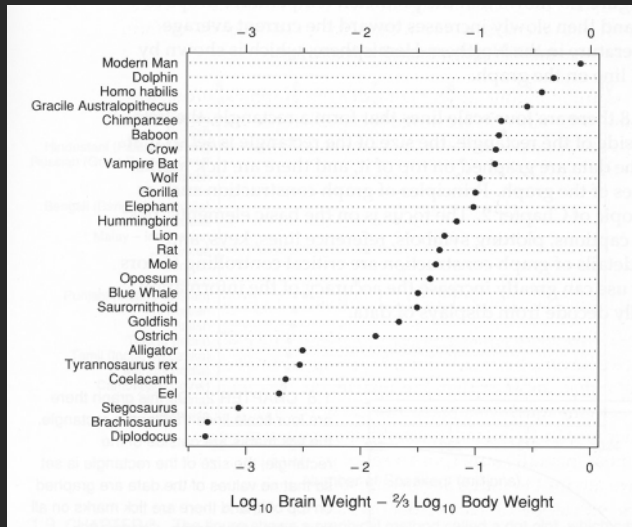
ID	Name	Body Weight	Brain Weight
1	Lesser Short-tailed Shrew	5	0.14
2	Little Brown Bat	10	0.25
3	Mouse	23	0.3
4	Big Brown Bat	23	0.4
5	Musk Shrew	48	0.33
6	Star Nosed Mole	60	1
7	Eastern American Mole	75	1.2
8	Ground Squirrel	101	4
9	Tree Shrew	104	2.5
10	Golden Hamster	120	1
11	Mole Rate	122	3
12	Galago	200	5
13	Rat	280	1.9
14	Chinchilla	425	6.4
15	Desert Hedgehog	550	2.4
16	Rock Hyrax (a)	750	12.3
17	European Hedgehog	785	3.5
18	Tenrec	900	2.6
19	Arctic Ground Squirrel	920	5.7
20	African Giant Pouched Rat	1000	6.6
21	Guinea Pig	1040	5.5
22	Mountain Beaver	1350	8.1
23	Slow Loris	1400	12.5
24	Genet	1410	17.5
25	Phalanger	1620	11.4

# Most powerful brain?



The Dragons of Eden [Carl Sagan]

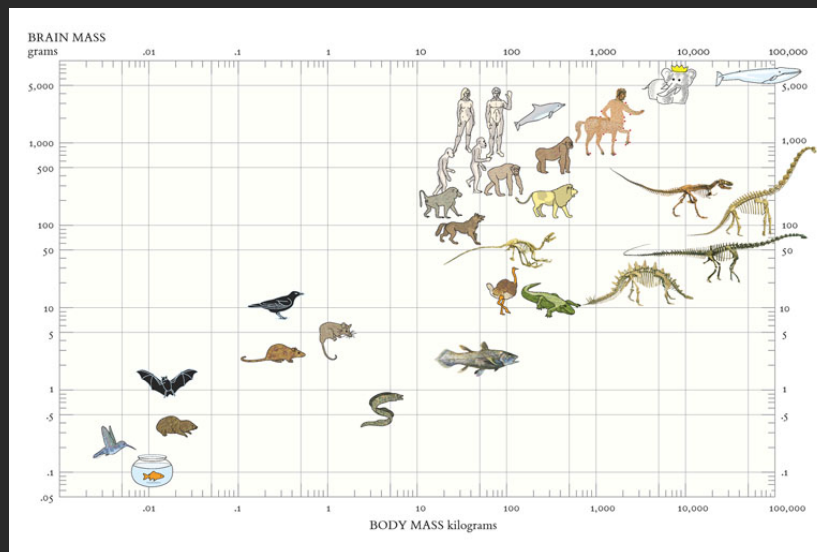
# Tell a story: Most powerful brain?



The Elements of Graping Data [Cleveland]

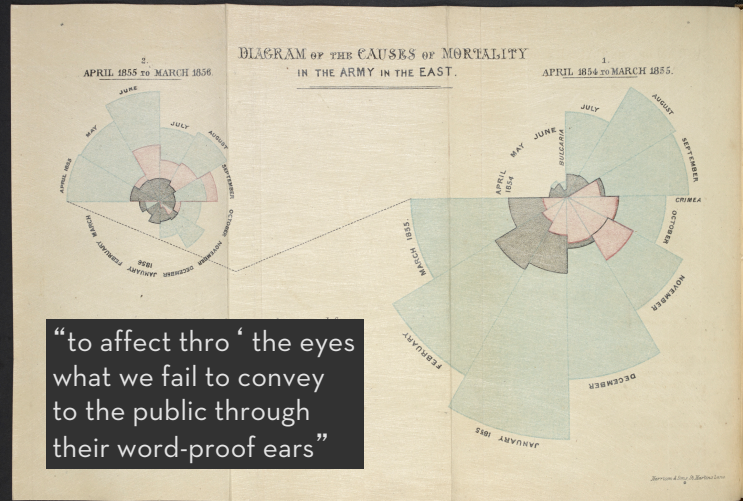
# Convey Information to Others

## Most powerful brain?



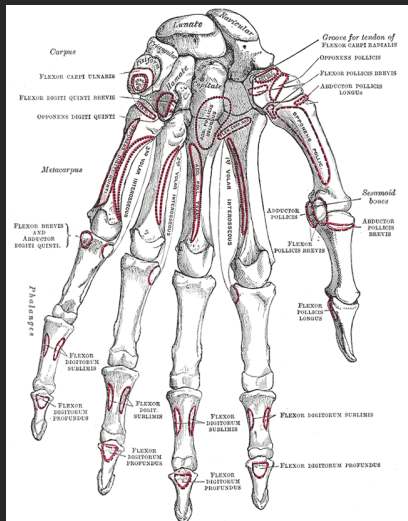
Beautiful Evidence [Tufte]

# Present argument

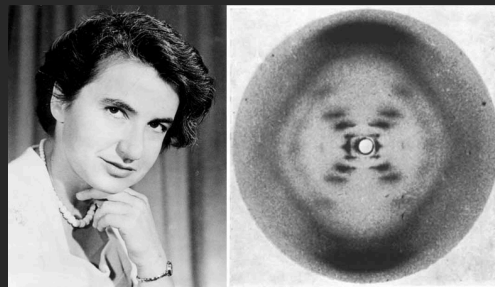


Crimean War Deaths [Nightingale 1858]

# Inspire

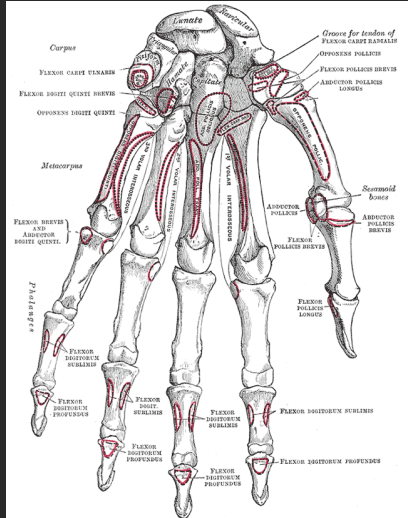


Bones in hand [from 1918 edition]



X-ray crystallography of DNA [Franklin 52]

# Inspire



Bones in hand [from 1918 edition]



Double helix model [Watson and Crick 53]

## The Purpose of Visualization

### Record information

- Photographs, blueprints, ...

### Support reasoning about information (analyze)

- Process and calculate
- Reason about data
- Expand memory

### Convey information to others (present)

- Share and persuade
- Emphasize important aspects of data



## Goals of visualization research

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### 1. **Understand** how visualizations convey information

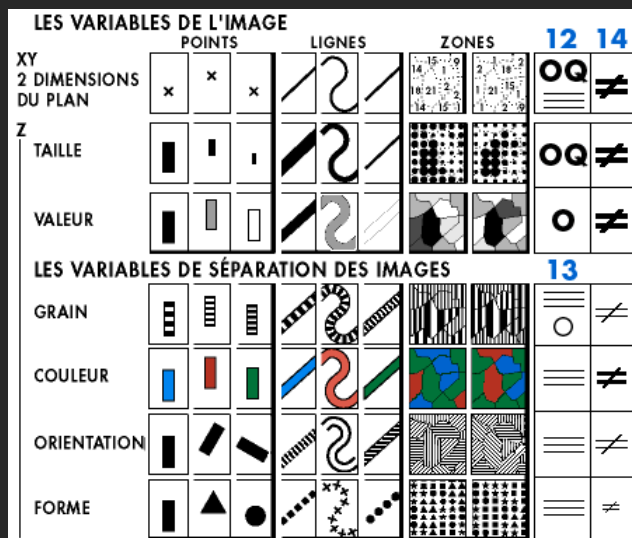
- What do people perceive/comprehend ?
- How do visualizations correspond with mental models of data?

### 2. **Develop principles and techniques** for creating effective visualizations and supporting analysis

- Leverage perception and cognition
- Strengthen connection between visualization and mental models

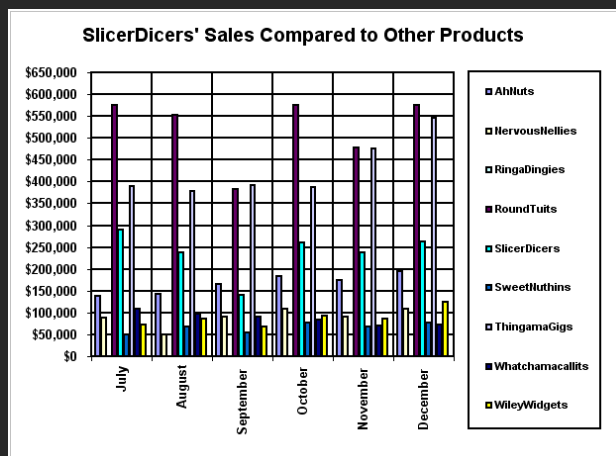
## Course Topics

# Data and image models

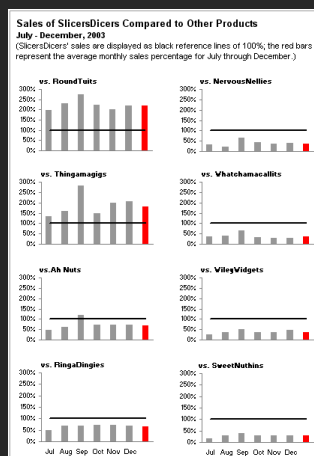


[Bertin, Graphics and Graphic Information Processing 1981]

# Visualization Design & ReDesign



Problematic design



Redesign

# Exploratory Data Analysis

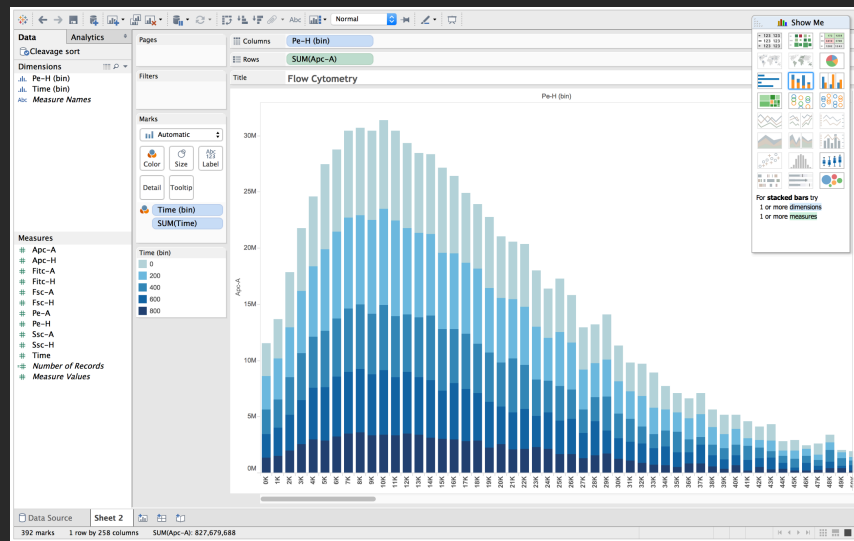
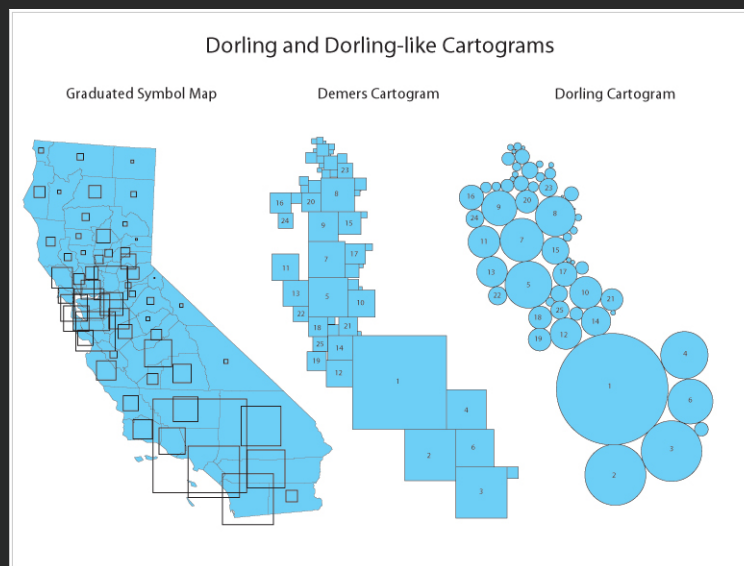


Tableau – based on Polaris [Stolte, Tang, Hanrahan]

# Using Space Effectively



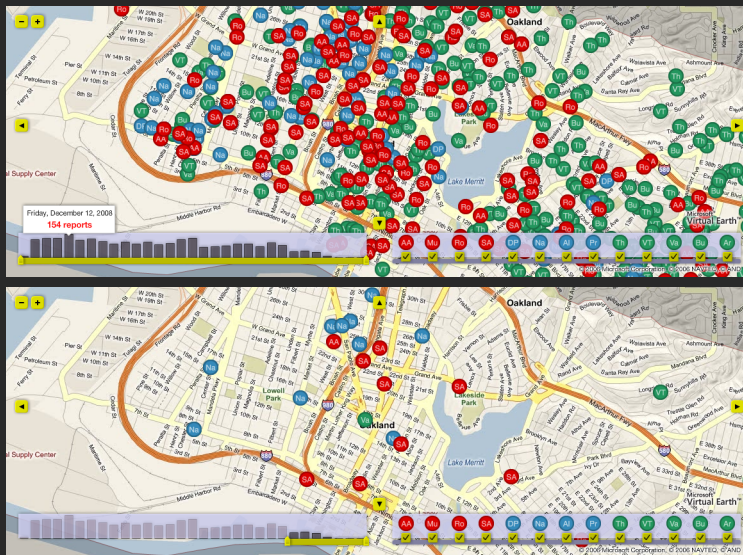
[http://www.ncgia.ucsb.edu/projects/Cartogram\\_Central/types.html](http://www.ncgia.ucsb.edu/projects/Cartogram_Central/types.html)

# Introduction to D3



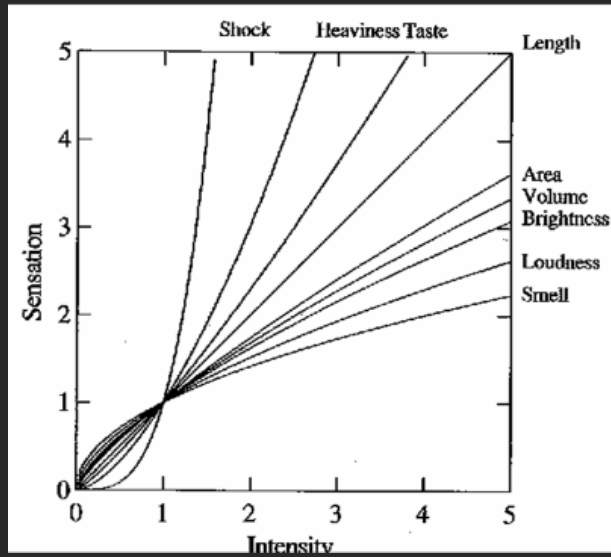
D3: Data Driven Documents [Bostock 2011]

# Interaction



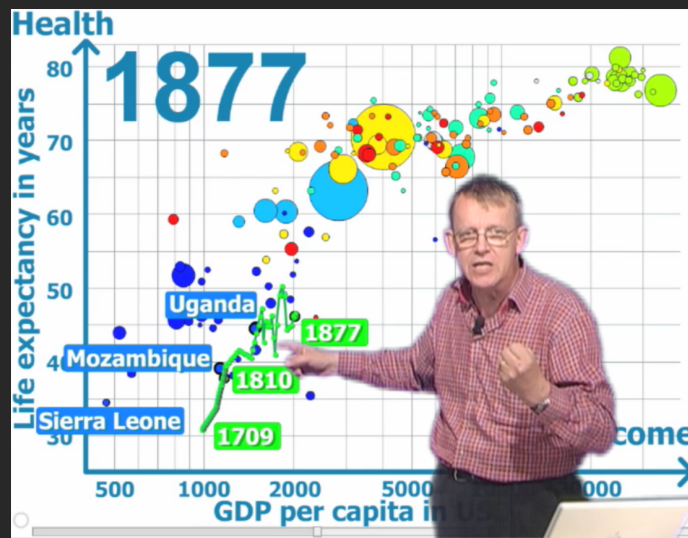
Oakland Crimespotting (crimespotting.org) [Stamen]

# Perception



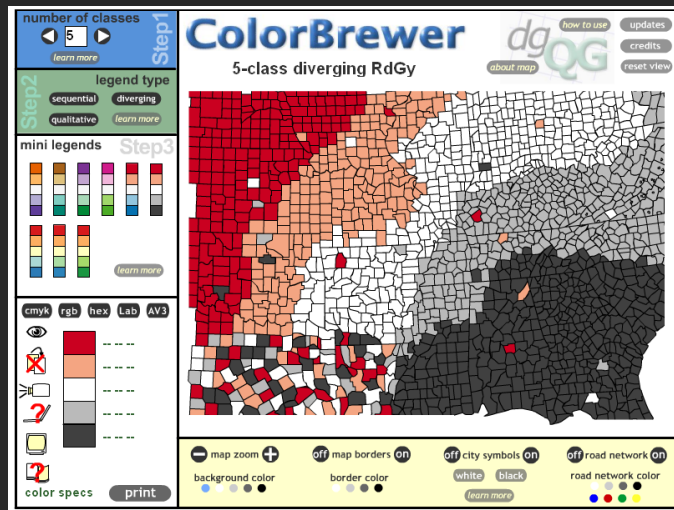
The psychophysics of sensory function [Stevens 61]

# Visual Explainers



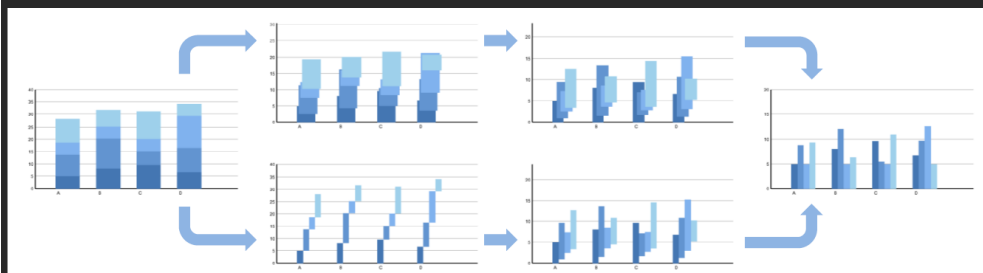
Gapminder [Rosling]

# Color



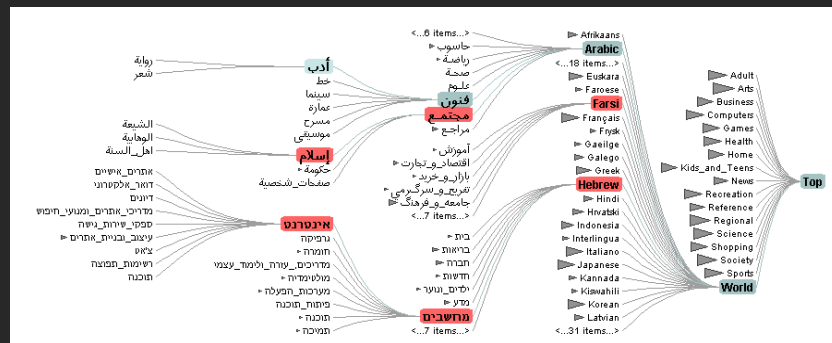
[from Cynthia Brewer <http://www.personal.psu.edu/faculty/c/a/cab38/>]

# Animation



Animated Transitions [Heer 07]

# Networks



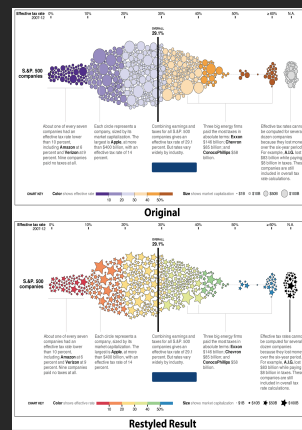
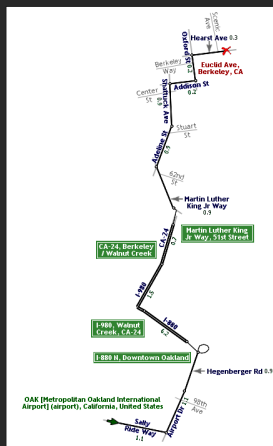
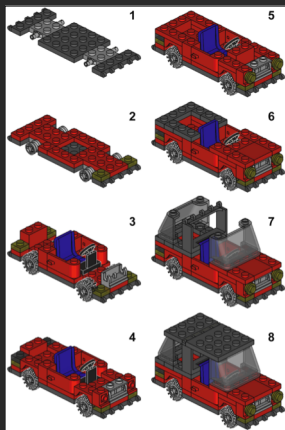
Degree-of-Interest Trees [Heer 2004]

## You should expect to

1. Design, evaluate and critique visualizations
2. Explore data using existing visualization tools
3. Implement interactive data visualizations
4. Develop a substantial visualization project

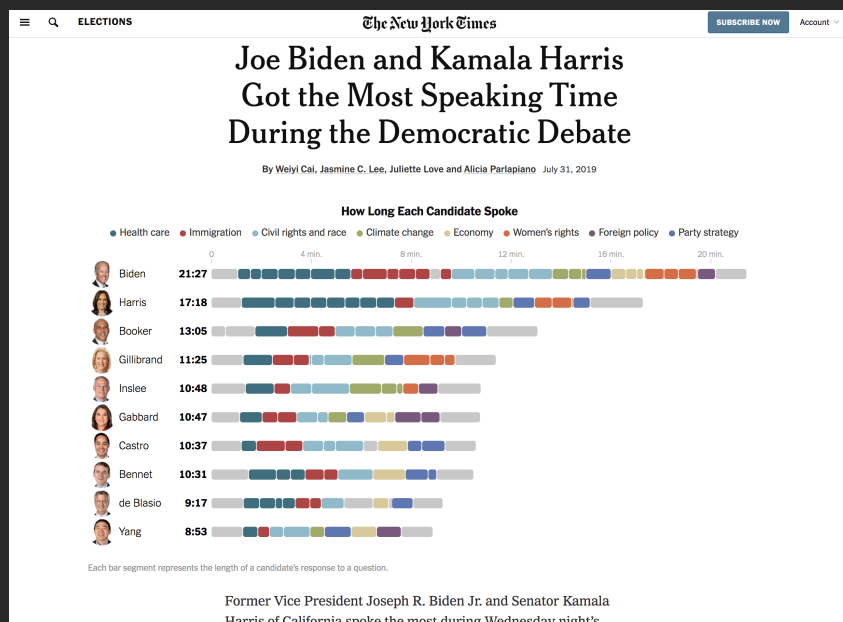
# Course Mechanics

## Instructor: Maneesh Agrawala





# Course Assistant: Juliette Love



## Office Hours

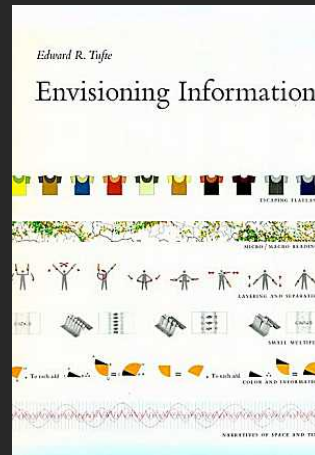
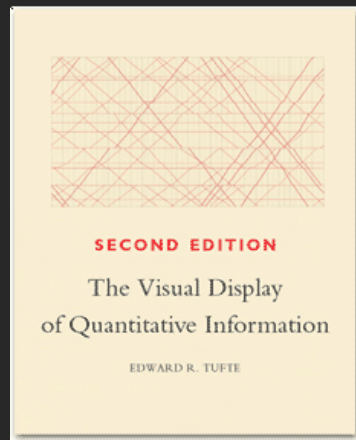
**Maneesh:** 1:30-2:30pm Thu, Gates 364 & by appt.

**Juliette:** 7-8:00pm Tue, Lathrop Tech Lounge & by appt.

**Outside of OH use Piazza to connect with us**

<https://piazza.com/stanford/winter2020/cs448b/>

# Textbooks



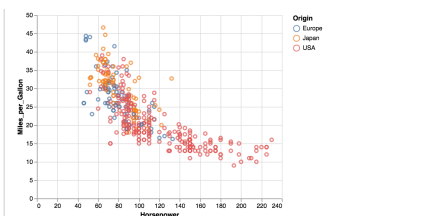
See also: [www.edwardtufte.com](http://www.edwardtufte.com)

# Interactive Notebooks

## Interactivity

In addition to basic plotting and view composition, one of Vega-Lite's more exciting features is its support for interaction.

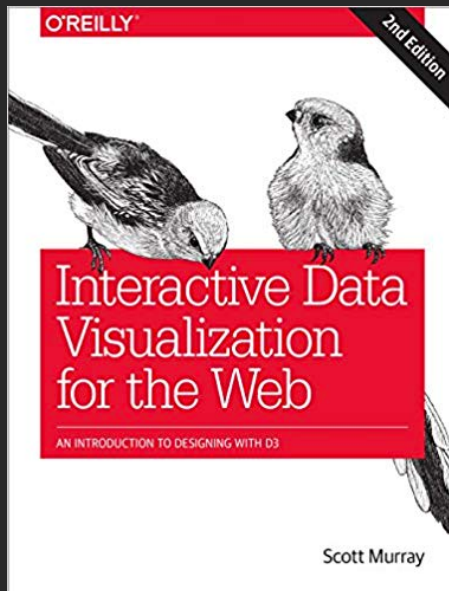
Starting with a scatter plot, we can add a basic (yet valuable) form of interactivity - tooltips upon mouse hover - by including a tooltip encoding channel:



```
vl.markPoint().data(cars).encode(  
  vl.x().fieldQ('Horsepower'),  
  vl.y().fieldQ('Miles_per_Gallon'),  
  vl.color().fieldQ('Origin'),  
  vl.tooltip(['Name', 'Origin']) // show the Name and Origin fields in a tooltip  
)  
.render()
```

Hands-on engagement with course concepts and modern visualization tools (Vega-Lite / Altair), in both JavaScript (Observable) and Python (Jupyter)!

## Optional Book



### For learning D3!

Book available online  
Code/examples on GitHub

We will be using D3 v5

<https://d3js.org>

## Readings

- **From books, notebooks and linked articles**

Many open to public, some may require SUNetID/Password

- **Material in class will be loosely based on readings**

- **Readings should be read by start of class**

- **Post discussion comments (about reading or lecture) using link on class webpage**

One comment per week through week 9

Must post by *noon the day after the lecture*

You have 1 pass for the quarter

### Class home page

<https://magrawala.github.io/cs448b-wi20/>

## Lecture/Reading Responses

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**Good responses typically exhibit one or more**

- Critiques of arguments made in the papers/lectures
- Analysis of implications or future directions for ideas in readings/lectures
- Insightful questions about the readings/lectures

**Responses should not be summaries**

## Discussion

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**Discussion is essential** for effective design, evaluation and critique of visualizations

- Attendance for non-SCPD students is mandatory (you have 2 passes before it will affect your grade)
- Laptops not allowed (unless we specifically ask for them)

# Assignments

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## Class participation (10%)

**Assignment 1:** Visualization Design (10%) due 1/13

**Assignment 2:** Exploratory Data Analysis (15%) due 1/27

Learn to use Tableau

**Assignment 3:** Interactive Prototype (25%) due 2/10

Should be familiar with Javascript (**start now if you are not**)

Will cover basics of D3 in class

**Final Project (40%)** proposal due 2/19, milestone 3/9, final 3/16

# Final project

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Visualization research project on topic of choice

Initial prototype and peer evaluation

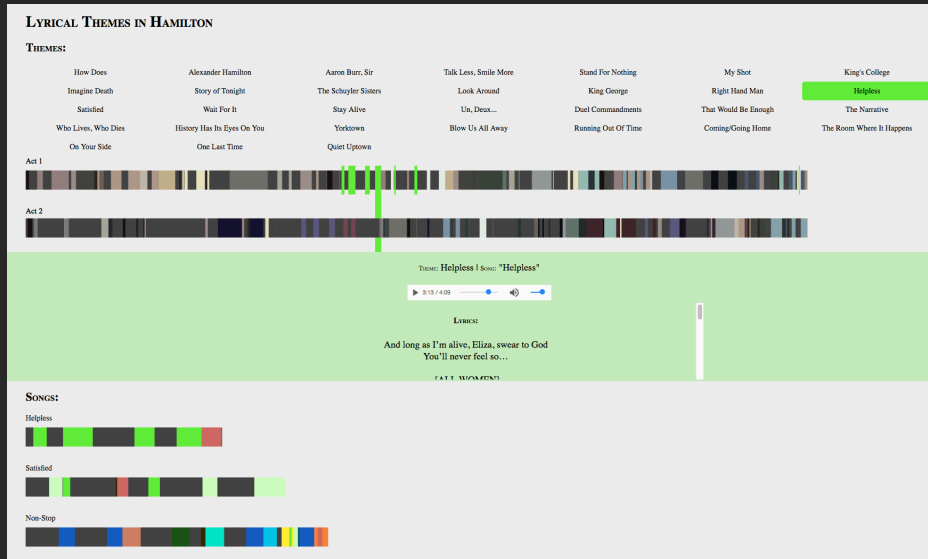
Design reviews and final presentation

Submit and publish online (if feasible)

Projects from previous classes have been:

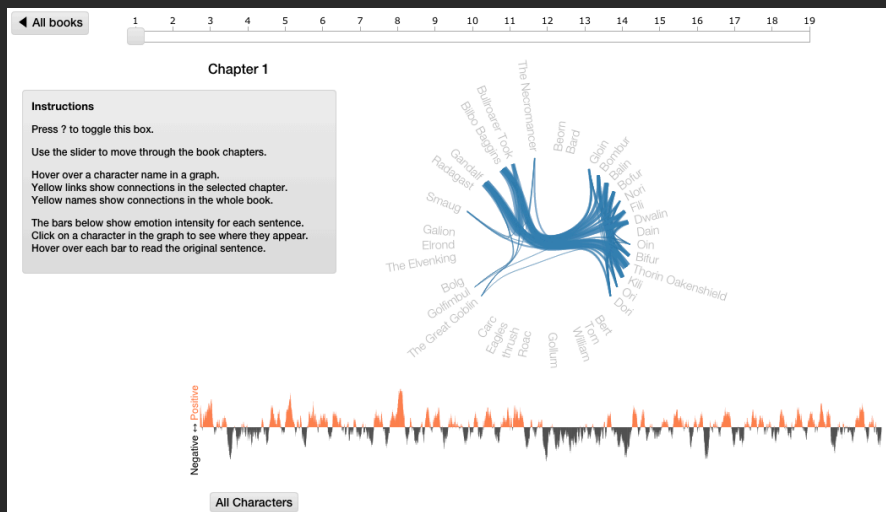
- Published as research papers
- Gone viral on blogs
- Released as open source projects

# Structure of Musicals



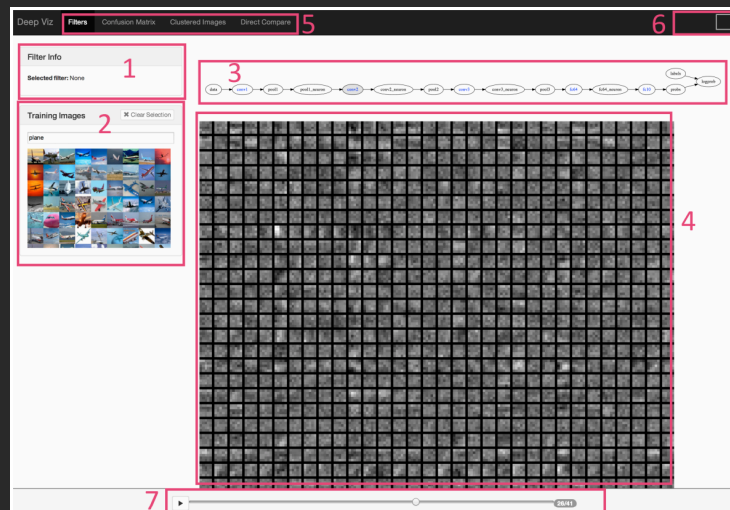
Lyrical themes in Hamilton [Townley-Smith, Sterman, Cook 2016]

# Visualization of Narrative Structure



Character interactions and sentiment in *The Hobbit* [Bilenko, Miyakawa 2013]

# deepviz: Visualizing Convolutional NNs



- 1) Filter details
  - 2) Image selector
  - 3) Network overview
  - 4) Filter visualization
  - 5) Visualization selector
  - 6) Selection helper
  - 7) Animation slider
- [Bruckner, Rosen, Sparks 2013]

## Assignment 1: Visualization Design

Design a static visualization for a data set.

You must choose the message you want to convey. What question(s) do you want to answer? What insight do you want to communicate?

### Data: Coterminal Computer Science Master's Degrees at Stanford

Stanford Institutional Research and Decision Support collects a variety of data about the educational programs at Stanford. We have extracted and prepared a small data set about the the number of students who have pursued coterminal Master's degrees in Computer Science between 2014 and 2019. Our data set contains the following information:

Number of records: 112

#### Variable Names:

- Completion Year: Year in which the coterminal degrees were completed.
- Coterm Master's Plan: Name of Master's degree student completed.
- Coterm Undergraduate Plan: Name of Undergraduate degree student completed.
- Number of Completions: Num. of students that completed the corresponding (Master's, Undergraduate) coterminal degree plan.

The extracted dataset is available in csv format: [StanfordCSCotermPlans\\_2014-1029.csv](#)

**Due by noon on Mon Jan 13**

## **Assignment 1: Visualization Design**

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Pick a guiding question, use it to title your visualization

Design a static visualization for that question

You are free to use any tools (including pen & paper)

Deliverables (upload via Canvas; see A1 page)

PDF of your visualization with a short description including design rationale ( $\leq 4$  paragraphs)

**Due by noon on Mon Jan 13**