

# **Introduction to Information Visualization**

SWEN422  
Human Computer Interaction  
Dr Craig Anslow  
[craig.anslow@ecs.vuw.ac.nz](mailto:craig.anslow@ecs.vuw.ac.nz)

# **SWEN 422 – Lecture Schedule**

- Week 6 – Information Visualization
- Week 7 – Information Visualization
- Week 8 – Information Visualization
- Week 9 – Gestural Interfaces
- Week 10 - AR/VR
- Week 11 - AR/VR
- Week 12 - no lectures (work on project)

[https://ecs.wgtn.ac.nz/Courses/SWEN422\\_2024T1/LectureSchedule](https://ecs.wgtn.ac.nz/Courses/SWEN422_2024T1/LectureSchedule)

# Visualization

“The ability to take data –

to be able to **understand** it,  
to **visualize** it,  
to **communicate** it –

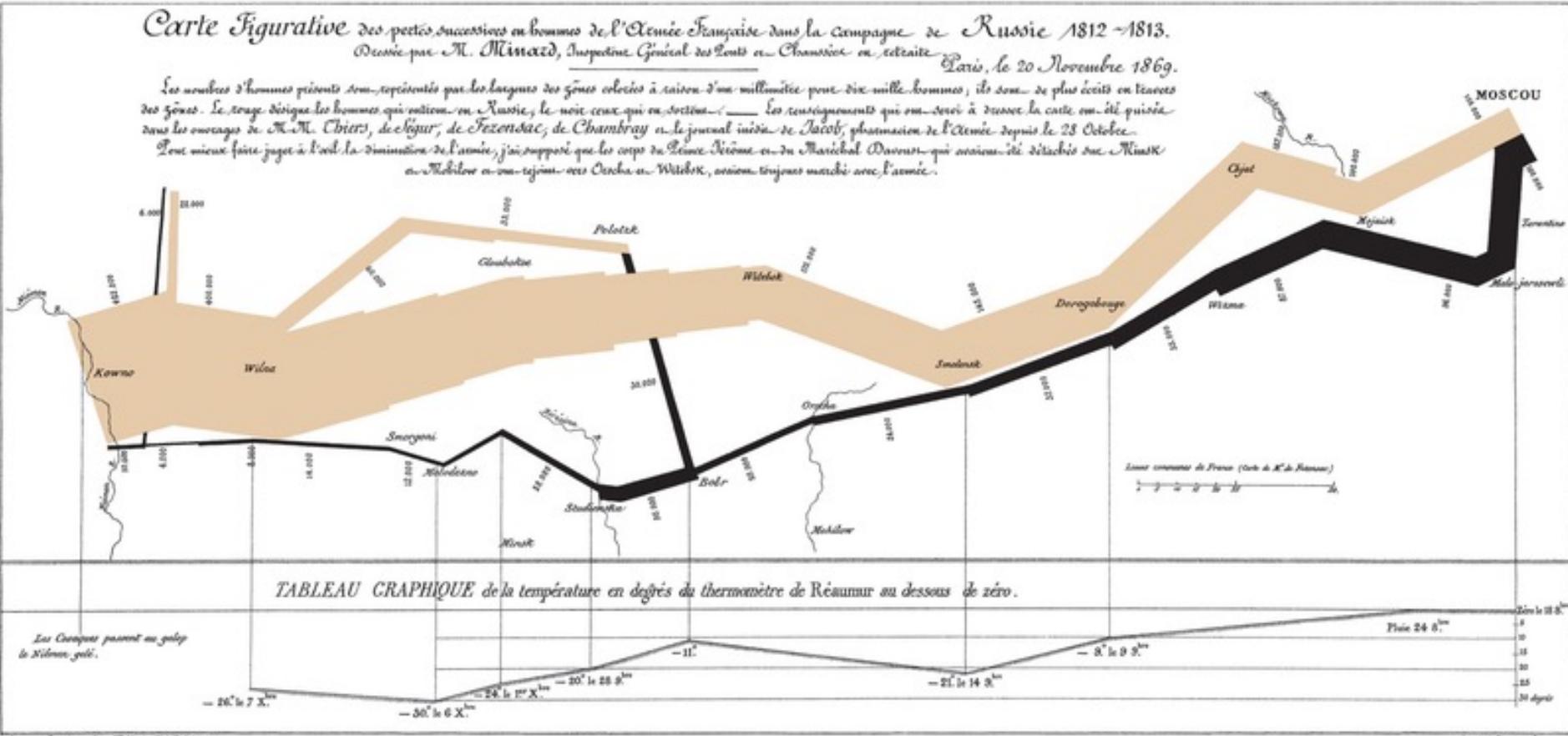
that's going to be a hugely important skill in the next decades,

... 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

# Charles Minard – Napoleon 1812



**Charles Minard's map of Napoleon's disastrous Russian campaign of 1812.**  
 Graphic notable for representation in 2D of 6 types of data: # of troops; distance; temperature; the latitude and longitude; direction of travel; and location relative to dates.

LONDON

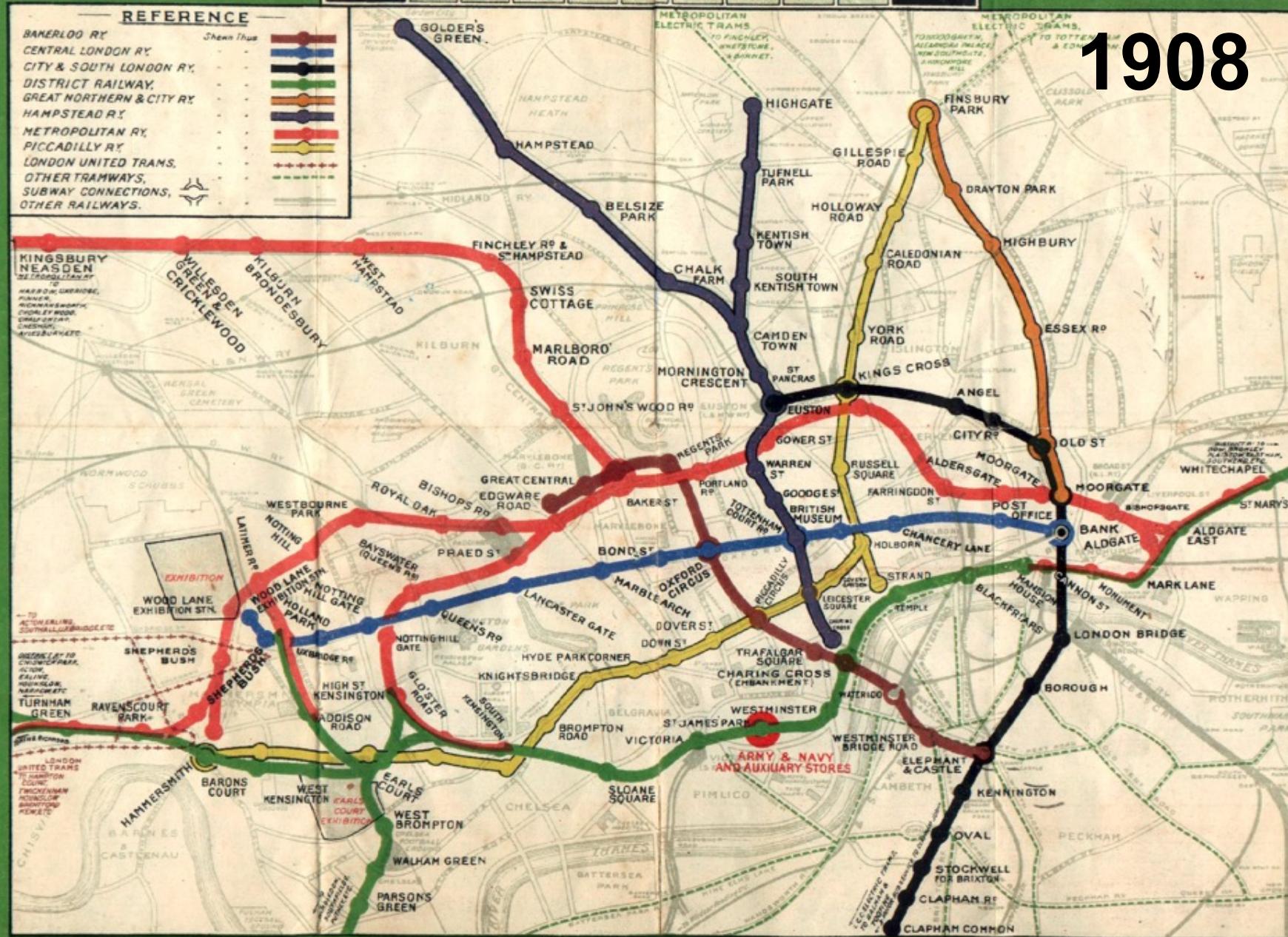
# UNDERGROUND

RAILWAYS

1908

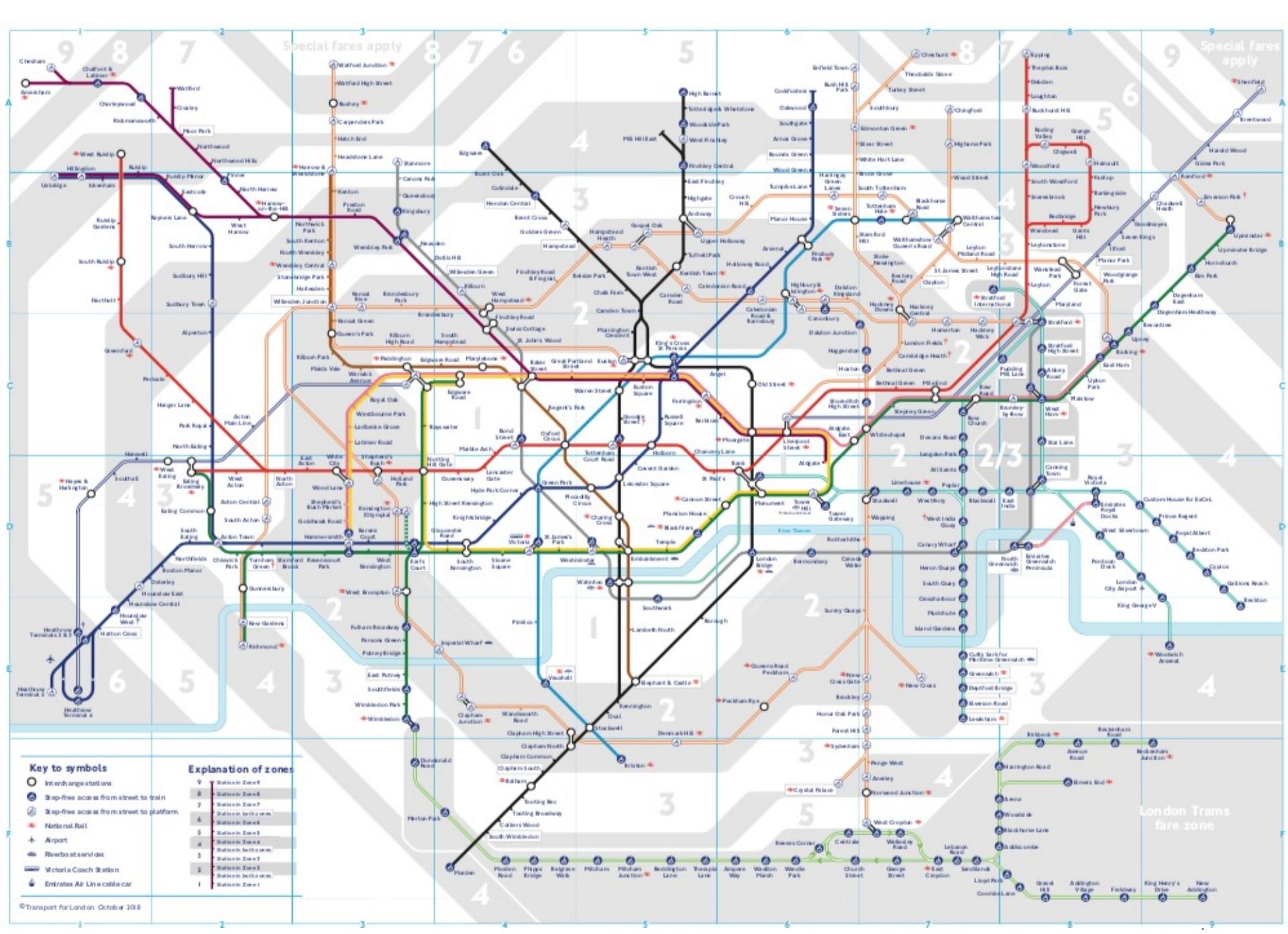
## REFERENCE

BAKERLOO RY.	SHOWN THIS
CENTRAL LONDON RY.	- - -
CITY & SOUTH LONDON RY.	—
DISTRICT RAILWAY.	—
GREAT NORTHERN & CITY RY.	—
HAMPSTEAD RY.	—
METROPOLITAN RY.	—
PICCADILLY RY.	—
LONDON UNITED TRAMS.	—
OTHER TRAMWAYS.	—
SUBWAY CONNECTIONS.	—
OTHER RAILWAYS.	—

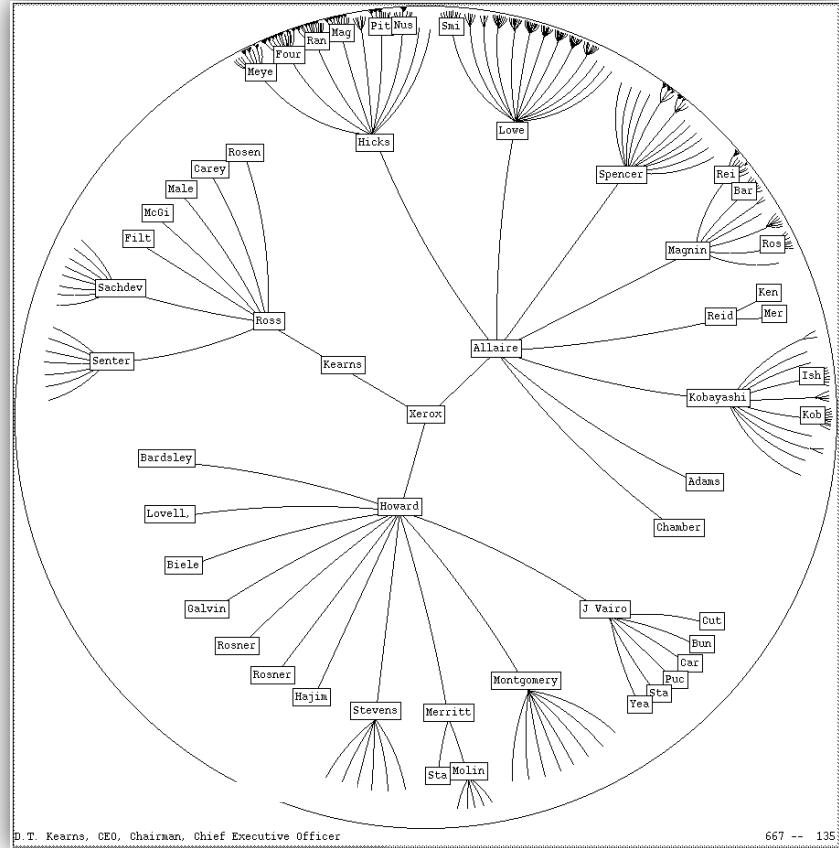


# 1933



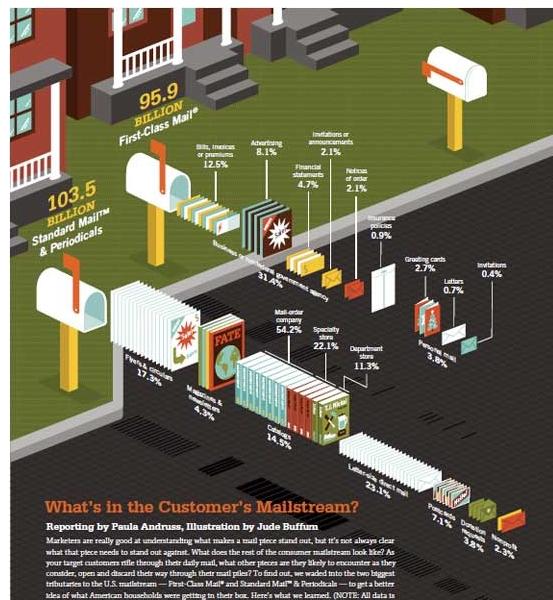
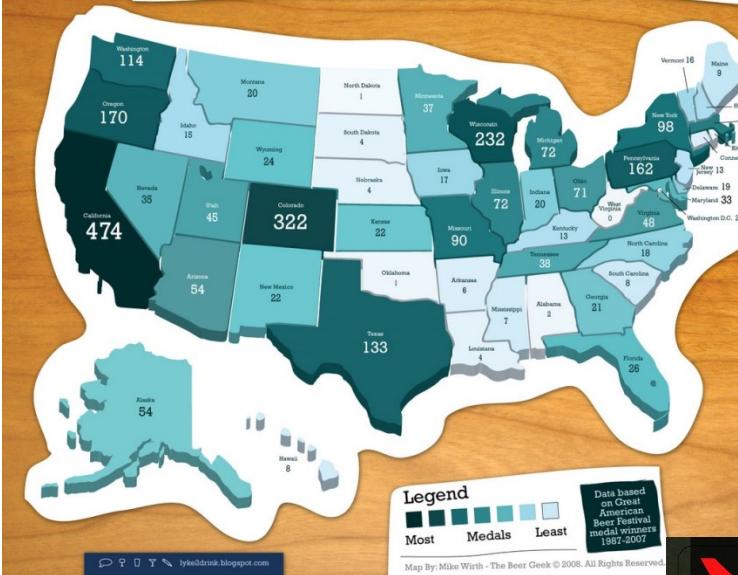


# InfoGraphics vs Visualization



A **Visualization** can be applied to many datasets; an **Infographic** is created for a particular dataset.

# The Best Beer in America



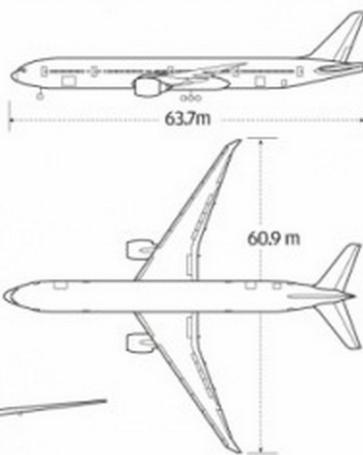
# Malaysia Airlines flight MH370

## Still a mystery

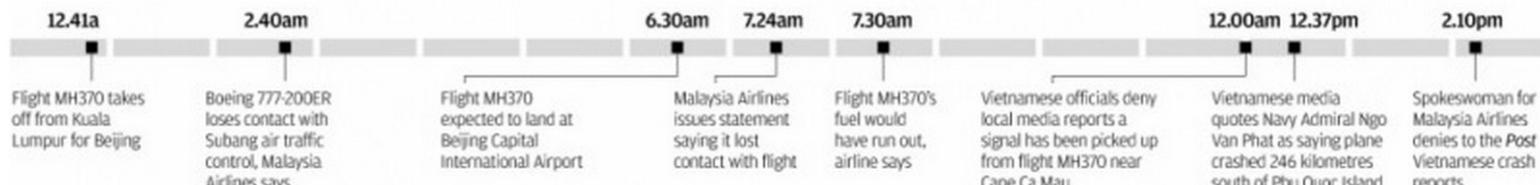
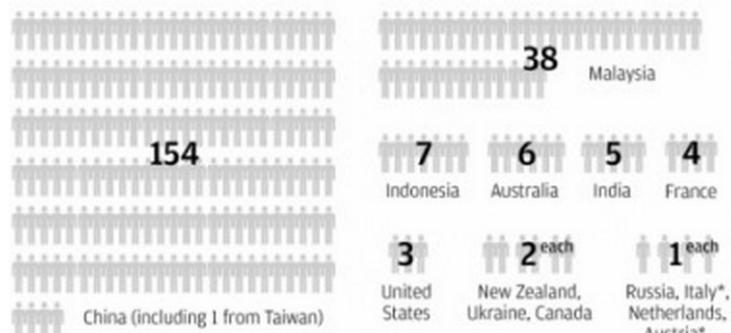
Flight MH370 with 239 people on board vanished yesterday over the South China Sea near the Vietnam coastline. There were more than 150 Chinese nationals on board.

### Boeing 777-200ER (Flight MH 370)

Passengers	Up to 292
Engines (Max. thrust)	Rolls-Royce Trent 895 42,365kg
Fuel	171,170 litres
Range	7,725 nautical miles (14,305km)
Cruise speed	0.84 Mach



### On board flight MH370



# What is Visualization?

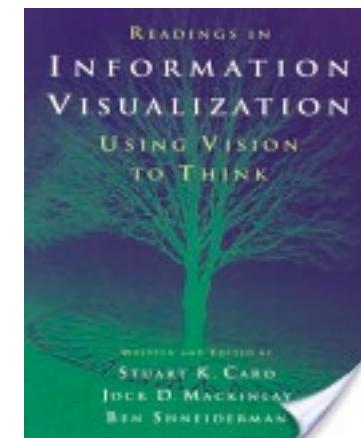
- Visual representation of data
- “Transformation of the symbolic into the geometric” [McCormick et al, 1987]
- “... artificial memory that best supports our natural means of perception” [Bertin, 1967]
- “Use of computer-generated, interactive, visual representations of data to amplify cognition” [Card, Mackinlay, & Shneidermann, 1999]
- “The use of visual representations to explore, make sense of, and communicate data.” [Few, 2014]

# Information Visualization

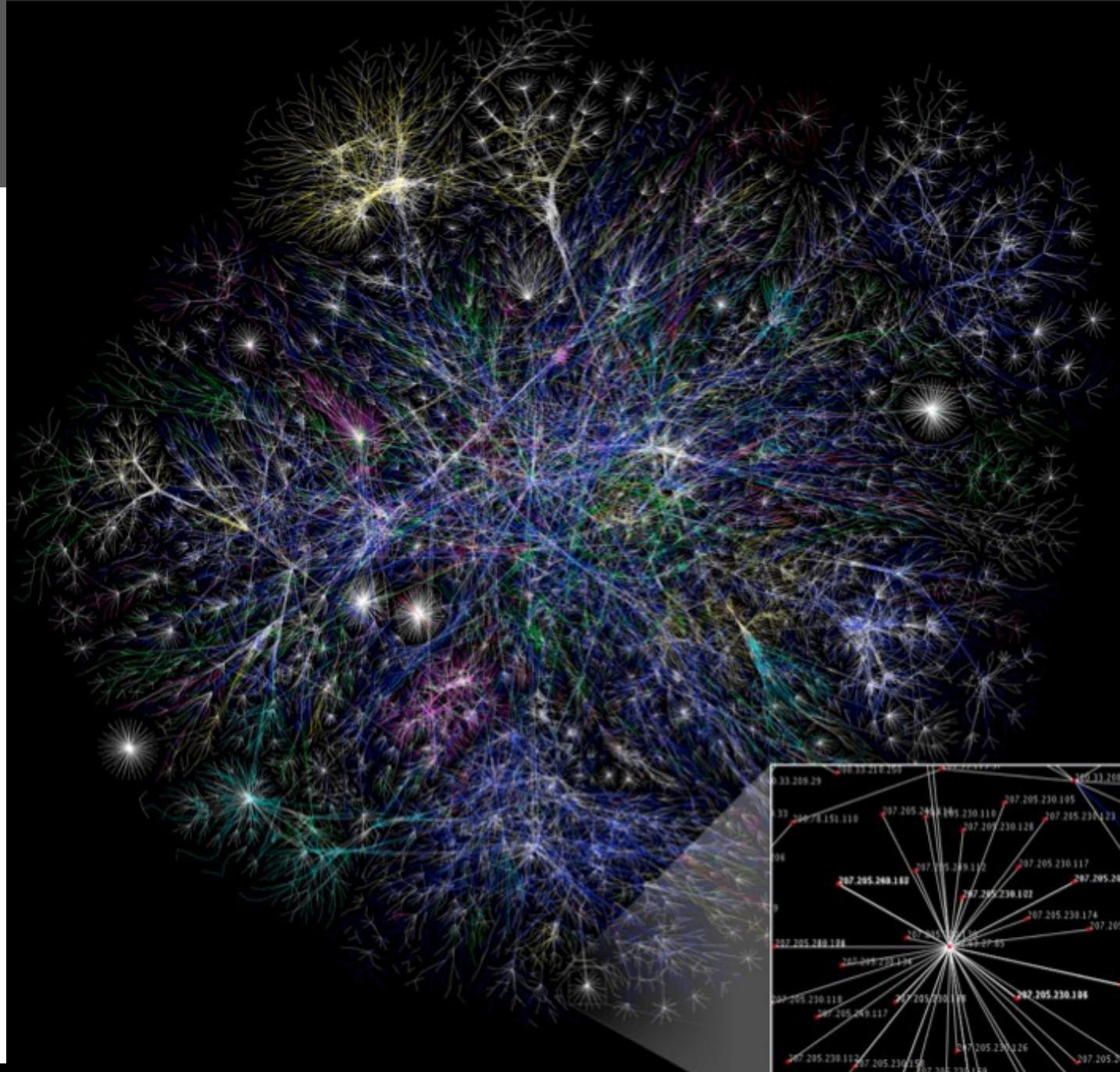
**Information Visualization** is the use of interactive visual representations of data to amplify cognition. This means that the data is transformed into an image, it is mapped to screen space. The image can be changed by users as they proceed working with it. This interaction is important as it allows for constant redefinition of goals when new insight into the data has been gained.

Card, Mackinlay, Schneiderman.

Readings in Information Visualization: Using Vision to Think  
Morgan Kaufmann, 1999



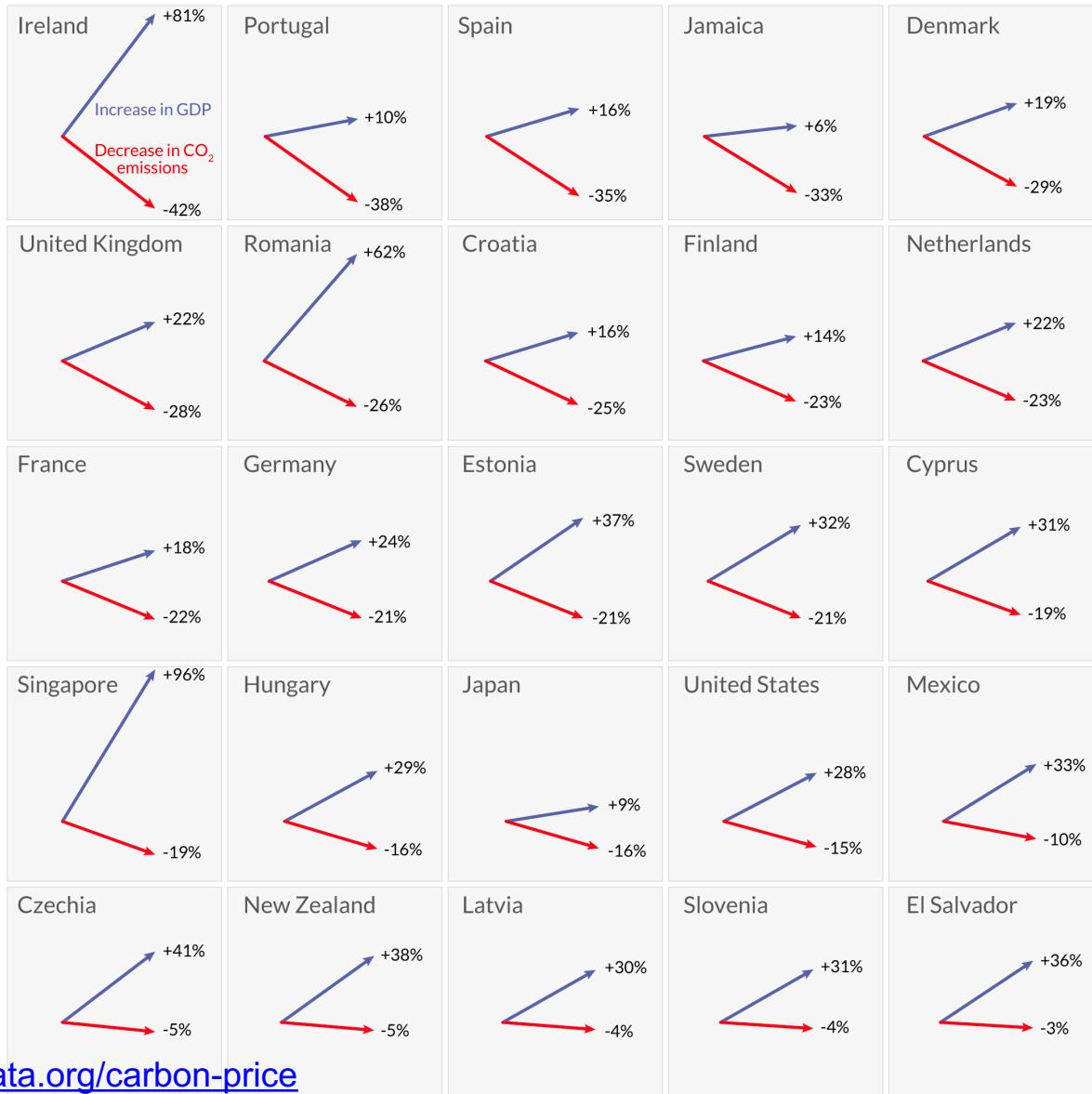
# OPTE



[http://en.wikipedia.org/wiki/Opte\\_Project](http://en.wikipedia.org/wiki/Opte_Project)

# Decoupling: Countries that achieved economic growth while reducing CO<sub>2</sub> emissions, 2005–19

Emissions are adjusted for trade. This means that CO<sub>2</sub> emissions caused in the production of imported goods are added to its domestic emissions – and for goods that are exported the emissions are subtracted.



<https://ourworldindata.org/carbon-price>

# Interactive Examples

- **Word Clouds:**
  - <https://worditout.com/>
  - <http://www.wordle.net/> Not Wordle Game <https://wordlegame.org/>
- **Data:**
  - Arden <https://www.newsroom.co.nz/2018/09/27/256105/full-text-pms-speech-to-the-united-nations>
  - Luxon <https://www.national.org.nz/speechstateofthenation>
- **Baby Name Wizard:** <http://www.babynamewizard.com/>
- **Sorting Algorithms:**
  - <http://www.sorting-algorithms.com/>
  - <https://softvis.wordpress.com/sorting-algorithms>

# Gource

## Gource

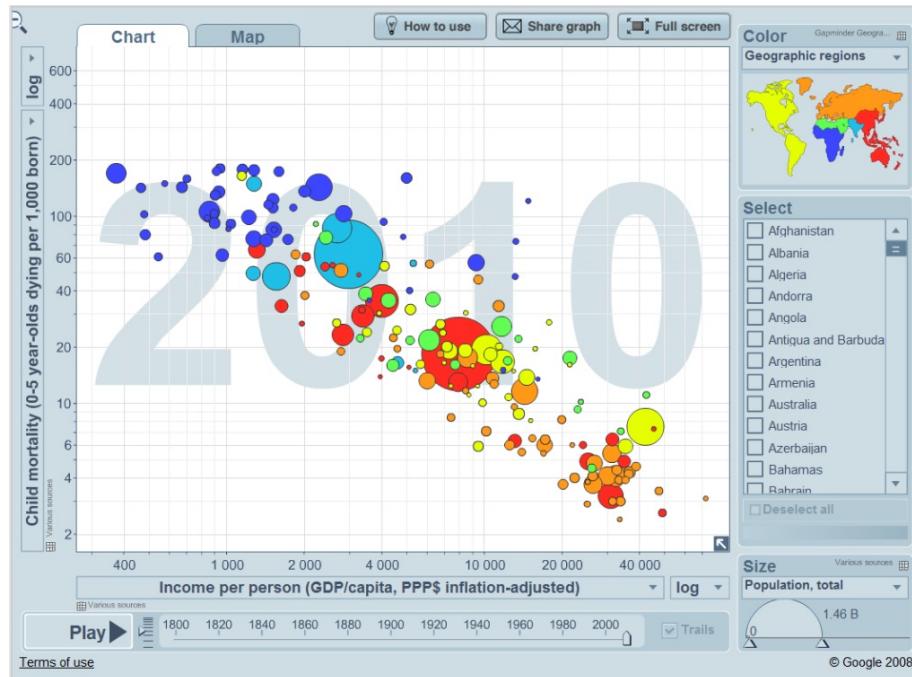
Software Version Control Visualization  
[gource.googlecode.com/](http://gource.googlecode.com/)



<http://gource.io/>

# GapMinder – Hans Rosling

## *Debunking Myths About the “Third World”*



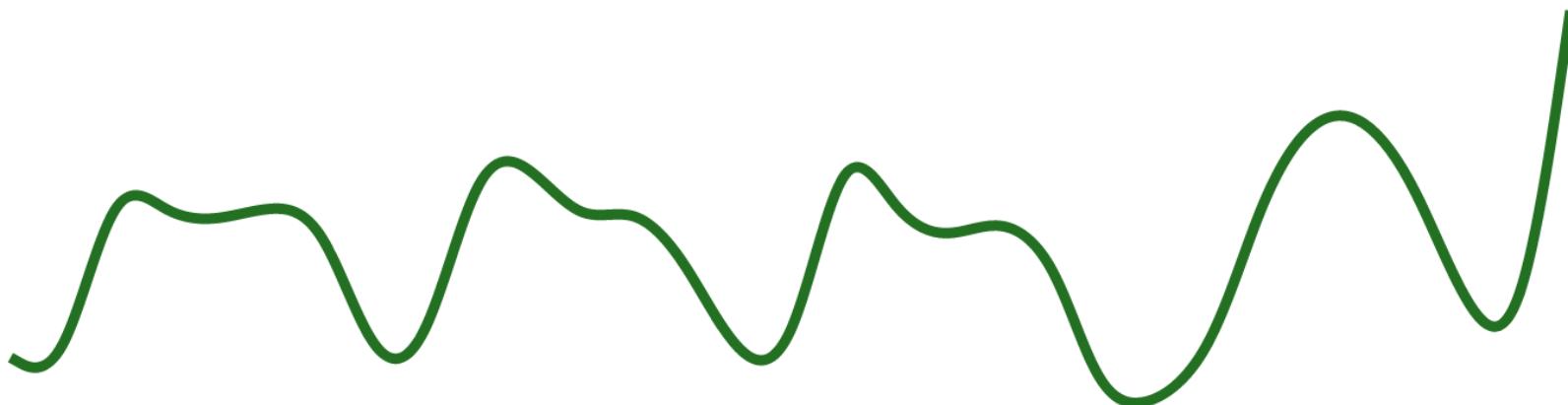
[http://www.ted.com/talks/hans\\_rosling\\_shows\\_the\\_best\\_stats\\_you\\_ve\\_ever\\_seen](http://www.ted.com/talks/hans_rosling_shows_the_best_stats_you_ve_ever_seen)  
<http://www.gapminder.org/>



# What is Visualization?

1. Based on non-visual data
2. Produce an image
3. Result must be readable and recognizable

Robert Kosara



# Why do we Visualize?

- **Visual bandwidth is enormous**

# Why do we Visualize?

- **Visual bandwidth** is enormous
- **Human perceptual** skills are remarkable
  - Trend, cluster, gap, outlier, pattern ...
  - Color, size, shape, proximity...

# 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

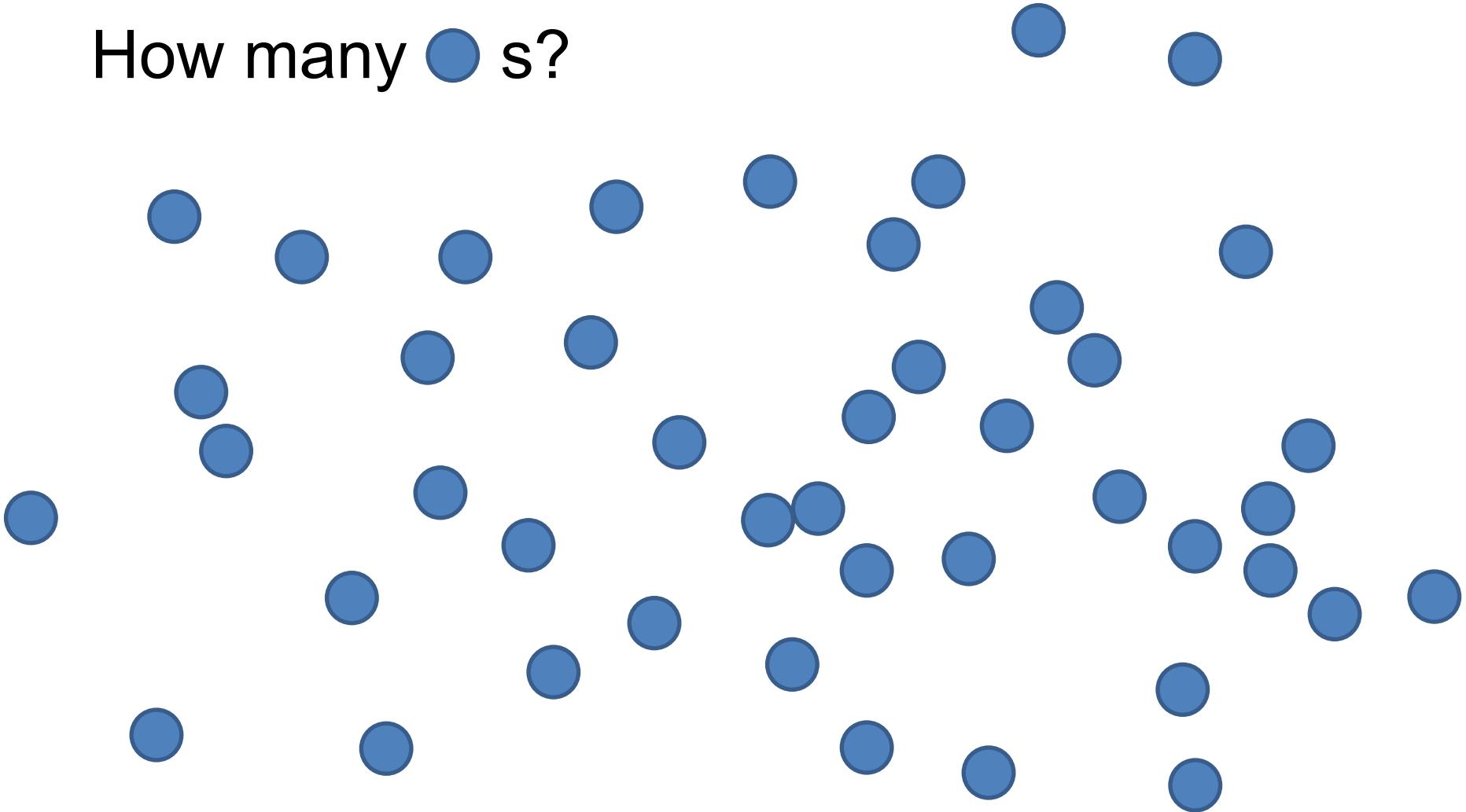
# Perception

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

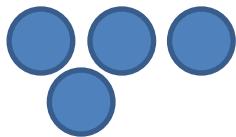
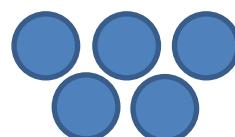
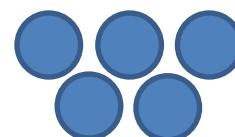
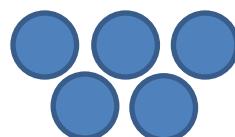
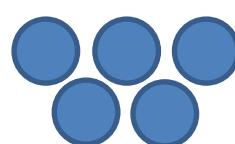
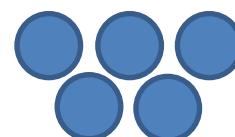
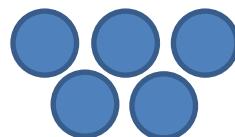
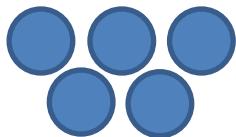
# Perception

How many  s?



# Perception

How many ● s?



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

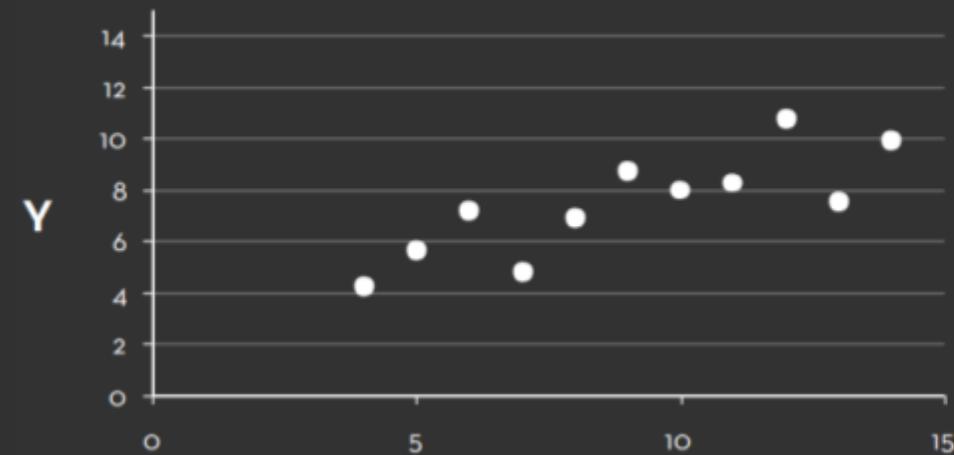
### Summary Statistics

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

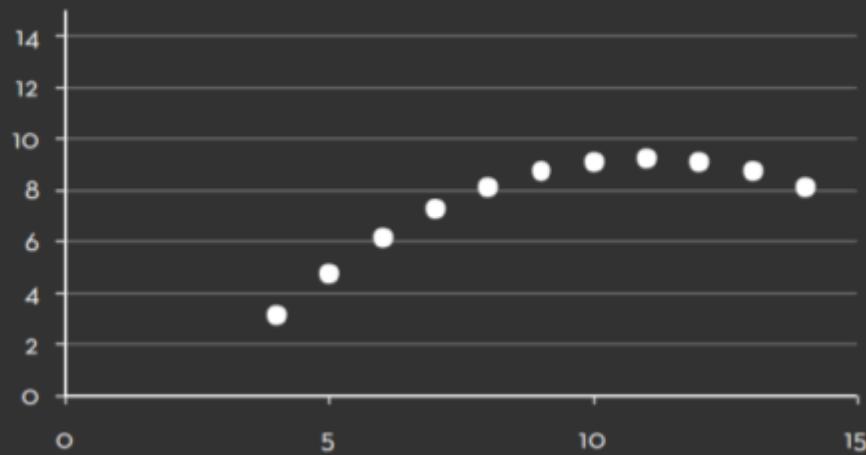
$$\mu_Y = 7.5 \quad \sigma_Y = 2.03$$

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

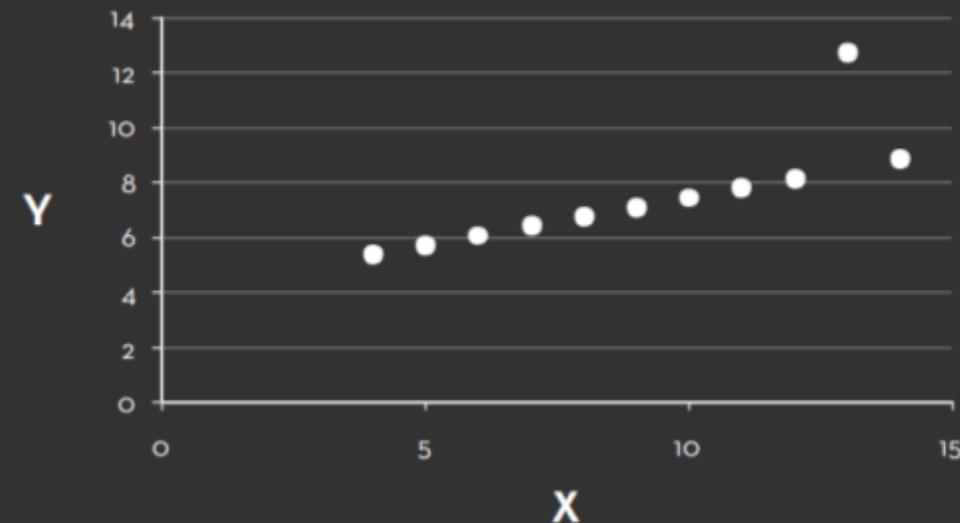
# Set A



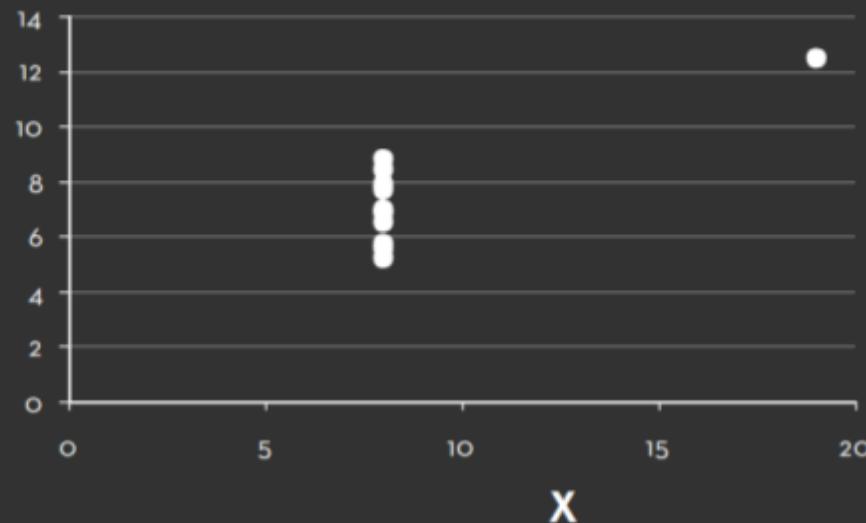
# Set B



# Set C



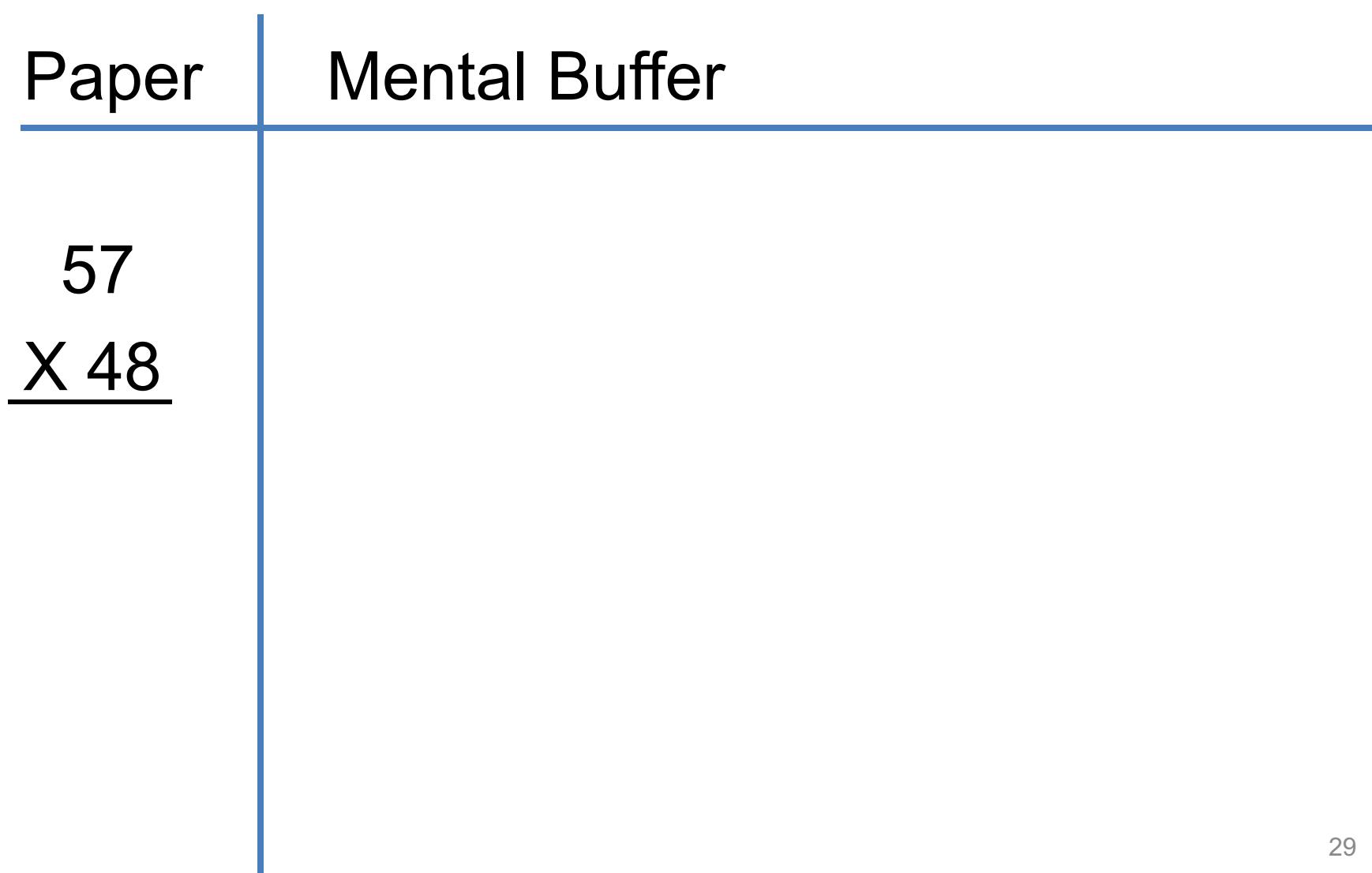
# Set D



# Why do we Visualize?

- **Visual bandwidth** is enormous
- **Human perceptual** skills are remarkable
  - Trend, cluster, gap, outlier, pattern...
  - Color, size, shape, proximity...
- External representation
  - **Reduces load** on working memory
  - **Offload** cognition

# External Representation



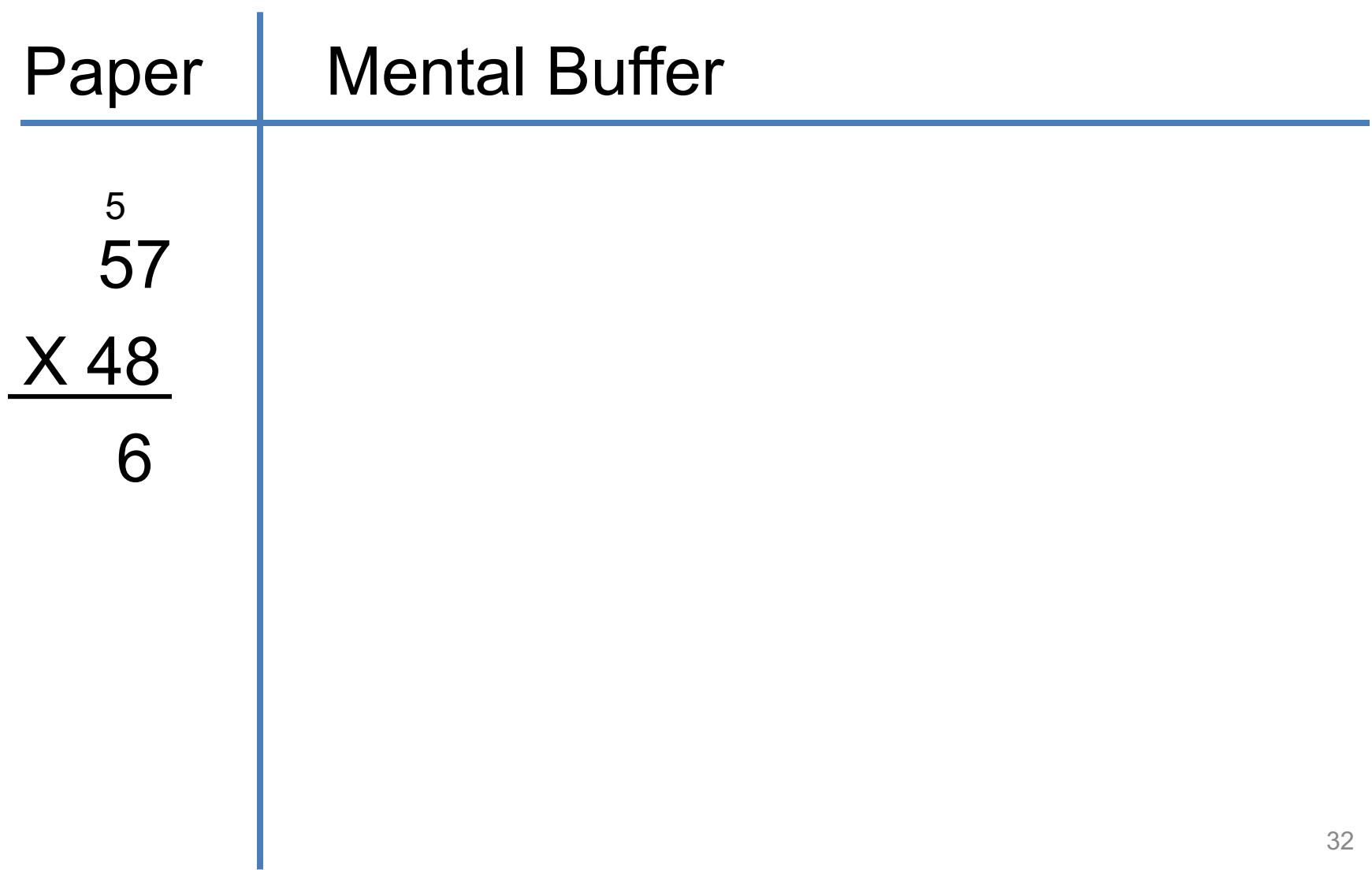
# External Representation

Paper	Mental Buffer
$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$	$7*8 = 56$

# External Representation

Paper	Mental Buffer
$\begin{array}{r} 5 \\ 57 \\ \times 48 \\ \hline 6 \end{array}$	$7 * 8 = 56$

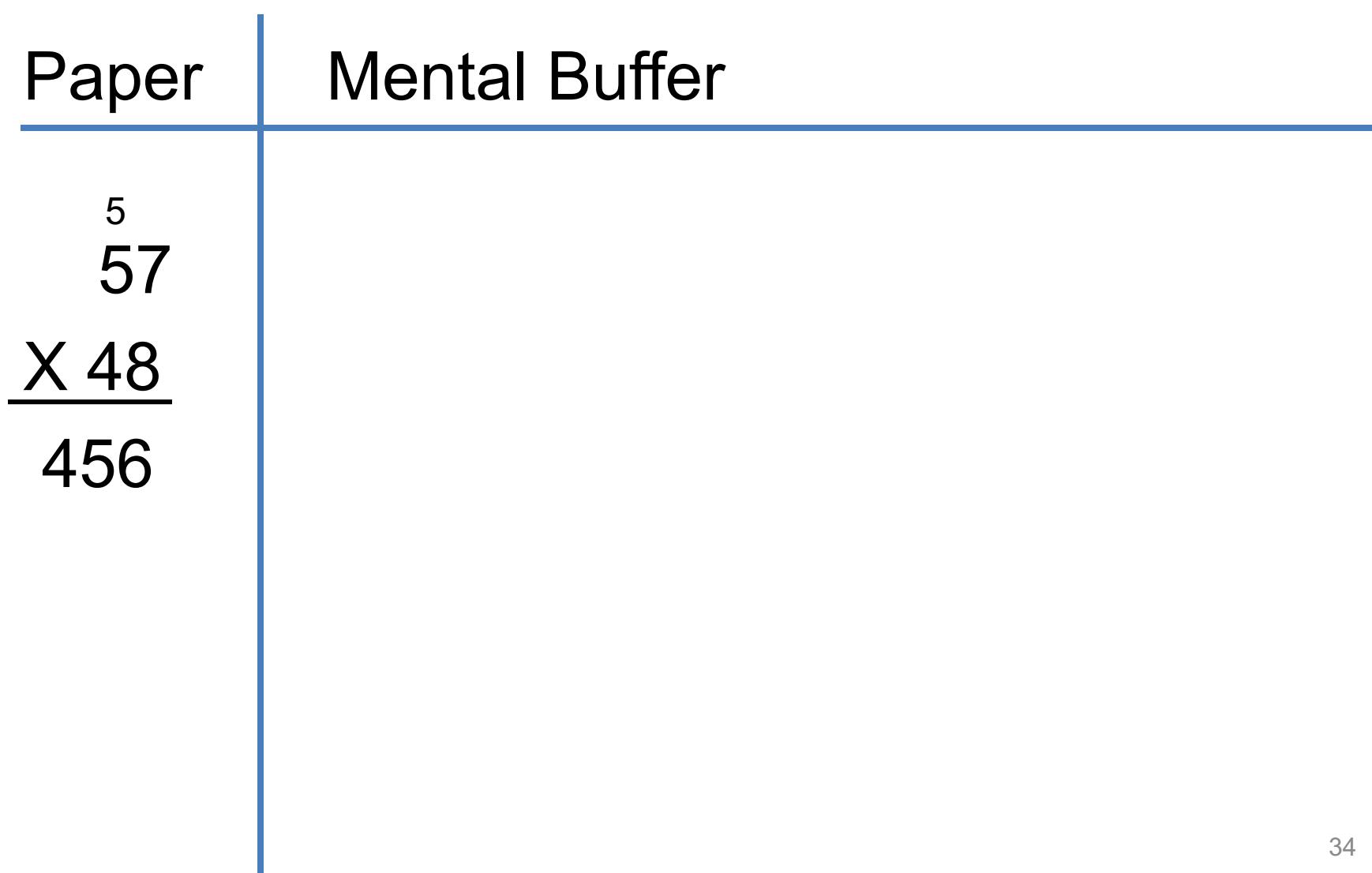
# External Representation



# External Representation

Paper	Mental Buffer
$\begin{array}{r} 5 \\ 57 \\ \times 48 \\ \hline 456 \end{array}$	$5 * 8 = 40 + 5 = 45$

# External Representation



# External Representation

Paper	Mental Buffer
$\begin{array}{r} 25 \\ \times 48 \\ \hline 456 \\ 8 \end{array}$	$4 * 7 = 28$

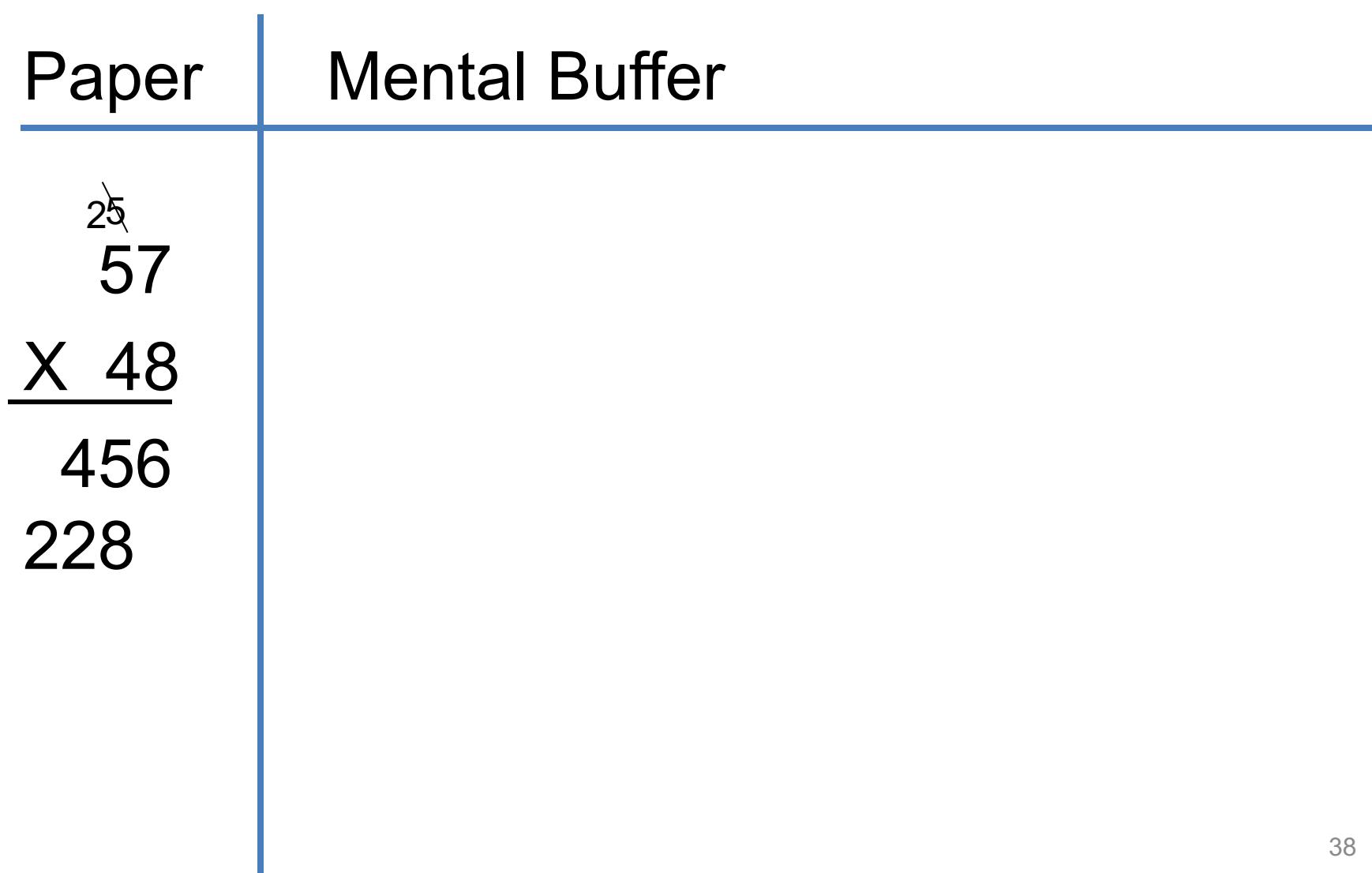
# External Representation

Paper	Mental Buffer
$\begin{array}{r} 25 \\ \times 57 \\ \hline 456 \\ 8 \end{array}$	

# External Representation

Paper	Mental Buffer
$\begin{array}{r} 25 \\ \times 48 \\ \hline 228 \end{array}$	$4 * 5 = 20 + 2 = 22$

# External Representation



# External Representation

Paper	Mental Buffer
$\begin{array}{r} 25 \\ \times 48 \\ \hline \end{array}$	$6 + 0 = 6$
57	$5 + 8 = 13$
456	$2 + 4 = 6 + 1 = 7$
228	
$\hline$	
2736	$2 + 0 = 2$

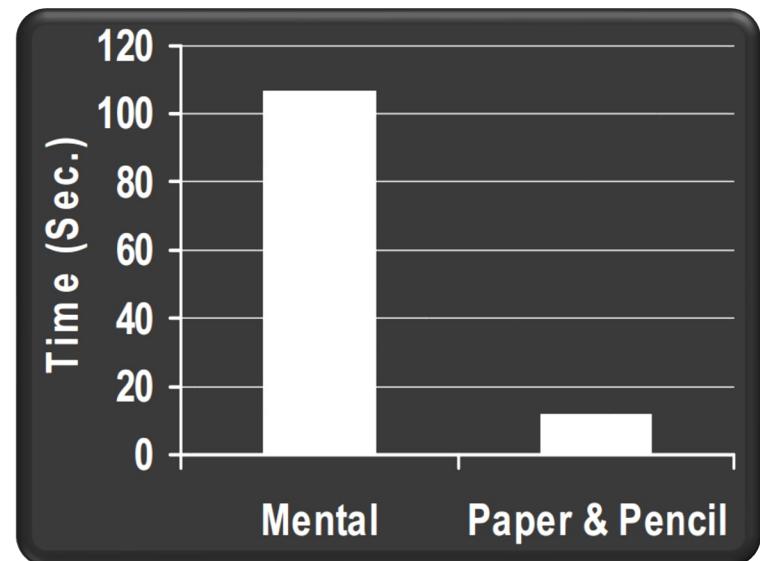
# External Representation

Paper

$$\begin{array}{r} 25 \\ \times 57 \\ \hline 1456 \\ 228 \\ \hline 2736 \end{array}$$

Mental Buffer

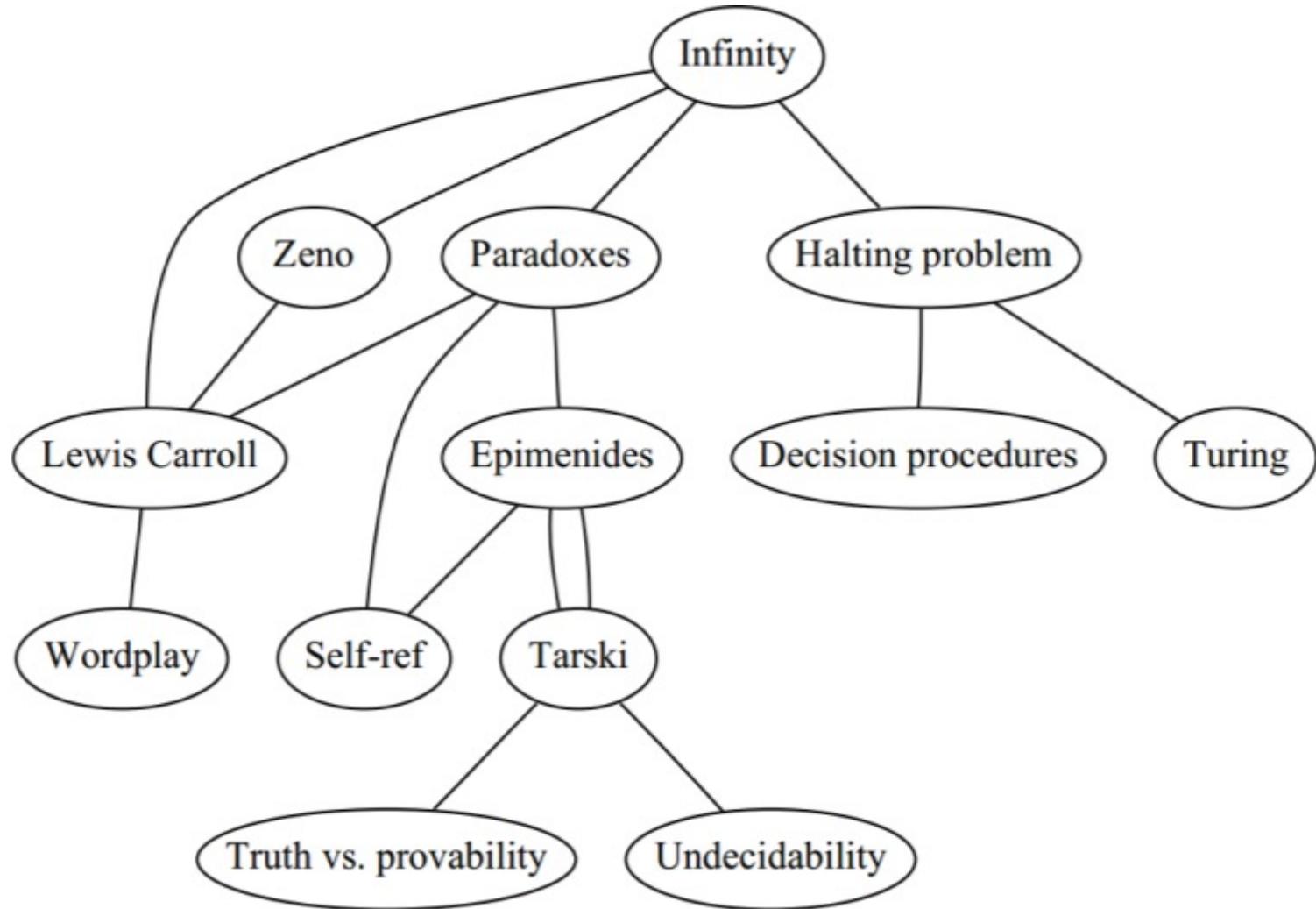
$$\begin{aligned} 6 + 0 &= 6 \\ 5 + 8 &= 13 \\ 2 + 4 = 6 + 1 &= 7 \\ 2 + 0 &= 2 \end{aligned}$$



# External Representation: Example

- Paradoxes – Lewis Carroll
- Paradoxes – Epimenides
- Paradoxes – Self-ref
- Paradoxes – Infinity
- Epimenides – Self-ref
- Epimenides – Tarski
- Halting Problem – Decision Procedure
- Halting Problem - Turing
- Infinity – Halting problem
- Infinity – Recursion
- Infinity – Zeno
- Infinity – Lewis Carroll
- Zeno – Lewis Carroll
- Lewis Carroll – Wordplay
- Tarski – Epimenides
- Tarski – Truth vs Provability
- Tarski - Undecidability

# External Representation: Example



# Why do we Visualize?

- **Visual bandwidth** is enormous
- **Human perceptual** skills are remarkable
  - Trend, cluster, gap, outlier, pattern...
  - Color, size, shape, proximity...
- External representation
  - **Reduces load** on working memory
  - **Offload** cognition
- Fewer coded symbols to decode

# Decoding

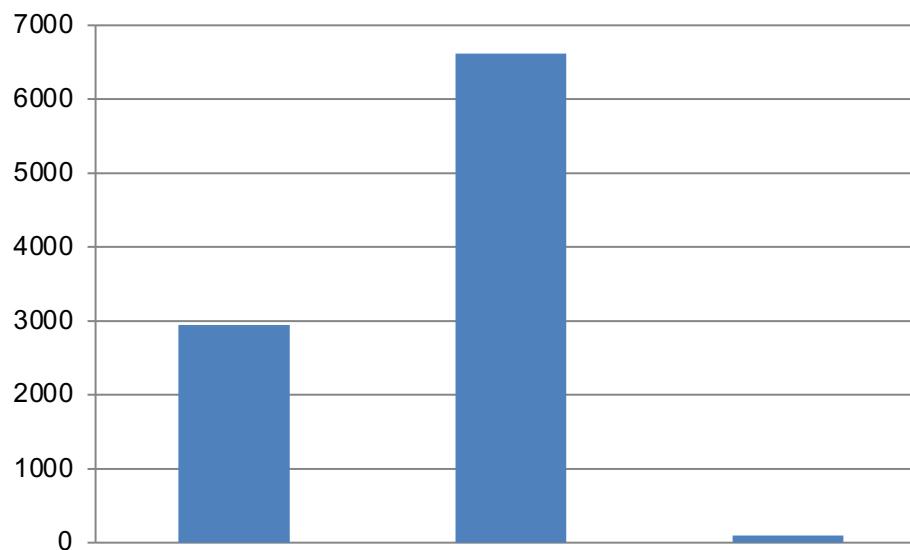
Compare:

2947      vs      6621      vs      95.12

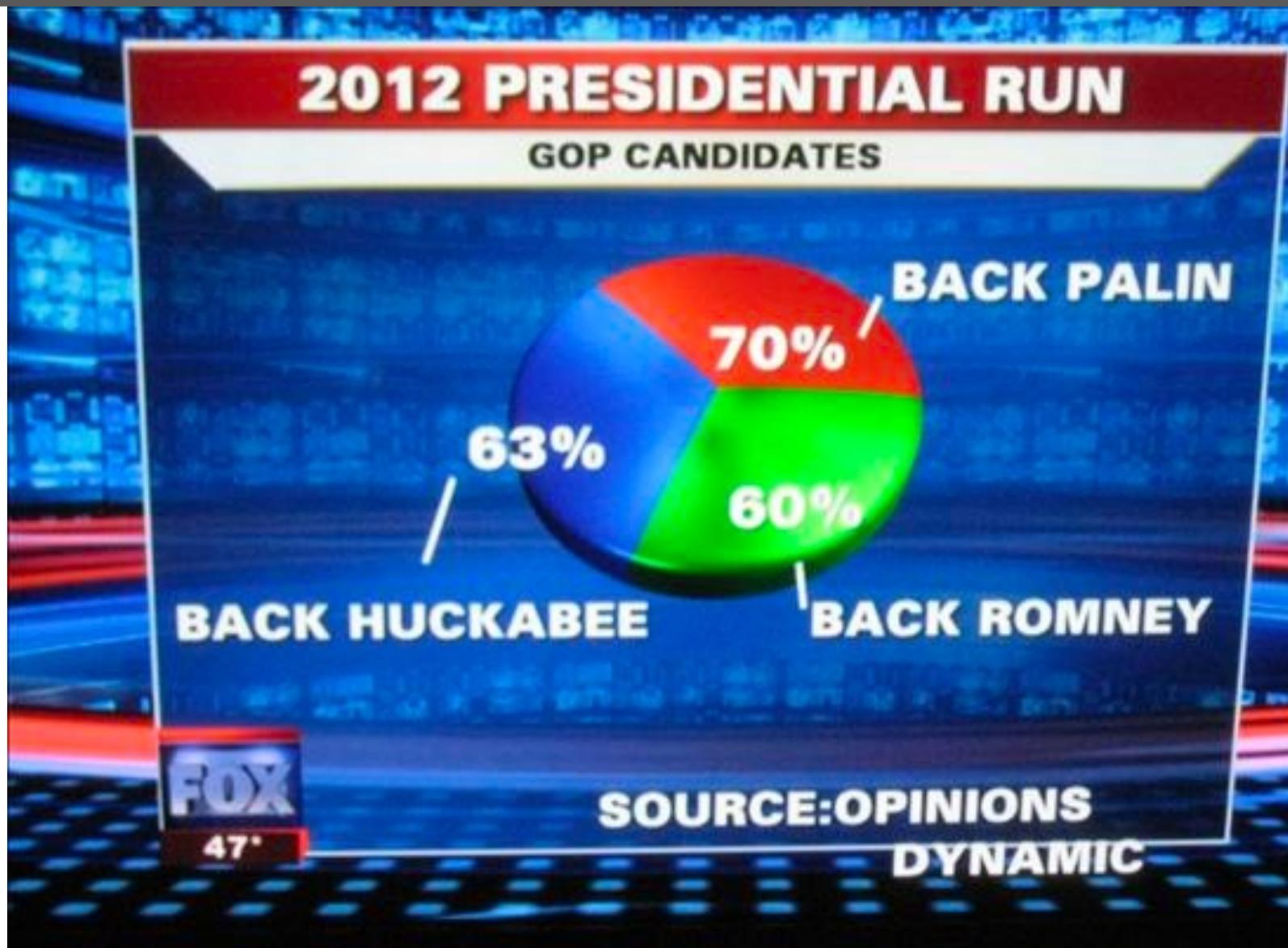
# Decoding

Compare:

2947      vs      6621      vs      95.12



# Why DON'T we Visualize?



# Why DON'T we Visualize?

## Myths:

- We visualize data because some people are visual learners.
- We visualize data for people who have difficulty understanding numbers.
- We visualize data to grab people's attention with eye-catching displays.
- Graphics provide the best means of telling stories contained in data.

# Why do we Visualize?

- See the big picture
  - Don't have read & interpret each datum on its own
- Easily & rapidly compare values
  - Line graph
- See patterns among values
- Compare patterns

# 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*
- **Information Visualization: An Introduction** by Robert Spence
  - *Overarching text book on information visualization*
- **Visual Thinking for Design** by Colin Ware
  - Ties perception theory and design processes to visualization practices.
- **Visualization Analysis and Design** by Tamara Munzner
  - Another current text book on visualization
- **Visualizing Data** by Ben Fry
  - *Text book on how to use Processing for visualization*
- **Beautiful Visualization** by Steele & Iliinsky
  - Combines techniques from artists, designers, scientists, and others.

# Visualization Resources - Tools and Toolkits

- **List of Tools:**
  - <https://www.codewall.co.uk/best-javascript-chart-libraries/>
  - <http://datavisualization.ch/tools/>
  - <http://bigdata-madesimple.com/review-of-20-best-big-data-visualization-tools/>
  - <https://medium.com/javarevisited/top-javascript-chart-libraries-to-consider-in-2021-2a97c32fee3a>
  - <https://blog.logrocket.com/top-javascript-data-visualization-libraries-2021/>
- **Wordle** - <http://www.wordle.net/>
- **Tableau** - <http://www.tableausoftware.com/>
- **Power BI** - <https://powerbi.microsoft.com>
- **Google Charts Library** - <https://developers.google.com/chart/>
- **HighCharts** - <http://www.highcharts.com/>
- **D3** - <http://d3js.org/>
- **Observable** - <https://observablehq.com/>
- **Vega and Vega-Lite** - <https://vega.github.io/>
- **Prefuse** - <http://prefuse.org/>
- **Processing** - <http://www.processing.org/>
- **R** - <http://www.r-project.org/>
- **Shiny** - <https://shiny.rstudio.com>

# Visualization Resources -

## Web Sites and Blogs

- **New York Times**
  - Dedicated team producing exceptional work.
  - <https://flowingdata.com/tag/new-york-times/>
- **Eagereyes**
  - Vis Researcher with criticism as well as overview from assorted research conferences
  - <https://eagereyes.org/>
- **Gapminder**
  - Hans Rosling's stat software & data.
  - <https://www.gapminder.org/>
- **Visual Business Intelligence**
  - Analytics blog, frequently discussing big data and dashboard design.
  - <https://www.perceptualedge.com/blog/>
- **Tableau Viz of the Day**
  - Daily example of a visualization created with Tableau software.
  - [https://public.tableau.com/s/gallery?qt-overview\\_gallery=1](https://public.tableau.com/s/gallery?qt-overview_gallery=1)

# Visualization Resources

## Websites and Blogs cont'd

- David McCandless - <http://www.informationisbeautiful.net/>
- Nathan Yau - <http://flowingdata.com>
- Manuel Lima - <http://www.visualcomplexity.com/vc/>
- Alark Joshi - <http://visualizeit.wordpress.com>
- Craig Anslow - <http://softvis.wordpress.com>
- Information Visualization Conference - <http://ieeevis.org>
- Information Visualization Journal - <http://ivi.sagepub.com>

# Readings

- A Tour through the Visualization Zoo. Jeffrey Heer, Michael Bostock, Vadim Ogievetsky  
*Communications of the ACM*, 53(6), pp. 59-67, 2010
- The eyes have it: a task by data type taxonomy for information visualizations. Ben Shneiderman.  
International Conference on Visual Languages 1996.
- Considering Visual Variables as a Basis for Information Visualisation. Sheelagh Carpendale. Research report 2001-693-16, Department of Computer science, University of Calgary, Calgary, AB, Canada, 2003.

# Assignment 2

- Essay
- Review one paper
- Topics:
  - Information Visualization
  - Gestural Interfaces
  - AR/VR
- Length: 3 pages
- Due: **2359 Friday 17 May**

[https://ecs.wgtn.ac.nz/Courses/SWEN422\\_2024T1/Assignment2](https://ecs.wgtn.ac.nz/Courses/SWEN422_2024T1/Assignment2)

# Summary - How Do We Visualize?

- **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 to use visual variables & encode data**
  - Requires awareness of:
    - Human perceptual system
    - Display capacity
    - Characteristics of data (size, type)
    - Task

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**Dr. Craig Anslow**

School of Engineering and Computer Science  
Victoria University of Wellington  
[craig.anslow@ecs.vuw.ac.nz](mailto:craig.anslow@ecs.vuw.ac.nz)