

Information Visualization

Making Data Understandable

Petra Isenberg
petra.isenberg@inria.fr

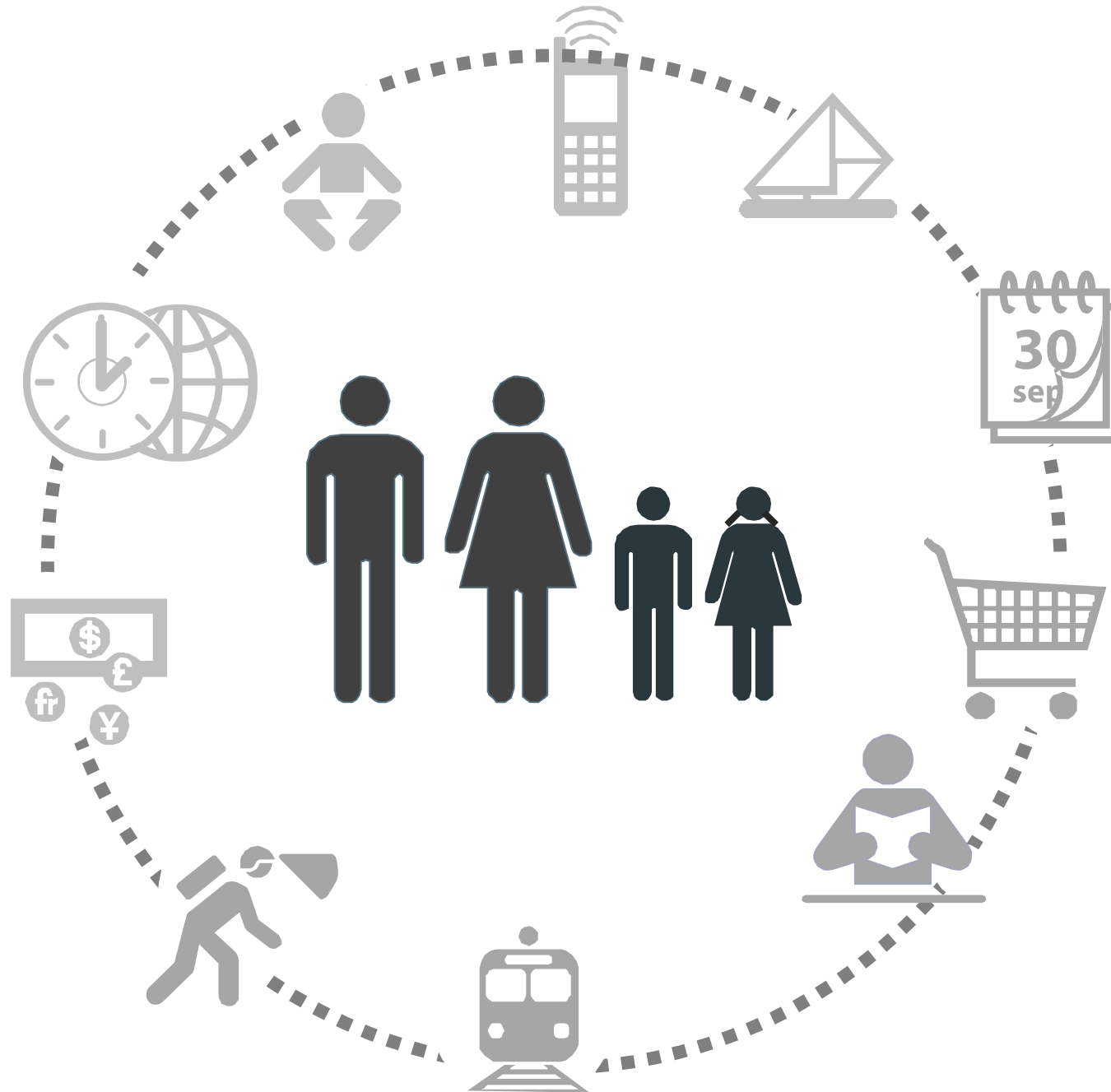


After today you will...

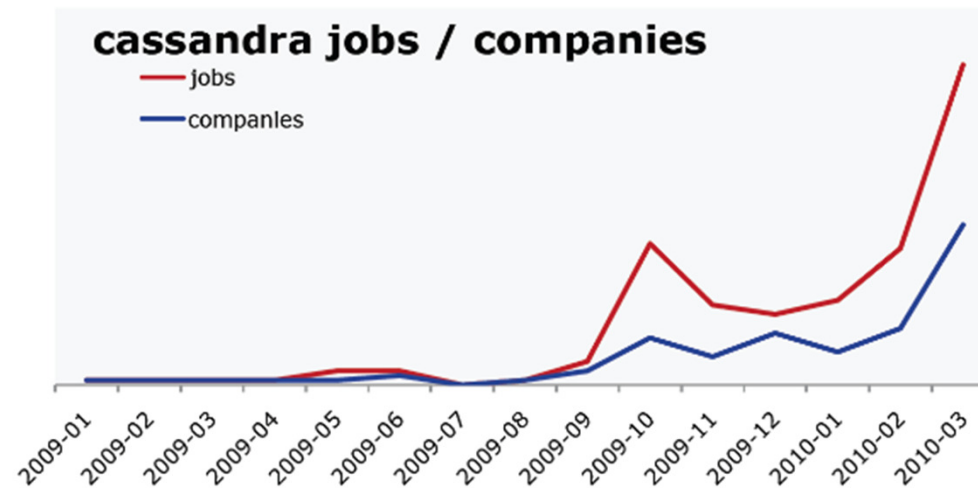
- have gained an overview of the research area
- learned principles of data representation and interaction
- learned about existing applications, tools, and techniques
- develop an understanding of and ability to critique information visualizations



It is estimated that 800 exabyte (**800×10^{19}**)
of **digital information** will be generated this year



Hiring trends for data science



It's not easy to get a handle on jobs in data science. However, data from [O'Reilly Research](#) shows a steady year-over-year increase in Hadoop and Cassandra job listings, which are good proxies for the "data science" market as a whole. This graph shows the increase in Cassandra jobs, and the companies listing Cassandra positions, over time.

"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."

Hal Varian, chief economist at Google

Question

how can we effectively access data?

- understand its structure?
- make comparisons?
- make decisions?
- gain new knowledge?
- convince others?
- ...

Today...



Information Visualization

Example

I		II		III		IV	
x	y	x	y	x	y	x	y
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89

Raw Data from Anscombe's Quartet

[Source: Anscombe's quartet, Wikipedia]

Statistical Analysis

For all four columns, the statistics are identical

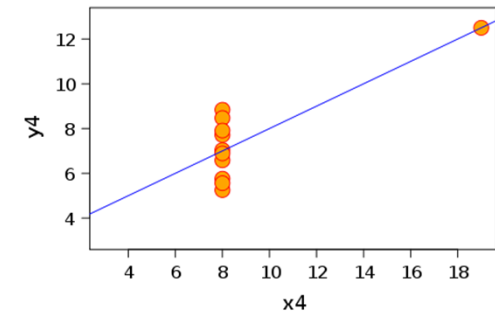
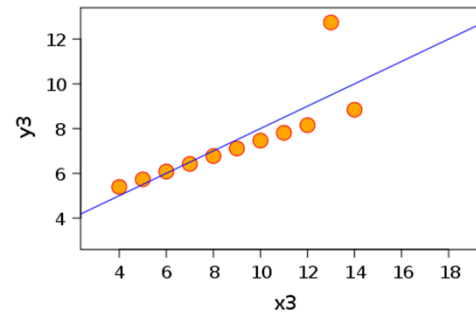
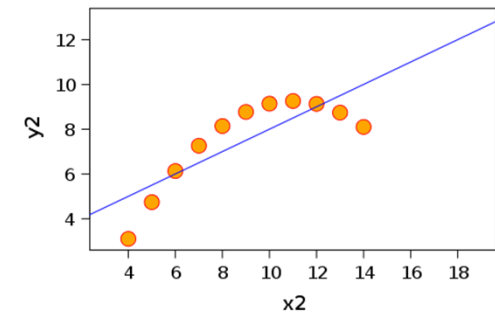
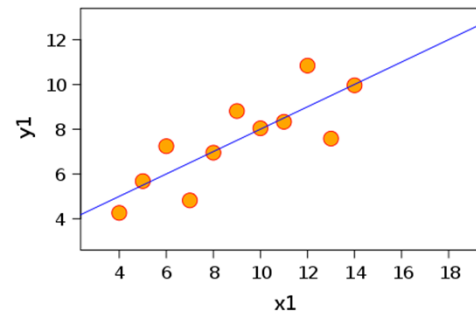
I		II		III		IV	
x	y	x	y	x	y	x	y
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89

Mean of x	9.0
Variance of x	11.0
Mean of y	7.5
Variance of y	4.12
Correlation between x and y	0.816
Linear regression line	$y = 3 + 0.5x$

Visual Representation of the Data

Visual representation reveals a different story

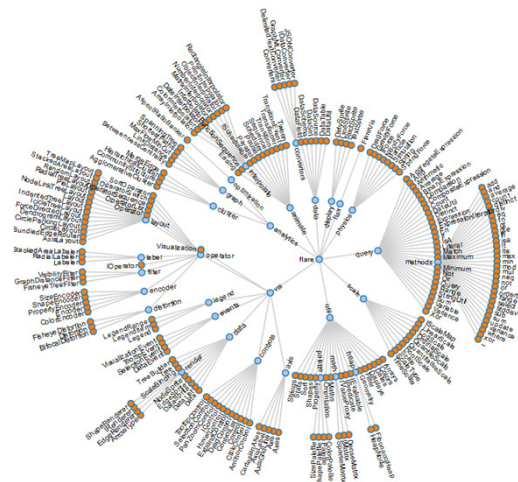
I		II		III		IV	
x	y	x	y	x	y	x	y
10.0	8.04	10.0	9.14	10.0	7.46	8.0	6.58
8.0	6.95	8.0	8.14	8.0	6.77	8.0	5.76
13.0	7.58	13.0	8.74	13.0	12.74	8.0	7.71
9.0	8.81	9.0	8.77	9.0	7.11	8.0	8.84
11.0	8.33	11.0	9.26	11.0	7.81	8.0	8.47
14.0	9.96	14.0	8.10	14.0	8.84	8.0	7.04
6.0	7.24	6.0	6.13	6.0	6.08	8.0	5.25
4.0	4.26	4.0	3.10	4.0	5.39	19.0	12.50
12.0	10.84	12.0	9.13	12.0	8.15	8.0	5.56
7.0	4.82	7.0	7.26	7.0	6.42	8.0	7.91
5.0	5.68	5.0	4.74	5.0	5.73	8.0	6.89



Why visual data representations?

- Vision is our most dominant sense
- We are very good at recognizing visual patterns
- We need to see and understand in order to explain, reason, and make decisions

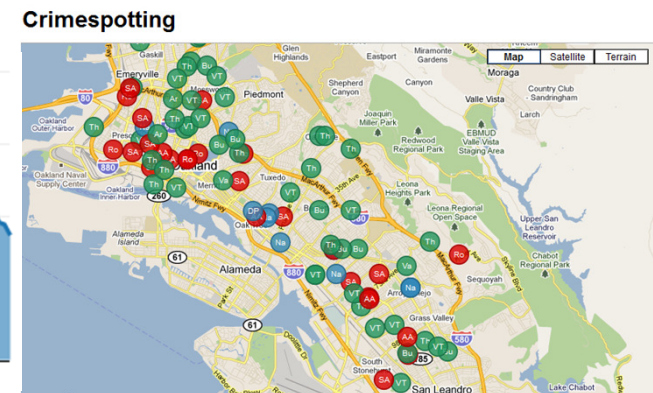
common examples:



graphs / hierarchies



charts



maps

all examples from: <http://vis.stanford.edu/protovis/>

Other benefits of visualization

- expand human working memory
 - offload cognitive resources to the visual system,
- reduce search
 - by representing a large amount of data in a small space,
- enhance the recognition of patterns
 - by making them visually explicit
- aid monitoring of a large number of potential events
- provides a manipulable medium & allows exploration of a space of parameter values.

百聞不如一見

"One hundred rumors are not comparable to one look."

An Old Chinese Inscription

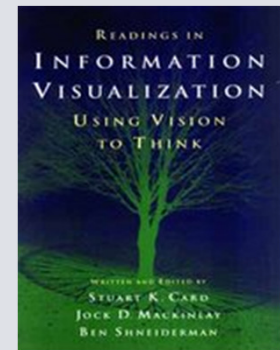
Information visualization

- Create visual representation
- Concentrates on abstract data
- Includes interaction

Official Definition:

The use of computer-supported, interactive, visual representations of abstract data to amplify cognition.

[Card et al., 1999]



Functions of Visualizations

- Recording information
 - Tables, blueprints, satellite images
- Processing information
 - needs feedback and interaction
- Presenting information
 - share, collaborate, revise
 - for oneself, for one's peers and to teach
- Seeing the unseen

Information Visualization Research Field

- ~25 years old
- came out of scientific visualization, computer graphics, HCI
- major conferences



IEEE VisWeek (3 main conferences: Vis, InfoVis, VAST)



EG EuroVis (both SciVis and InfoVis)

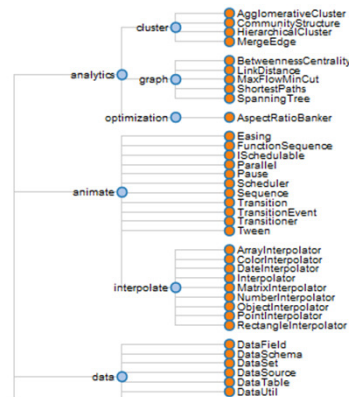
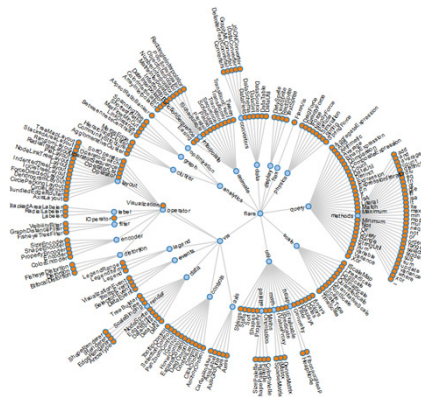


ACM CHI (general HCI)

Information vs. Scientific Visualization

InfoVis

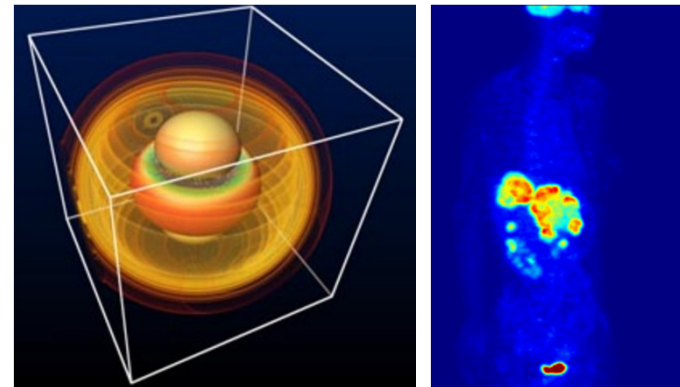
- focus on abstract data
- position of data in space can be chosen freely
- typical techniques:
 - (we will see later)



different spatial graph layouts of abstract data

SciVis

- focus on scientific data
- position of data in space is typically fixed
- typical techniques
 - flow visualization
 - volume visualization (CT, MRT)



spatial representation of gravity waves & a PET scan

there exists a gray region between both fields (e.g. maps)

Visual Analytics

- Related to both information visualization and scientific visualization
- Focus on whole data analysis process



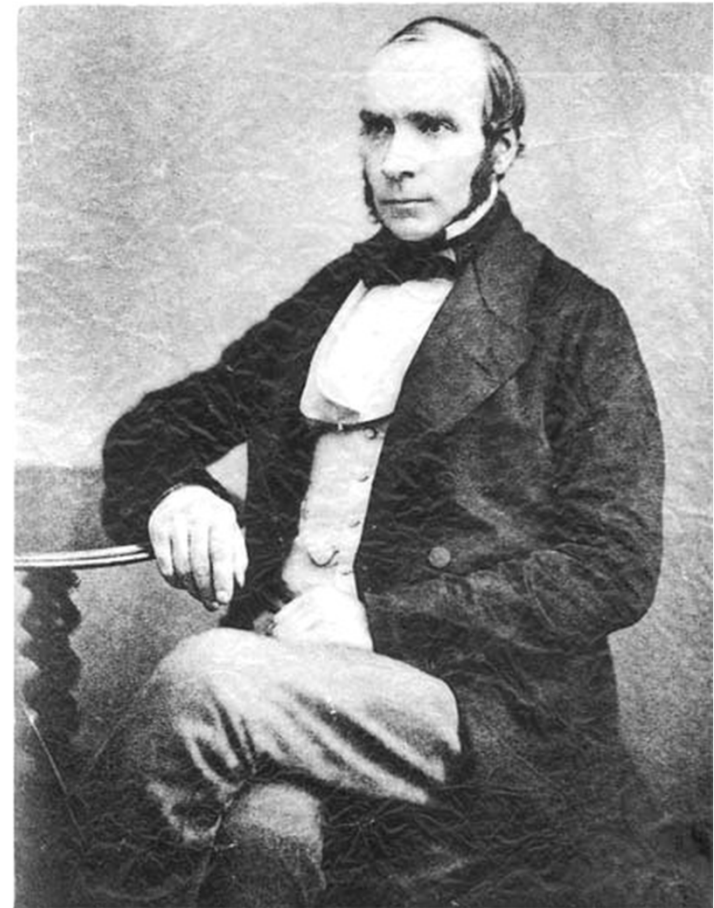
More information: Illuminating the Path

Visualization of abstract data has been practiced for hundreds of years...

HISTORICAL EXAMPLES

The Broadway Street Pump

- In 1854 cholera broke out in London
 - 127 people near Broad Street died within 3 days
 - 616 people died within 30 days
- People thought it spread by “miasma in the atmosphere”
- Dr. John Snow was the first to link contaminated water to the outbreak of cholera
- How did he do it?
 - he talked to local residents
 - identified a water pump as a likely source
 - used maps to illustrate his theory
 - convinced authorities to disable the pump



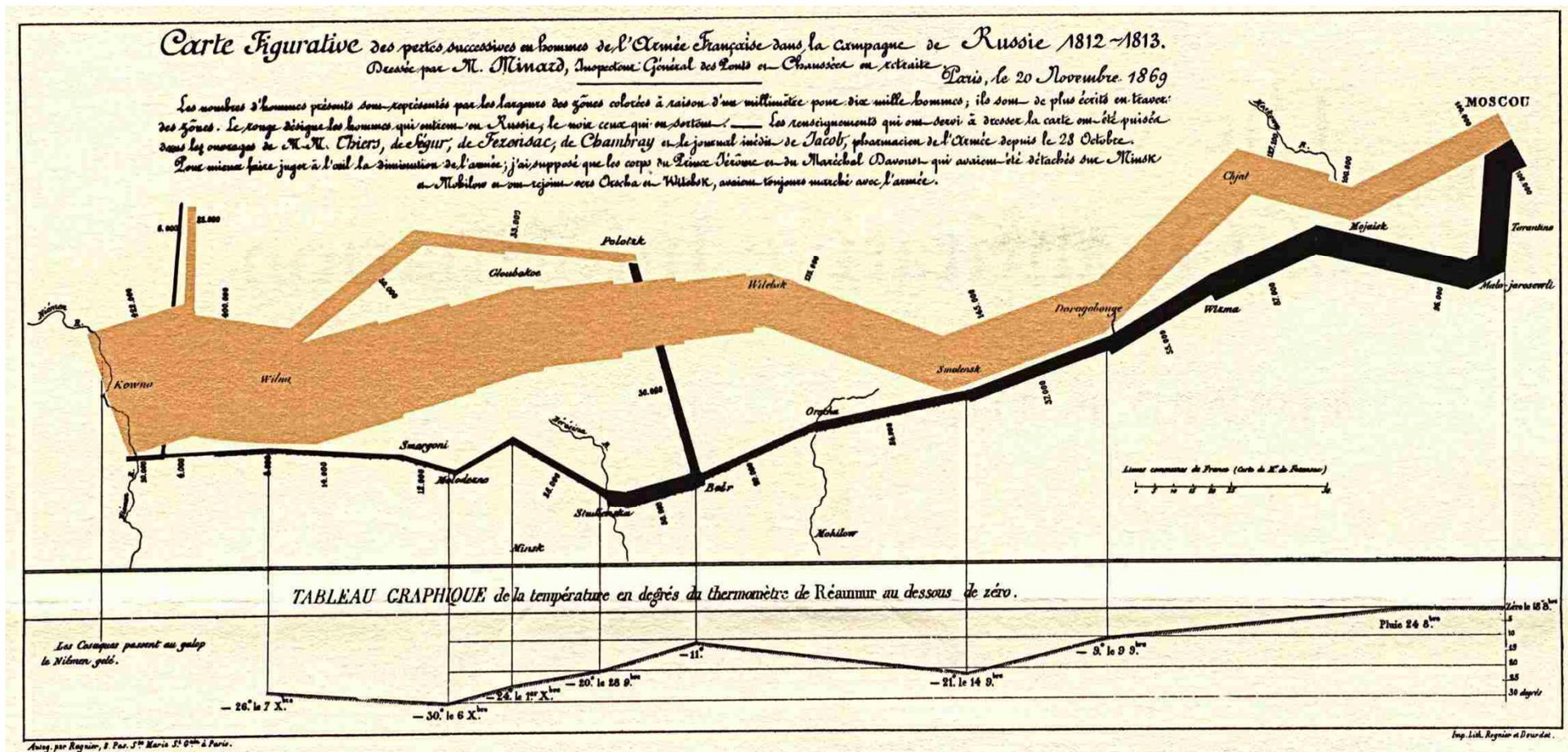


Napoleon's March on Moscow

Charles Minard, 1869

Named the best statistical graphic ever drawn (by Edward Tufte)

- Includes: spatial layout linked with stats on: army size, temperature, time
- Tells a story in one overview



More info: The Visual Display of Quantitative Information (Tufte)

CARTE FIGURATIVE des pertes successives en hommes de l'Armée Française dans la campagne de Russie 1812-1813.

Dressée par M. Minard, Inspecteur Général des Ponts et Chaussées en retraite.

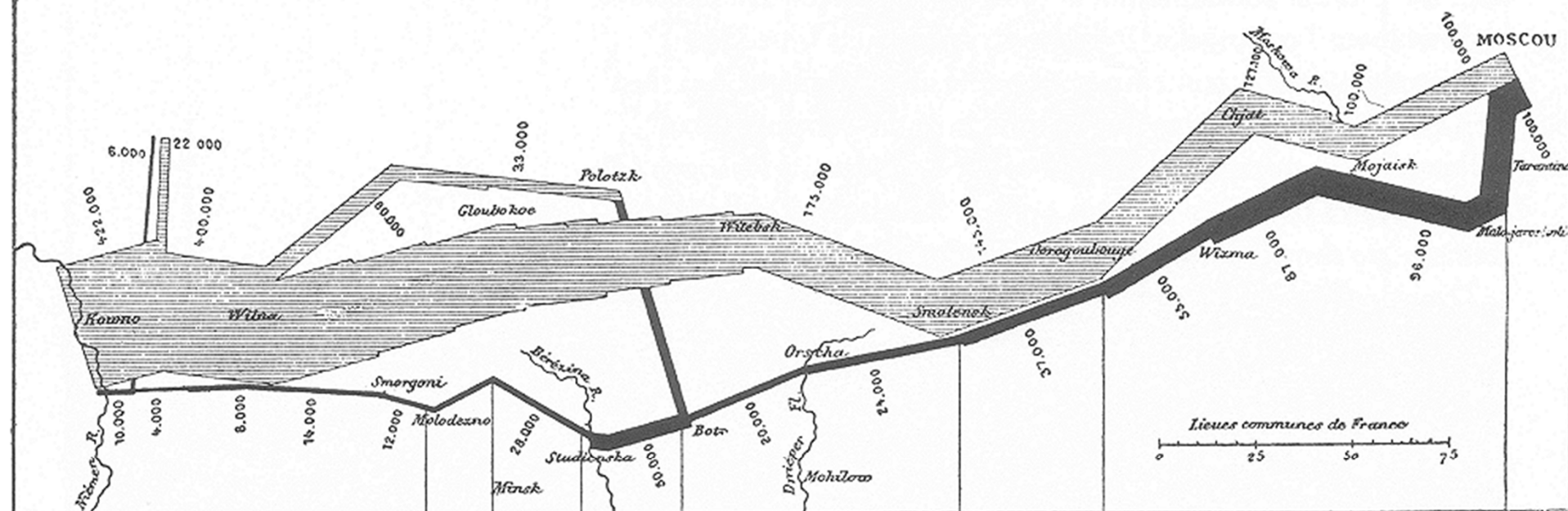
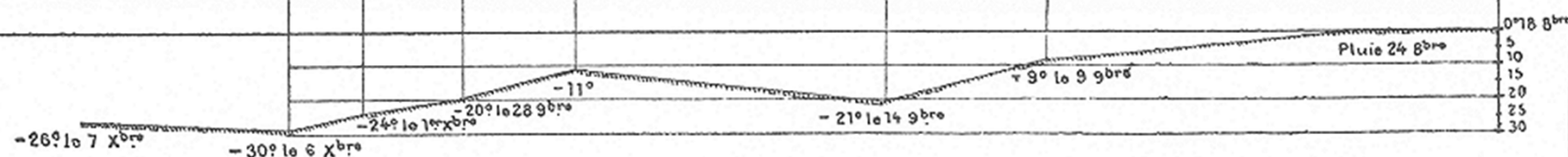
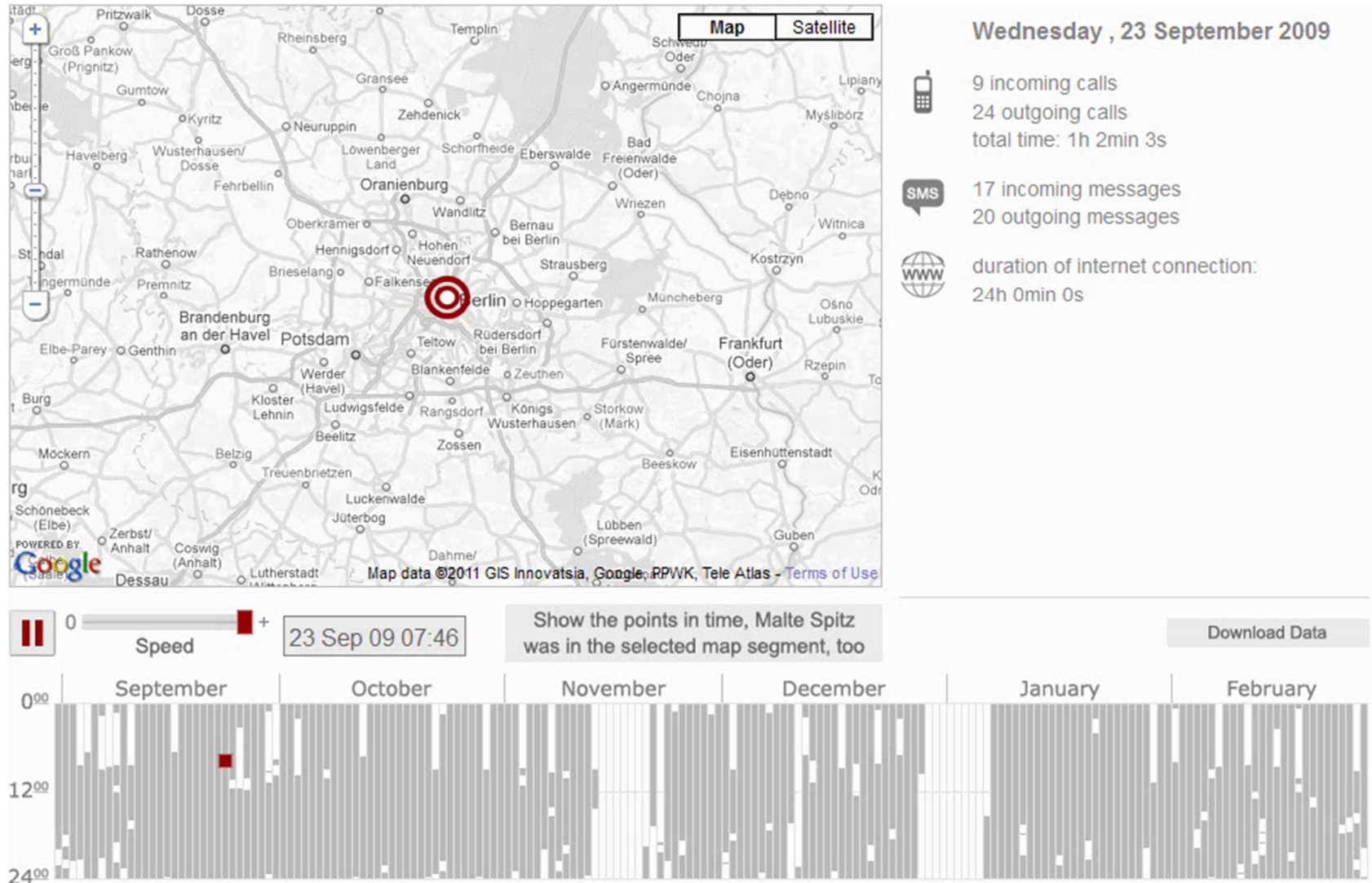


TABLEAU GRAPHIQUE de la température en degrés du thermomètre de Réaumur au dessous de zéro



... AND VERY RECENTLY

Mobile Phones...



<http://www.zeit.de/datenschutz/malte-spitz-data-retention>



UPDATE: Apple has released update [4.3.3](#) that will delete this data. [Register now to preserve your data.](#)

1
Register with
OpenPaths.

2
Get our
desktop
app to

3
Start
visualizing,
using, and

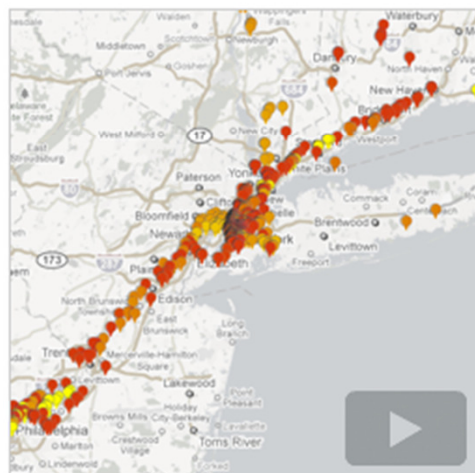
Your device.



On April 20, 2011, researchers announced that they had discovered a file on Apple iOS devices, like the iPhone and iPad, that show where you've been over the past year.

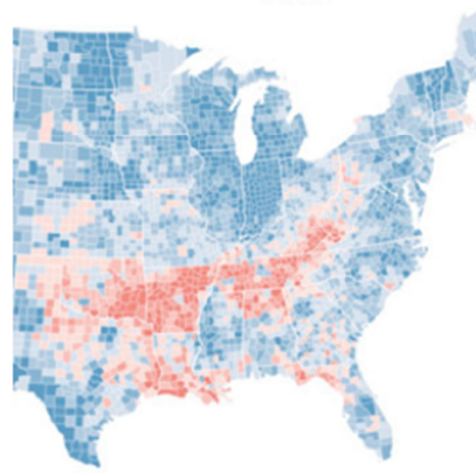
Apple has released an update that will delete this data. [Register now to preserve your data.](#)

Your data.



With OpenPaths, you can preserve your iPhone or iPad's location information as well as visualize where you've been. You can even download your data in CSV and JSON format so you can remix it and use it in your own projects.

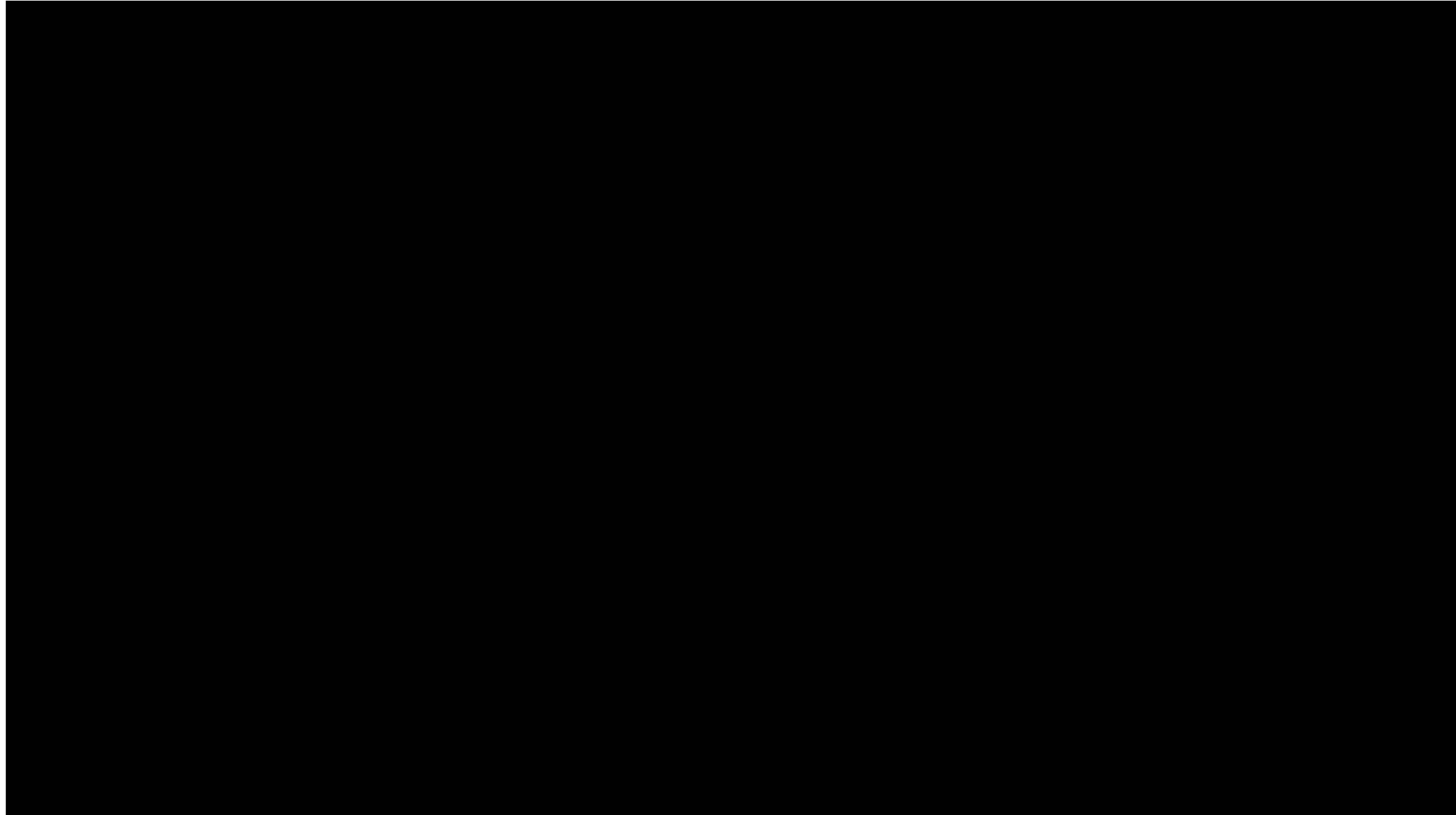
Your decision.



What's more, OpenPaths allows you to securely and anonymously donate your data to researchers who could use it to study mobility, transportation, land use, epidemiology, and overall make the world a better place.

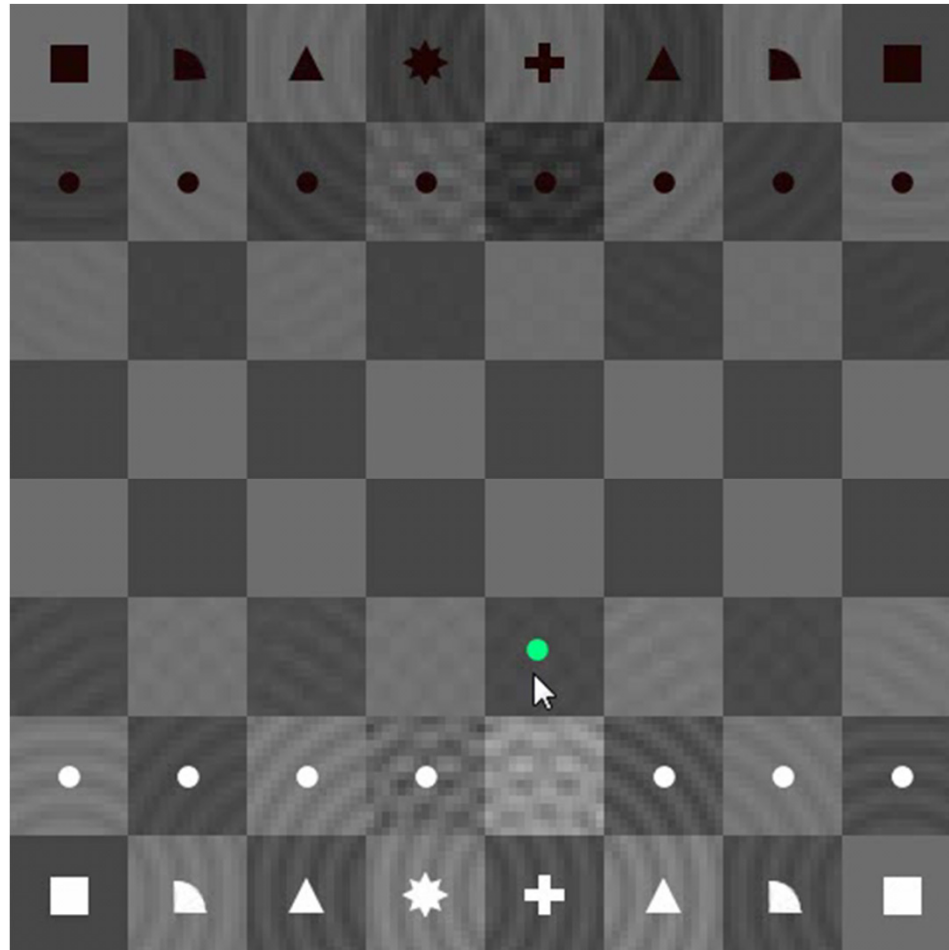
[Learn more >>](#)

TrashTrack



Winner of the NSF International Science & Engineering Visualization Challenge!
<http://senseable.mit.edu/trashtrack/>

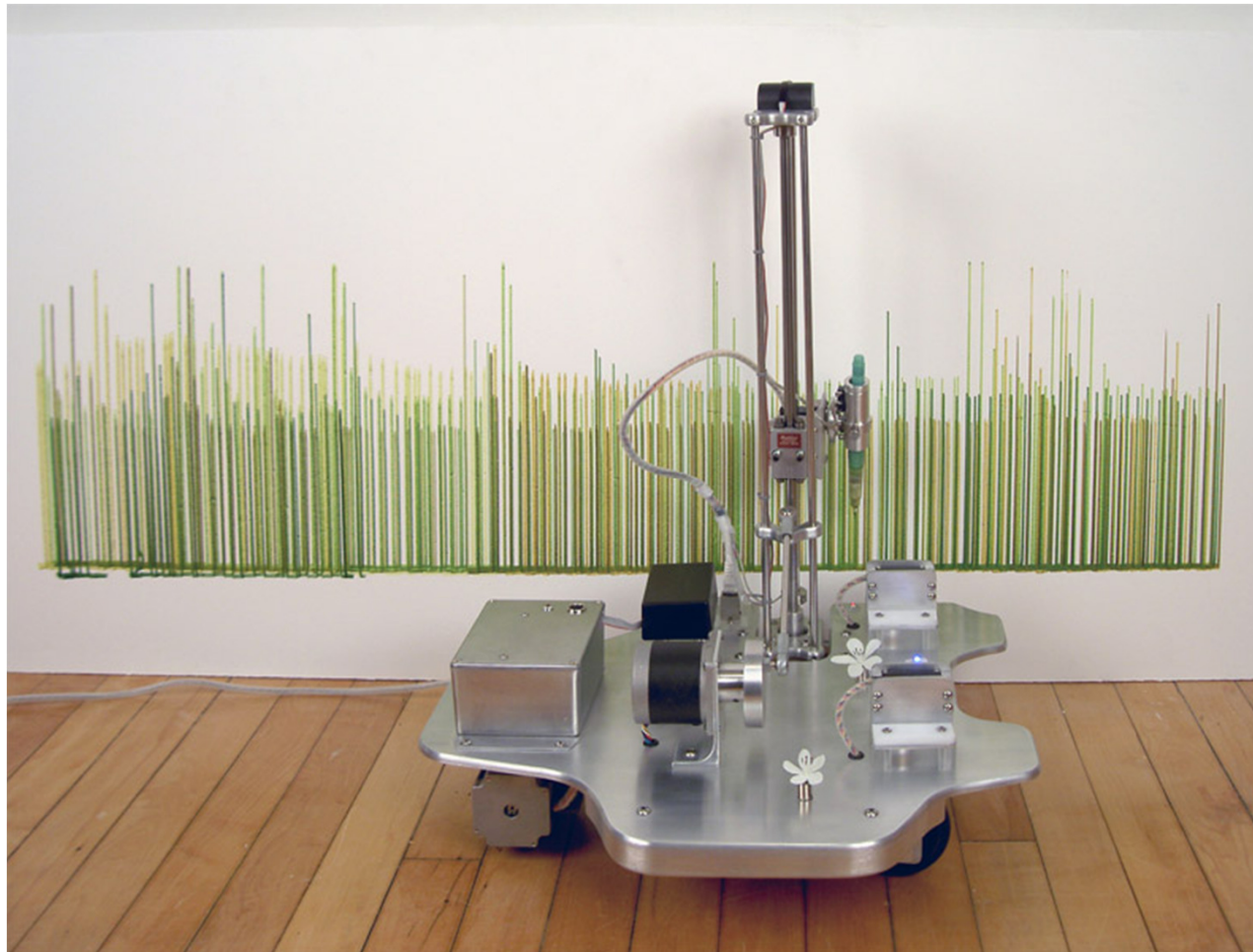
Artificial Intelligence



<http://www.turbulence.org/spotlight/thinking/chess.html>

HRI

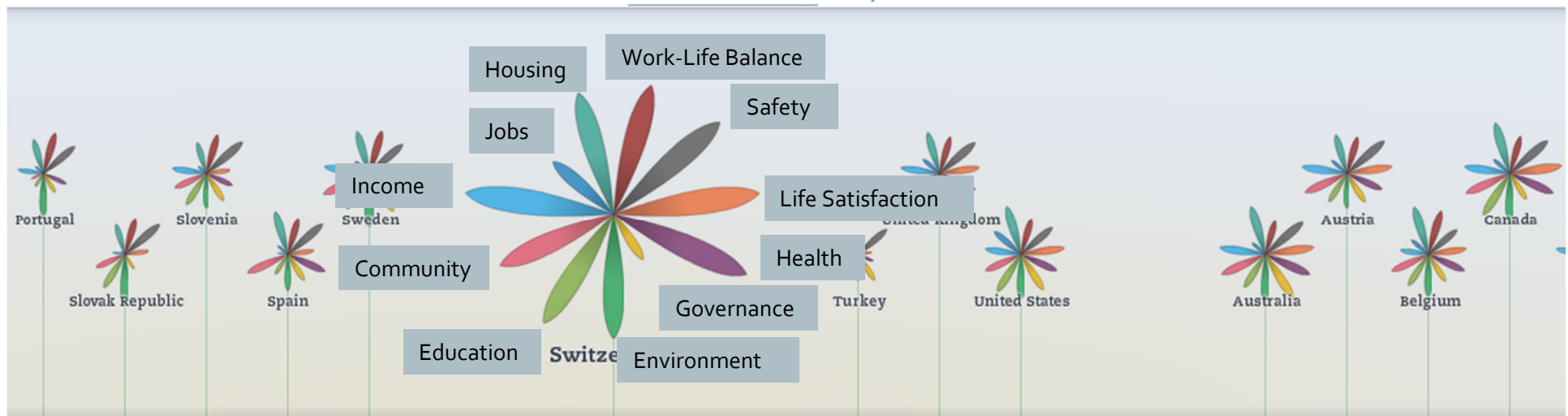
Translator II: Robot visualizing CO₂ emissions



<http://www.youtube.com/watch?v=Q3b9LIAYqAw>

Open Data

- Movement making government data freely available
- Encourage participation by everyone



Many Eyes

- Upload data, create visualizations, discuss
- Distributed asynchronous collaboration

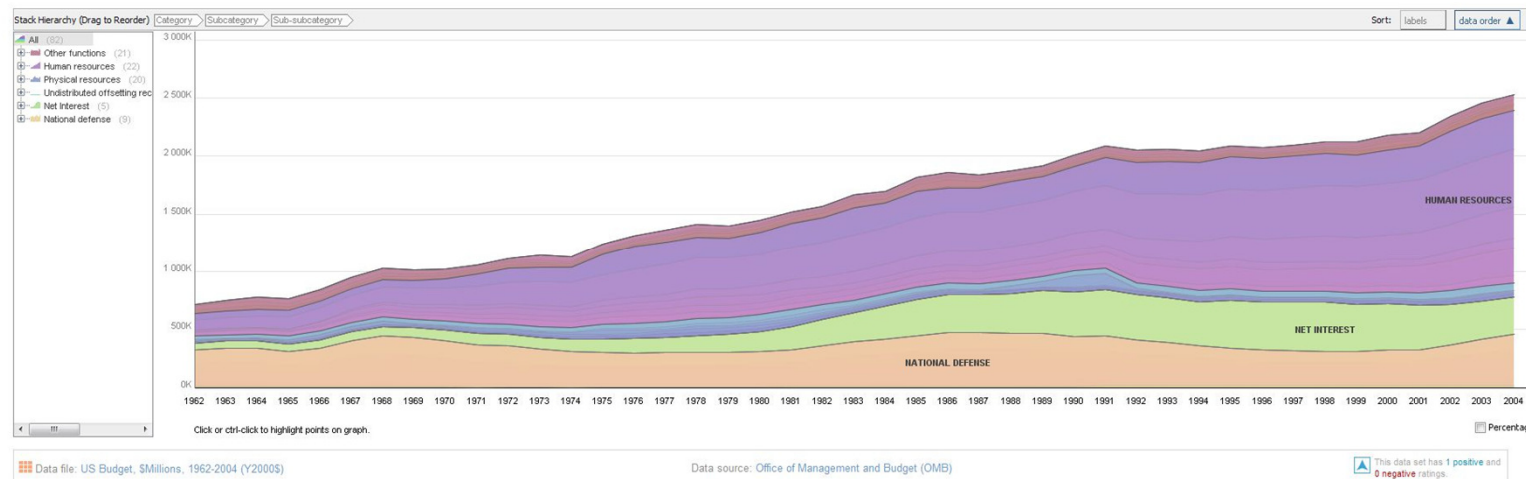
Visualizations : US government expenses 1962-2004

Uploaded by: Frank van Ham

Created at: Jan 10 2007

Description: Where have your tax dollars gone?

Tags: us budget gov



Comments (46)

Currently showing

Frank van Ham says:
Where have your tax dollars gone?
Posted Jan 10 2007
See view for this comment

Anonymous says:
What is this spike in housing assistance?
Posted Jan 10 2007
See view for this comment

Anonymous says:
Huge variability... is this politics-driven or weather-driven?
Posted Jan 10 2007
See view for this comment

★ This visualization was featured Saturday June 23 2007, 01:25 PM

▲ This visualization has 31 positive and 1 negative ratings.

Part of these topic centers
Tom Erickson's topic hub
Examples

Being watched by
luckianart
Luis Miguel
Irene
ruoyang
MBA-Bright
fre
LogosSeeker
jmgul
anandesh
ohumors
irenegriff
Steve_McD
Innor
Bschwendmann
Public Agenda
Casbel
konstantinos
ntsesi

Learn more
About Stack Graph for Categories

<http://www-958.ibm.com/software/data/cognos/manyeyes/>

Specific Visualization Environments



Molecular visualisation in the Reality Cube
University of Groningen, NL



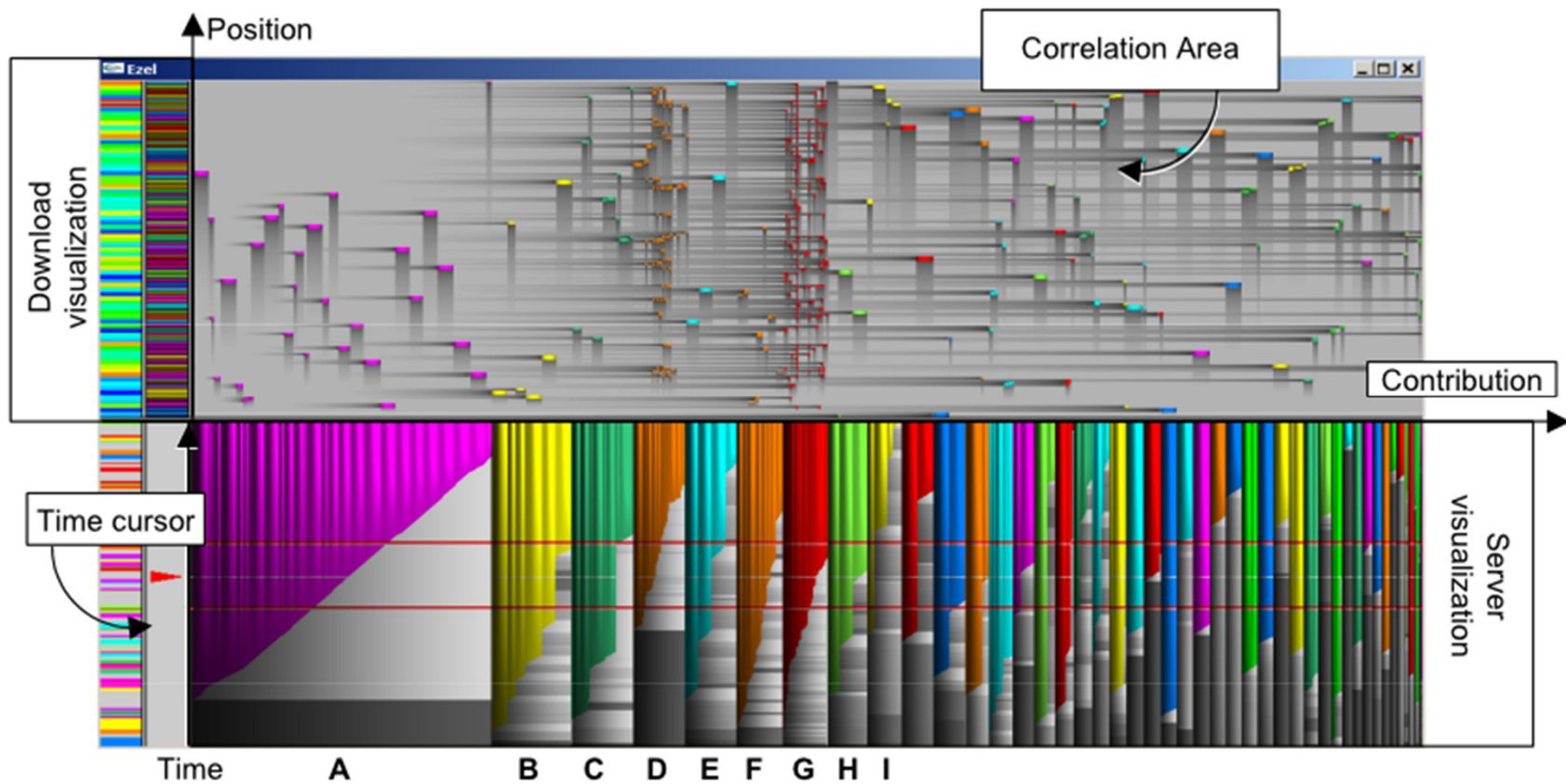
Tabletops for Visualization
University of Calgary



Wall, INRIA

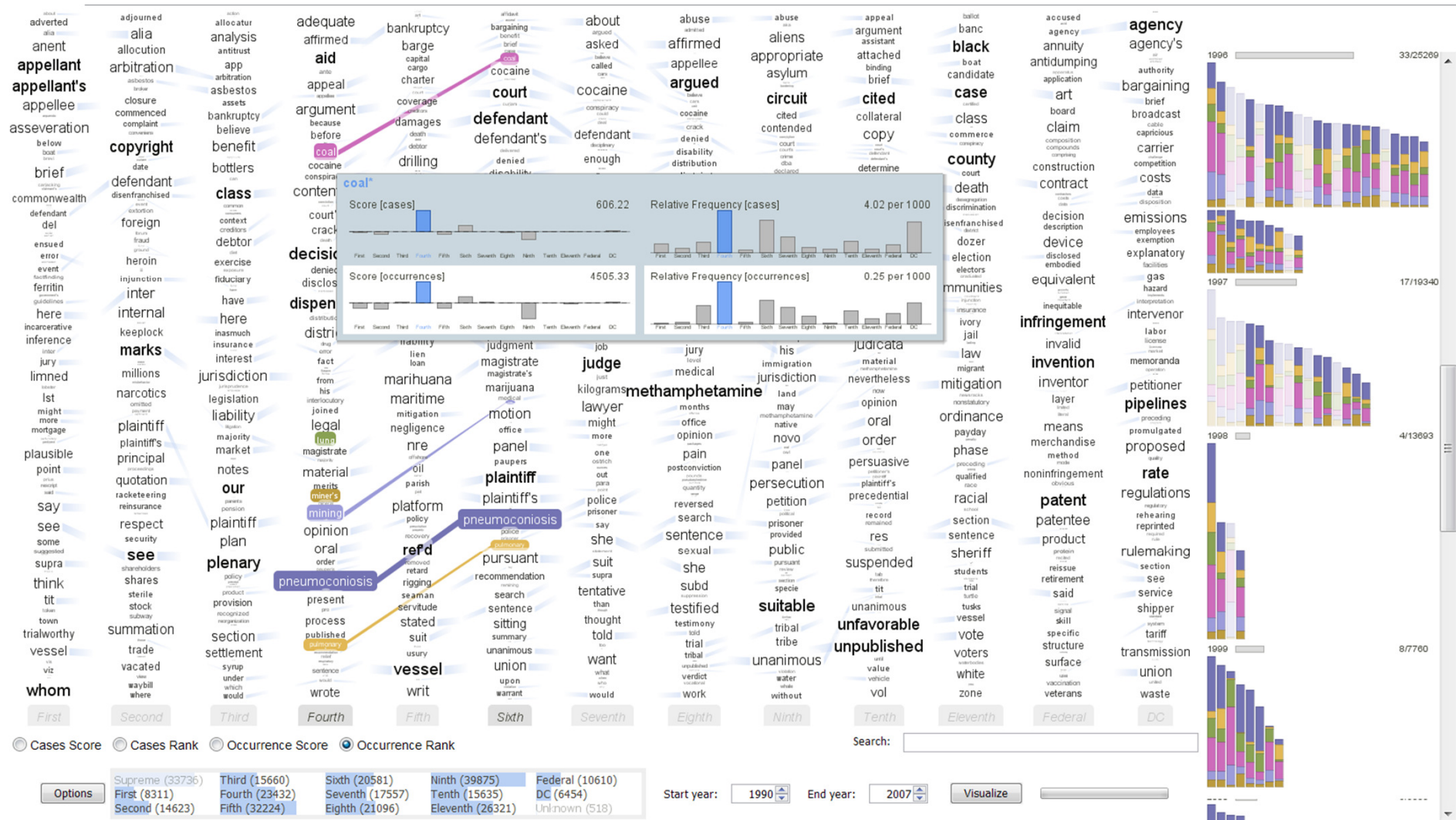
Software Visualization

EZEL: a Visual Tool for Performance Assessment of Peer-to-Peer File-Sharing Networks (Voinea et al., InfoVis, 2004)

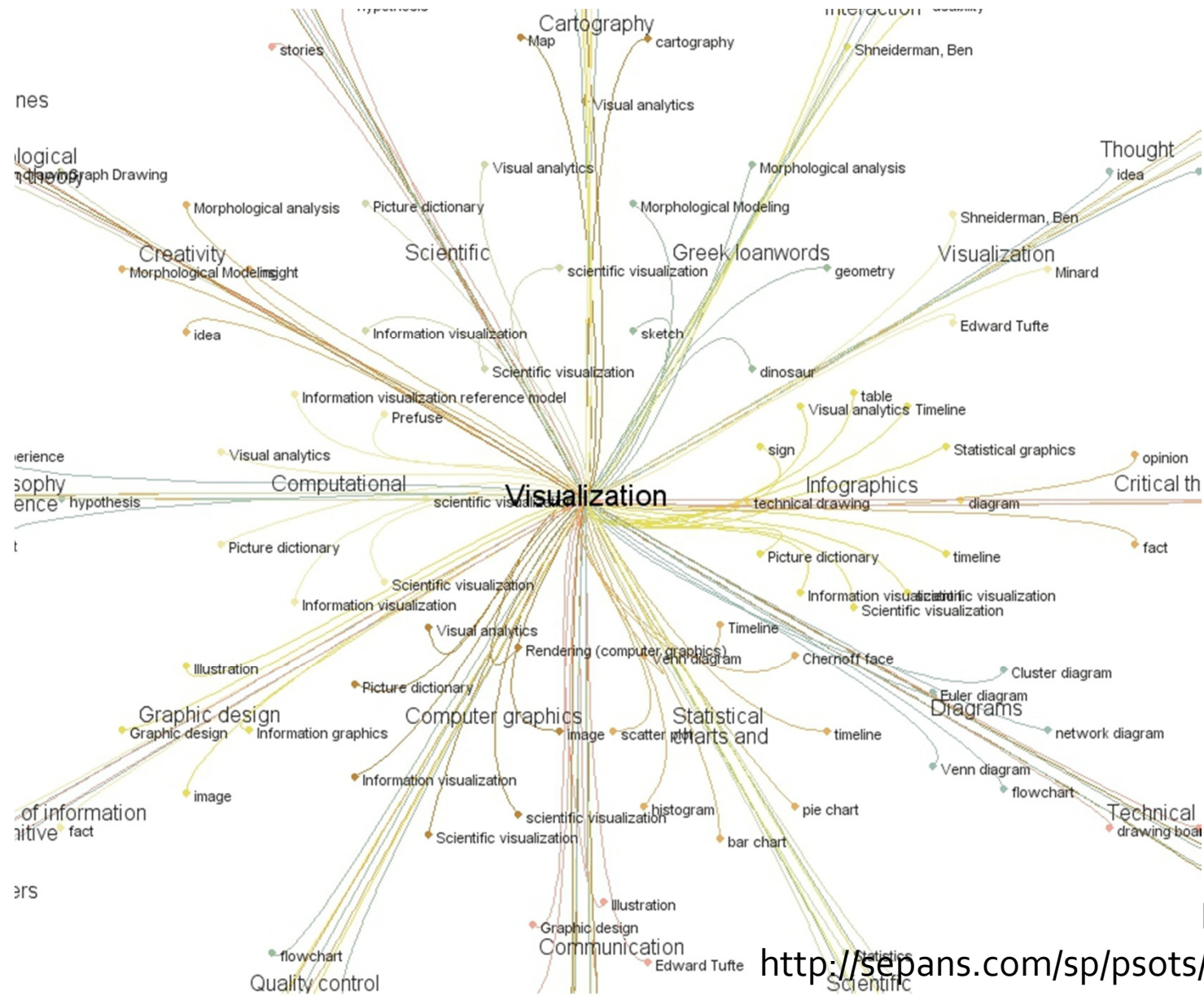


Text Visualization

Parallel Tag Clouds to Explore Faceted Text Corpora (Collins et al., VAST 2009)



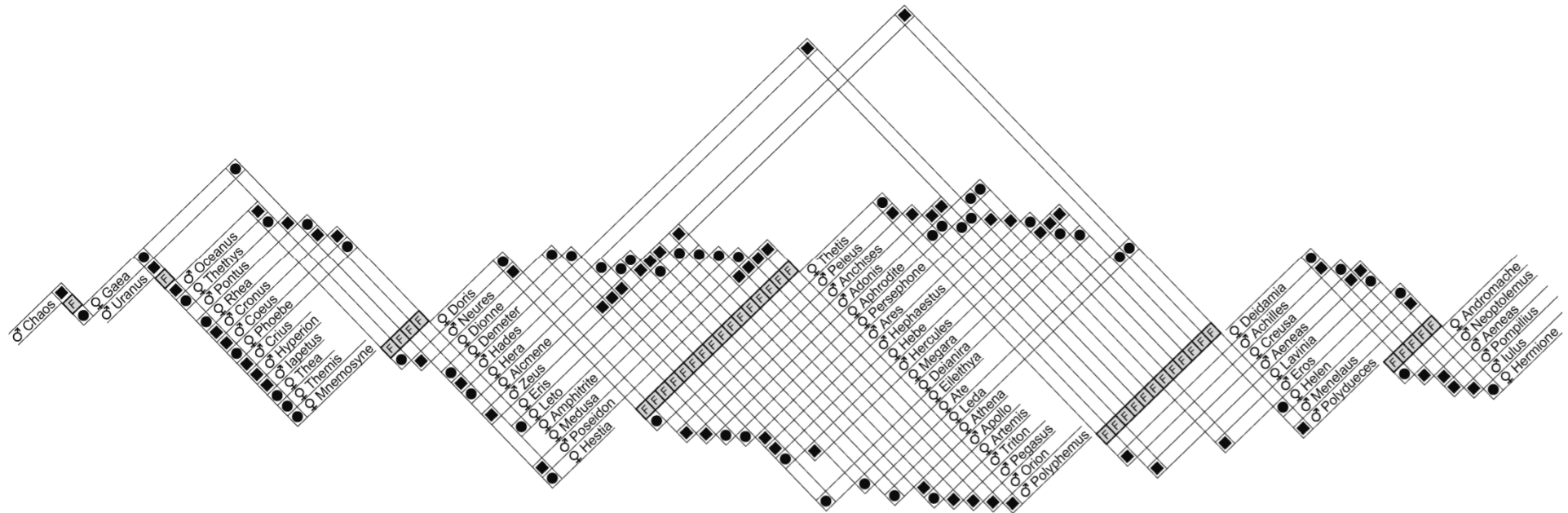
Graphs



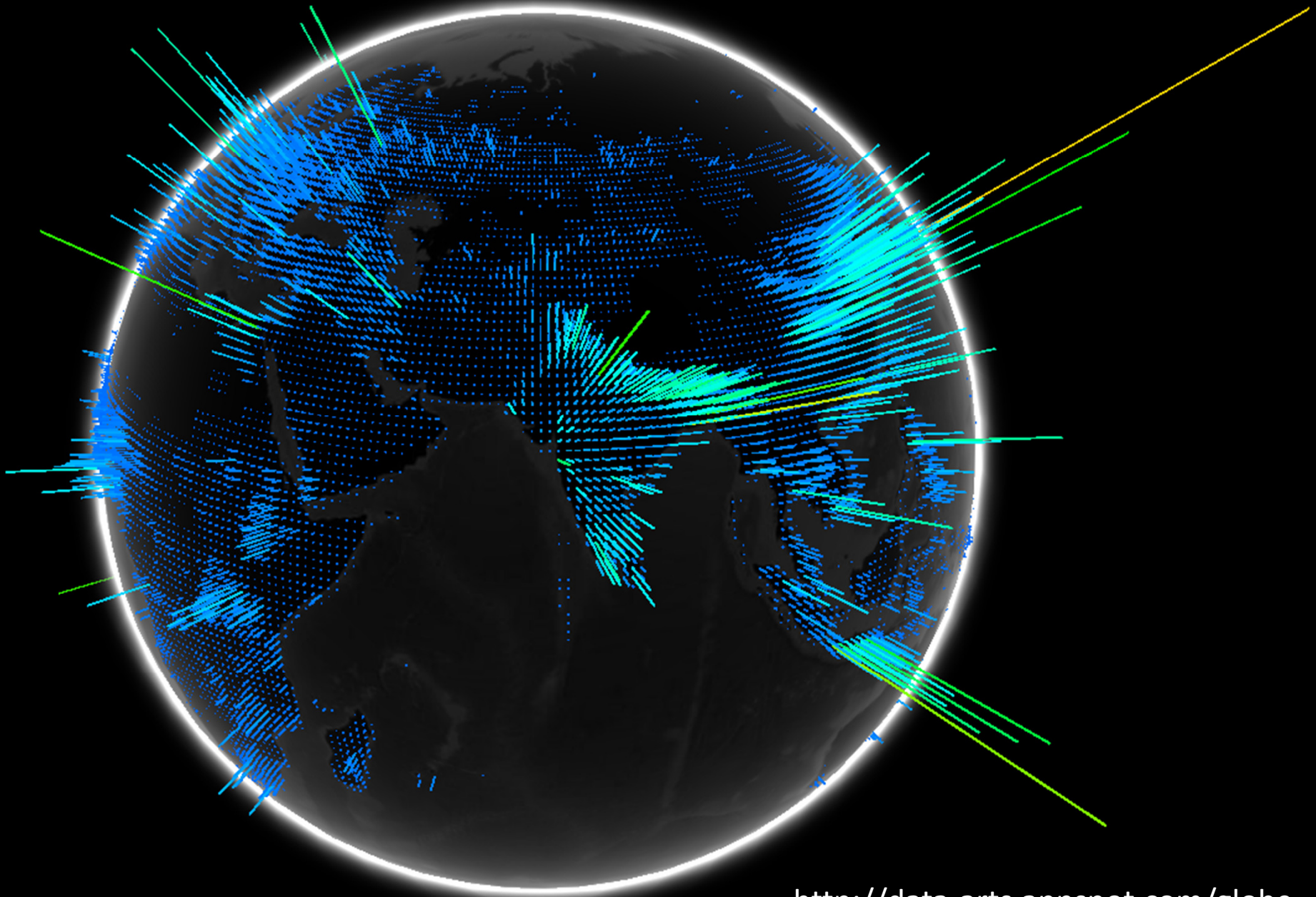
Here Wikipedia

http://sepan.s.com/sp/psots/wiki_category/

Family Trees



Geographic Visualization



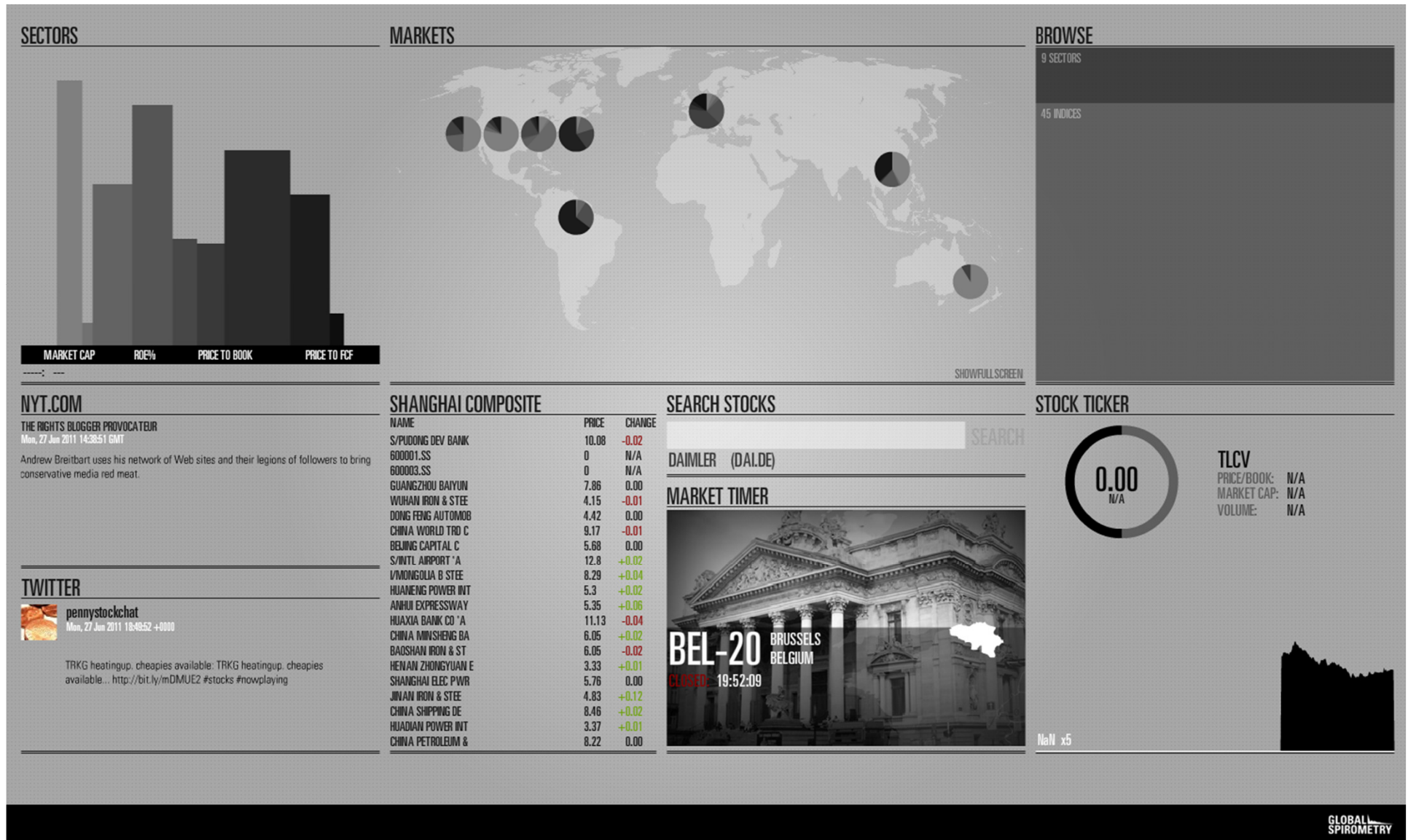
<http://data-arts.appspot.com/globe>

Weather



<http://weatherspark.com/>

Data Dashboards



Resources for more examples

- Visualization conferences
- Blogs
 - <http://infosthetics.com/>
 - <http://felloinlovewithdata.com/>
 - <http://eagereyes.org/>
 - <http://flowingdata.com/>
 - <http://www.informationisbeautiful.net/>
- Books
 - Textbooks
 - Readings in Information Visualization: Using Vision to Think (a bit old now but good intro)
 - Information Visualization (Robert Spence – a light intro, I recommend as a start)
 - Information Visualization Perception for Design (Colin Ware, focused on perception and cognition)
 - Interactive Data Visualization: Foundations, Techniques, and Applications (Ward et al. – most recent)
 - Examples
 - Beautiful Data (McCandless)
 - Now You See it (Few)
 - Tufte Books: Visual Display of Quantitative Information (and others)
 - ... (many more, ask me for details)

It is difficult to create

CREATE VISUALIZATIONS

GOOD ↑



AND ALL WERE IN THE WRONG!



Good Presentation Should Be Susceptible to Only One Interpretation

It was six men of Indostan
To learning much inclined,
Who went to see the Elephant
(Though all of them were blind.)
That each by observation
Might satisfy his mind.

—
The First (side) "Is very like a wall!"
—

The Second (tusk) "Is very like a spear!"
—

The Third (trunk) "Is very like a snake!"
—

The Fourth (knee) "Is very like a tree!"
—

The Fifth (ear) "Is mighty like a fan!"
—

The Sixth (tail) "Is very like a rope!"
—

And so these men of Indostan
Disputed loud and long,
Each in his own opinion
Exceeding stiff and strong
Though each was partly in the right,
And all were in the wrong!

From John Godfrey Saxe, "The Blind Men and the Elephant", *Clever Stories of Many Nations Rendered in Rhyme*, 1865.

What is a representation?

- A representation is
 - a formal system or mapping by which the information can be specified (D. Marr)
 - a sign system in that it stands for something other than its self.
- for example: the number thirty-four

34

decimal

100010

binary

XXXIV

roman

Presentation

- different representations reveal different aspects of the information

decimal: counting & information about powers of 10,

binary: counting & information about powers of 2,

roman: counting & adding and subtracting

- presentation

how the representation is placed or organized on the screen

34, 34, 34

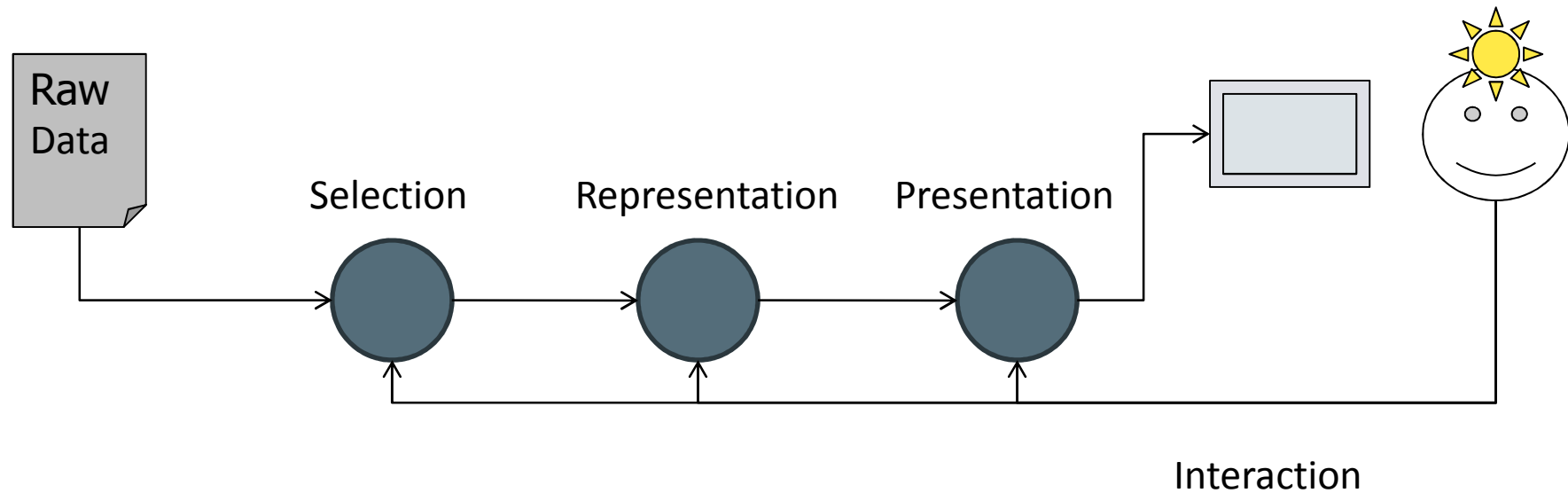
Principles of Graphical Excellence

- Well-designed presentation of interesting data – a matter of *substance, statistics, design*
- Complex ideas communicated with clarity, precision, efficiency
- Gives the viewer the greatest number of ideas in the shortest time with the least ink in the smallest space
- Involves almost always multiple variables
- Tell the truth about the data

Or a bit more simply...

- Solving a problem simply means representing it so as to make the solution transparent ... (Simon, 1981)
- Good representations:
 - allow people to find relevant information
 - information may be present but hard to find
 - allow people to compute desired conclusions
 - computations may be difficult or “for free” depending on representations

How do we arrive at a visualization?

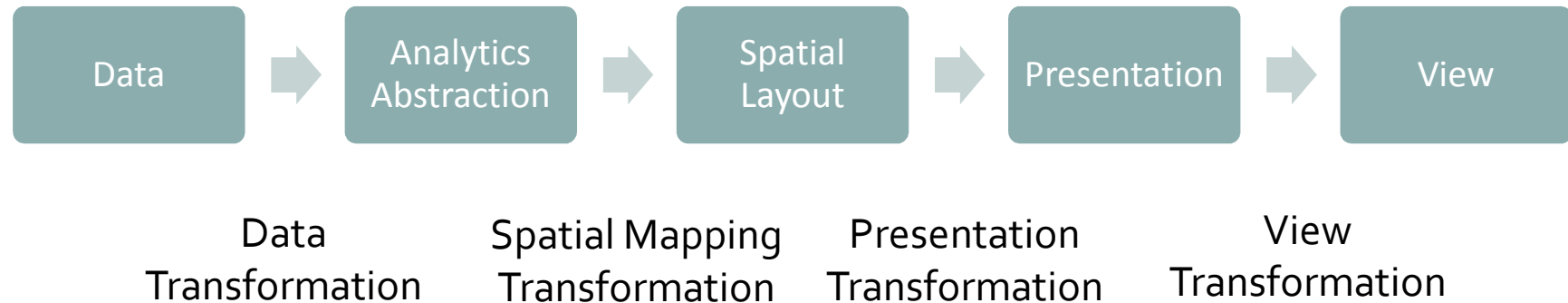


The Visualization Pipeline

From [Spence, 2000]

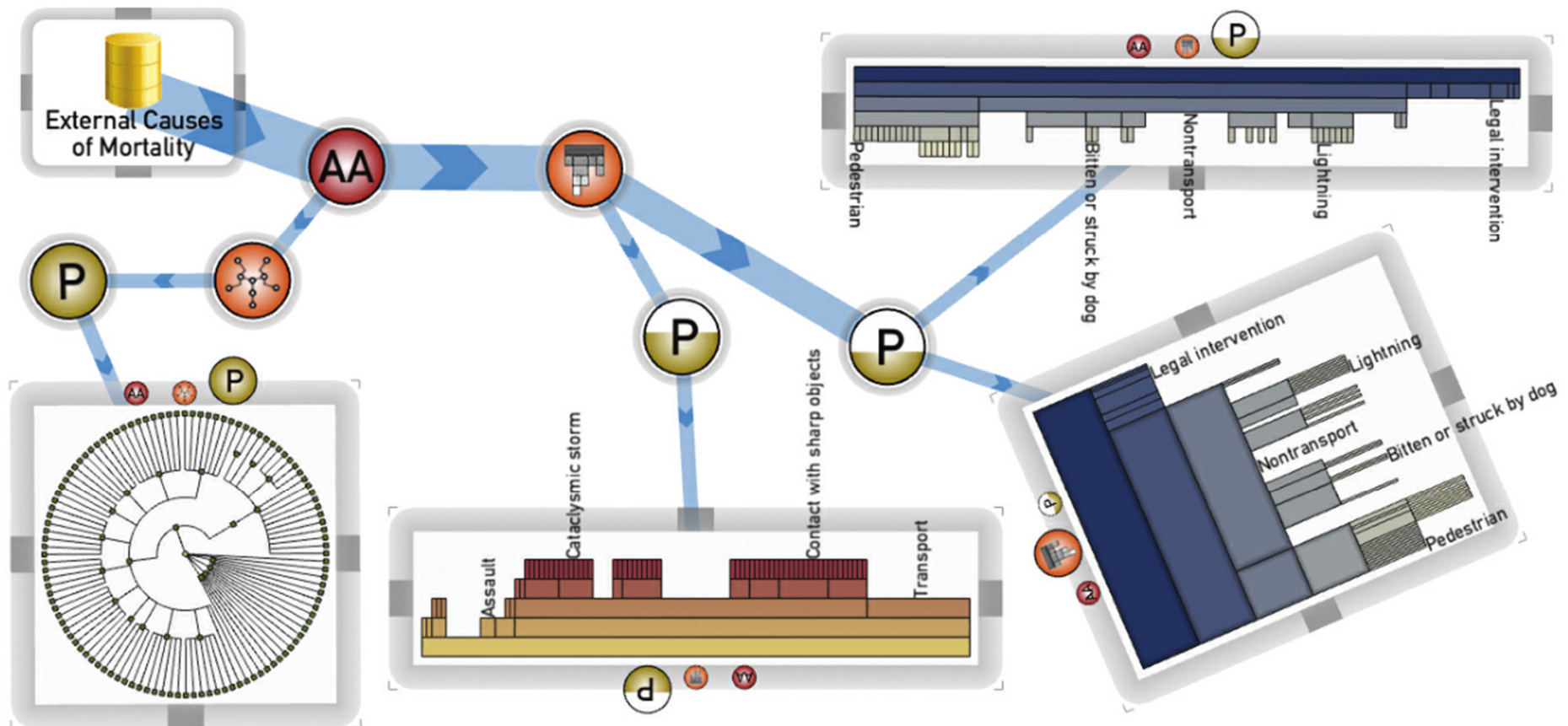
Visualization Reference Model

Also a visualization pipeline a bit expanded



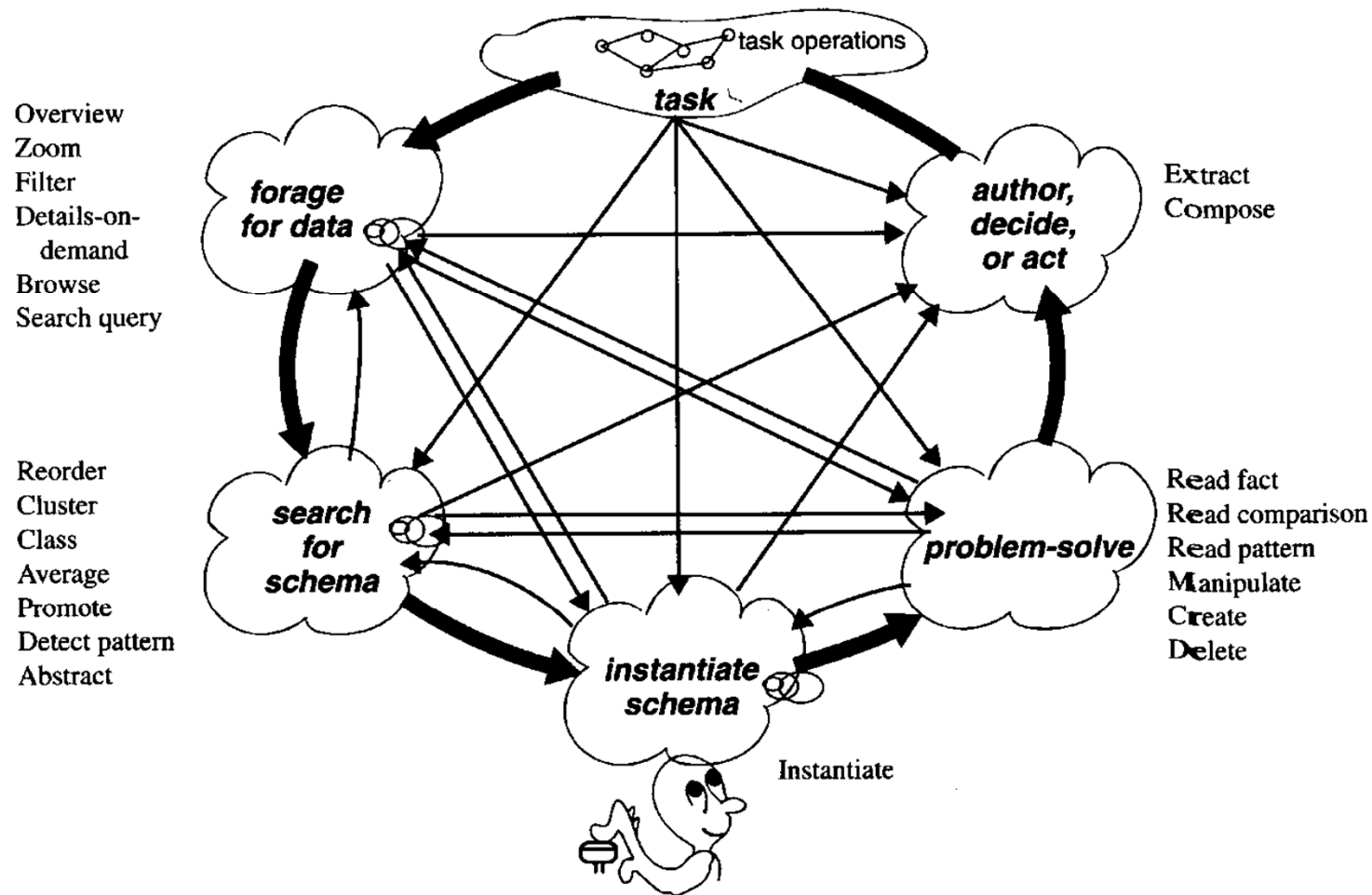
From [Card et al., Readings in Information Visualization]

Visualization pipeline in an image



[Tobiasz et al., 2009]

Knowledge Crystallization Cycle



Working with visualizations in NOT a linear process

[Card et al., 1999]

Ben Fry's "Seven Stages of Visualizing Data"

Visualizing complex data sets often requires insights from diverse fields of knowledge, such as statistics, data mining, graphic design, et cetera. Ben Fry suggests a seven stage design process, reconciling all stages into a single process.

1. Acquire

Obtain the data, whether from an Excel document, an XML feed, et cetera.

2. Parse

Data will not always be organized ideally for visualizing it. Give your data structure by ordering it into categories.

3. Filter

Be careful to prevent information overload, remove all but the data of interest

4. Mine

Apply methods from statistics or data mining as a way to find patterns or meaning in the data.

5. Represent

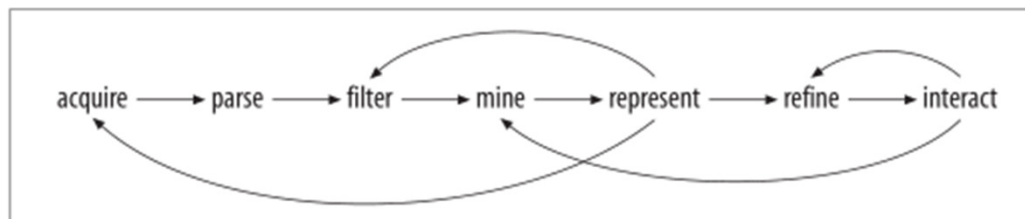
Choose a basic visual model to visual the data. (see Chapter 5)

6. Refine

Improve the basic representation to make it more clear and more visually engaging. (see Chapter 6)

7. Interact

Add methods for manipulating the data. Allows users to control what they see or even possibly how they see it.



Visualization Pitfalls

- **Data Design**
 - Select the right data dimensions
 - **Pitfall:** Display irrelevant data relationships
- **Visual Design**
 - Consider perceptual capabilities
 - **Pitfall:** Difficult to interpret, lead users to misinterpretation
- **Interface Design**
 - Mode of interaction with visual and data appropriate
 - **Pitfall:** Poor interaction negates benefits from data and visual design
- **Understanding Target Users**
 - Visualization design accounts for stakeholder needs and characteristics
 - **Pitfall:** Mistaken assumptions of cultural norms or user abilities leads to misinterpretation

Pitfalls

- Selecting the wrong data
- Selecting the wrong data structure
- Filtering out important data
- Failed understanding of the types of things that need to be shown
- Choosing the wrong representation
- Choosing the wrong presentation format
- Inappropriate interactions provided to explore the data

Exercise

- Think about the cognitive tasks that people would perform with the aid of this data.
- What would a person want to know about this data set?
- Create a visualization of this data that would assist those tasks

	mary	joe	paul	sue	betty	lyn	jack	fred	
mary		0	1	2	1	5	3	5	4
joe			0	1	5	1	4	1	3
paul				0	2	5	2	2	2
sue					0	1	1	1	1
betty						0	2	2	1
lyn							0	2	2
jack								0	1
fred									0

0 self

1 knows

2 likes

3 dislikes

4 loves

5 does not know

Critique

- End first 1.5h

Recap

- So far you
 - learned what information visualization is
 - learned about the advantages of visualization
 - saw a number of examples (historical and new)
 - tried to create your own first visualization from a dataset
- Next
 - you will get to know your data
 - you will learn about the basic components of visualization
 - try another example

Data

- Data is the foundation of any visualization
- The visualization designer needs to understand
 - the data properties
 - know what meta-data is available
 - know what people want from the data

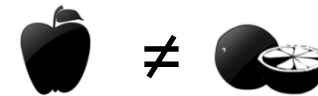
Nominal, Ordinal and Quantitative

- Nominal (labels)
 - Fruits: apples, oranges
- Ordered
 - Quality of meat: grade A, AA, AAA
 - Can be counted and ordered, but not measured
- Quantitative: Interval
 - no clear zero (or arbitrary)
 - e.g. dates, longitude, latitude
 - usually compare differences (intervals)
- Quantitative: Ratio
 - meaningful origin (zero)
 - physical measurements (temperature, mass, length)
 - counts and amounts

Nominal, Ordinal and Quantitative

- Nominal (labels)

- Operations: =, ≠



- Ordered

- Operations: =, ≠, <, >



- Quantitative: Interval

- Operations: =, ≠, <, >, -, +

- Can measure distances or spans

[1989 – 1999] + [2002 – 2012]

- Quantitative: Ratio

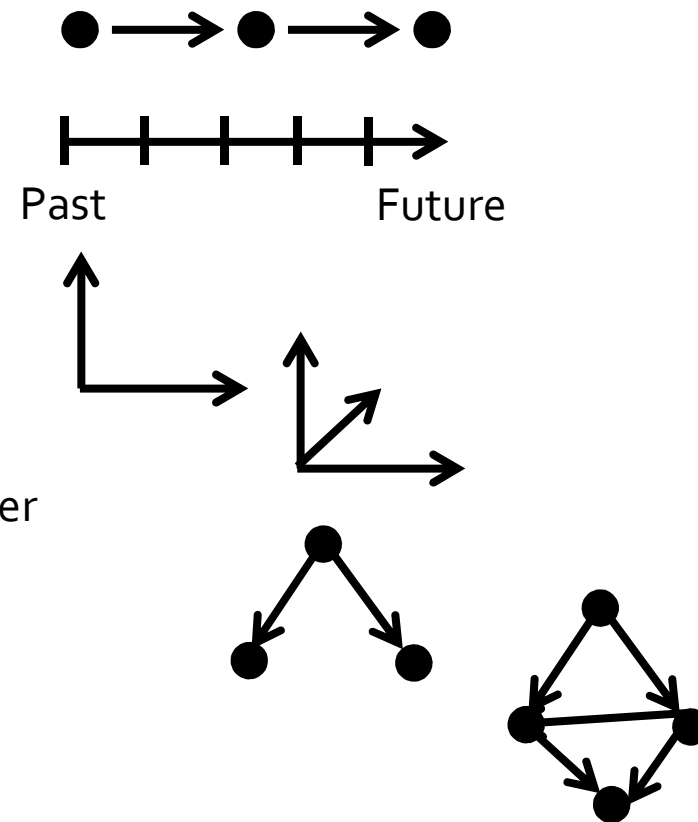
- Operations: =, ≠, <, >, -, +, •, ÷

- Can measure ratios or proportions

10kg / 5kg

Data-Type Taxonomy

- 1D (linear)
- Temporal
- 2D (maps)
- 3D
- nD (relational) vis examples later
- Trees (hierarchies)
- Networks (graphs)

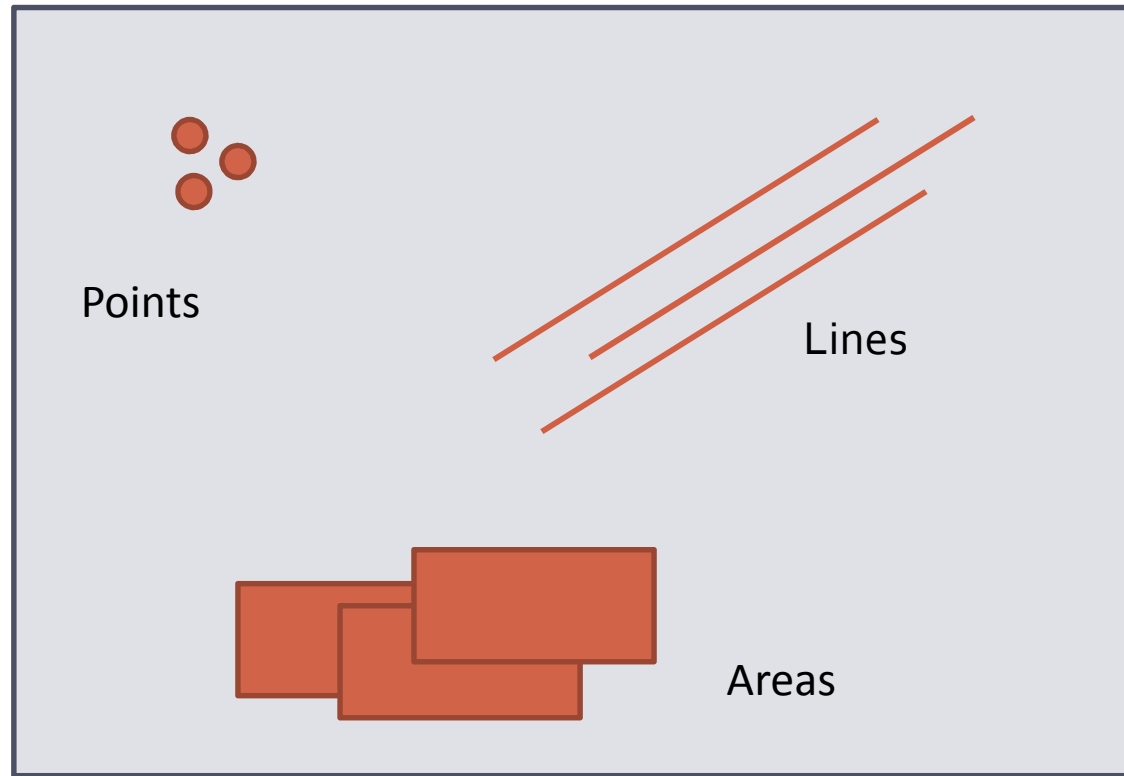


Why is this important?

- Nominal, ordinal, and quantitative data are best expressed in different ways visually
- Data types often have inherent tasks
 - temporal data (comparison of events)
 - trees (understand parent-child relationships)
 - ...
- But:
 - any data type (1D, 2D,...) can be expressed in a multitude of ways!

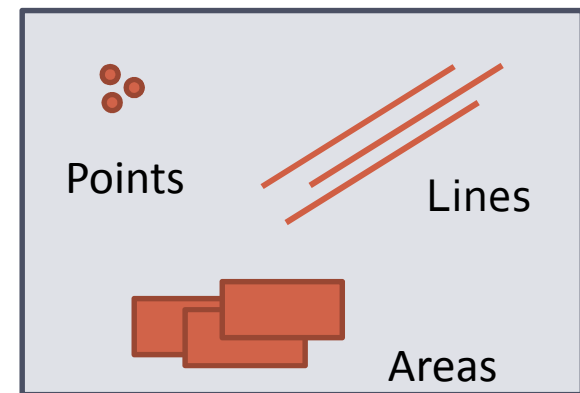
Visualization's Main Building Blocks

Marks which represent:



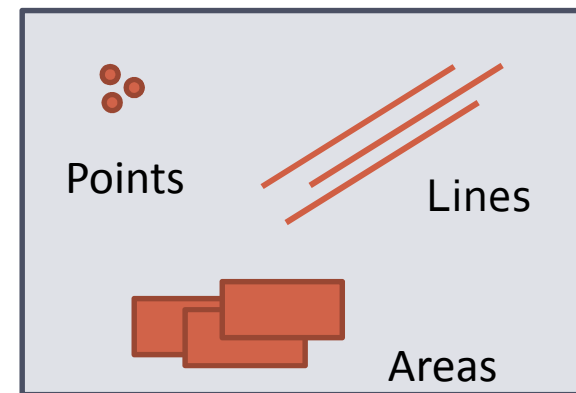
Points

- “A point represents a location on the plane that has **no theoretical length or area**. This signification is independent of the size and character of the mark which renders it visible.”
- a location
- marks that indicate points can vary in all visual variables



Lines

- “A line signifies a phenomenon on the plane which has **measurable length but no area**. This signification is independent of the width and characteristics of the mark which renders it visible.”
- a boundary, a route, a connection

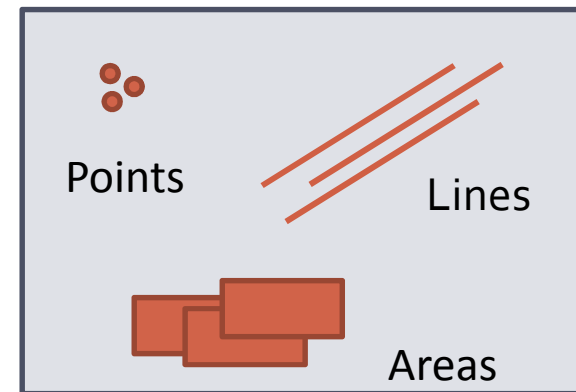


Areas

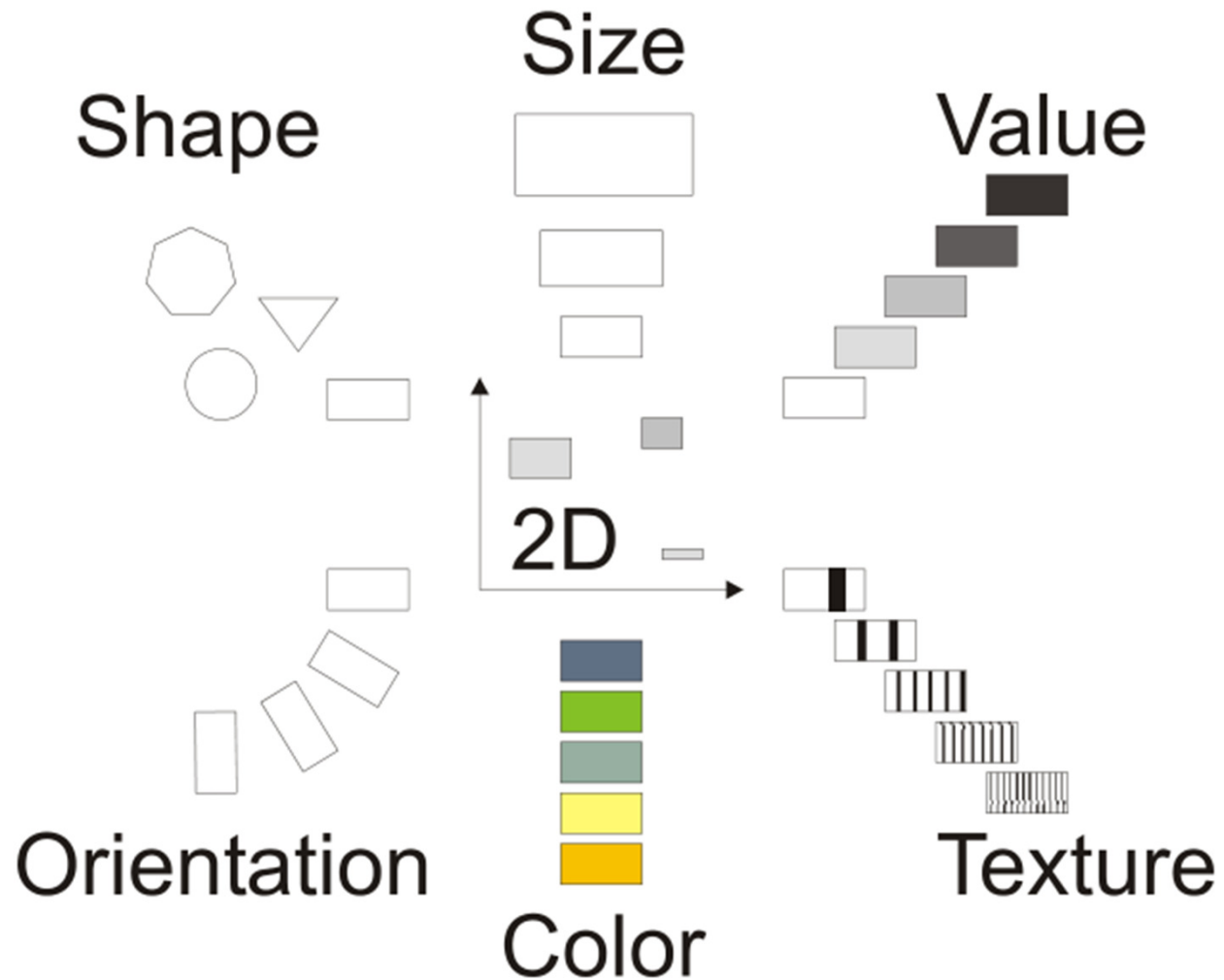
- “An area signifies something on the plane that **has measurable size**.

This signification applies to the entire area covered by the visible mark.”

- an area can change in position but not in size, shape or orientation without making the area itself have a different meaning



Visual Variables Applicable to Marks



From Semiology of Graphics (Bertin)

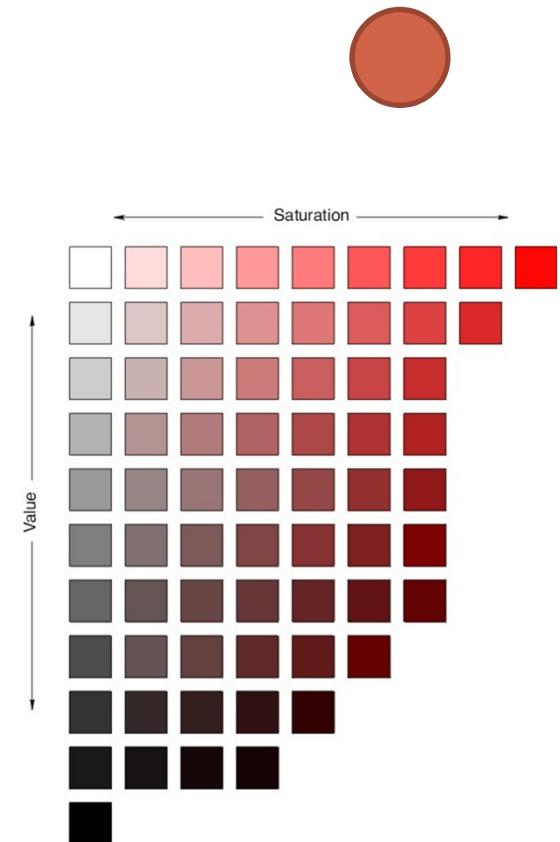
Additional Variables for Computers

- **motion**

- direction, acceleration, speed, frequency, onset, 'personality'

- **saturation**

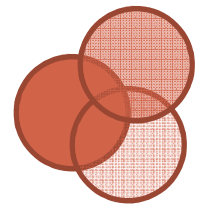
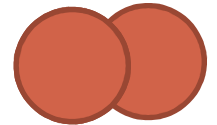
- colour as Bertin uses largely refers to hue, saturation != value



Extending those from Semiology of Graphics (Bertin)

Additional Variables for Computers

- **flicker**
 - frequency, rhythm, appearance
- **depth? 'quasi' 3D**
 - depth, occlusion, aerial perspective, binocular disparity
- **Illumination**
- **transparency**

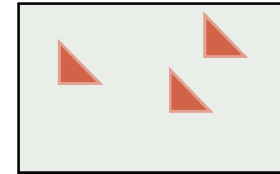
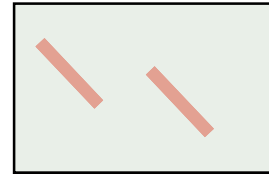
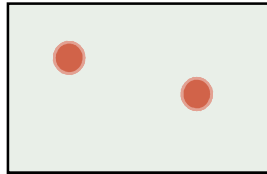


Characteristics of Visual Variables

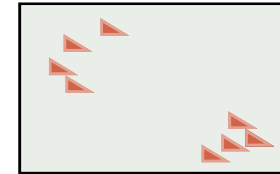
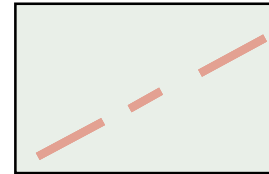
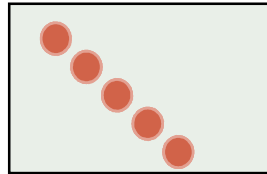
- **Selective:**
Is a change in this variable enough to allow us to select it from a group?
- **Associative:**
Is a change in this variable enough to allow us to perceive them as a group?
- **Quantitative:**
Is there a numerical reading obtainable from changes in this variable?
- **Order:**
Are changes in this variable perceived as ordered?
- **Length:**
Across how many changes in this variable are distinctions possible?

Visual Variable: Position

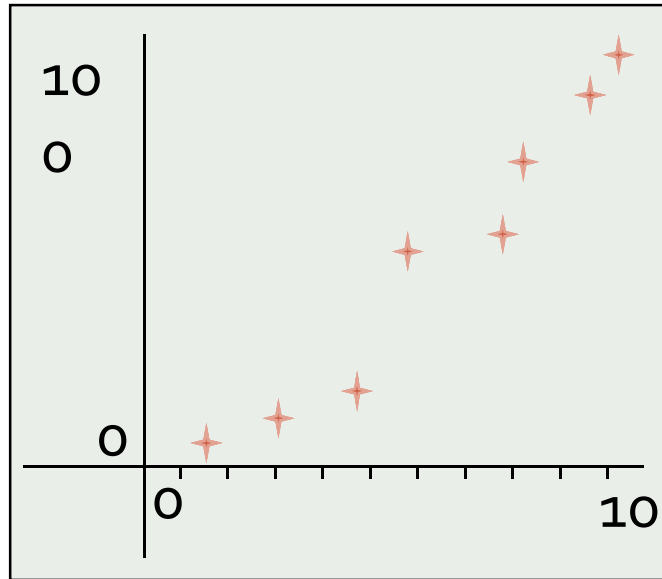
✓ • selective



✓ • associative



✓ • quantitative

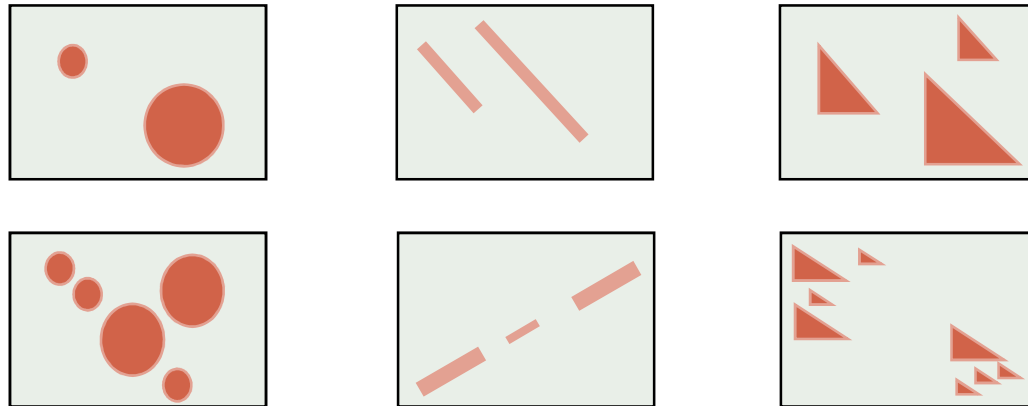


✓ • order

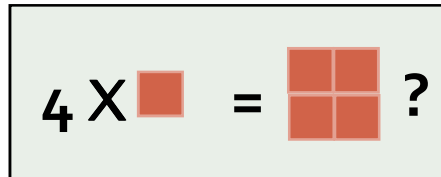
✓ • length

Visual Variable: Size

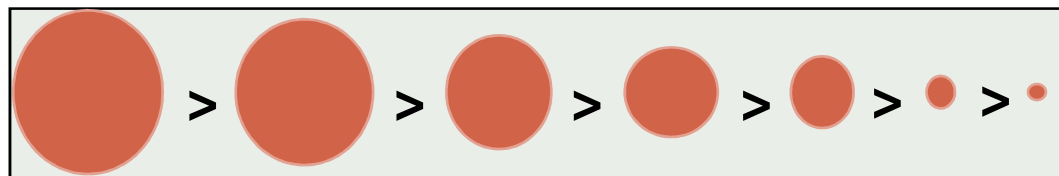
- ✓ • selective
- ✓ • associative
- ~ • quantitative



- ✓ • order



- ✓ • Length



- theoretically infinite but practically limited
- association and selection ~ 5 and distinction ~ 20

Size



points



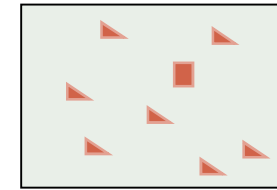
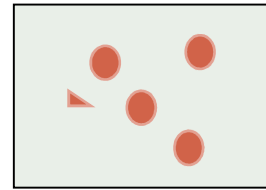
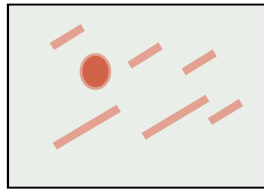
lines



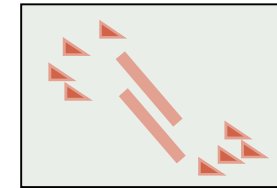
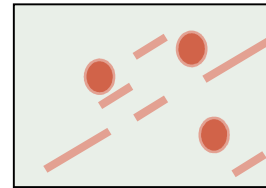
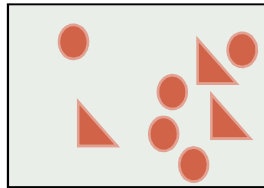
areas

Visual Variable: Shape

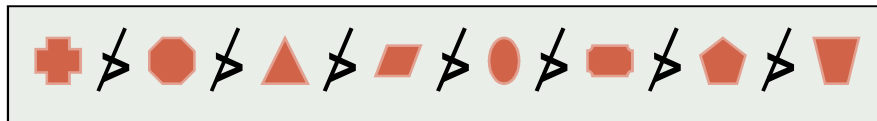
 • selective




 • associative



 • quantitative

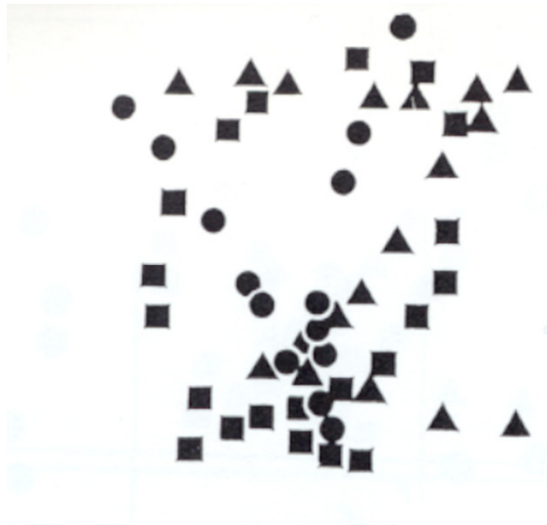


 • order

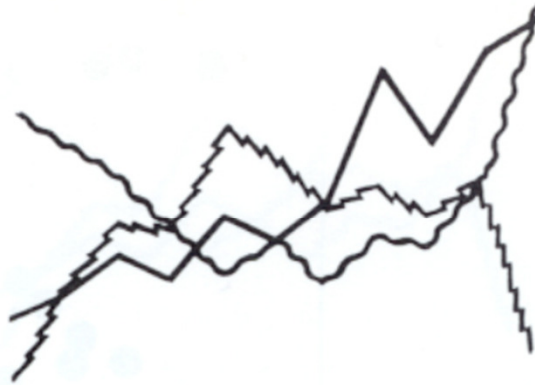
 • length
– infinite



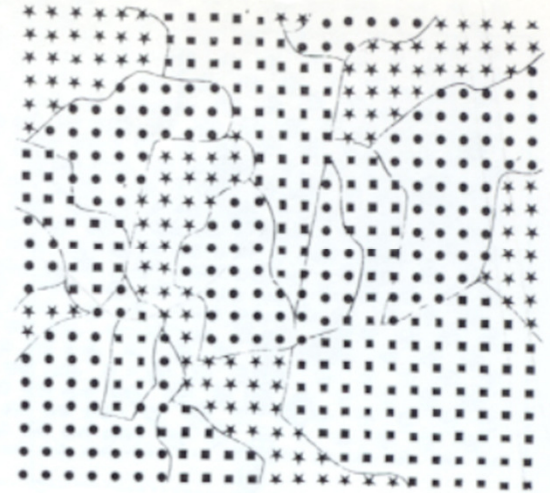
Shape



points



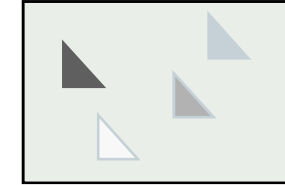
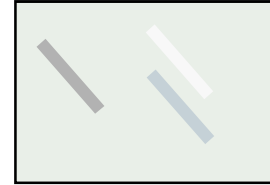
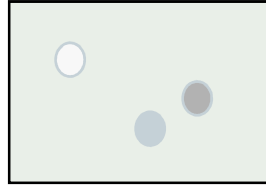
lines



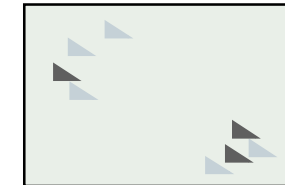
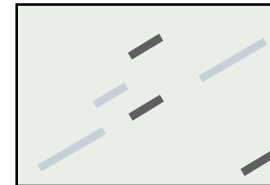
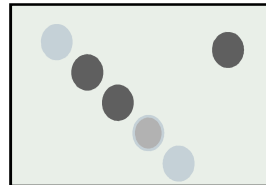
areas

Visual Variable: Value

✓ • selective

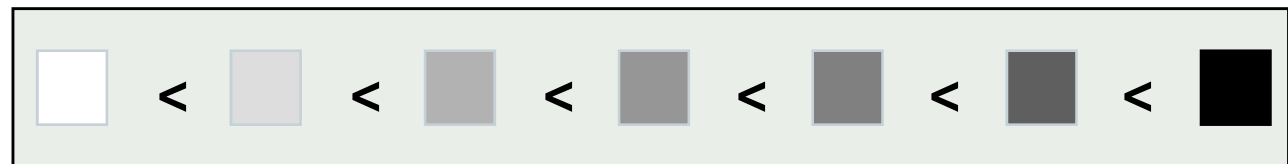


✓ • associative



✗ • quantitative

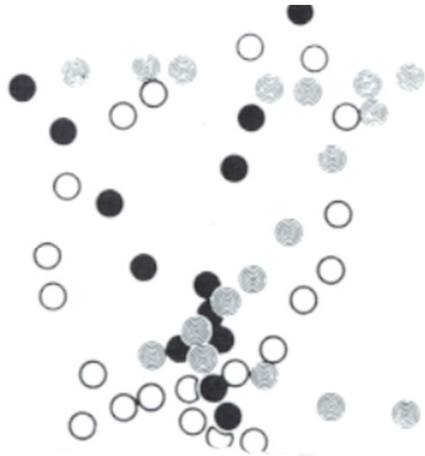
✓ • order



✓ • length

- theoretically infinite but practically limited
- association and selection ~ < 7 and distinction ~ 10

Value



points



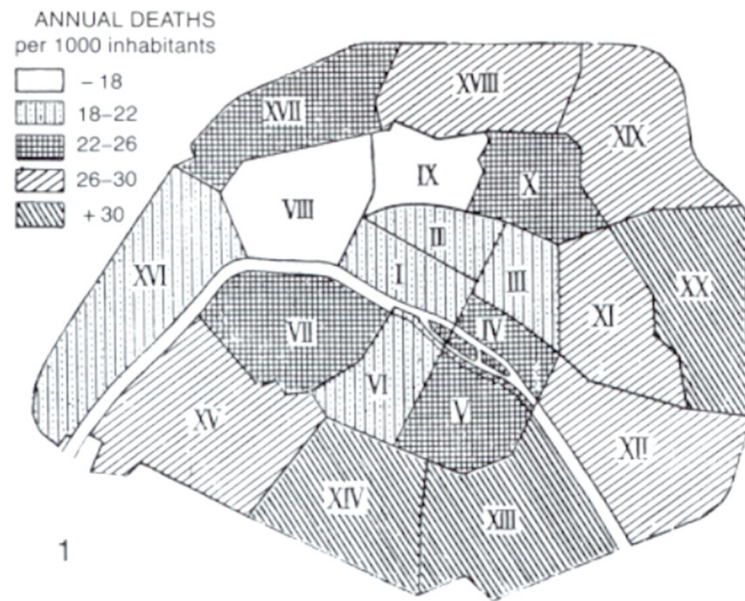
lines



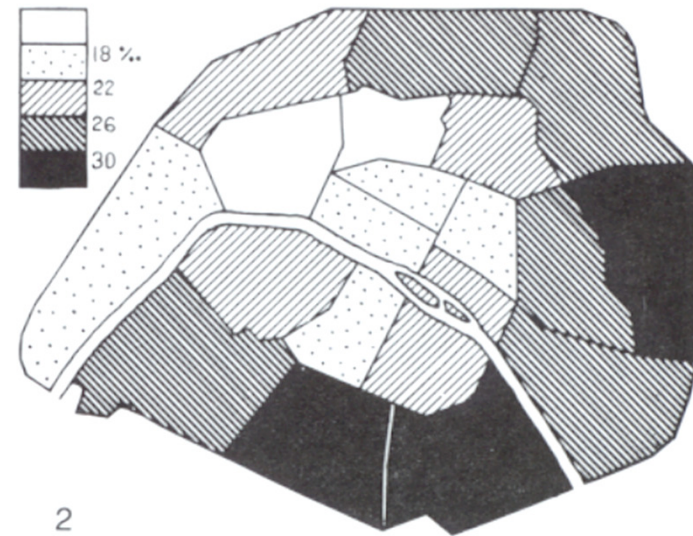
areas

Value

- Ordered, cannot be reordered







Values not ordered correctly according to scale
Information has to be read point by point



Values ordered correctly
Image much more useful

Visual Variable: Colour

- ✓ • selective 
- ✓ • associative 
- ~~≠~~ • quantitative 
- ~~≠~~ • order 
- ✓ • length
 - theoretically infinite but practically limited
 - association and selection ~ < 7 and distinction ~ 10

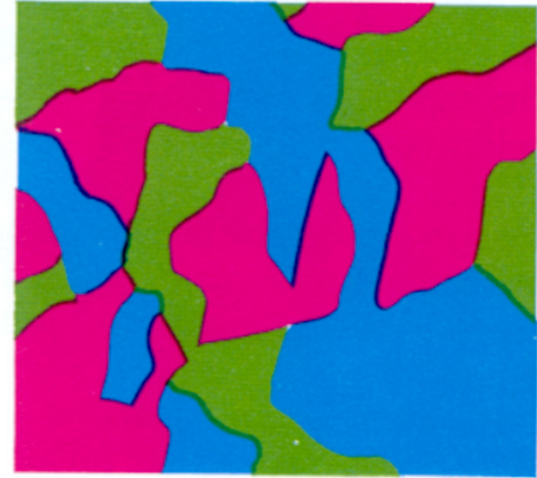
Colour



points



lines



areas

Colour Scales

- Common to use a rainbow scale... caution!

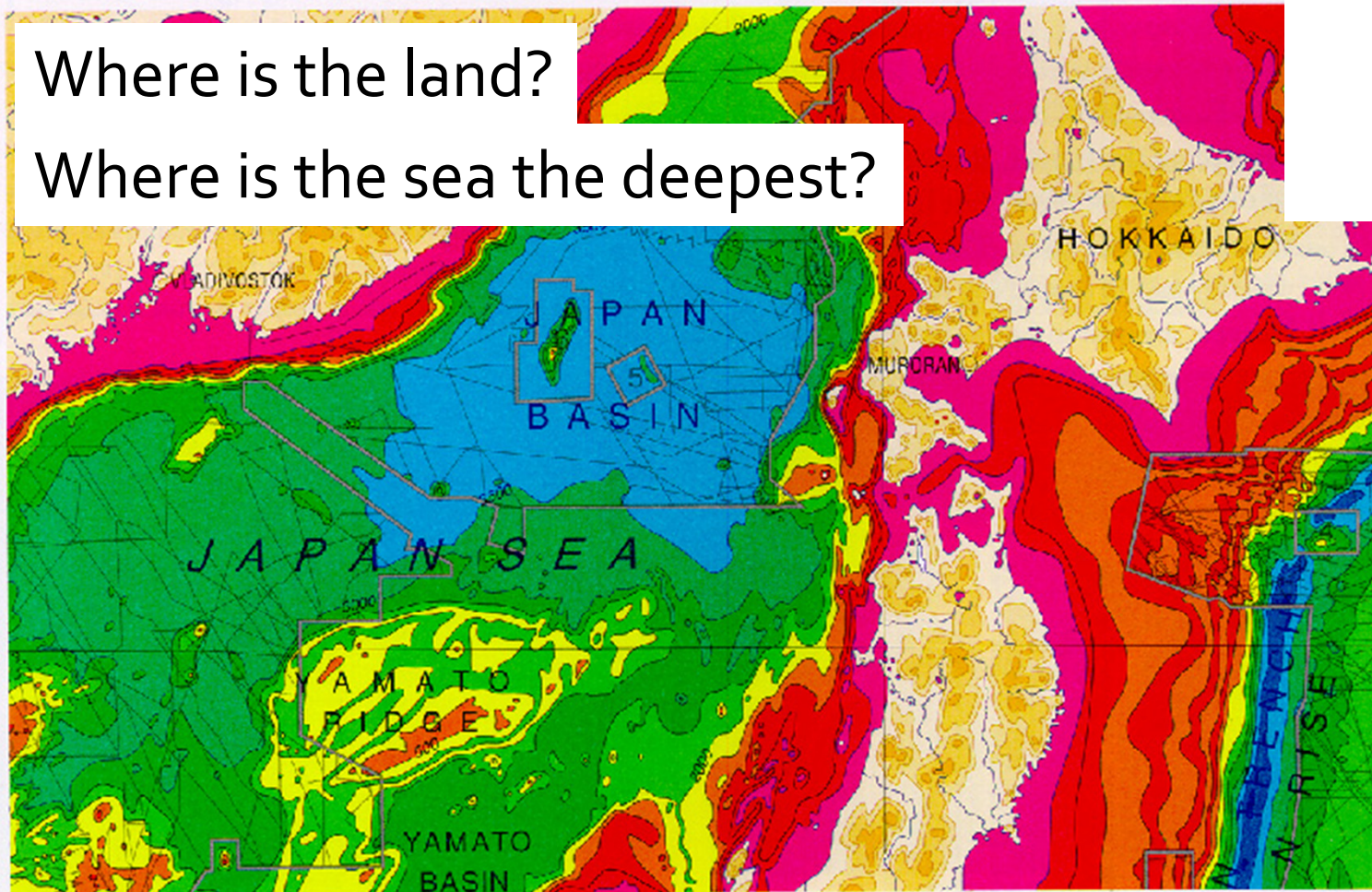


General Bathymetric Chart of the Ocean

Every color mark signals:
longitude, latitude, sear/land, depth/altitude

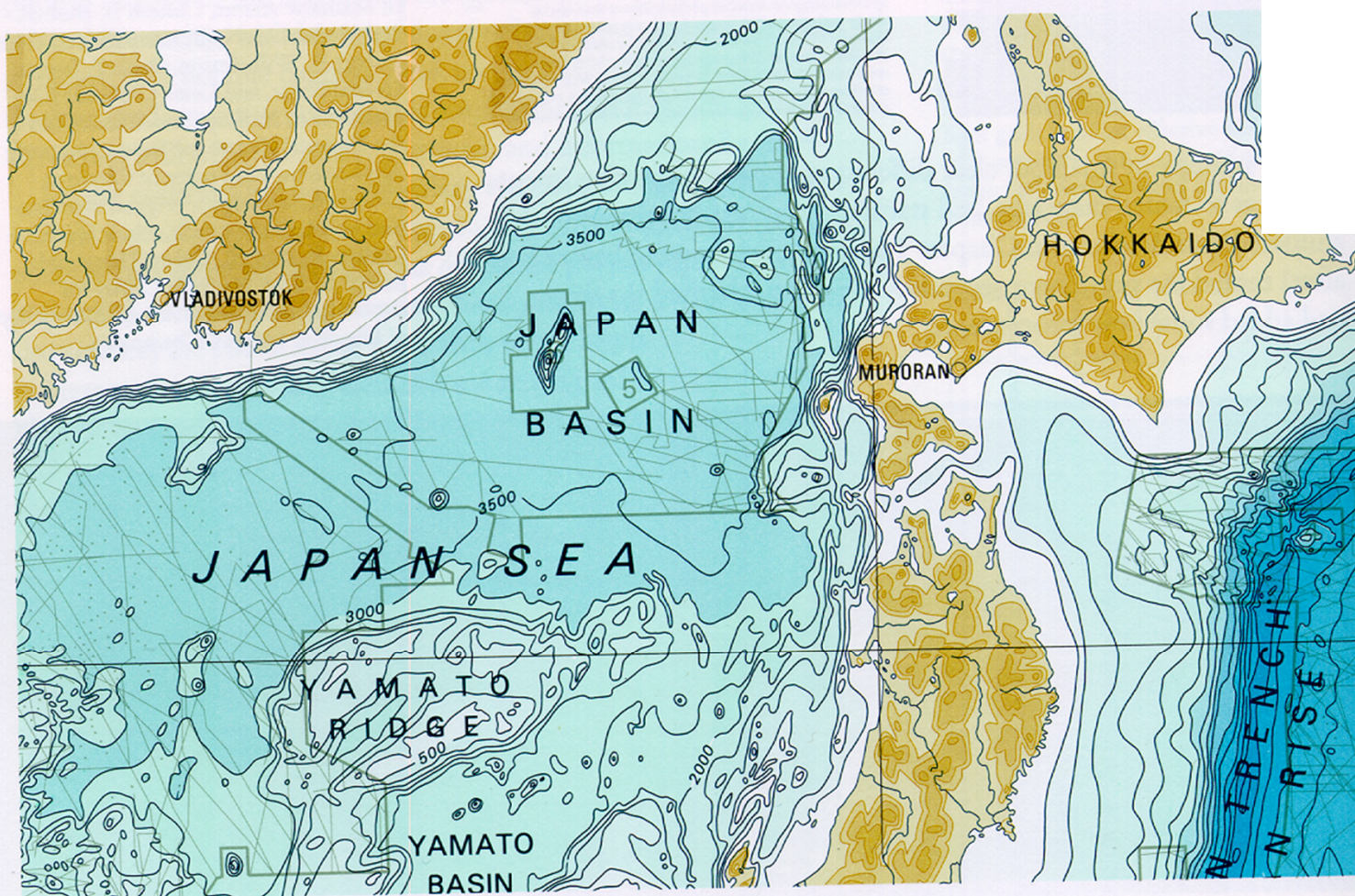
Where is the land?

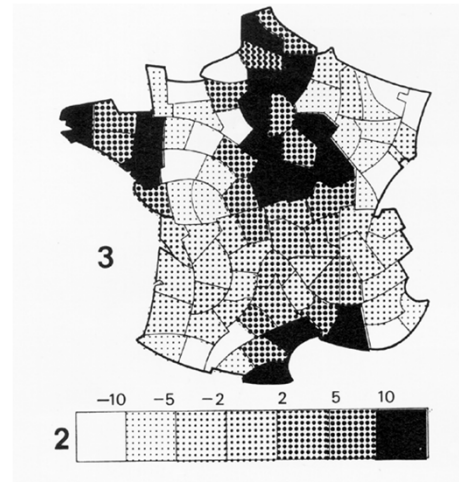
Where is the sea the deepest?



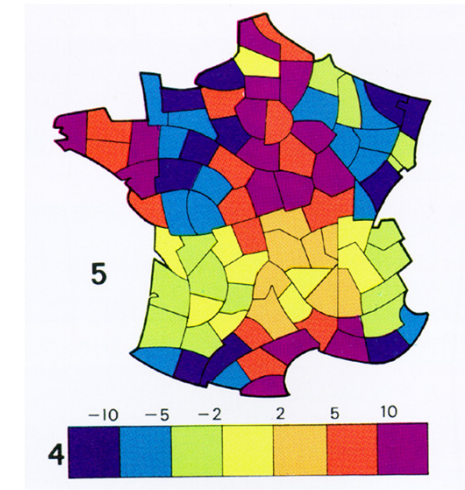
General Bathymetric Chart of the Ocean

Now describe what kind of color scale was possibly used here

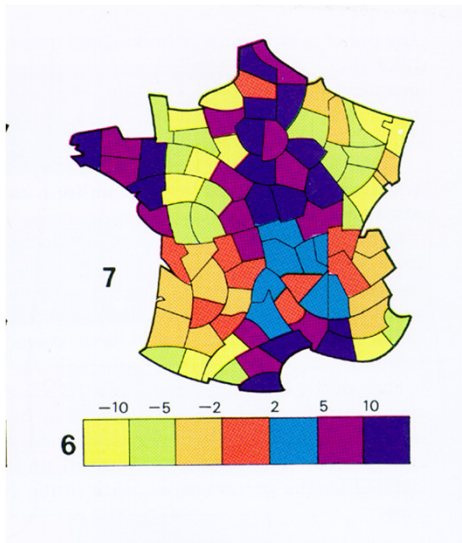




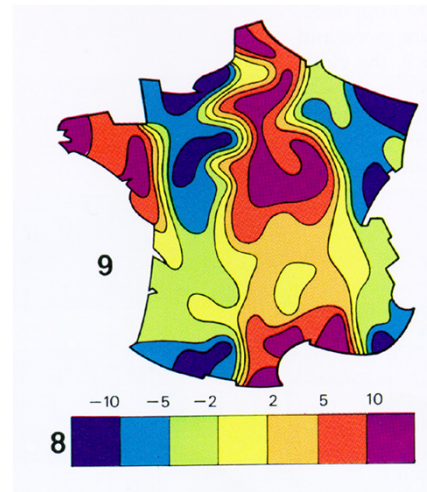
only represented by value
shows north-south band



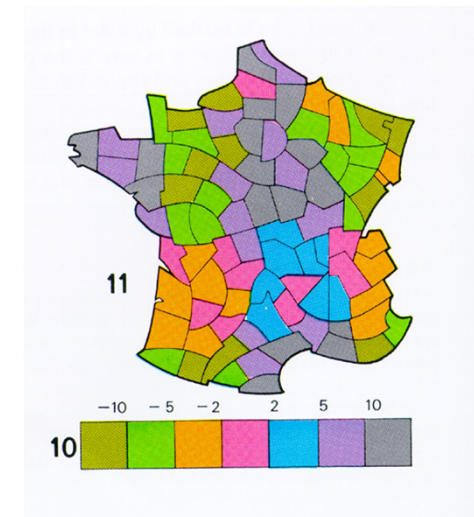
values increase from
yellow to left & right
creates east-west band



colors ordered by value
north-south band reappears



rainbow scale only works
when colors not next to each
other in the scale are not
brought together on the plane



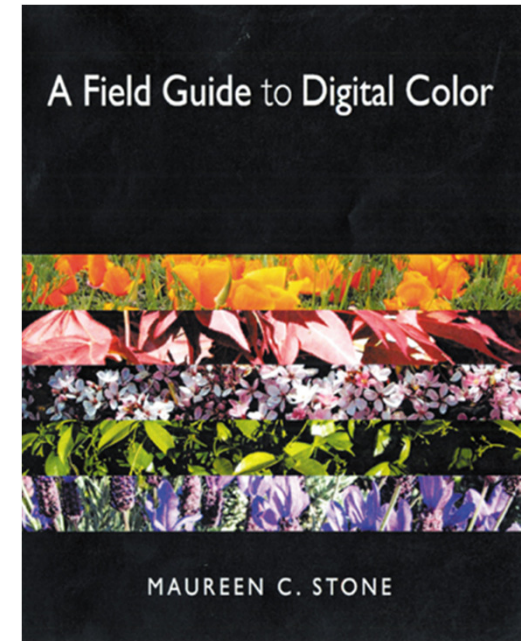
scale with no value changes
cannot represent orders
only good for selective and
associative depiction

Controls Legibility



Colour Resources

- Maureen Stone's Resources
 - <http://www.stonesc.com>
 - *A Field Guide to Digital Color* (A. K. Peters)
- Cindy Brewer's *ColorBrewer*
 - <http://colorbrewer.org>
- ColourLovers Community Palette Sharing
 - <http://www.colourlovers.com>

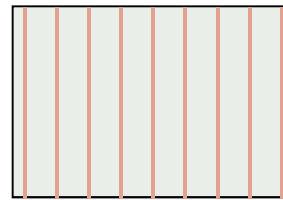
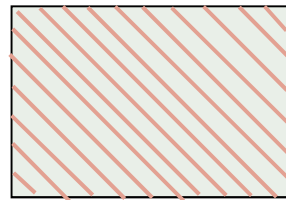


Visual Variable: Orientation

✓ • selective

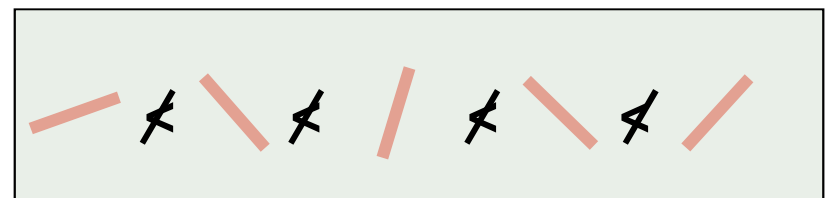
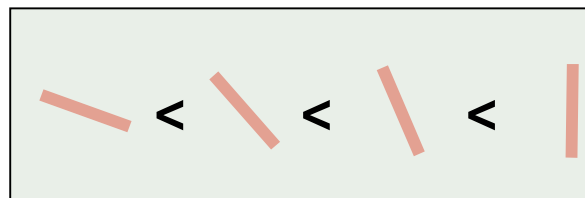


✓ • associative



~~≠~~ • quantitative

~~≠~~ • order



✓ • length

• ~5 in 2D; ? in 3D

Orientation



points



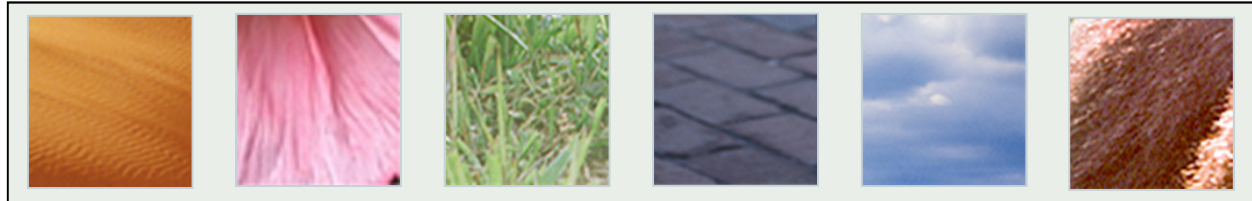
lines



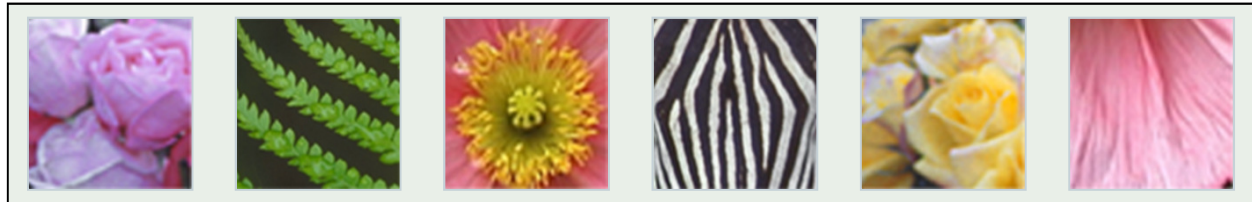
areas

Visual Variable: Texture

✓ • selective

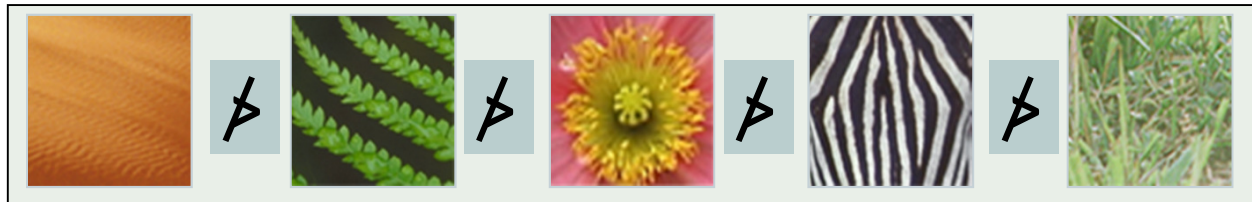


✓ • associative



≠ • quantitative

≠ • order



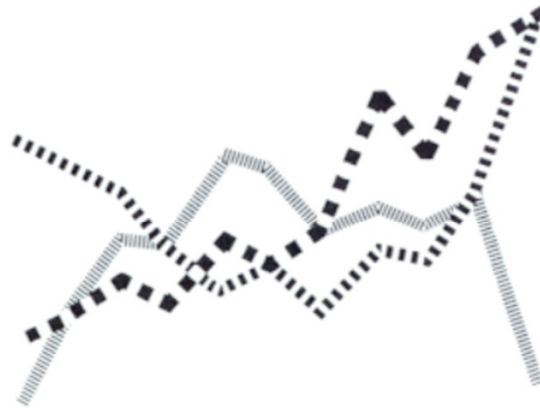
✓ • length

- theoretically infinite

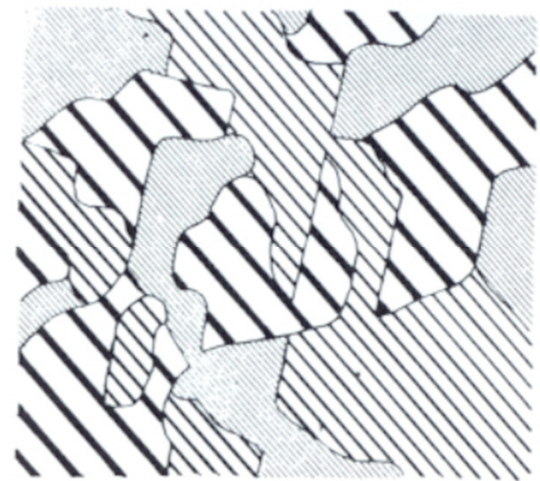
Texture



points



lines

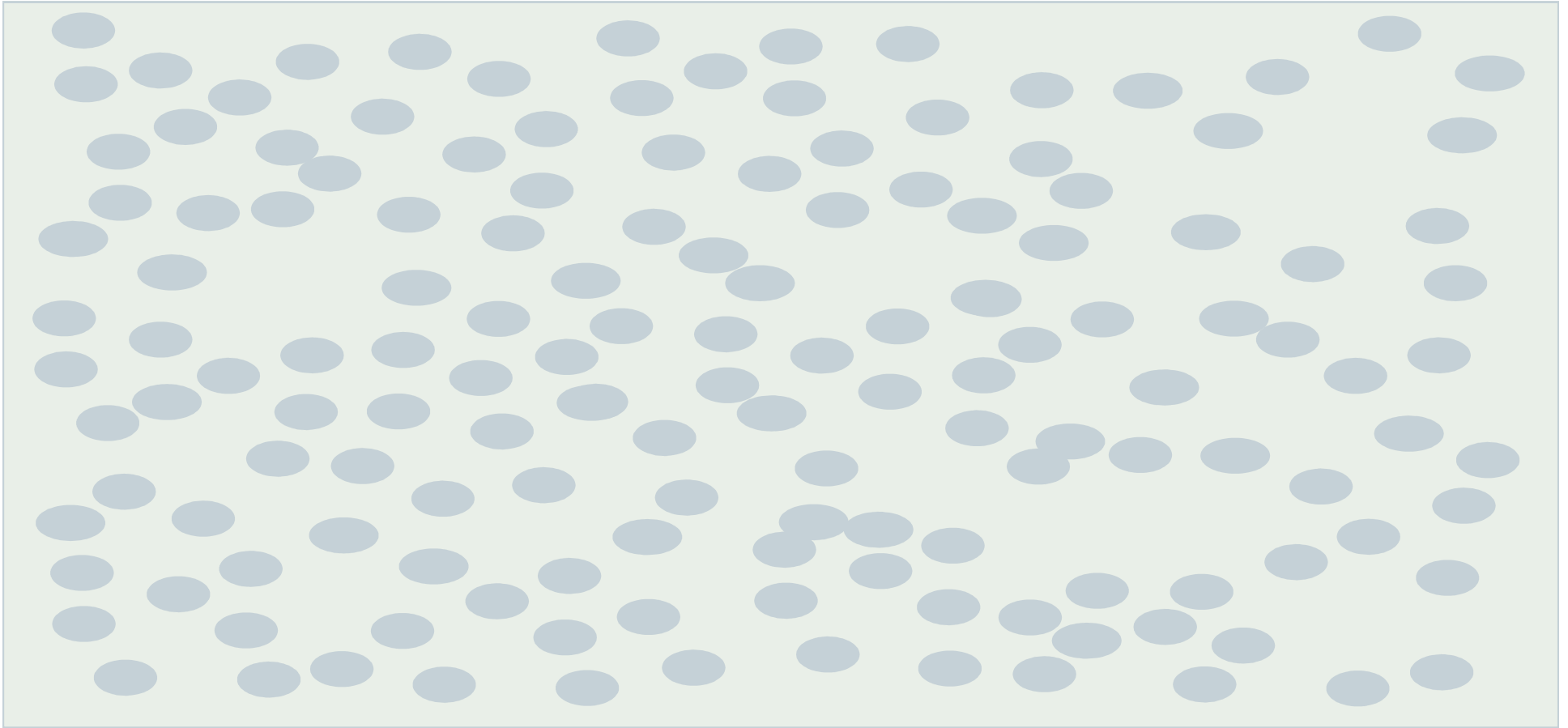


areas

Visual Variable: Motion

- ✓ • selective
 - motion is one of our most powerful attention grabbers
- ✓ • associative
 - moving in unison groups objects effectively
- ≠ • quantitative
 - subjective perception
- ≠ • order
- ? • length
 - distinguishable types of motion?

Motion



Visual Variables

Visual Variable	Selective	Associative	Quantitative	Order	Length
Position	Yes	Yes	Yes	Yes	Dependant on resolution
Size	Yes	Yes	Approximate	Yes	Association: 5; Distinction: 20
Shape	With Effort	With Effort	No	No	Infinite
Value	Yes	Yes	No	Yes	Association: 7; Distinction: 10
Hue	Yes	Yes	No	No	Association: 7; Distinction: 10
Orientation	Yes	Yes	No	No	4
Grain	Yes	Yes	No	No	5
Texture	Yes	Yes	No	No	Infinite
Motion	Yes	Yes	No	Yes	Unknown

Short Break

- Summary:
 - Now you know the main building blocks are **marks**
 - Marks are modified by **visual variables**
 - Visual variables have **specific characteristics**
 - These characteristics influence how the data will be perceived
- Next you will
 - See that the vision system is **quicker and better** at detecting certain visual variables
 - Learn that these influences how visualizations will be read

Preattentive Processing

- Some things can be extracted without need for focused attention
- Generally within 200-250 ms
- Seems to be done in parallel by low-level vision system
- Preattentive processing is influenced by visual encoding

How many 3's do you see?

1281768756138976546984506985604982826762
9809858458224509856458945098450980943585
9091030209905959595772564675050678904567
8845789809821677654876364908560912949686

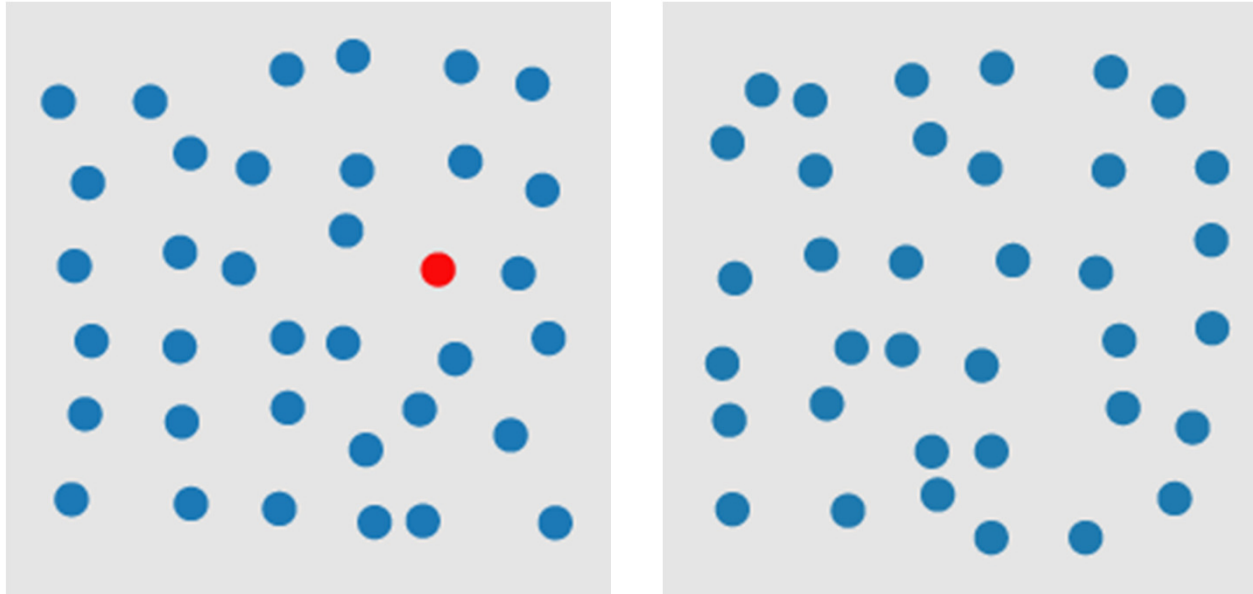
How about now?

12817687561**3**8976546984506985604982826762
980985845822450985645894509845098094**3**585
90910**3**0209905959595772564675050678904567
8845789809821677654876**3**64908560912949686

Visual variables influence preattentive processing

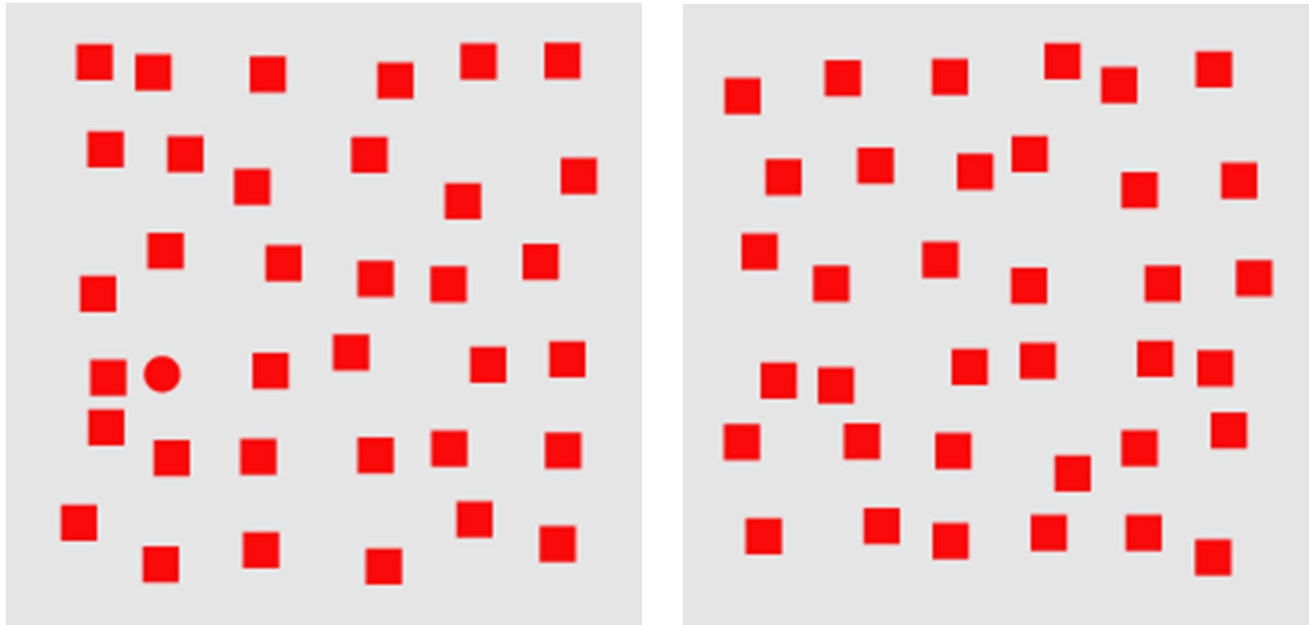
***DETERMINE IF A RED CIRCLE
IS PRESENT***

Hue



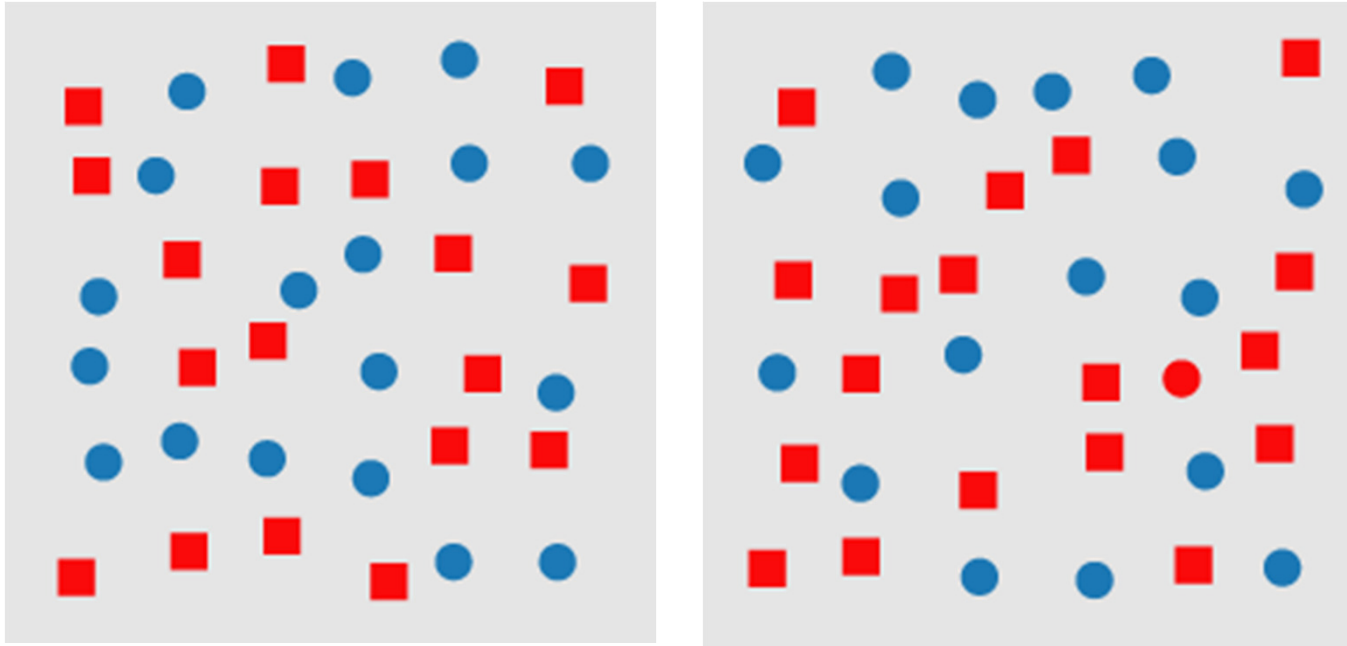
Yes, can be done preattentively

Shape



Yes, can be done preattentively

Hue and Shape



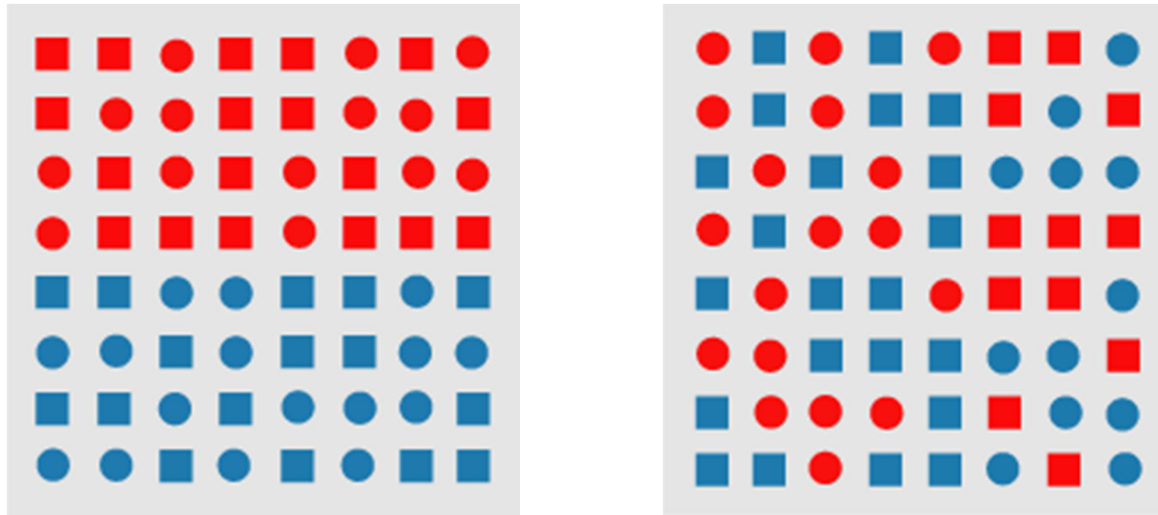
Cannot be done preattentively due to conjunction of shape and hue

→ need to search

Visual variables influence preattentive processing

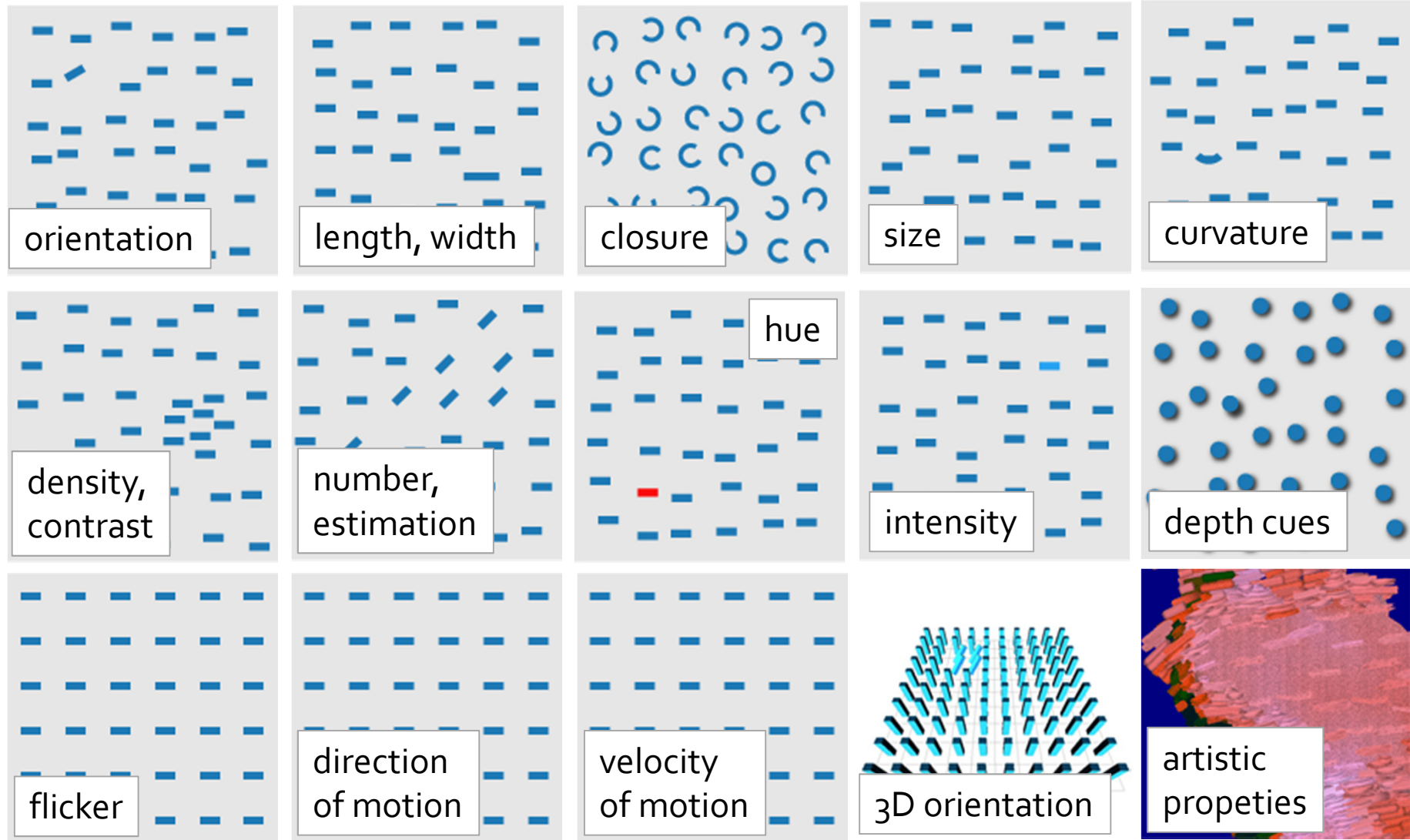
***DETERMINE IF THERE IS A BOUNDARY
IN THE DISPLAY***

Fill and Shape



- Left can be done preattentively (groups are distinguished by one unique feature)
- Right cannot since groups are distinguished by two features

Preattentive visual features (some)



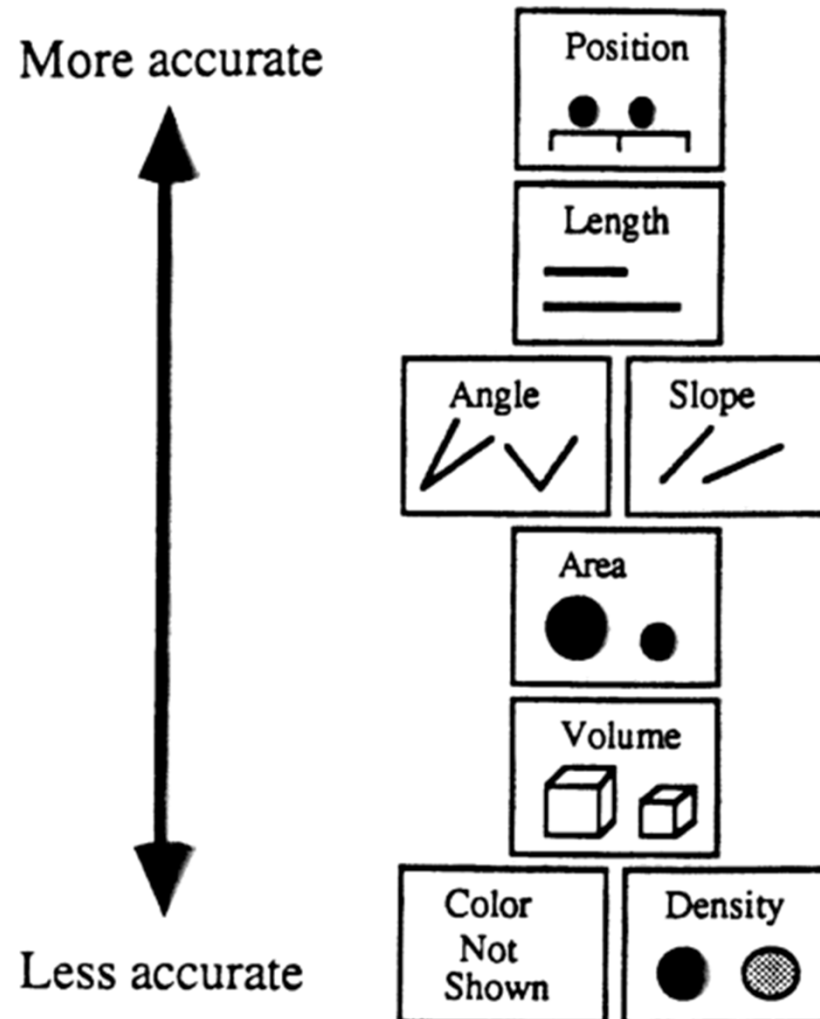
Elementary Graphical Perception Tasks

William S. Cleveland 1980s

- Performed controlled experiments to find out how effectively people could judge changes in visual features
- Focus on quantitative information
- Variables used: angle, area, color hue, color saturation, density (value), length, position, slope, volume

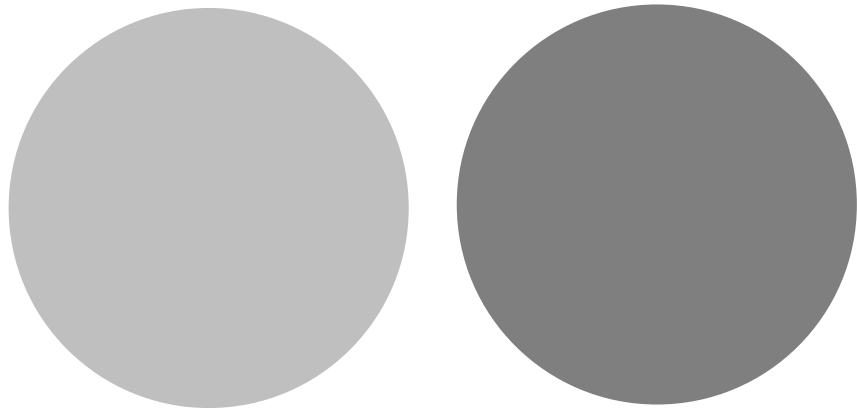
Elementary Graphical Perception Tasks

William S. Cleveland 1980s

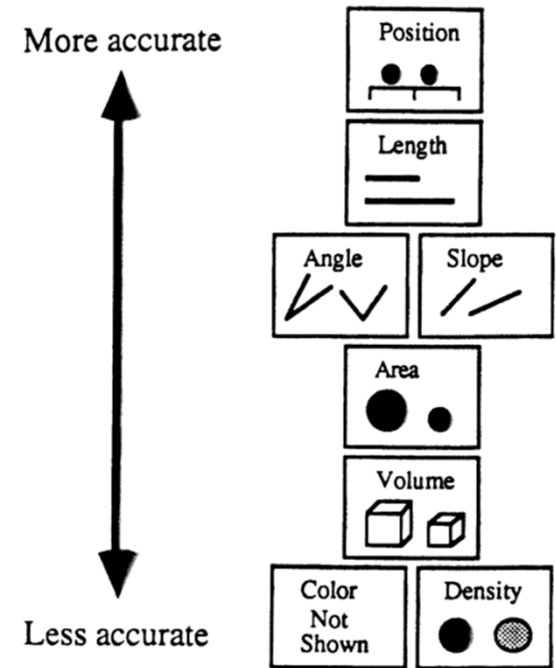


Value

- What percentage in value is the right from the left (=100%) ?

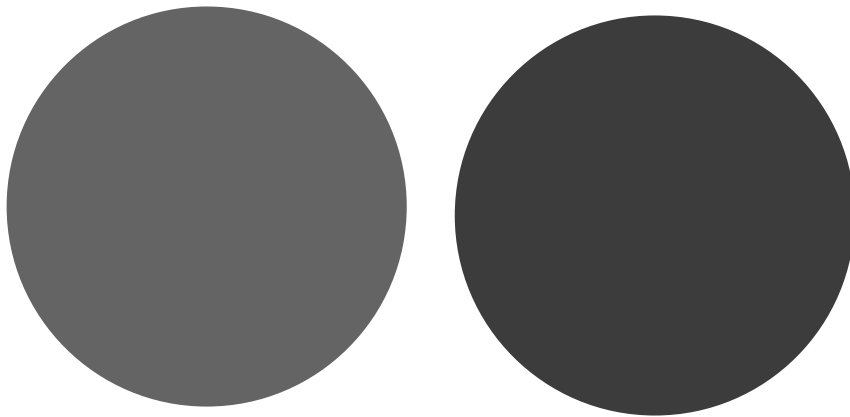


66%

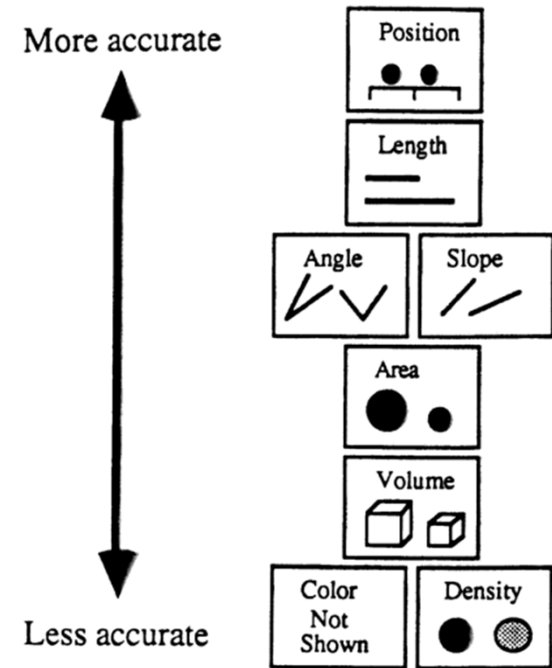


Value

- What percentage in value is the right from the left (=100%)?

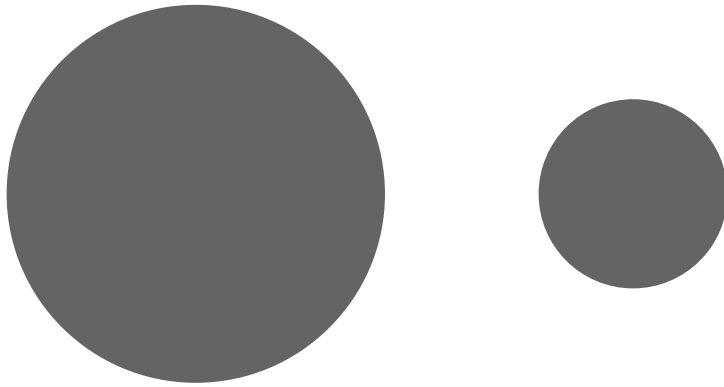


60%

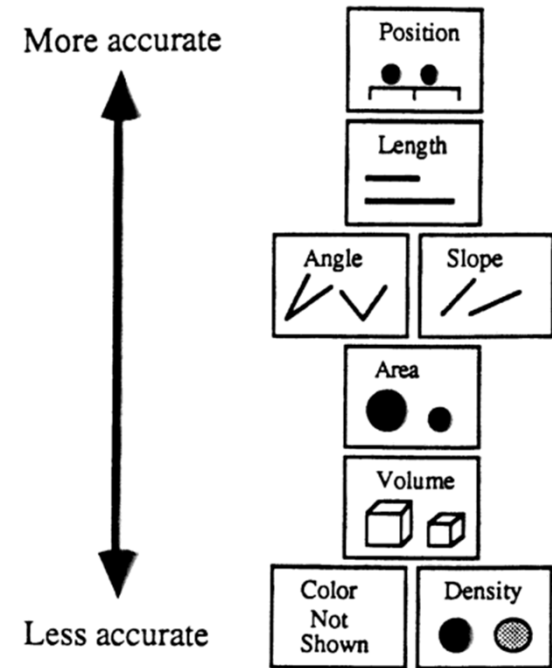


Area

- What percentage in size is the right from the left (=100%)?

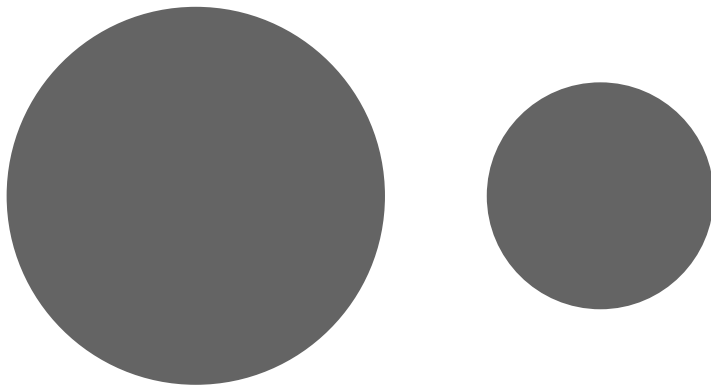


25%

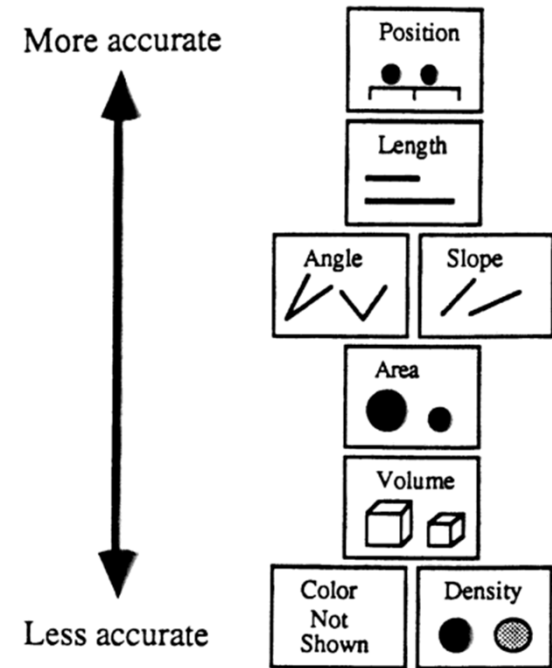


Area

- What percentage in size is the right from the left (=100%)?

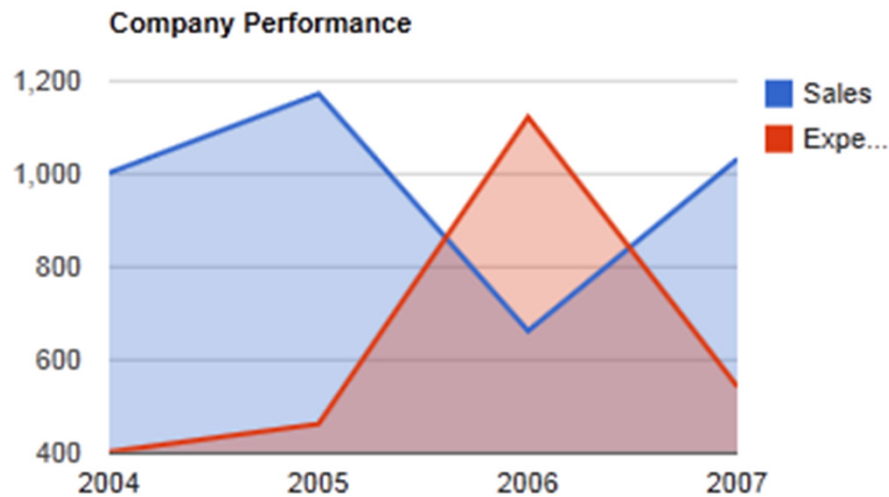


36%

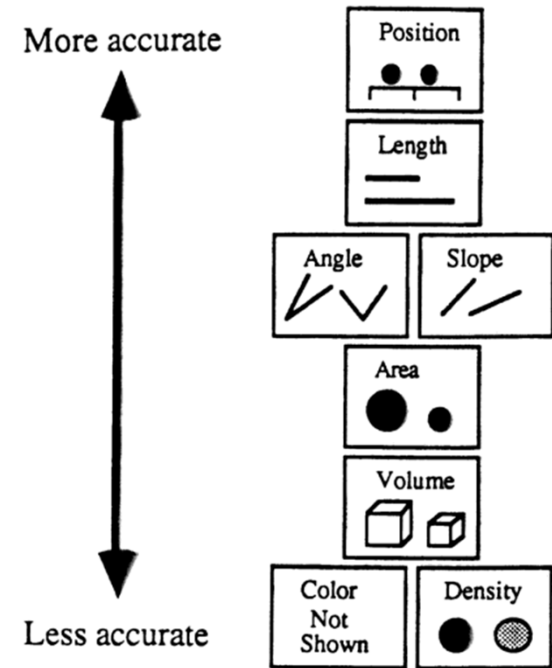


Area

- What percentage in size is the red from the blue (=100%)?



no idea – this is very difficult

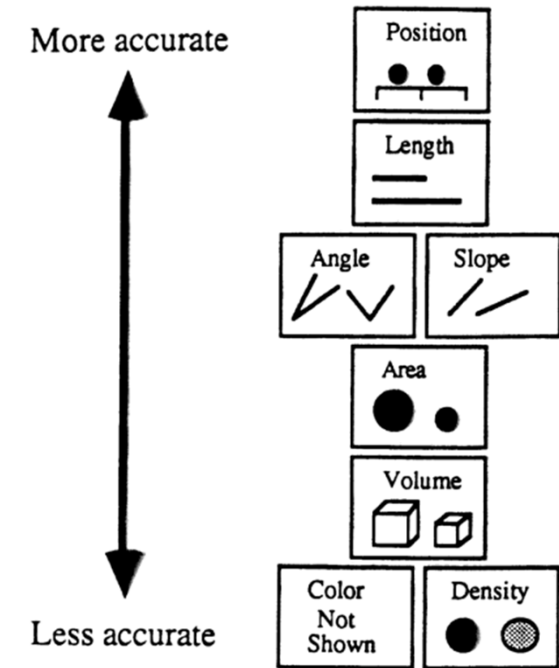


Length

- What percentage in length is the right from the left (=100%)?



75%

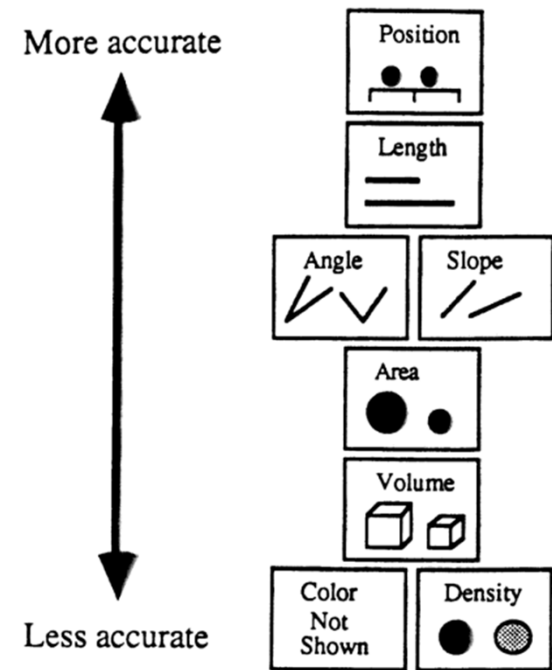


Length / Position

- What percentage in length is the right from the left (=100%)?



25%



Effectiveness of Data Encodings

Quantitative		Ordinal		Nominal
Position	————	Position	————	Position
Length		Density		Color Hue
Angle		Color Saturation		Texture
Slope		Color Hue		Connection
Area		Texture		Containment
Volume		Connection		Density
Density		Containment		Color Saturation
Color Saturation		Length		Shape
Color Hue		Angle		Length
Texture		Slope		Angle
Connection		Area		Slope
Containment		Volume		Area
Shape	————	Shape		Volume

Let's evaluate...

Car / Nation	USA	Japan	Germany	France	Sweden
Accord		x			
AMC Pacer	x				
Audi 5000			x		
BMW 320i			x		
Champ	x				
Chev Nova	x				
Saab 9000				x	

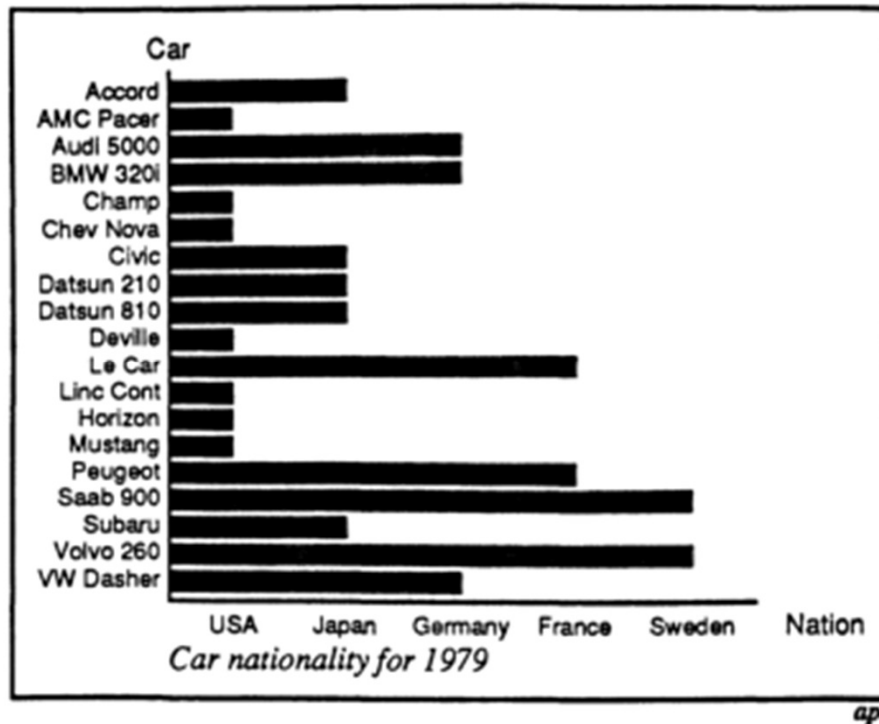
What kind of data are we looking at?

Nations: Nominal

Cars: Nominal

(Nation,Car): Nominal

Let's evaluate...

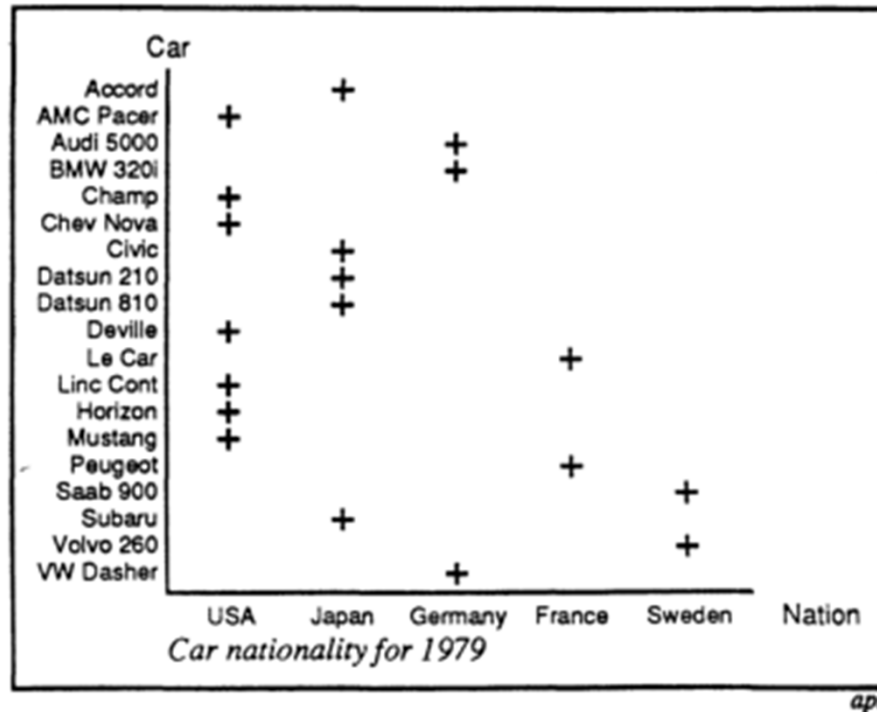


Quantitative	Ordinal	Nominal
Position	Position	Position
Length	Density	Color Hue
Angle	Color Saturation	Texture
Slope	Color Hue	Connection
Area	Texture	Containment
Volume	Connection	Density
Density	Containment	Color Saturation
Color Saturation	Length	Shape
Color Hue	Angle	Length
Texture	Slope	Angle
Connection	Area	Slope
Containment	Volume	Area
Shape	Shape	Volume

Problem:

Length of bar suggests an order or quantity
(e.g. Swedish cars are better)

Let's evaluate...



Quantitative	Ordinal	Nominal
Position	Position	Position
Length	Density	Color Hue
Angle	Color Saturation	Texture
Slope	Color Hue	Connection
Area	Texture	Containment
Volume	Connection	Density
Density	Containment	Color Saturation
Color Saturation	Length	Shape
Color Hue	Angle	Length
Texture	Slope	Angle
Connection	Area	Slope
Containment	Volume	Area
Shape	Shape	Volume

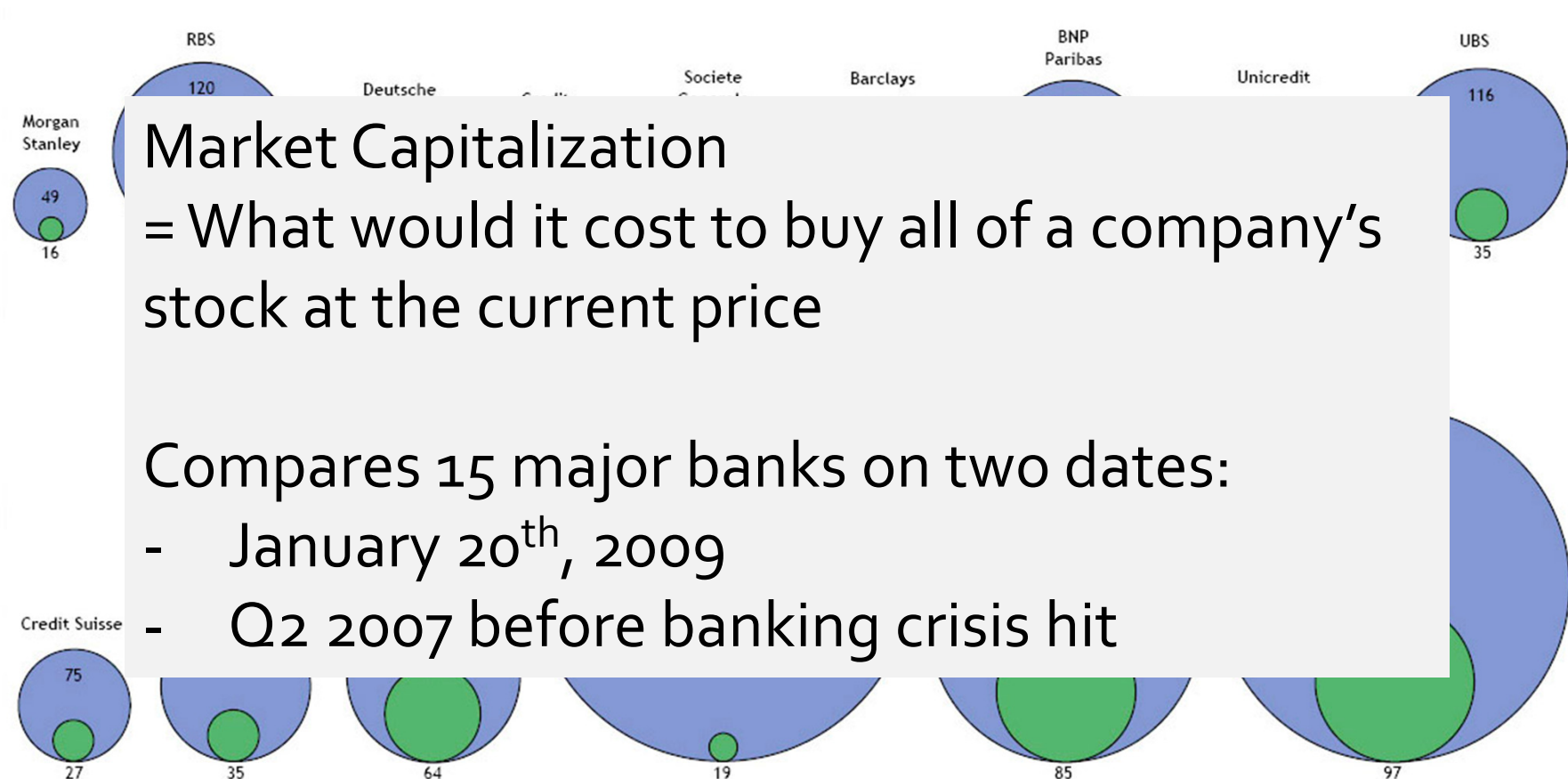
Better!

Let's evaluate...

Banks: Market Cap

● Market Value as of January 20th 2009, \$Bn

● Market Value as of Q2 2007, \$Bn



Market Capitalization

= What would it cost to buy all of a company's stock at the current price

Compares 15 major banks on two dates:

- January 20th, 2009
- Q2 2007 before banking crisis hit

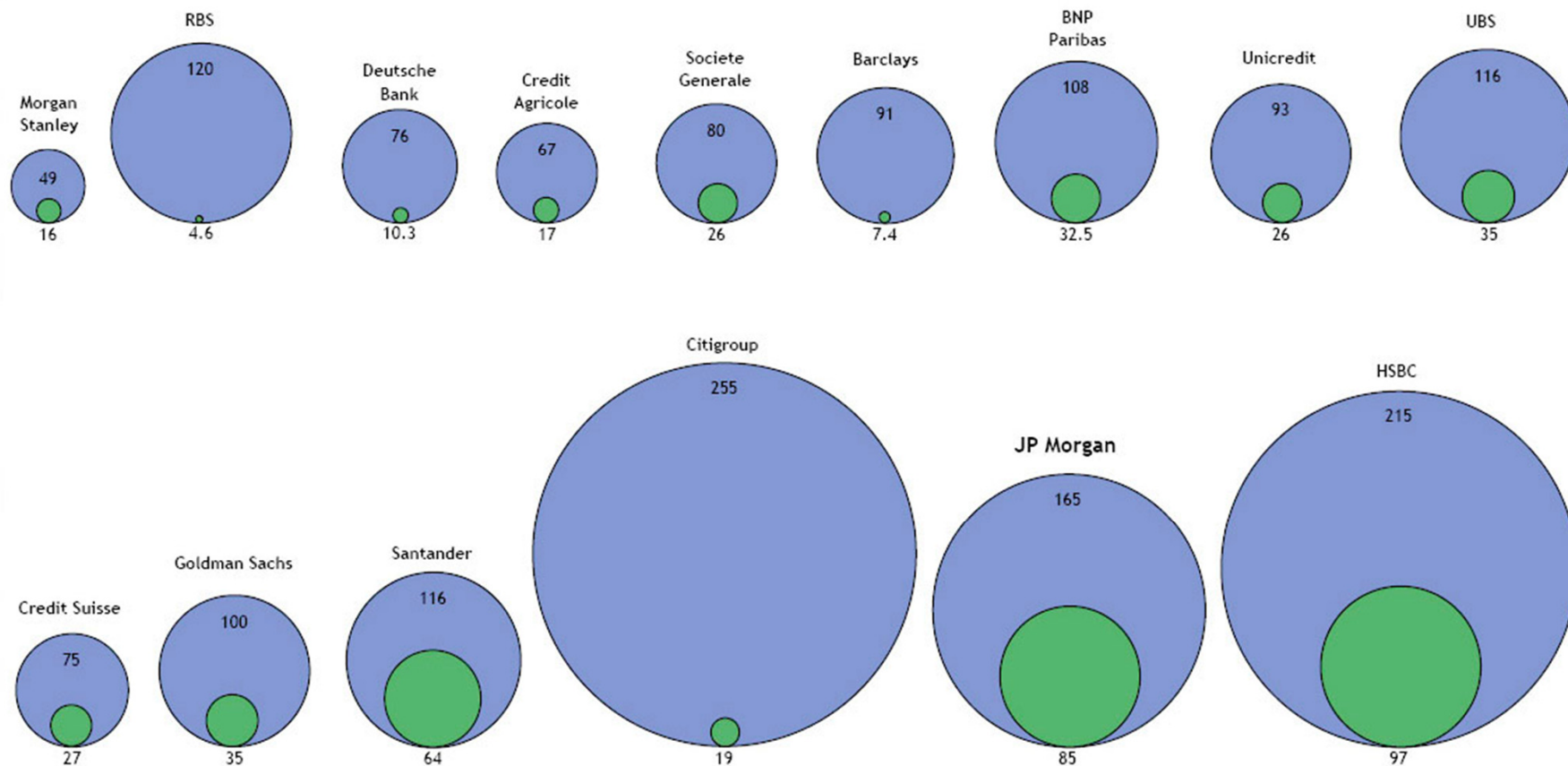
Problems here?

Banks: Market Cap

● Market Value as of January

● Market Value as of Q2 2009

- We are not good at comparing areas



J.P.Morgan

While JPMorgan considers this information to be reliable, we cannot guarantee its accuracy or completeness

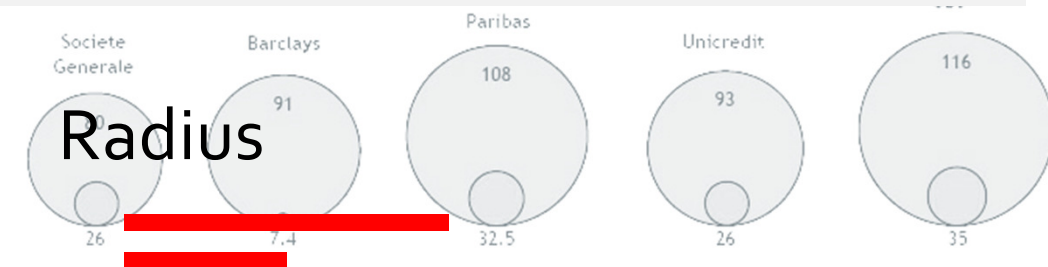
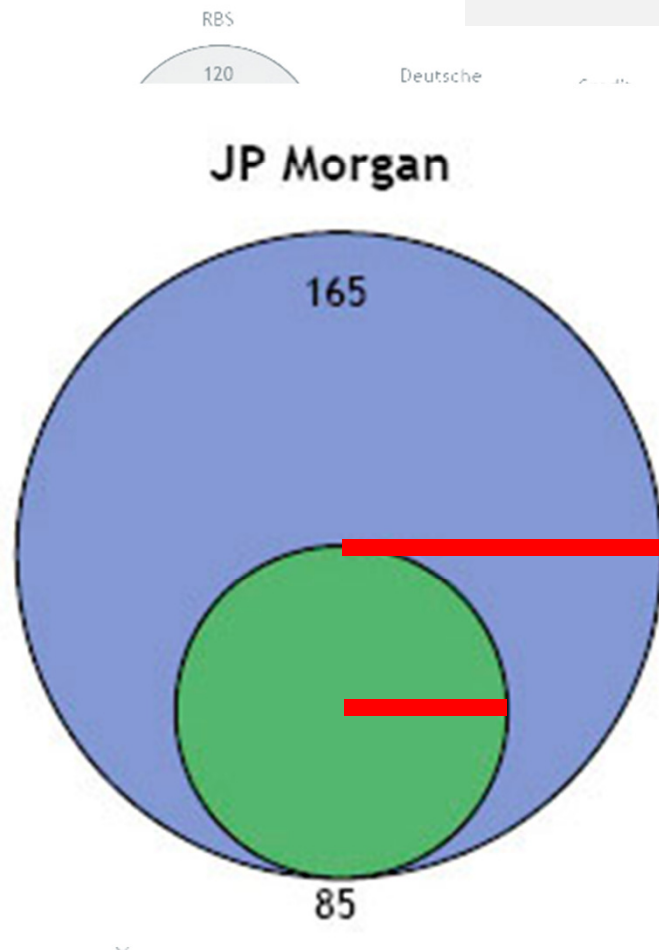
Source: Bloomberg, Jan 20th 2009

Problems here?

Banks: Market Cap

- Market Value as of January
- Market Value as of Q2 2009

- We are not good at comparing areas
- What should we read here?



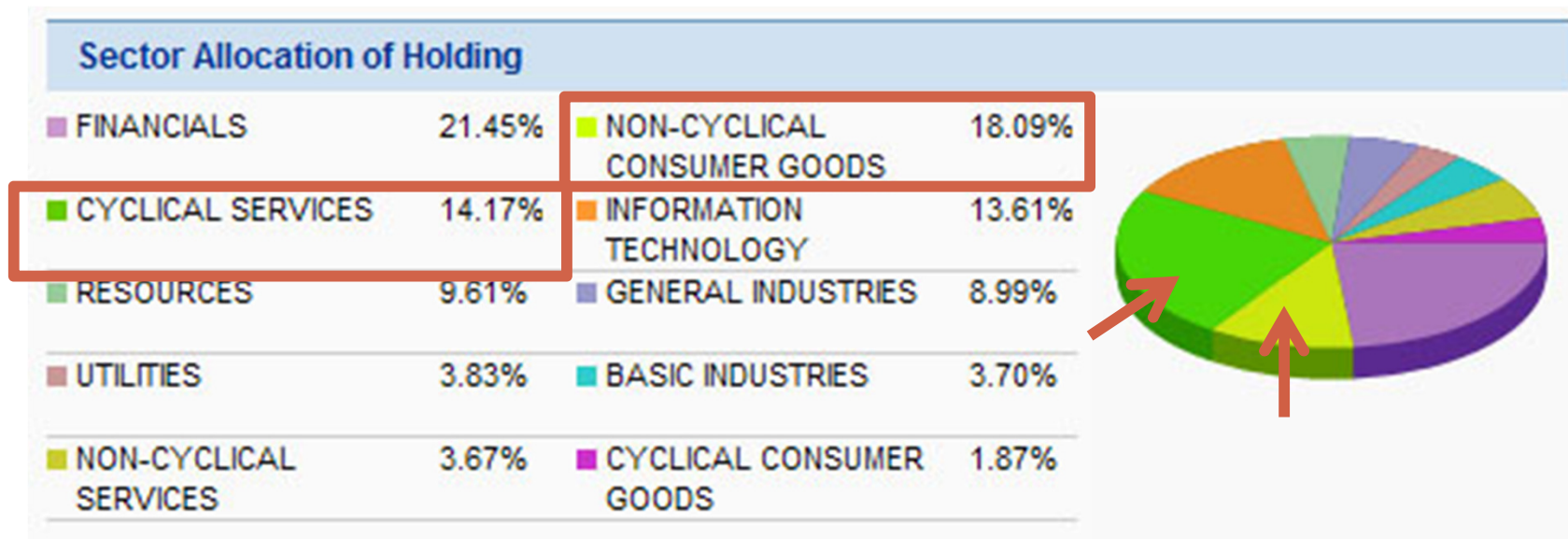
Radius

Area difference ~25%

$$85 / 165 = \sim 50\%$$

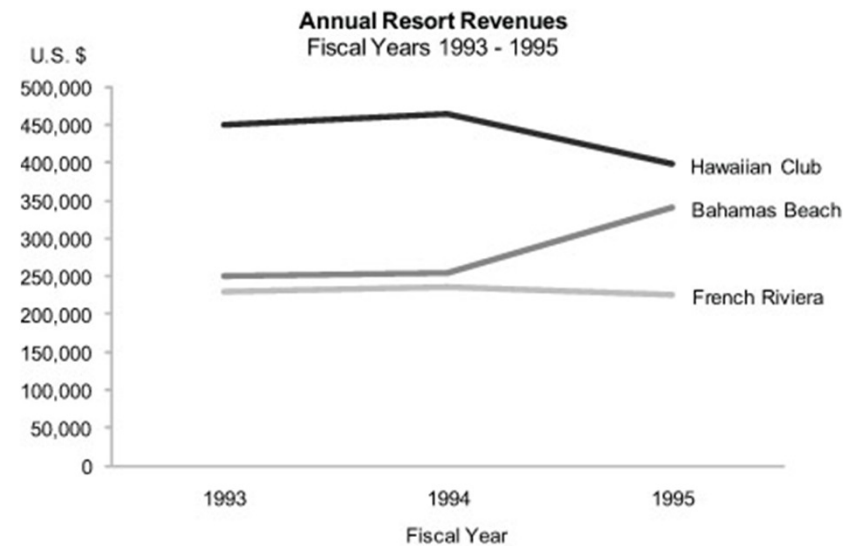
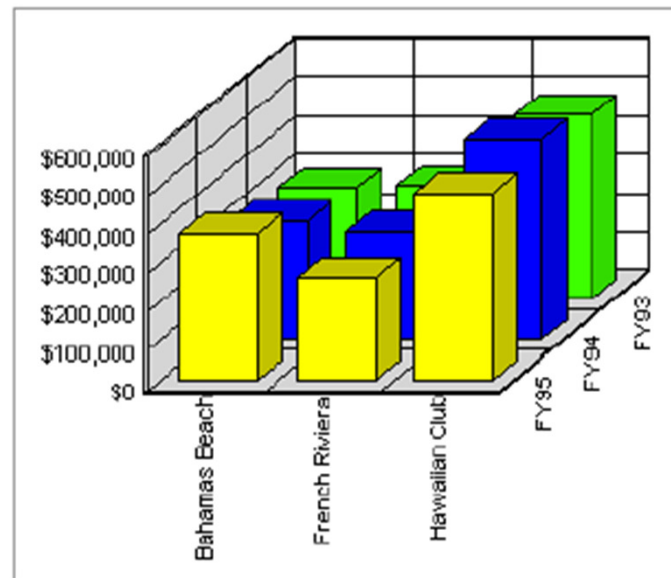
=> we should compare the radius / diameter !!
(but then why draw a circle?)

Problem here?



- Pie slices are difficult to compare in area
- There is likely a bug or error in the data
- Perspective distortion adds to the problem
- Colors are difficult to distinguish

Similarly...3D bar charts are not recommended

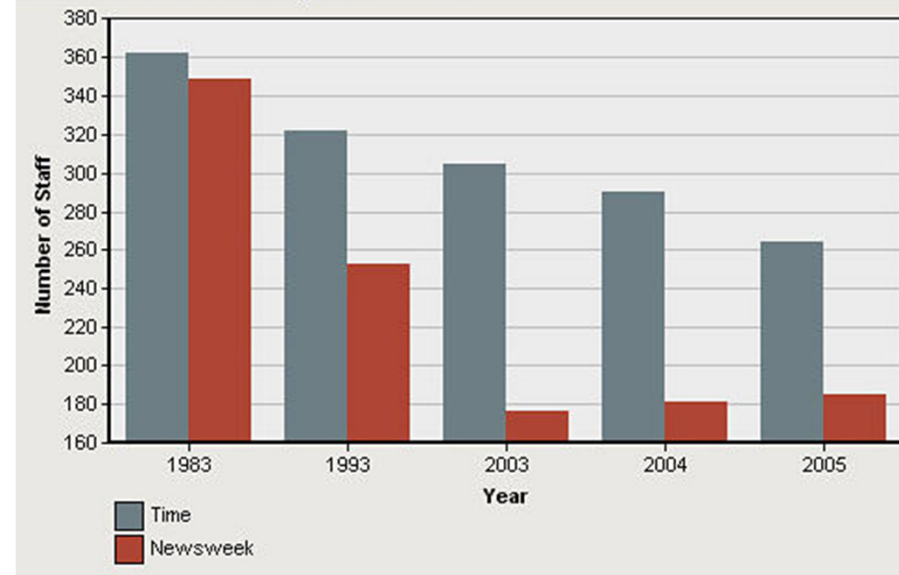


This is much easier to see and compare!

Problem here?

NEWS MAGAZINE STAFF SIZE OVER TIME

Time and Newsweek select years 1983 - 2005



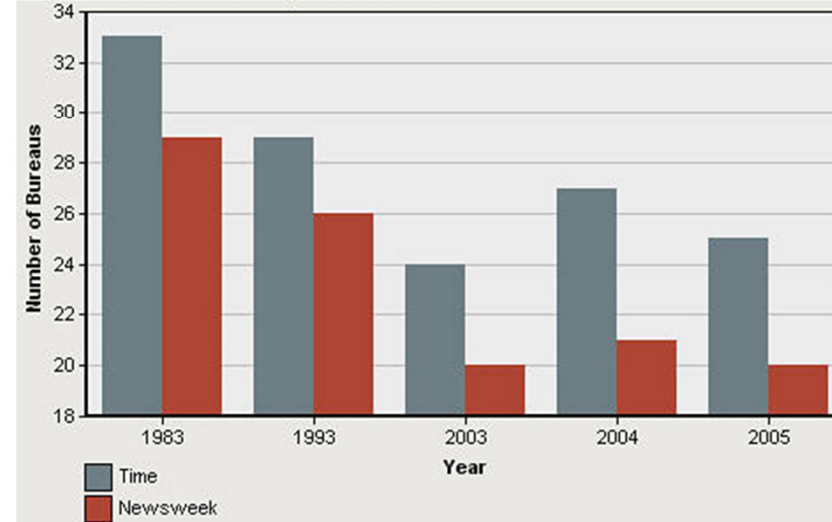
NUMBER OF CORRESPONDENTS IN BUREAUS OVER TIME

Time and Newsweek, select years 1983 - 2005

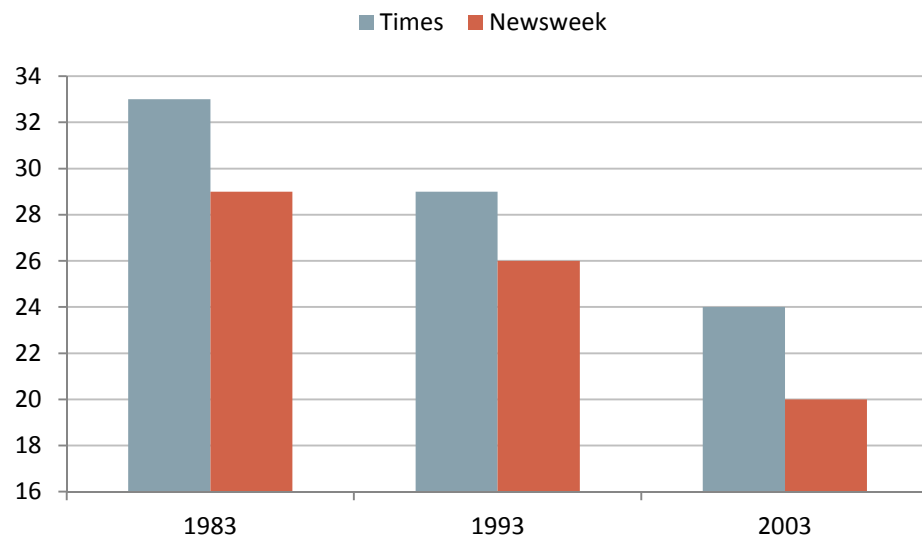


NEWS MAGAZINE BUREAUS OVER TIME

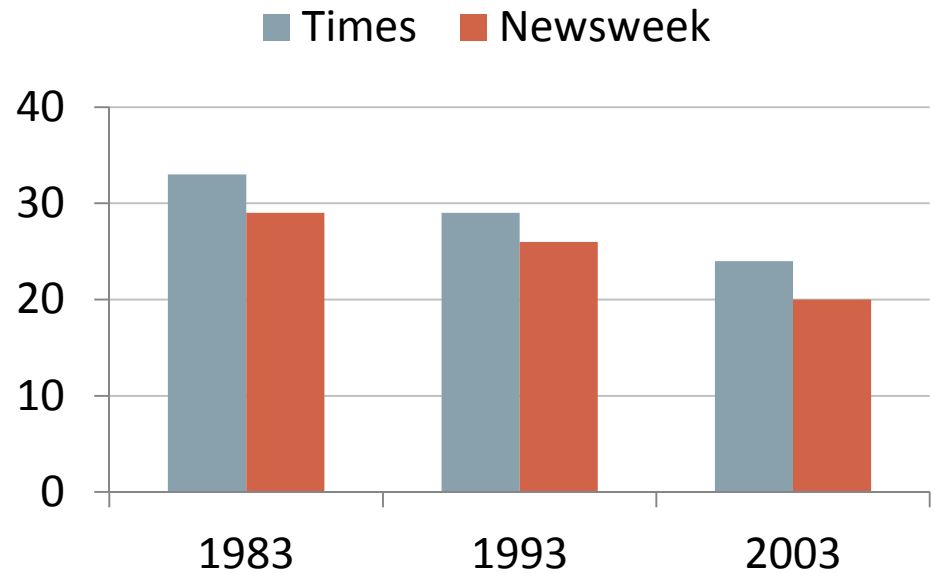
Time and Newsweek select years 1983 - 2005



Length Comparison



At first glance:
2003: Newsweek is 50% of Times

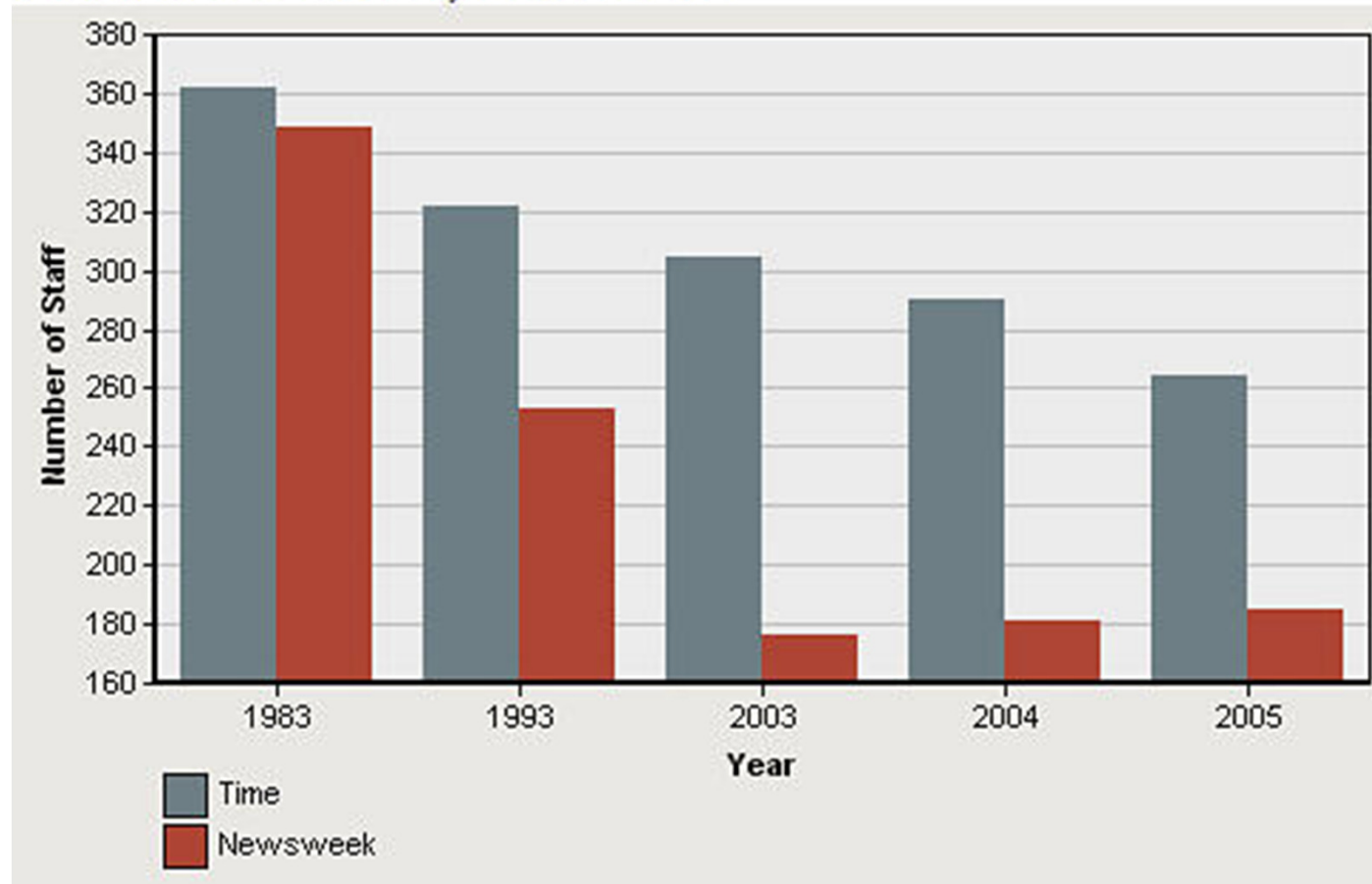


If we add a proper o:
2003: Newsweek is ~80% of
Times

Moreover...

NEWS MAGAZINE STAFF SIZE OVER TIME

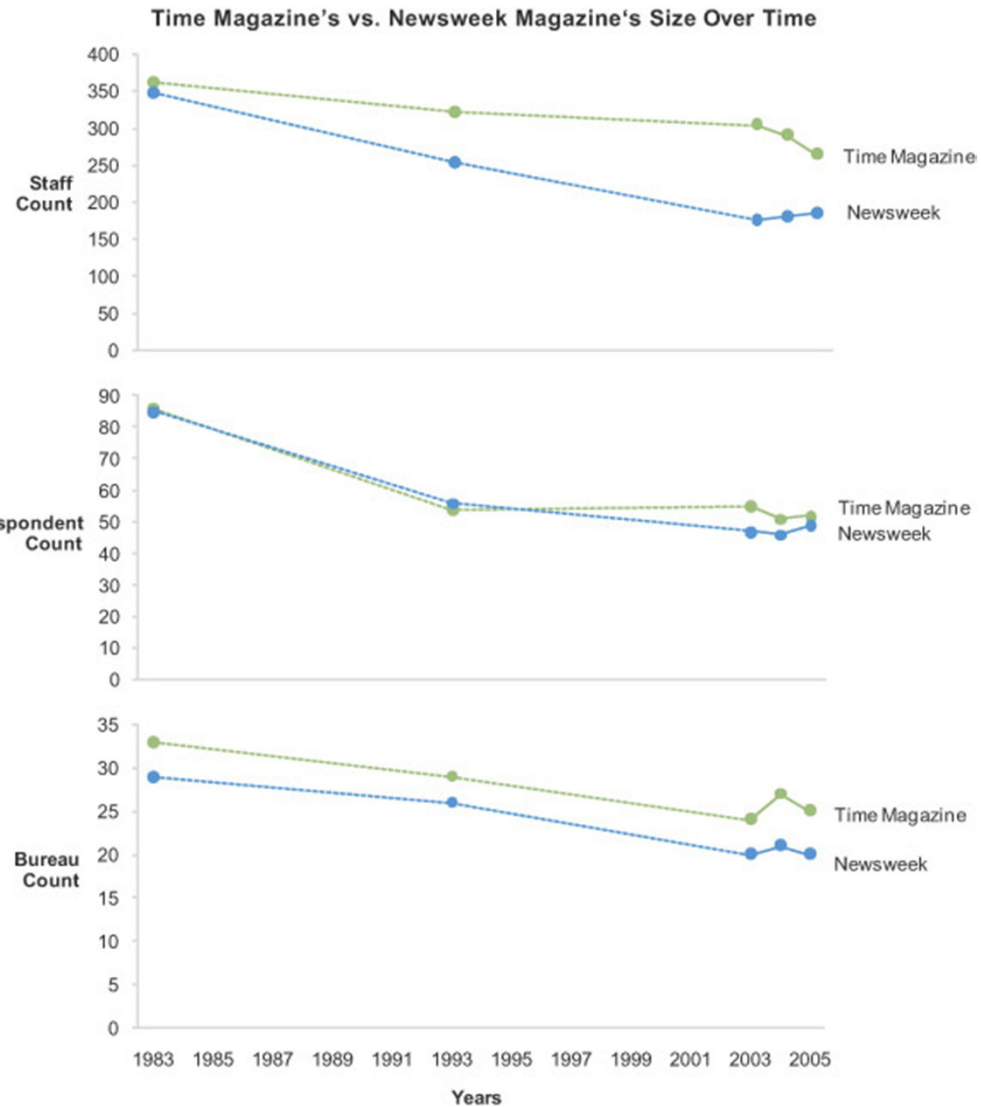
Time and Newsweek select years 1983 - 2005



10 years

1 year

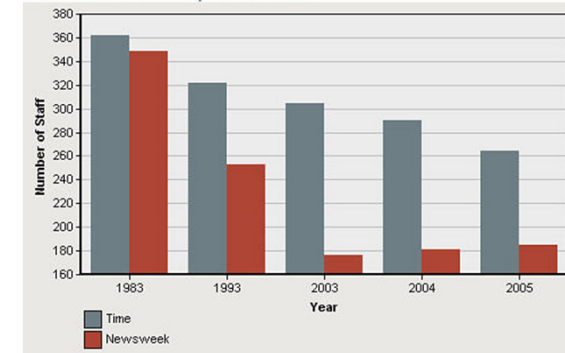
Redesign (by Stephen Few)



Note: A dashed line connecting two points indicates that there are years between the points for which values were not available. If the values were available, the shape of the lines might vary significantly.

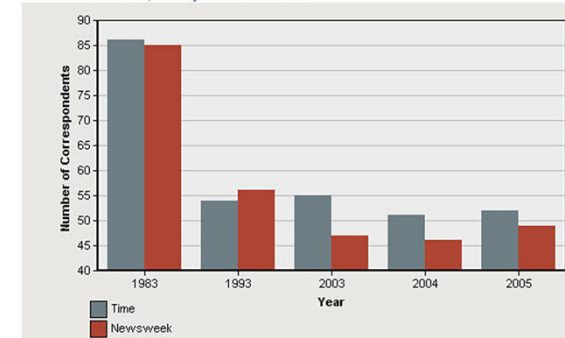
NEWS MAGAZINE STAFF SIZE OVER TIME

Time and Newsweek select years 1983 - 2005



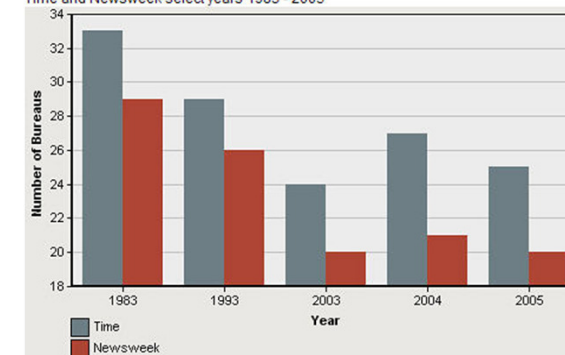
NUMBER OF CORRESPONDENTS IN BUREAUS OVER TIME

Time and Newsweek, select years 1983 - 2005



NEWS MAGAZINE BUREAUS OVER TIME

Time and Newsweek select years 1983 - 2005



Many more examples and critiques can be found:

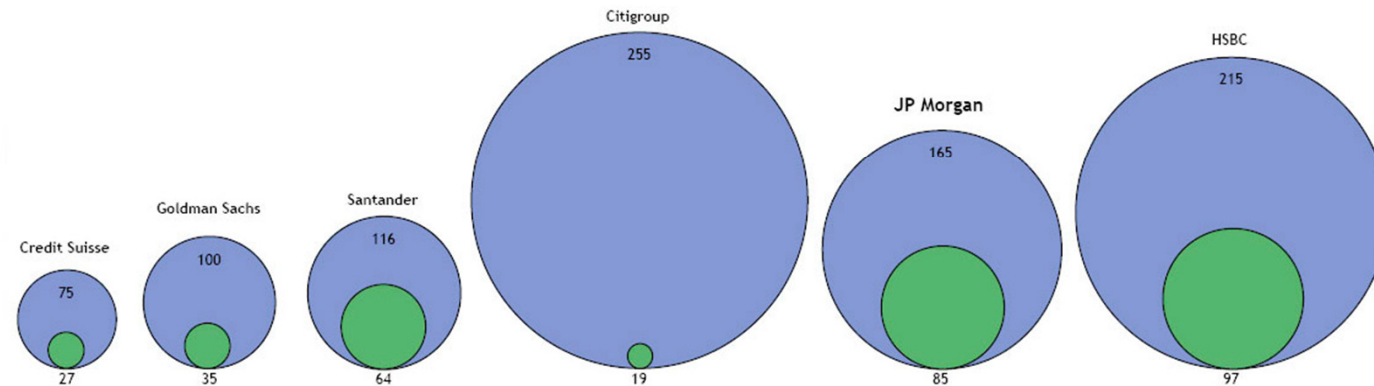
- In Stephen Few's books
- on his website <http://www.perceptualedge.com>
(where the previous examples are from)
- In Edward Tufte's books
- http://junkcharts.typepad.com/junk_charts/

Exercise

- ~20mins
- Re-design this graph
- Keep in mind what people would want to learn from this graph
- Provide brief reason for encoding

Banks: Market Cap

- Market Value as of January 20th 2009, \$Bn
- Market Value as of Q2 2007, \$Bn



J.P.Morgan

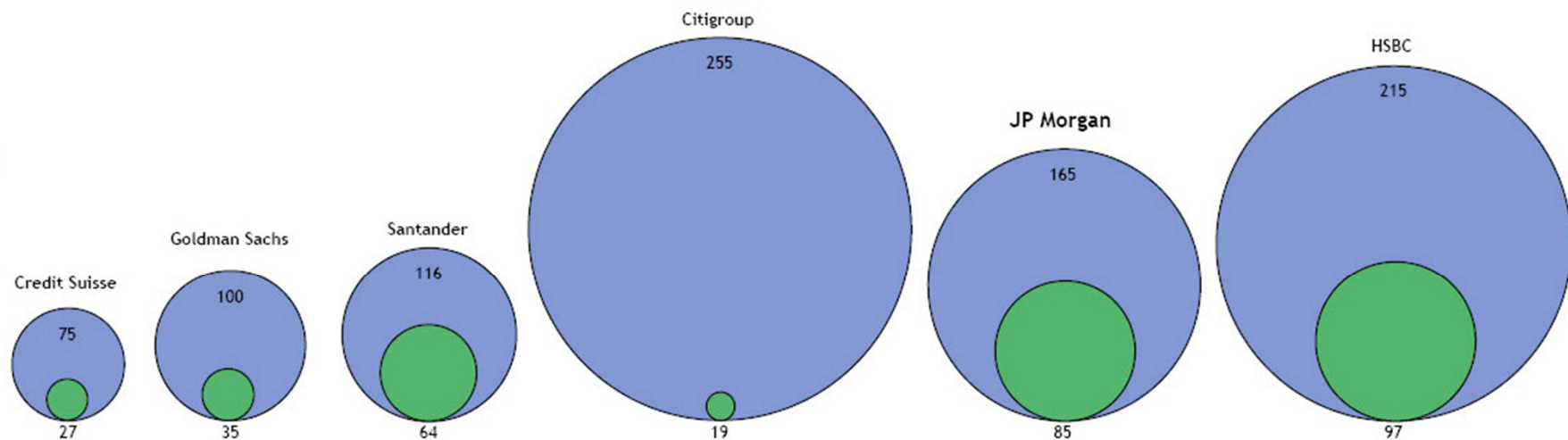
While JPMorgan considers this information to be reliable, we cannot guarantee its accuracy or completeness

Source: Bloomberg, Jan 20th 2009

Banks: Market Cap

● Market Value as of January 20th 2009, \$Bn

● Market Value as of Q2 2007, \$Bn

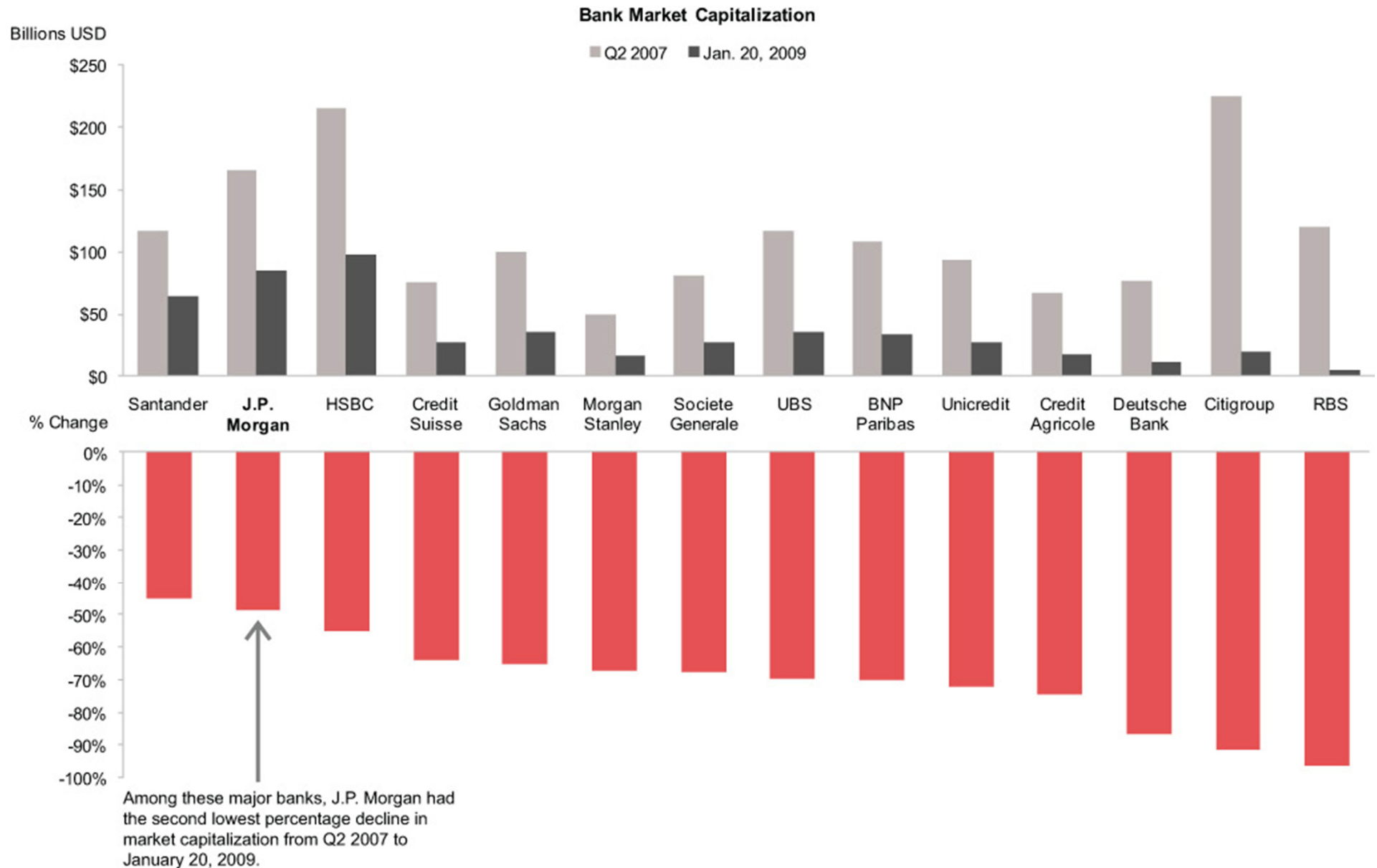


J.P.Morgan

While JPMorgan considers this information to be reliable, we cannot guarantee its accuracy or completeness

Source: Bloomberg, Jan 20th 2009

Stephen Few's Redesign



Short Break

- Summary
 - You saw that the vision system is **quicker and better** at detecting certain visual variables
 - Learned about the **effectiveness** of variables for encoding certain types of data
 - Learned to **critique basic data encodings**
- Next
 - Well known visualization techniques

INFORMATION VISUALIZATION TECHNIQUES

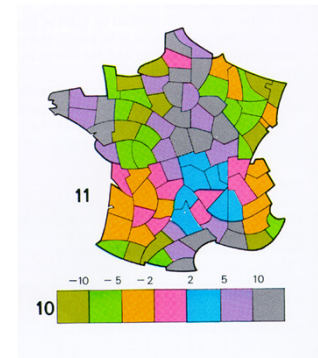
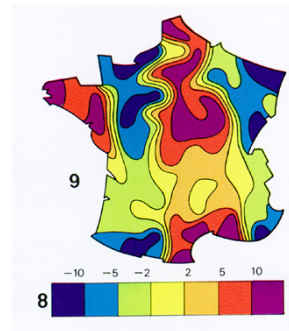
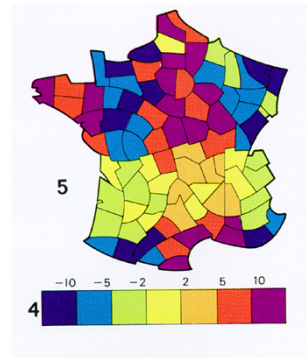
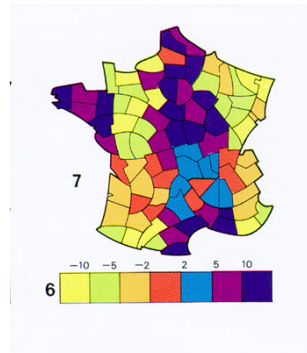
1D DATA

We have already talked about...

- How to encode 1D values with
 - length
 - position
 - value
 - size
 - texture
 - color
 - ...

Let's look a bit more in depth at...

- Color Scales
- So far you know:
 - Rainbow scales can be very harmful
 - Value changes in color are important

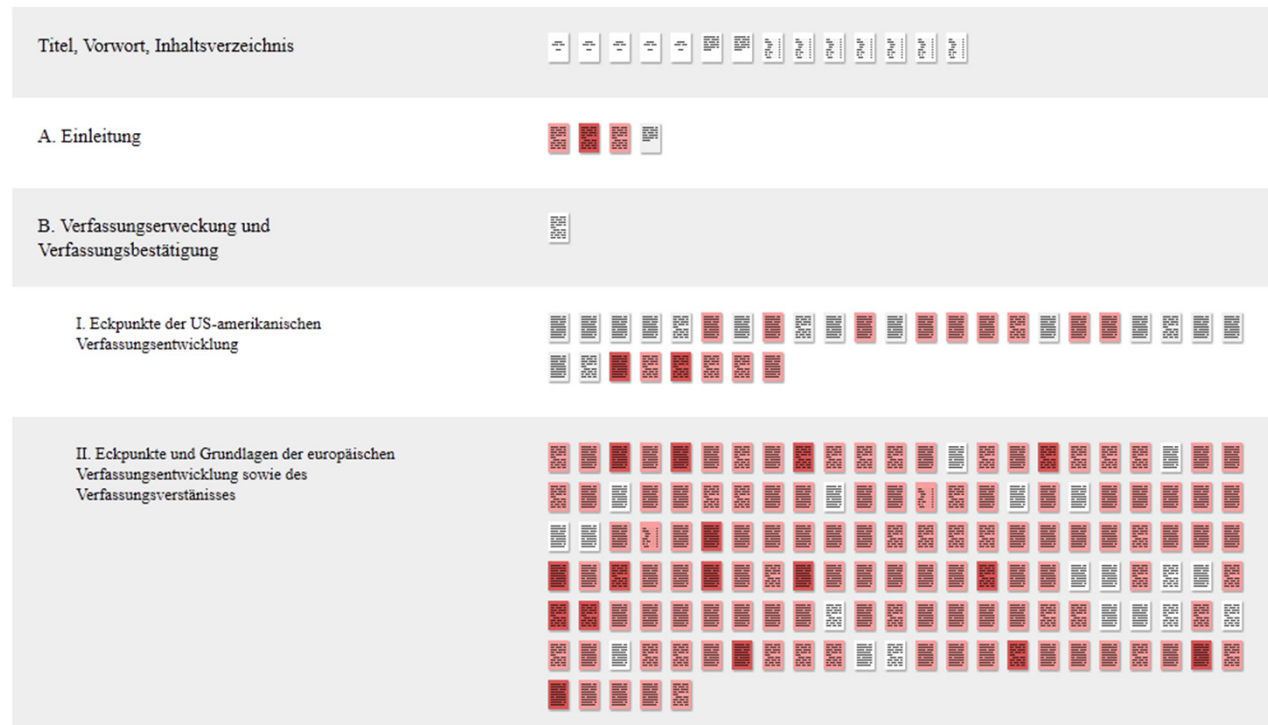


Color for Quantitative, Nominal, Ordered Data

Verfassung und Verfassungsvertrag Konstitutionelle Entwicklungsstufen in den USA und der EU

von Karl-Theodor Freiherr zu Guttenberg

Die farblich gekennzeichneten Seiten enthalten nicht ausgewiesene Zitate oder Plagiate aus anderen Veröffentlichungen.
Die dunkelroten Symbole kennzeichnen Seiten, auf denen Plagiate unterschiedlicher Quellen gefunden wurden.



Here:

Visualization of pages in the
Doctoral thesis of Germany's
former Defense Minister

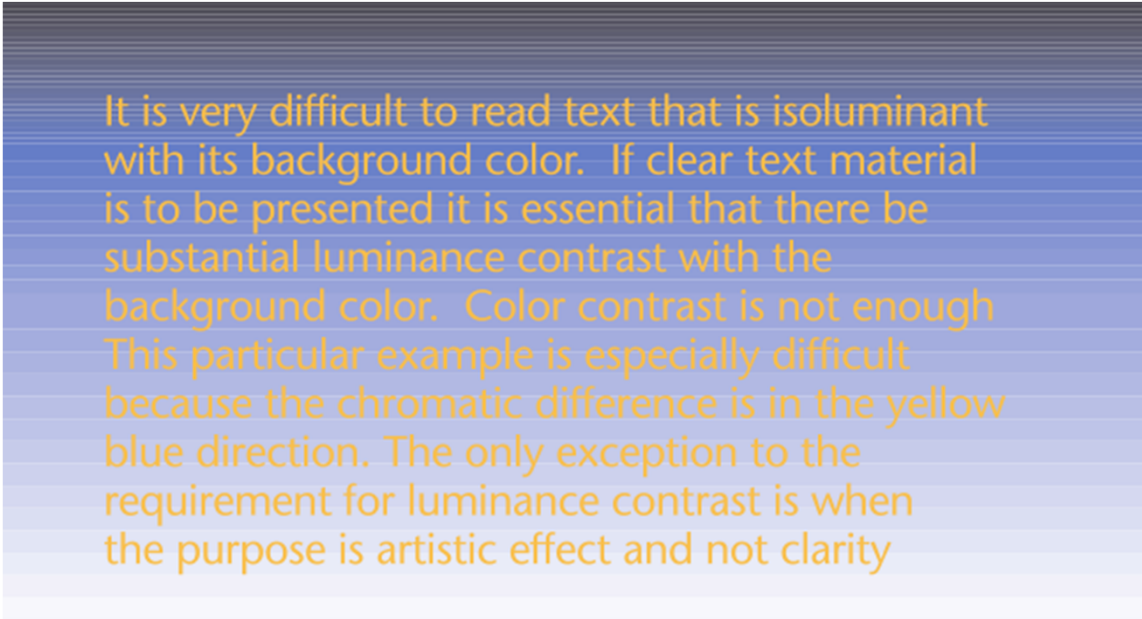
page with non-cited text
from one source

non-cited text from
several sources

Visualization helped to
show how much of the
thesis was plagiarized

More general rules about color

- Always have high luminance contrast between foreground and background



It is very difficult to read text that is isoluminant with its background color. If clear text material is to be presented it is essential that there be substantial luminance contrast with the background color. Color contrast is not enough. This particular example is especially difficult because the chromatic difference is in the yellow blue direction. The only exception to the requirement for luminance contrast is when the purpose is artistic effect and not clarity.

More general rules about color

- Always have high luminance contrast between foreground and background
- Use only few distinct colors



- > 12 colors will likely not work
- ~ 5 colors recommended

ColorBrewer <http://colorbrewer2.org/>

- Highly recommended resource
- Designed originally for maps but will also work well for other types of visualizations

number of data classes on your map

5

[learn more >](#)

the nature of your data

qualitative

[learn more >](#)

pick a color scheme: Paired



(optional) only show schemes that are:

- ☐ colorblind safe ☐ print friendly
☐ photocopy-able [learn more >](#)

pick a color system

166, 206, 227
31, 120, 180
178, 223, 138
51, 160, 44
251, 154, 153

☒ RGB ☐ CMYK ☐ HEX

adjust map context

☐ roads

☐ cities

☒ borders

select a background

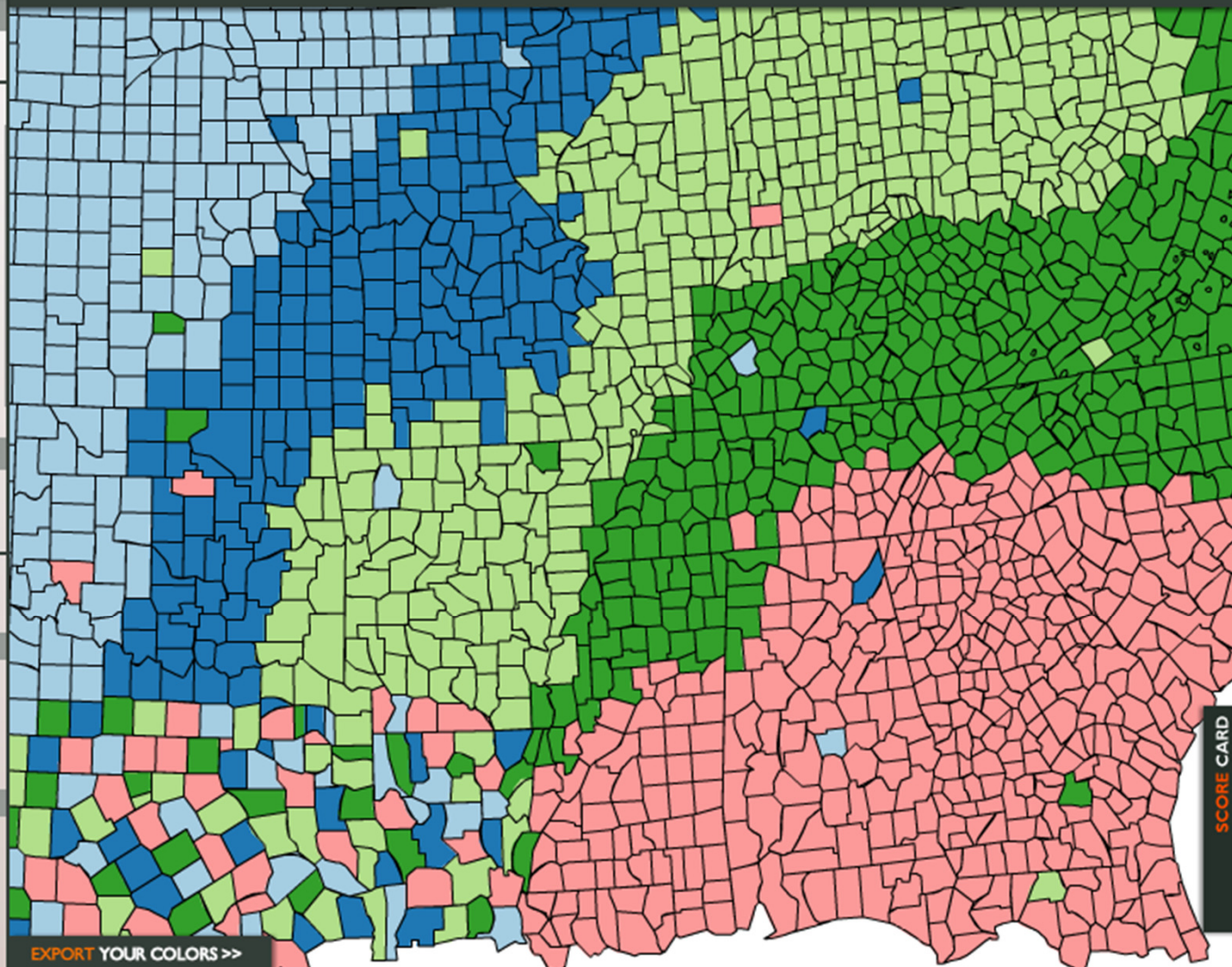
☒ solid color

☐ terrain

color transparency

[how to use](#) | [updates](#) | [credits](#)

COLORBREWER 2.0
color advice for cartography



[EXPORT YOUR COLORS >>](#)

SCORE CARD

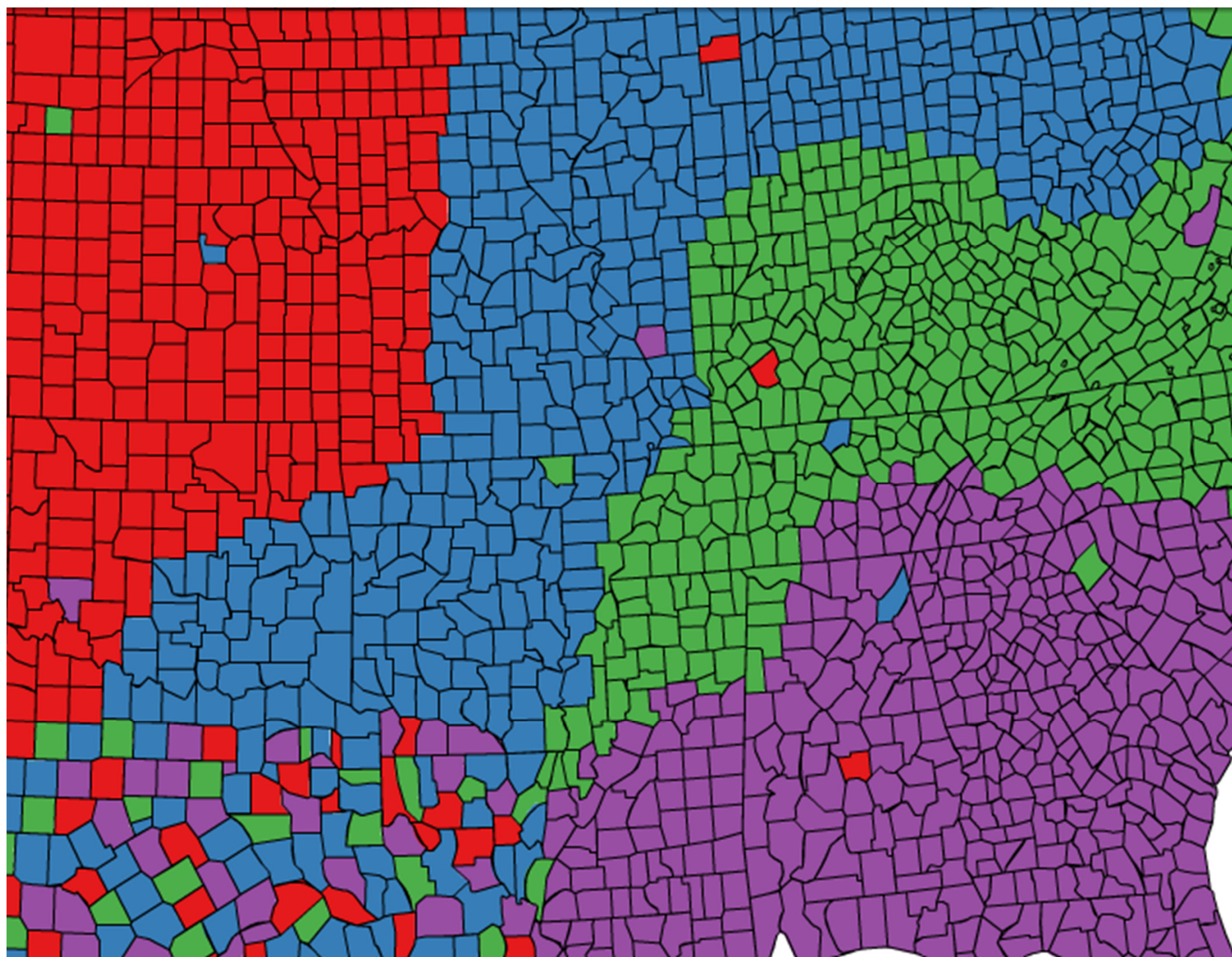
[learn more >](#)

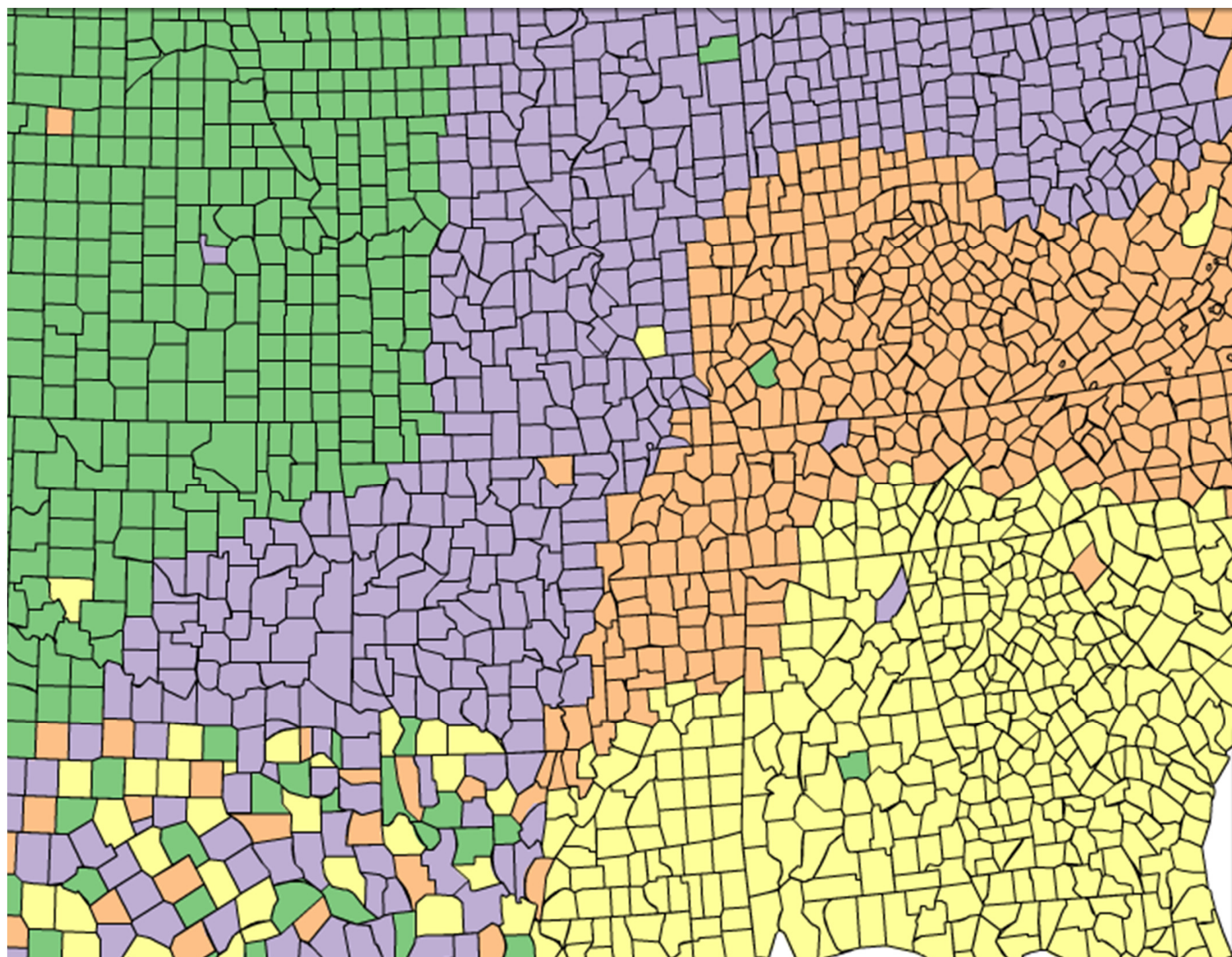
More general rules about color

- Always have high luminance contrast between foreground and background
- Use only few distinct colors
- Red, green, yellow, blue are hard-wired into the brain. Use them first.

More general rules about color

- Always have high luminance contrast between foreground and background
- Use only few distinct colors
- Red, green, yellow, blue are hard-wired into the brain. Use them first.
- For large areas use muted colors

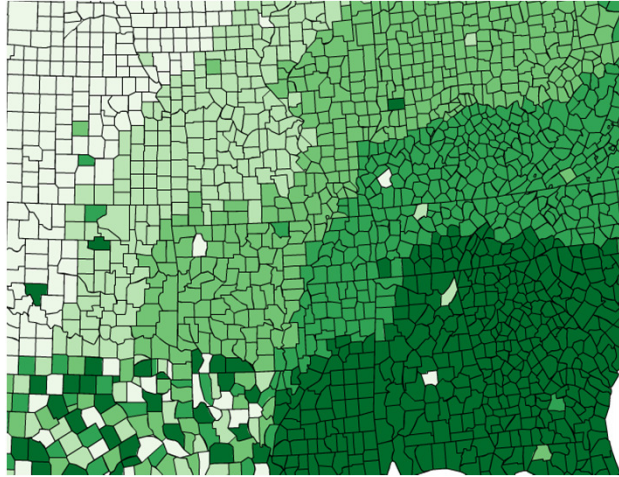




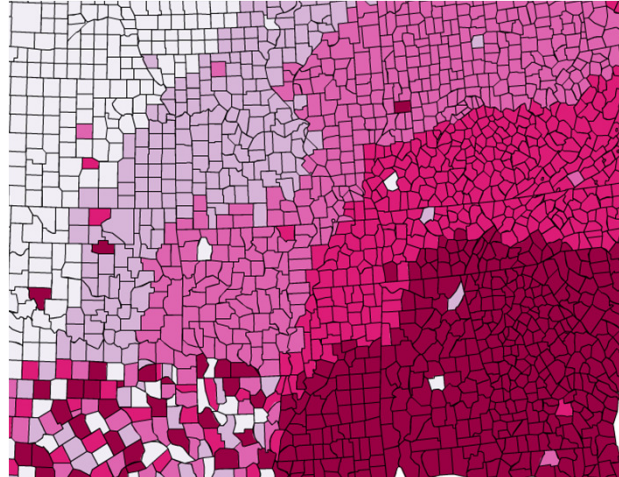
More general rules about color

- Always have high luminance contrast between foreground and background
- Use only few distinct colors
- Red, green, yellow, blue are hard-wired into the brain. Use them first.
- For large areas use muted colors
- When an ordering is required, recommended: red-green, yellow-blue, low saturation-high saturation, dark-light

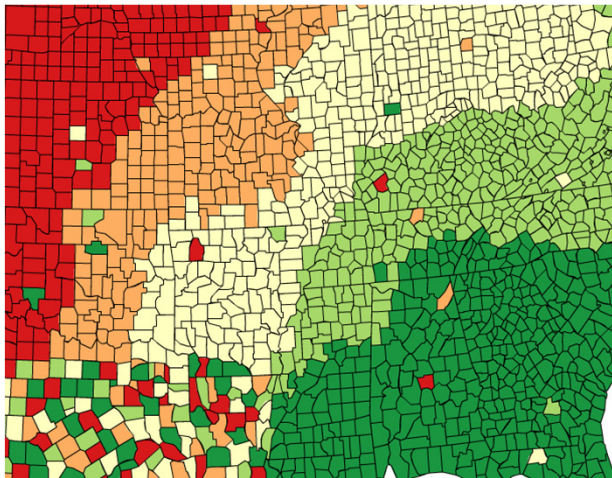
Ordered Color Scales



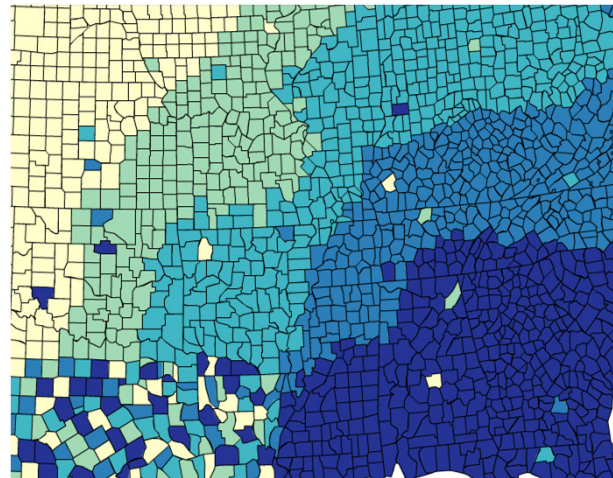
low - high saturation



dark-light



red-green



yellow-blue

If you use red-green 7% of the viewers may not see anything

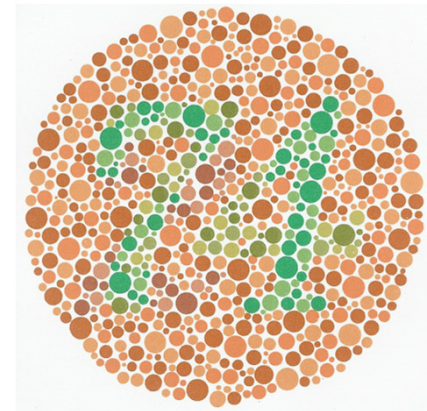
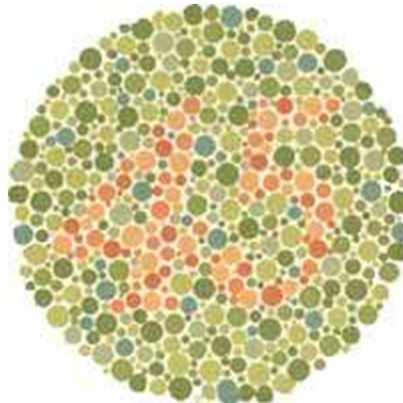
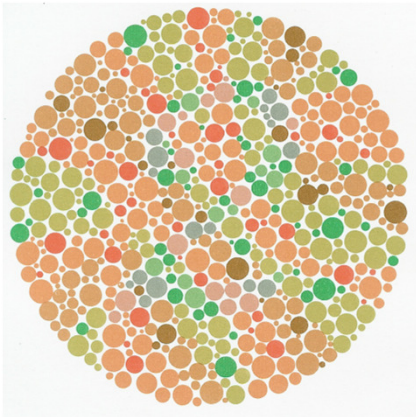
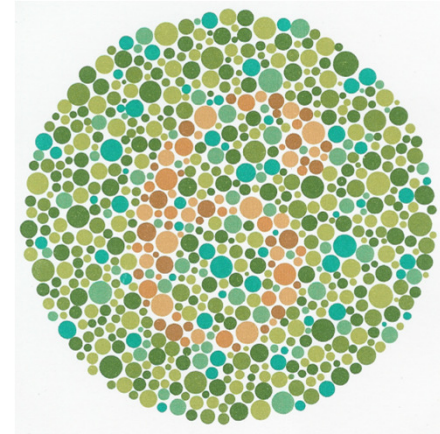
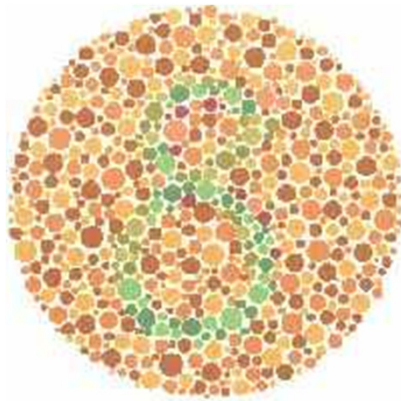
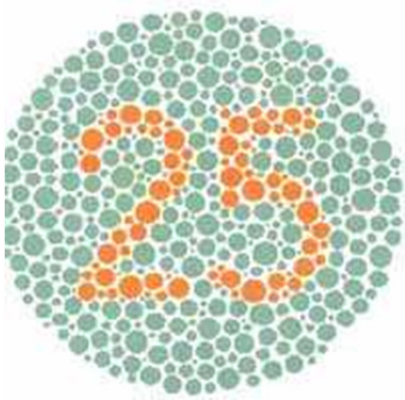
ONE WARNING ABOUT RED-GREEN

The following slides on the topic are adapted from Tobias Isenberg's

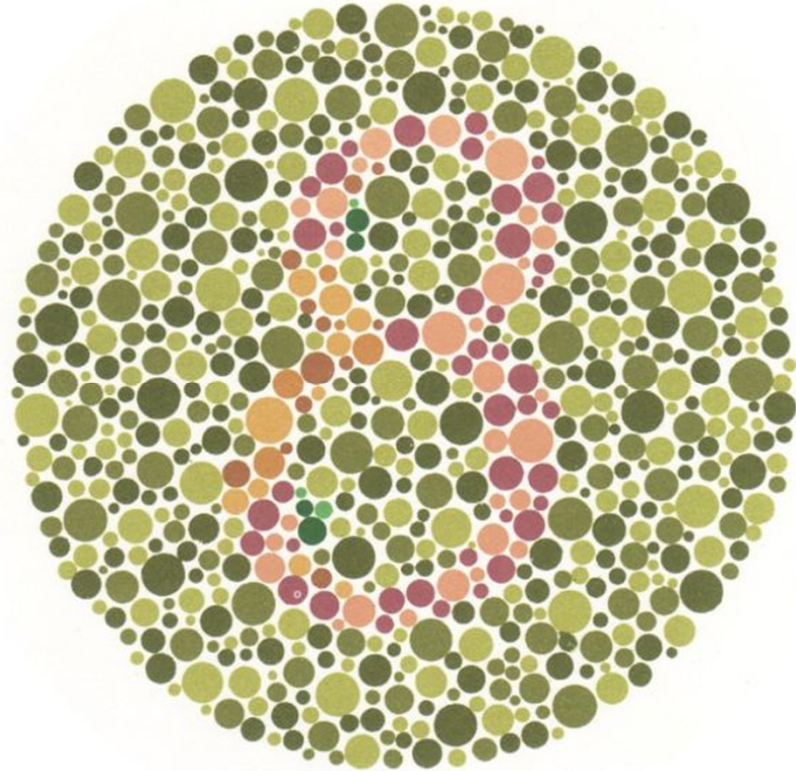
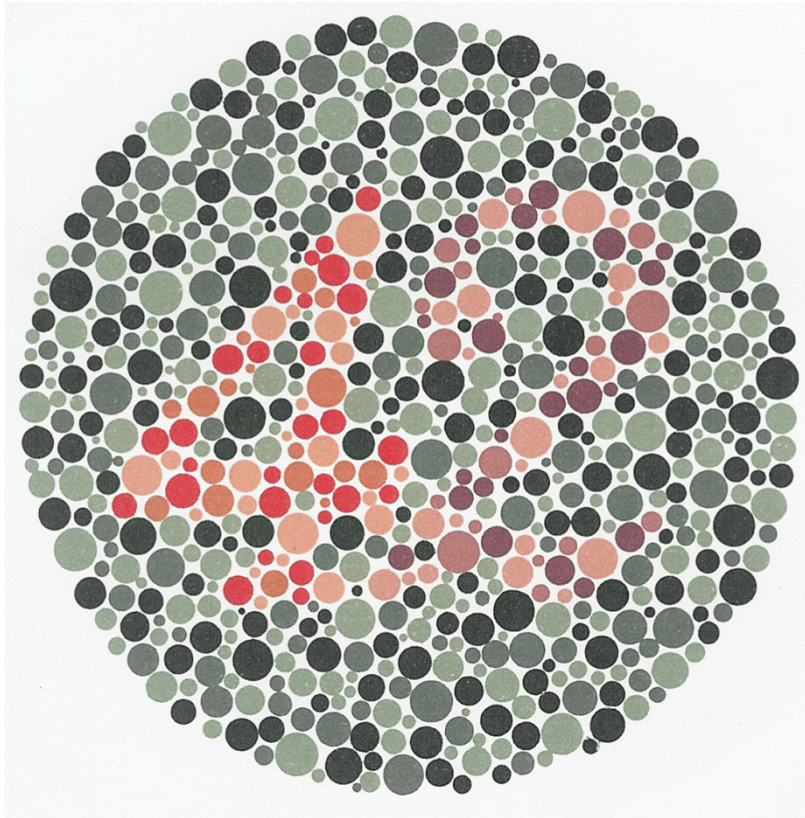
Color Deficiency

- ca. 7% of male population color-deficient
- mostly red-green color deficiency (Deuteranopy or Protanopy); other forms as well (e.g., Tritanope, very rare)
- avoid red-green color contrasts for visualization purposes!
- simulate: GIMP, <http://www.vischeck.com/>
- side note: there are (very, very few) people with more than three cone types

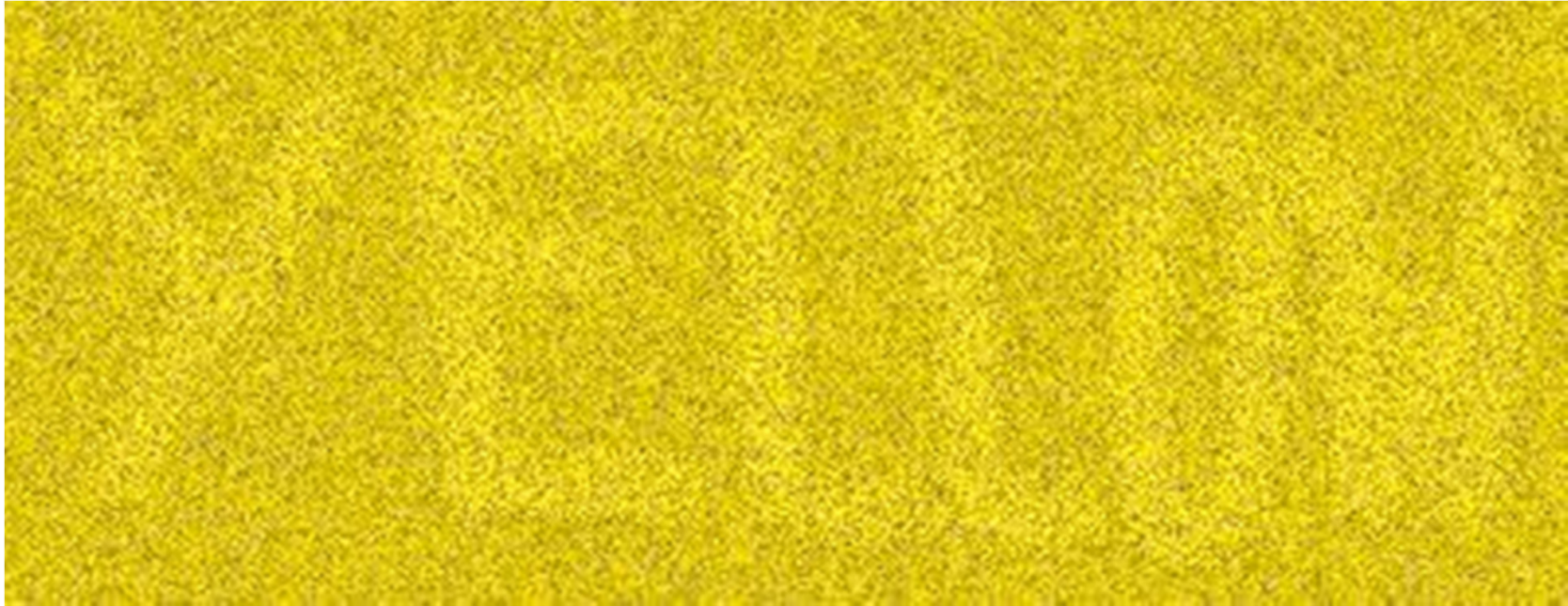
Color Deficiency Test



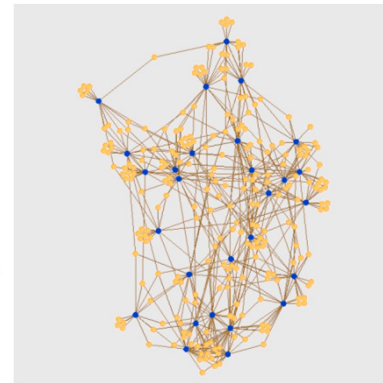
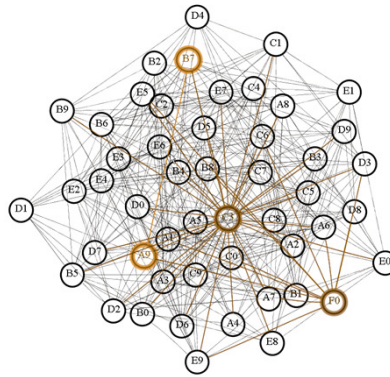
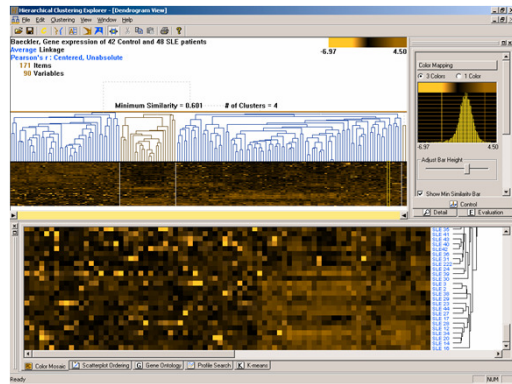
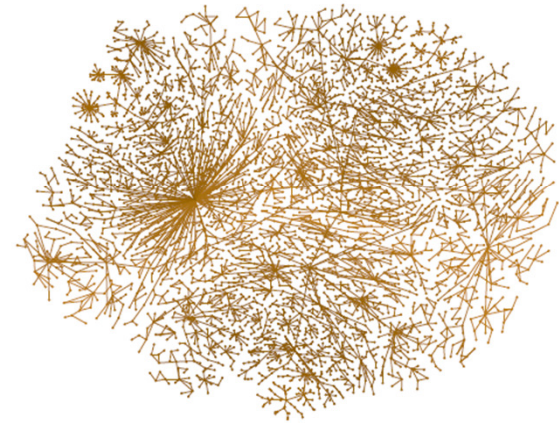
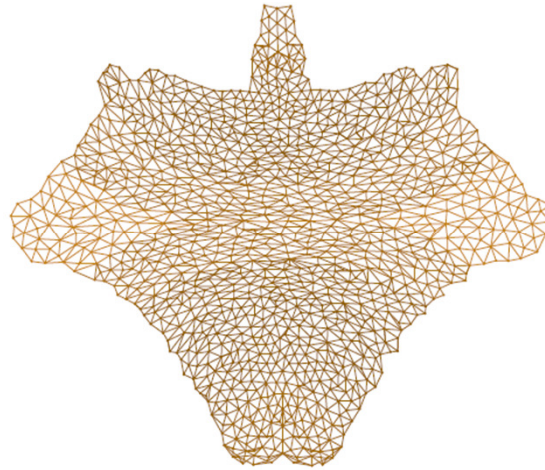
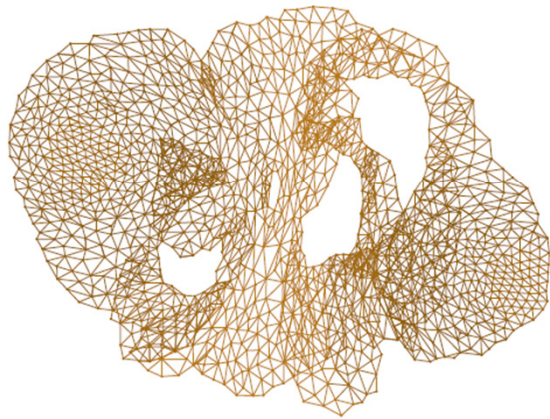
Color Deficiency Test



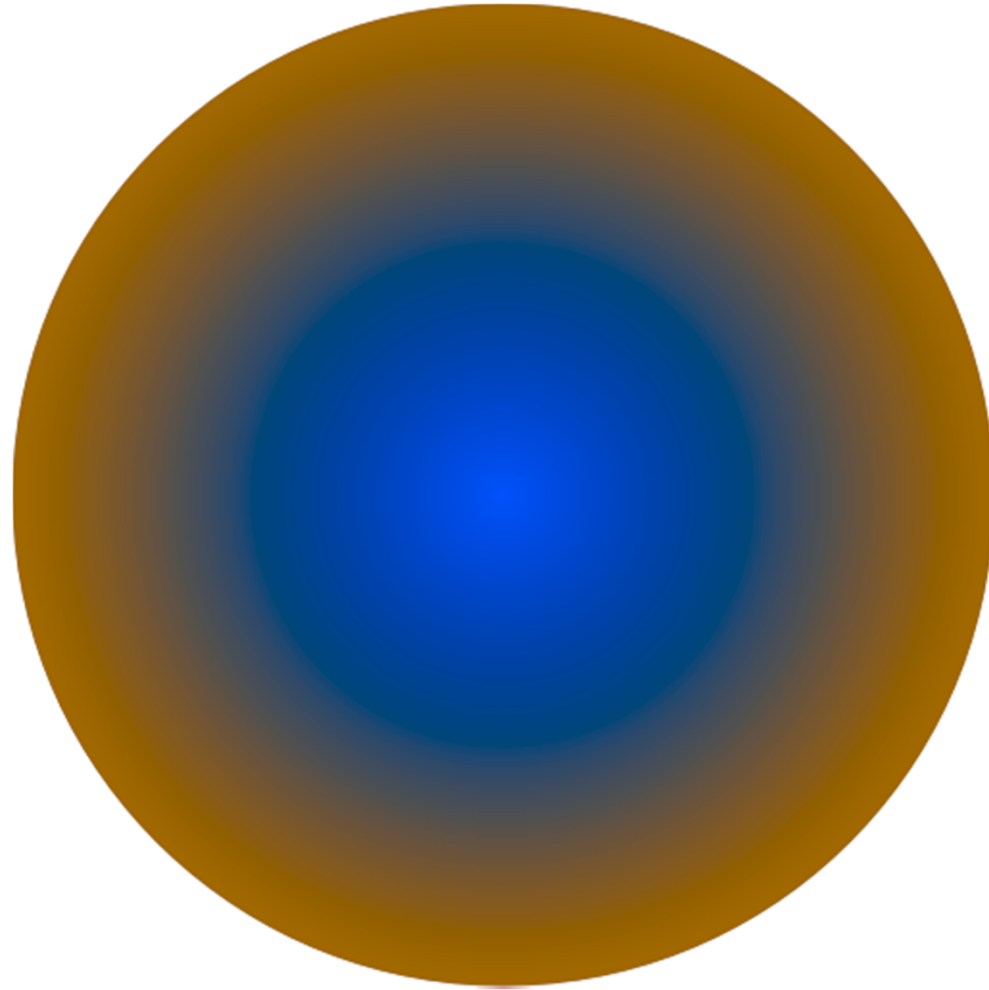
Color Deficiency



Examples from VIS/InfoVis 2004



Better: Red-Blue Contrast



More general rules about color

- Always have high luminance contrast between foreground and background
- Use only few distinct colors
- Red, green, yellow, blue are hard-wired into the brain. Use them first.
- For large areas use muted colors
- When an ordering is required, recommended: red-green, yellow-blue, low saturation-high saturation, dark-light
- **... there exist many many more specialized rules (when you get more advanced...)**

Visualization techniques for text and a few others for

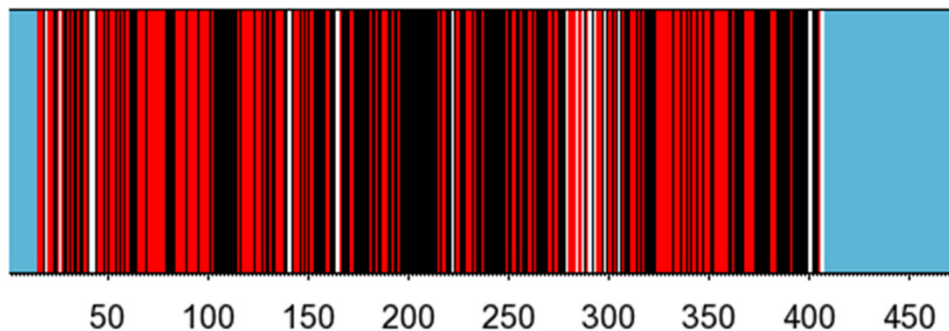
LINEAR DATA

Other Vis from the Guttenberg Plagiarism Wiki

- Very simple color+order visualization

1218 Plagiatsfragmente aus 135 Quellen
auf 371 von 393 Seiten (94.4%)
in 10421 plagiierten Zeilen (63.8%)

Note: I do not think the colors are well
chosen



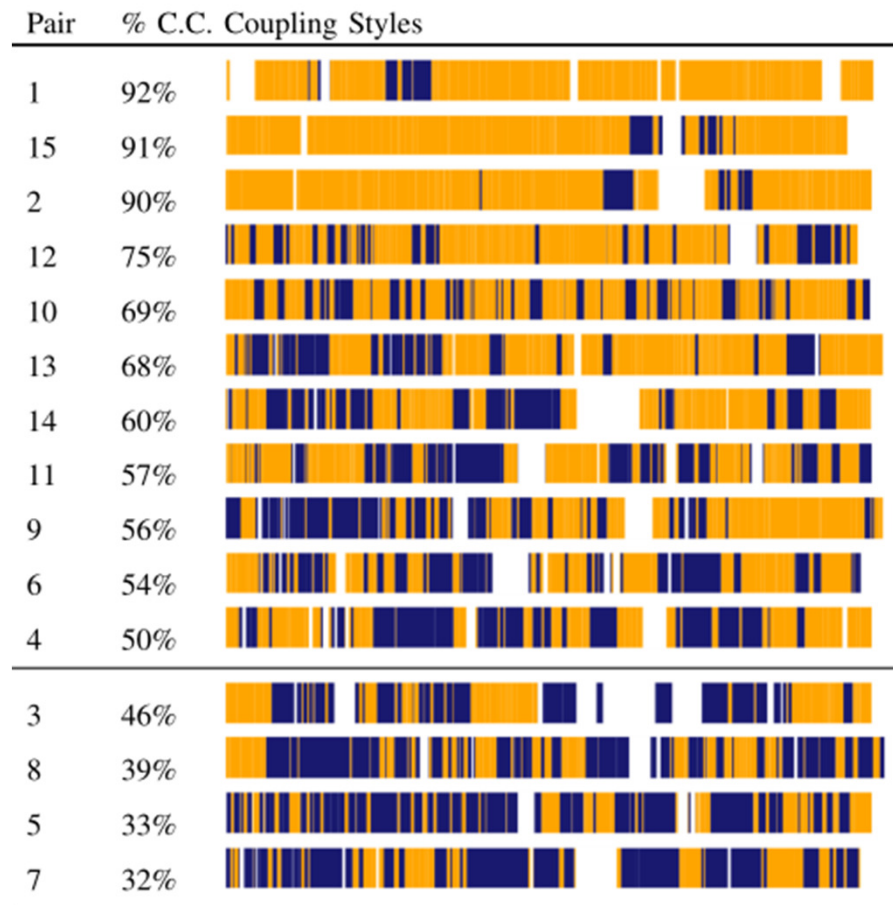
Stand: 03.04.2011 11:55 Uhr

- Seiten, auf denen Plagiate gefunden wurden
- Seiten mit Plagiaten aus mehreren Quellen
- Seiten, auf denen bisher keine Plagiate gefunden wurden
- Das Inhaltsverzeichnis (Seiten 1-14) und die Anhänge (ab Seite 408) wurden nicht bei der Berechnung des Prozentualwertes mit einbezogen

- pages with plagiarism
- pages with plagiarism from >1 source
- pages without plagiarism
- pages not counted in % plagiarized
e.g. TOC & Appendix

More examples

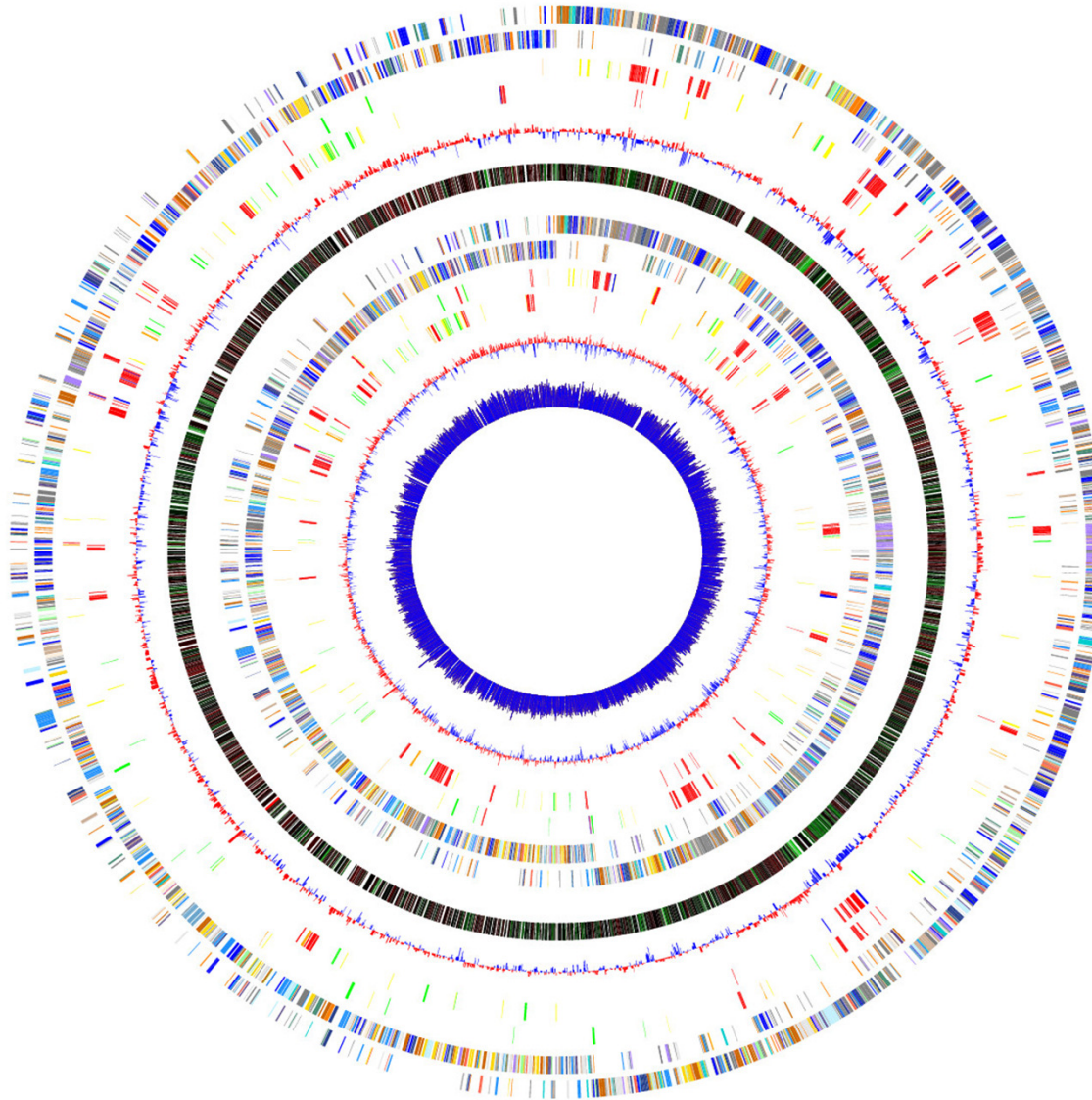
- Useful for comparison



E.g. to compare the behavior of groups over time

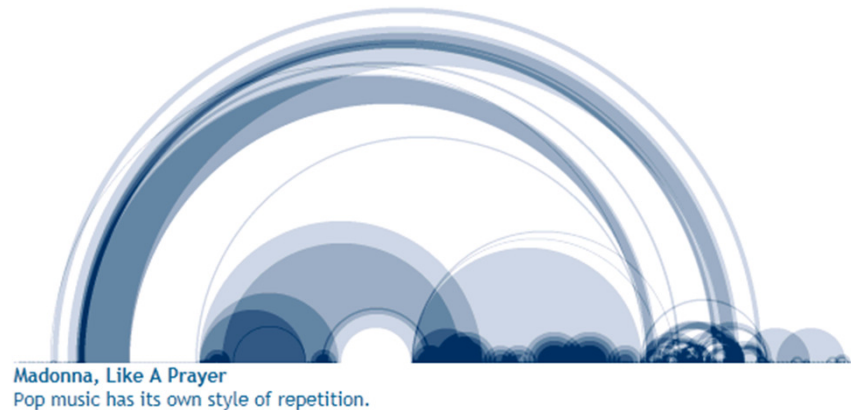
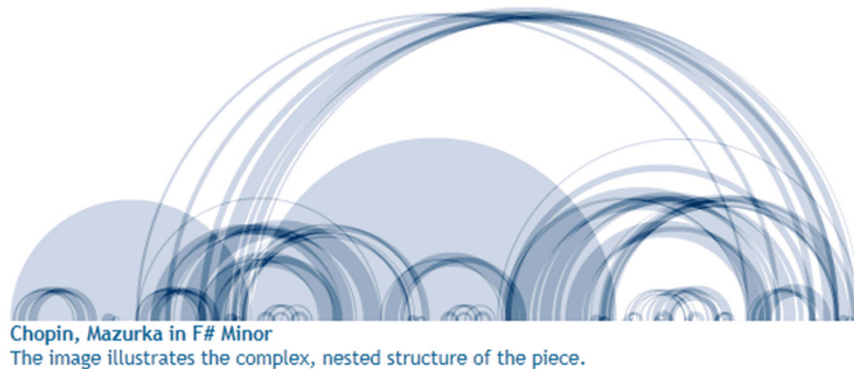
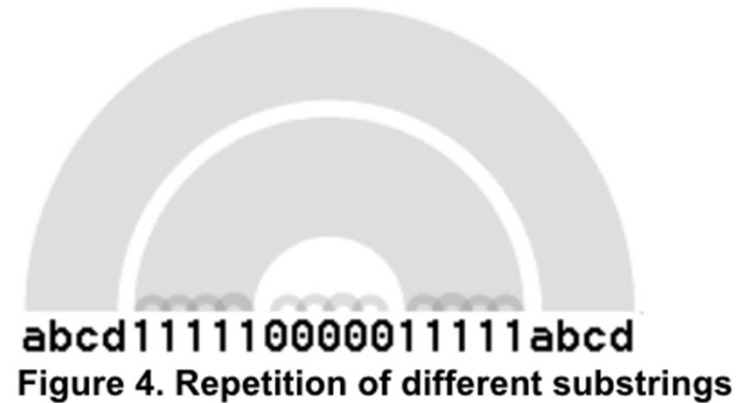
<- according to two main behavior types (one in blue and one in yellow)

GenomeViz

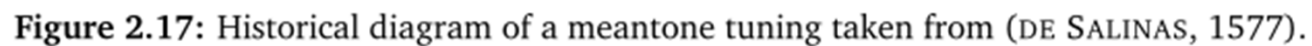


- Comparison of several 1D viz in one view
- Genomic data makes sense in a circle

ArcDiagrams



- Very old idea applied to current data

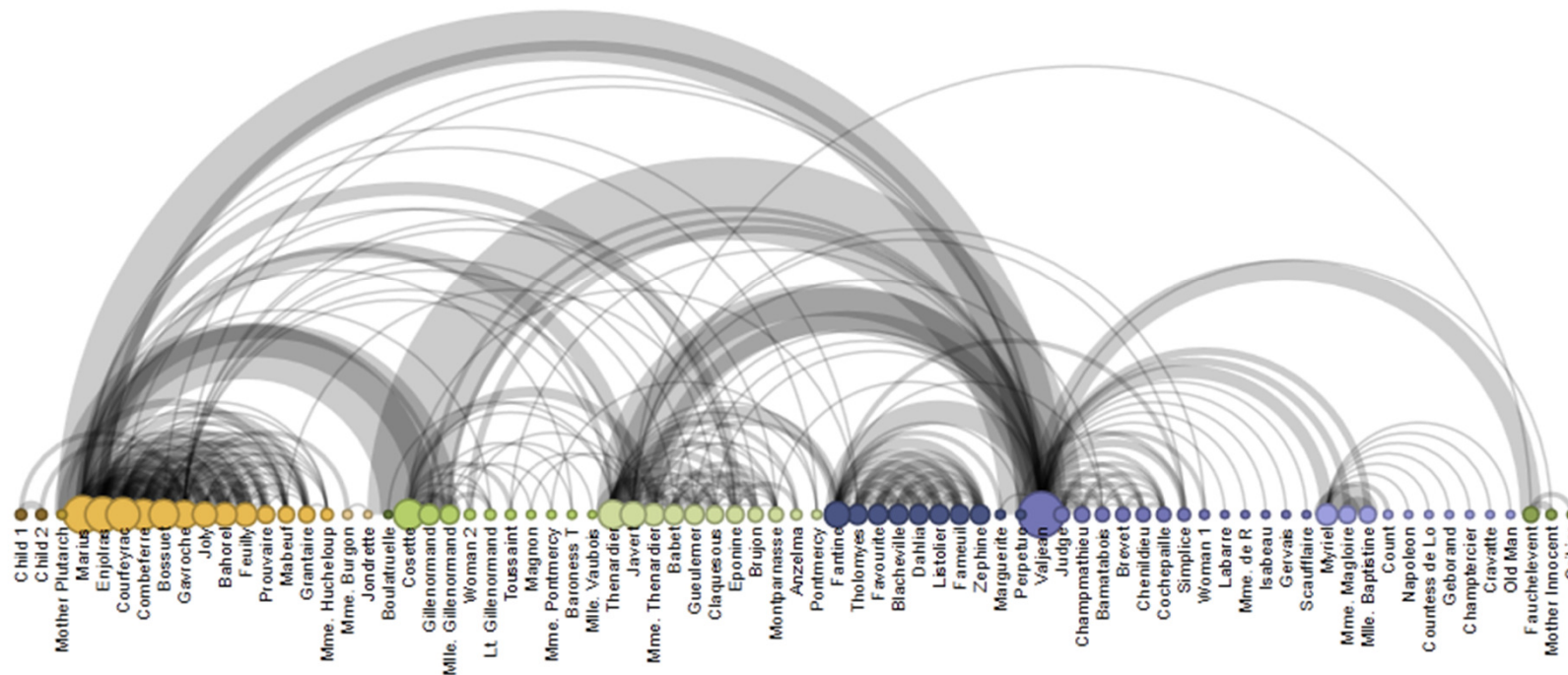


ArcDiagrams

- Can be easily extended

character co-occurrence
in the chapters of Victor
Hugo's classic novel, *Les
Misérables*

Arc Diagrams

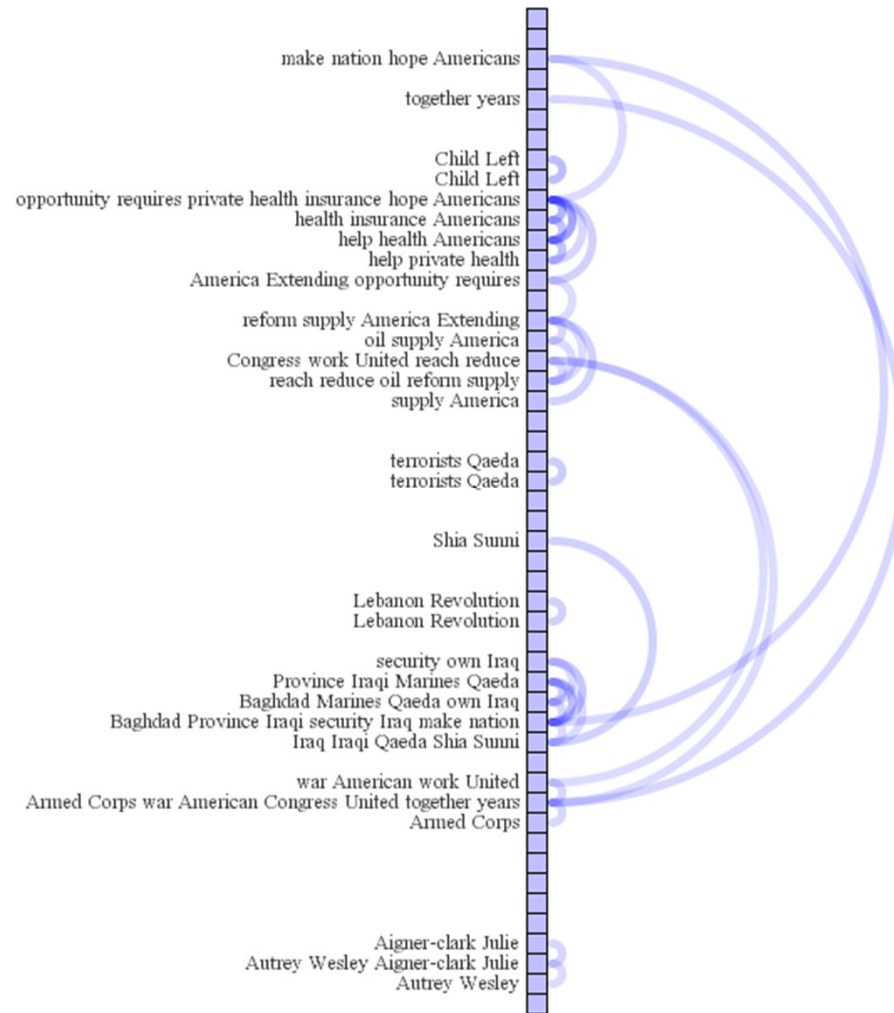


Note that this is actually a graph data structure.
(More on graphs later)

DocumentArcDiagrams

State of the Union Address, 2007

? Click on question mark to load a new file...



Similarity within a text document

Similarity Arcs

ThreadArcs

ReMail

File Edit View Help

Inbox

Time	Who	Subject
6:35	Andrew Bognar	RECEIVED: GD
6:56	Charlie Boone	Lets get the paper done before March
7:20	Chi-chung Hui	Management Report: Highlights Due 27
7:23	Fredrick Mathe	Researchers: Quick exercise in reviewing
8:34	Gabrielle Camp	Just remembered - have to drop my car at mechanic
9:04	Hue Sun Chan	The Remail Design Spec
9:34	Joseph Cordes	Re: Thread visualization
9:45	Keith Owen	MRC has gone bonanzas...Act now to take advantag
10:32	Lucy Osborne	Re: Hardware changes a turnoff
1:15	Marc Shulman	see you at the UCM meeting
2:56	Margaret Downie	Local company integrating with email
3:30	Nathan Lawer	Tanya working from home
4:08	Paul Steipe	still open after the meeting <eom>
4:55	Regina Hendricks	Re: Just meet on thursday
5:13	Simon Robertson	Reminder from Managers meeting tomorrow
5:23	Steven Rossant	Agenda and action items to follow (eom)
5:35	Tanya Keye	Server - minor change
5:40	Margaret Downie	Amazon.com Delivers Dance & DJ Music
5:45	Nathan Lawer	Re: Hardware changes a turnoff
6:16	Rich Steipe	in a talk by Techtonic
6:20	Nathan Lawer	Re: Researchers: Quick exercise in reviewing June
6:26	Jennifer Combs	Interesting talk by Bernard Kerr
6:34	Regina Hendricks	Current Server 1.0
6:40	Marc Shulman	Re: I'm for Tue July 10th - after 10am - not 1-2pm
6:44	Jennifer Combs	you interested in a talk by Techtonic (local company)
6:59	Jennifer Combs	RE: are you Interested in a talk by Informio

9:00am Wednesday, April 17, 2003

Re: Design of threads viz

From Tanya Keye **To** Margaret Doe **Cc:** Rich ...

Guys:

Thanks for all the dicussion around the new design I think that the changes you made will greatly improve the user experience.

We still need to talk about how we plan to install the coding development on each of

Thread View



Nathan Contributors

Participants

- contributors:
 - Tanya Keye
 - Margaret Doe
 - Nathan Lawer
 - Rich Steipe
- recipients:
 - Jennifer Combs
 - Marc Shulman

Design of threads viz (16)

Tanya Keye	Design of threads
Margaret Doe	+looking good
Tanya Keye	+Guys: Thanks
Nathan Lawer	+can you change
Paul Steipe	Great Re: Design
Nathan Lawer	+Tanya I think
Tanya Keye	+Ok with me.
Rich Steipe	Let's make the
Nathan Lawer	Ok Re: Let's mak

January 2 - April 20, 2003

3

[About](#)

Read

<http://www.textarc.org/>

TextArc

Alice

Show concordance

Show text Project Gutenberg header

Download thesaurus

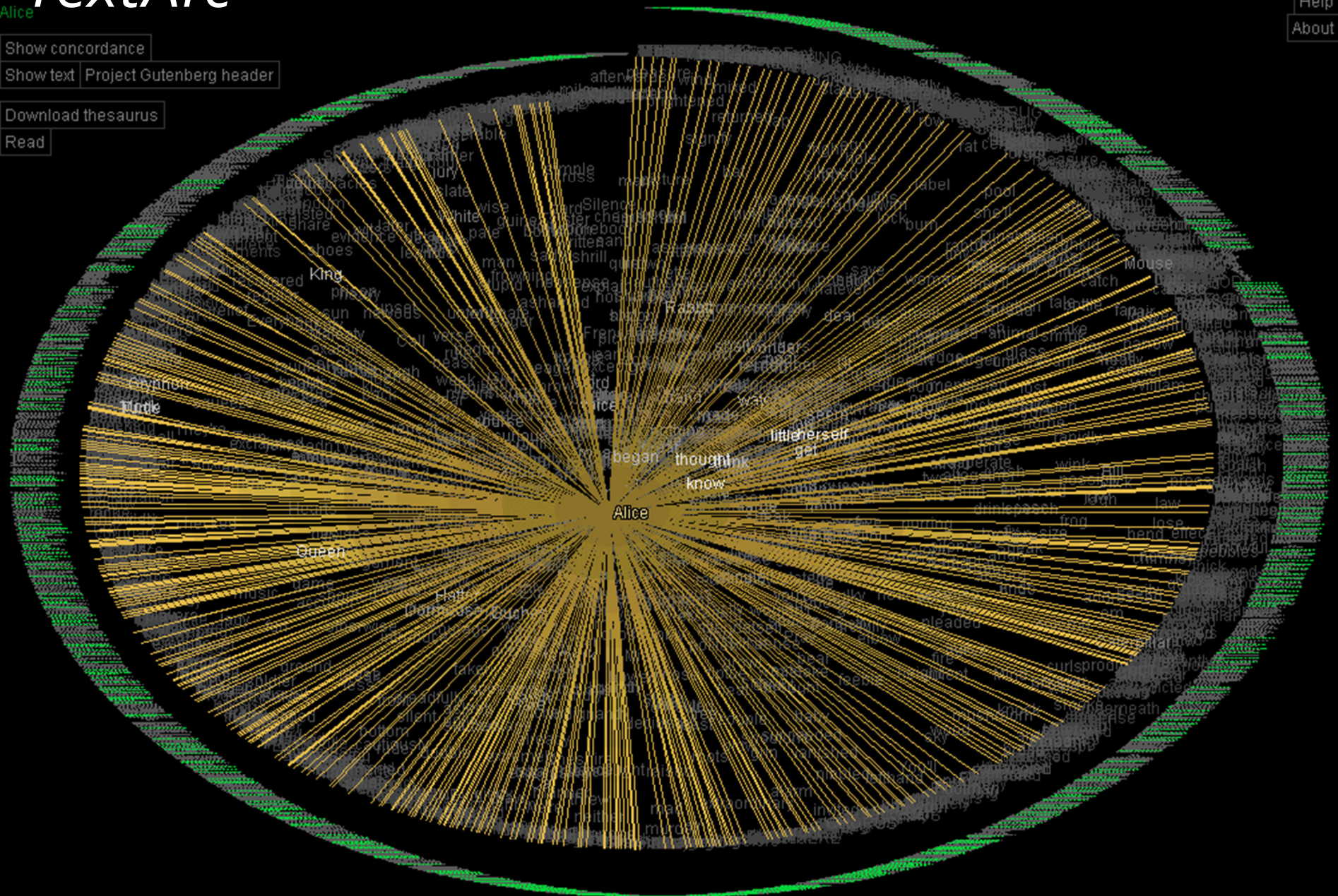
Read

Alice's Adventures In Wonderland

X

Help

About

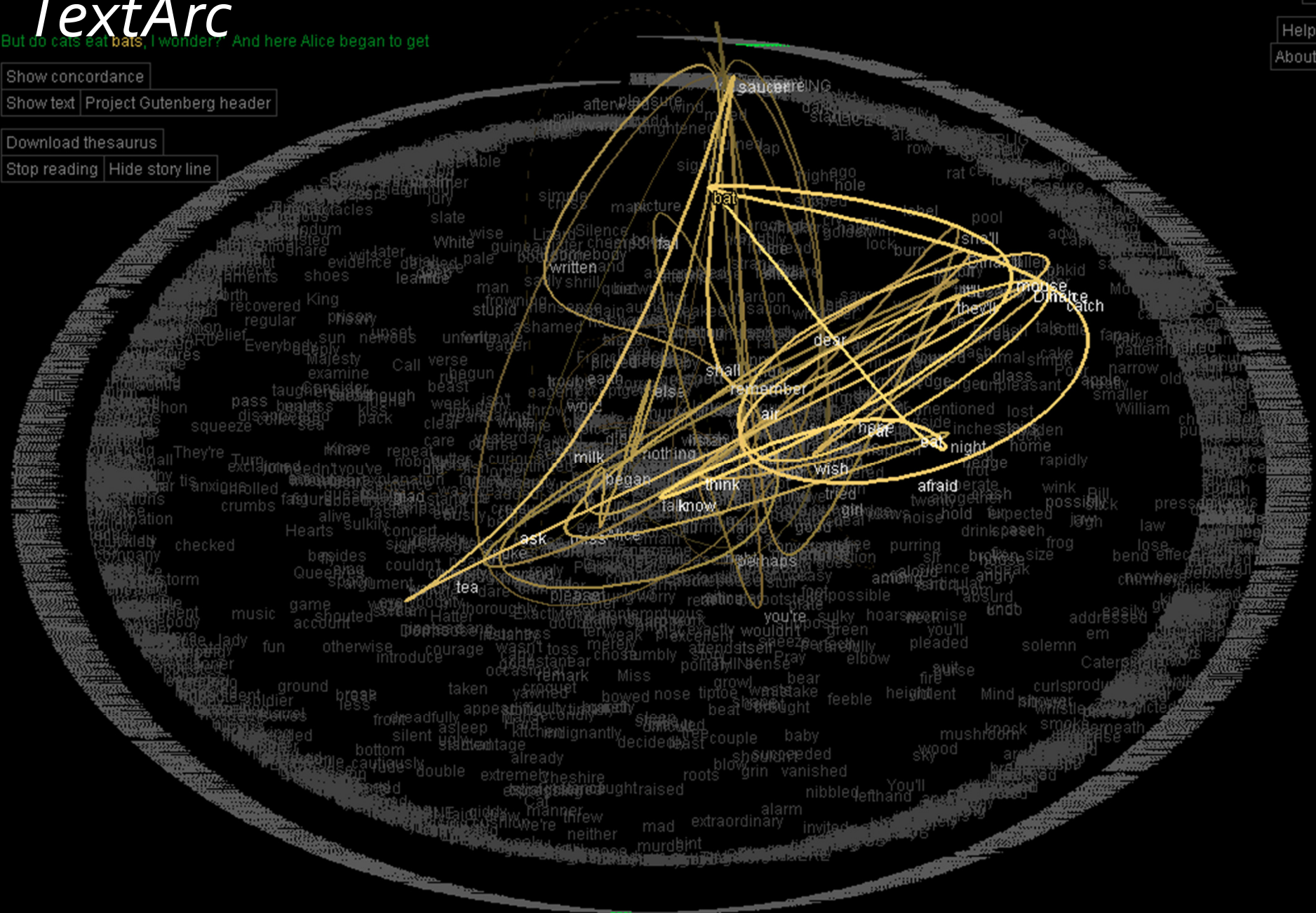


<http://www.textarc.org/>

✕

About

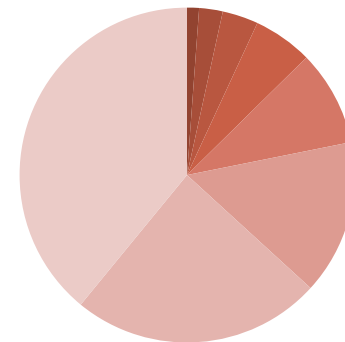
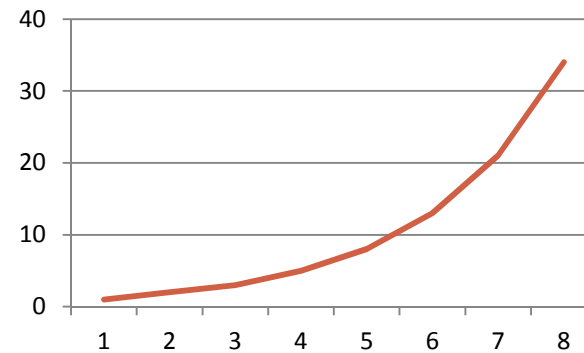
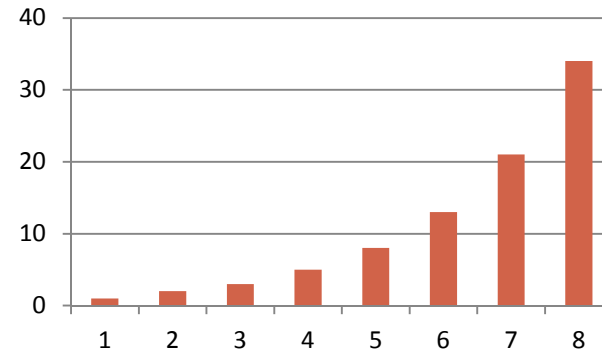
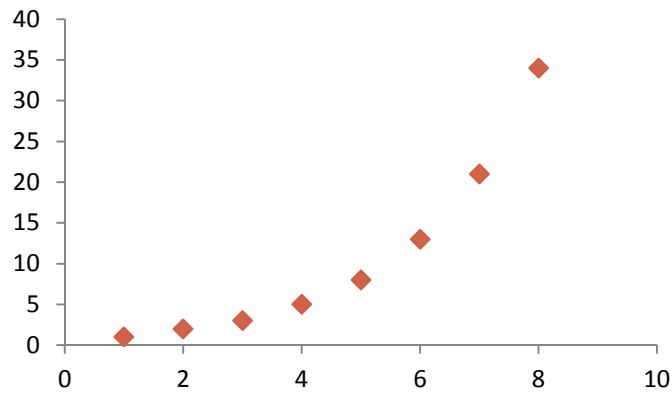
Stop reading Hide story line



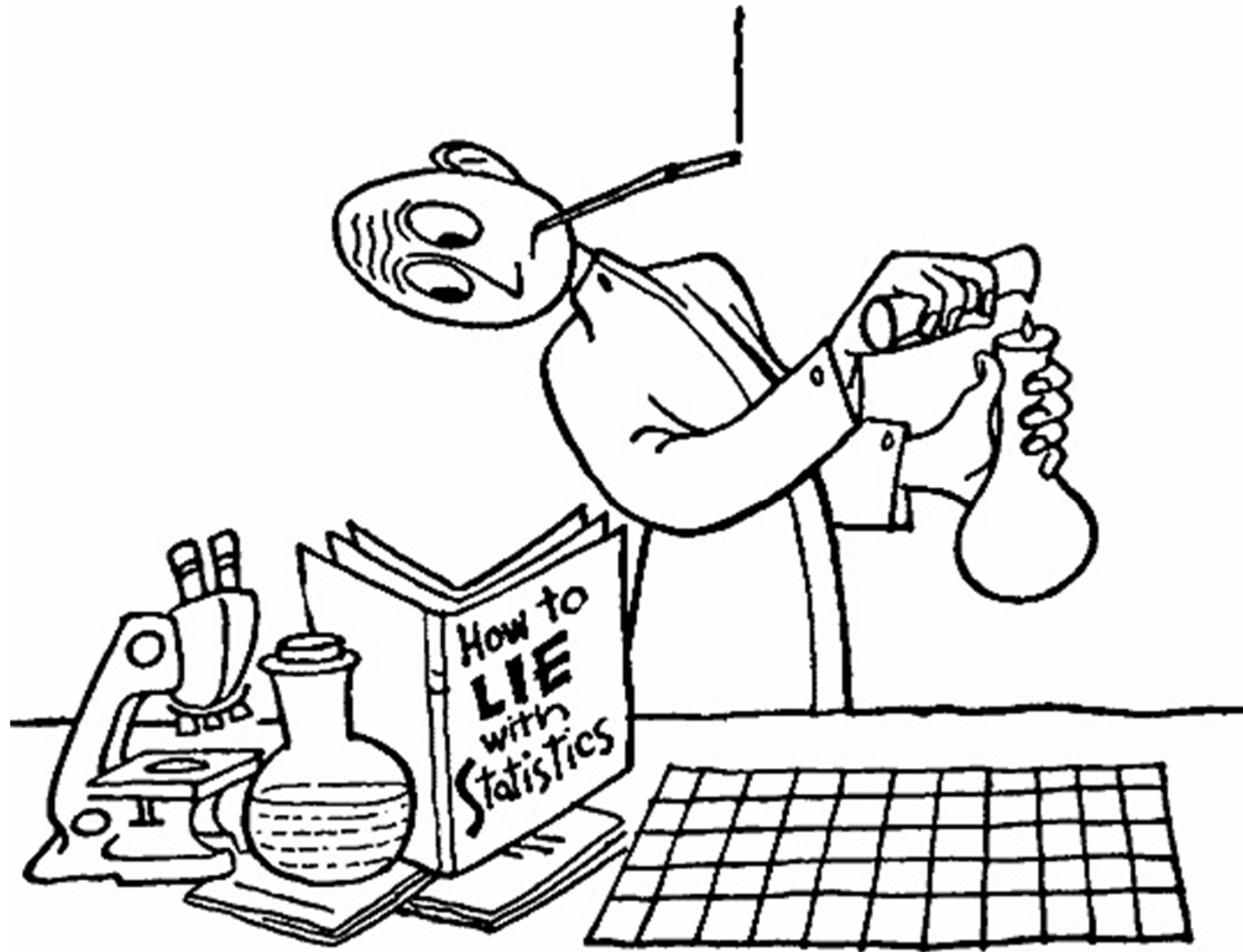
<http://www.textarc.org/>

Also many diagrams can show 1D data

- Bar Charts
- Line Charts
- Pie Charts
- Dot Charts
- ...



A few more words on charts



Good reference: How to Lie with Statistics, by Darrell Huff

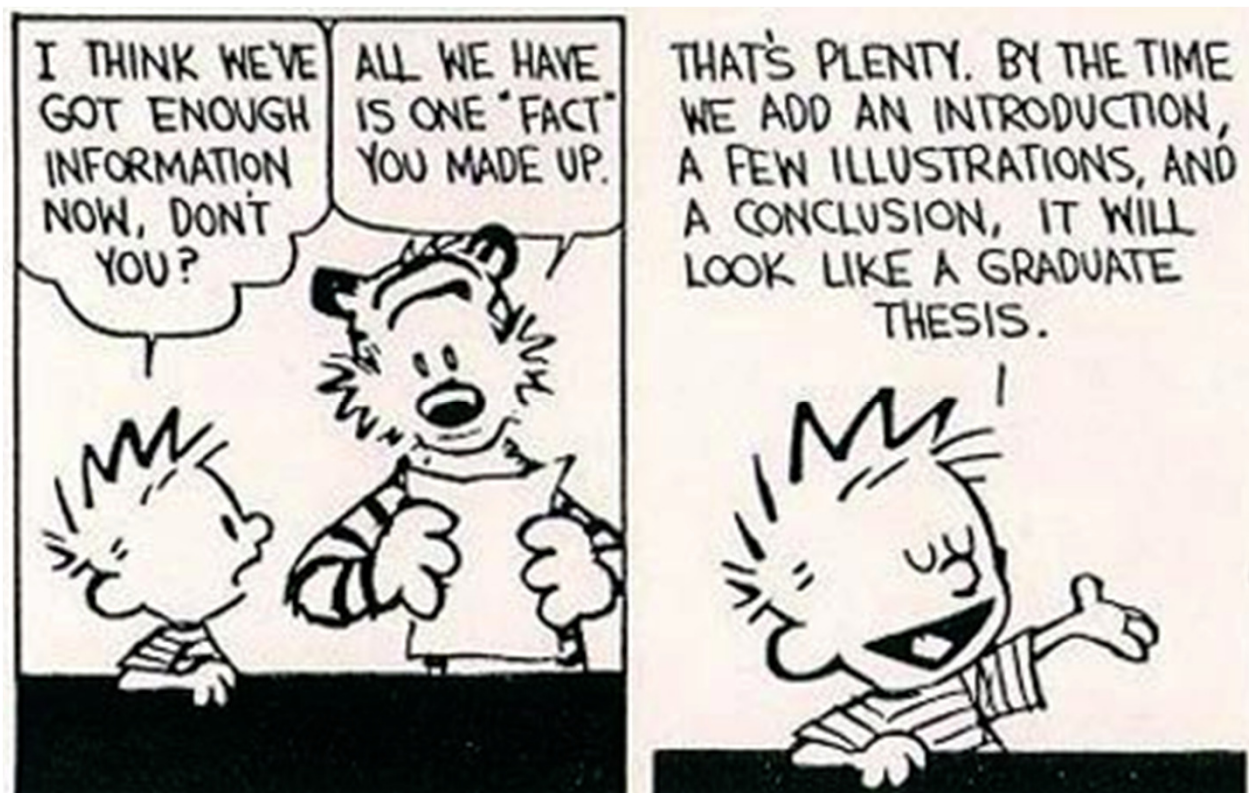
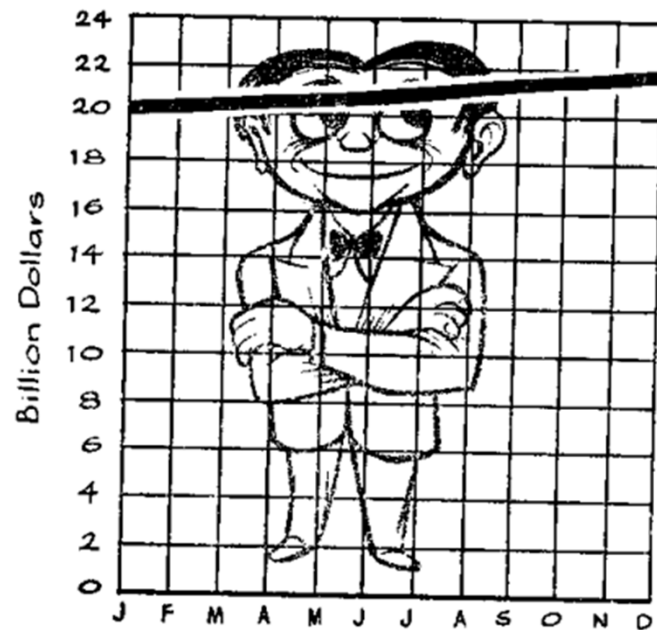


Chart Rules

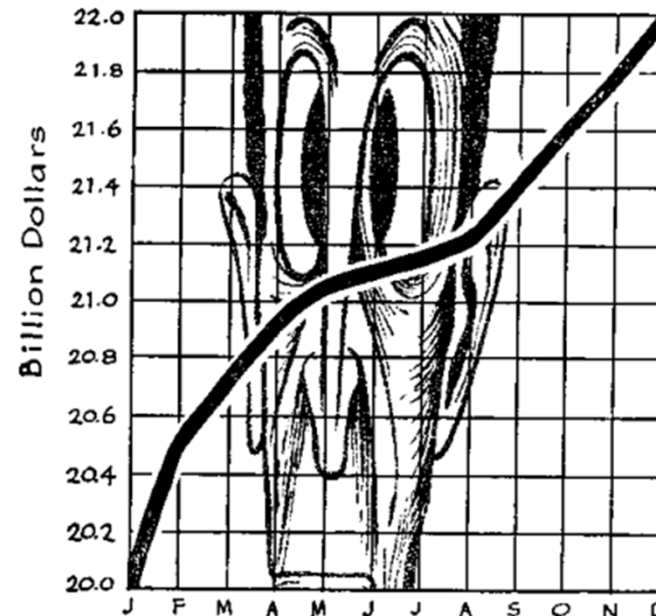
- Provide a proper baseline



A 10% increase. Good!



Already looks more impressive



Wow!

Chart Rules

- Provide a proper baseline & label your axes

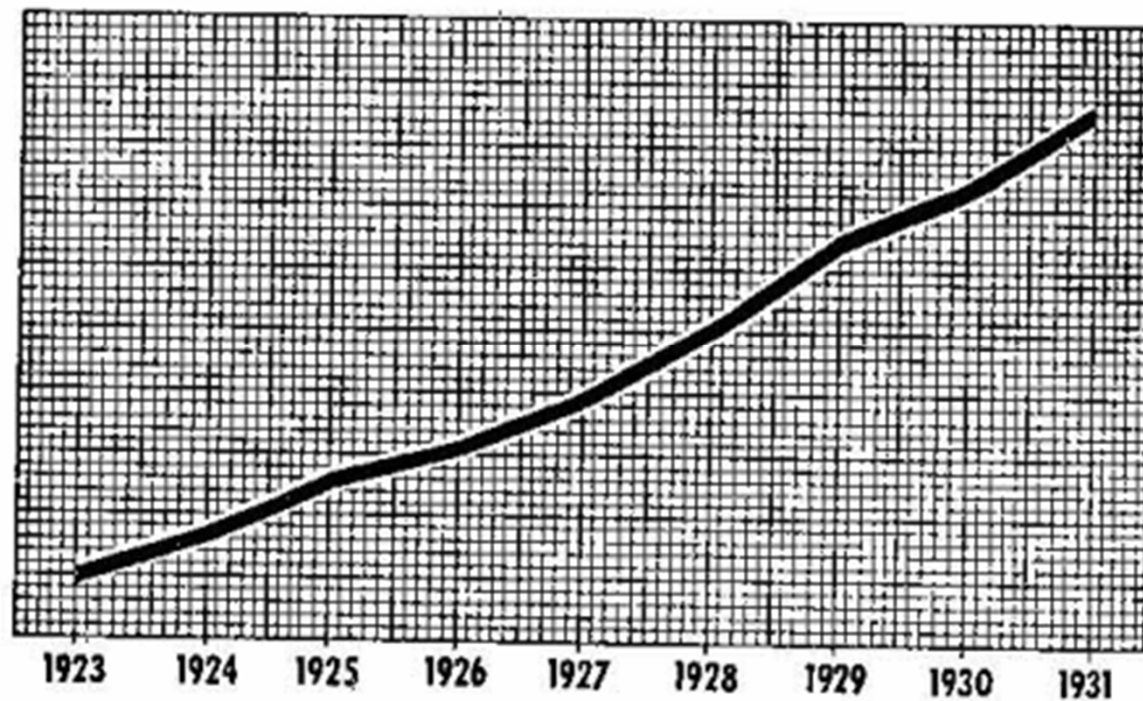
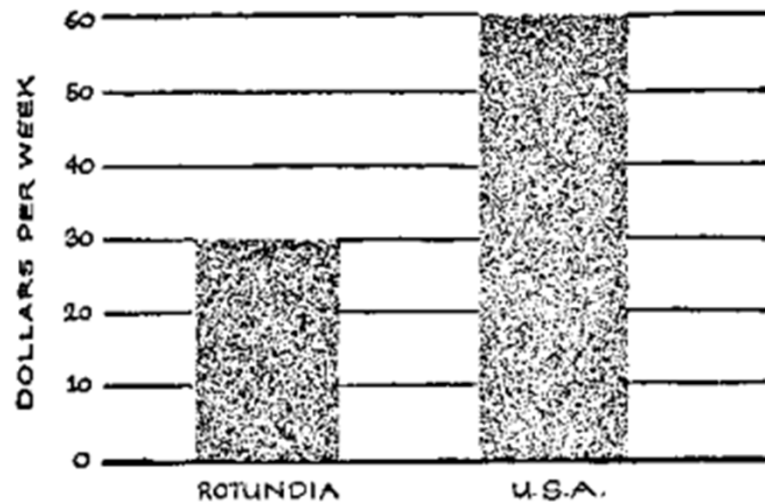


Chart Rules

- Provide a proper baseline & label your axes
- Avoid eye-candy



True data



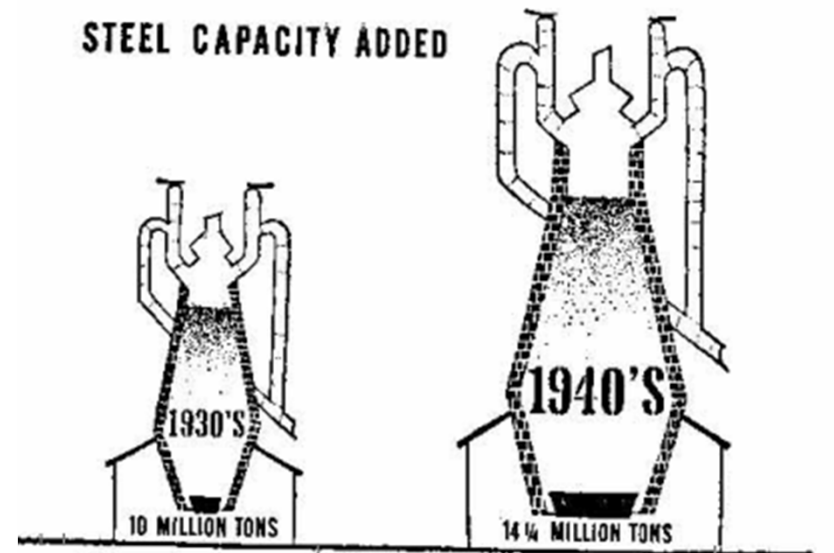
same data with eye-candy & no numbers
but tells the same general story



impressive but a lie!

Chart Rules

- Provide a proper baseline & label your axes
- Avoid eye-candy
- Don't make people compare areas when not necessary



Adapted by courtesy of STEELWAYS.

Schwimmende Schlote

Der internationale Schiffsverkehr boomt. Seit 1990 hat sich der Treibstoffverbrauch auf dem Meer verdoppelt. Die dreckigen Abgase der Schiffe gelangen weitgehend ungefiltert in die Atmosphäre

<http://images.zeit.de/wissen/2011-04/s41-infografik-schiffsverkehr.pdf>

Do the boxes represent the little white numbers??

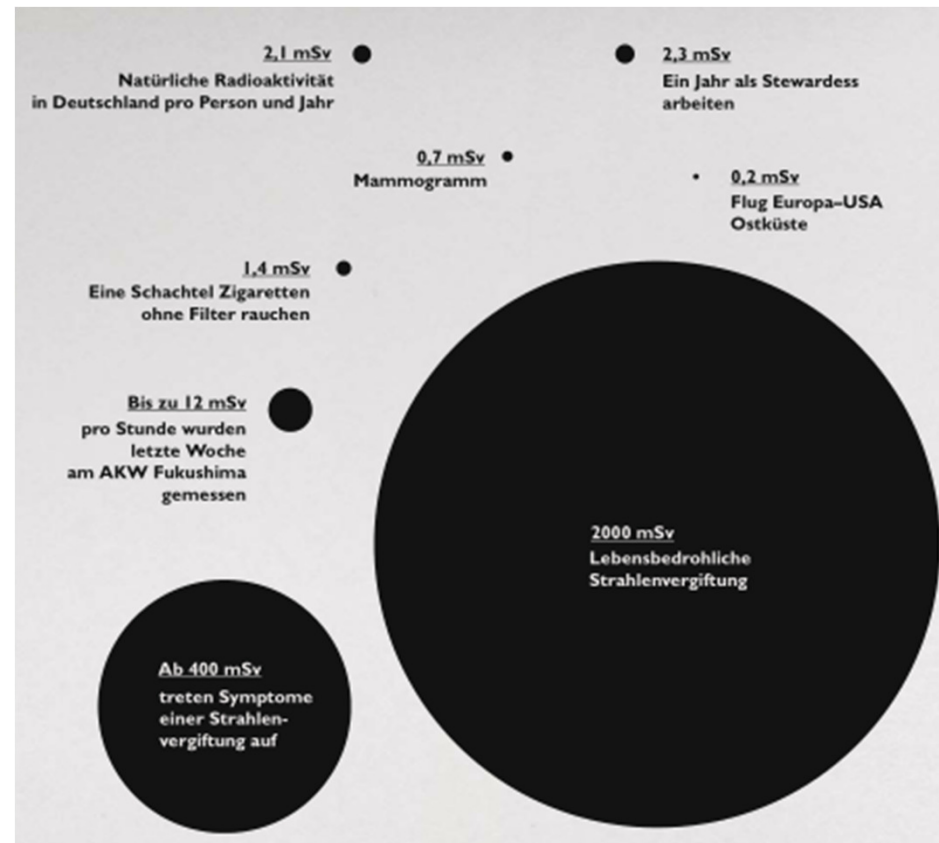


A few more recent chart sins

All from www.zeit.de/grafik



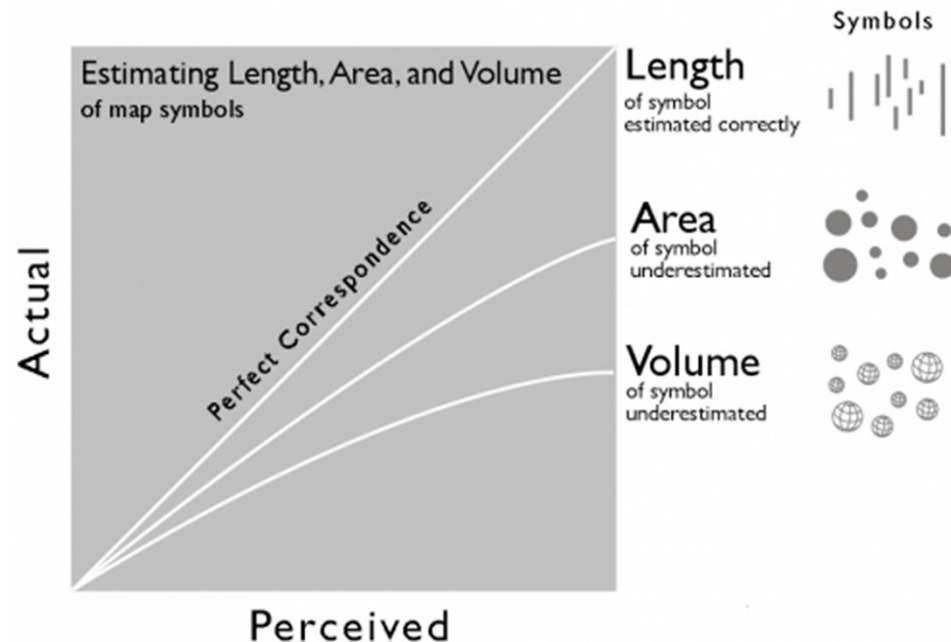
The numbers are the only useful part here.
The areas are not comparable

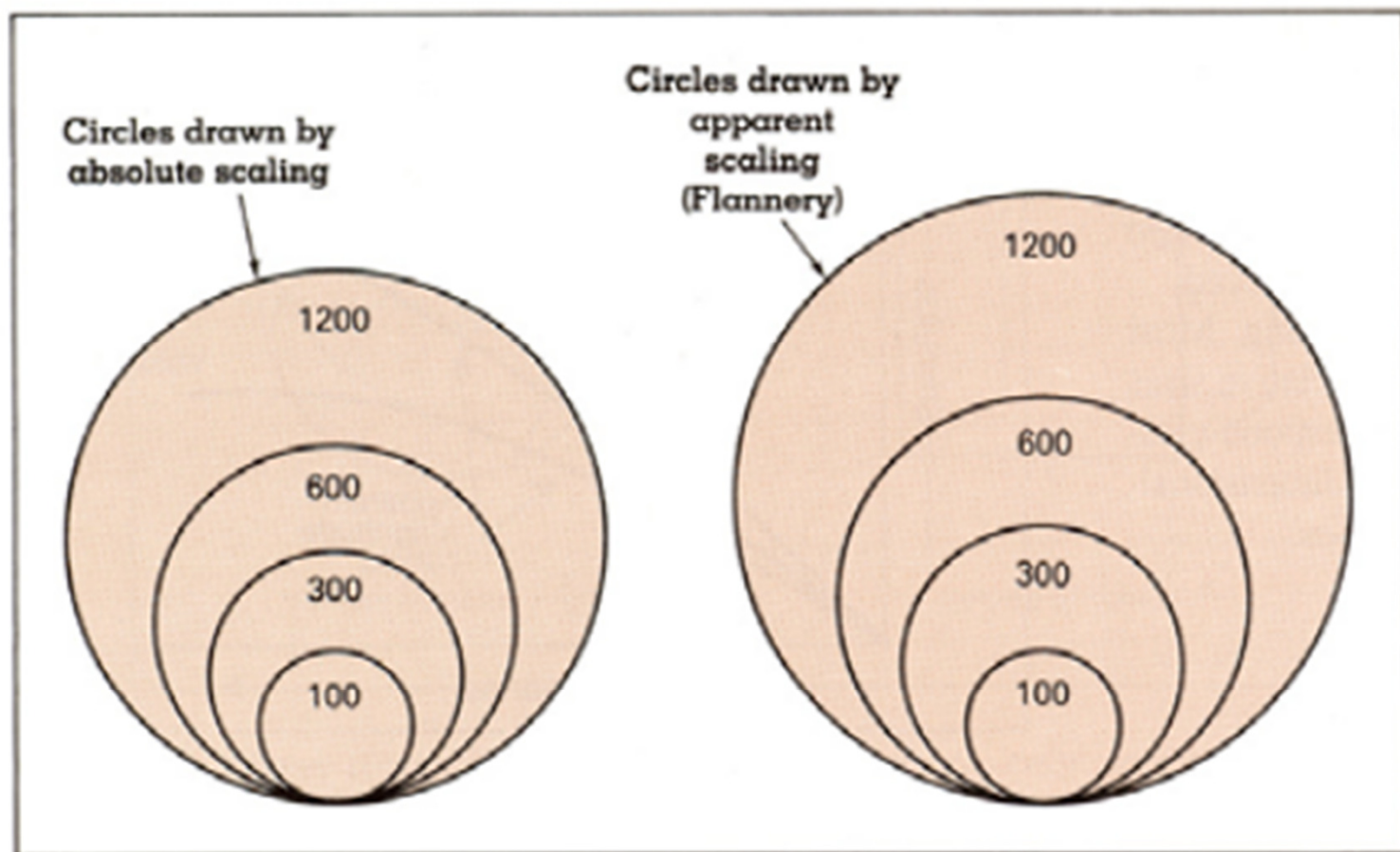


We already talked about problems comparing circles
→ There are actually even more problems...

Interlude

- People tend to **correctly estimate lengths**
- They tend to **underestimate areas and volumes**.
 - When asked to pick a circle that is two times the size of another most people would pick a circle ~1.8 times the size. This tendency gets worse with larger areas, and is worse in general for estimations of volumes.





[Cartography: Thematic Map Design, Figure 8.6, p. 170, Dent, 96]

$$S = 0.98A^{0.87} \text{ [from Flannery 71]}$$

2,1 mSv
Natürliche Radioaktivität
in Deutschland pro Person und Jahr

2,3 mSv
Ein Jahr als Stewardess
arbeiten

0,7 mSv
Mammogramm

• 0,2 mSv
Flug Europa-USA
Ostküste

1,4 mSv
Eine Schachtel Zigaretten
ohne Filter rauchen

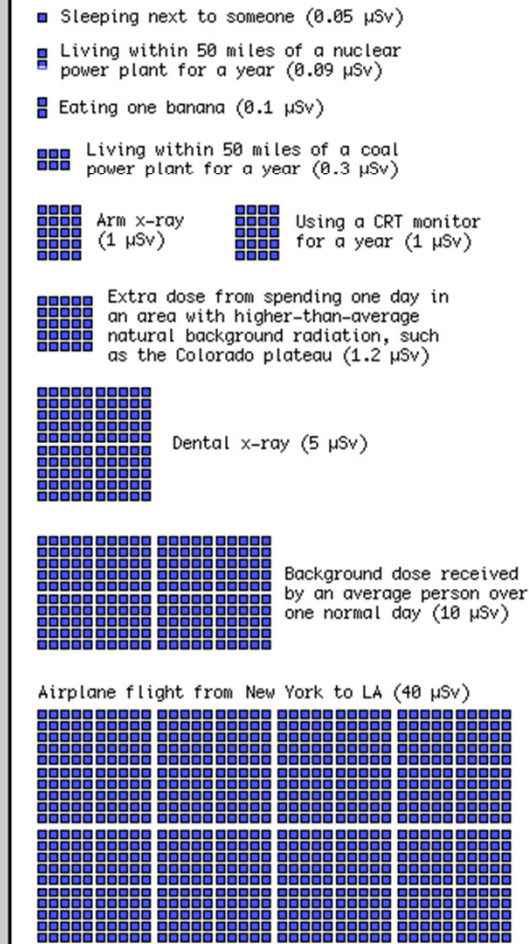
Bis zu 12 mSv
pro Stunde wurden
letzte Woche
am AKW Fukushima
gemessen

2000 mSv
Lebensbedrohliche
Strahlenvergiftung

Ab 400 mSv
treten Symptome
einer Strahlen-
vergiftung auf

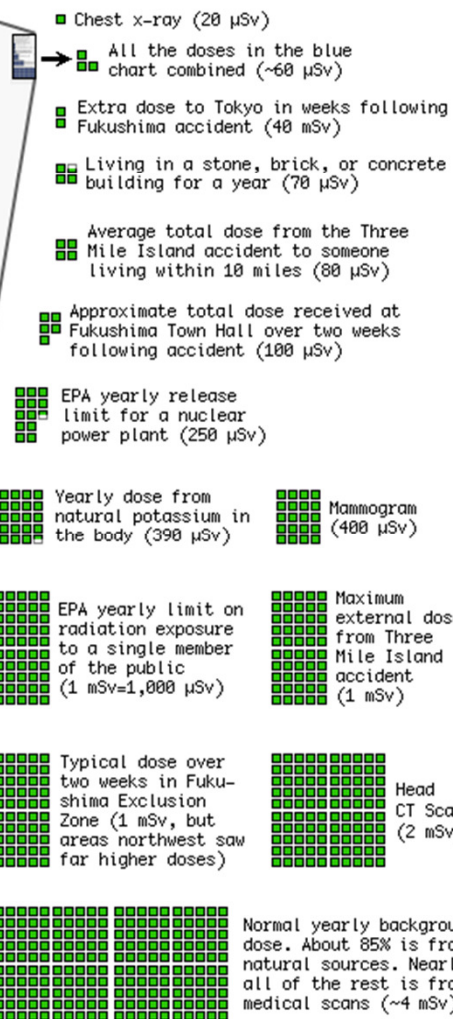
Radiation Dose Chart

This is a chart of the ionizing radiation dose a person can absorb from various sources. The unit for absorbed dose is "sievert" (Sv), and measures the effect a dose of radiation will have on the cells of the body. One sievert (all at once) will make you sick, and too many more will kill you, but we safely absorb small amounts of natural radiation daily. Note: The same number of sieverts absorbed in a shorter time will generally cause more damage, but your cumulative long-term dose plays a big role in things like cancer risk.

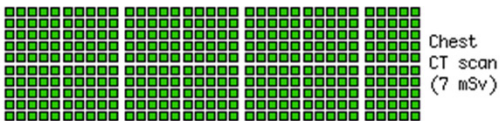
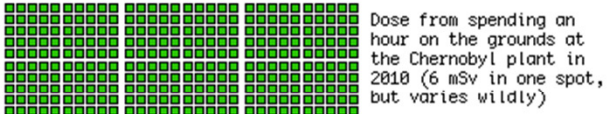


Using a cell phone (0 μ Sv)—a cell phone's transmitter does not produce ionizing radiation* and does not cause cancer.
* Unless it's a bananaphone.

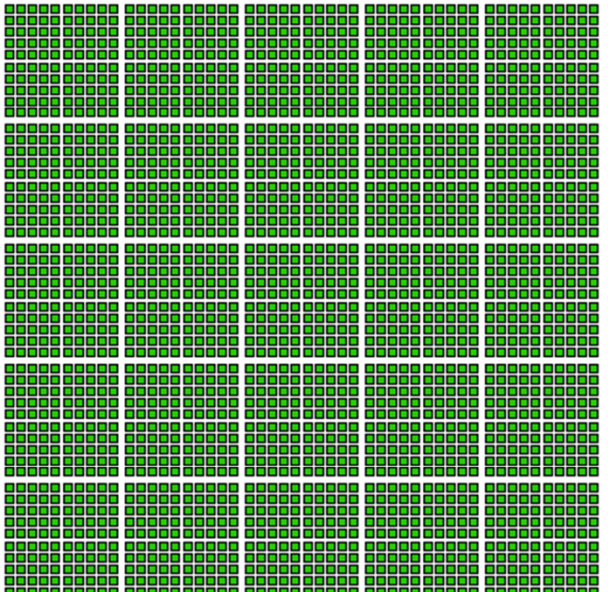
■ = (0.05 μ Sv)



EPA yearly release target for a nuclear power plant (30 μ Sv)



Maximum yearly dose permitted for US radiation workers (50 mSv)



Approximate total dose at one station at the north-



All doses in

Radiation worker one-year dose limit (50 mSv)

via xkcd

Chart Rules

- Provide a proper baseline & label your axes
- Avoid eye-candy
- Don't make people compare areas when not necessary
- Provide legends

Chart Rules

- Provide a proper baseline & label your axes
- Avoid eye-candy
- Don't make people compare areas when not necessary
- Provide legends
- Grids help but make them subtle (no black lines!)

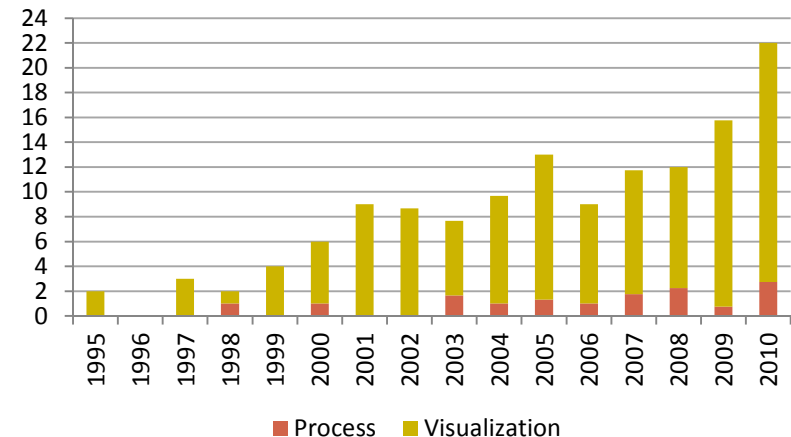
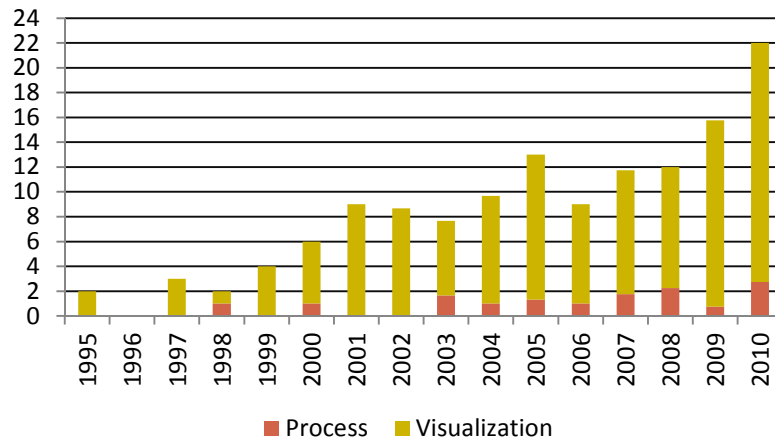
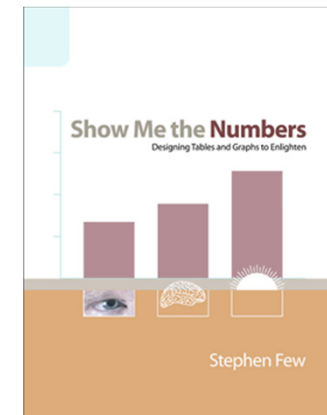
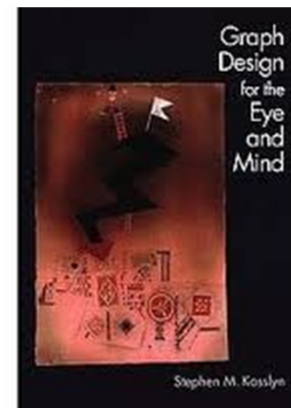
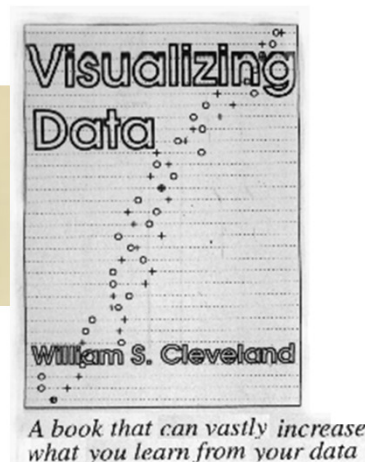
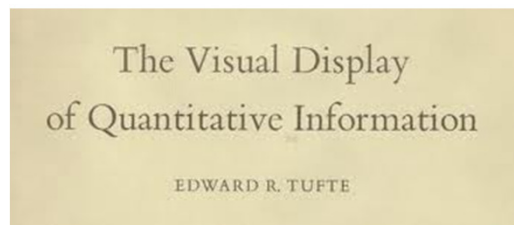


Chart Rules

- Provide a proper baseline & label your axes
- Avoid eye-candy
- Don't make people compare areas when not necessary
- Provide legends
- Grids help but make them subtle (no black lines!)
- Many more...



***SPATIAL VISUALIZATION
TECHNIQUES***

Heatmaps

Hotmap (Fisher, 2007)

<http://hotmap.msresearch.us/>



Figure 1. Hotmap, showing all trails. A pixel is red if at least one user has looked at it. Note the frequent horizontal and vertical lines from users holding down scroll buttons.

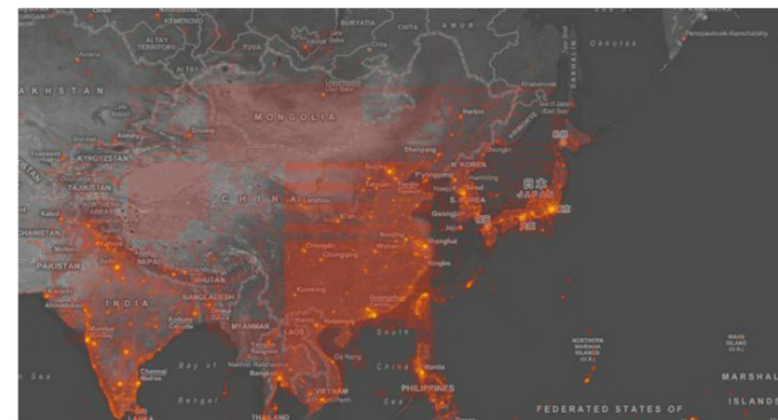
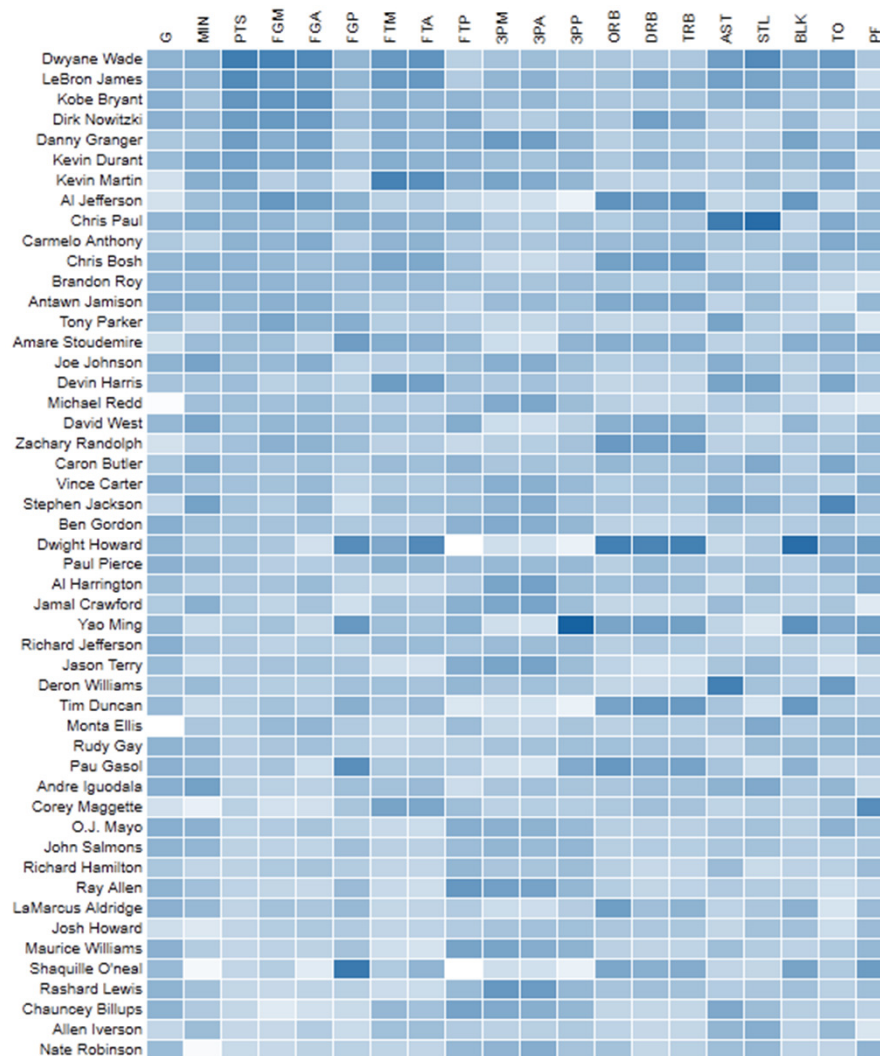


Figure 3. Hotmap in China. Note the faint highlight over greater China, and the brighter colors over the coastal area, suggesting repeated scraping of the data.

Heatmaps

Also work for non-spatial data

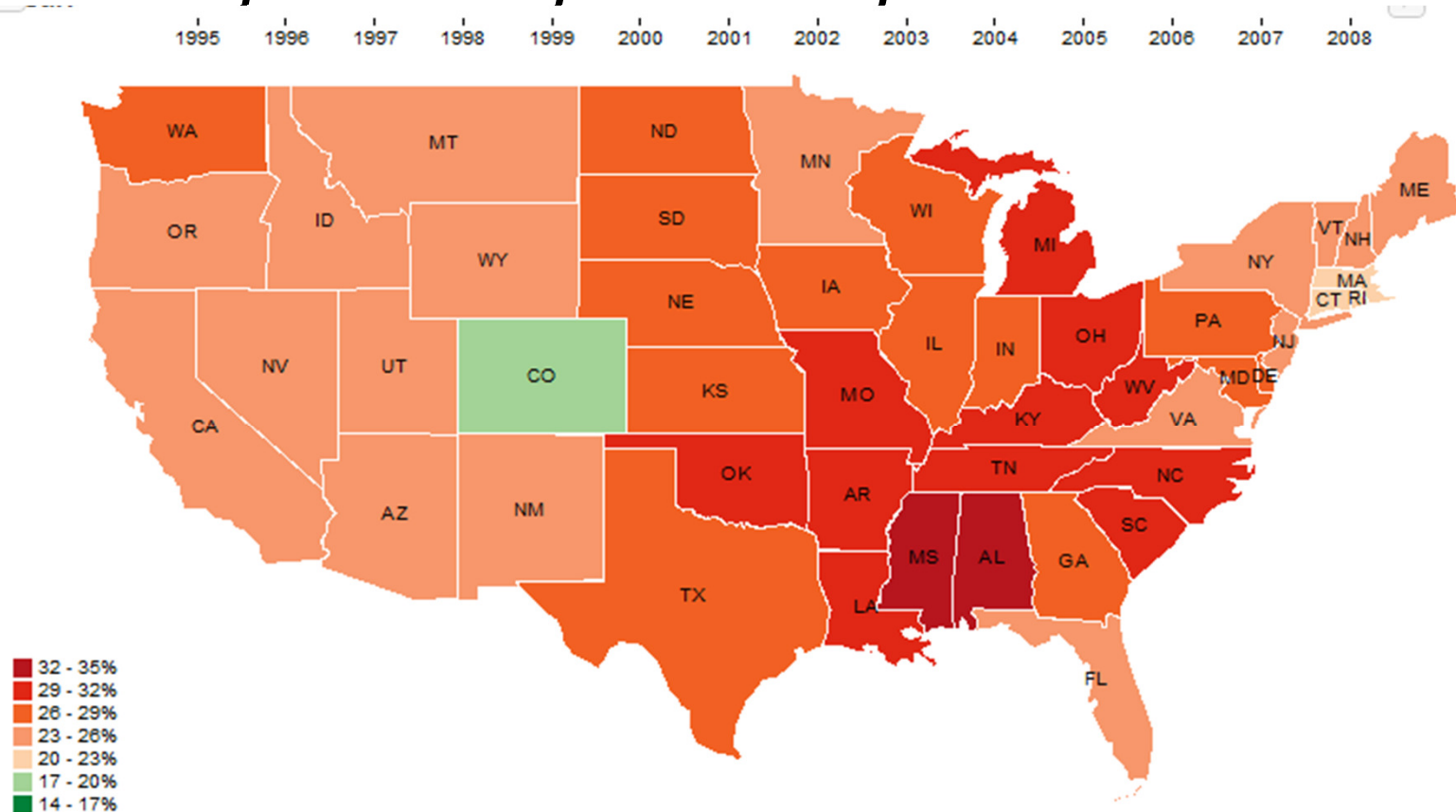


top scorer in the NBA

<http://mbostock.github.com/protovis/ex/nba.html>

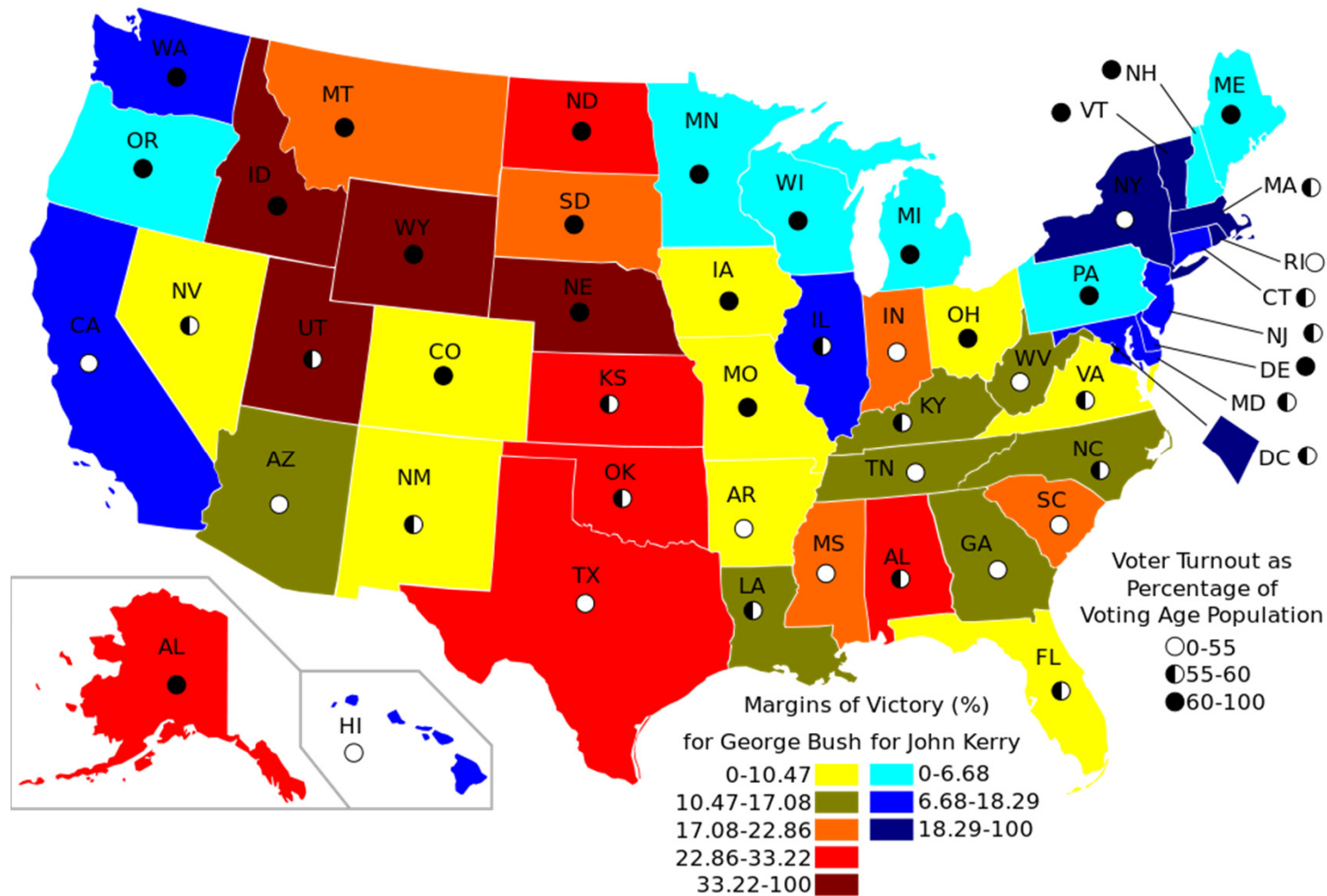
Source: [FlowingData](#)

HeatMap – Choropleth Map



Problems: If area is small, values are hard to read and color perception may be difficult

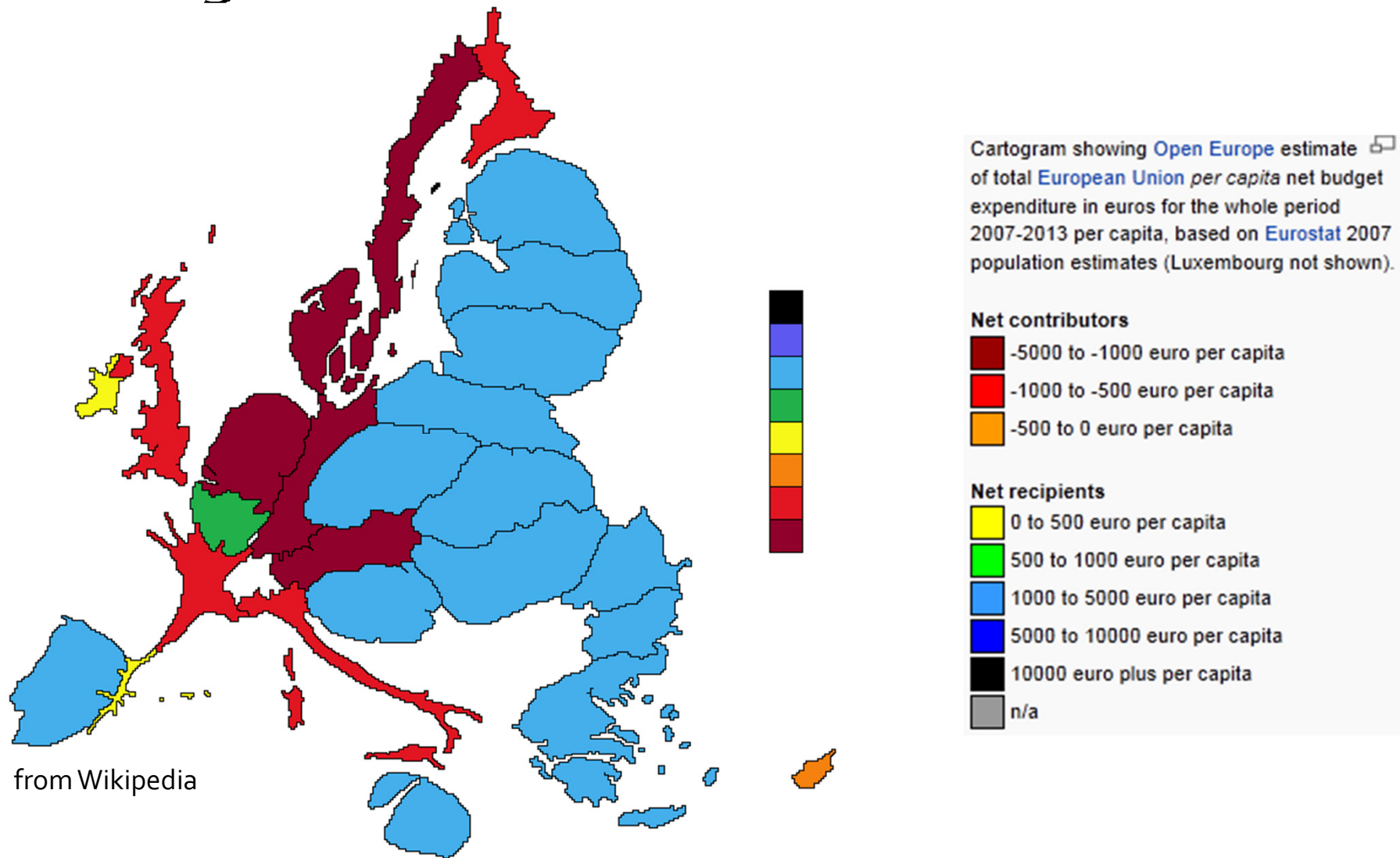
Remember to use good color – always!



P.S. This is not good use of color!

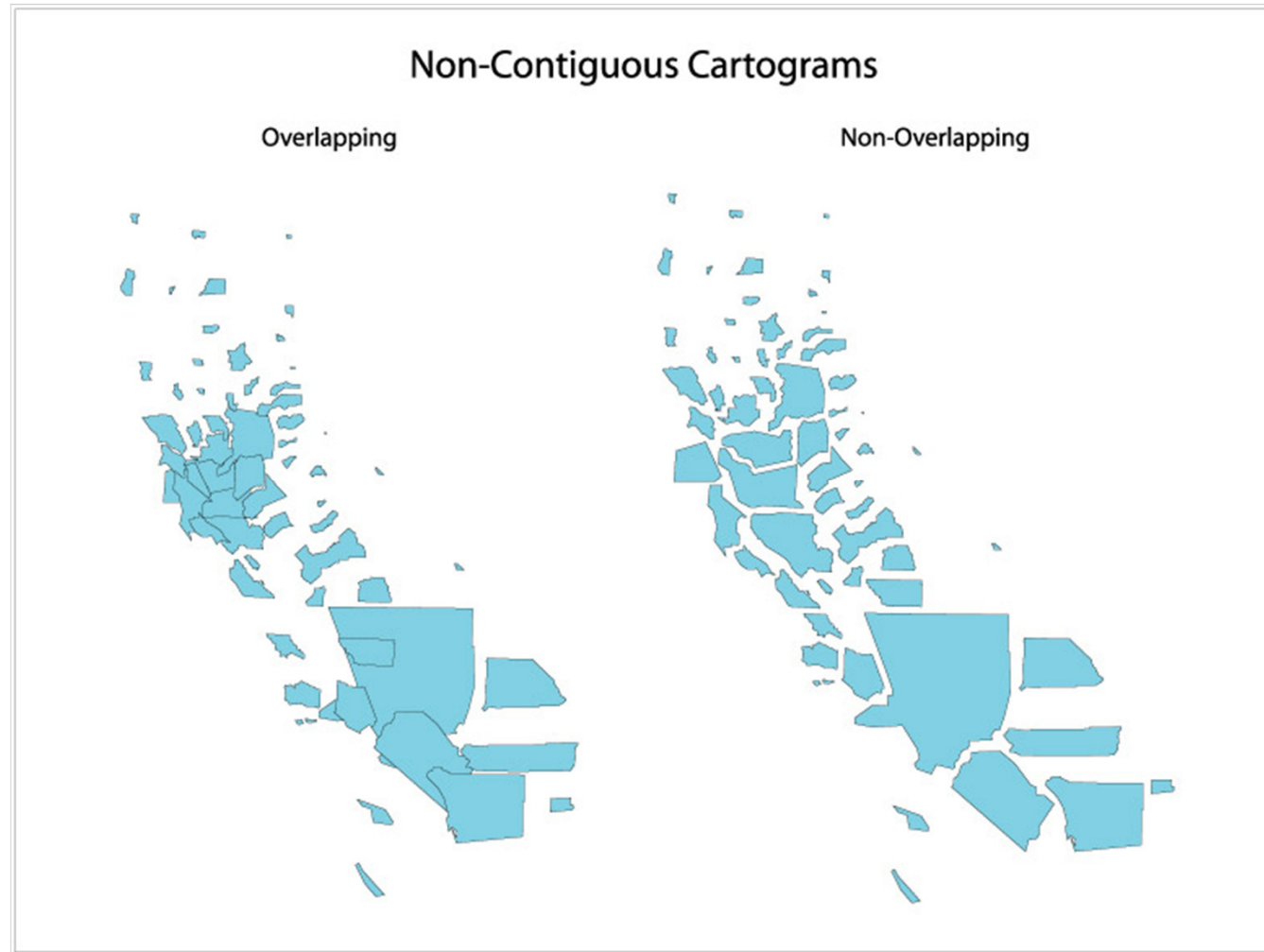
http://en.wikipedia.org/wiki/File:2004US_election_map.svg

Cartogram



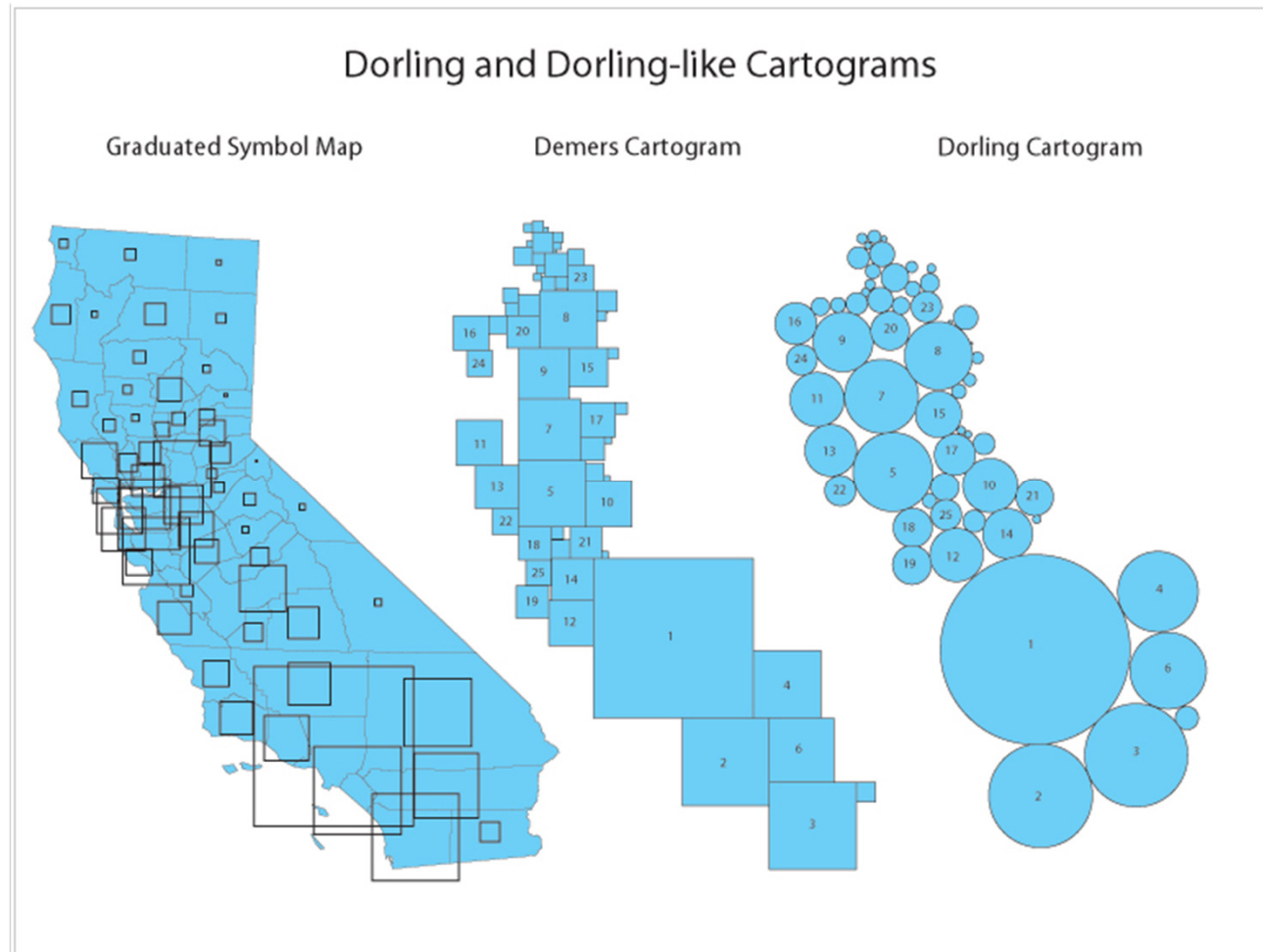
Continuous cartogram (tries to optimize size constraints as much as possible)

Cartogram



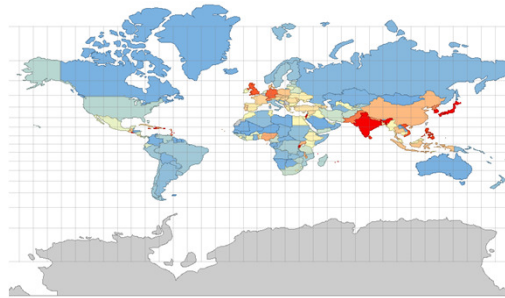
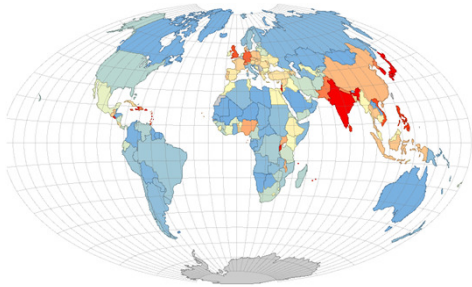
Size can be set easily but map shape and connectivity is lost

Cartogram



Size comparison easier but map topology largely lost

GeoVis is its own field with many specific rep problems



Projections



Slingsby et al, 2010

Movement in Space (here storms)

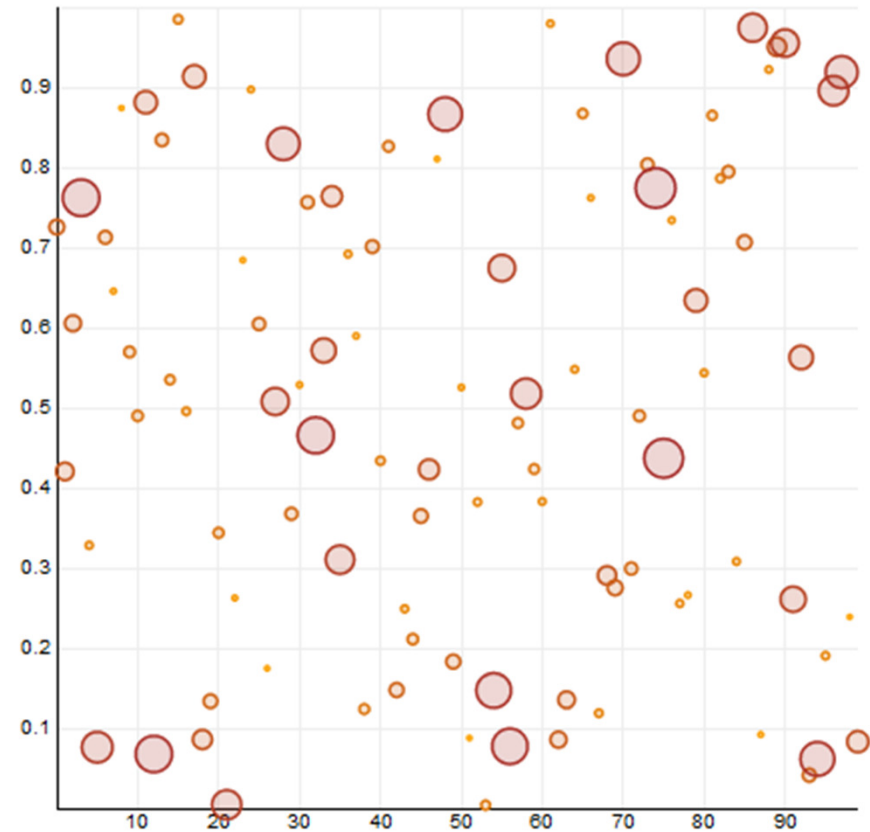
Consult the specialized conferences and literature
for more information (too detailed for now)

Visualization Techniques for

MULTIVARIATE DATA

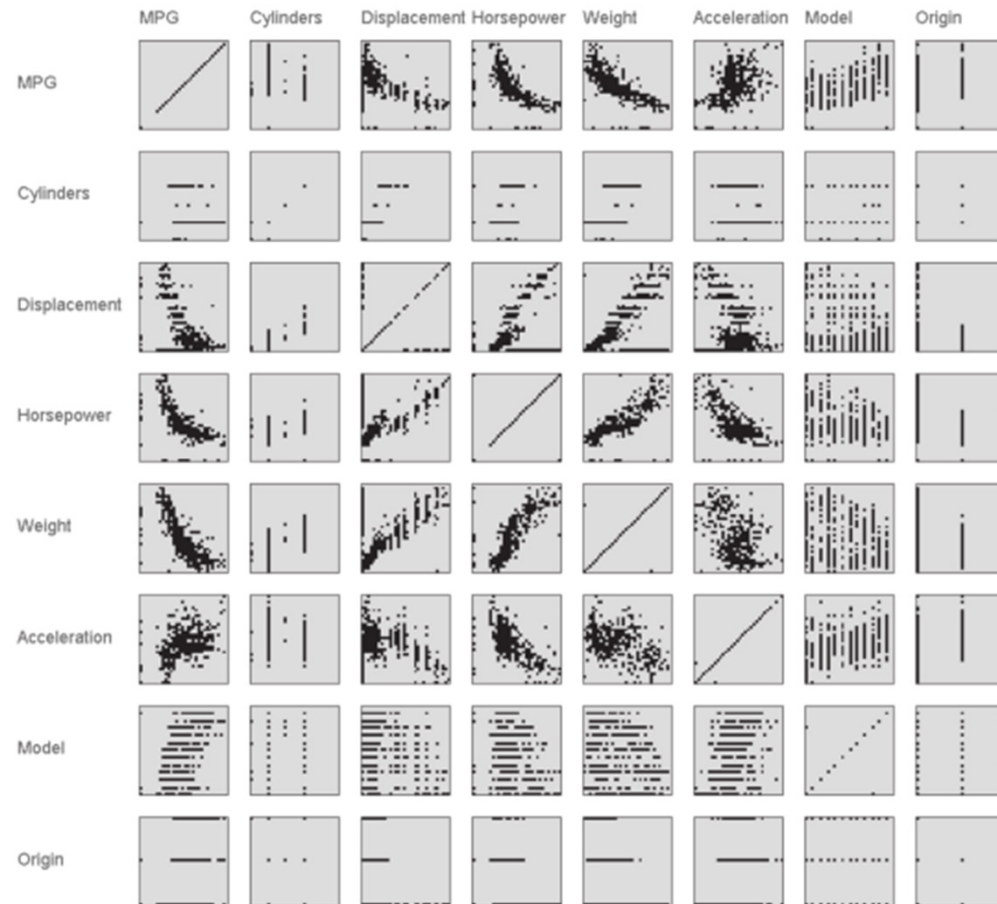
Scatterplot Matrices

- Regular scatterplot
 - 2D position
(2 data dimension)
 - Size can encode
additional dimension
 - Color of circles can
encode another
dimension



- [Hans Rosling TED Talk Video](#)

Scatterplot Matrices



7-dimensional car dataset

correlation of 2 dimensions per square

Interlude – interaction with ScatterDice

Rolling the Dice

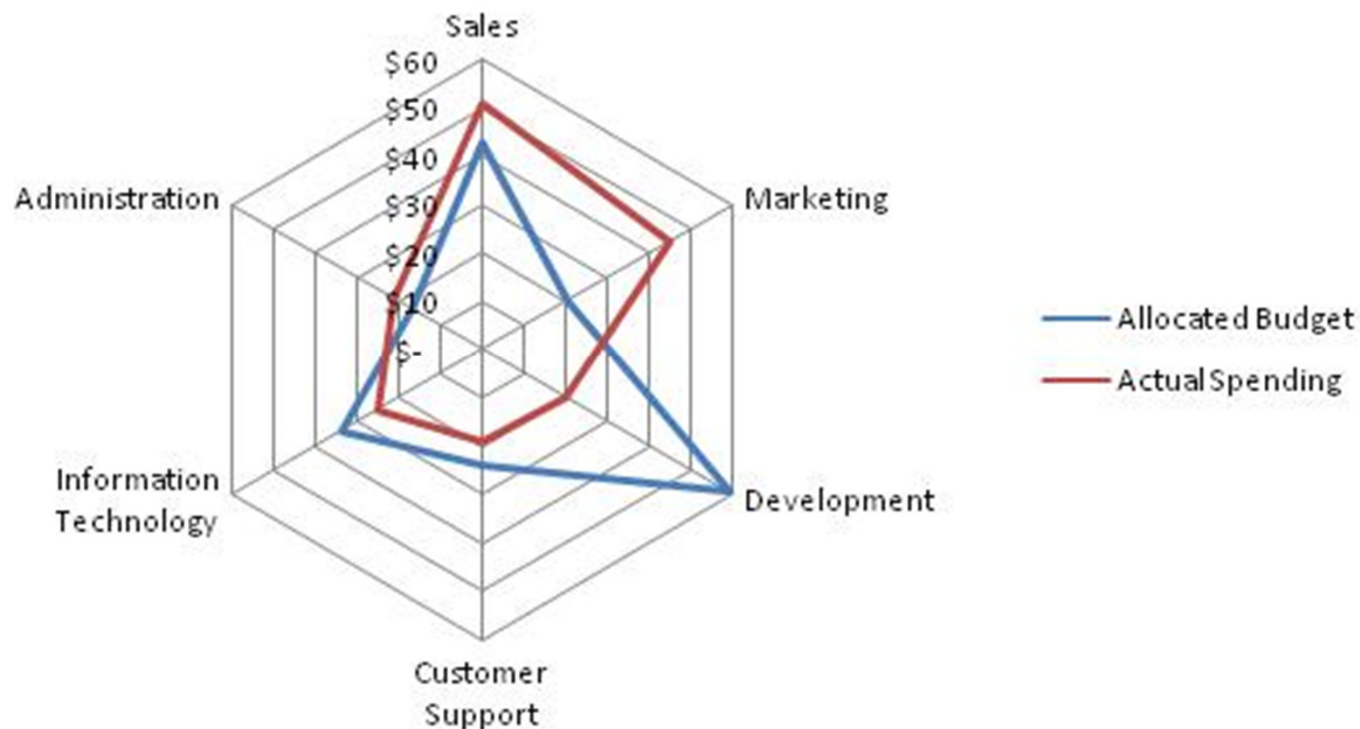
Multidimensional Visual Exploration
using Scatterplot Matrix Navigation

Niklas Elmqvist
Pierre Dragicevic
Jean-Daniel Fekete

INRIA

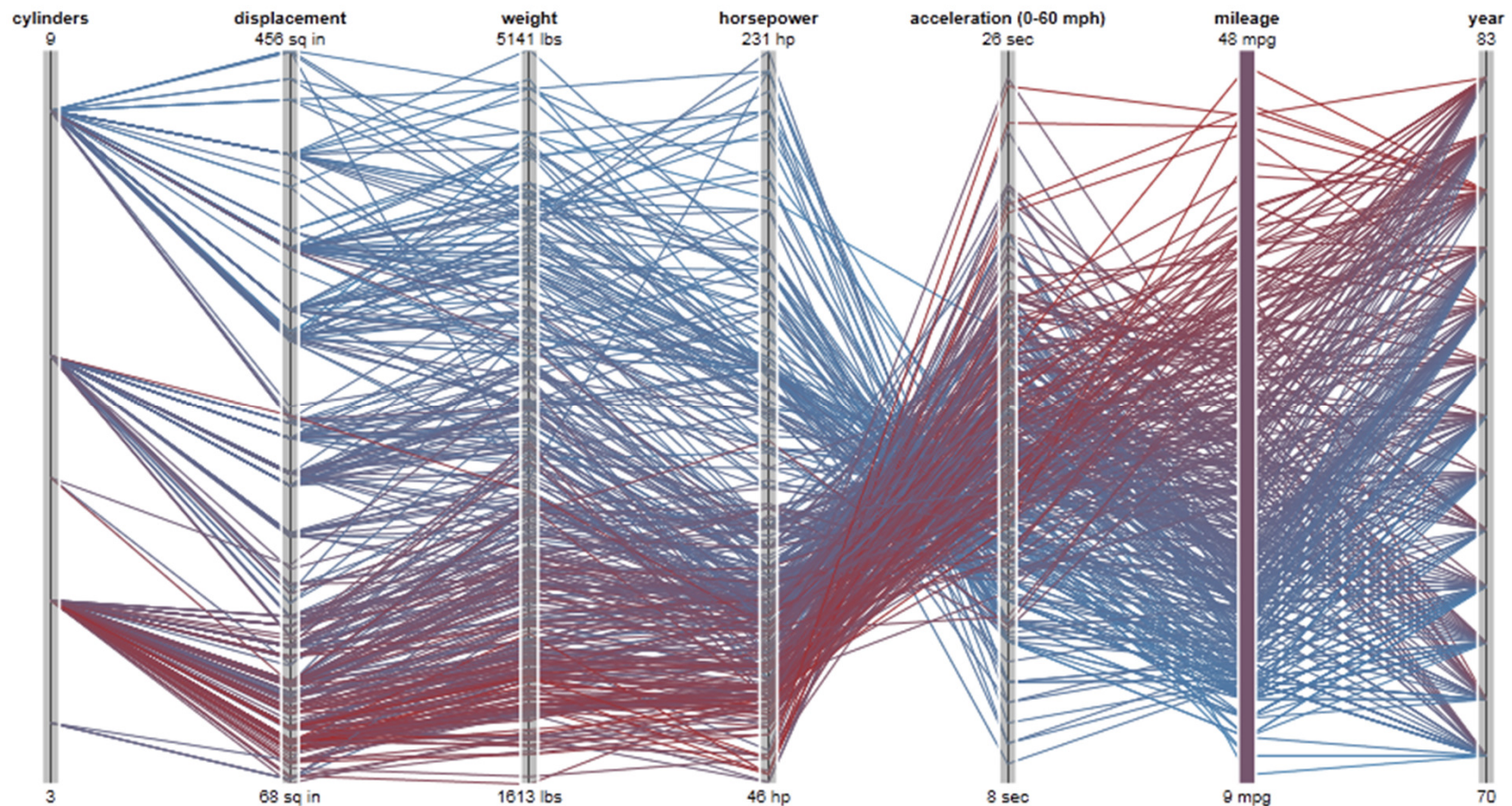
Star Plot / Spider Chart / Radar Chart

- In this case sharing similar scales
- But also works for different scales




Parallel Coordinates

- Extremely well researched method with many possibilities to fine-tune



Parallel Coordinates

Google scholar "parallel coordinates" Search [Advanced Scholar Search](#)

Scholar Articles and patents anytime include citations  [Create email alert](#) Results 1 - 10 of about 4,880. (0.08 sec)

[Parallel coordinates: a tool for visualizing multi-dimensional geometry](#) [\[PDF\] from tuwien.ac.at](#)
A Inselberg... - [Proceedings of the 1st conference on ..., 1990 - portal.acm.org](#)
Here a methodology based on a multi-dimensional system of **Parallel Coordinates** whose development began in 1978 is described. Preliminary results on some representations and construction algorithms for N-Dimensional Lines and Hyperplanes appeared in 1981 [28]. The results were ...
[Cited by 700](#) - [Related articles](#) - [All 10 versions](#)

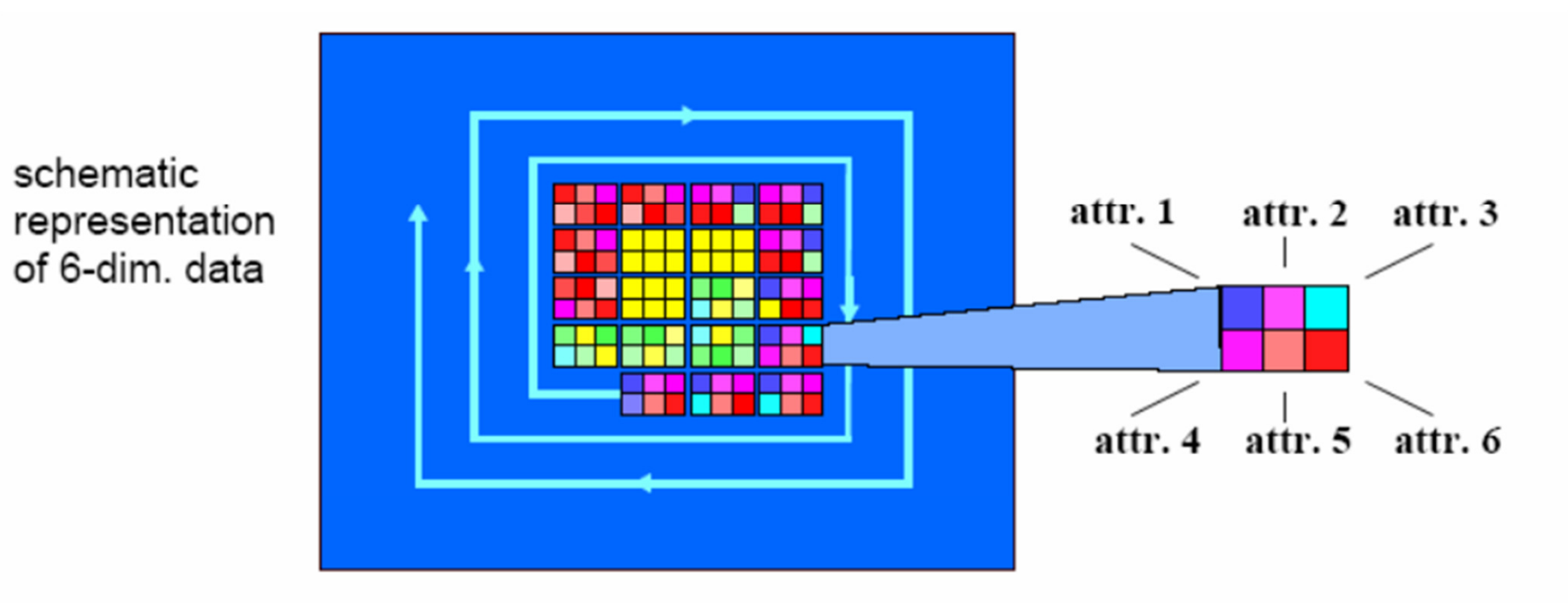
[The plane with parallel coordinates](#)
A Inselberg - [The Visual Computer, 1985 - citeulike.org](#)
Abstract By means of Parallel Coordinates planar "graphs" of multivariate relations are obtained. Certain properties of the relationship correspond to the geometrical properties of its graph. On the plane a point \longleftrightarrow line duality with several interesting properties is induced. ...
[Cited by 614](#) - [Related articles](#) - [Cached](#) - [All 3 versions](#)

Tools to try them

- <http://davis.wpi.edu/~xmdv/visualizations.html>
- <http://www2.research.att.com/areas/stat/xgobi/>
- <http://www.wallinfire.net/picviz/>
- R: <http://stat.ethz.ch/R-manual/R-patched/library/MASS/html/parcoord.html>
- Visualization Toolkits...
- <http://www.kdnuggets.com/software/parallax.html>
(from the „inventor“ – but not free)

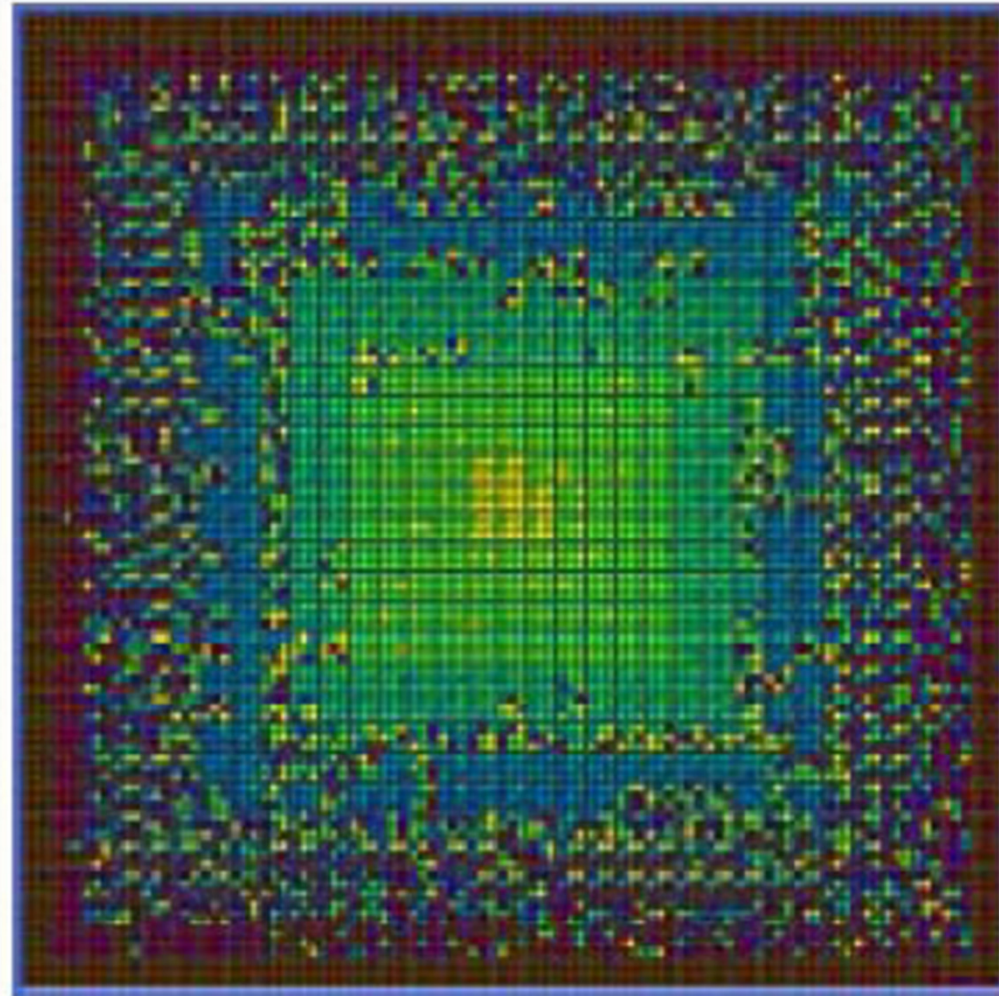
Disclaimer: I haven't tested any of them

Dense Pixel Displays



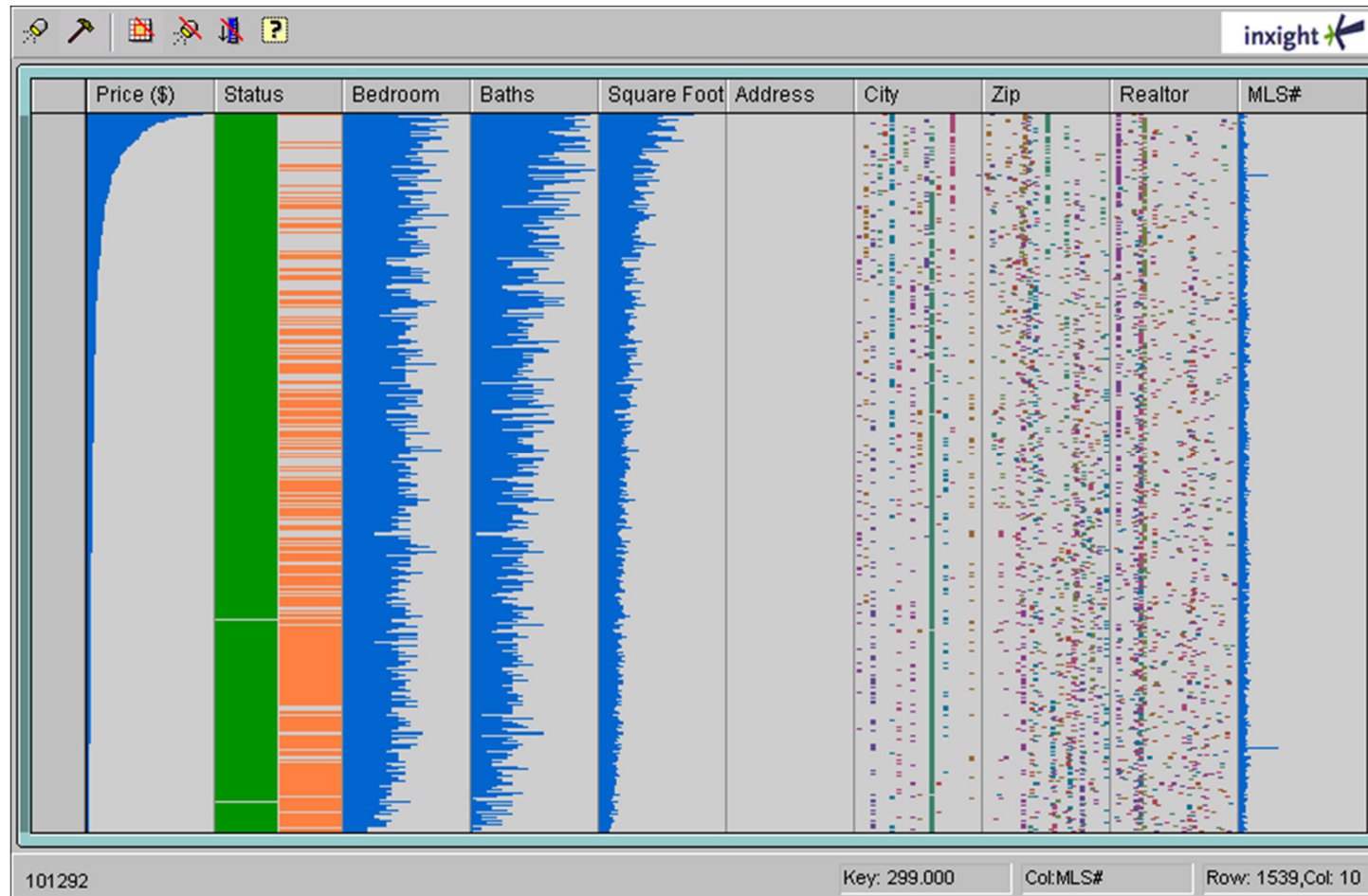
Levkowitz, Vis '91

Dense Pixel Displays



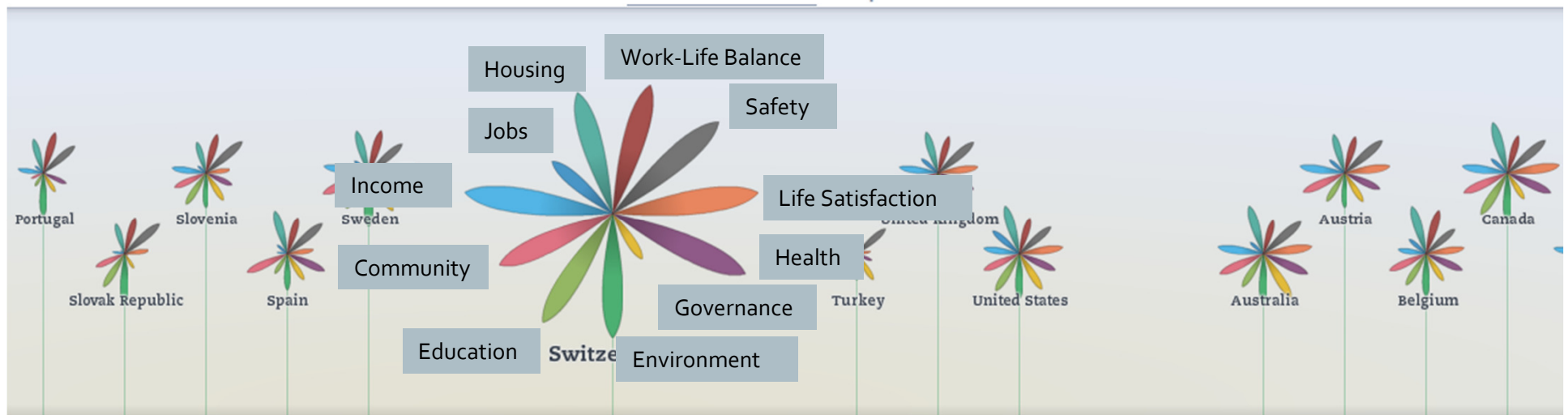
Tabular Data Displays

- TableLens



Can do some
of this in
Excel now

Glyphs



People Garden

- Visualization technique for portraying on-line interaction environments (Virtual Communities)
- Provides both individual and societal views
- Utilizes garden and flower metaphors

Xiong and Donath
UIST '99

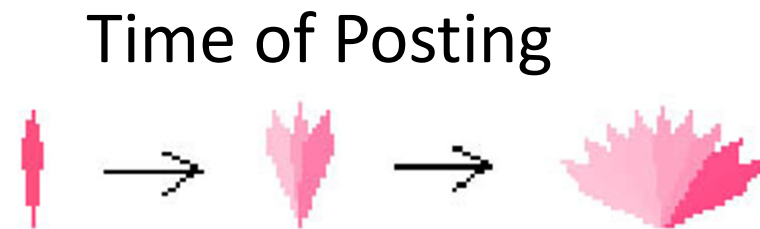
Data Portrait: Petals

Fundamental view of an individual



His/Her postings are represented as petals of the flower, arranged by time in a clockwise

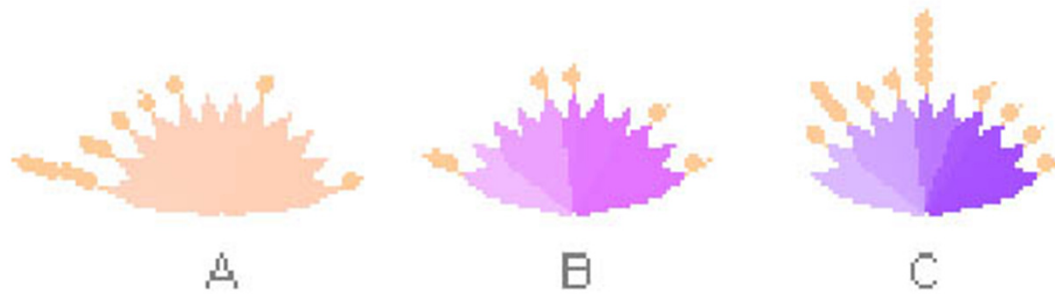
Data Portrait: Postings



- New posts are added to the right
- Slide everything back so it stays symmetric
- Each petal fades over time showing time since posting
- A marked difference in saturation of adjacent petals denotes a gap in posting

Data Portrait: Responses

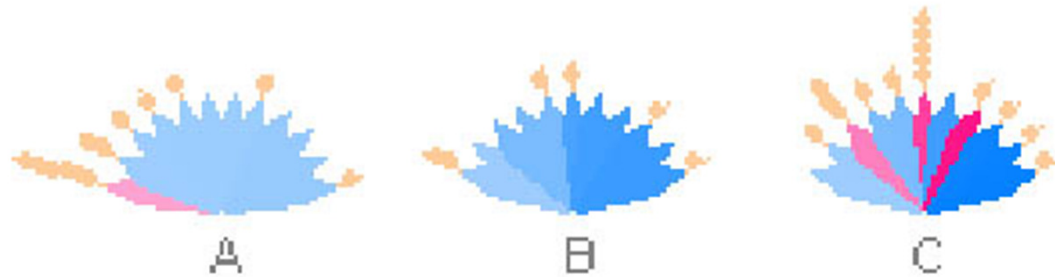
Response to posting



Small circle drawn on top of a posting to represent each follow-up response

Data Portrait: Color

Initial post vs. reply



Color can represent original/reply

Here magenta is original post, blue is reply

Garden

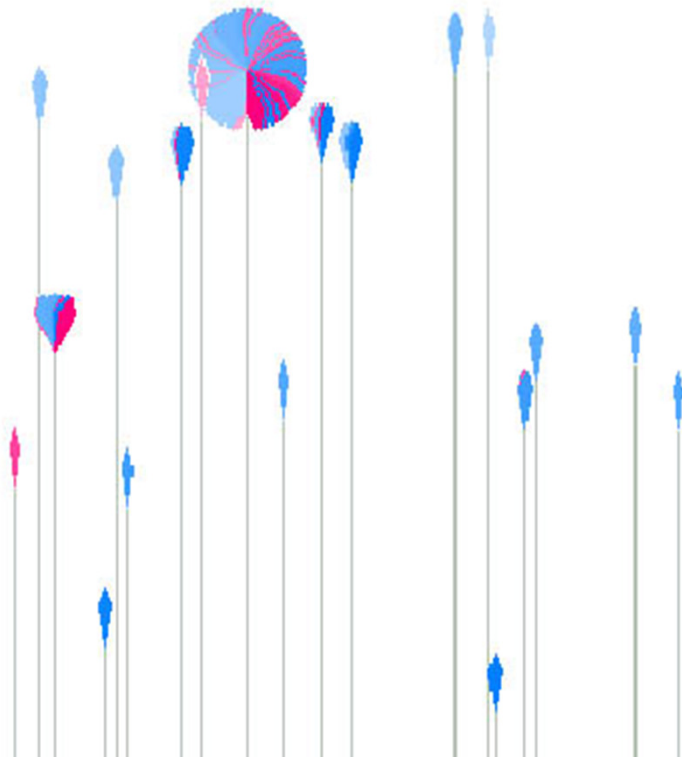
Combine many
portraits to make a
garden

Message board with
1200 postings over
2 months

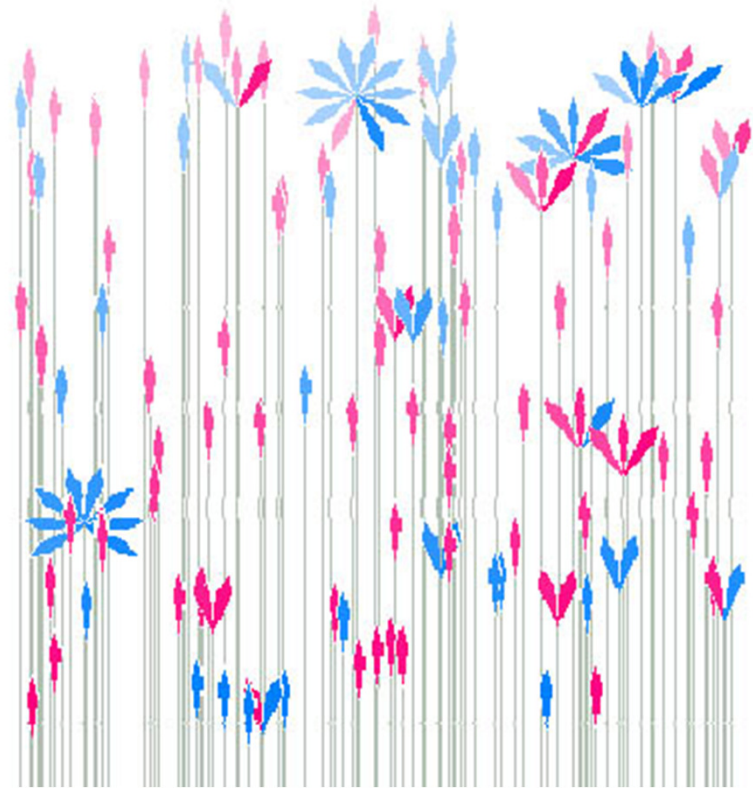
Each flower is a
different user
Height indicates length
of time at the board



Interpreting Displays



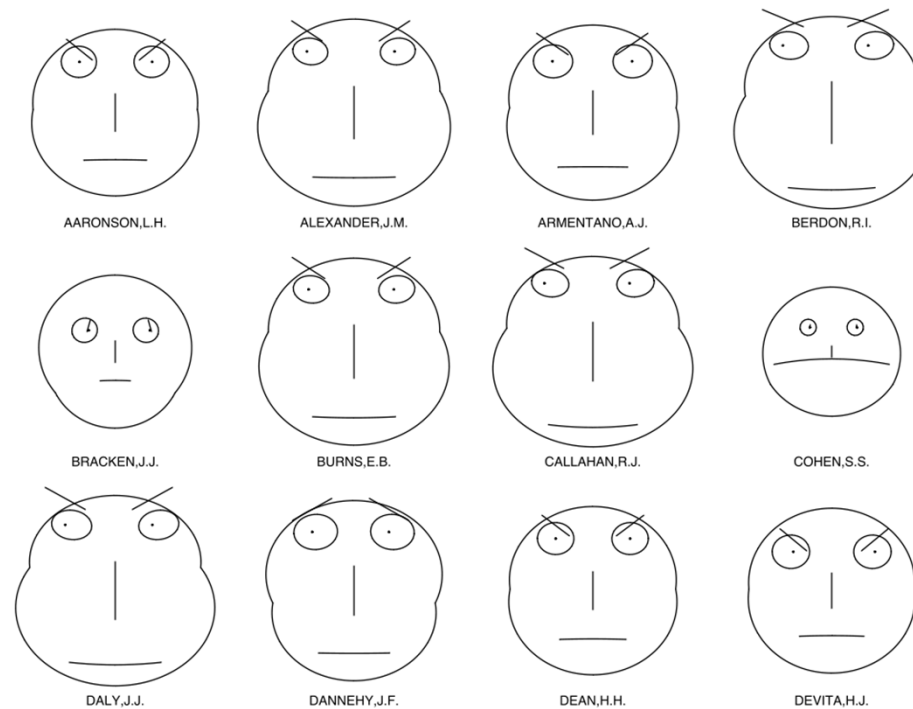
Group with one dominating person



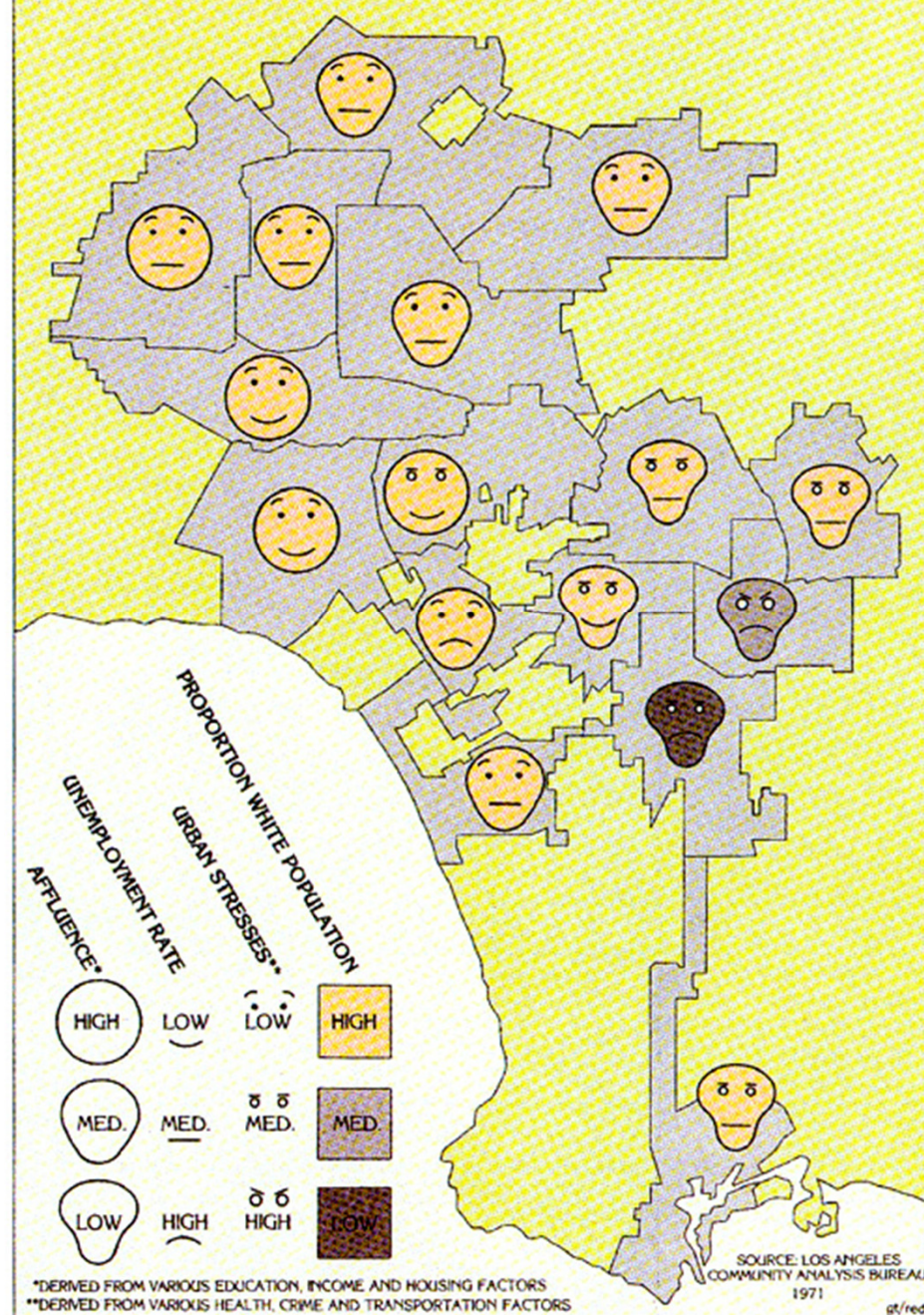
More democratic group

Chernoff Faces

- eyes, ears, mouth and nose represent values of the variables by their shape, size, placement and orientation
- Based on the idea that we are very very good at recognizing facial expression



Life in Los Angeles



Many more exist but...

WE PROBABLY NEED A BREAK?

Visualization Techniques for

TEMPORAL DATA

Charts

- Focus+Context Chart



ProtoVis Example

<http://vis.stanford.edu/protovis/ex/zoom.html>

June 25, 2009

[SIGN IN TO E-MAIL](#)

[FEEDBACK](#)

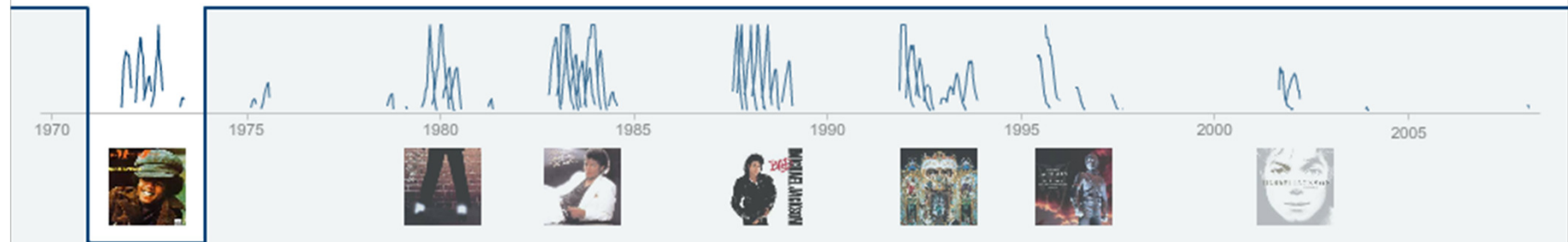
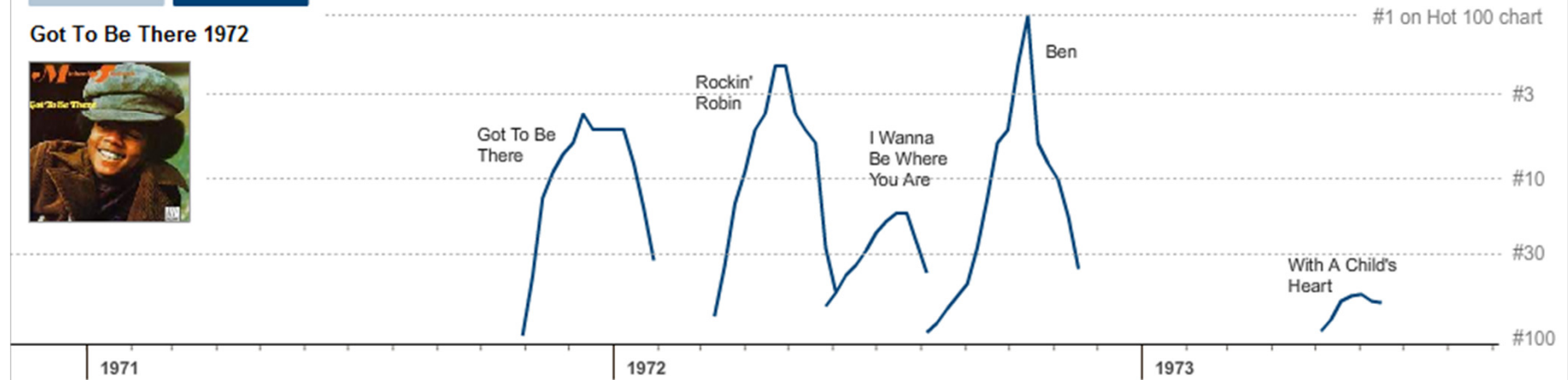
Jackson's Billboard Rankings Over Time

A timeline of how Michael Jackson's songs performed on the [Billboard](#) Hot 100 chart.

[< Previous](#)

[Next >](#)

Got To Be There 1972



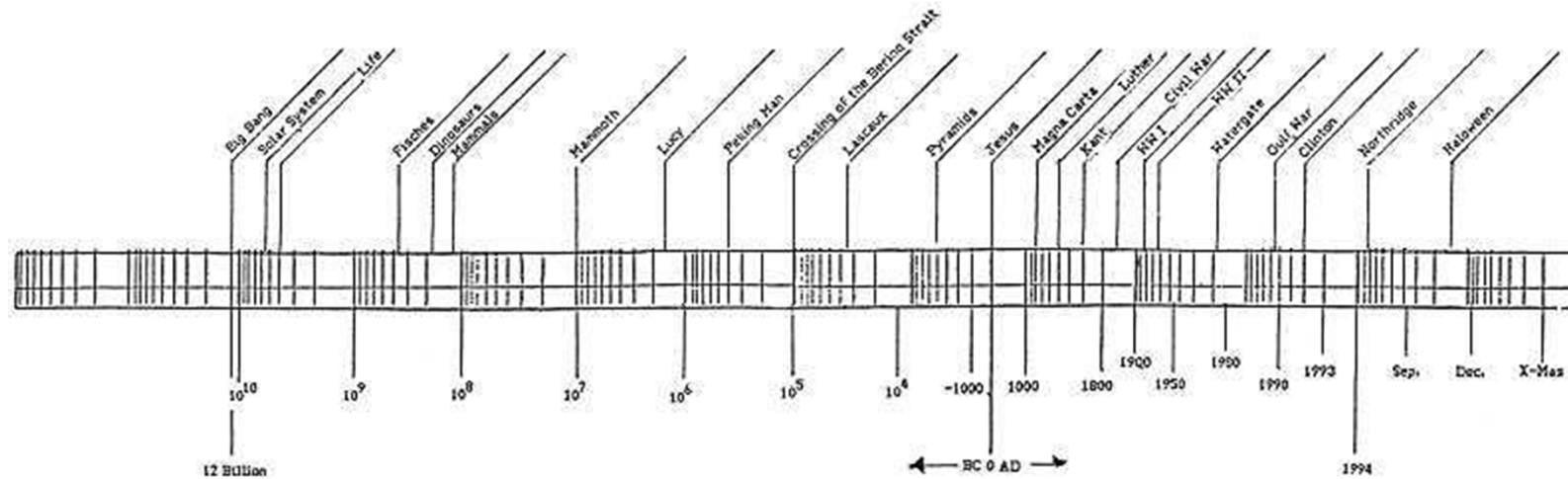
NYTimes

<http://www.nytimes.com/interactive/2009/06/25/arts/0625-jackson-graphic.html>

Log Scales

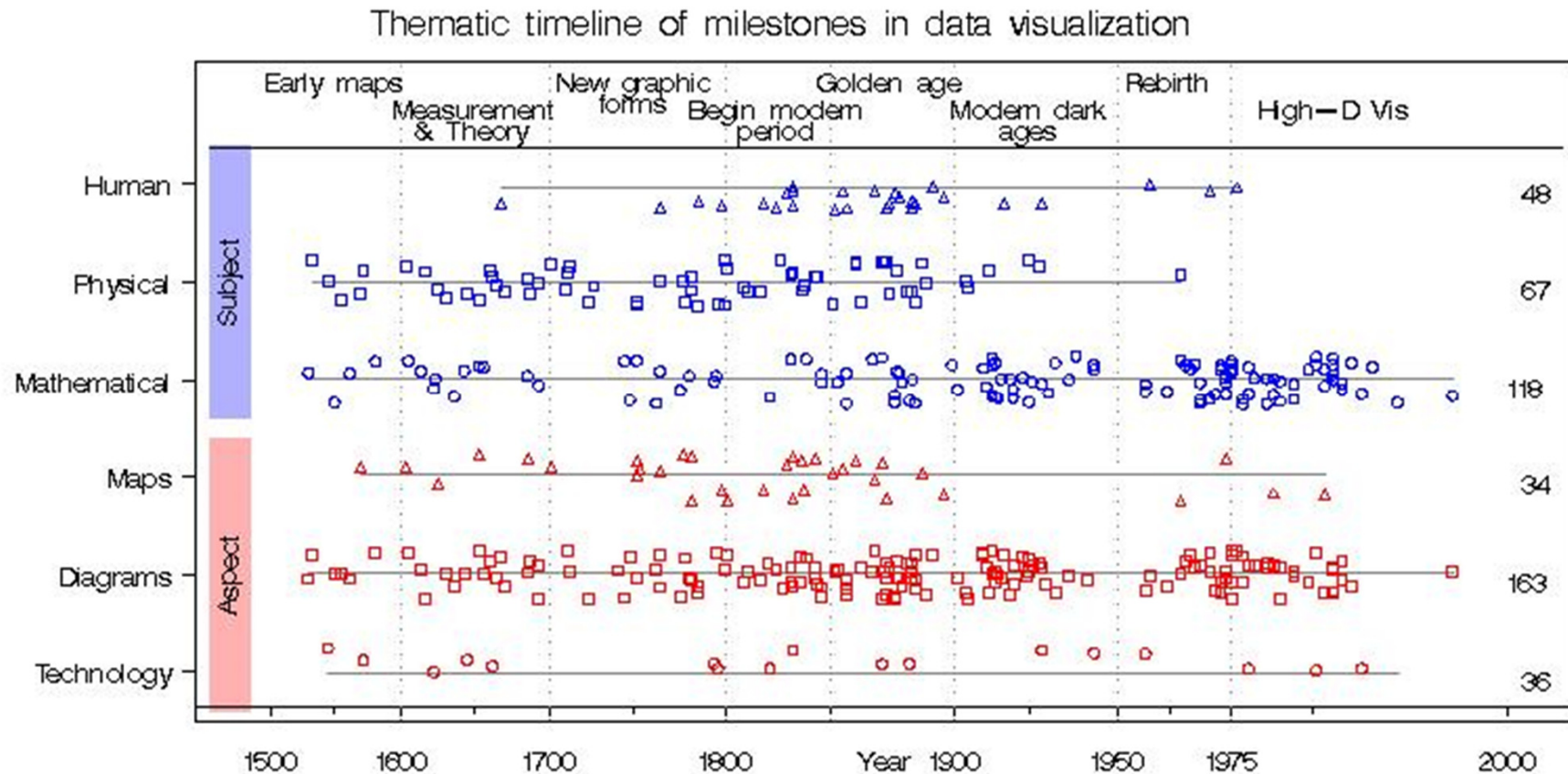
- If timescale too large to fit in one view

Logarithmic



<http://www.math.yorku.ca/SCS/Gallery/timelines.html#hyperhistory>

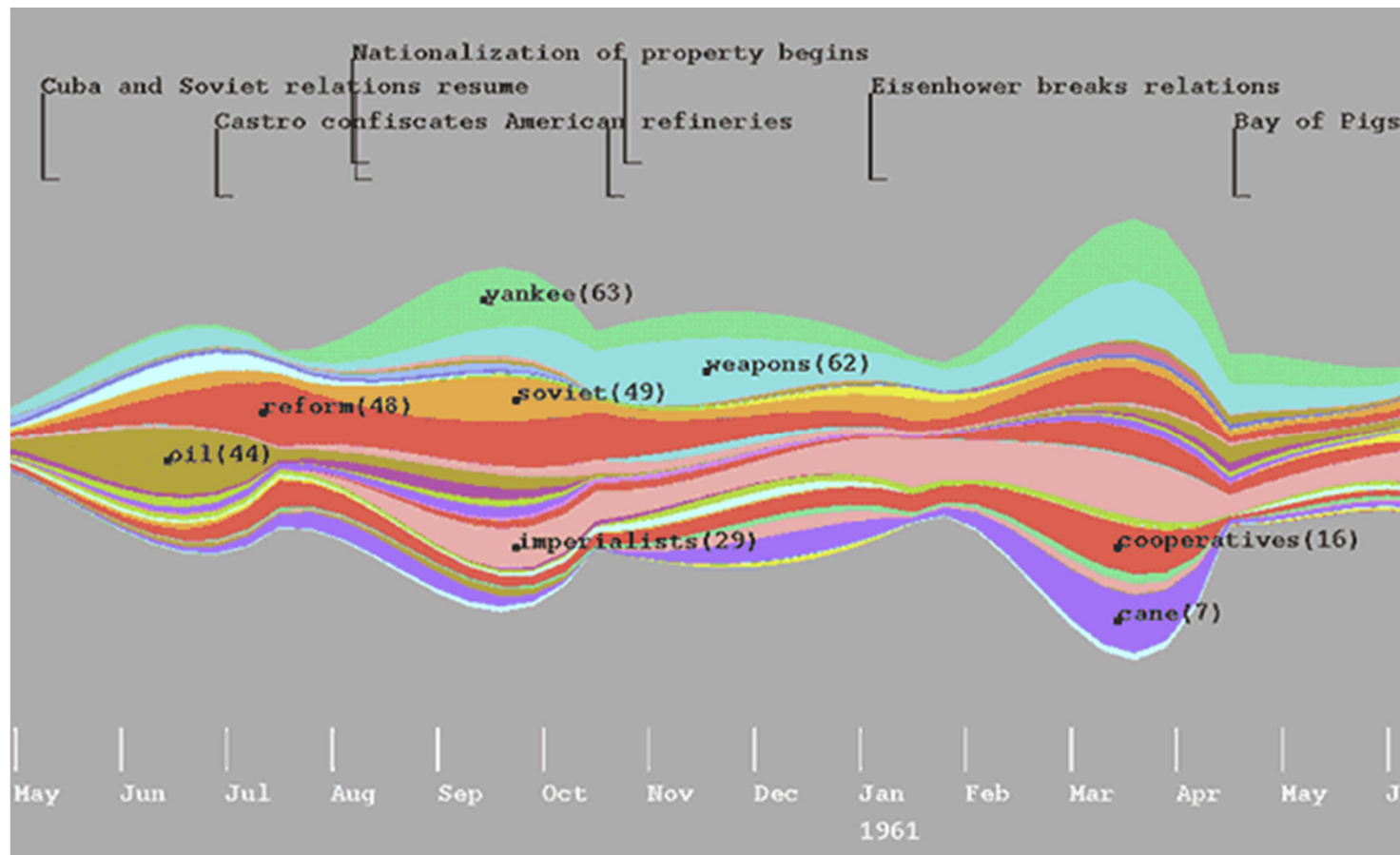
Reverse Square-Root Scale



<http://www.math.yorku.ca/SCS/Gallery/images/timelines/milecatline.jpg>

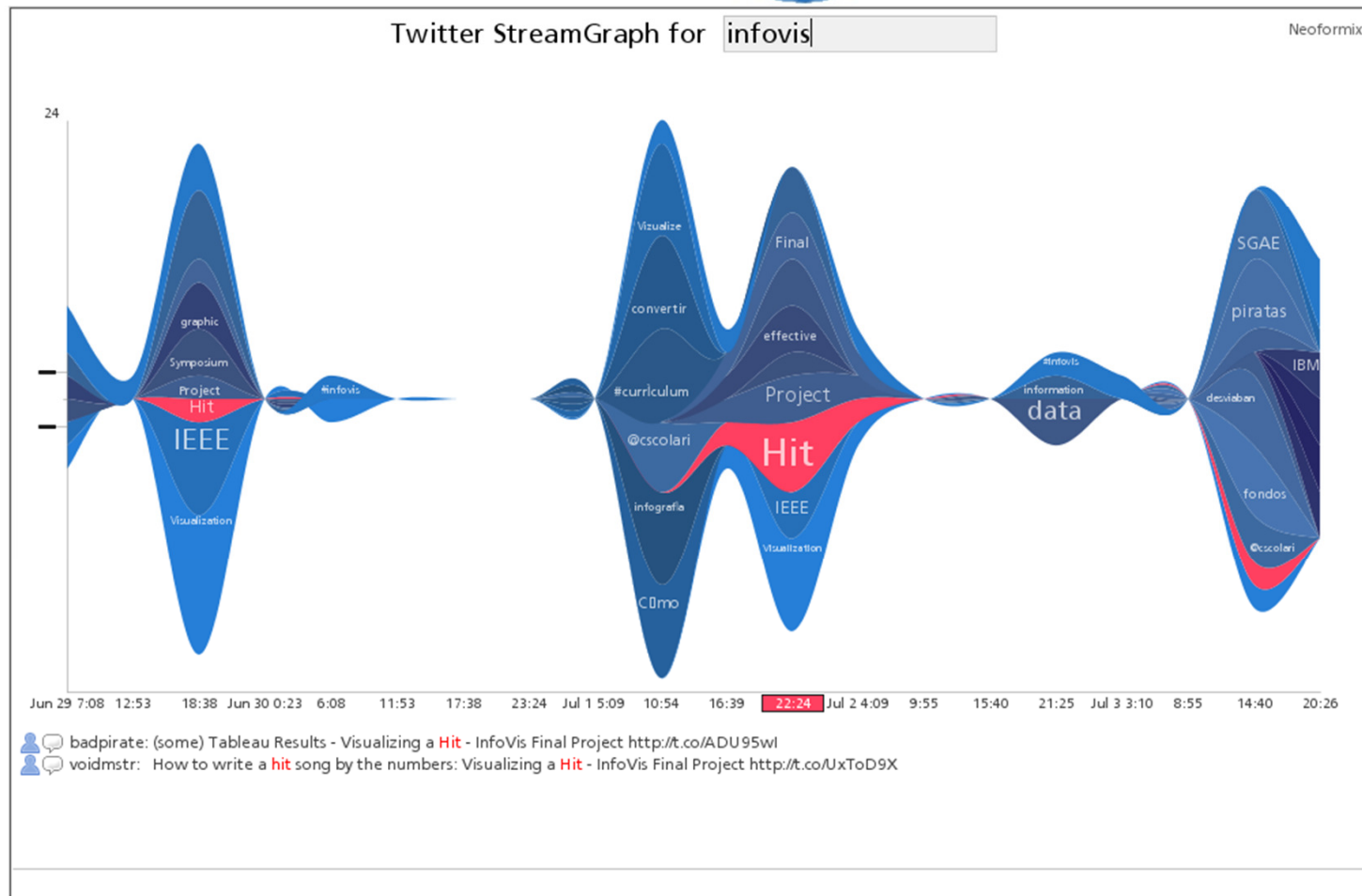
ThemeRiver

- Topic layered on top of each other around central line



StreamGraph

Twitter StreamGraphs



StreamGraph

METRICS

AMANDA COX
AND LEE BYRON

*Ebb and Flow
At the Box Office*

Through Wednesday, the films of 2007 had grossed about \$9.7 billion at theaters in the United States. Ninety-five percent of that total came from films that peaked within two weeks of opening.

But many of the films nominated for the Academy Awards on Sunday — like “Juno,” the runaway independent hit — took much longer to reach their peak. Nominees in categories like best picture are not always audience favorites, and word of mouth or critical acclaim can help them build momentum.

Here is a look at how films fared at the box office in 2007.

Summer

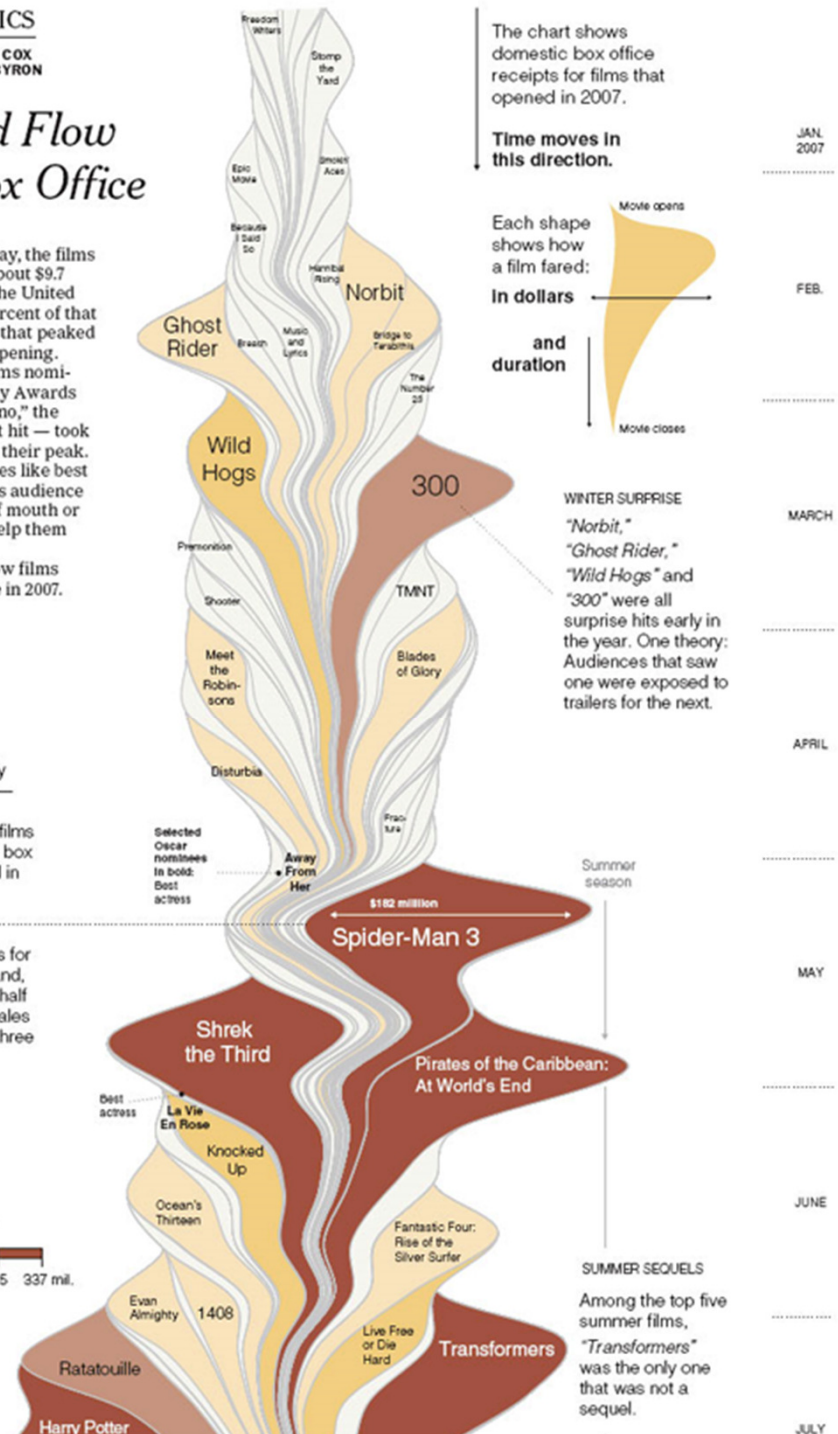
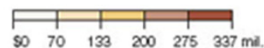
Most films — especially summer blockbusters — peak on their opening weekend. The top five films last year, measured by box office receipts, opened in May or July.

"Spider-Man 3"

beat box-office records for its opening weekend and, when it closed, nearly half of its domestic ticket sales had come from those three days.

Color Key

Total domestic gross,
through Feb. 20, 2008



HistoryFlow

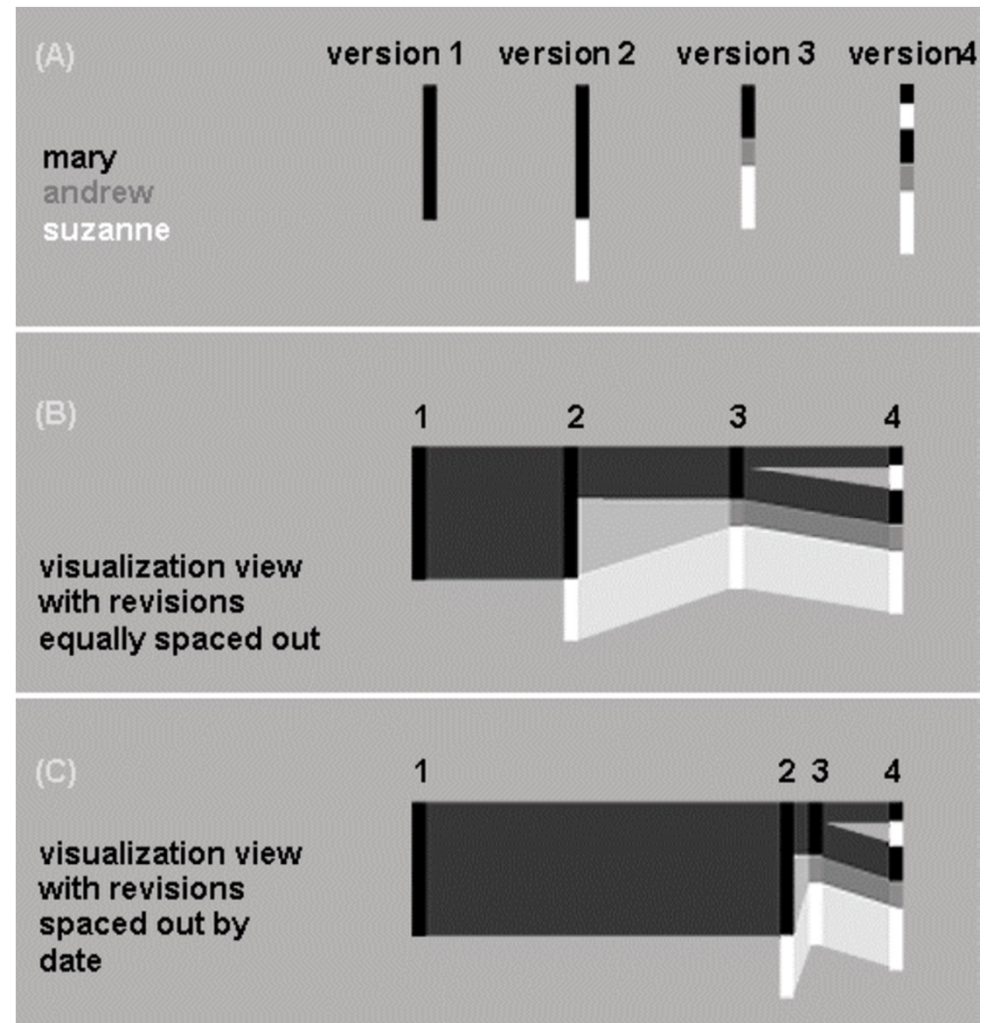
Chocolate

Revision history

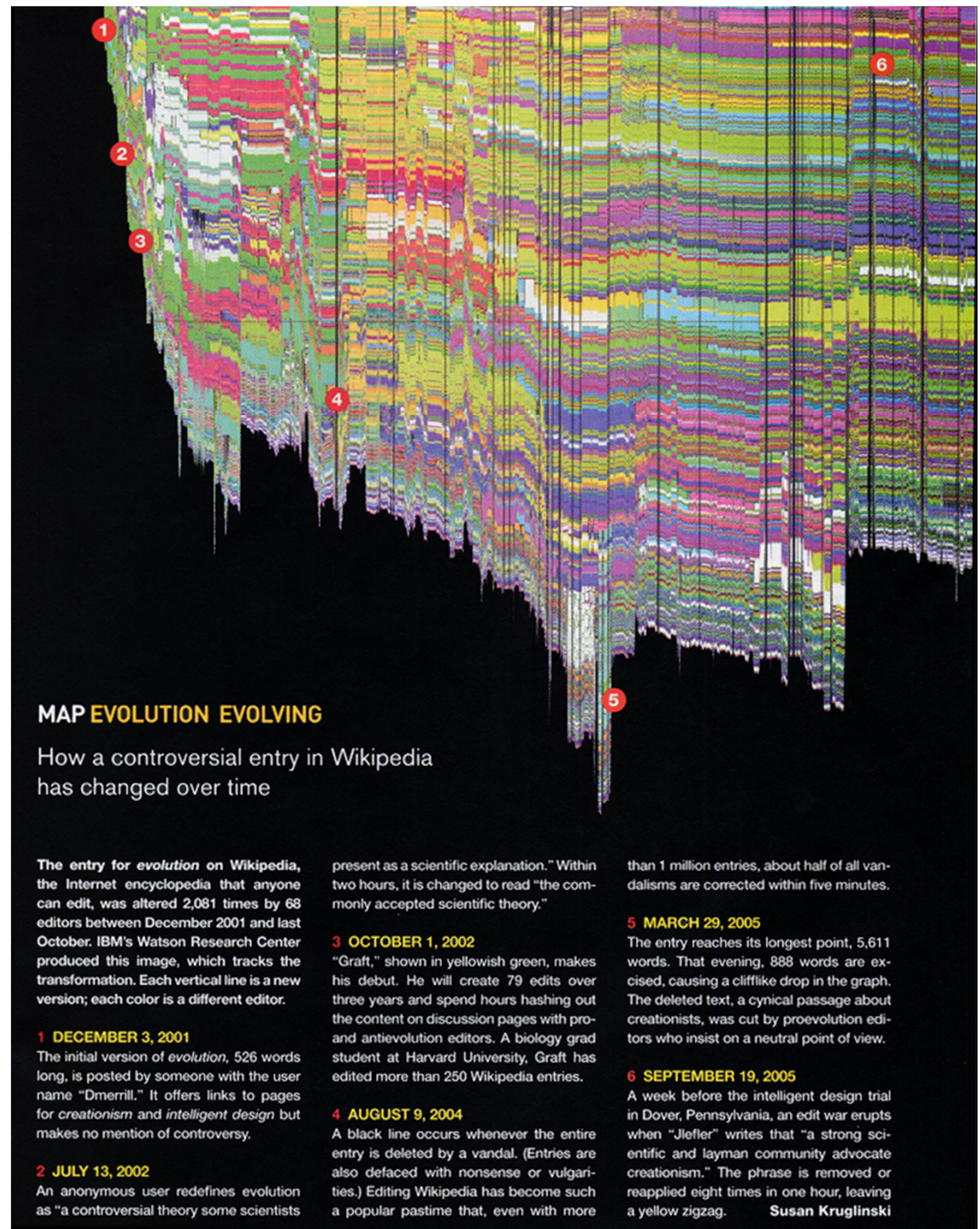
Legend: (cur) = difference with current version, (last) = difference with preceding version, M = minor edit

- (cur) (last) .. 12:01, 20 Aug 2003 .. [Dysprosia](#) (neaten to do, rearrange see also)
- (cur) (last) .. 11:59, 20 Aug 2003 .. [Patrick](#)
- (cur) (last) .. 11:52, 20 Aug 2003 .. [81.203.98.109](#)
- (cur) (last) .. M 18:36, 6 Aug 2003 .. [Manika](#) (corrected spelling)
- (cur) (last) .. 18:32, 6 Aug 2003 .. [Daniel Quinlan](#) (removing obscure heraldry information, belongs on [[heraldry]] if anywhere)
- (cur) (last) .. 15:21, 6 Aug 2003 .. [Rmhermen](#)
- (cur) (last) .. 15:08, 6 Aug 2003 .. [Cyp](#) (Chocolate often has odd shapes.)
- (cur) (last) .. 19:14, 3 Aug 2003 .. [Daniel C. Boyer](#) ("chocolate" as shade of gules in heraldry)
- (cur) (last) .. M 02:00, 30 Jul 2003 .. [Evercat](#) (fmt)

Fig 1: Detail of revision history of Wikipedia's *Chocolate* page.

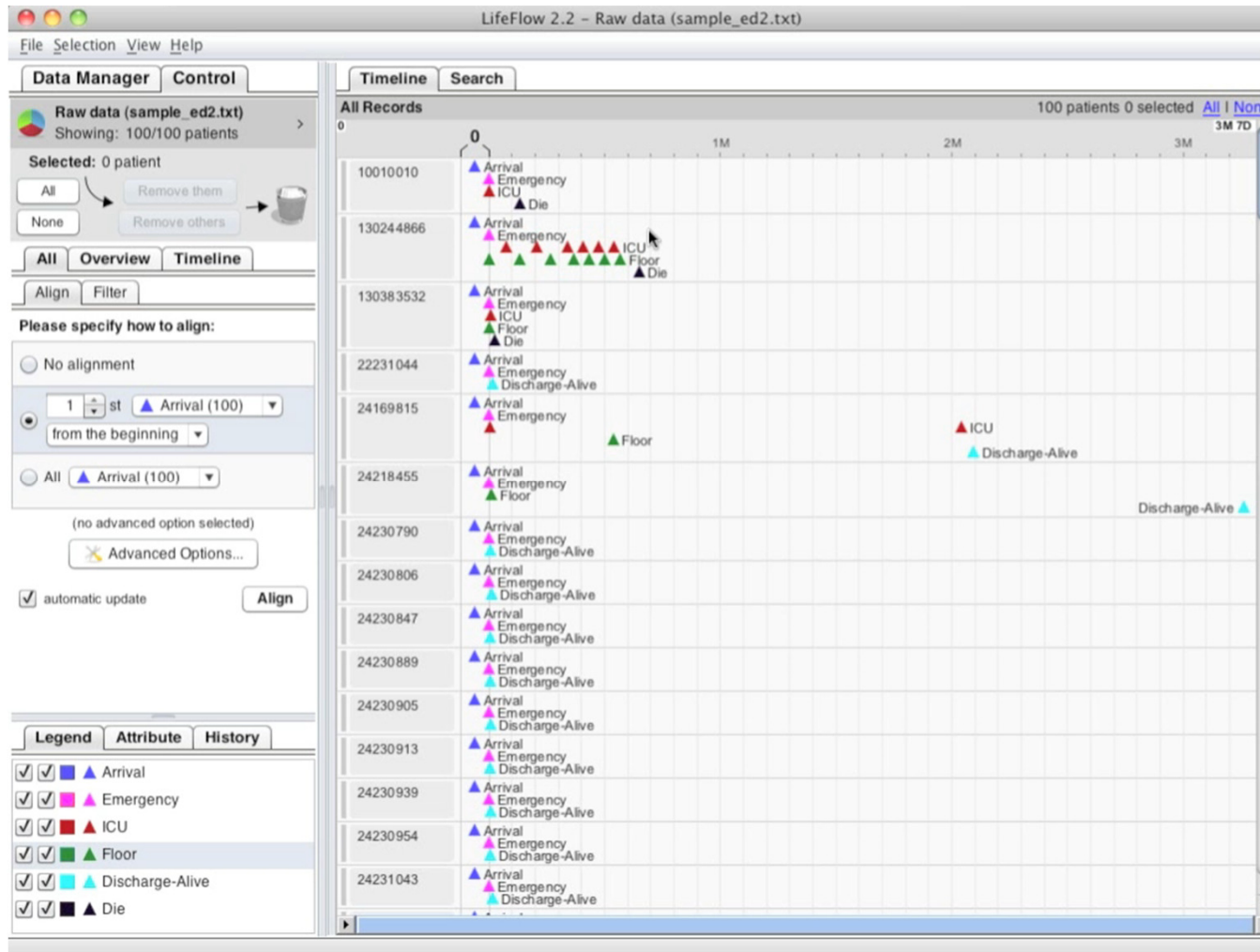


HistoryFlow

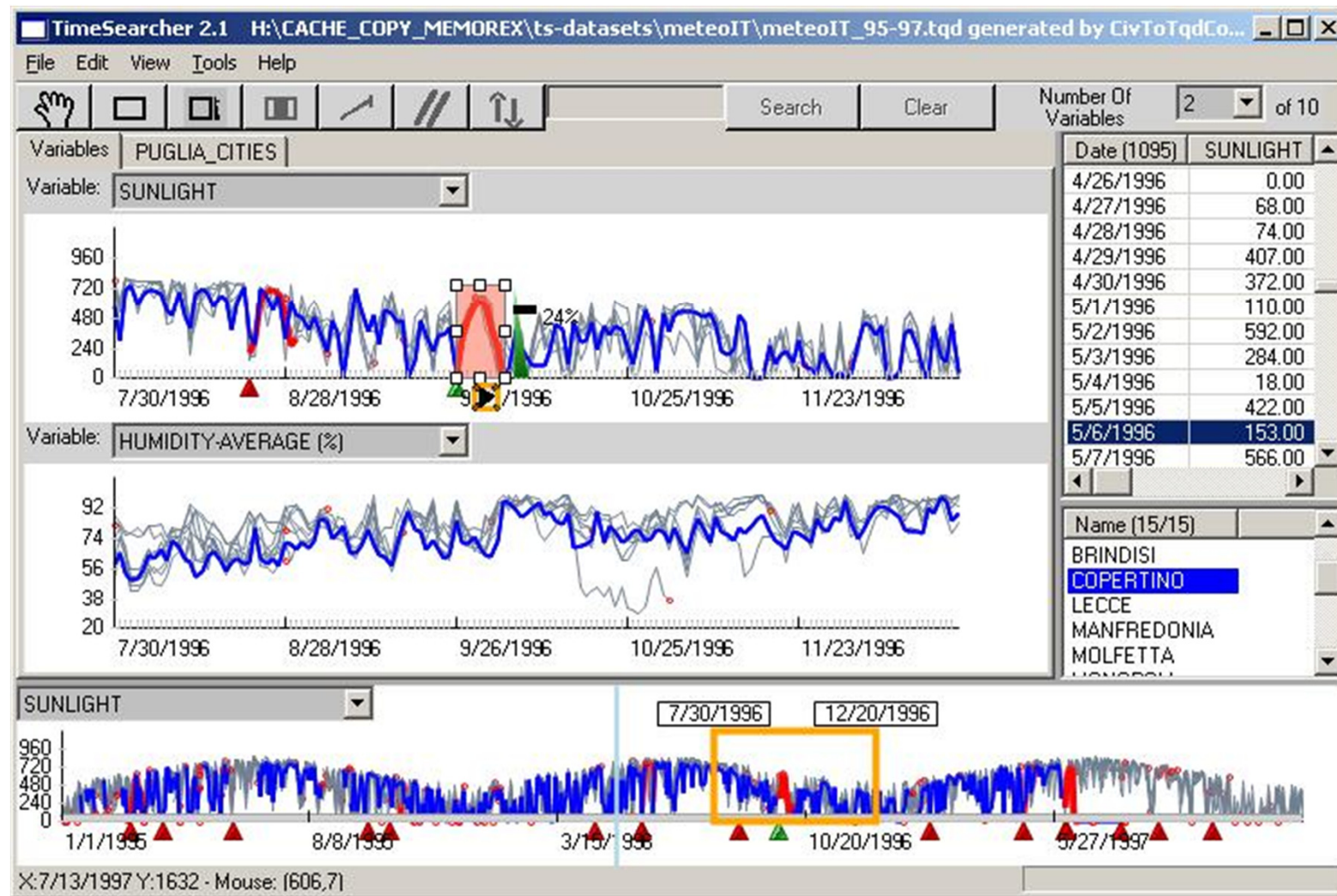


Viegas et al., 2004

LifeFlow



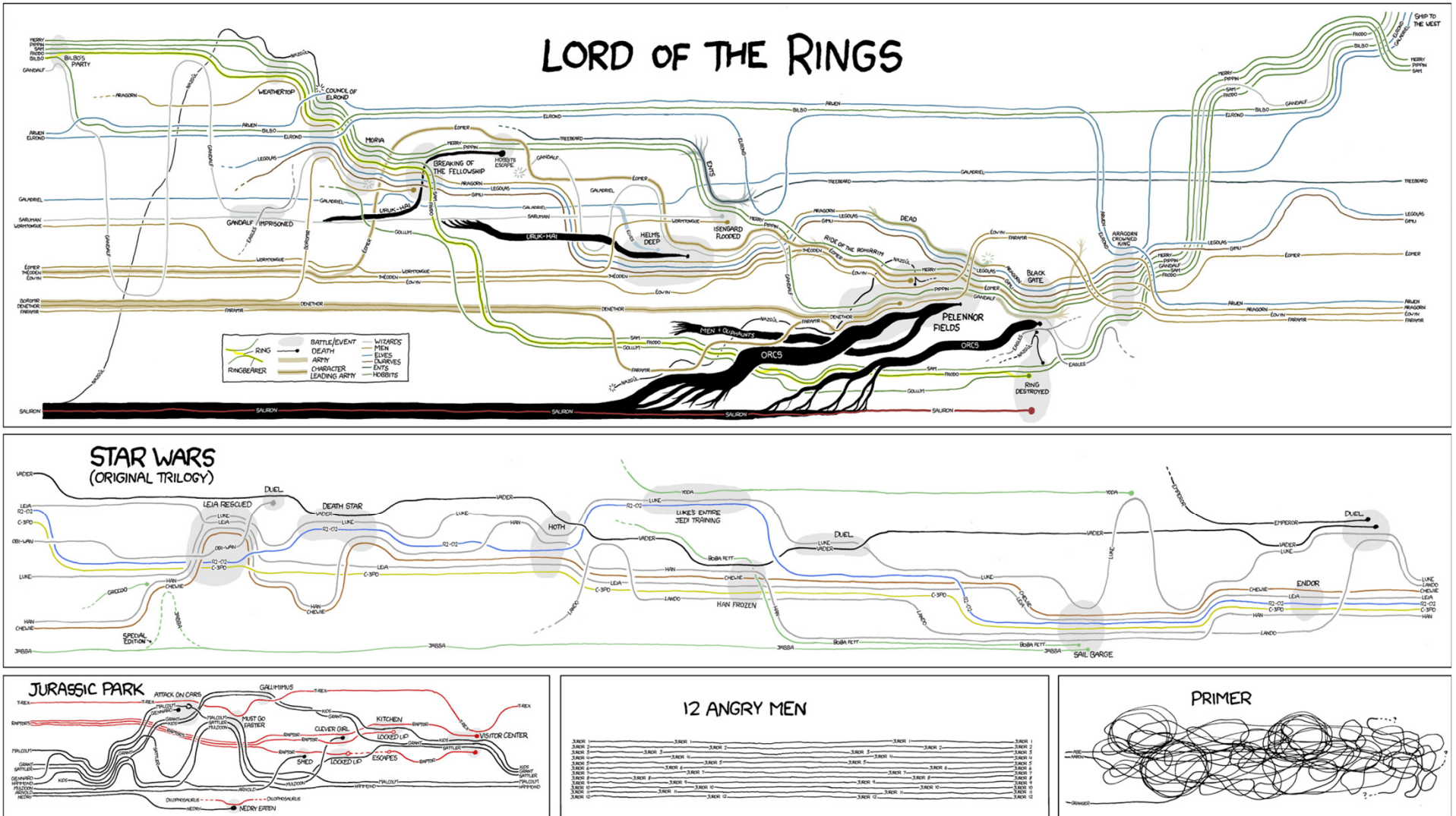
TimeSearcher



Download running version here: <http://www.cs.umd.edu/hcil/timesearcher/>

Narrative Chart

THESE CHARTS SHOW MOVIE CHARACTER INTERACTIONS. THE HORIZONTAL AXIS IS TIME. THE VERTICAL GROUPING OF THE LINES INDICATES WHICH CHARACTERS ARE TOGETHER AT A GIVEN TIME.



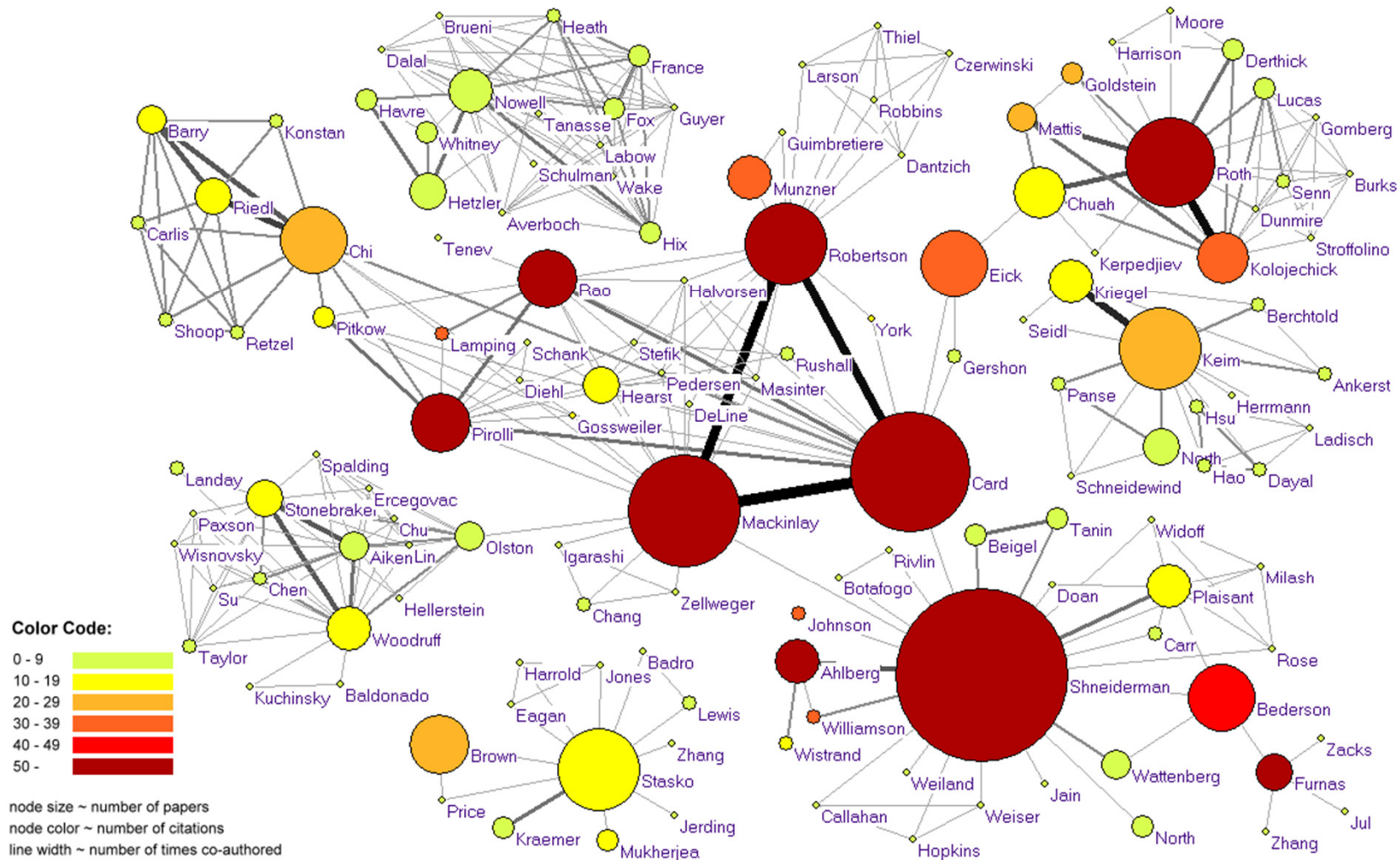
Visualization Techniques for

GRAPHS

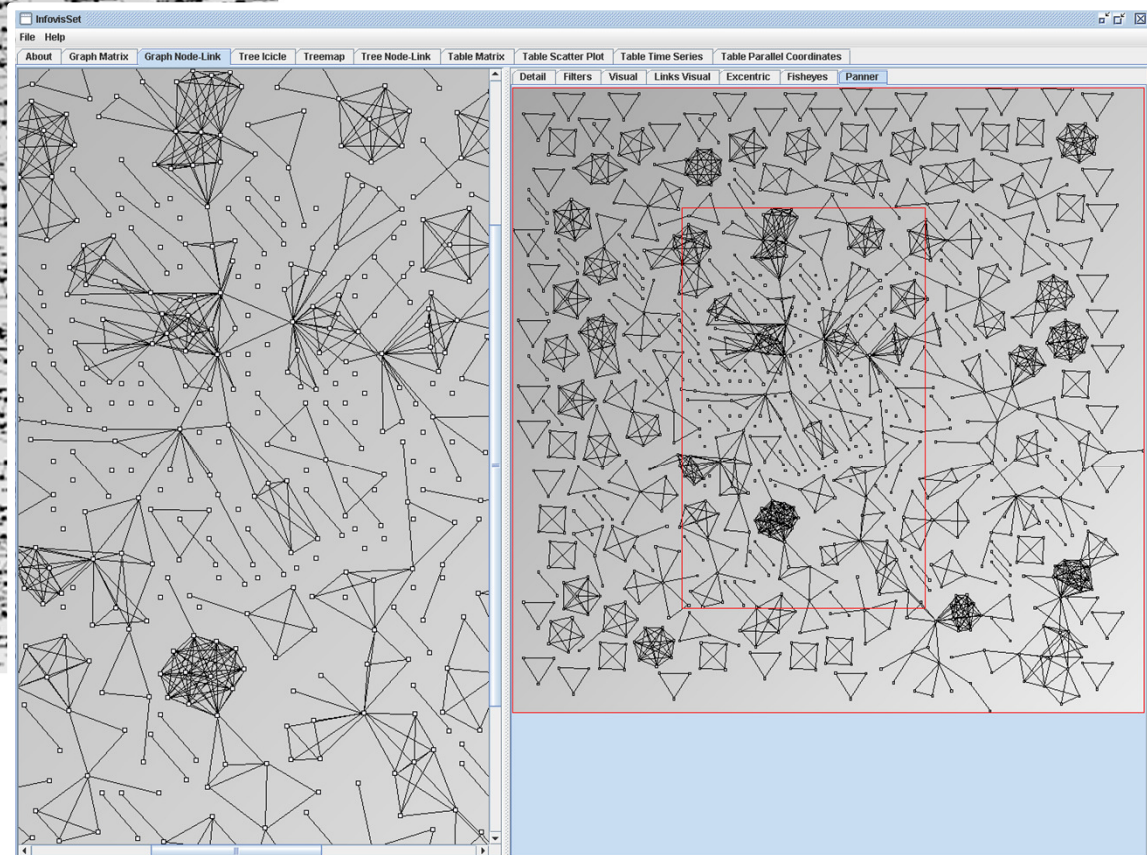
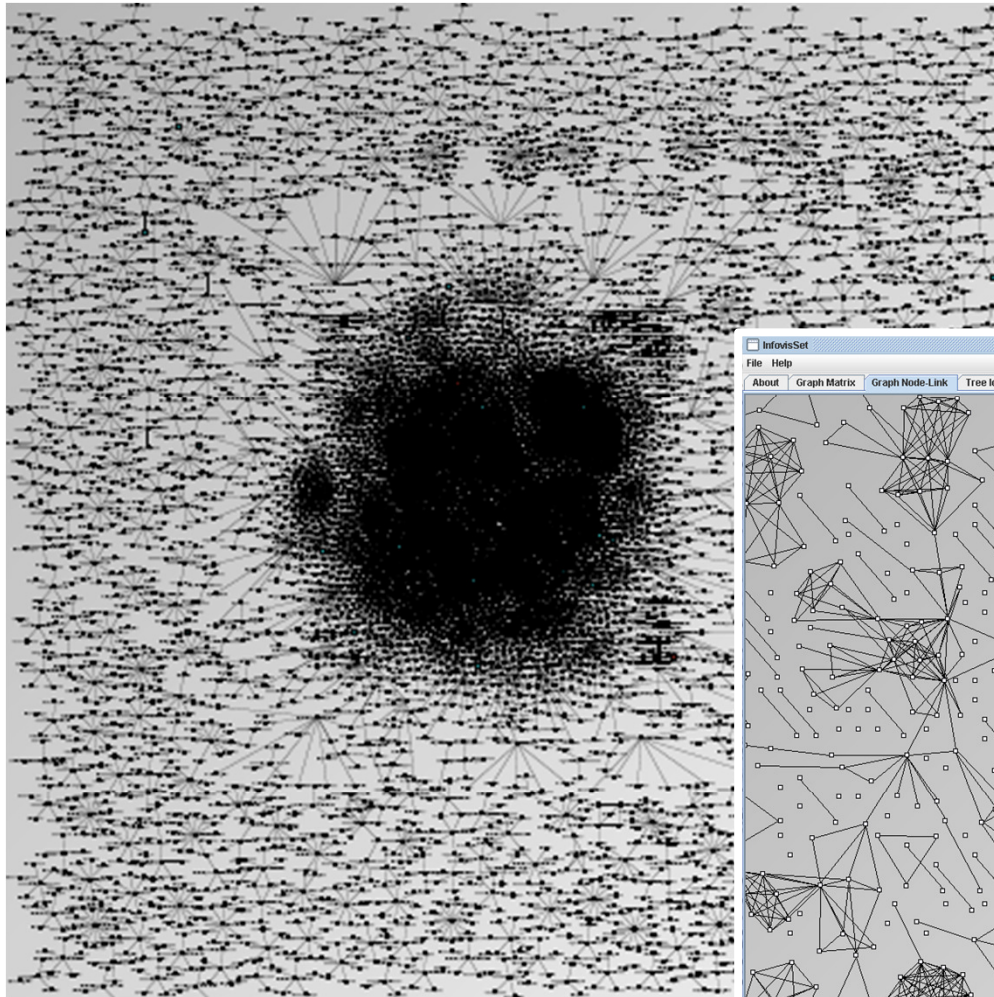
Graphs

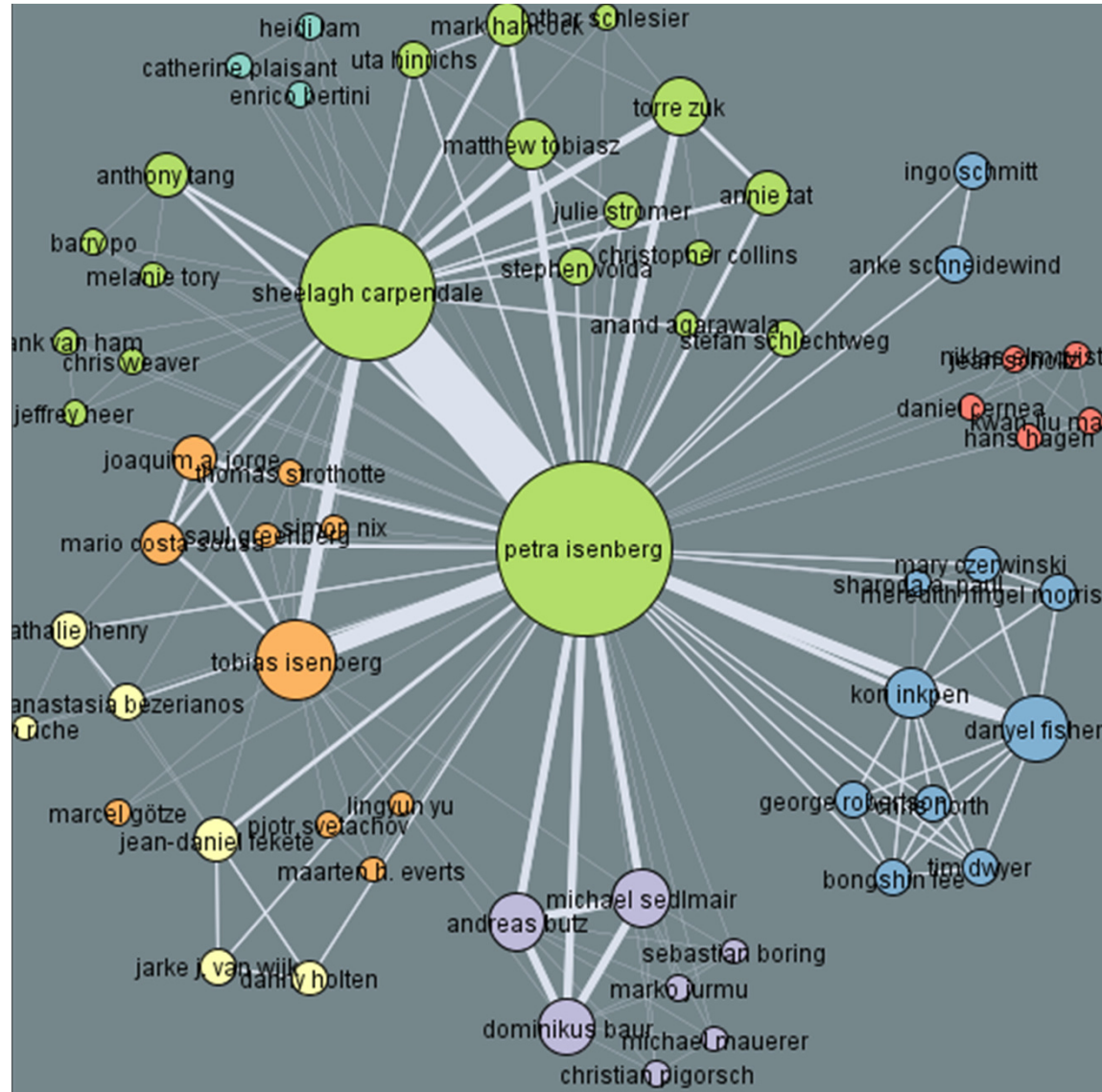
- Represent relationships among data
- Consist of nodes and edges
- Graph Drawing is a big research area in infovis
 - has its own conferences

InfoVis Co-authoring (K. Börner et al.)



Generally, after loading...





Same data using LinLog Layout – a specialized layout for social networks

Graph Drawing Criteria

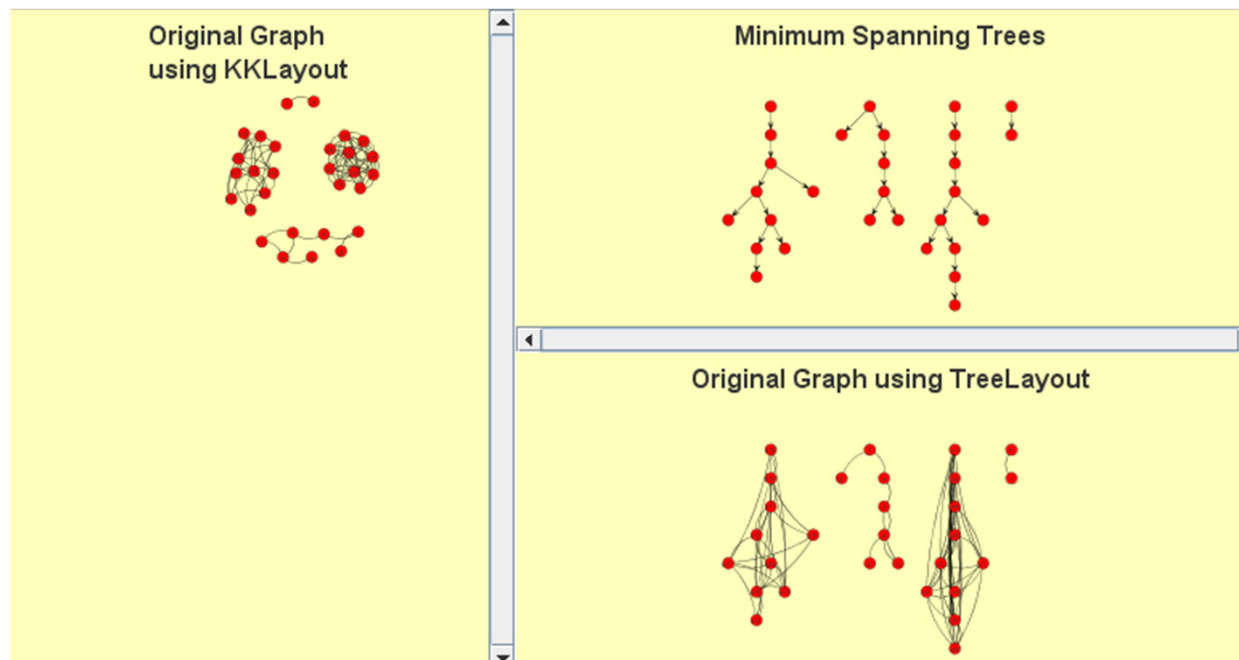
Crossings:	Minimization of edge crossings. Ideally a planar graph.
Area:	Minimization of the area of the drawing.
Total Edge Length:	Minimization of the sum of the lengths of the edges.
Maximum Edge Length:	Minimization of the maximum length of an edge.
Uniform Edge Length:	Minimization of the variations in edge length.
Total Bends:	Minimization of the total number of bends along an edge.
Maximum Bends:	Minimization of the maximum number of bends on an edge.
Uniform Bends:	Minimization of the number of bends on an edge.
Aspect Ratio:	Minimization of the aspect ratio of the drawing.
Symmetry:	Display symmetries of the graph in the drawing.
Angular Resolution:	Maximization of the smallest angle between two edges incident at a node.

Approaches to Graph Layout

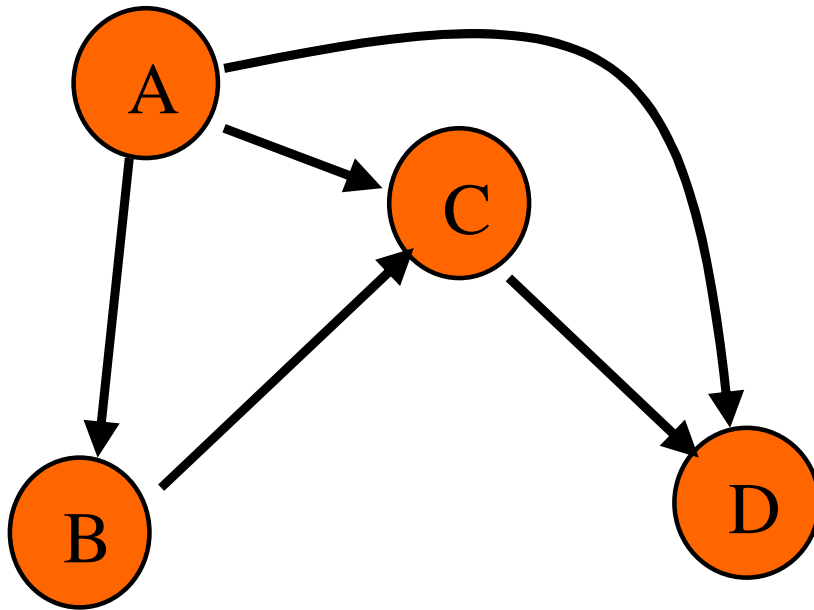
- Direct layout calculation using graph structure
 - Tree layout on spanning tree
 - Hierarchical layout
 - Adjacency matrix layout
- Optimization-based layout
 - Constraint satisfaction
 - Force-directed layout
- Attribute-driven layout
 - Layout using data attributes, not linkage

Spanning-Tree Layout

- Many graphs are tree-like or have useful spanning trees
 - Websites, Social Networks

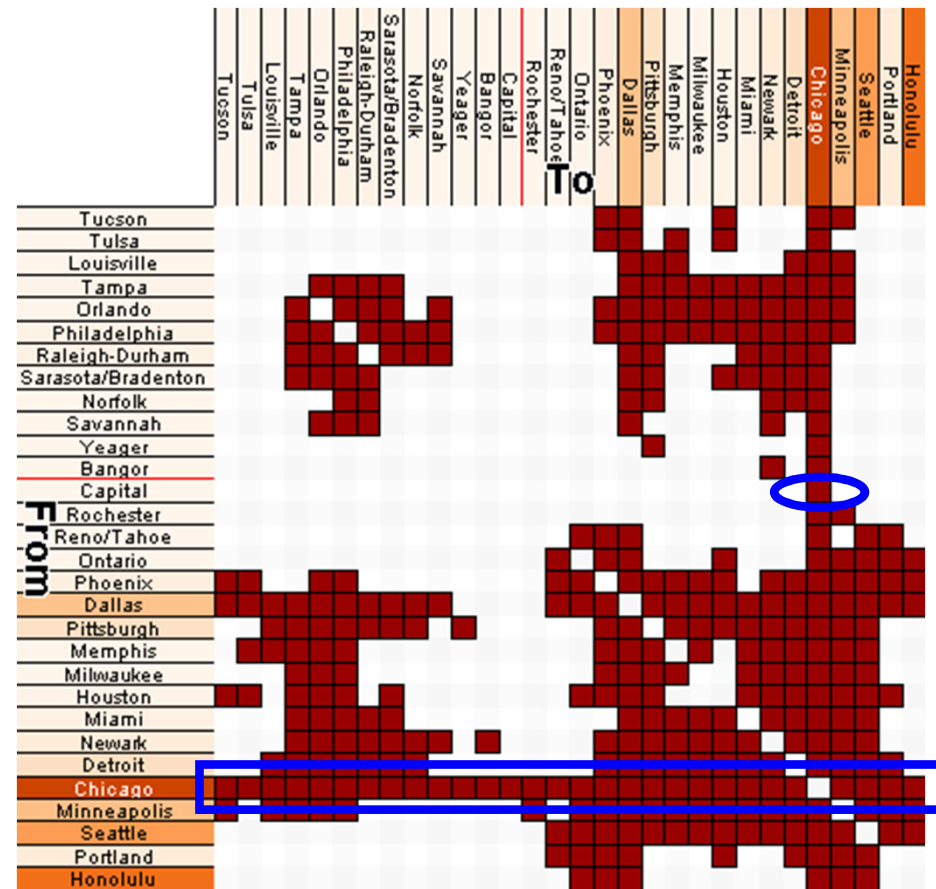
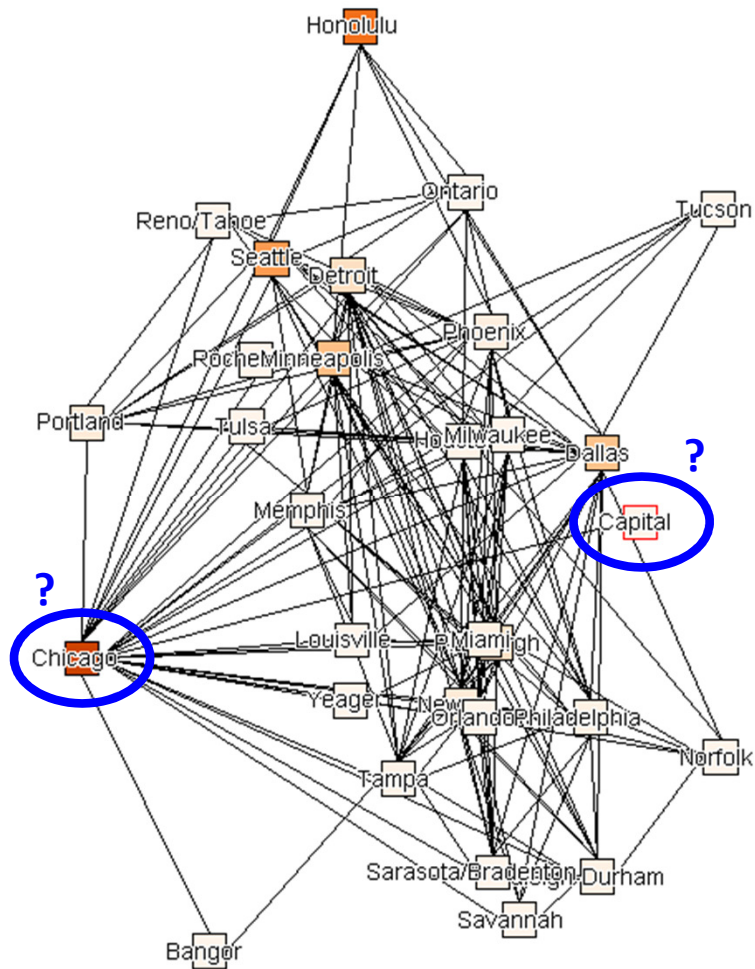


Alternative: Matrix Representation

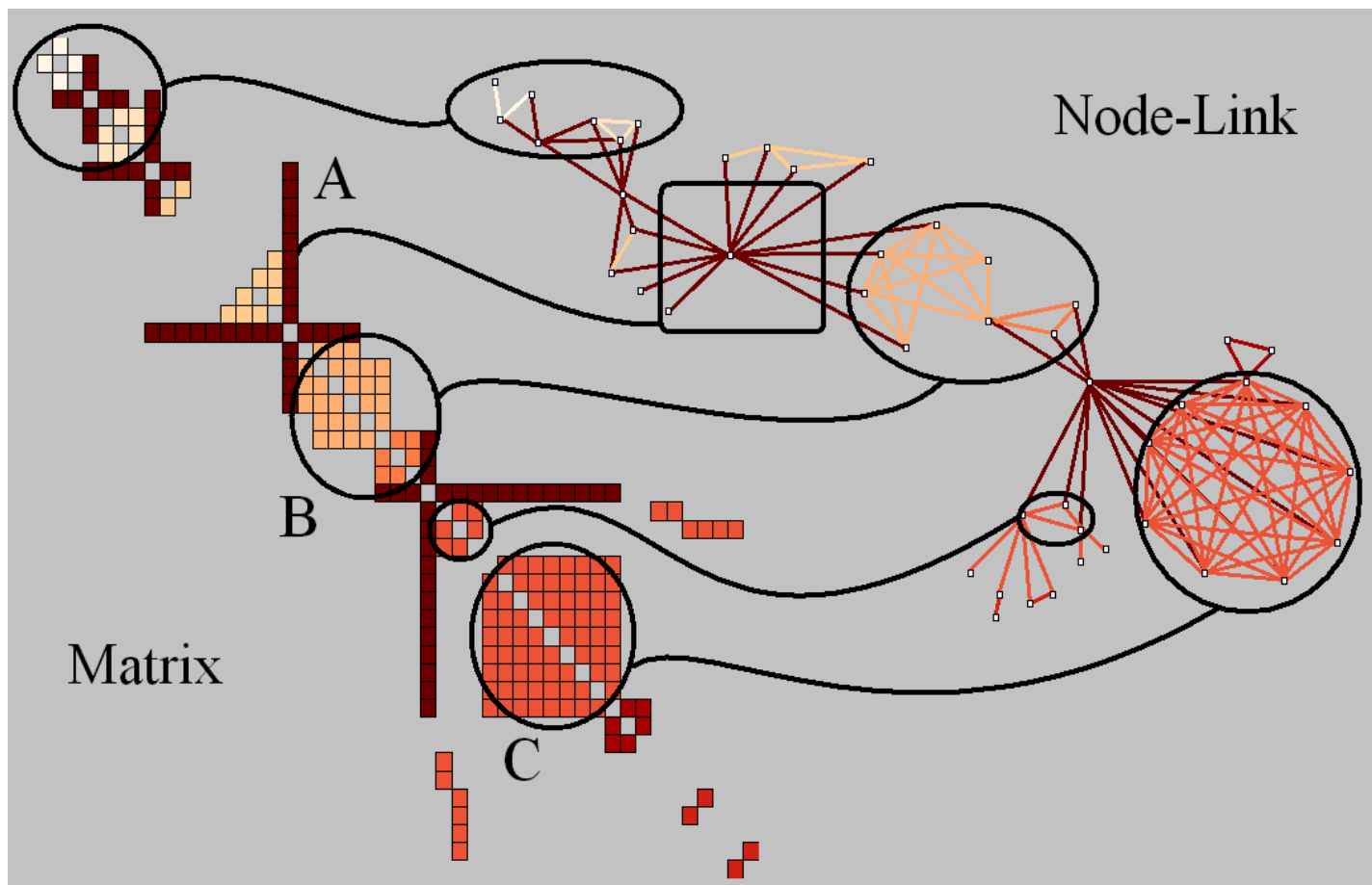


	A	B	C	D
A		X	X	X
B			X	
C				X
D				

Matrix Visualization



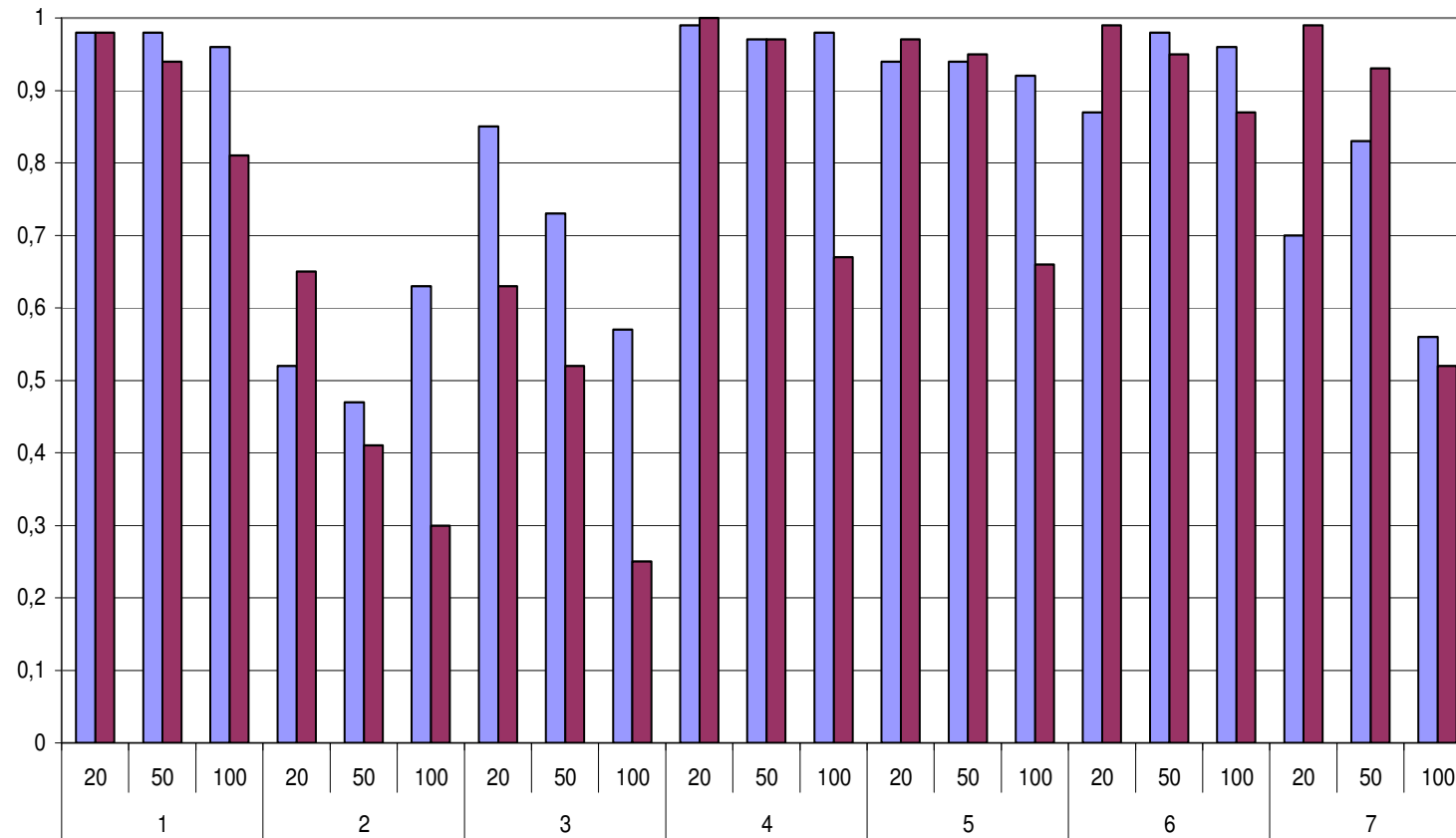
Visual Patterns with Ordered Matrices



User Study

- Tasks related to the overview
 - Number of vertices
 - Number of arcs
- Tasks related to graph elements
 - Finding an element (vertex, link)
 - Finding the most connected vertex (central actor, pivot, hub)
 - Finding a common neighbor
 - Finding a path
- Random graphs (3 sizes & 3 densities)
- 2 representations: Node-Link + Matrix

User Study



Completion time for the 7 tasks, 3 densities and 2 representations
(Node-Link in blue, Matrix in red)

User Study

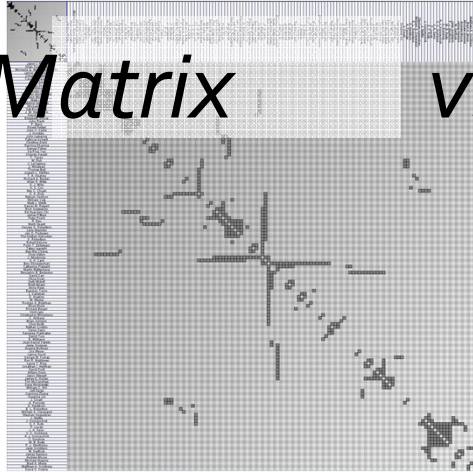
Results:

- Node-link diagrams are preferable for small sparse graphs (20 vertices)
- Matrices are more readable *wrt* dense graphs and medium/large graphs (> 20 vertices) *wrt* the selected tasks, except path finding

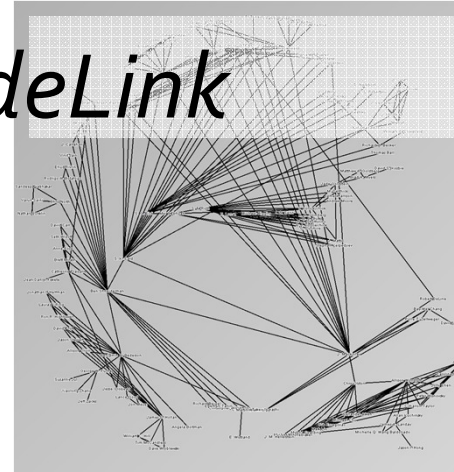
Reference:

Mohammad Ghoniem, Jean-Daniel Fekete and Philippe Castagliola *Readability of Graphs Using Node-Link and Matrix-Based Representations: Controlled Experiment and Statistical Analysis*, Information Visualization Journal, 4(2), Palgrave Macmillan, 2005, pp. 114-135.

Matrix vs.



NodeLink



+

- Usable without reordering
- No node overlapping
- No edge crossing
 - Readable for dense graphs
- Fast navigation
- Fast manipulation
 - Usable interactively
- More readable for some tasks

-

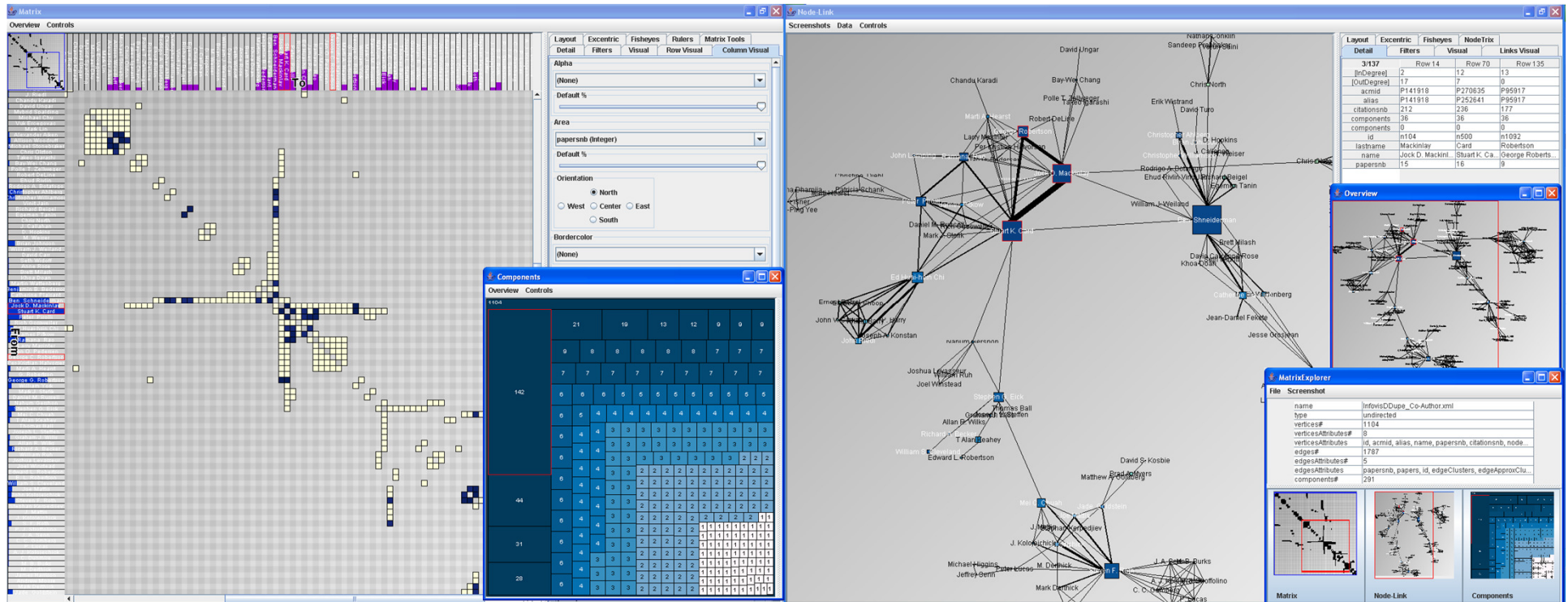
- Less familiar
- Use more space
- Weak for path following tasks

- Familiar
- Compact
- More readable for path following
- More effective for small graphs
- More effective for sparse graphs

- Useless without layout
- Node overlapping
- Edge crossing
 - Not readable for dense graphs
- Manipulation requires layout computation

MatrixExplorer [Henry&Fekete6]

Combined representation

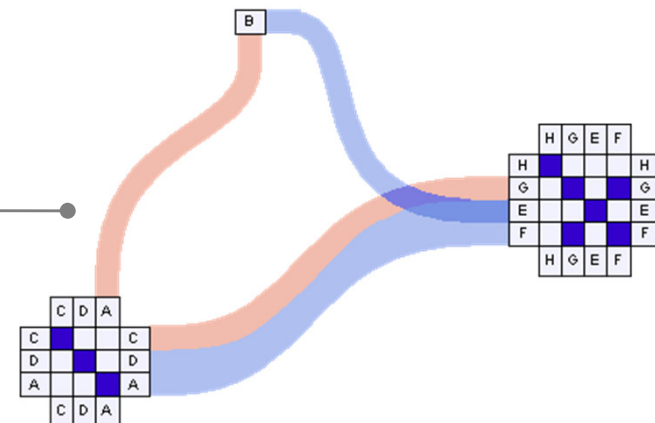
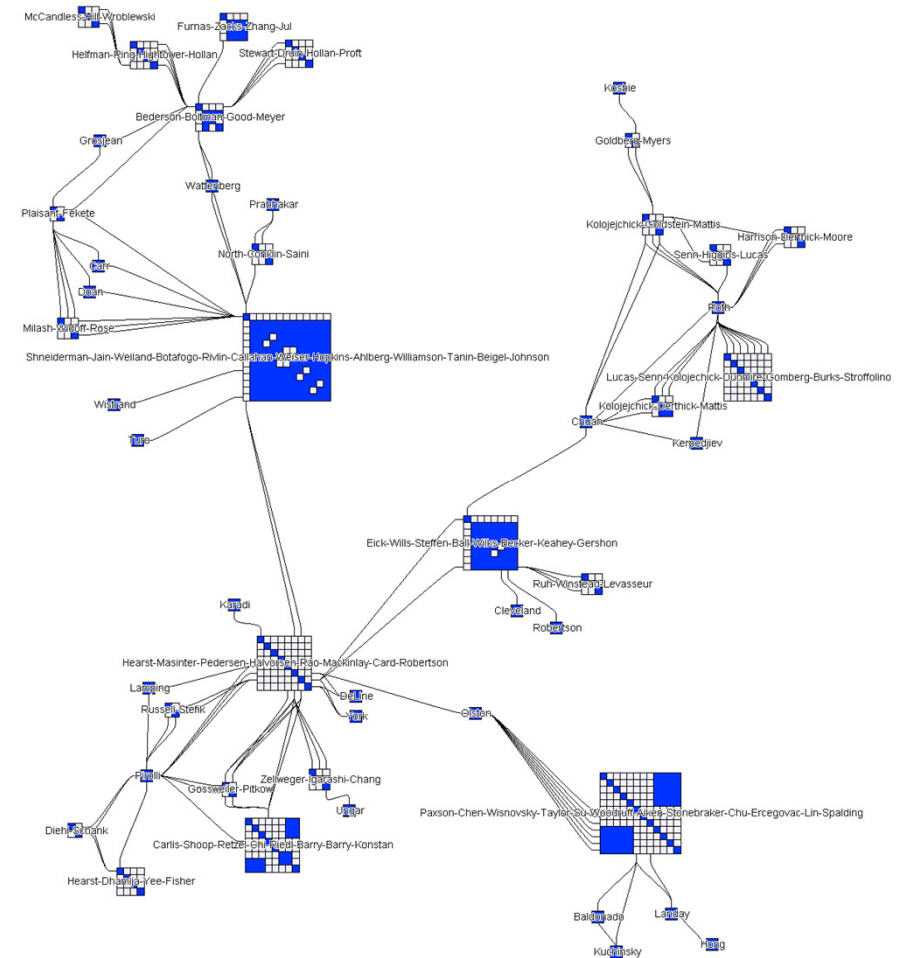


- Matrices to explore
- Node-Link diagrams to present findings

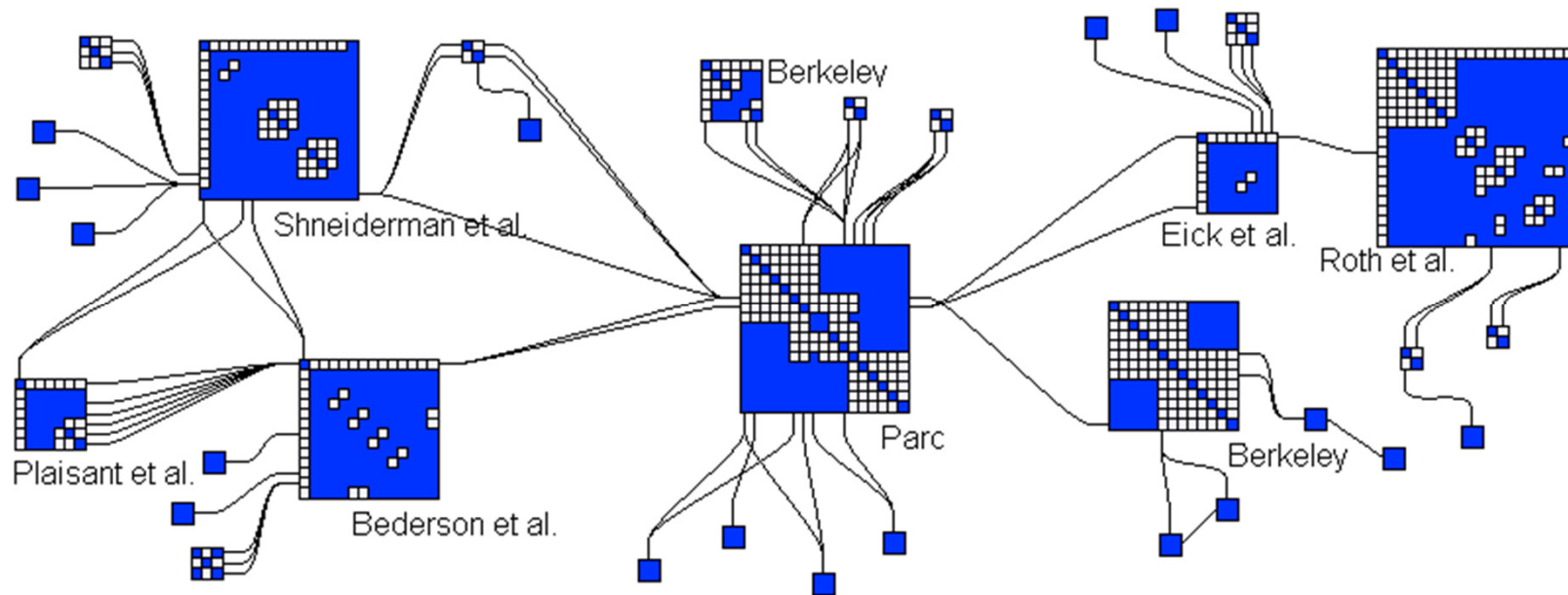
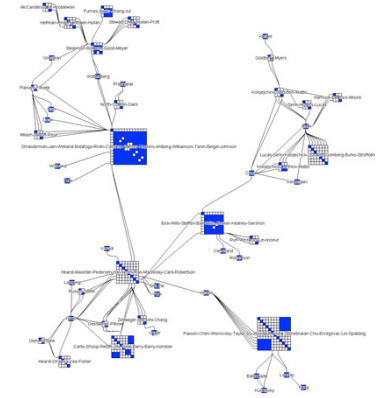
NodeTrix [Henry et al.07]

Hybrid representation

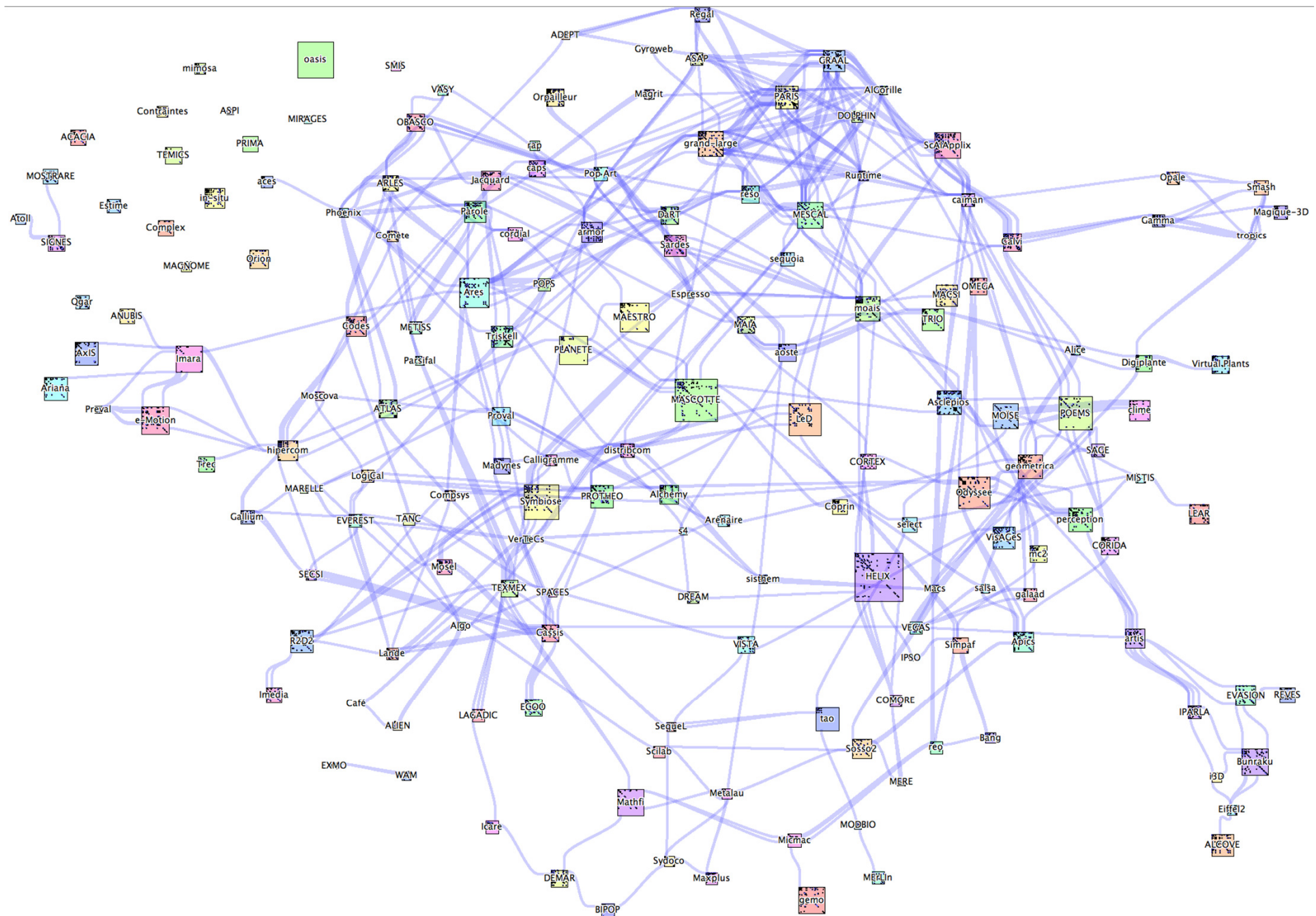
- Designed for small-world networks
 - Globally sparse
 - Locally dense
- Visualizing dense sub-graphs as matrices
- Interact to create, edit and remove the matrices

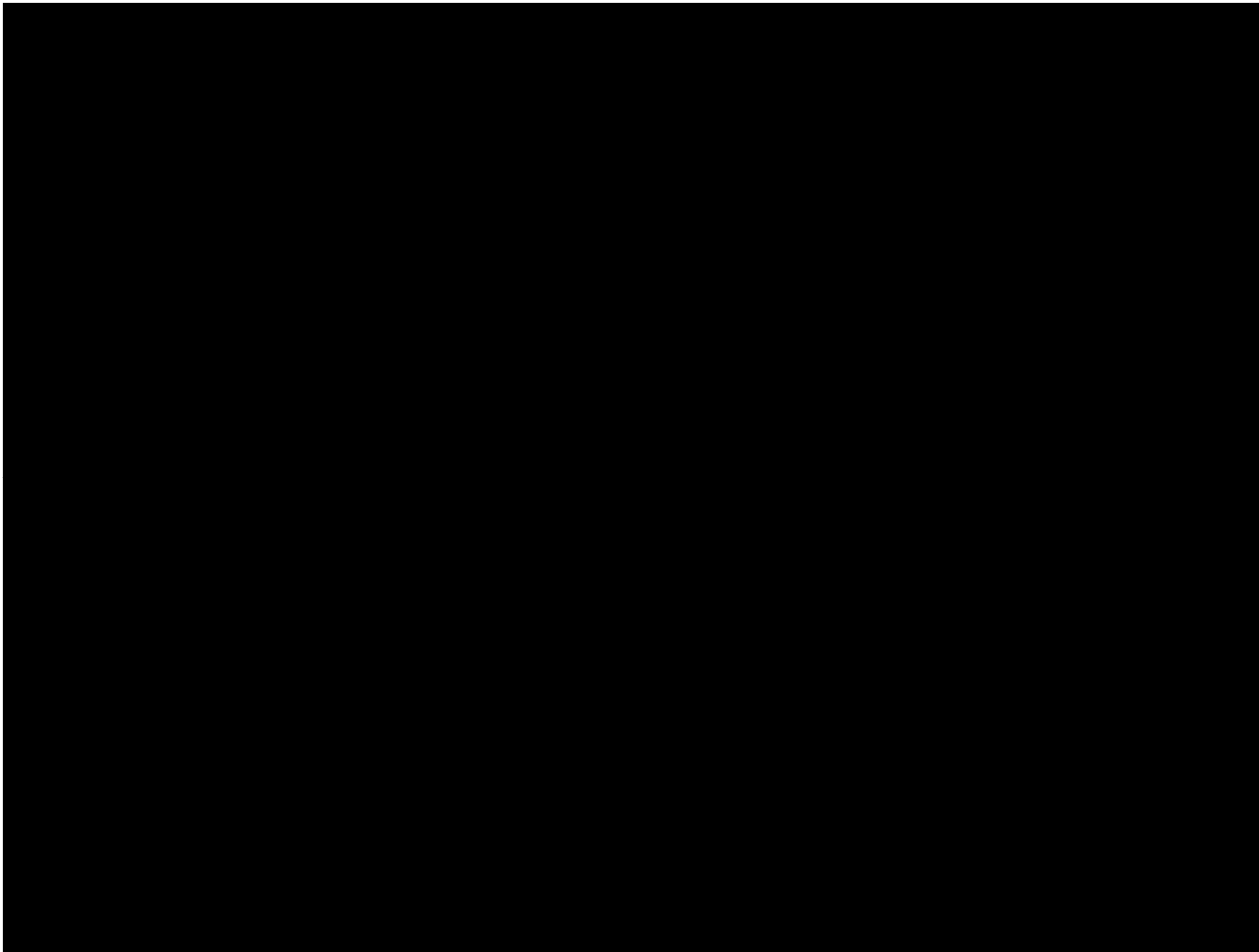


Visual Patterns



Infovis Coauthorship (133 actors)





Video on NodeTrix

http://www.lri.fr/~nhenry/nodetrix/NodeTrix_h264.mov

Force-Directed Layout

- Edges = springs
- Nodes = charged particles
- Repeatedly calculate forces, update node positions

<http://mbostock.github.com/d3/ex/force.html>

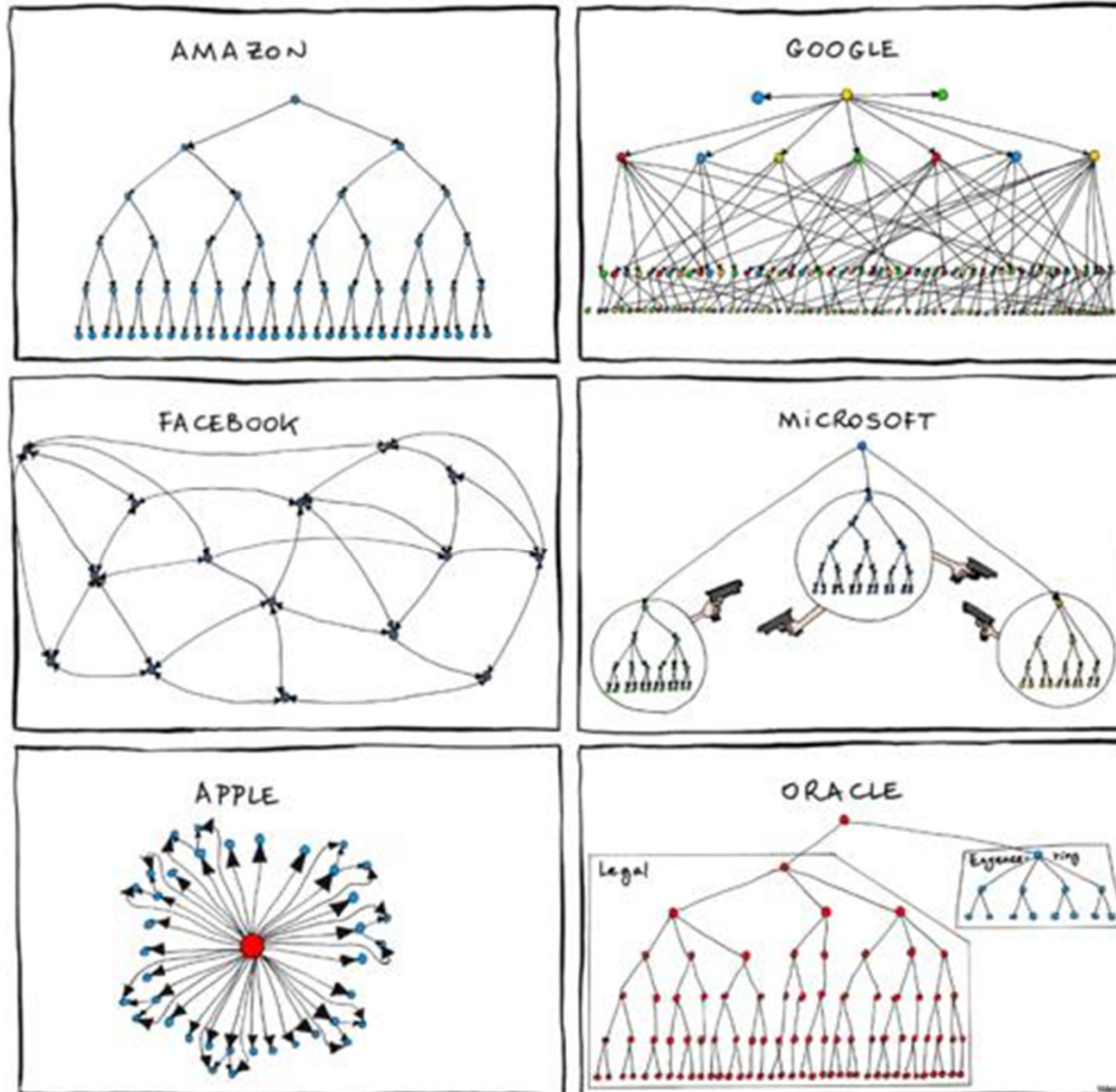
Attribute-Driven Layout

Network Visualization by Semantic Substrates

Ben Shneiderman and Aleks Aris
University of Maryland, HCIL

Copyright 2006

And finally...

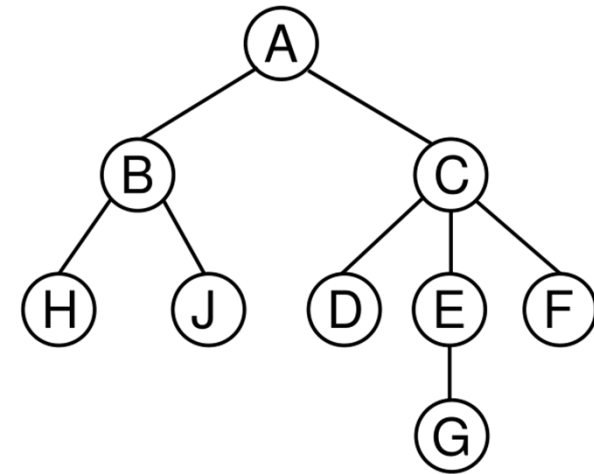


Visualization Techniques for

HIERARCHICAL DATA

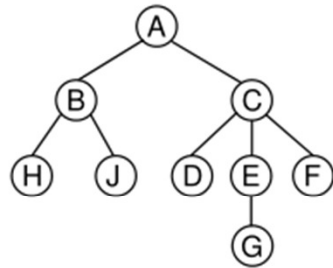
Node-Link Layout

- The traditional approach
- Pick a layout algorithm
- Draw a rooted tree
- Well known layout algorithm:
Reingold-Tilford

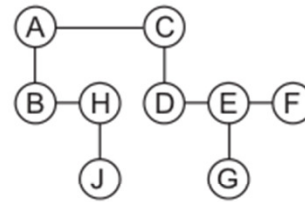


- Many more exist which try to balance a number of aesthetic criteria

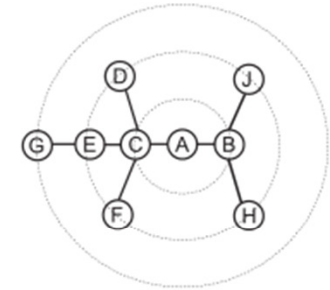
Different Tree Representations



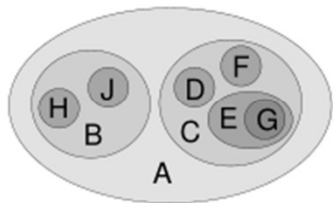
Conventional Diagram



Preorder Representation



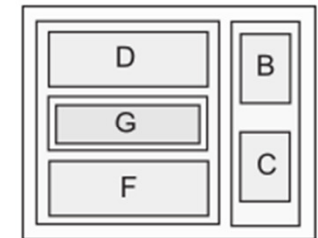
Radial Tree



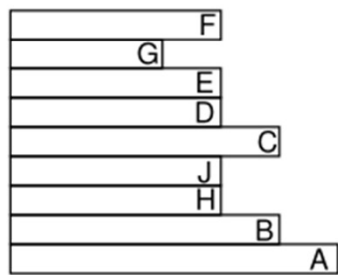
Venn Diagram

$(A(B(H)(J))(C(D)(E(G))(F)))$

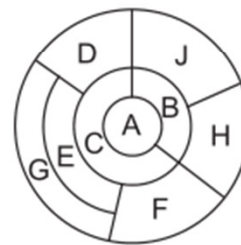
Nested Parentheses



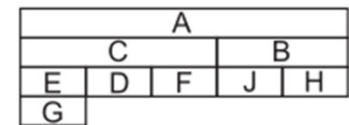
Nested Treemap



Indentation



Tree Ring



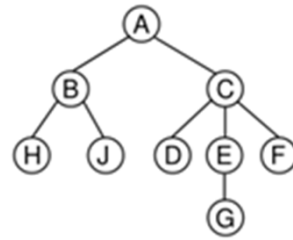
Icicle Plot

TreeMap

- Space-filling
- Free tool here:

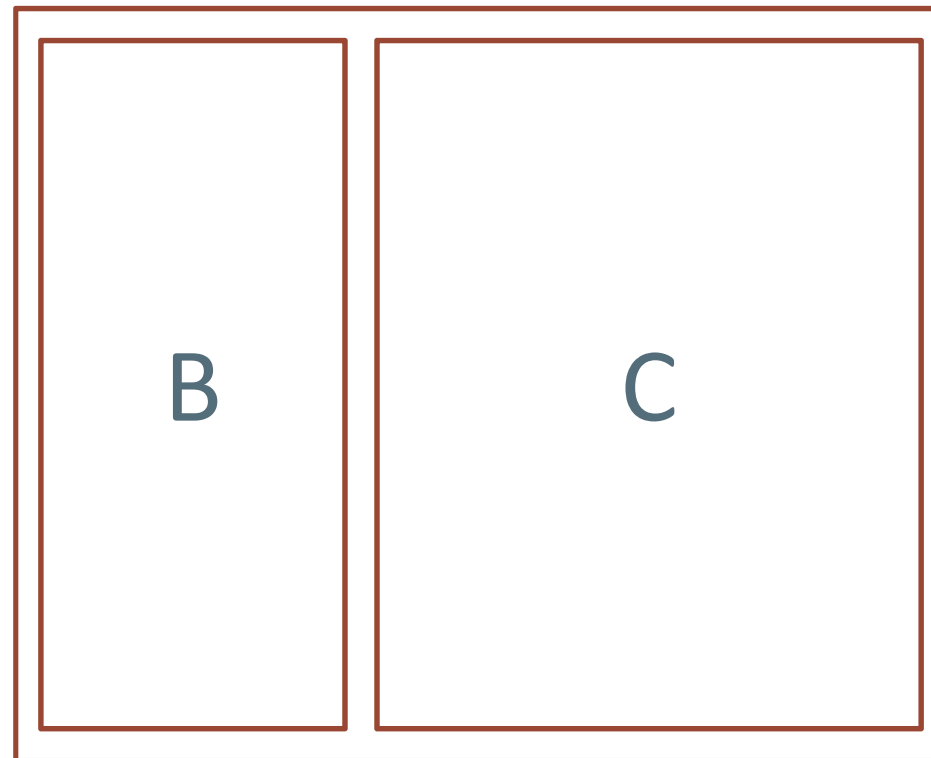
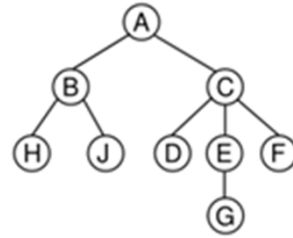
<http://www.cs.umd.edu/hcil/treemap/>

TreeMap

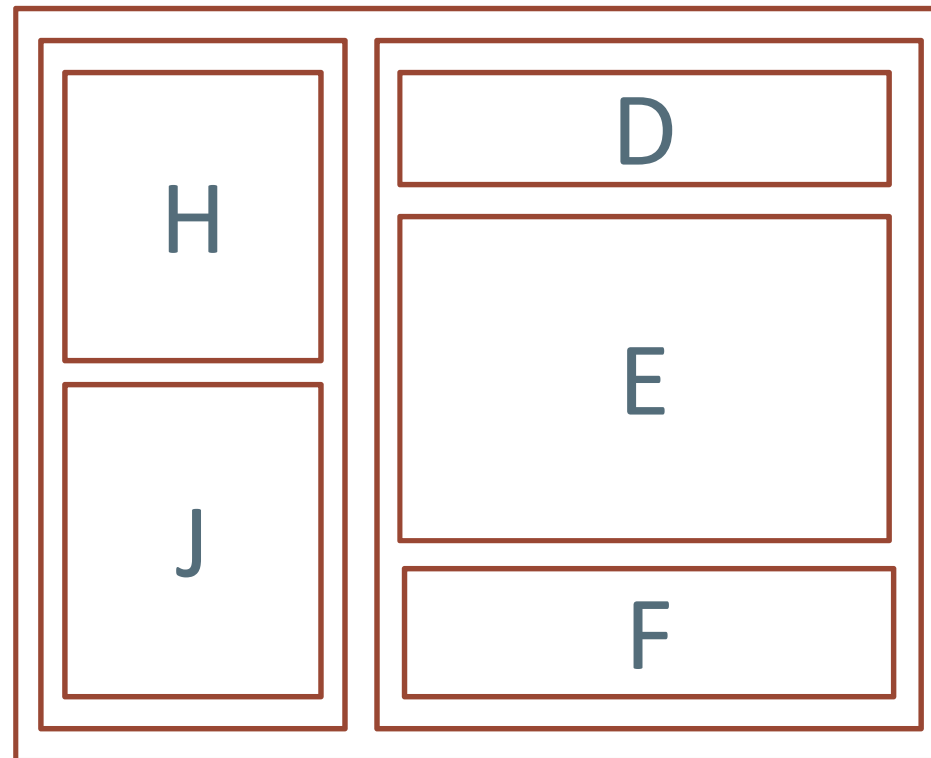
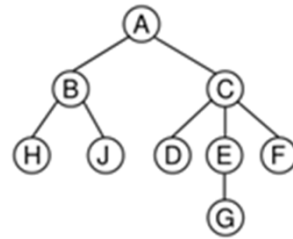


A

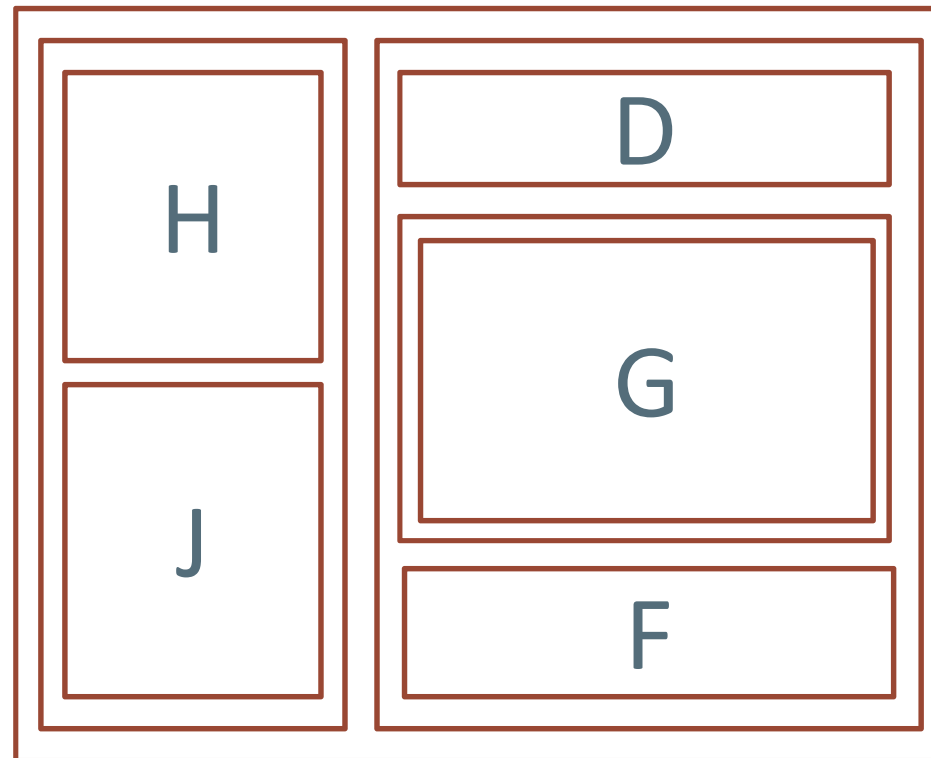
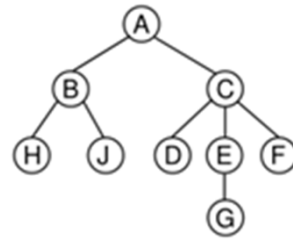
TreeMap



TreeMap



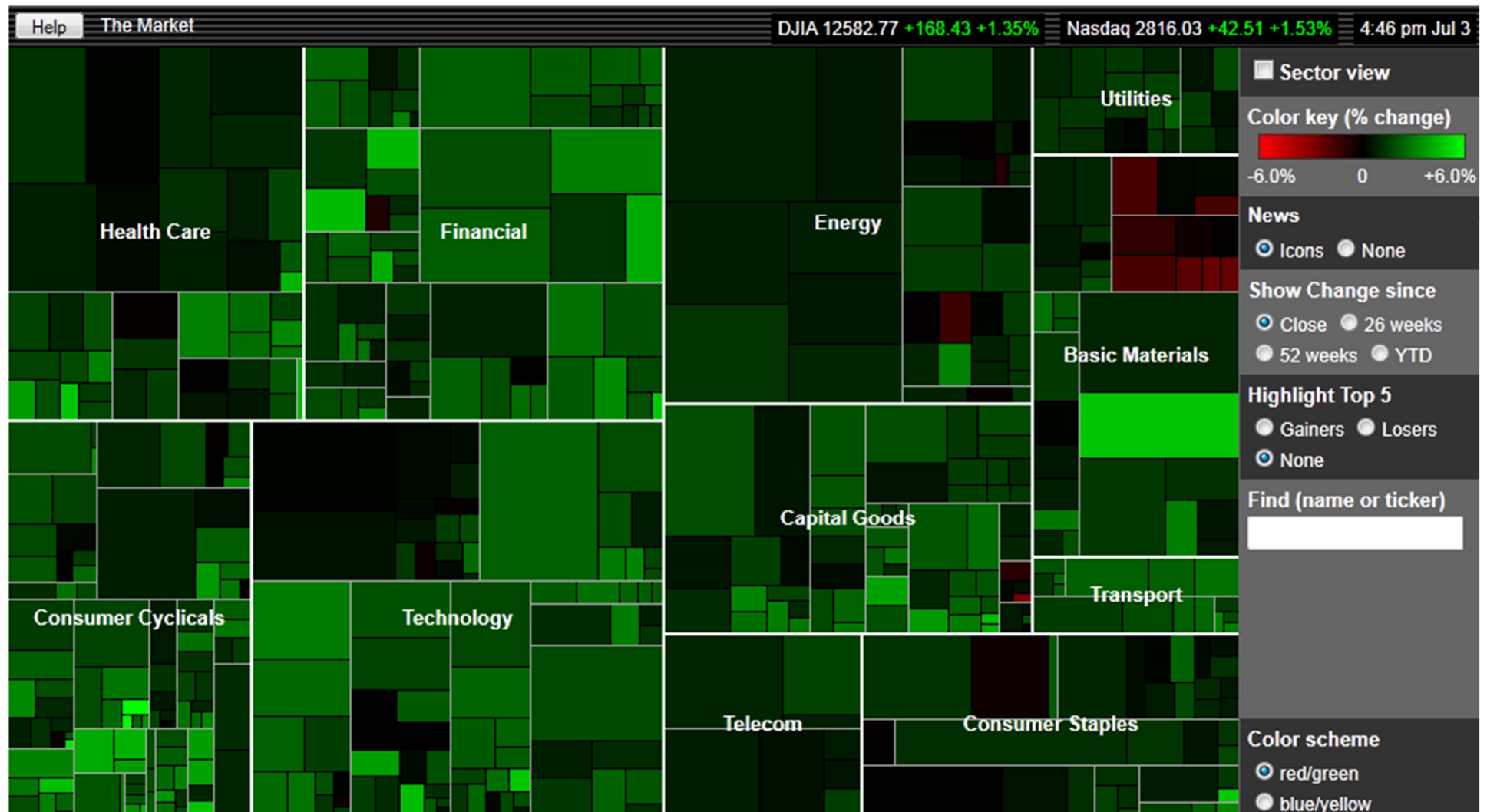
TreeMap



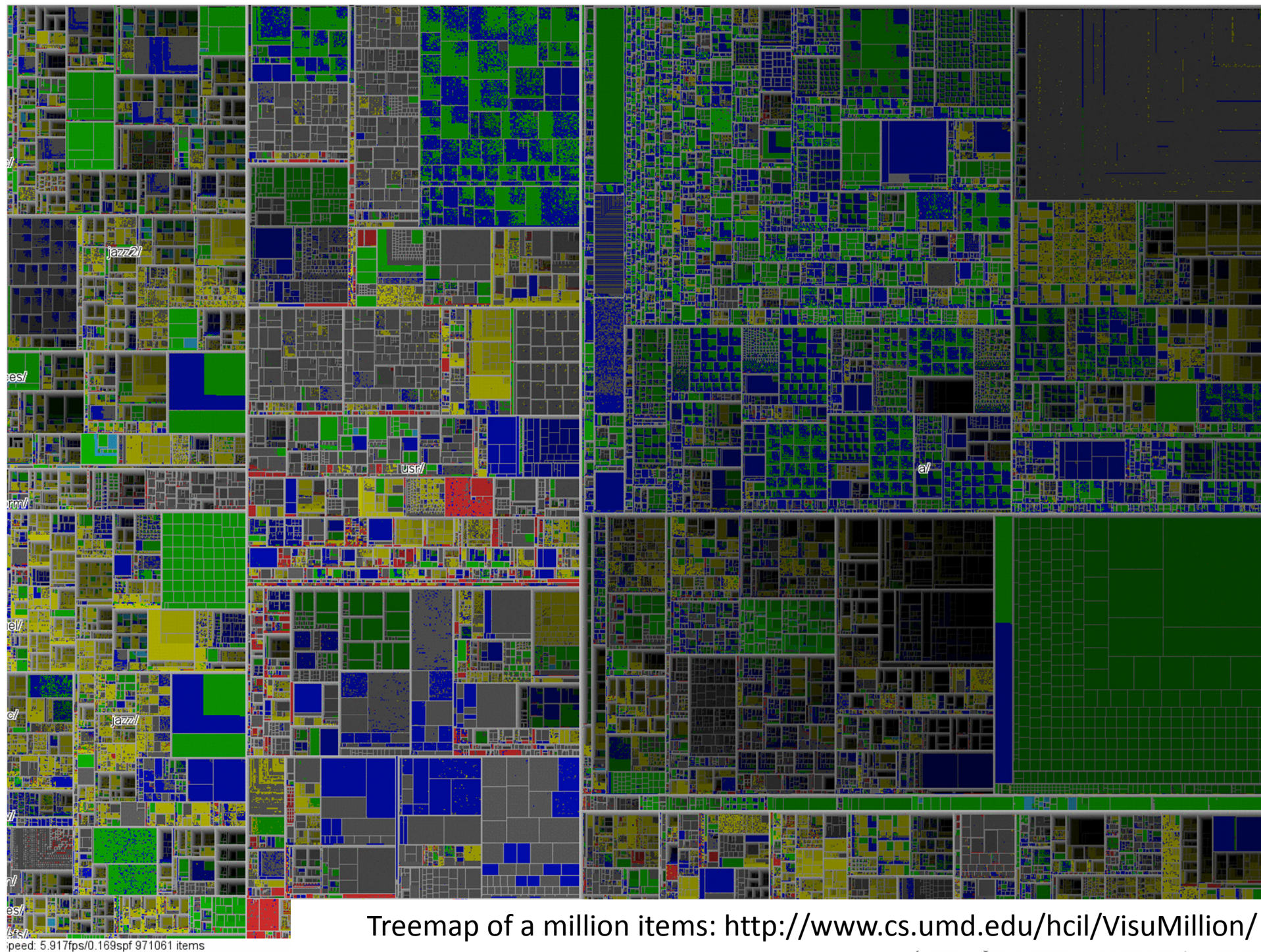
Map of the Market

SmartMoneySelect

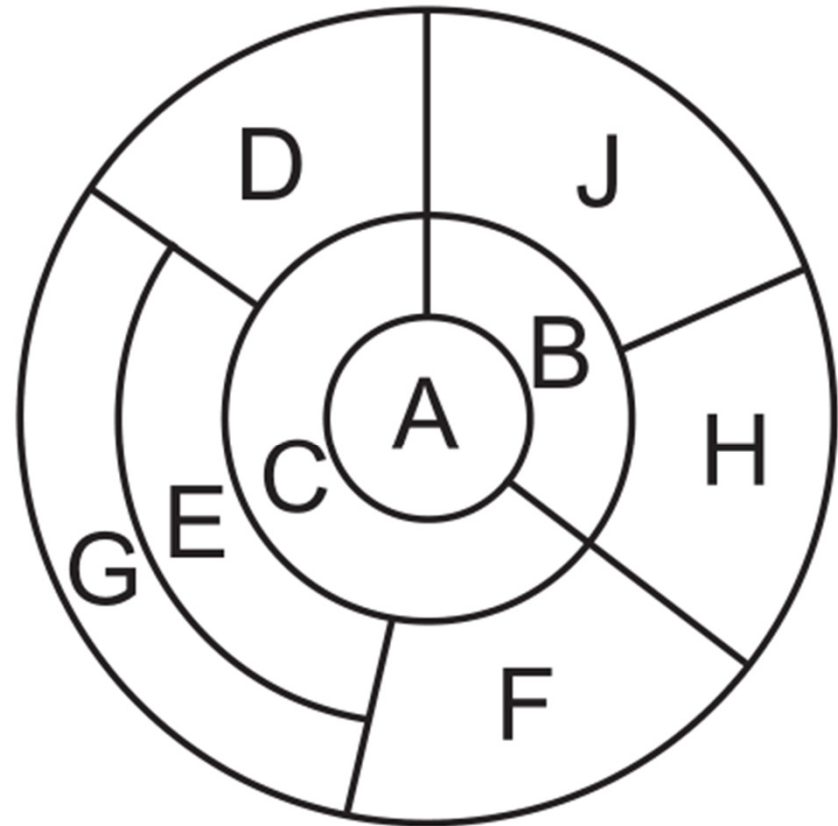
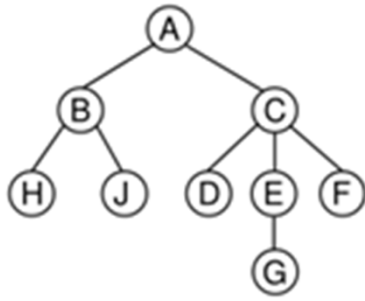
Upgrade [here](#) to access the [Market Map 1000](#) and search 1,000 companies with enhanced capabilities.



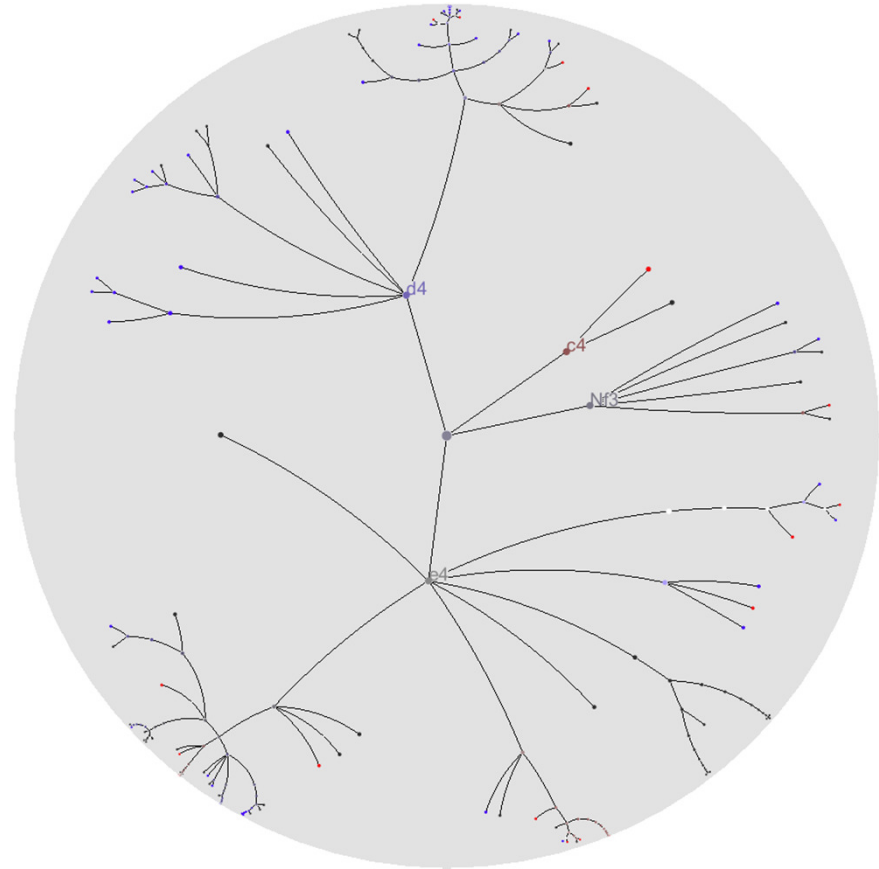
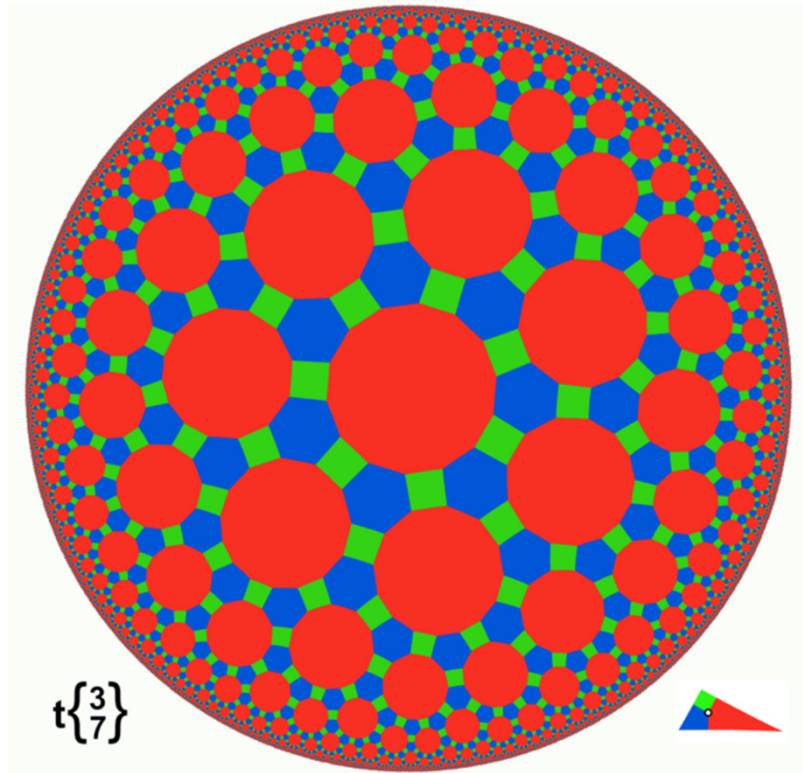
<http://www.smartmoney.com/map-of-the-market/>



TreeRing



Hyperbolic Tree



Poincaré Disk -> Lay out a tree on this space

Advantage: Tree will definitely fit in view! (clever!) But nodes quite squished near edge

Geneaquilts

GeneaQuilts

A System for Exploring
Large Genealogies

A.Bezerianos P.Dragicevic J.-D.Fekete J.Bae B.Watson

<http://www.aviz.fr/geneaquilts/>

Last but not Least!

INTERACTION

Interaction Techniques

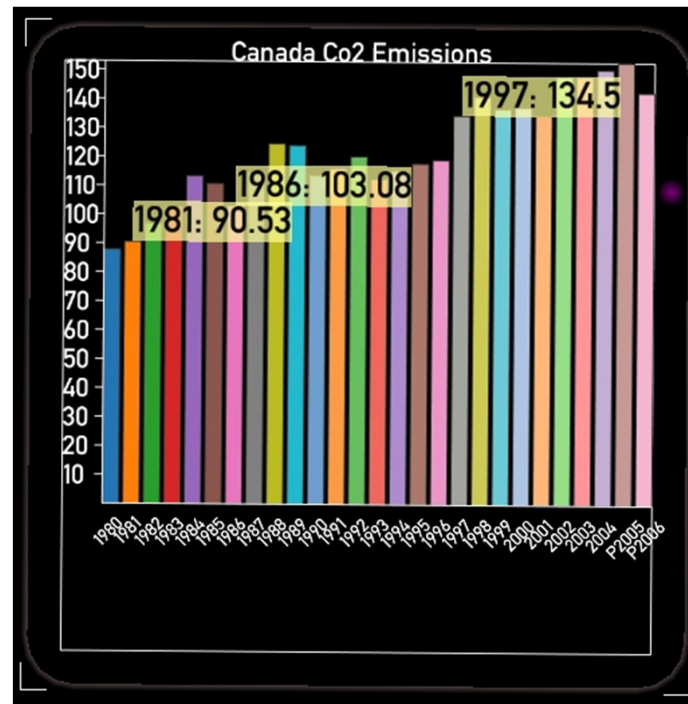
Based on user intent

- Select – mark something as interesting
- Explore – show me something else
- Reconfigure – show me a different arrangement
- Encode – show me a different representation
- Abstract/Elaborate – more or less detail
- Filter – show me something conditionally
- Connect – show me related items

After [Yi et al., InfoVis 2007]

Selection

- Mark something as interesting
- Often combined with other techniques

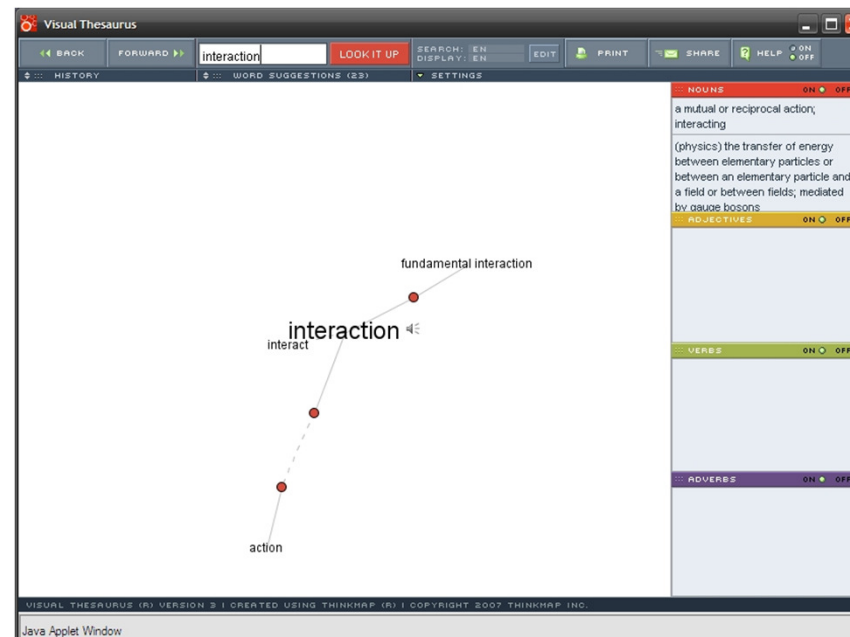


Selection

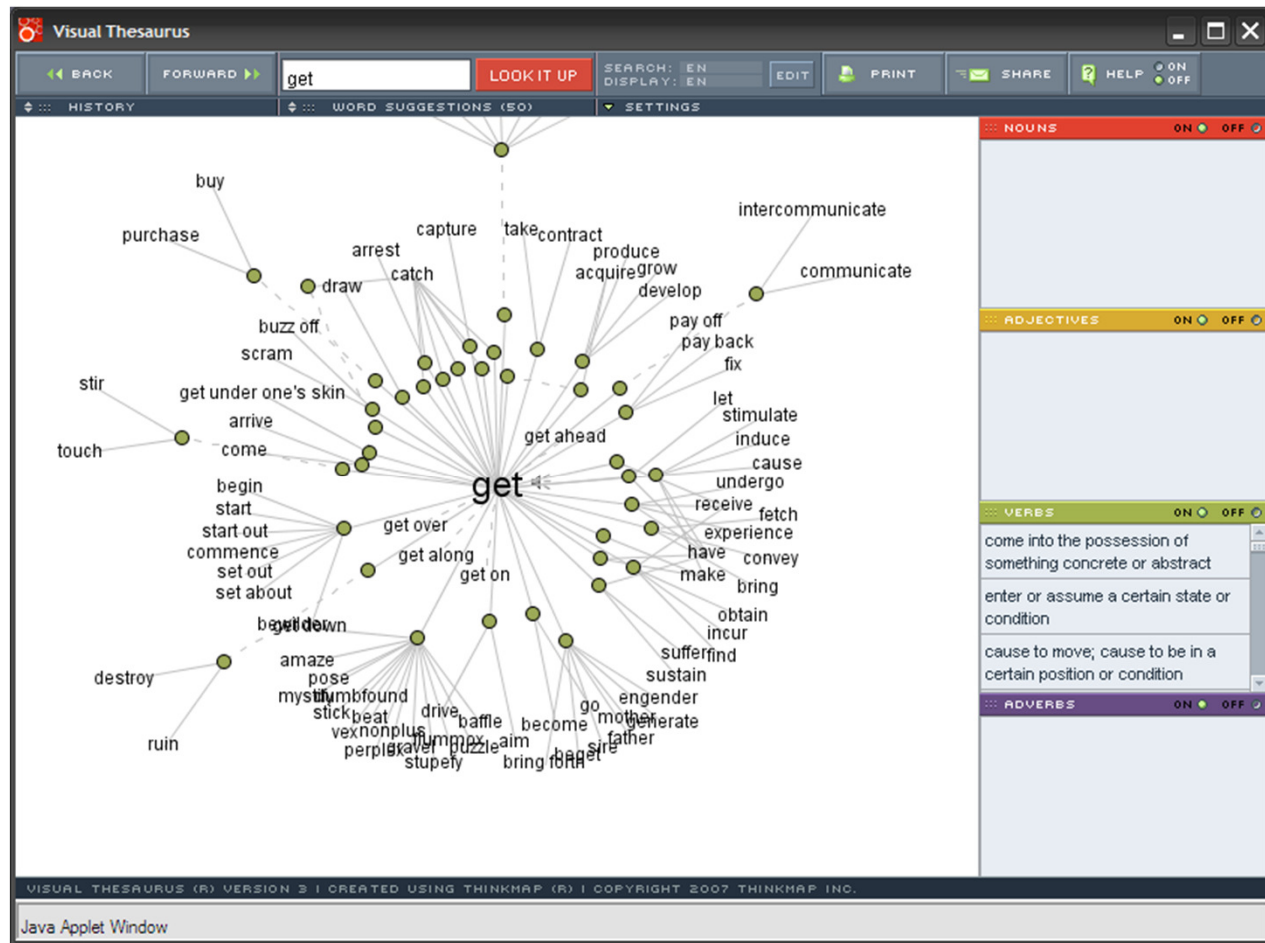
**TreeJuxtaposer:
Scalable Tree Comparison
using
Focus+Context
with
Guaranteed Visibility**

Explore

- Show me something else
- Examine subset of data cases (view-based)
 - E.g. Panning (move viewpoint across representation)
 - E.g. Direct Walk (move viewing focus through clicks)



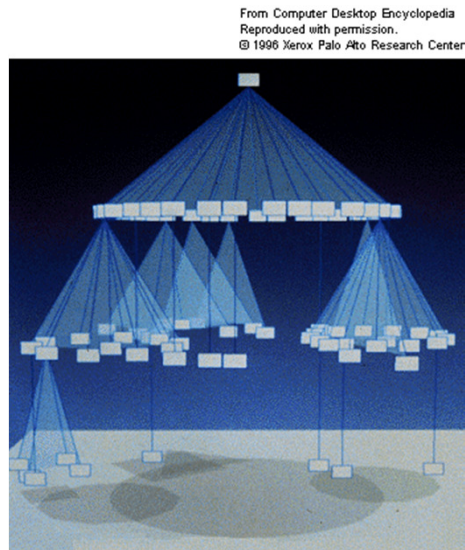
Explore



[VisualThesaurus.avi](#)

Reconfigure

- Show a different arrangement
 - Move data items to
 - Enable better comparison
 - Avoid occlusion
 - Correspond to some mental model of the data



Cone Trees

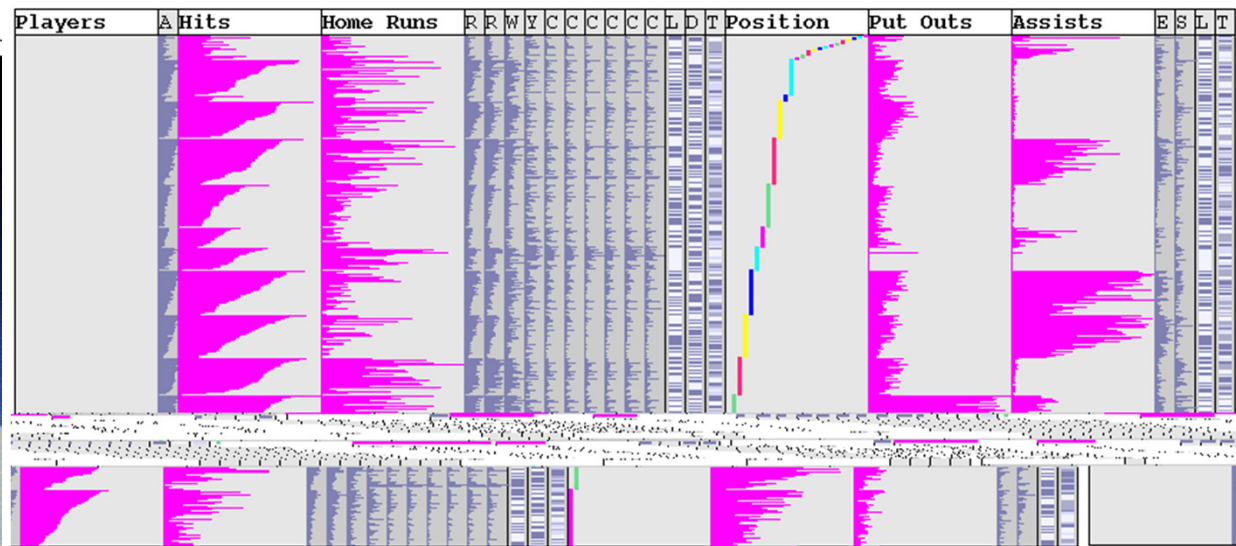
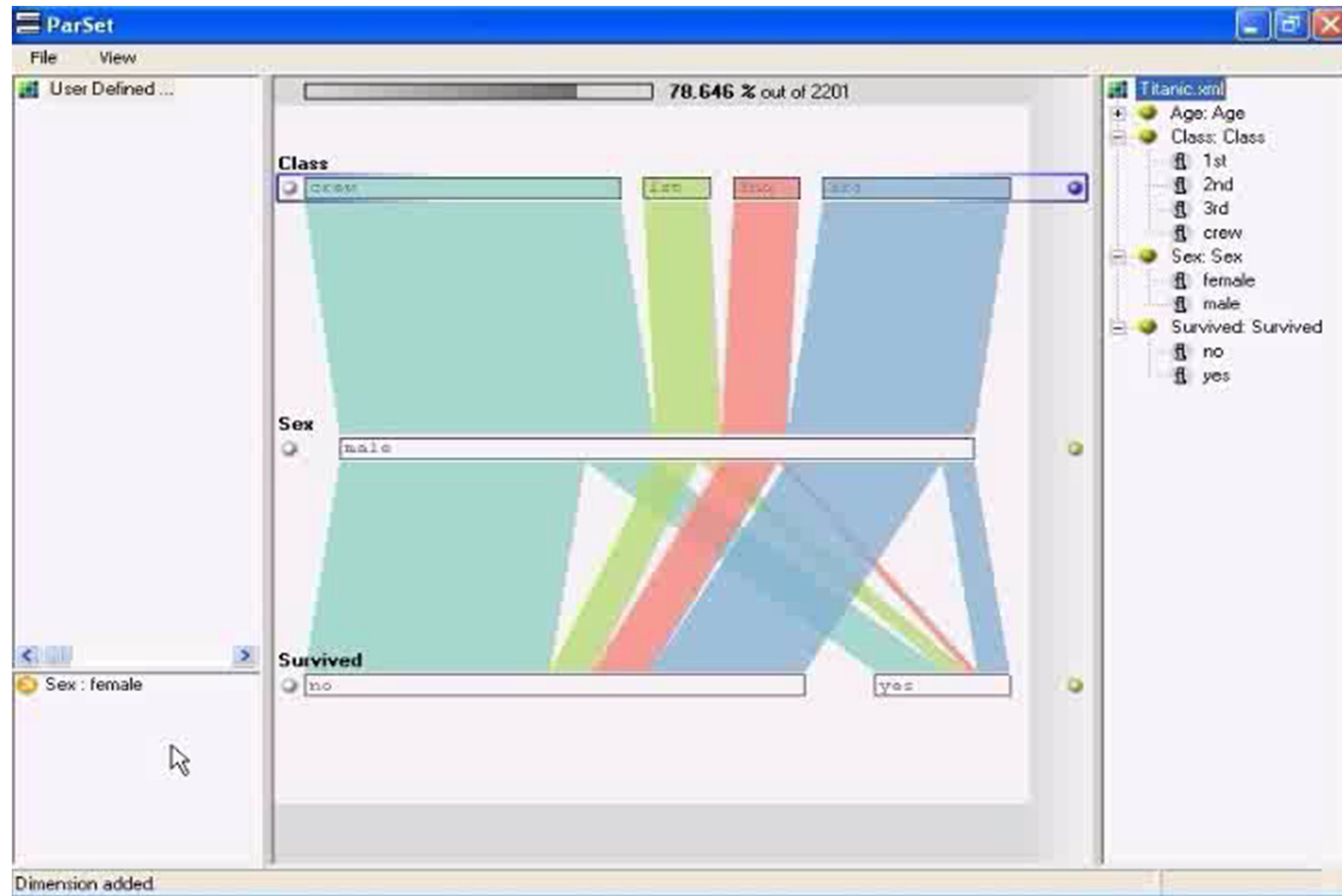


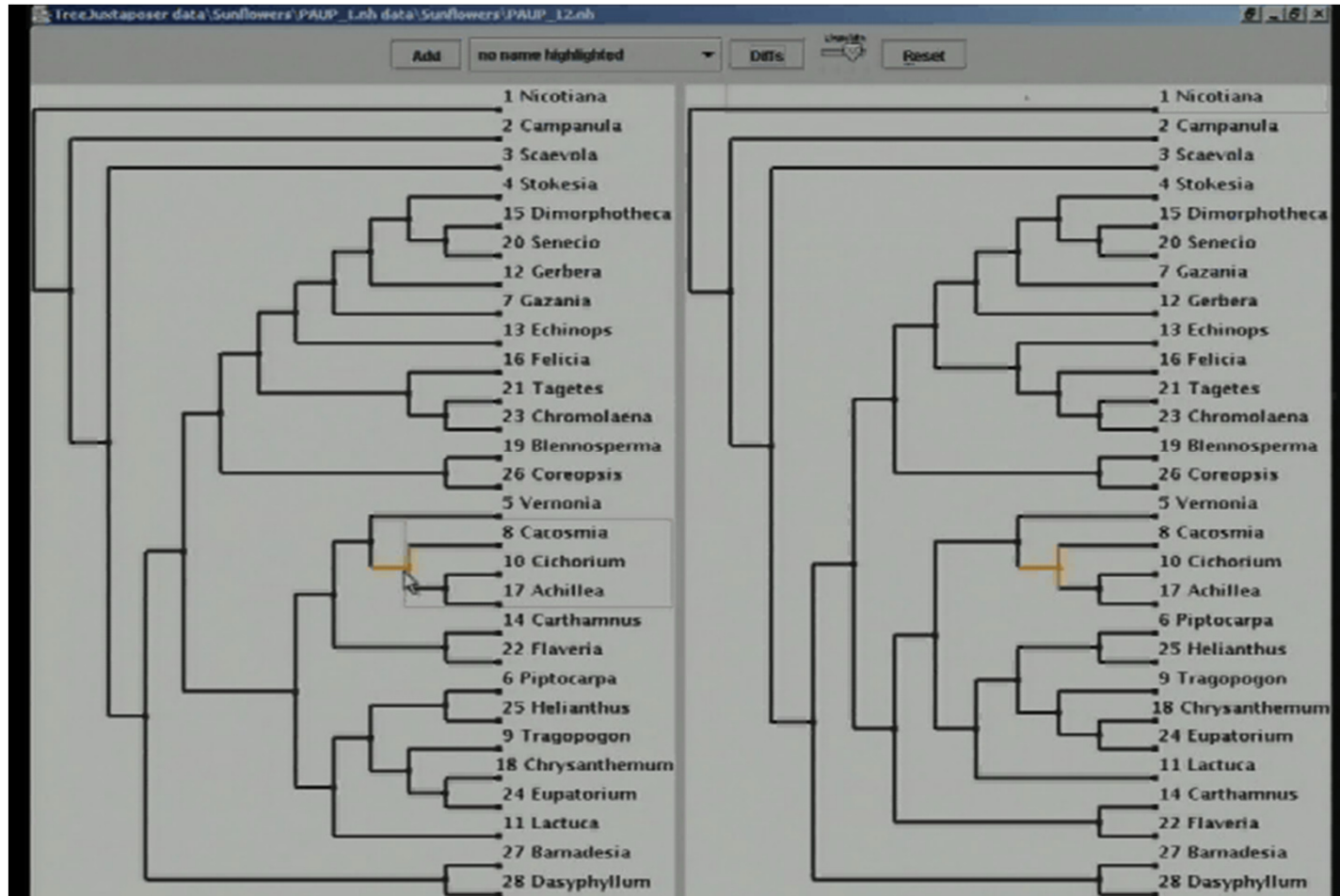
Table Lens

Reconfigure



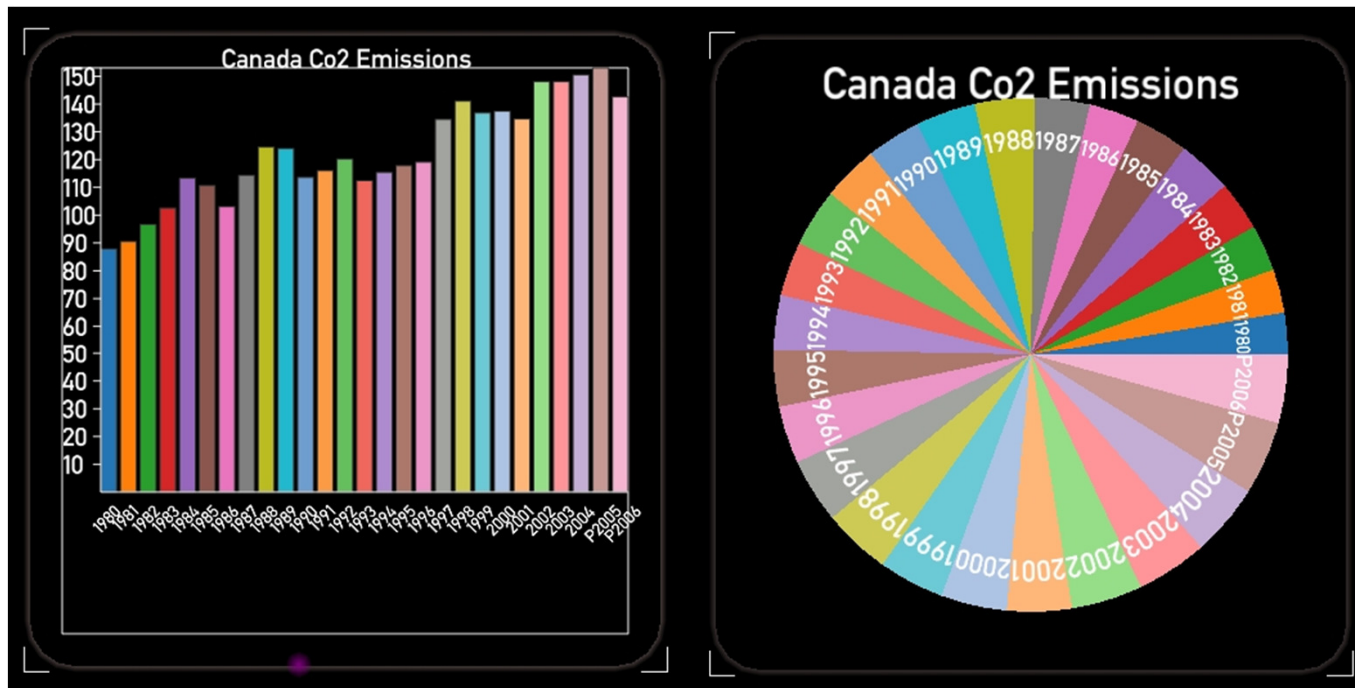
[ParallelSets - Bendix et al., 2005]

Reconfigure



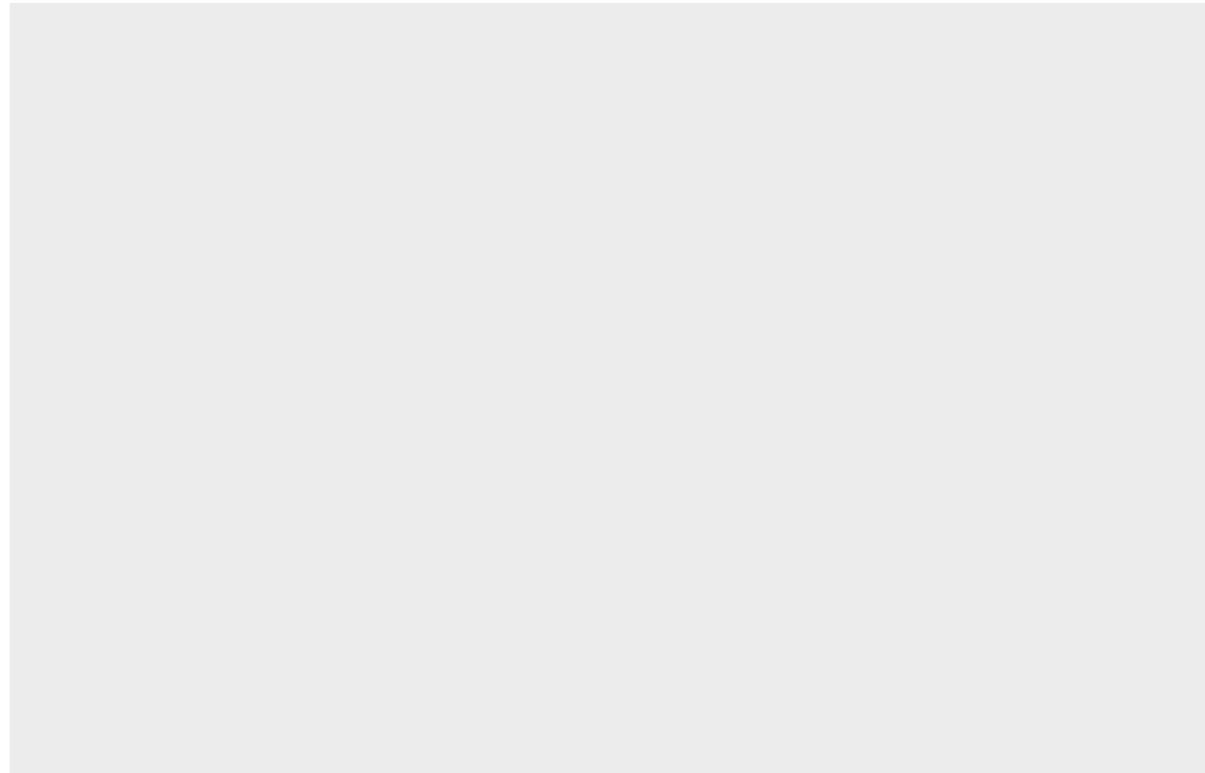
Encode

- Show a different:
 - Representation Type
 - Visual appearance: Colour, Size, Shape,...



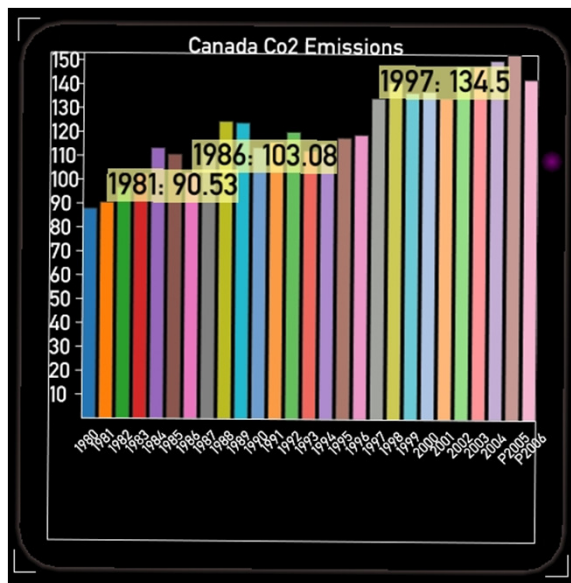
Encode

- Animation is important!



Abstract/Elaborate

- Show me more or less detail
 - Adjust level of abstraction
 - Detail-on-demand
 - Zooming (as long as representation isn't fundamentally altered)



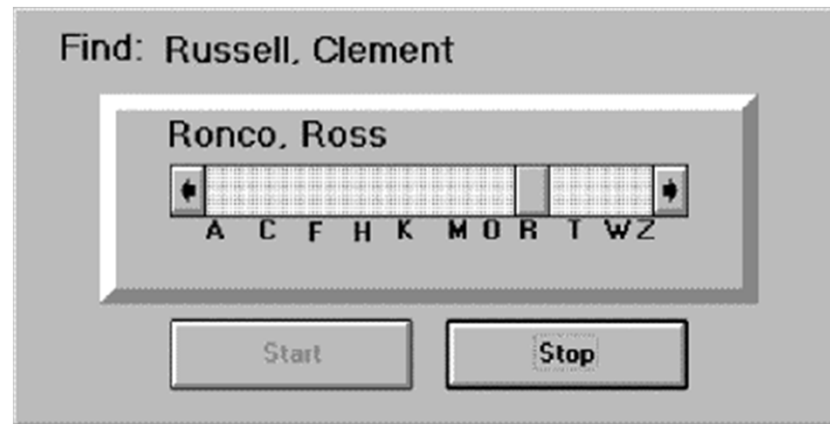
Warning: Not every technique belongs to just one category.

Abstract/Elaborate



Filter

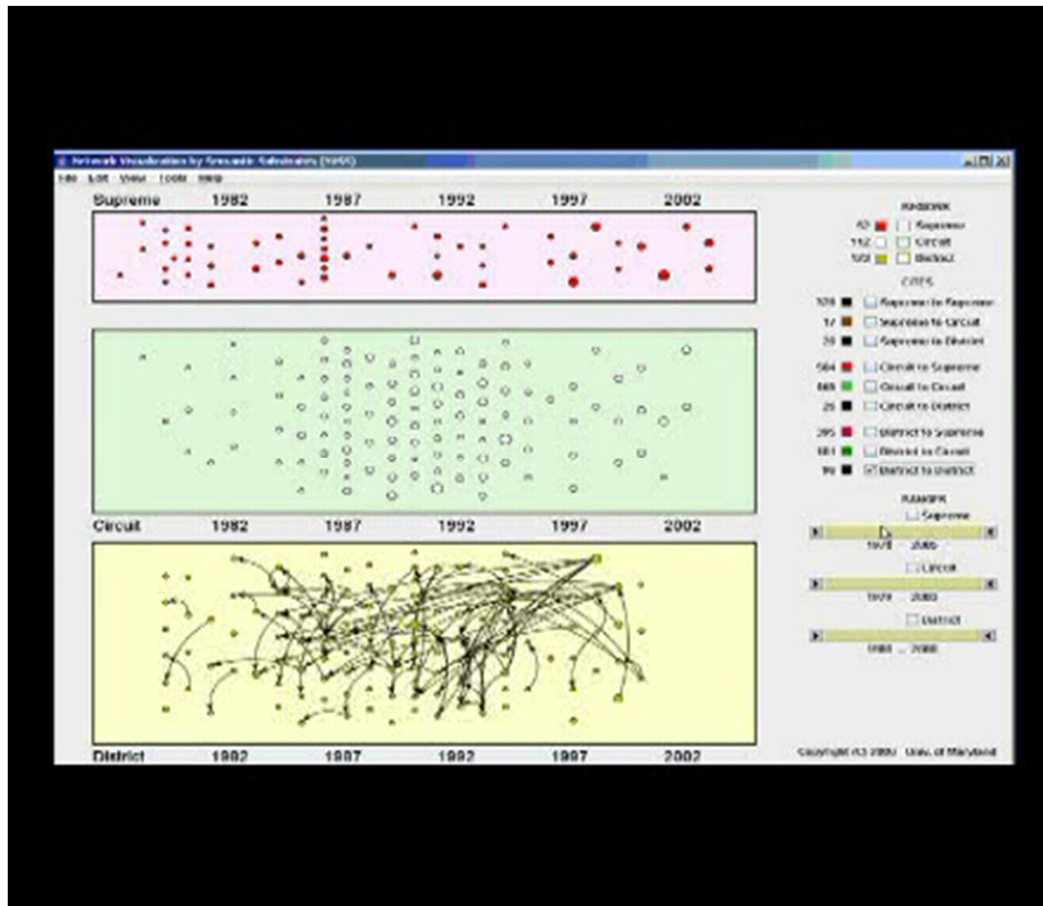
- Show subset of data based on condition
 - E.g. by selecting a data range



[AlphaSlider; Ahlberg & Shneiderman, 1993]

Filter

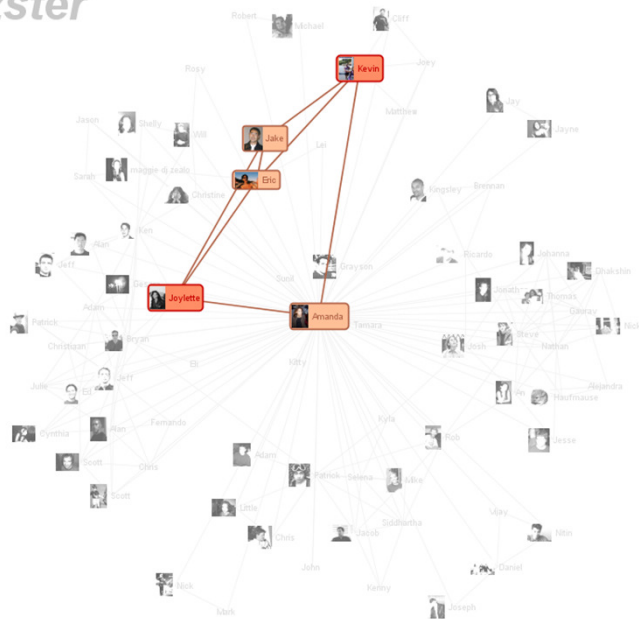
Remember the Range Sliders in this video



Connect

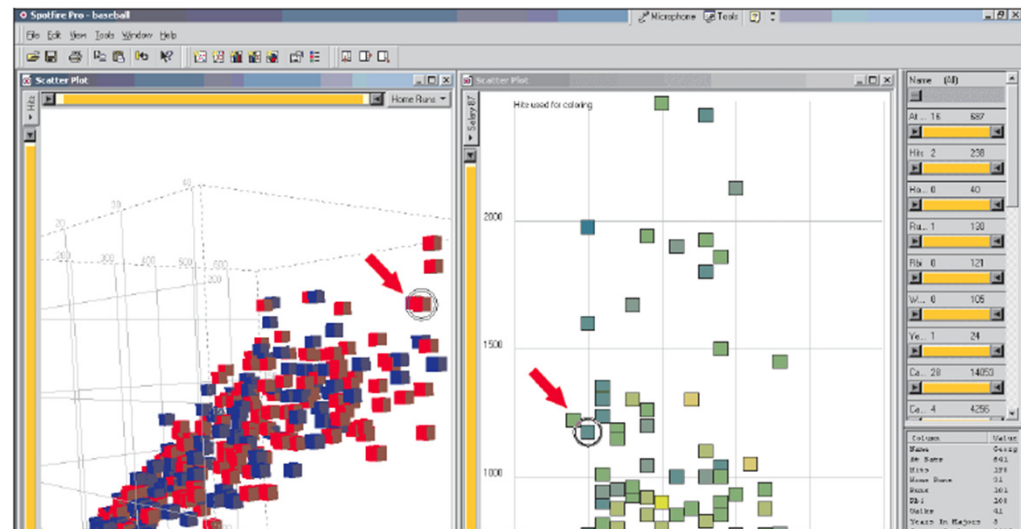
- Show related items
 - E.g. brushing

vizster



Single view

[Heer&boyd, InfoVis '05]

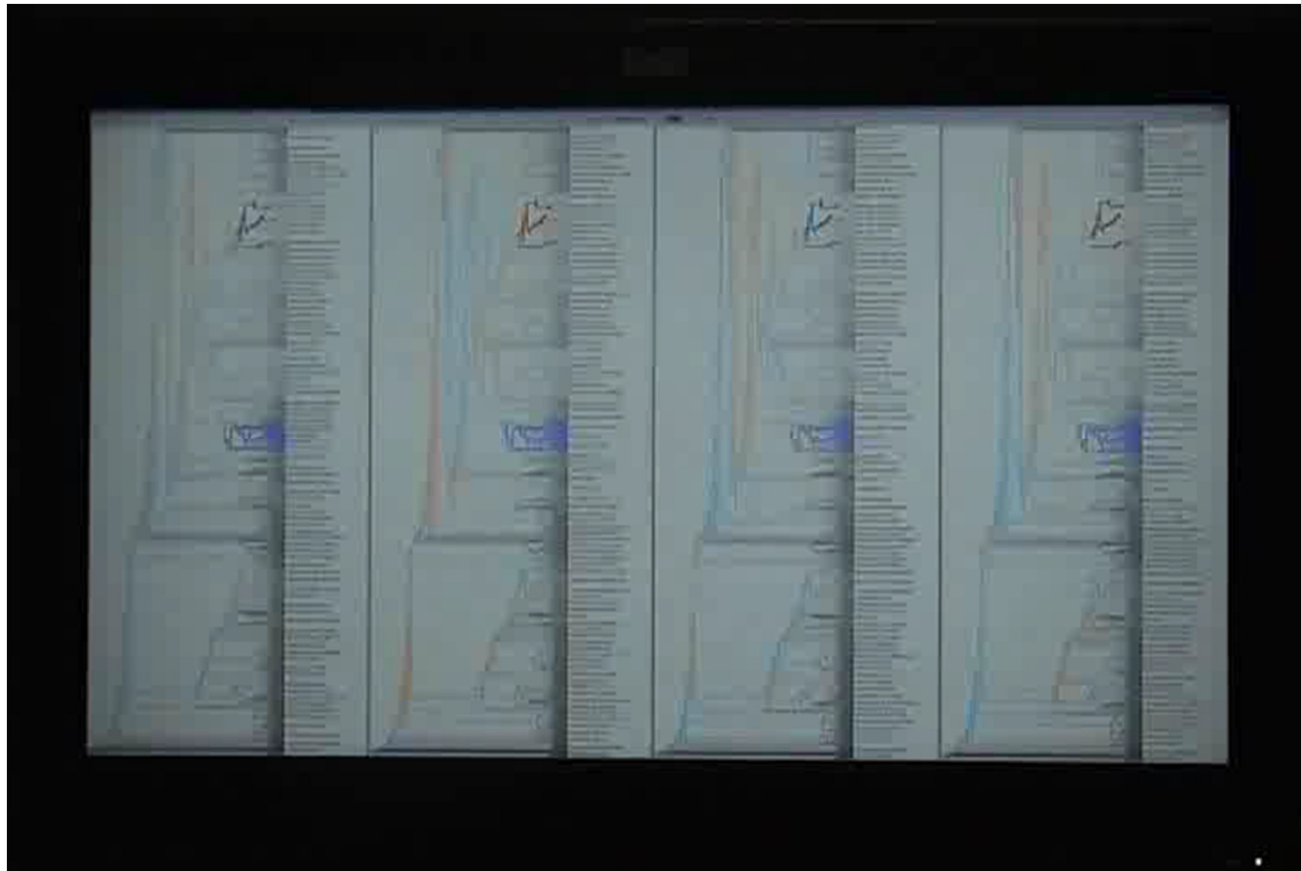


Multiple view

[Spotfire]

Connect

Which video previously showed a connect interaction?



Exercise & Discussion



Magic Lenses

Exercise & Discussion

Select

Explore

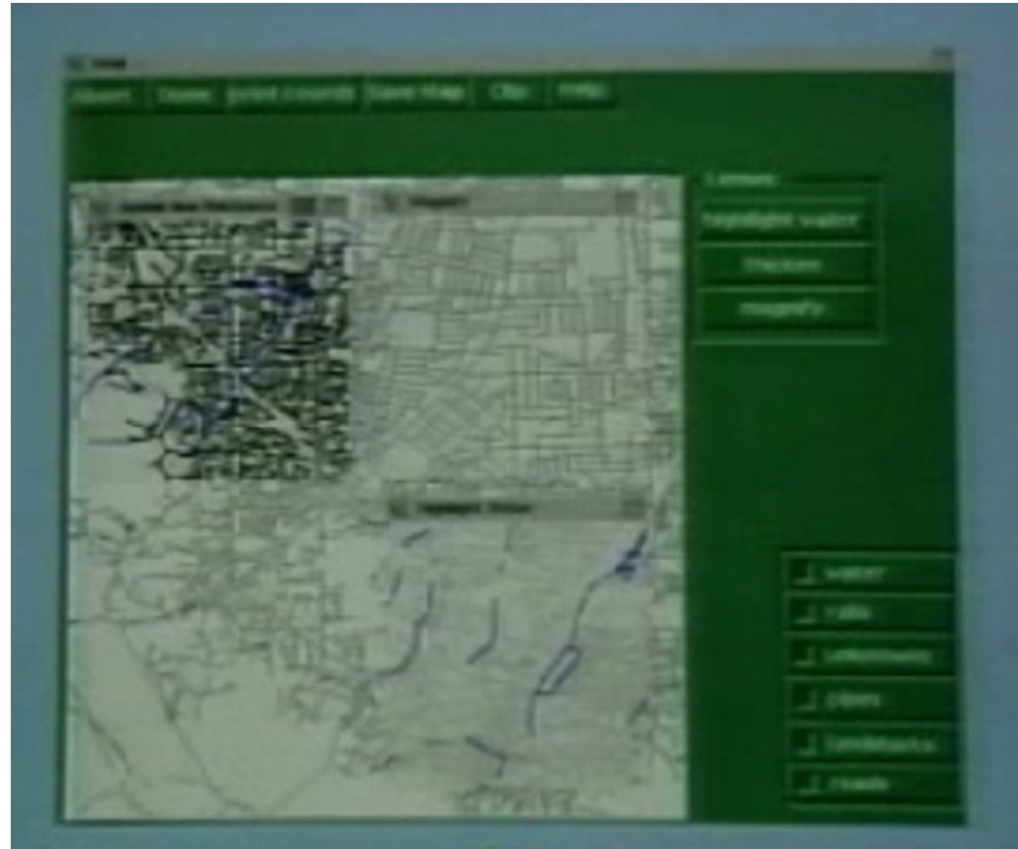
Reconfigure

Encode

Abstract/Elaborate

Filter

Connect

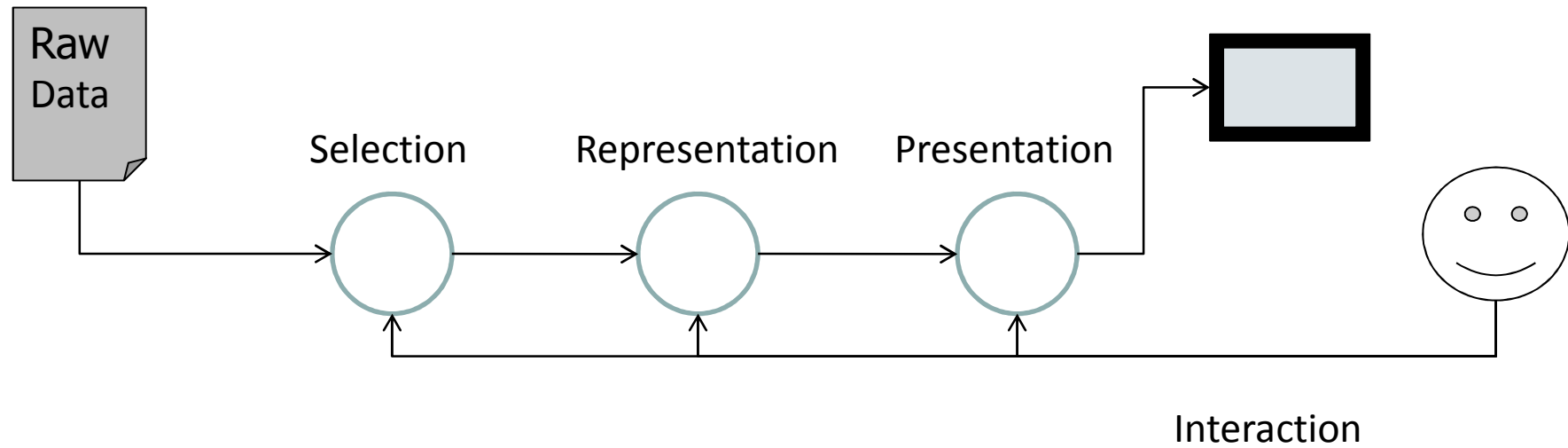


Toolglass & Magic Lenses

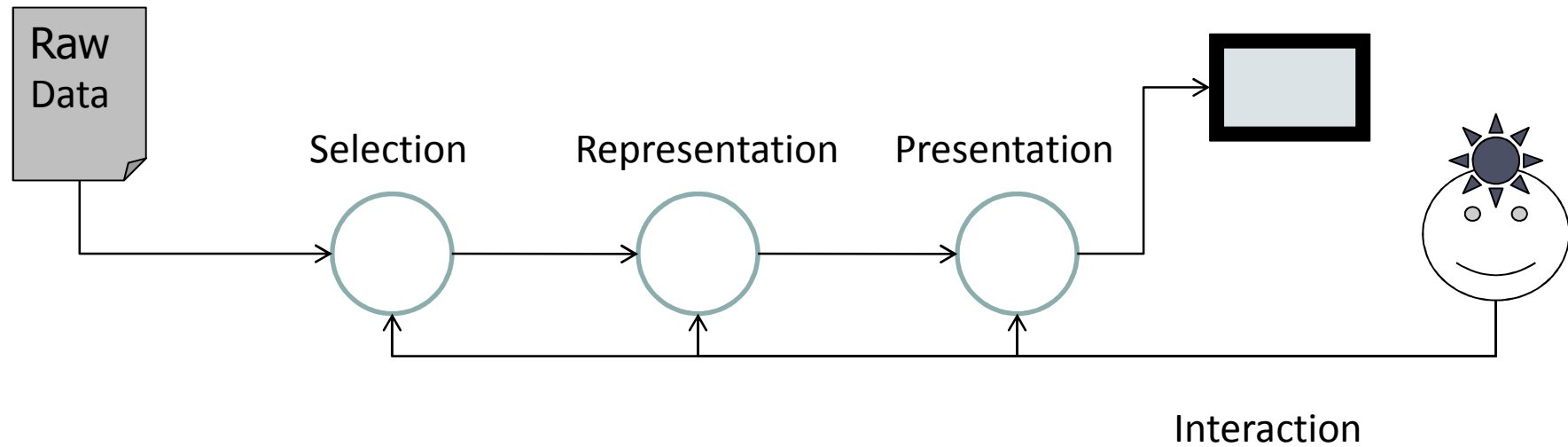
Part II

When & Where to interact

Spence's Infovis Model



Spence's Infovis Model

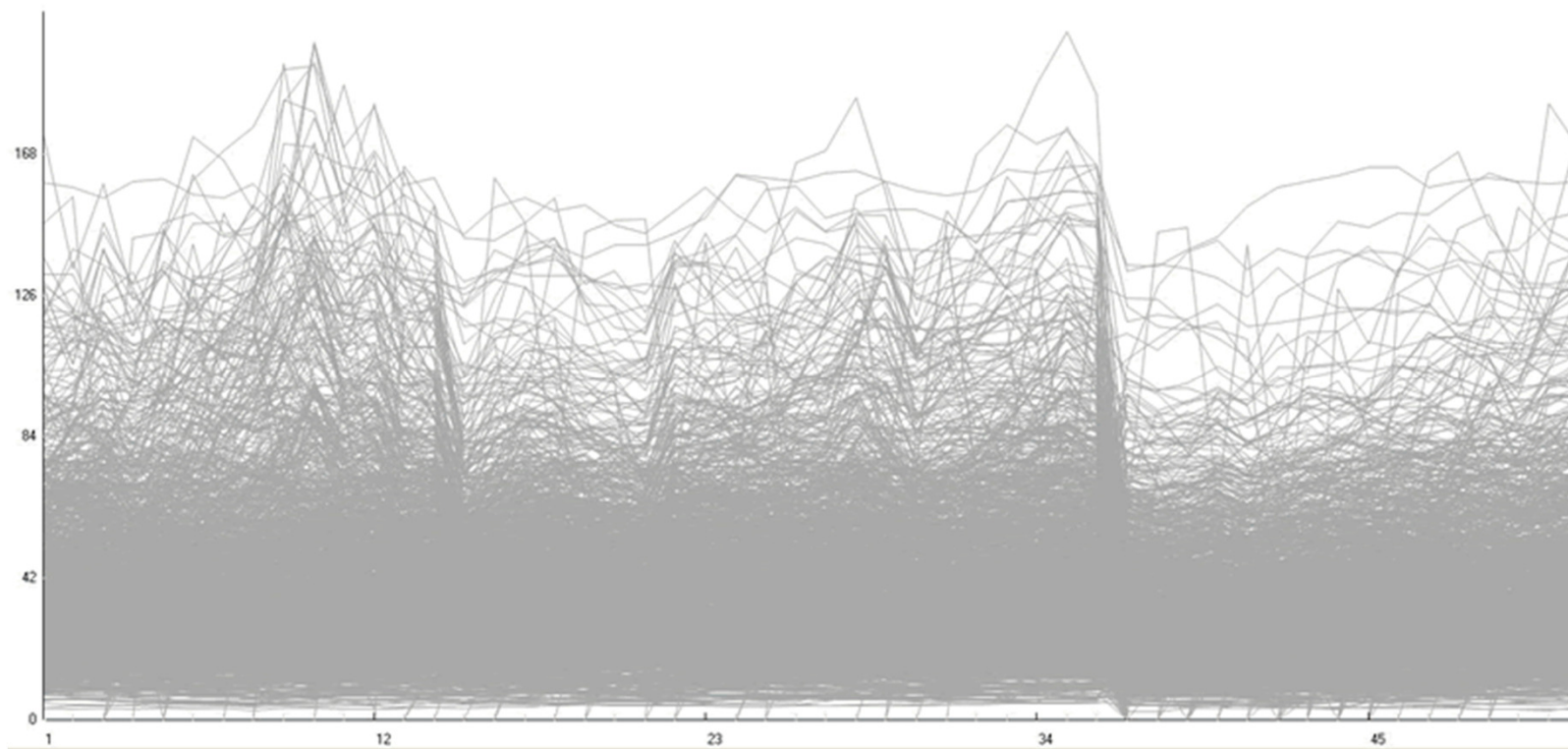


Focus on the “data” that is interacted with

Visual Information Seeking Mantra

[Shneiderman, 1996]

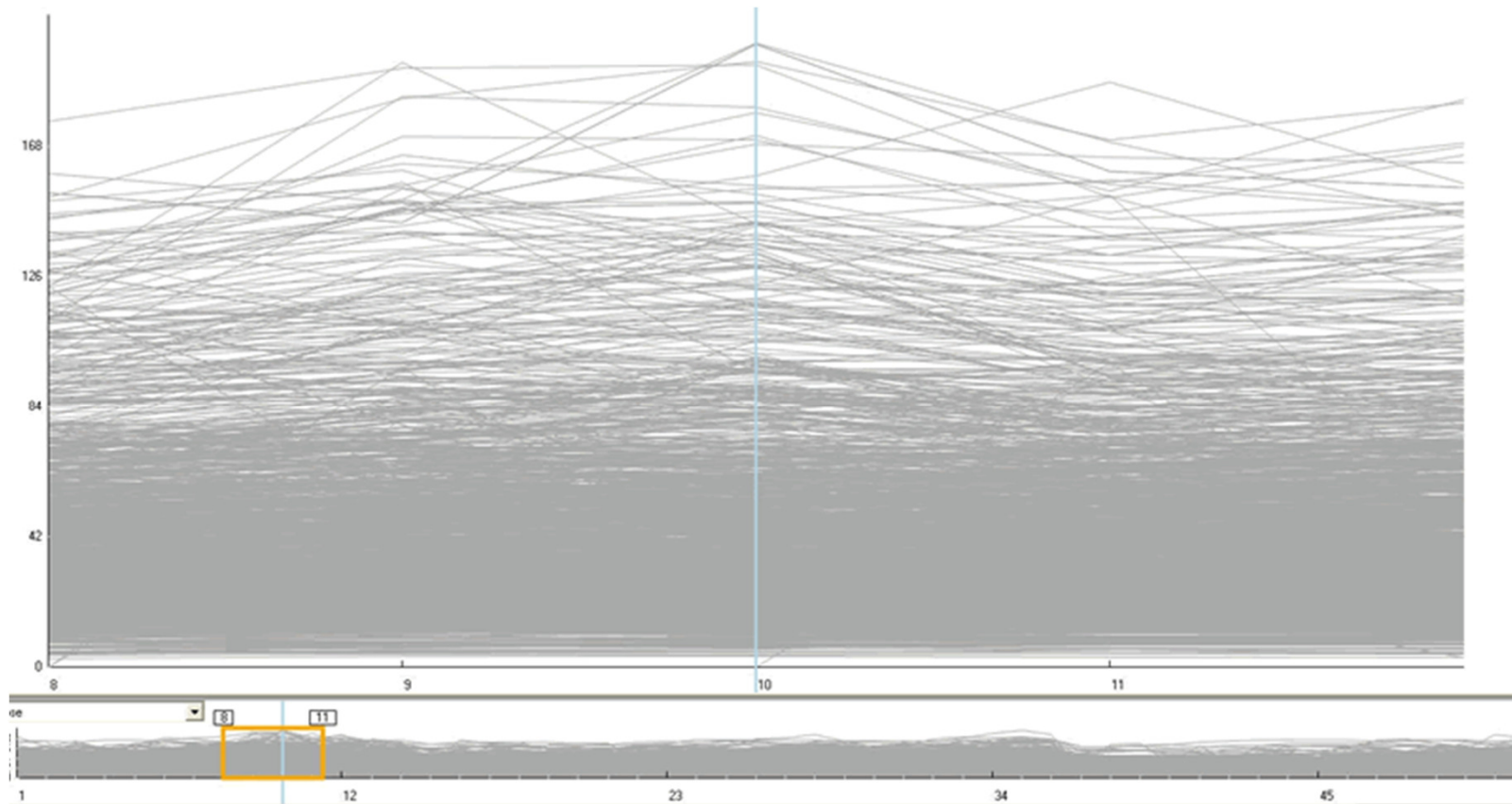
Describes the order of interaction operations



Visual Information Seeking Mantra

[Shneiderman, 1996]

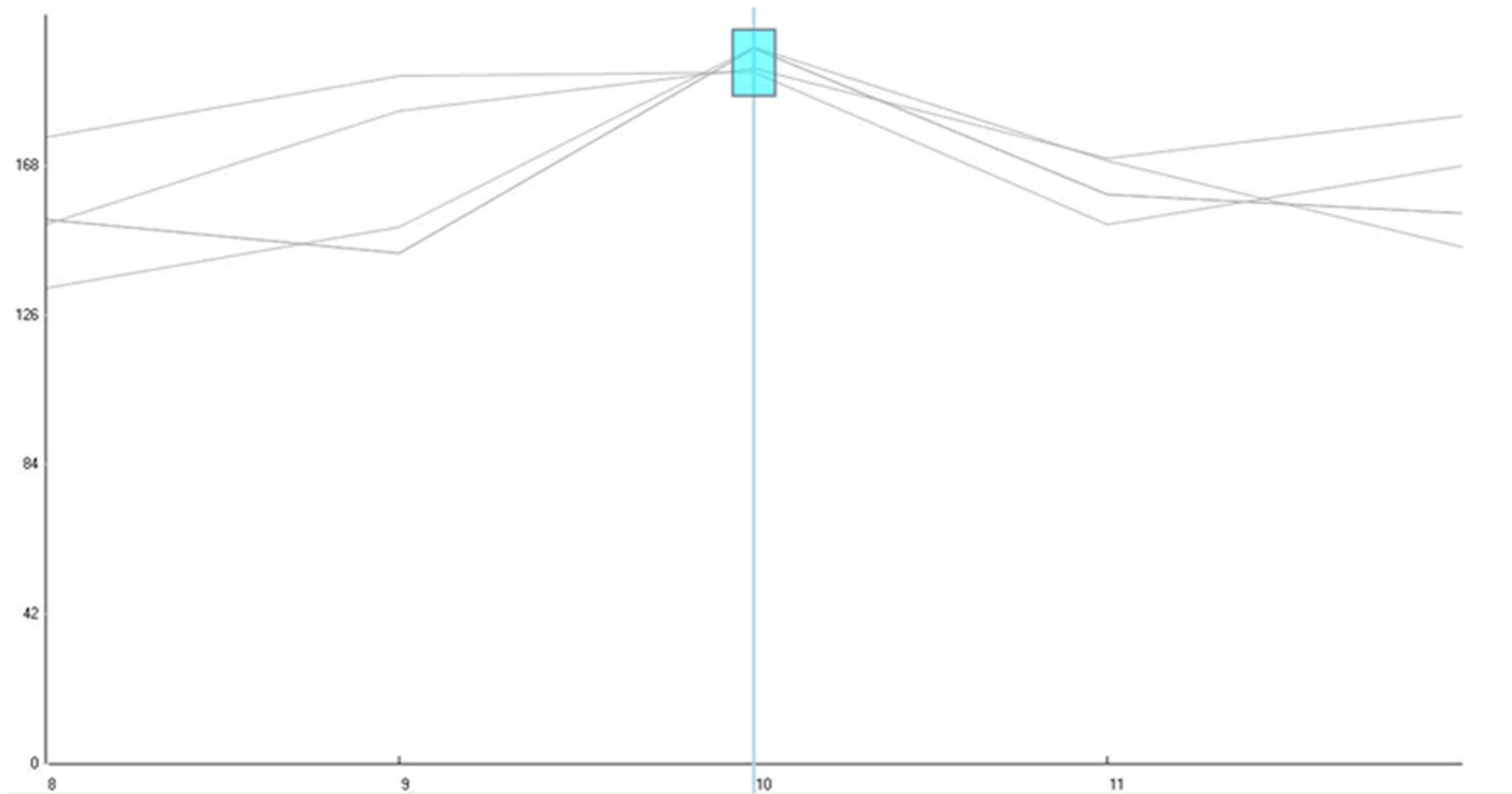
Describes the order of interaction operations



Visual Information Seeking Mantra

[Shneiderman, 1996]

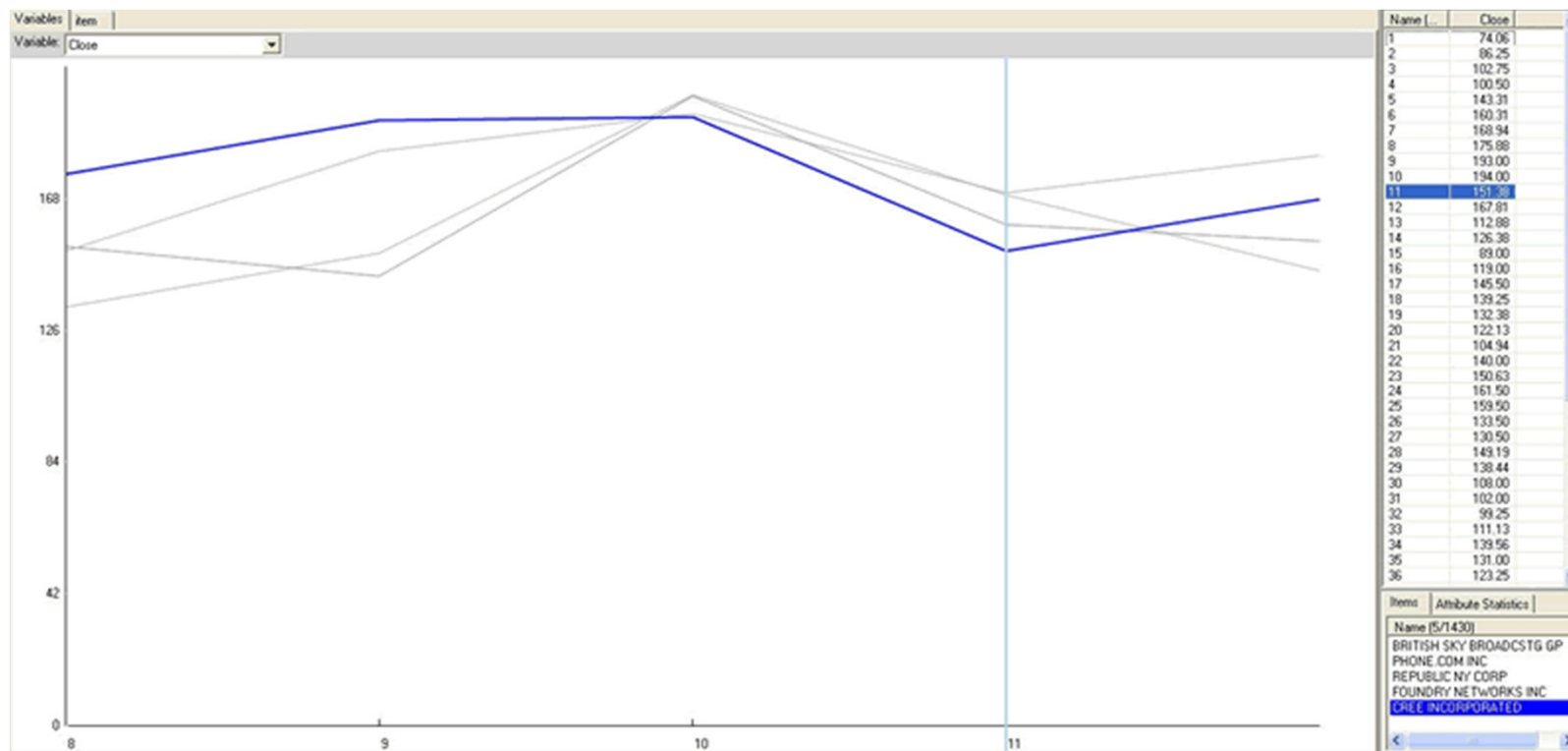
Describes the order of interaction operations



Visual Information Seeking Mantra

[Shneiderman, 1996]

Describes the order of interaction operations



Visual Information Seeking Mantra

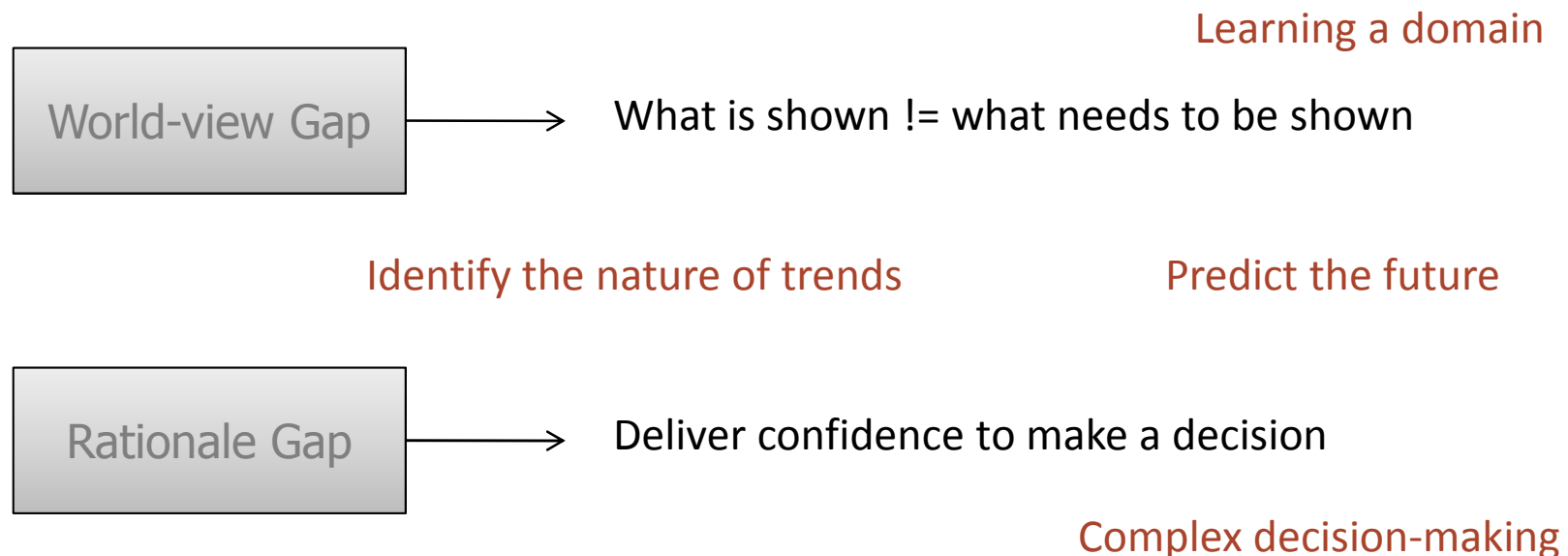
Describes the order of interaction operations

- Overview first
- Zoom & filter
- Details on demand

→ useful for many (but not all) infovis applications

Knowledge Precepts

Problem: How to adequately support decision making?
→ More than simple queries needed!



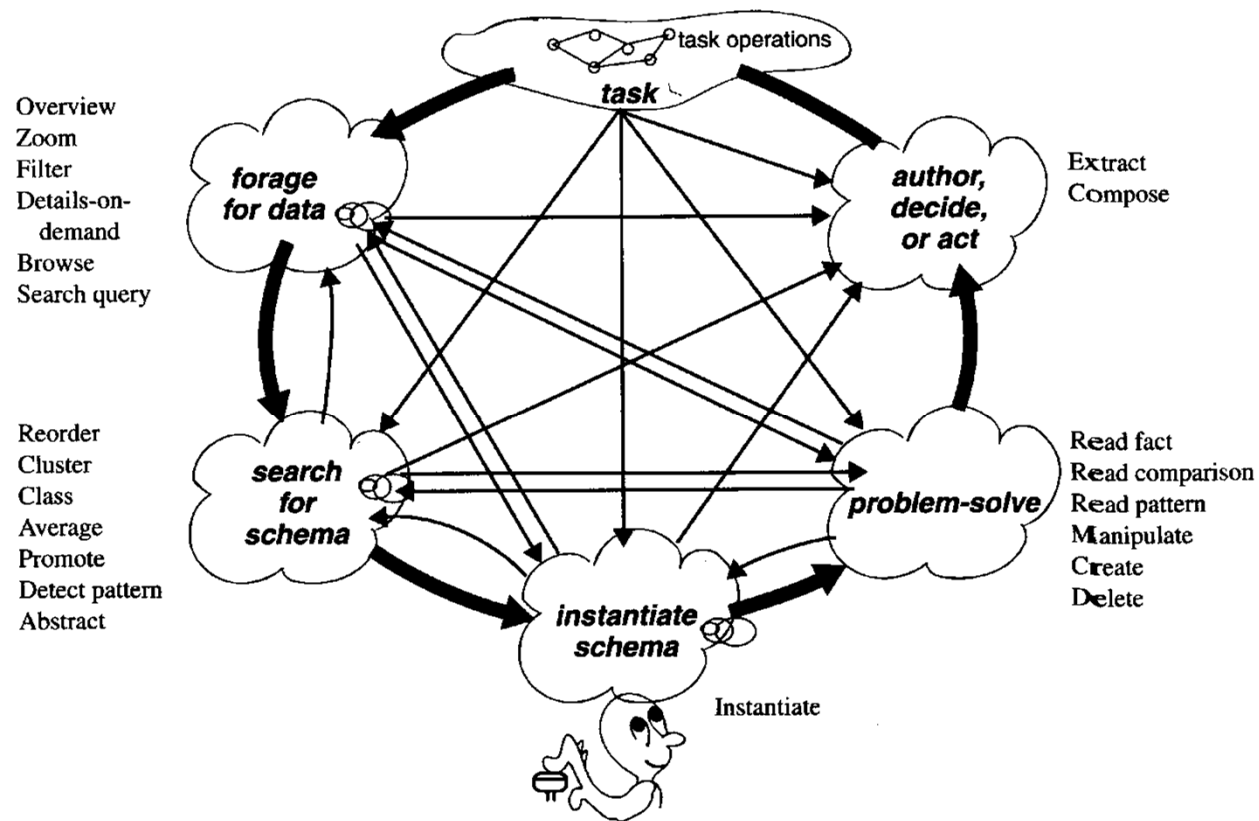
[Amar & Stasko, 2005]

Knowledge Precepts

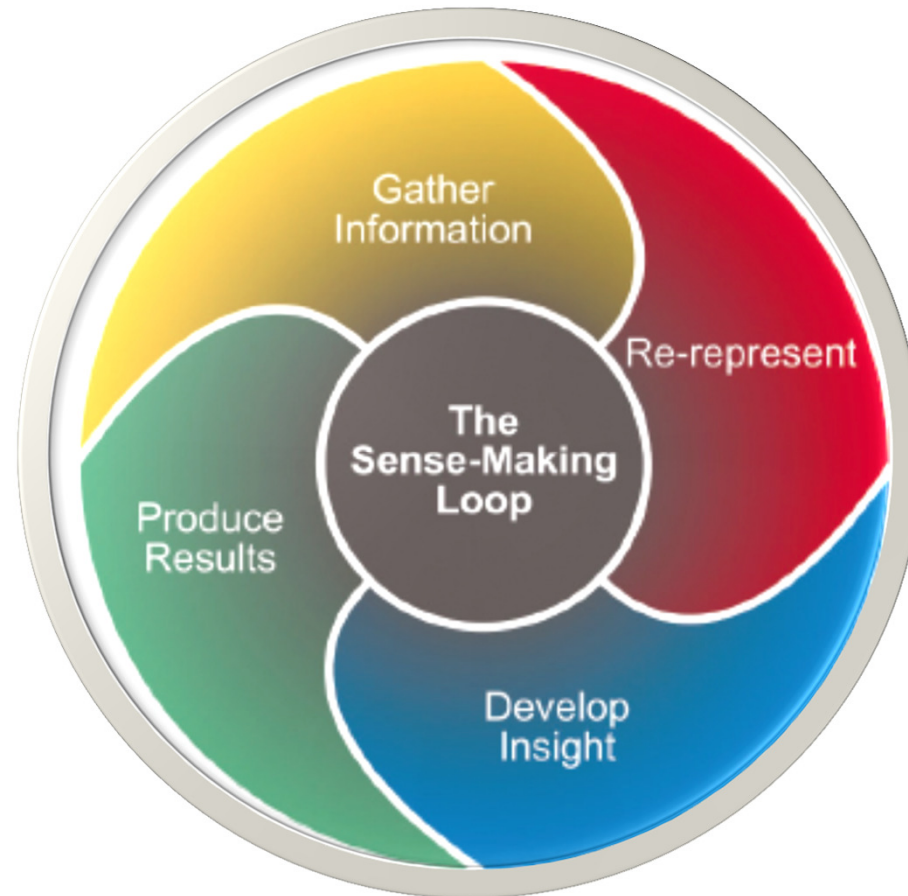
- World-view based precepts
 - Provide facilities to create, acquire, transfer knowledge about important domain parameters or
 - Provide support for discovery of multivariate explanations
 - Facilitate hypothesis testing
- Rationale-based precepts
 - Expose uncertainty
 - Concretize relationships
 - Expose cause & effect

Knowledge Crystallization Cycle

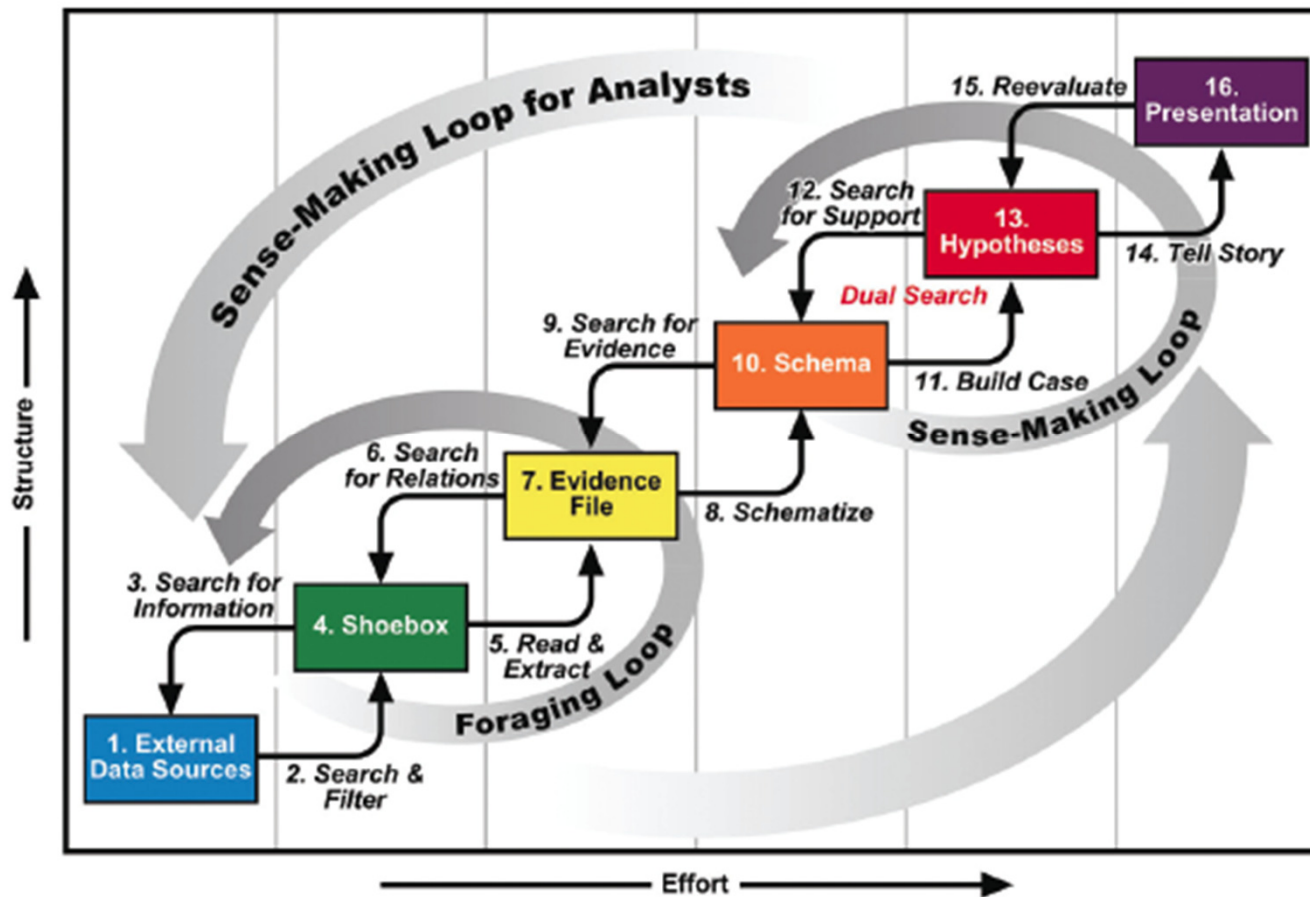
Focuses on process of knowledge extraction



The Analytic Reasoning Process



Sense-Making Loop



For some types of intelligence analysts

We're out of time? Yes, this is the end. No, then...

HOW CAN I START...??

INFOVIS TOOLKITS

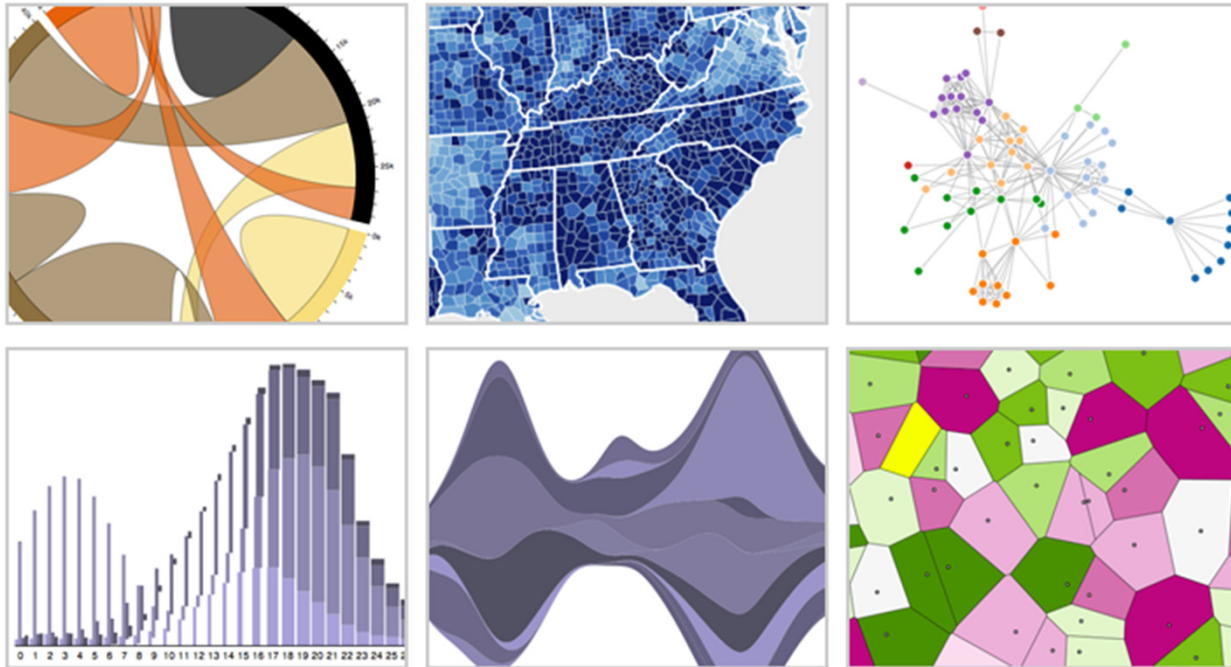
Web-based, open-source

<http://mbostock.github.com/d3/>

- d3 (javascript-based)

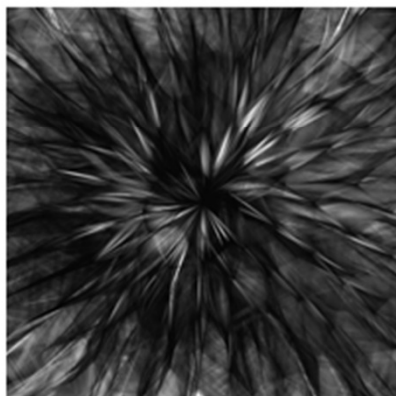
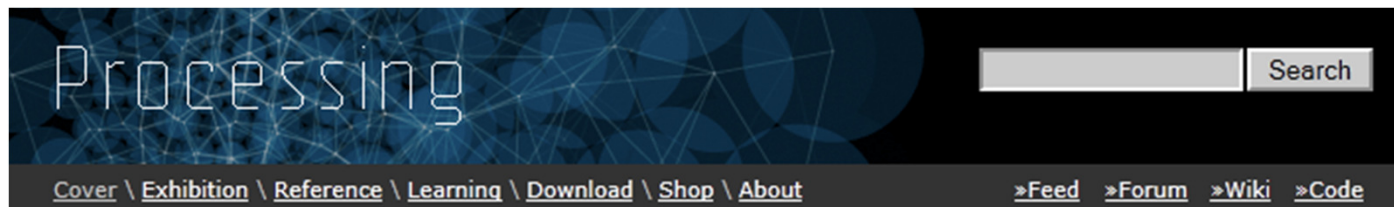
Data-Driven Documents

D3.js is a small, [free](#) JavaScript library for manipulating documents based on data.



D3 allows you to bind arbitrary data to a Document Object Model (DOM), and then apply data-driven transformations to the document. As a trivial example, you can use D3 to generate a basic HTML table from an array of numbers. Or, use the same data to create an interactive SVG bar chart with smooth transitions and interaction.

Open-source



Announcing Processing 1.5+


A lot has changed in the nine months since 1.2.1 was released, the biggest being the introduction of "modes" for the editor, allowing you to switch between Android development and the classic desktop/web mode. More modes are coming in future releases. Please read [revisions.txt](#) to see all of the changes.

- » [Download Processing](#)
- » [Explore the Exhibition](#)
- » [Play with Examples](#)
- » [Browse Tutorials](#)

Processing is an open source programming language and environment for people who want to create images, animations, and interactions. Initially developed to serve as a software sketchbook and to teach fundamentals of computer programming within a visual context, Processing also has evolved into a tool for generating finished professional work. Today, there are tens of thousands of students, artists, designers, researchers, and hobbyists who use Processing for learning, prototyping, and production.

- » Free to download and open source
- » Interactive programs using 2D, 3D or PDF output
- » OpenGL integration for accelerated 3D
- » For GNU/Linux, Mac OS X, and Windows
- » Projects run online or as double-clickable applications
- » Over 100 libraries extend the software into sound, video, computer vision, and more...
- » Well [documented](#), with many [books](#) available

Mostly Sci-Vis



Visualization Toolkit

Kitware

Search

Tell us what you think

PROJECTRESOURCESHELPOPEN SOURCE

The **Visualization Toolkit (VTK)** is an open-source, freely available software system for 3D computer graphics, image processing and visualization. VTK consists of a C++ class library and several interpreted interface layers including Tcl/Tk, Java, and Python. [Kitware](#), whose team created and continues to extend the toolkit, offers [professional support and consulting services](#) for VTK. VTK supports a wide variety of visualization algorithms including: scalar, vector, tensor, texture, and volumetric methods; and advanced modeling techniques such as: implicit modeling, polygon reduction, mesh smoothing, cutting, contouring, and Delaunay triangulation. VTK has an extensive information visualization framework, has a suite of 3D interaction widgets, supports parallel processing, and integrates with various databases on GUI toolkits such as Qt and Tk. VTK is cross-platform and runs on Linux, Windows, Mac and Unix platforms.

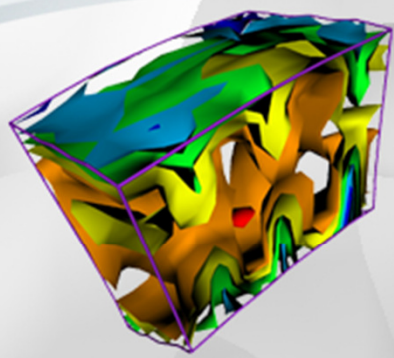
News

[More News >](#)

- 05.04.2011** [Google Summer of Code Student Projects Announced](#)
- 03.24.2011** [Visualization Toolkit Selected for Google Summer of Code](#)
- 03.15.2011** [NASA Awards Kitware Contract to Develop ParaView for Ultrascale V...](#)
- 03.09.2011** [ParaView 3.10.0 Now Available](#)
- 03.02.2011** [Kitware Announces VTK Course in Europe](#)

VTK

Thousands of researchers and developers around the world use VTK, an open source, freely available software system for 3D computer graphics, image processing, and visualization.



JavaScript InfoVis Toolkit

Create Interactive Data Visualizations for the Web

[Home](#) • [Download](#) • [Builder](#) • [Donate](#)

Demos

Explore the Visualizations

Learn

Browse the Doc

Discuss

Join the Google Group

Contribute

Get Involved

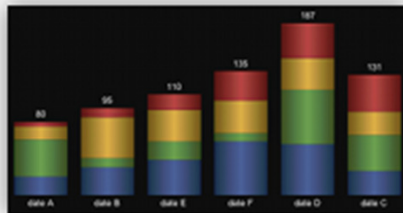
Blog

News and Stuff

About

Bio and Contact

Area, Bar and Pie Charts



Stacked AreaChart
Vertical Stacked BarChart
Horizontal Stacked BarChart
Stacked PieChart

Sunburst



File System Visualization
Custom Nodes and Edges

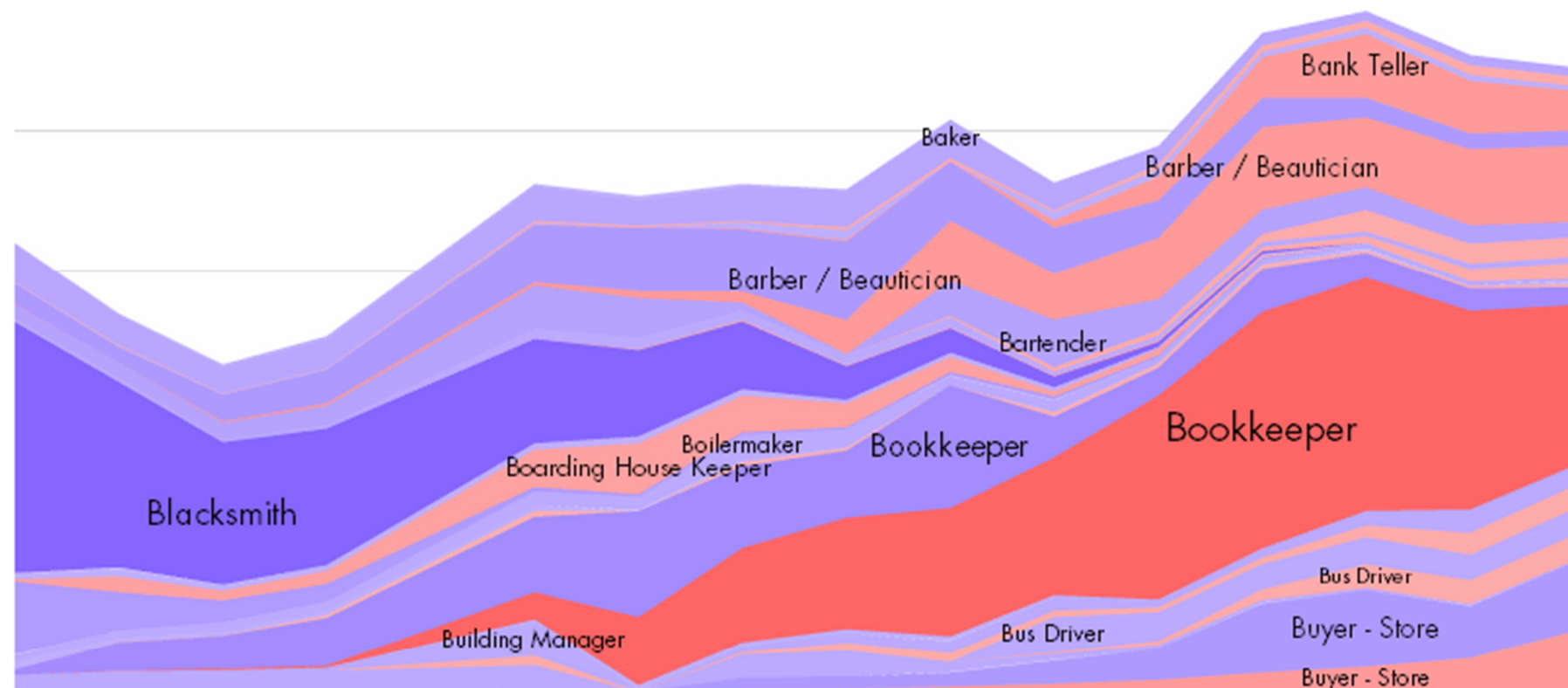
Icicle



Static Icicle Animation
File System Visualization

<http://thejit.org/>

flare DATA VISUALIZATION FOR THE WEB



Flare makes it easy to create interactive data visualizations.

Flare is an ActionScript library for creating visualizations that run in the Adobe Flash Player. From basic charts and graphs to complex interactive graphics, the toolkit supports data management, visual encoding, animation, and interaction techniques. Even better, flare features a modular design that lets developers create customized visualization techniques without having to reinvent the wheel.



Java-based

prefuse

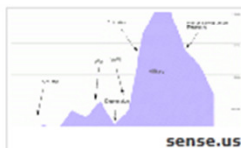
INFORMATION VISUALIZATION TOOLKIT

[Home](#) | [Download](#) | [Gallery](#) | [Documentation](#) | [Feedback](#)

Download

prefuse beta
release 2007.10.21
source zip (.zip) 4.1mb

Gallery



the prefuse visualization toolkit

Prefuse is a set of software tools for creating rich interactive data visualizations. The original **prefuse** toolkit provides a visualization framework for the Java programming language. The **prefuse flare** toolkit provides visualization and animation tools for ActionScript and the Adobe Flash Player.

Prefuse supports a rich set of features for data modeling, visualization, and interaction. It provides optimized data structures for tables, graphs, and trees, a host of layout and visual encoding techniques, and support for animation, dynamic queries, integrated search, and database connectivity. Prefuse is written in Java, using the Java 2D graphics library, and is easily integrated into Java Swing applications or web applets. Prefuse is licensed under the terms of a **BSD license**, and can be freely used for both commercial and non-commercial purposes.

The **visualization gallery** and **demonstration video** provide numerous examples of the types of applications that can be built with the prefuse toolkit.

To learn more about prefuse, take a look at the **user's manual** or the **frequently asked questions**. For users of the alpha version of the toolkit, there is also a **porting guide** for migrating to the beta version.

Need help? Visit the **Help Forum on SourceForge.net** (You'll need a SourceForge login to post). Please be sure to include detailed information (e.g., stack traces, source code, etc) if you need debugging help.

If you are interested in tools for ActionScript and Flash, see the **prefuse flare** project instead.

Piccolo



Piccolo2D Home

- Play
- Learn
- Download
- Community
- Applications
- Press
- Sponsors

Found a Typo?

A Structured 2D Graphics Framework

Welcome to Piccolo2D! A revolutionary way to create robust, full-featured *graphical applications* in Java and C#, with striking visual effects such as *zooming*, *animation* and *multiple representations*.

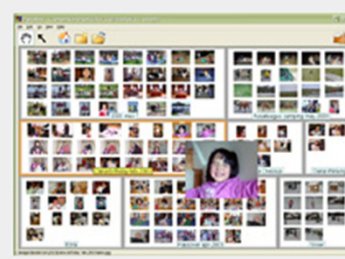
Piccolo2D is a toolkit that supports the development of 2D structured graphics programs, in general, and [Zoomable User Interfaces \(ZUIs\)](#), in particular. A ZUI is a new kind of interface that presents a huge canvas of information on a traditional computer display by letting the user smoothly zoom in, to get more detailed information, and zoom out for an overview. We use a "[scene graph](#)" model that is common to 3D environments. Basically, this means that Piccolo2D maintains a hierarchal structure of objects and cameras, allowing the application developer to orient, group and manipulate objects in meaningful ways.

Why use Piccolo2D? It will allow you to build structured graphical applications without worrying so much about the low level details. The infrastructure provides efficient repainting of the screen, bounds management, event handling and dispatch, picking (determining which visual object the mouse is over), animation, layout, and more. Normally, you would have to write all of this code from scratch. Additionally, if you want to build an application with zooming, that's built right into the framework too.

What exactly is it? Piccolo2D is a layer built on top of a lower level graphics API. There are currently three versions of the toolkit: Piccolo2D.Java, Piccolo2D.NET and PocketPiccolo2D.NET (for the .NET Compact Framework). The java version is built on Java 2 and relies on the Java2D API to do its graphics rendering. The .NET version is built on the .NET Framework and relies on the GDI+ API to do its graphics rendering. This makes it easy for Java and C# programmers, even those targeting PDAs, to build their own animated graphical applications. And best of all, Piccolo2D is **free** and **open source**!

References

The primary paper describing and analyzing the Piccolo2D architecture: Bederson, B. B., Grosjean, J., & Meyer, J. (2004). [Toolkit Design for Interactive Structured Graphics](#), IEEE Transactions on Software Engineering, 30 (8), pp. 535-546.



ManyEyes (but not really a "toolkit")

Many Eyes

Explore

[Visualizations](#)
[Data sets](#)
[Comments](#)
[Topic centers](#)

Participate

[Create a visualization](#)
[Upload a data set](#)
[Create a topic center](#)
[Register](#)

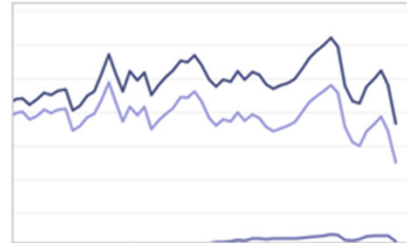
Learn more

[Quick start](#)
[Visualization types](#)
[About Many Eyes](#)
[Privacy](#)
[Blog](#)

Visu

Try our featured visualizations

US Taxes as Percentage of Personal Income



1929-2009

by David Joerg

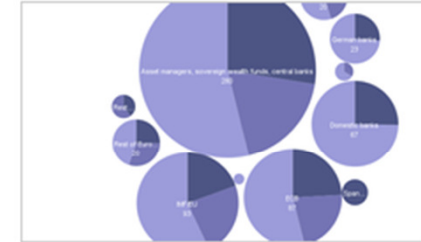
Browser Market Share



Percent. 1994 Q1 - 2010 Q3

by frank_molenaar

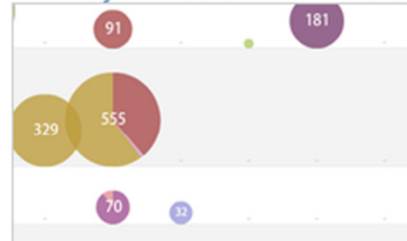
Who Holds the Debt



Greece, Ireland and Portugal

by kostasgeorgioy

NHL Players Born in Newfoundland



I'se The B'y that plays hockey...

by 1rick

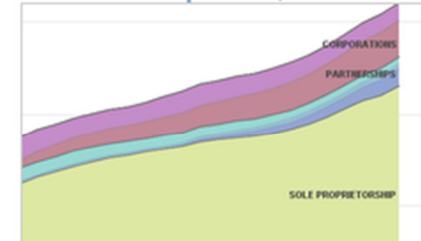
Fire Related Civilian Deaths and Injuries



US Data

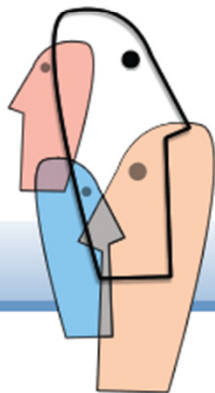
by Jeff Kempster

Business Composition, Tax



1980-2007

by exkimu00



An experiment brought to you by IBM Research and the IBM Cognos software group

R

- Stats software
- Lots of data vis/plots packages

Google Charts API

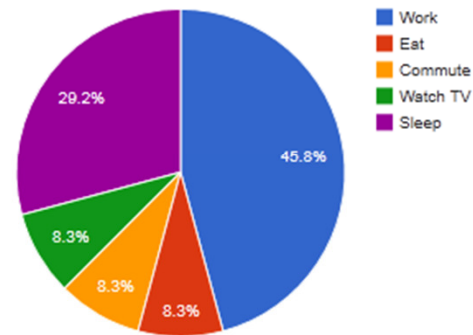
Google Chart Tools

Display live data on your site

Google chart tools are powerful, simple to use and free. Try out our rich gallery of interactive charts and data tools.

Get Started

Pie Chart - [view source](#)



     [more](#)



Rich Gallery

Choose from a variety of charts. From simple scatter plots to hierarchical tree-maps, find the best fit to your data.



Customizable

Make the charts your own. Configure an extensive set of options to perfectly match the look and feel of your website.



HTML5 / SVG

Cross-browser compatibility (adopting VML for older IE versions) and cross platform portability to iOS and new Android releases. No plugins are needed.



Free

Completely free for all uses: commercial, governmental, personal or educational.



Interactive

Simple event handling enables a cohesive interactive experience with the surrounding web page.



Dynamic

Present real-time data using a variety of data connection tools.

Graph Vis Library

JUNG

Java Universal Network/Graph Framework

[Overview](#)

[Download](#)

[Documentation](#)

[Examples](#)

[Wiki](#)

[Projects Using JUNG](#)

[FAQ](#)

[Support](#)

[Team](#)

[Presentations](#)

[Bug Tracker](#)

[Sourceforge](#)

[Acknowledgements](#)

[Links](#)

SOURCEFORGE.NET

Overview

JUNG — the Java Universal Network/Graph Framework—is a software library that provides a common and extendible language for representing and manipulating graph or network. It is written in Java, which allows JUNG-based applications to make use of the extensive built-in capabilities of the Java language.

The JUNG architecture is designed to support a variety of representations of entities and their relations, such as directed and undirected graphs, weighted and unweighted graphs, and hypergraphs. It provides a mechanism for annotating graphs, entities, and relations with metadata. This facilitates the creation of analytical tools that can operate on the metadata attached to each entity and relation.

The current distribution of JUNG includes implementations of a number of algorithms from graph theory, data mining, and network analysis, including shortest path algorithms, random graph generation, statistical analysis, and calculation of network distances, flows, and importance measures (centrality).

JUNG also provides a visualization framework that makes it easy to construct tools for the interactive exploration of networks. Users can create their own custom layouts. In addition, filtering mechanisms are provided which allow users to focus their attention on specific parts of the network.

As an open-source library, JUNG provides a common framework for graph/network analysis and visualization. We hope that this will help to coordinate others' development efforts, and thus avoid continually re-inventing the wheel.

— The JUNG Framework Development Team

Many More

- ...

My sage advice

- Learn about your data
- Be creative & have fun building your own vis
- Build on what exists but also modify to adjust to your own data
- Do not neglect interaction
- Please choose good colors
Permutations of 255,0,0 hardly ever look good!
- Be critical about visualizations you see!

Today We Covered

- Basics of Visualization
 - What is InfoVis
 - How do you generate an infovis
 - What are the basic building blocks
- Overview of Visualization Techniques
 - For a variety of datasets
 - Interaction
 - Toolkits

Acknowledgements

This lecture was inspired by slides sets from:

- Sheelagh Carpendale
- Christopher Collins
- Jean-Daniel Fekete
- Jeffrey Heer
- Tobias Isenberg
- John Stasko