

CS 185 -- Human Computer Interaction

4/10 Intro to Visualization

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Overview

- **Visualization for Exploring and Understanding Data**
- **Visual Variables**
- **Visual Design**
- **Visualizing Algorithms**
- **Geospatial Visualization**
- **High Dimensional Data**

Exploit Human Perception

Highest bandwidth sense

Fast, parallel

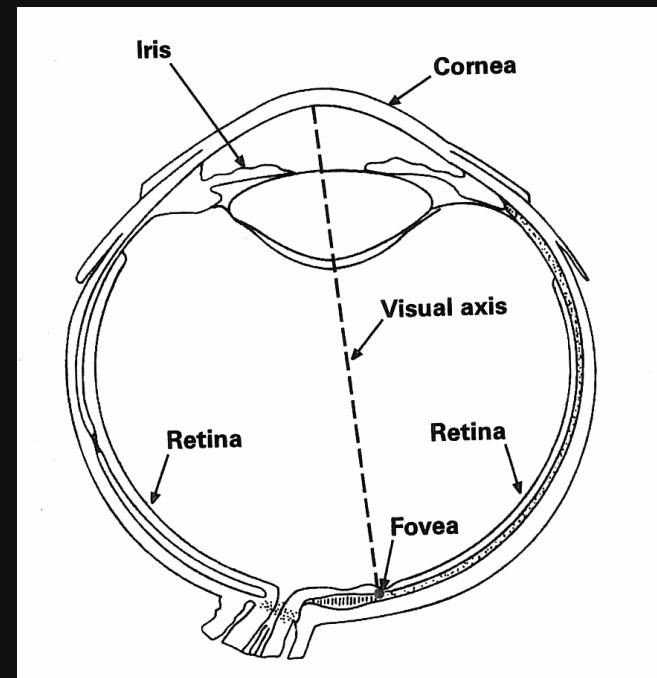
Pattern recognition

Pre-attentive

Extends memory and cognitive capacity

People think visually

Impressive. Lets use it!



Types of data

Entities – objects of interest

Relationships

- form structures that relate entities
- many kinds of relationships

Attributes of entities or relationships

- if they cannot be thought of independently

Operations (cf Colin Ware)

- Operations (actions) can also be considered as data

What is visualization?

Understanding and seeing

We talk about trying to make our thoughts **clear**, to bring them into **focus**

“To visualize” – really means “to construct a visual image in the mind” – but now also refers to
“a graphical representation of data or concepts”

Defn of Visualization: The use of computer-supported, visual representation of data to amplify cognition

The purpose of visualization is **insight**, not pictures

Visualizations can be said to be **natural** or **visually efficient**

How Visualization Amplifies Cognition

Different ways that visualizations *could* help amplify cognition:

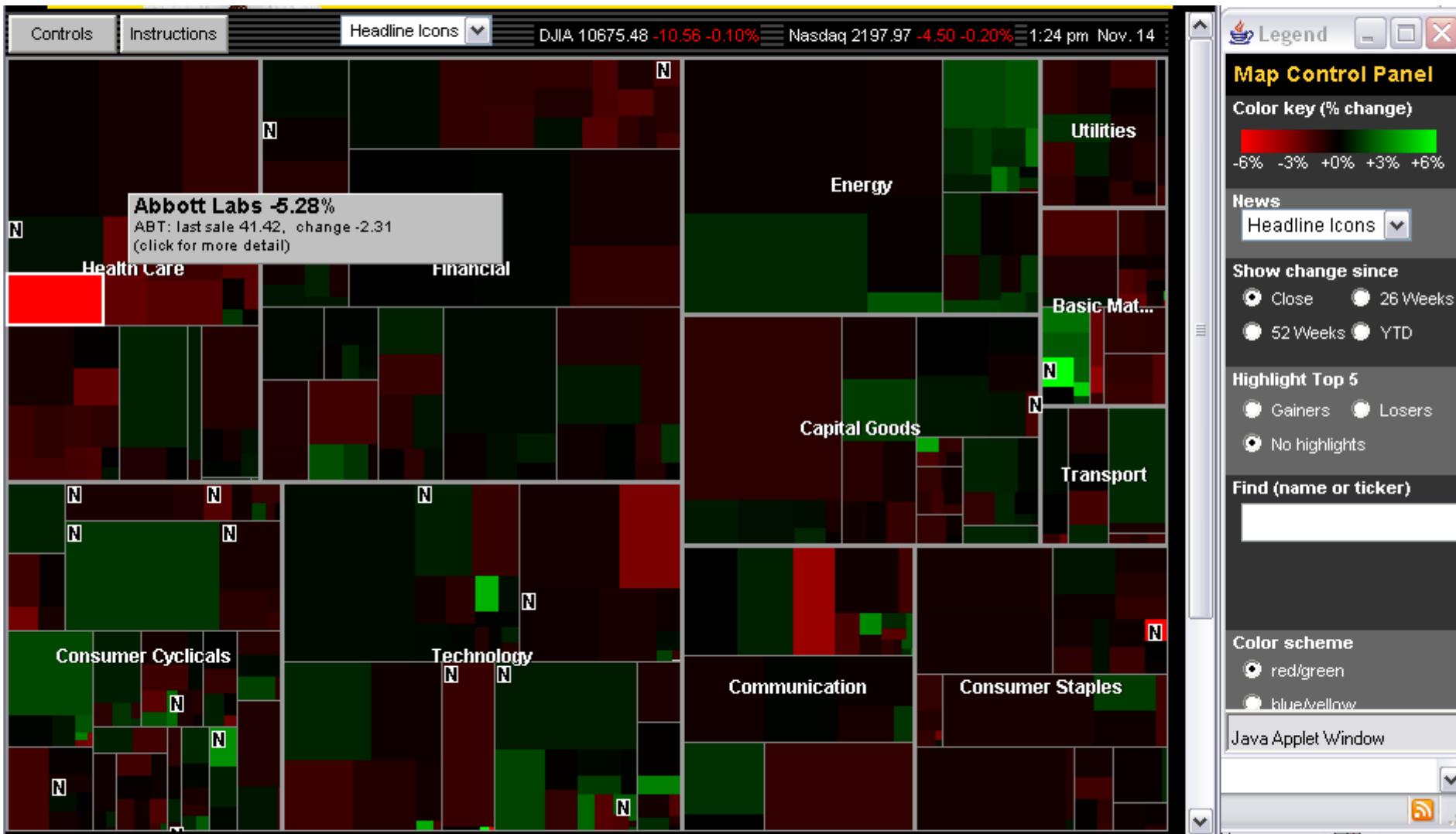
1. By increasing **memory** and processing resources available
2. By reducing the amount of time to **search**
3. Enhancing the detections of **patterns** and enabling perceptual inference operations
4. Aid perceptual **monitoring**
5. By encoding information in a **manipulable** medium

Mapping Data to Visual Form

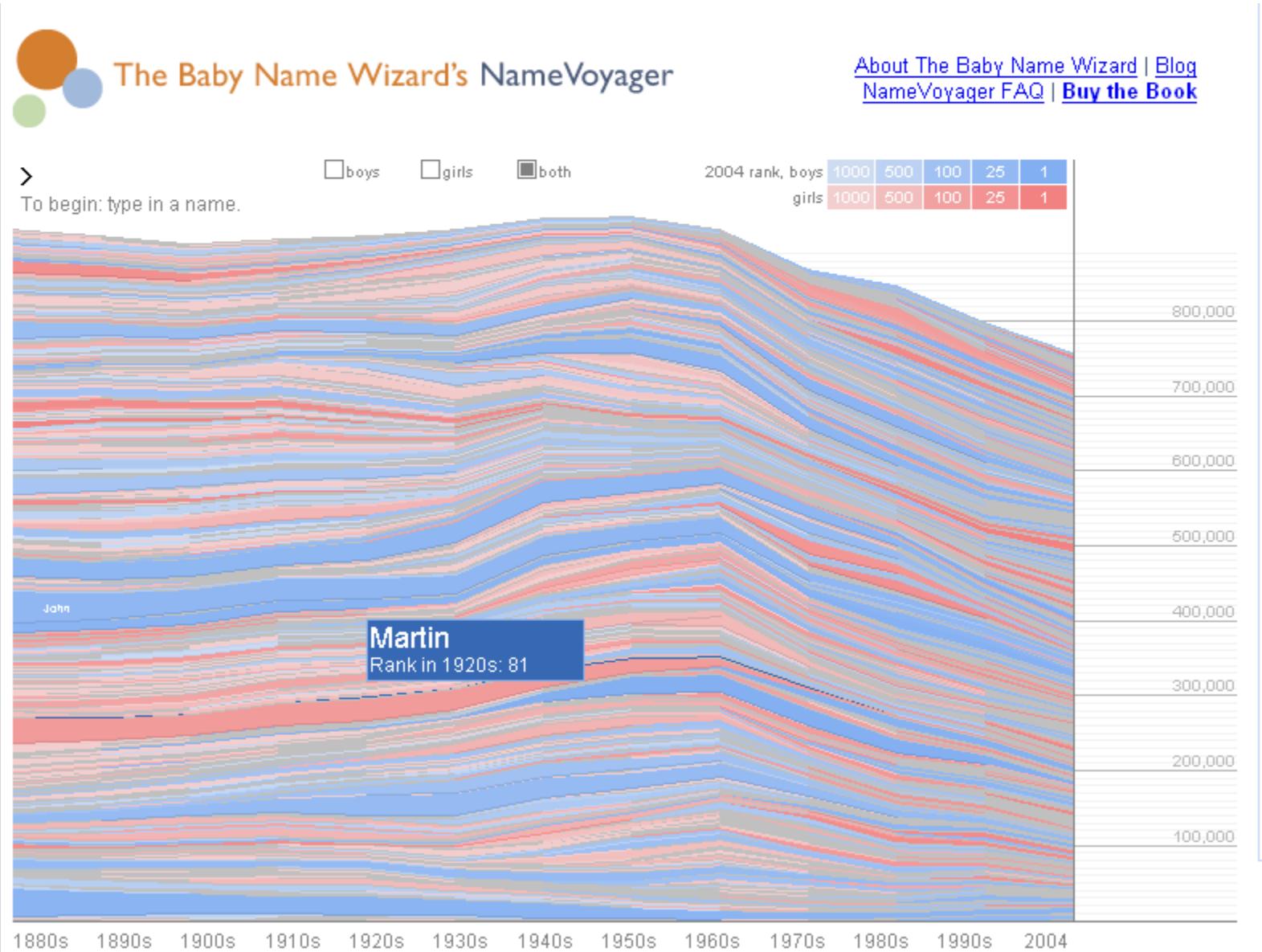
Different forms of data:

- Data tables
- Meta data (descriptive data about data)
- Hierarchies, heterarchies

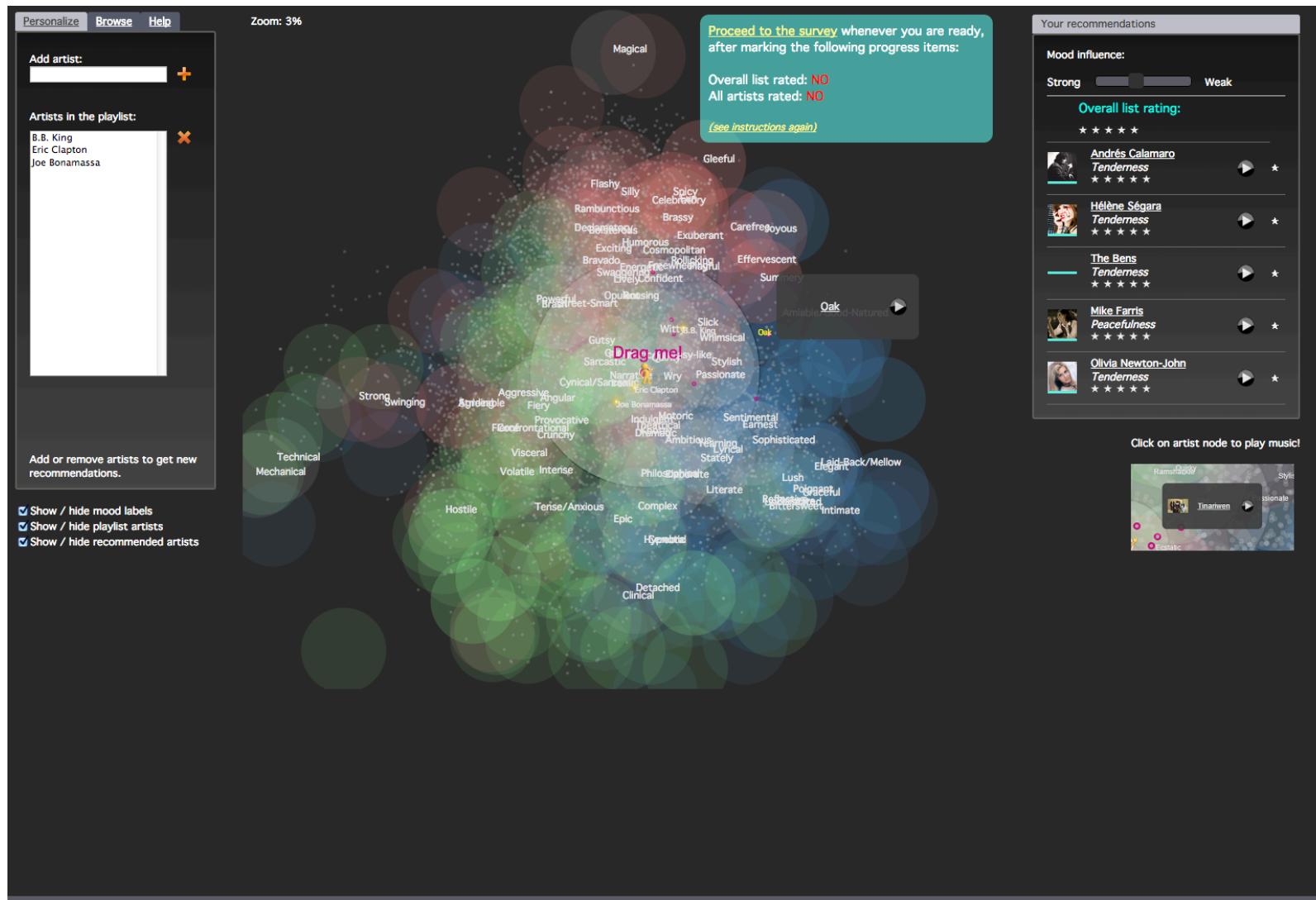
SmartMoney (TreeMap)



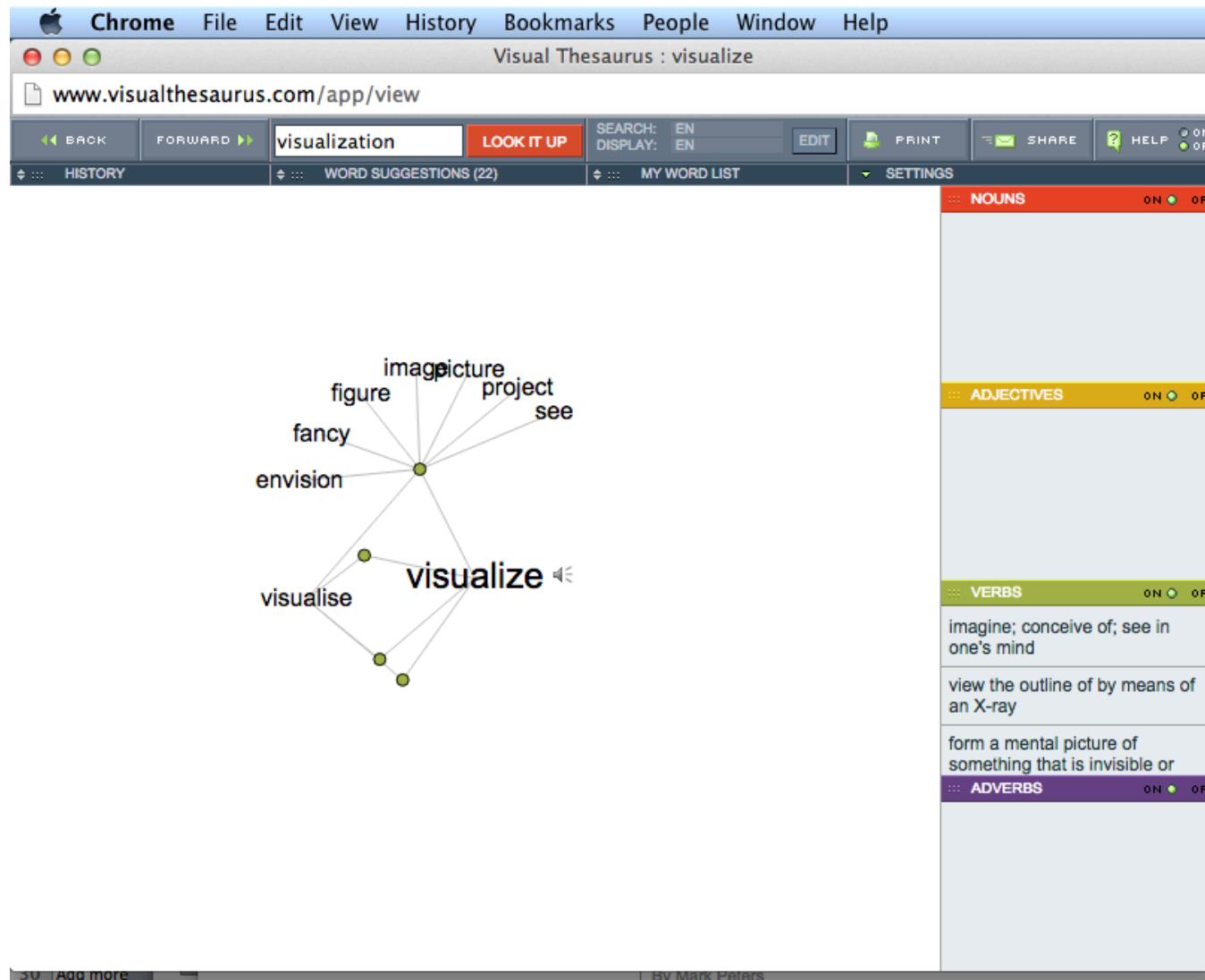
Baby Name Voyager (River)



MoodPlay (Asterism?) (I. Andjelkovic)



Visual Thesaurus (Node-link)



Attribute quality (variable types)

Nominal data

- Labeling function (e.g. apple, orange), category data that can be directly compared (=)

Ordinal data

- Sequencing things, ranking (<,>)

Quantitative data

- Real numbers (e.g. object A is twice as big as B, can do arithmetic on them, ratios)
- And Interval data
 - Able to derive gap between data values (e.g. time of departure and arrival of an aircraft)

We can sometimes transform one type of data into another

Exploit Human Perception

Highest bandwidth sense

Fast, parallel

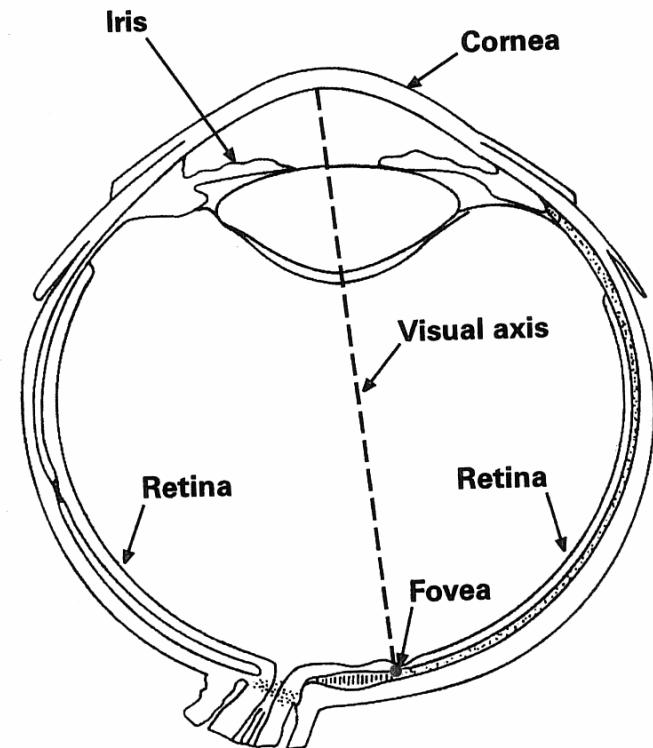
Pattern recognition

Pre-attentive

Extends memory and cognitive capacity

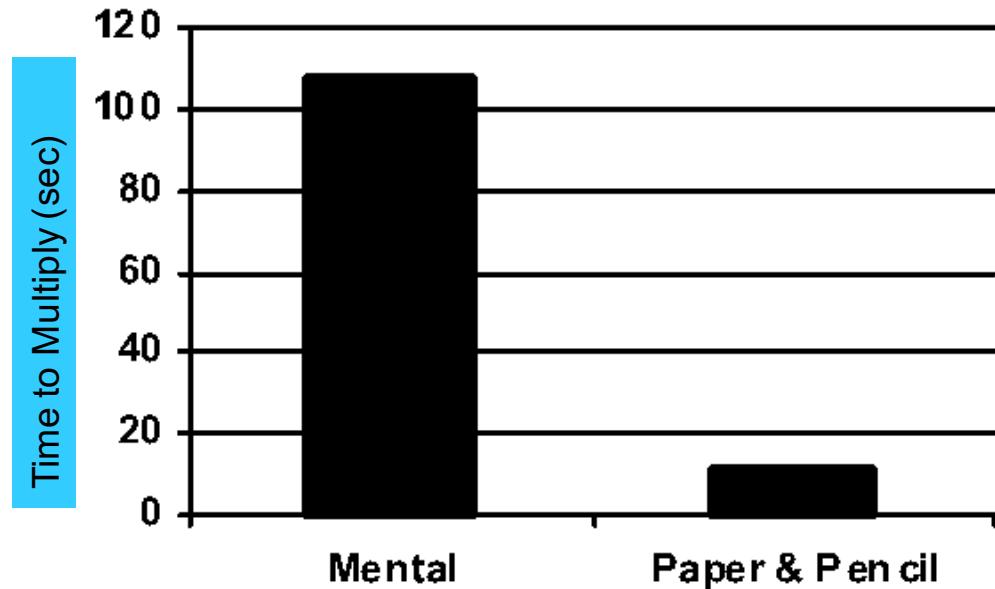
People think visually

Impressive. Lets use it!



Strategy: Use External World (Externalize)

$$\begin{array}{r} 34 \\ \times 72 \\ \hline 68 \\ 23^2 80 \\ \hline 24^1 48 \end{array}$$



How Many Zeros in 100 Digits of PI?

3.14159265358979
323846264338327
950288419716939
937510582097494
459230781640628
620899862803482
534211706798214

How Many Red Objects?

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

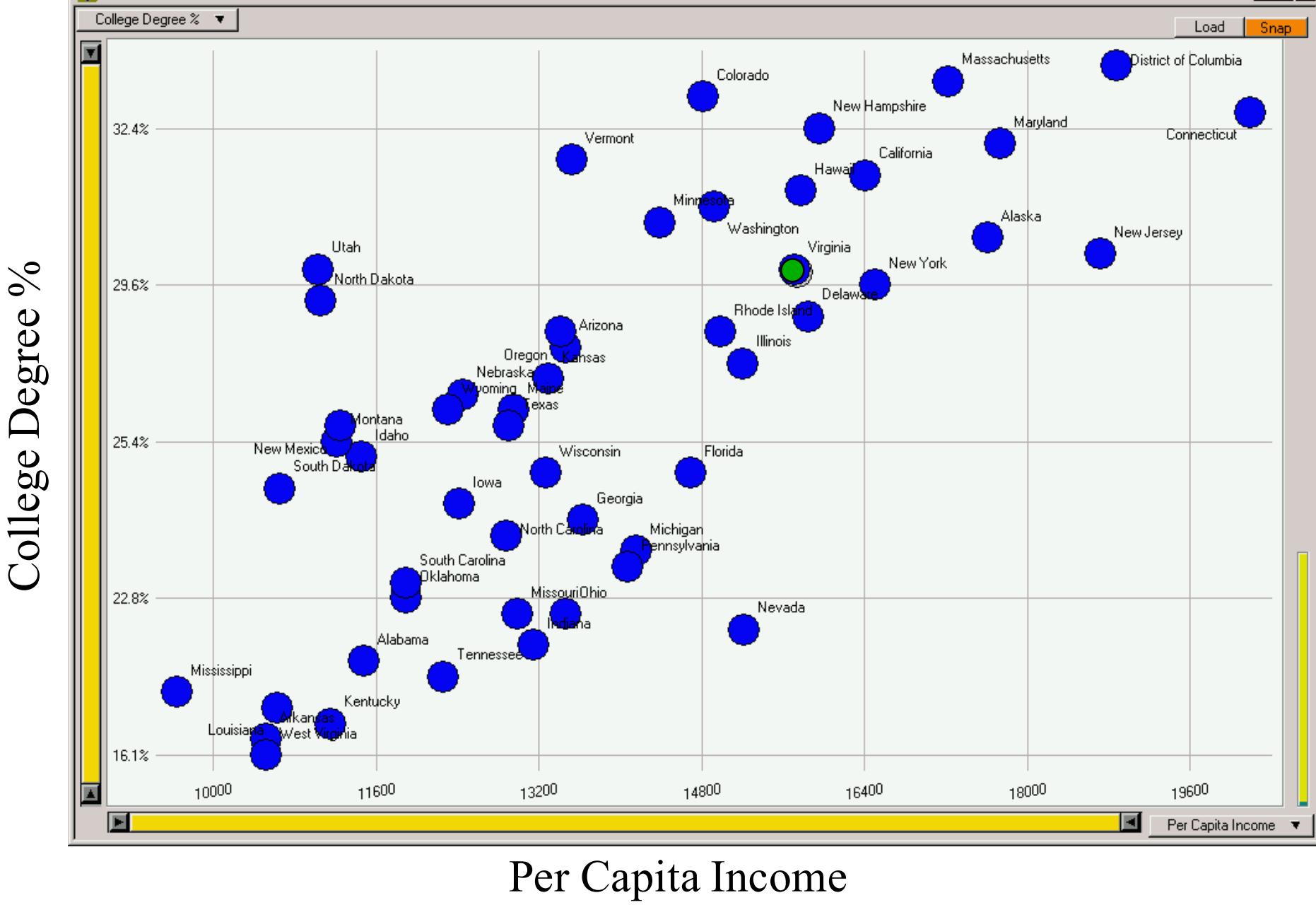
Which state has highest Income?

Relationship between Income and Education?

Outliers?

Table - StateData()

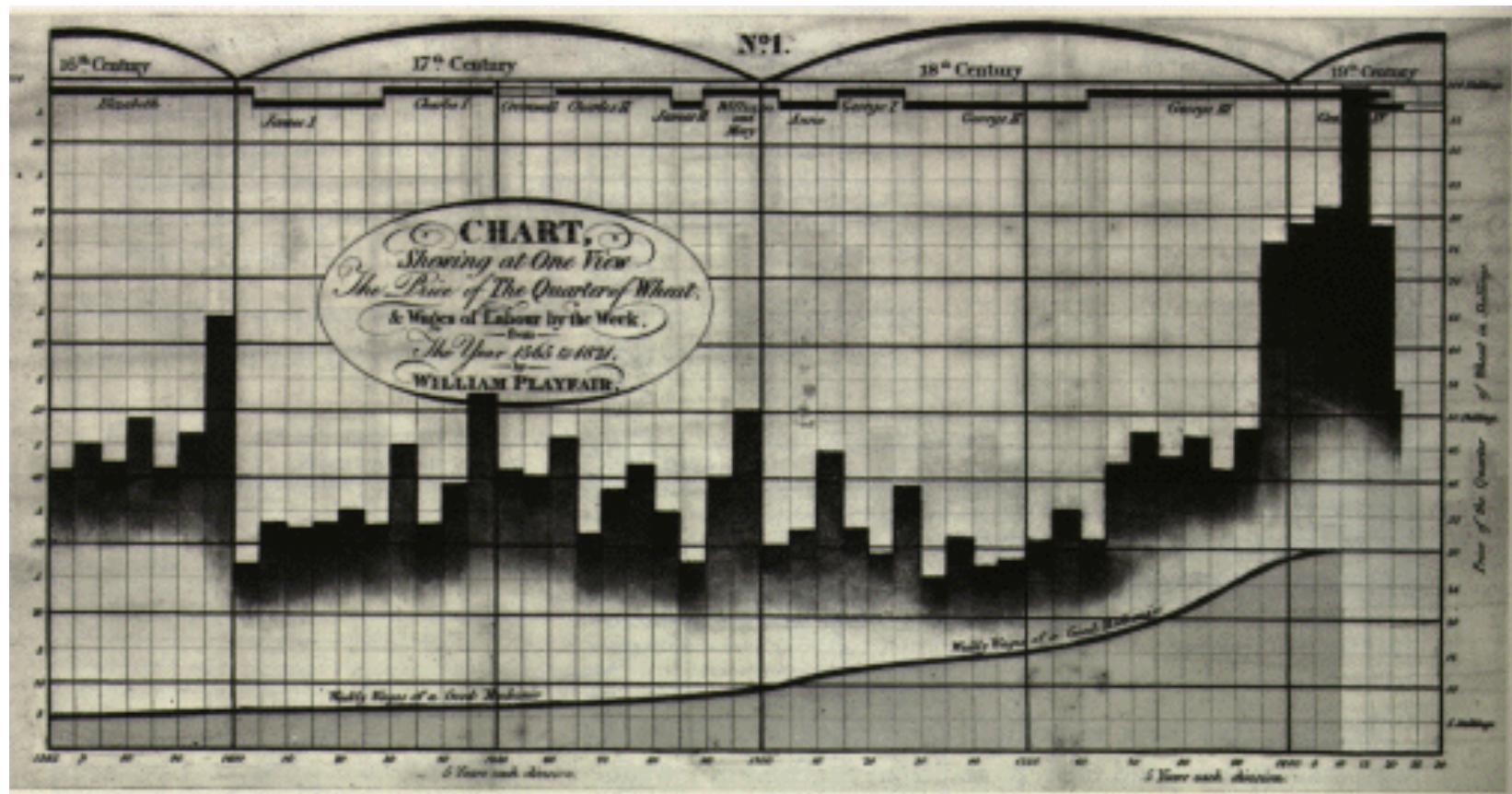
State	College Degree %	Per Capita Income	Median Income	Population
Alabama	20.6%	11486	\$30,400	4,713,917
Alaska	30.3%	17610	\$30,400	710,000
Arizona	27.1%	13461	\$30,400	6,713,917
Arkansas	17.0%	10520	\$30,400	3,000,000
California	31.3%	16409	\$30,400	37,000,000
Colorado	33.9%	14821	\$30,400	5,000,000
Connecticut	33.8%	20189	\$30,400	3,500,000
Delaware	27.9%	15854	\$30,400	950,000
District of Columbia	36.4%	18881	\$30,400	600,000
Florida	24.9%	14698	\$30,400	21,000,000
Georgia	24.3%	13631	\$30,400	9,000,000
Hawaii	31.2%	15770	\$30,400	1,400,000
Idaho	25.2%	11457	\$30,400	1,600,000
Illinois	26.8%	15201	\$30,400	12,000,000
Indiana	20.9%	13149	\$30,400	6,000,000
Iowa	24.5%	12422	\$30,400	3,000,000
Kansas	26.5%	13300	\$30,400	3,000,000
Kentucky	17.7%	11153	\$30,400	4,000,000
Louisiana	19.4%	10635	\$30,400	4,000,000
Maine	25.7%	12957	\$30,400	1,200,000
Maryland	31.7%	17730	\$30,400	5,500,000
Massachusetts	34.5%	17224	\$30,400	6,500,000
Michigan	24.1%	14154	\$30,400	9,500,000
Minnesota	30.4%	14389	\$30,400	5,000,000
Mississippi	19.9%	12989	\$30,400	2,500,000
Missouri	22.3%	11213	\$30,400	6,000,000
Montana	25.4%	12452	\$30,400	950,000
Nebraska	26.0%	15214	\$30,400	1,800,000
Nevada	21.5%	15959	\$30,400	3,000,000
New Hampshire	32.4%	18714	\$30,400	1,300,000
New Jersey	30.1%	12885	\$30,400	9,000,000
New Mexico	25.5%	11246	\$30,400	2,000,000
New York	29.6%	16501	\$30,400	19,000,000
North Carolina	24.2%	11051	\$30,400	8,000,000
North Dakota	28.1%	13461	\$30,400	700,000
Ohio	22.3%	11893	\$30,400	11,000,000
Oklahoma	22.8%	13418	\$30,400	3,500,000
Oregon	27.5%	14068	\$30,400	3,500,000
Pennsylvania	23.2%	14981	\$30,400	12,000,000
Rhode Island	27.5%	11897	\$30,400	1,000,000
South Carolina	23.0%	10661	\$30,400	4,000,000
South Dakota	24.6%	12255	\$30,400	800,000
Tennessee	20.1%	12904	\$30,400	6,000,000
Texas	25.5%	11029	\$30,400	24,000,000
Utah	30.0%	13527	\$30,400	3,000,000
Vermont	31.5%	15713	\$30,400	600,000
► Virginia	30.0%	14923	\$30,400	8,000,000
Washington	30.9%	10520	\$30,400	6,000,000
West Virginia	16.1%	13276	\$30,400	1,000,000
Wisconsin	24.9%	12311	\$30,400	5,000,000
Wyoming	25.7%		\$30,400	



William Playfair

Scottish political economist. “Father of statistical graphics” (together with J.H. Lambert)

1786 published the first presentation graphics

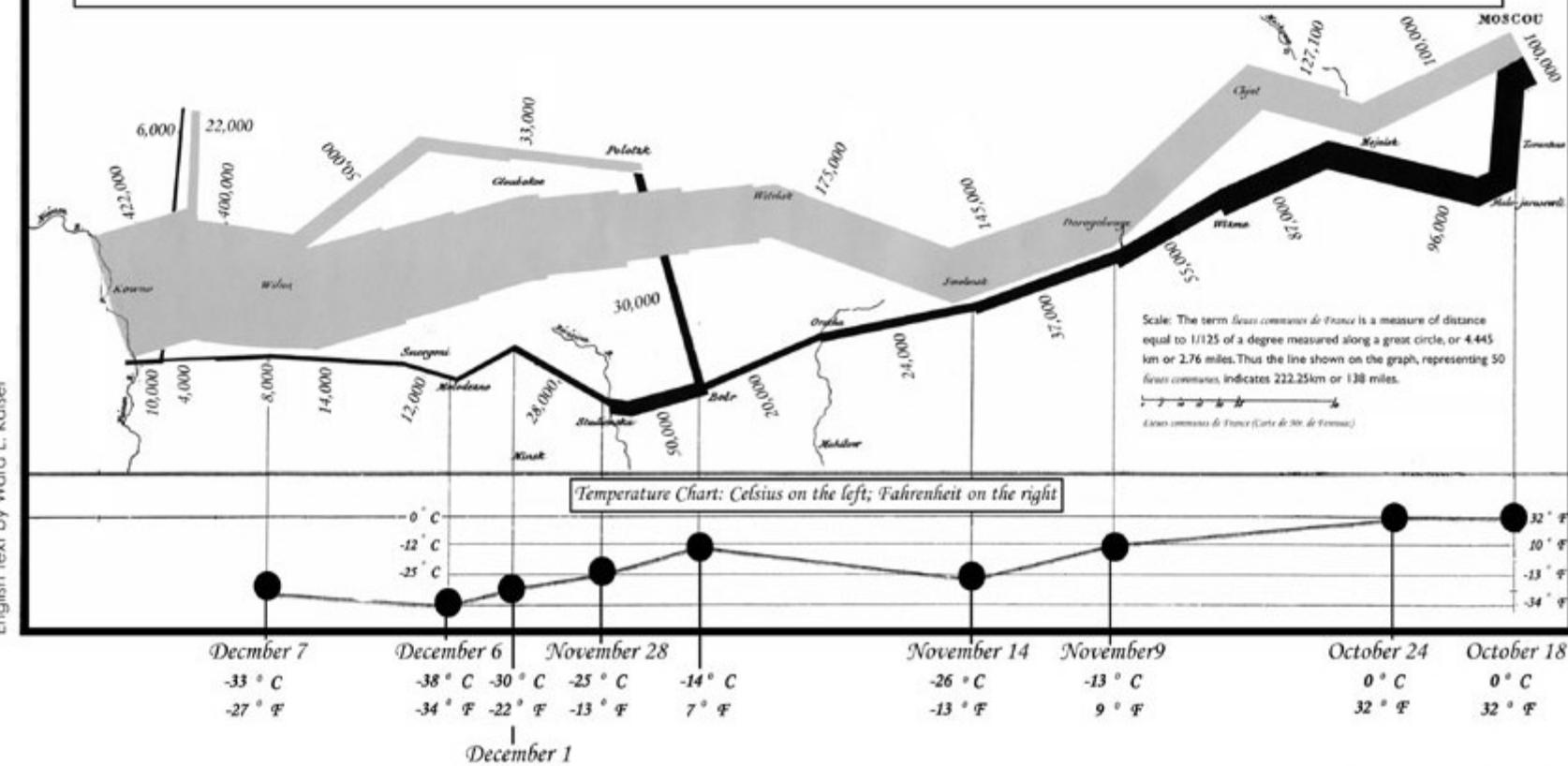


*Map representing the losses over time of French army troops during the Russian campaign, 1812-1813.
Constructed by Charles Joseph Minard, Inspector General of Public Works retired.*

Paris, 20 November 1869

The number of men present at any given time is represented by the width of the grey line; one mm. indicates ten thousand men. Figures are also written besides the lines. Grey designates men moving into Russia; black, for those leaving. Sources for the data are the works of messrs. Thiers, Segur, Fezensac, Chambray and the unpublished diary of Jacob, who became an Army Pharmacist on 28 October. In order to visualize the army's losses more clearly, I have drawn this as if the units under prince Jerome and Marshall Davoust (temporarily separated from the main body to go to Minsk and Mikilow, which then joined up with the main army again), had stayed with the army throughout.

English text by Ward L. Kaiser



Editor's note: dates & temperatures are only referenced for the retreat from Moscow
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Figure 58. Minard's map of Napoleon's Russian campaign.

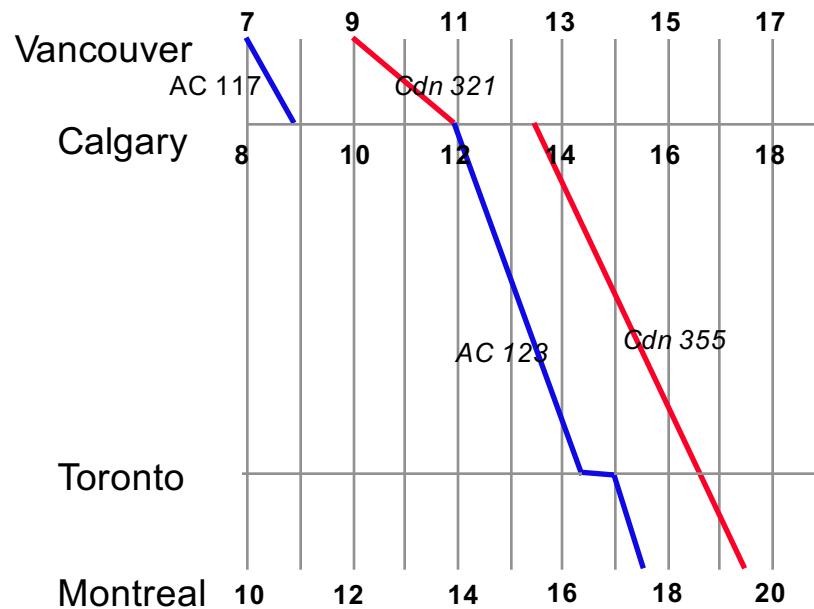
This graphic has been translated from French to English and modified to most effectively display the temperature data.

Which is the best flight?

length, stop-overs, switches...

		depart	arrive
AC 117	Vancouver - Calgary	7:00	9:00
Cdn 321	Vancouver - Calgary	9:00	12:00
Cdn 355	Calgary - Montreal	13:30	19:30
AC 123	Calgary - Toronto	12:30	16:30
AC 123	Toronto - Montreal	16:45	17:30

*time zone: +1 van-cal, +2 cal-tor, mtl



Principles for Information Visualization

Graphics should reveal the data

- show the data
- not get in the way of the message
- avoid distortion
- present many numbers in a small space
- make large data sets coherent
- encourage comparison between data
- supply both a broad overview and fine detail
- serve a clear purpose

E. Tufte

Visual Display of Quantitative Information

- *many visual examples on the following slides are taken from Tufte's books*

Show The Data



||||| |||| ||

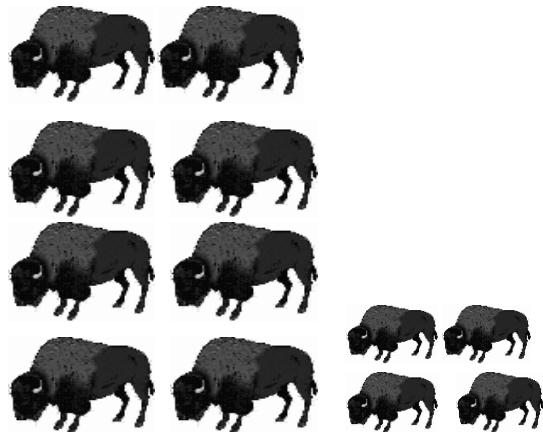
Buffalo

||||| |||| ||

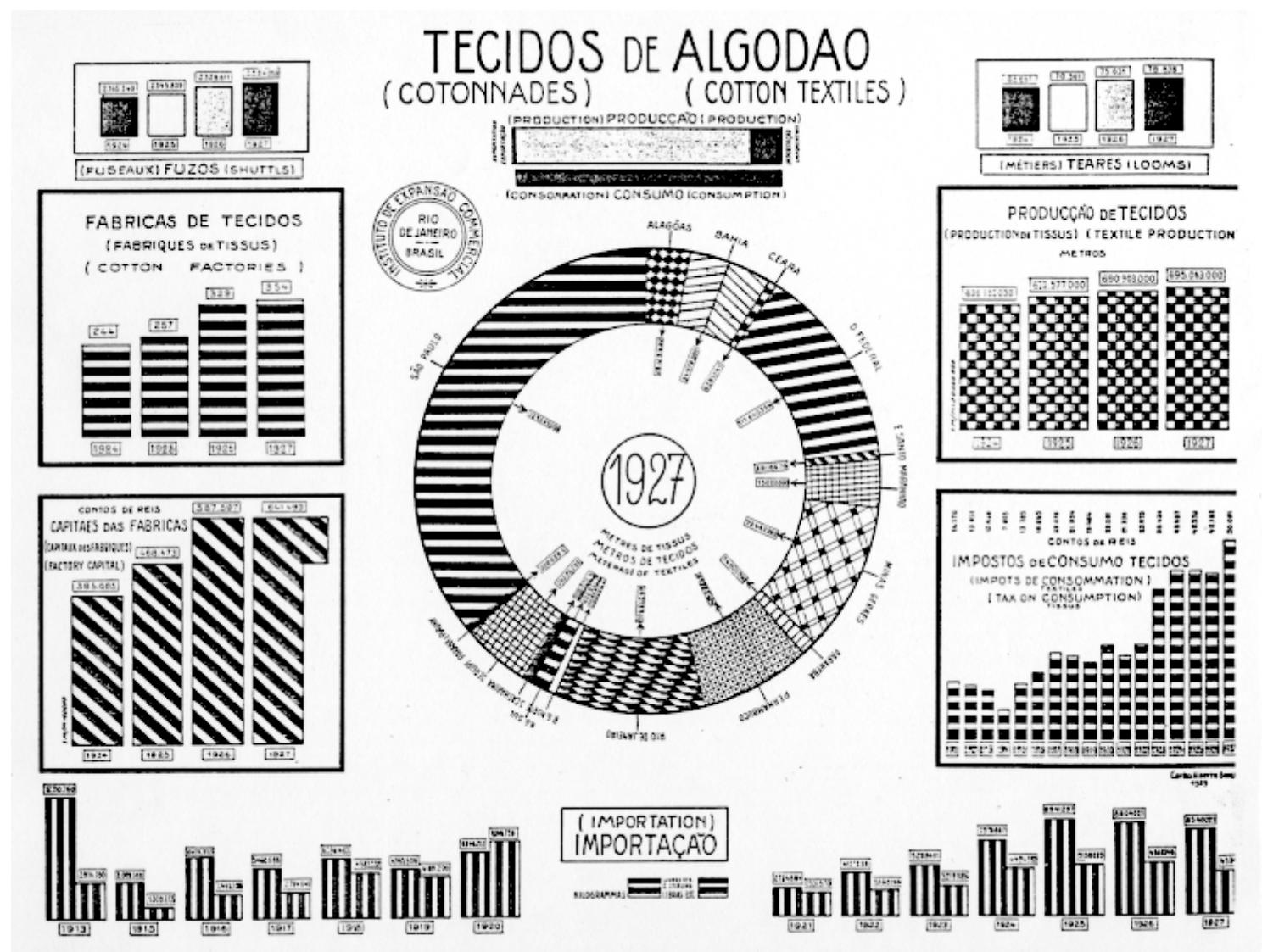
Buffalo

||||| ||||

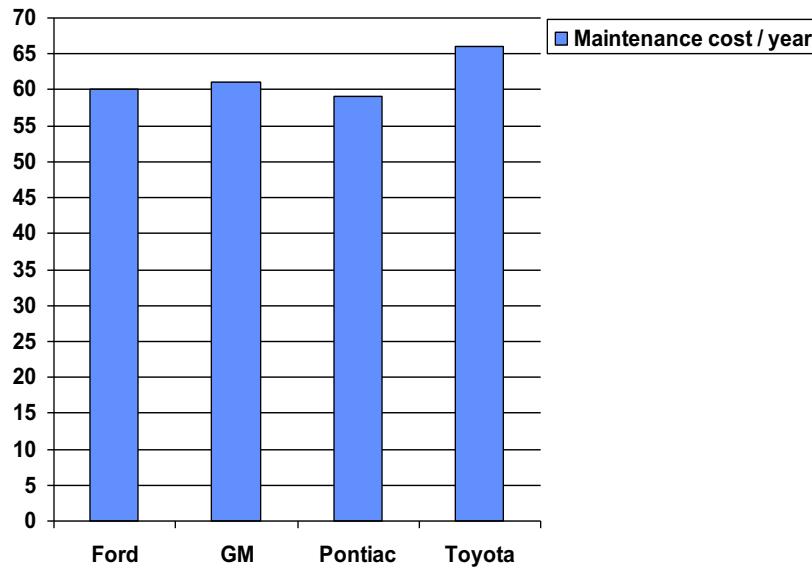
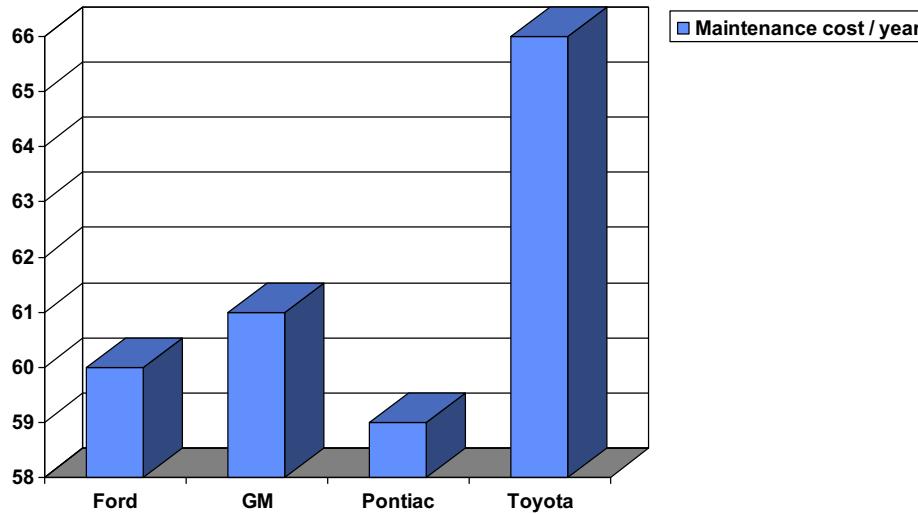
Adults # calves



Do Not Get In The Way Of The Message



Avoid Distortion



Broad Overview And Fine Detail

Mutually Exclusive Views



Icewind Dale (Black Isle)

Broad Overview And Fine Detail

Overlay



Diablo (Blizzard)

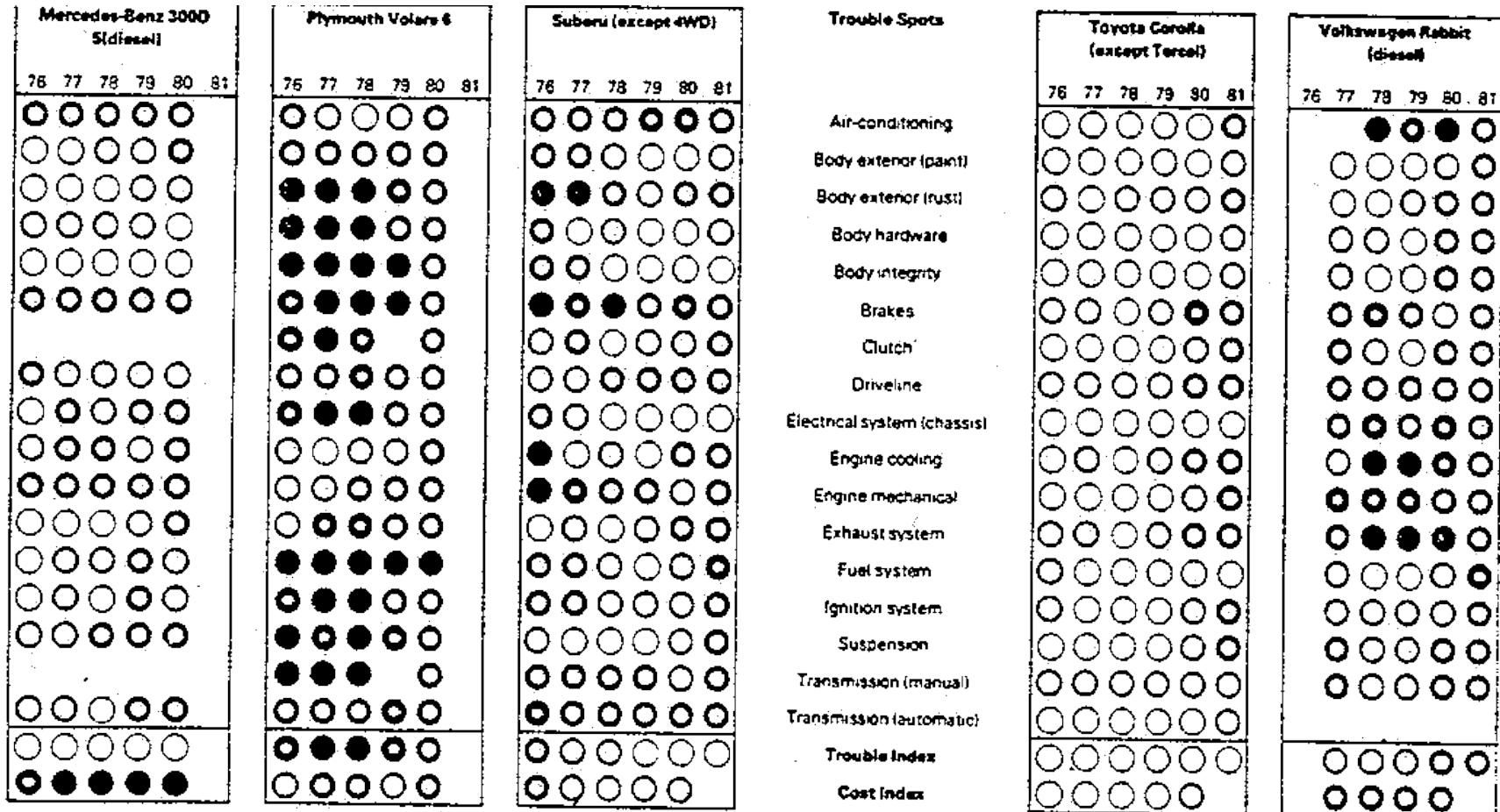
Broad Overview And Fine Detail

Separate Views

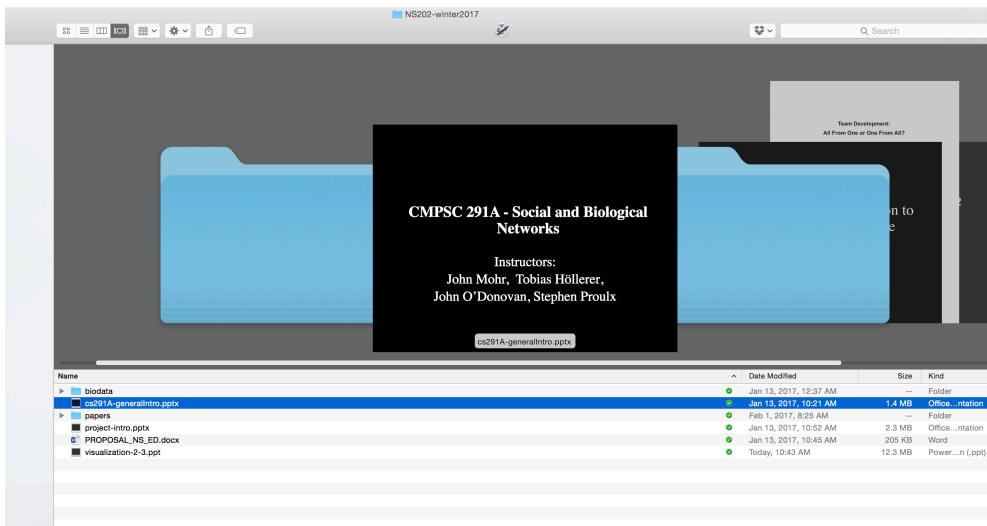


Defender (Williams Electronics)

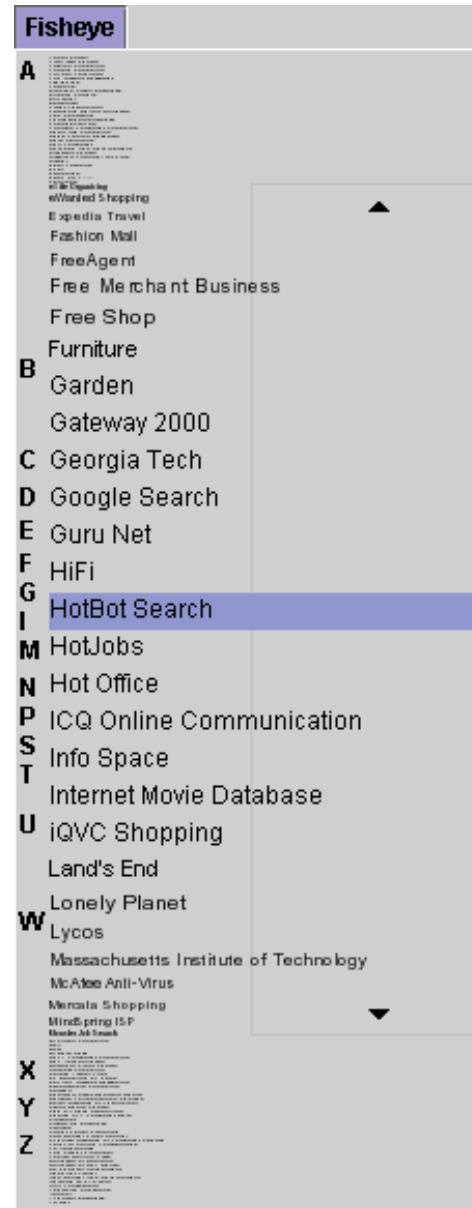
Broad Overview And Fine Detail



Broad Overview And Fine Detail



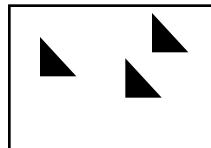
Bederson, B.B. (May 2000)
University of Maryland
www.cs.umd.edu/hcil/fisheyemenu/



Visual Variables (Jacques Bertin)

Position

- Changes in the x, y, z location



Size

- Changes in length, area or repetition



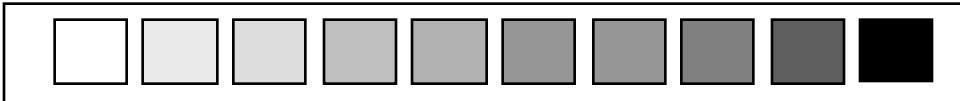
Shape

- Changes in form



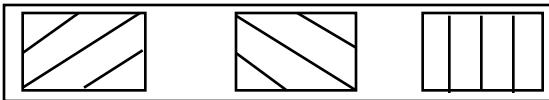
Value

- Changes in brightness



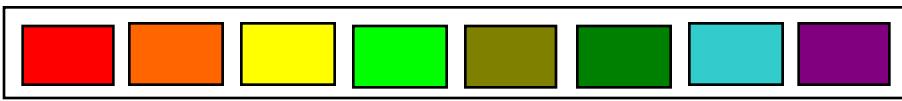
Orientation

- Changes in alignment



Color

- Changes in hue



Texture

- Variations in pattern



Motion



Visual Variables

Visual variables can affect how you interpret information

- **selective**

is a change in this variable enough to allow us to select things from a group?

- **associative**

is a change in this variable enough to allow us to perceive things as a group?

- **quantitative**

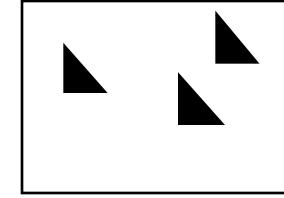
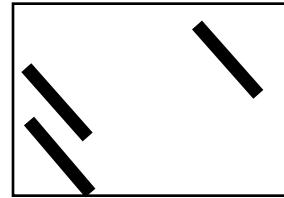
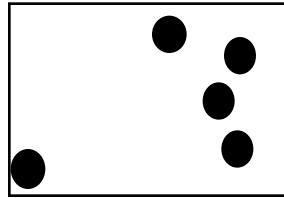
is there a numerical reading obtainable from changes in this variable?

- **order**

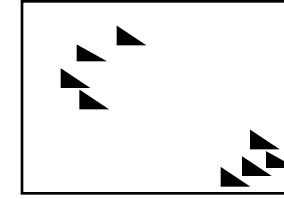
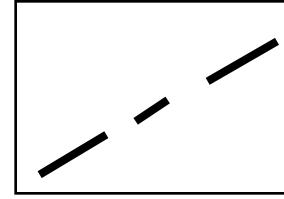
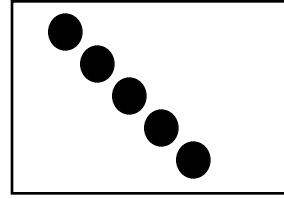
are changes in this variable perceived as ordered?

Visual Variable: Position

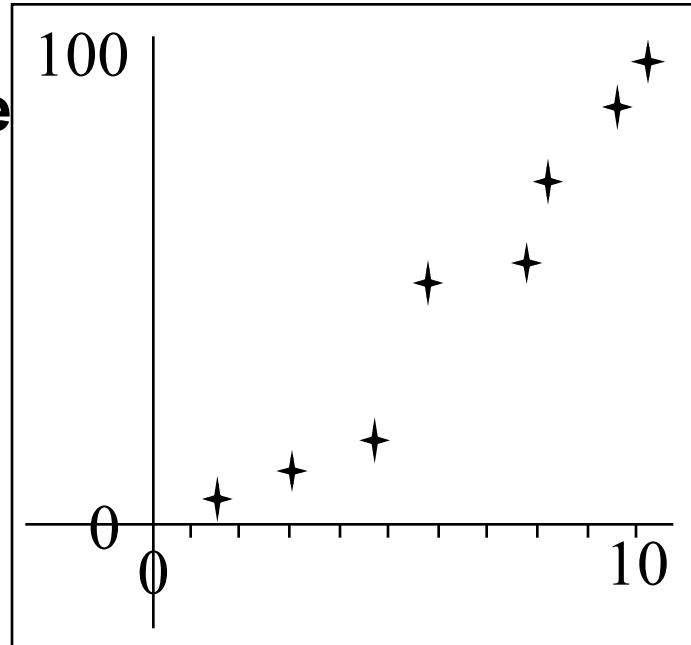
✓ selective



✓ associative



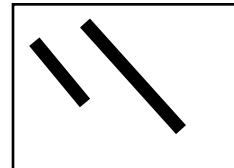
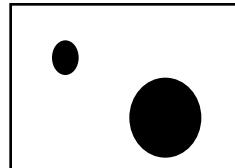
✓ quantitative



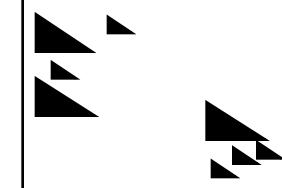
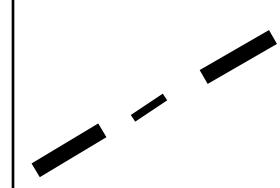
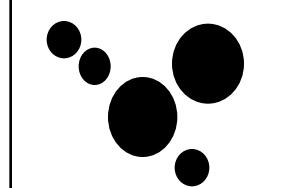
✓ order

Visual Variable: Size

✓ selective



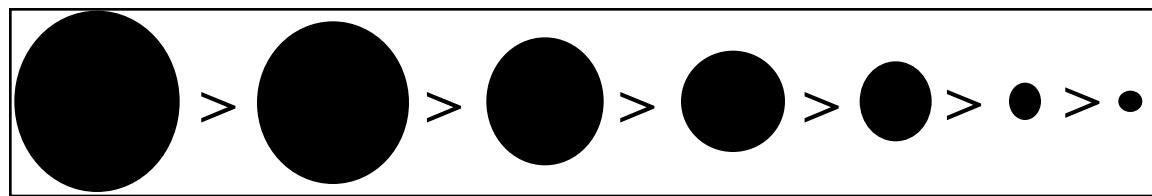
✓ associative



✗ quantitative

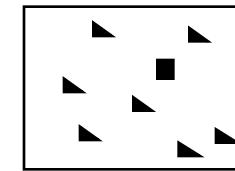
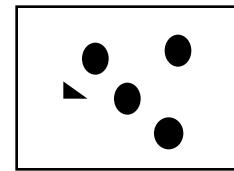
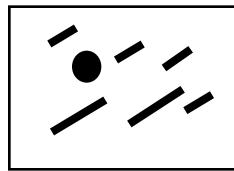
$$4 \times \blacksquare = \begin{array}{|c|c|}\hline \blacksquare & \blacksquare \\ \hline \blacksquare & \blacksquare \\ \hline \end{array}$$

✓ order

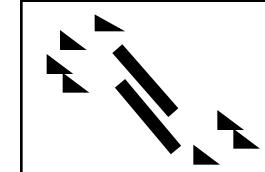
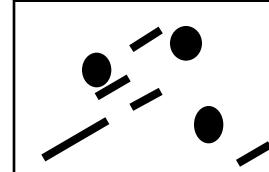
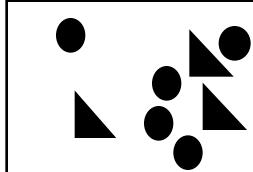


Visual Variable: Shape

 **selective**



 **associative**



 **quantitative**

  15

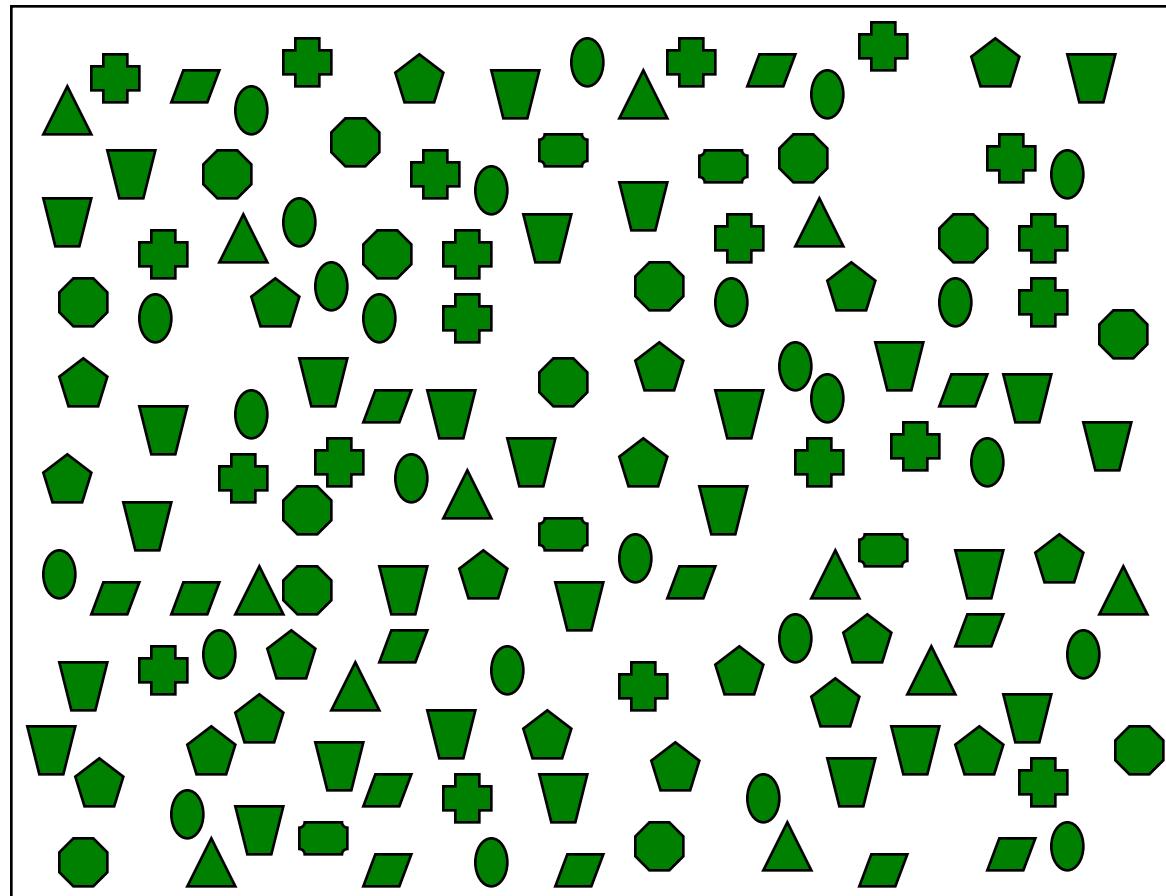
  34

  105

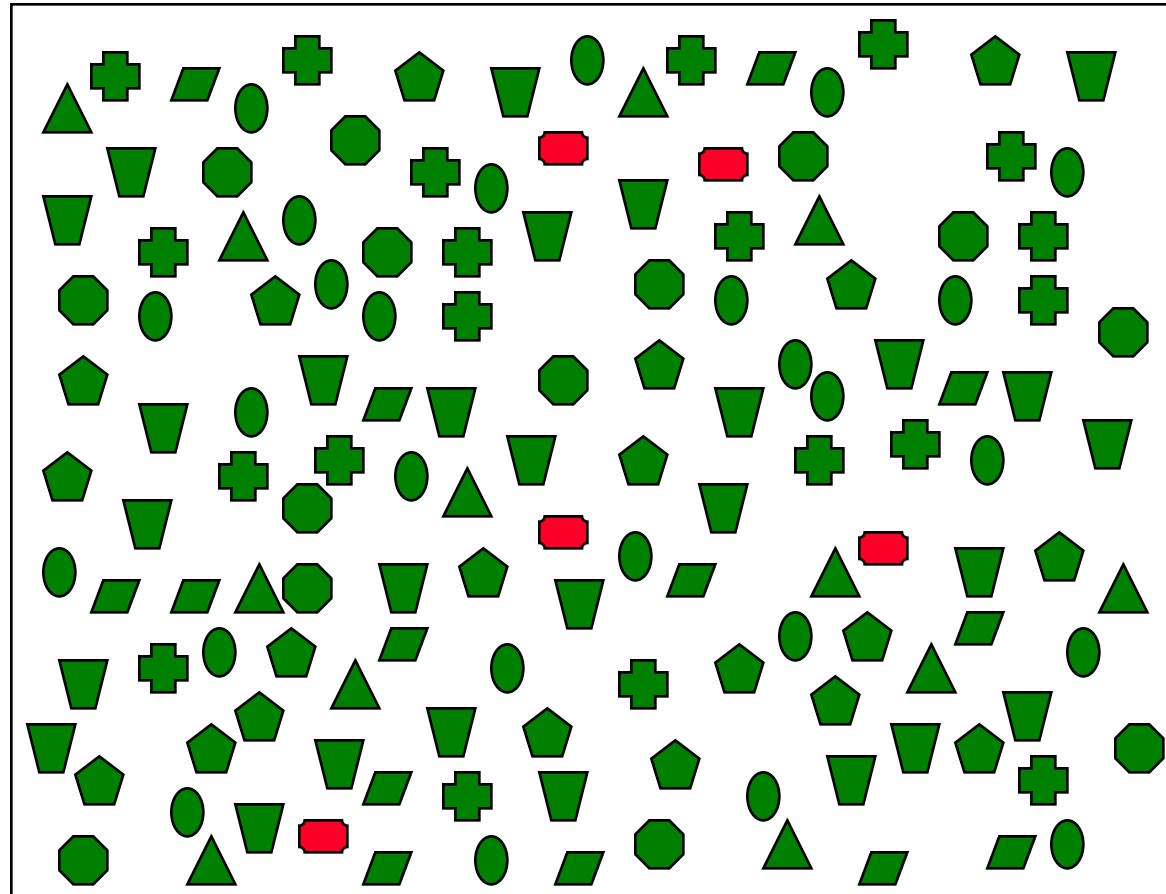
 **order**

 >  >  >  >  >  >  > 

Shape

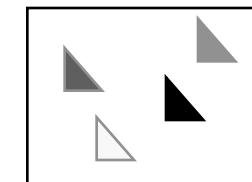
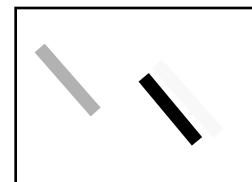
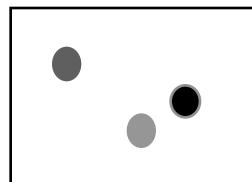


Shape

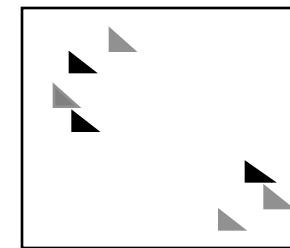
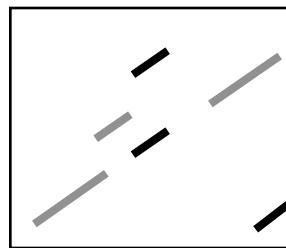
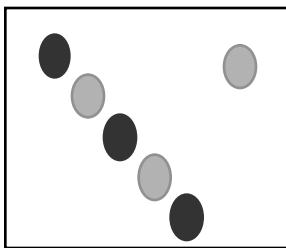


Visual Variable: Value

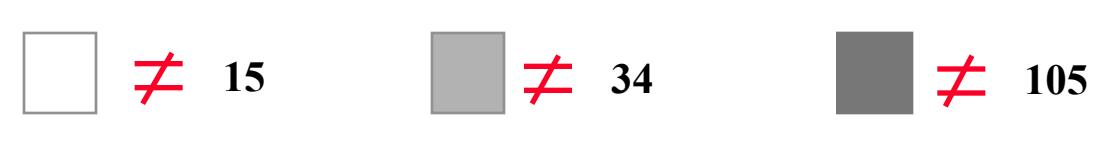
✓ selective



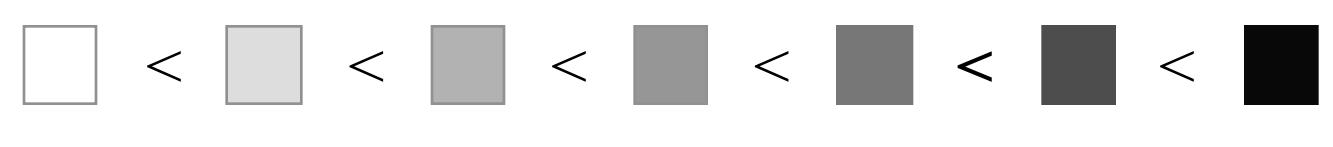
✓ associative



✗ quantitative

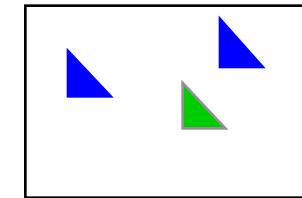
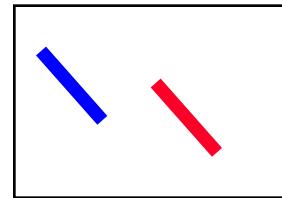
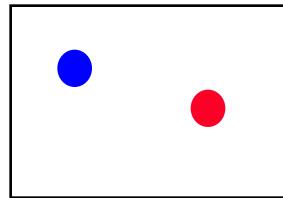


✓ order

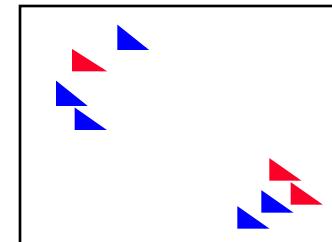
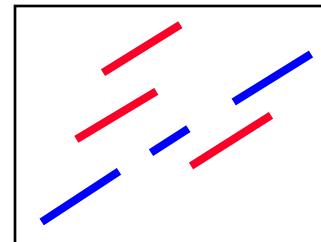
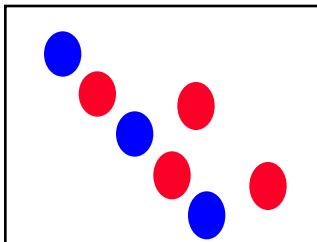


Visual Variable: Color

✓ selective



✓ associative



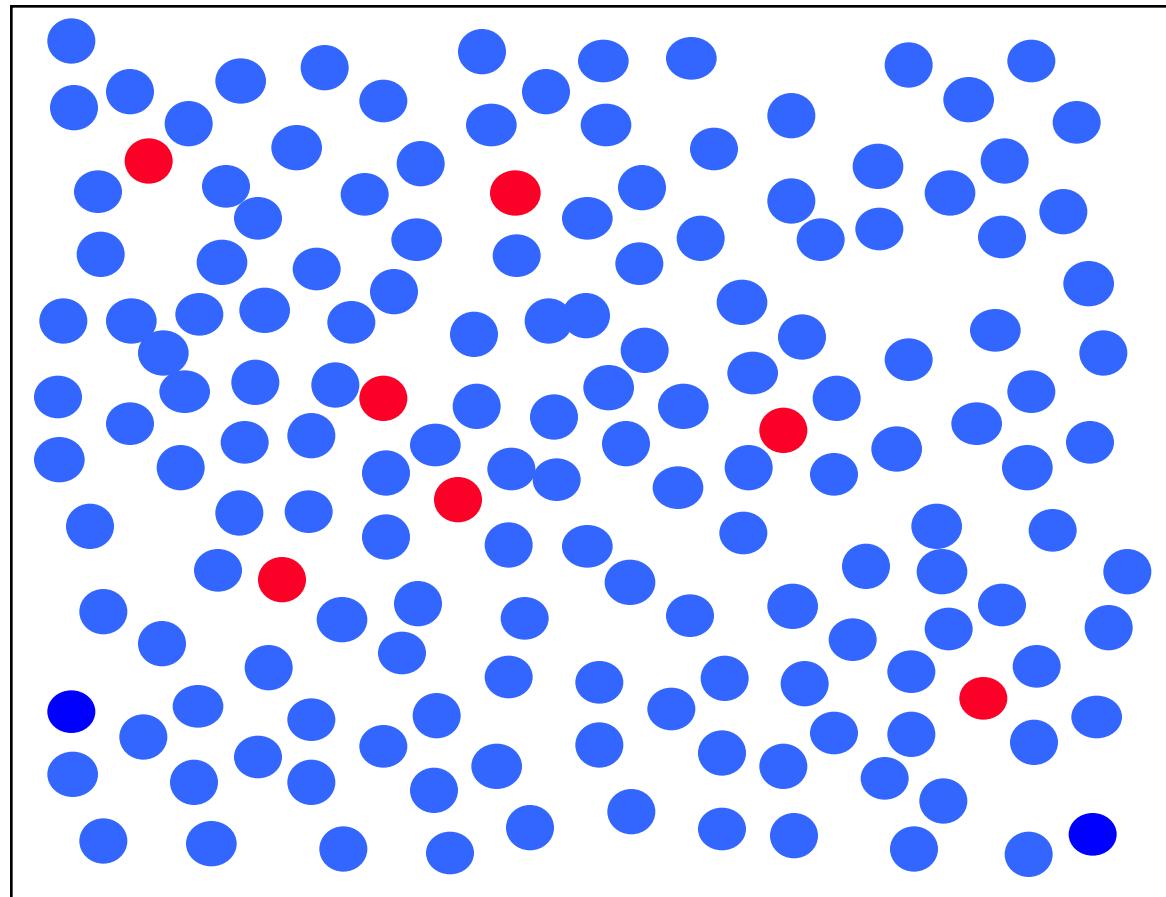
✗ quantitative



✗ order



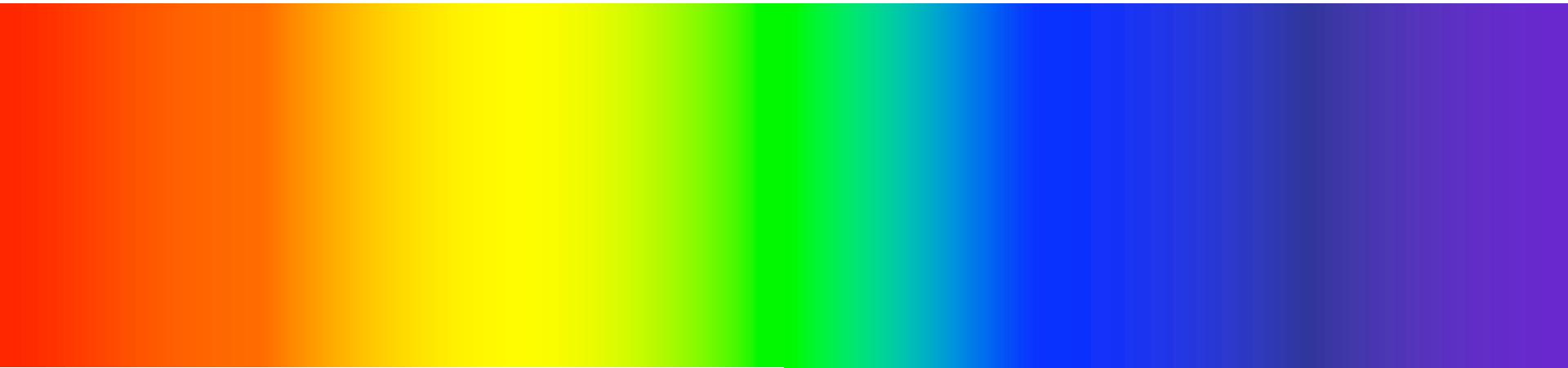
Color

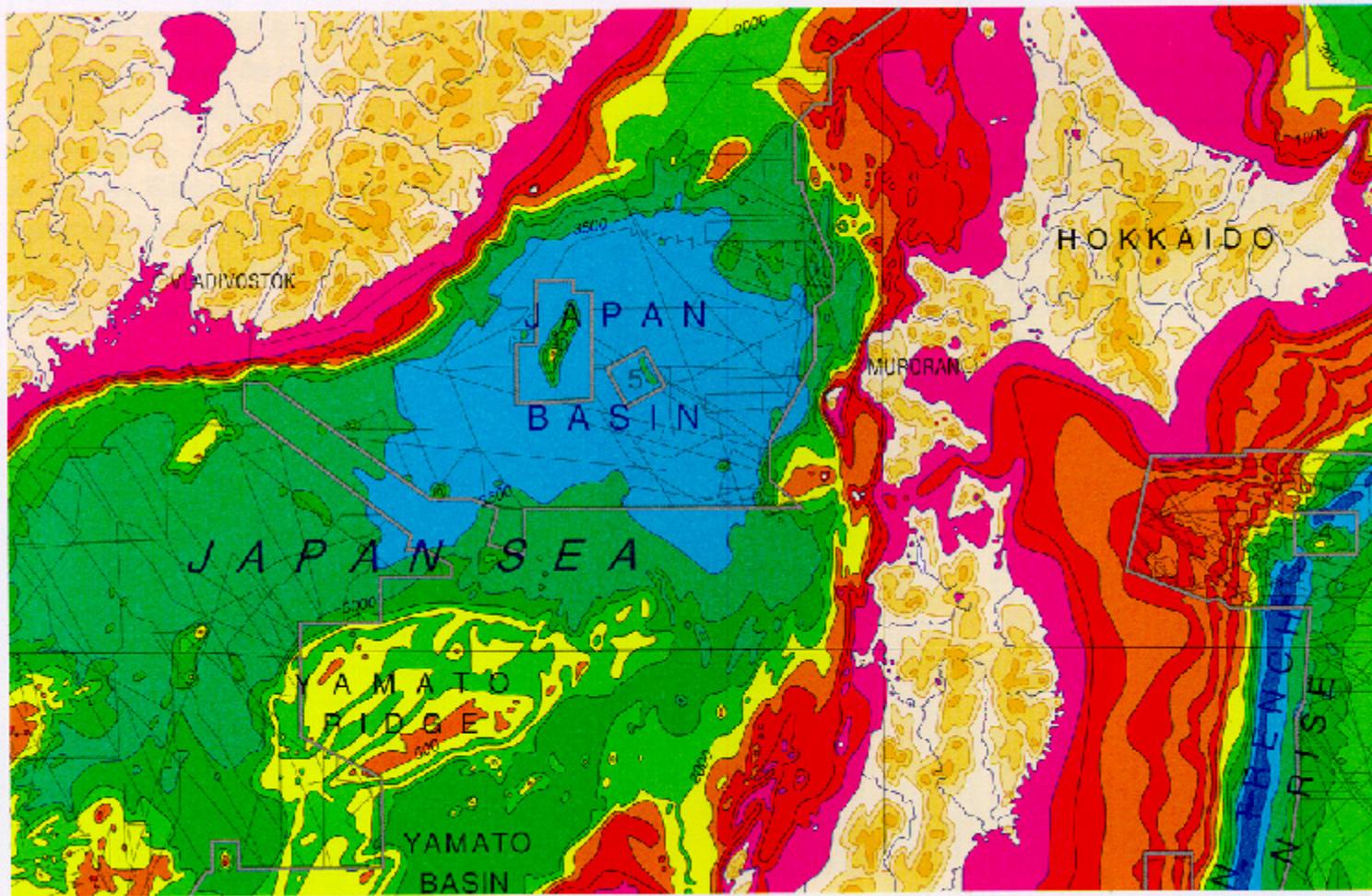
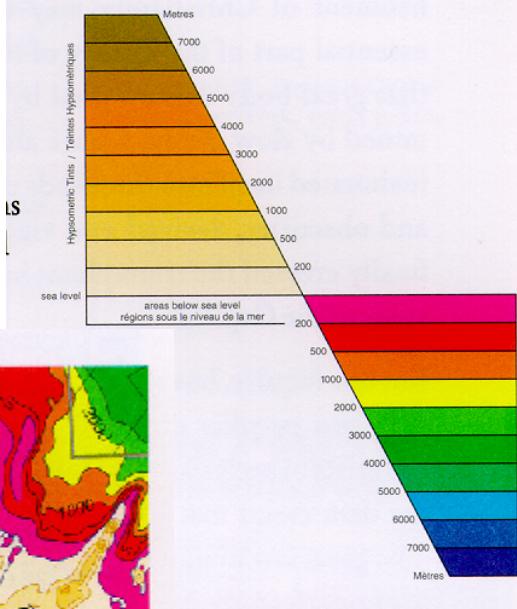


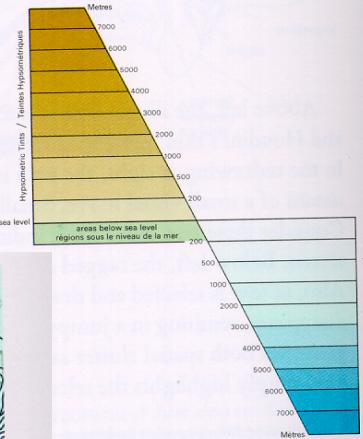
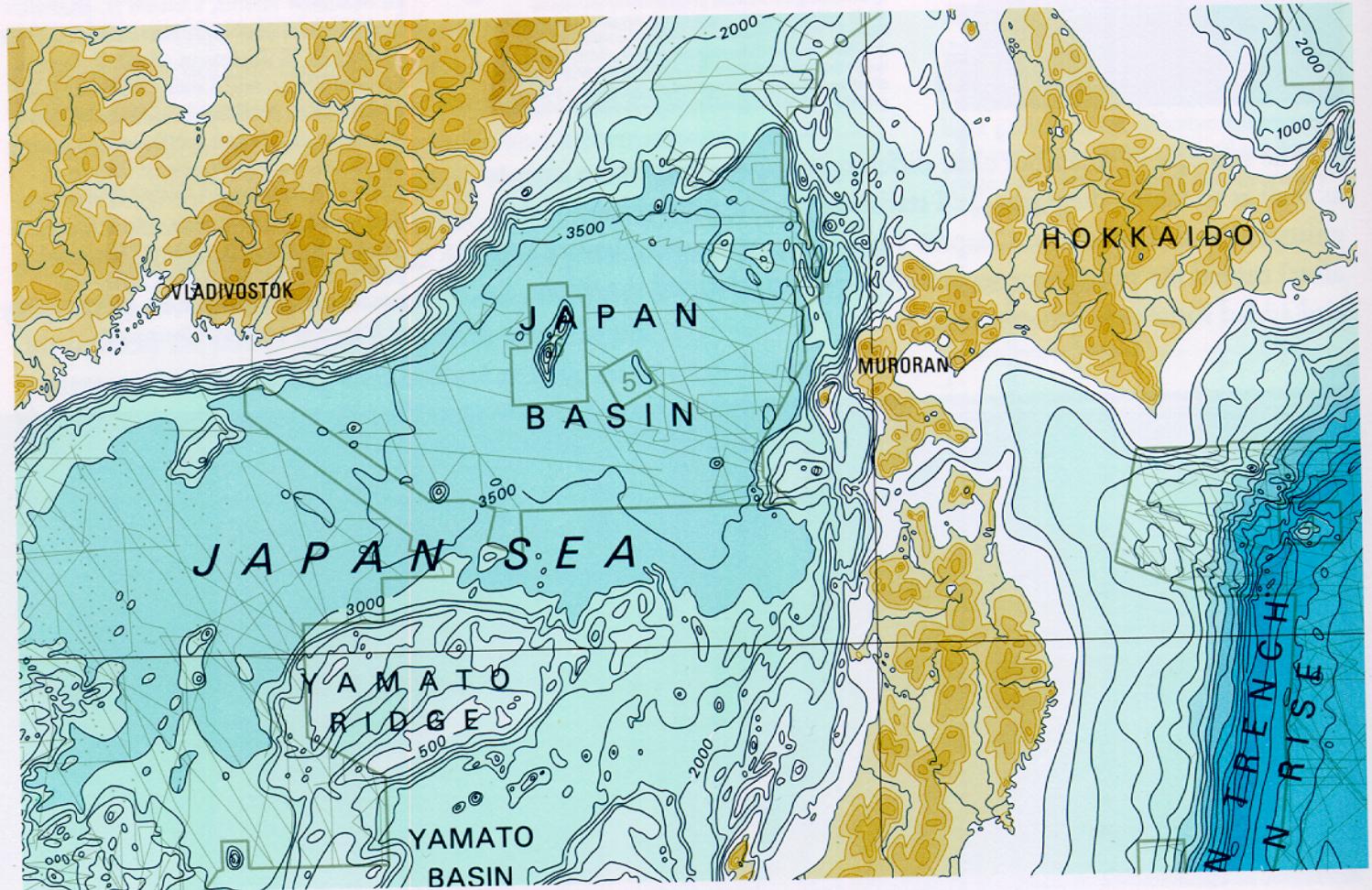
Encoding

Common (bad) advice says use a rainbow scale

- Marcus, Murch, Healey
- problems with rainbows





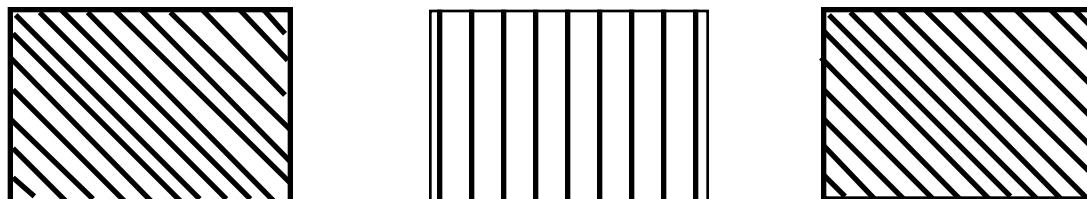


Visual Variable: Orientation

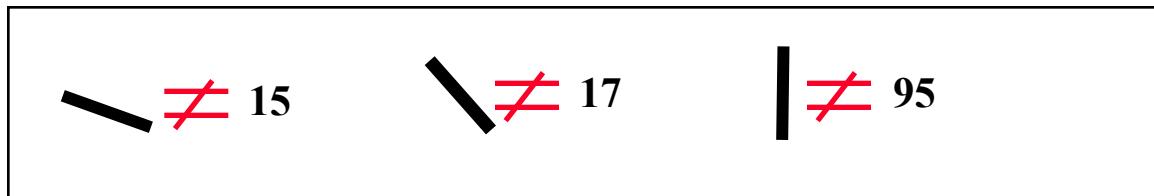
✓ selective



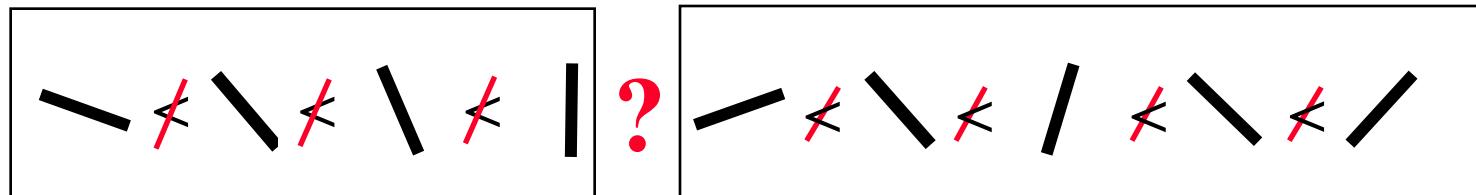
✓ associative



✗ quantitative



✗ order



Visual Variable: Texture

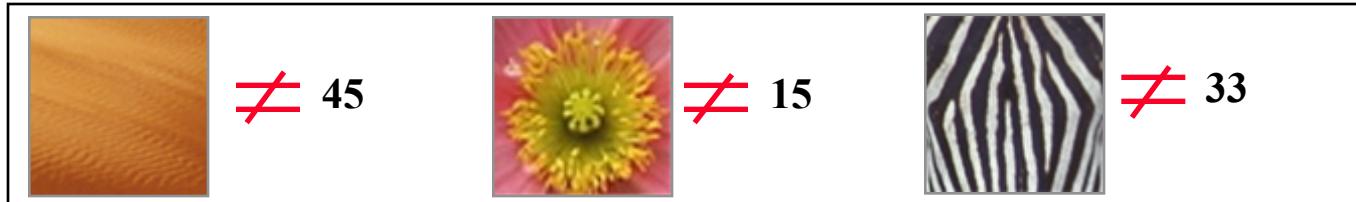
✓ selective



✓ associative



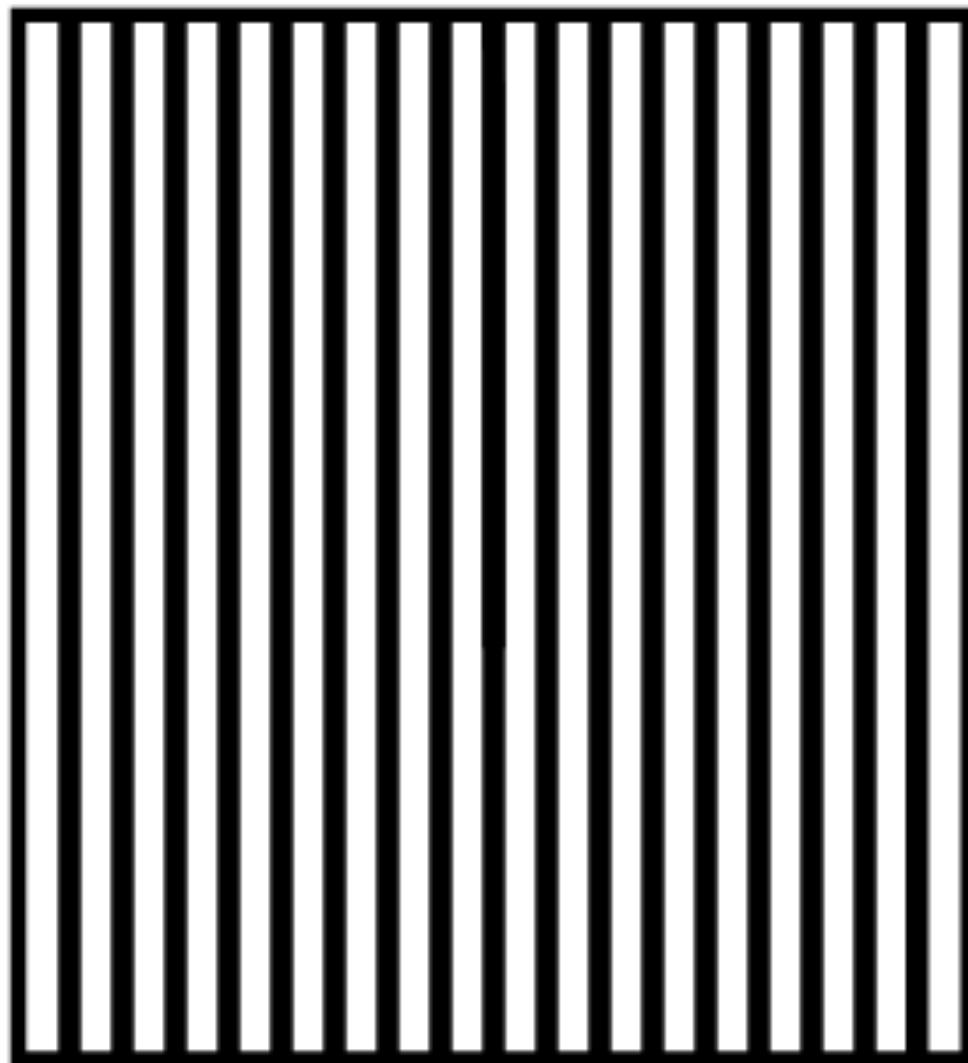
✗ quantitative

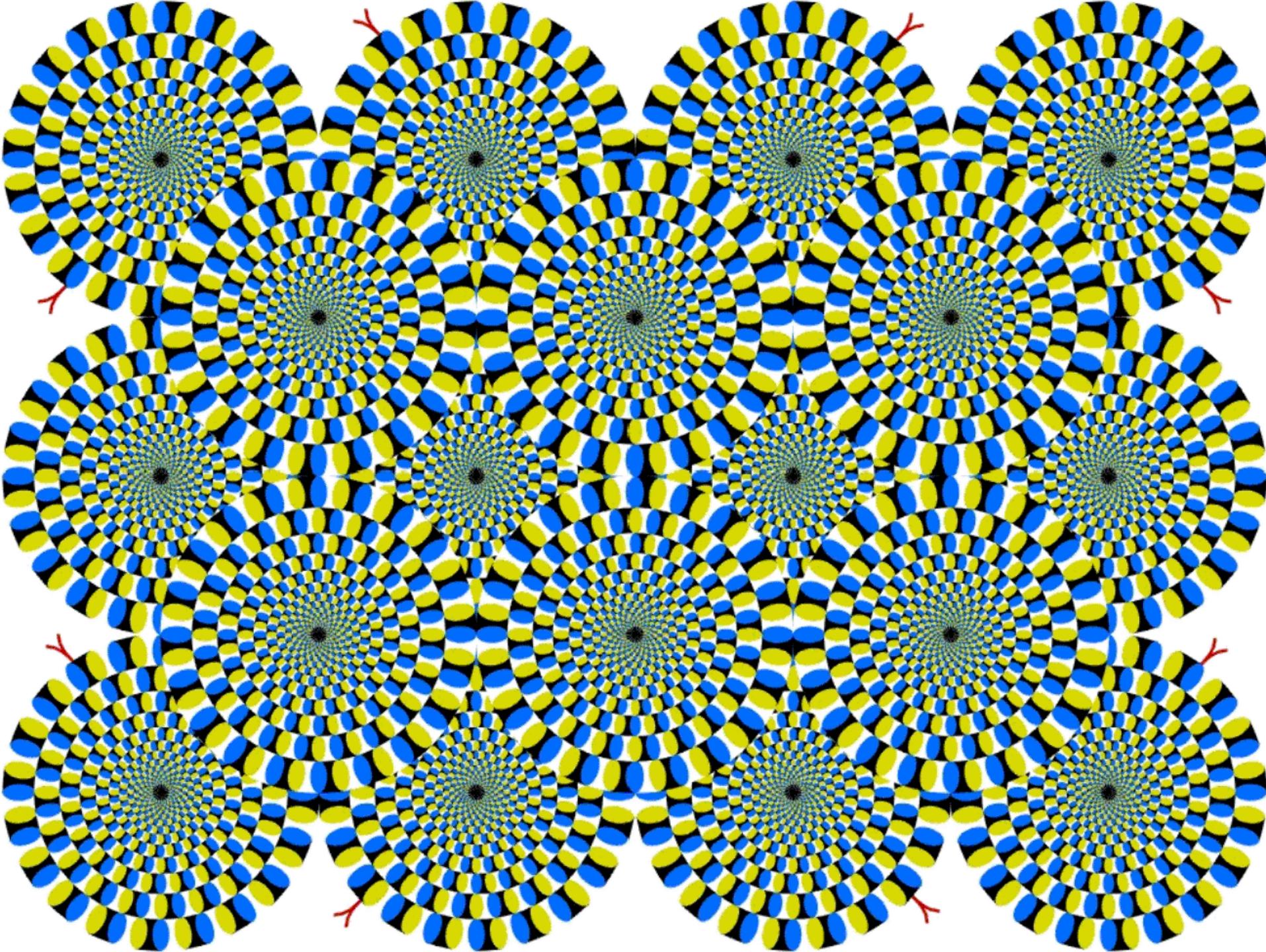


✗ order



Texture: Vibratory Effects





Visual Variable: Motion

✓ **selective** - motion is one of our most powerful attention grabbers

✓ **associative** – objects moving in unison groups them effectively

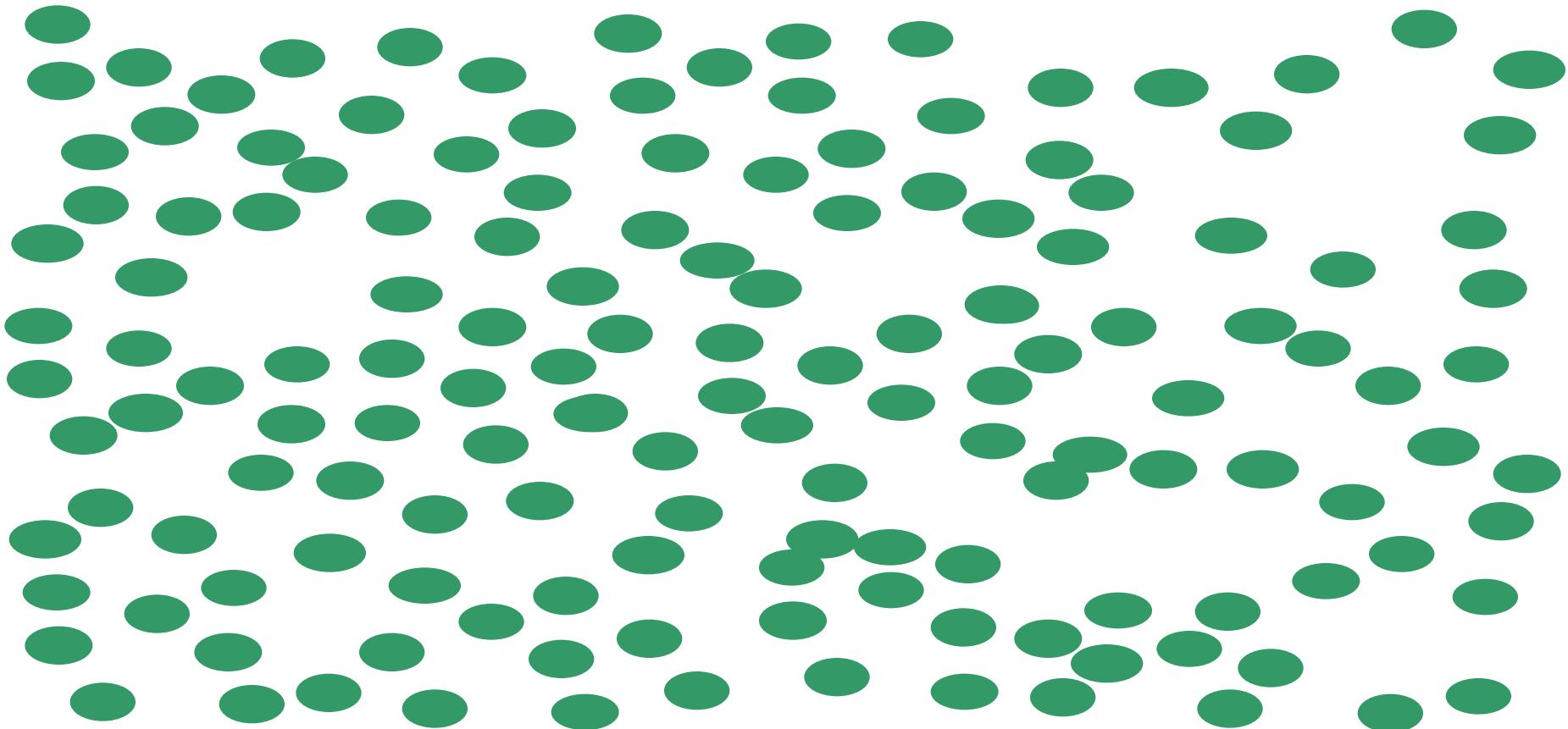


quantitative - subjective perception



order

Motion

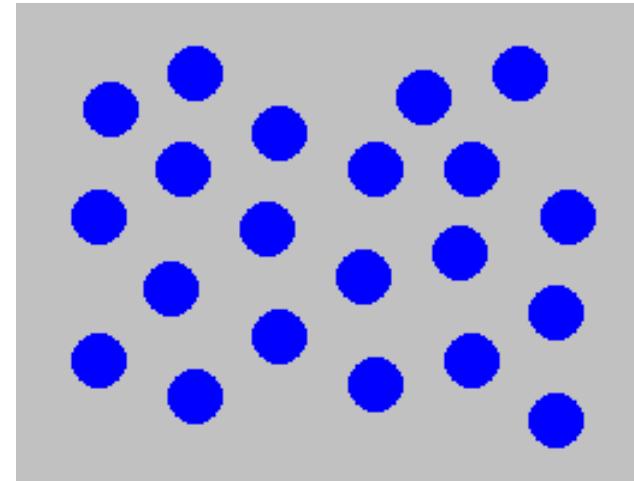
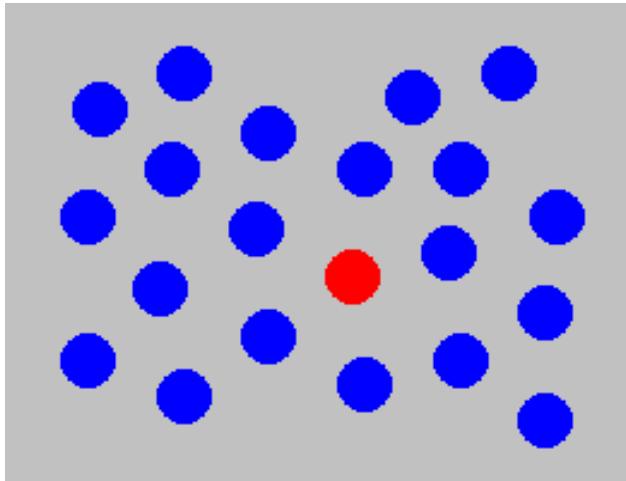


What is Pre-attentive Processing?

- Refers to cognitive operations that can be performed prior to focusing attention on any particular region of an image
- Estimation based on viewing experiments:
<200-250 ms qualifies as pre-attentive

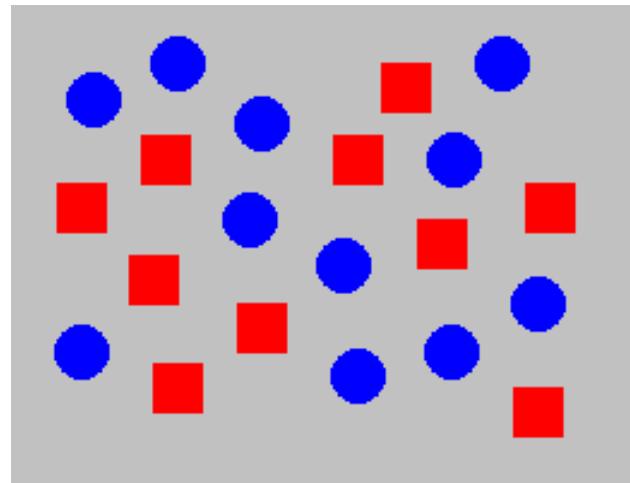
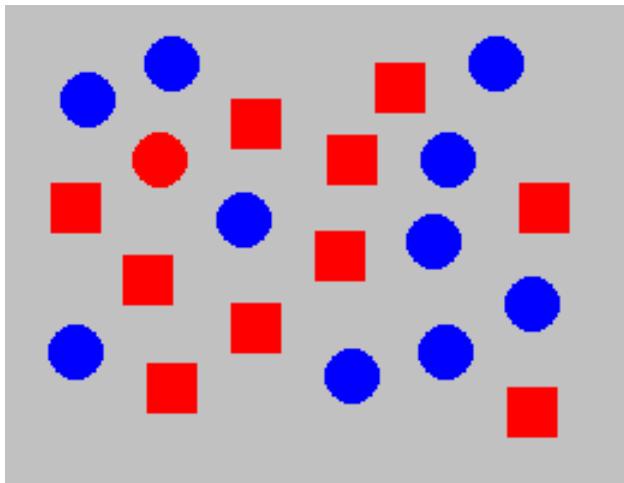
Pre-attentive Processing

Target has a unique feature (color) from the distractors. Hence it can be detected pre-attentively.



Pre-attentive Processing

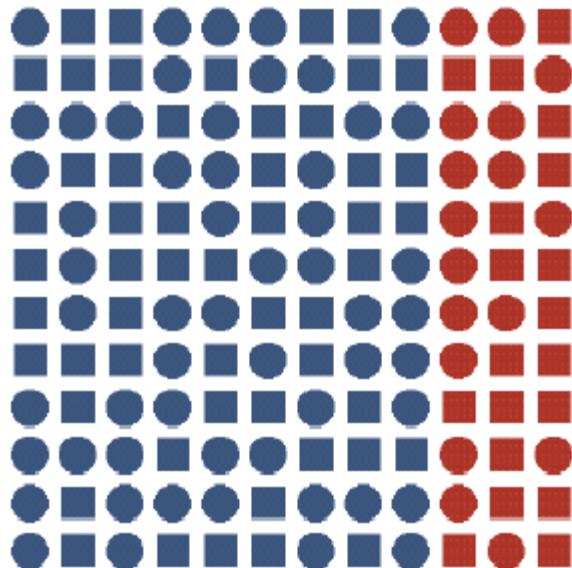
Conjunction of features: No unique feature distinct from its distracters. Hence difficult to detect.



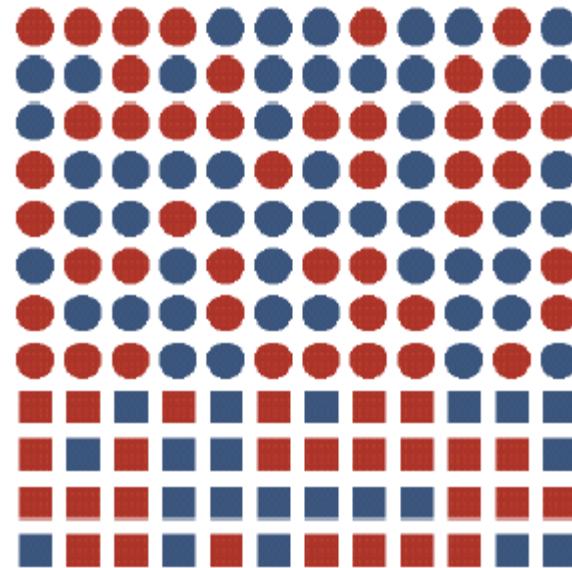
Pre-attentive Processing

Example: Hue Vs Form

Feature Interference: Variation of form did not interfere with hue segregation. Varying hue within a display region interfered with boundary detection based on form.



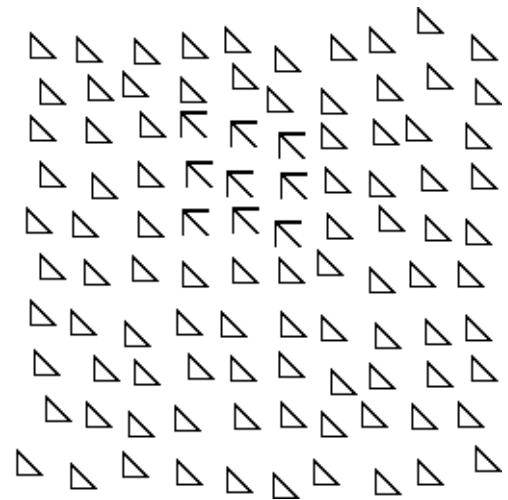
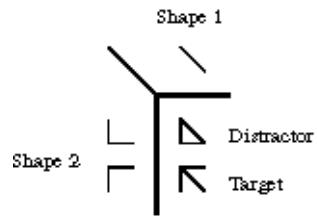
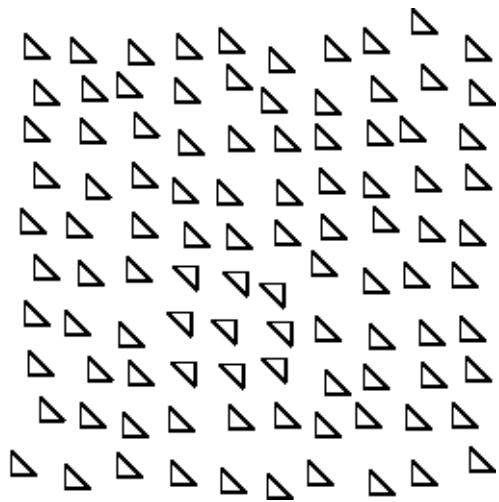
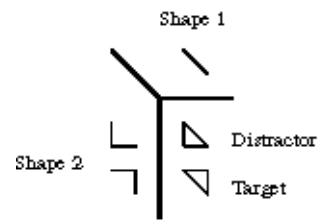
(a)



(b)

Emergent Features

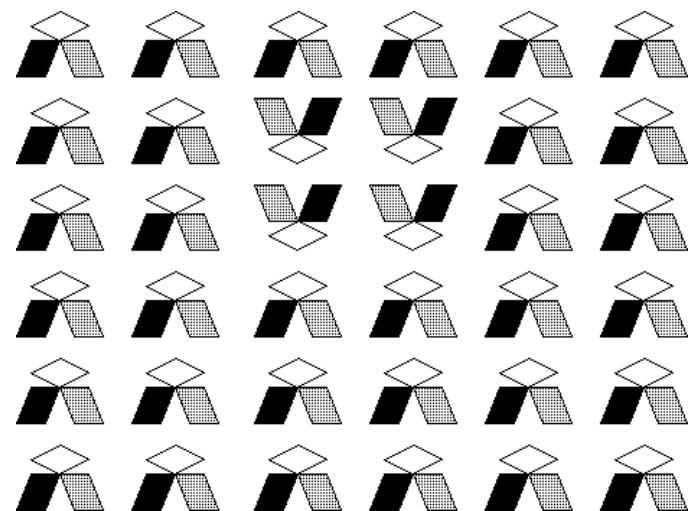
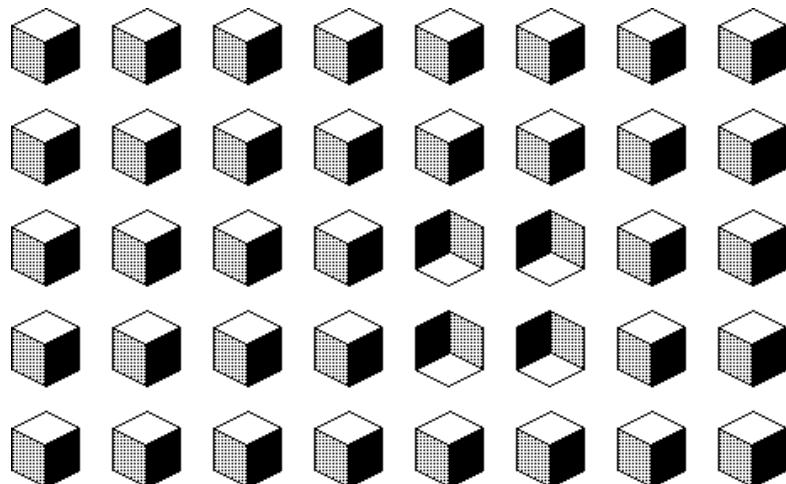
- Target in (a) contains no unique feature.
- Target in (b) contains non-closure as unique feature.



2D or 3D?

When the cubes appear "three-dimensional", the 2x2 group with a different orientation is pre-attentively detected

When three-dimensional cubes are removed, the unique 2x2 group cannot be pre-attentively detected.



Chernoff Faces

Use faces with different expressions to represent multidimensional data

Each data value in a multidimensional data element controls an individual facial characteristic

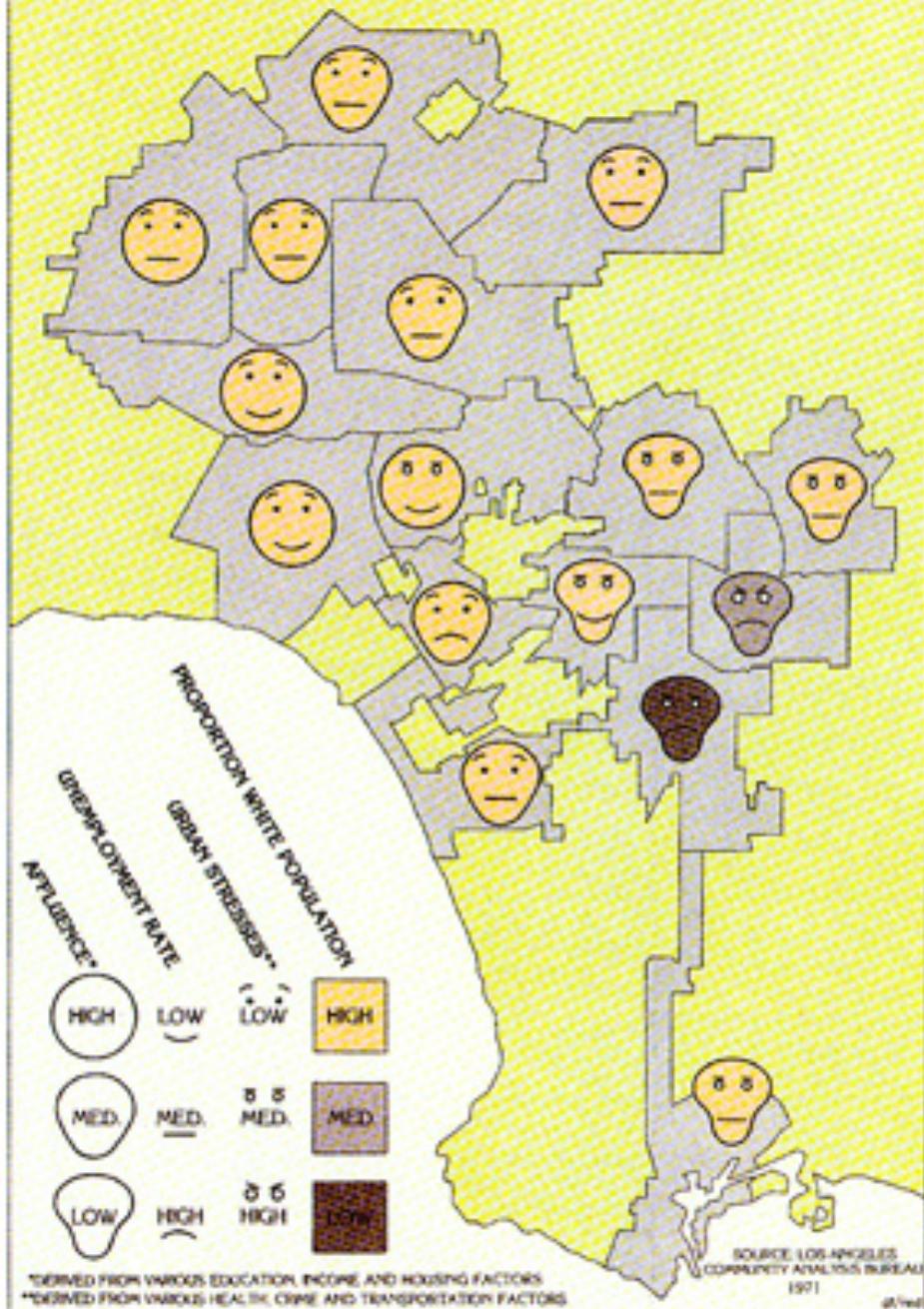
Examples of these characteristics include the nose, eyes, eyebrows, mouth, and jowls

Can support data with up to eighteen dimensions

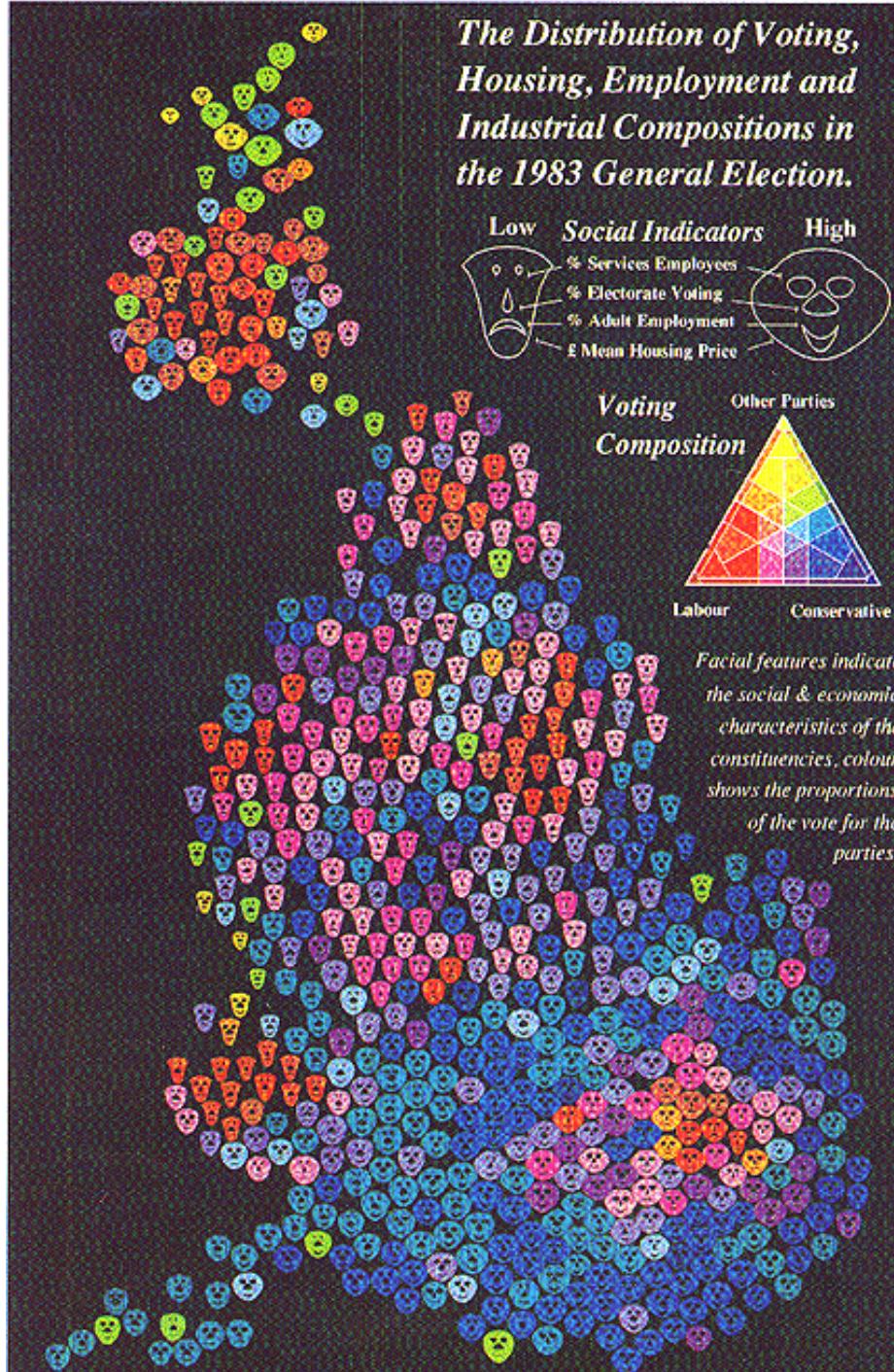
Groupings in coherent data will be drawn as groups of icons with similar facial expressions



Life in Los Angeles



The Distribution of Voting, Housing, Employment and Industrial Compositions in the 1983 General Election.



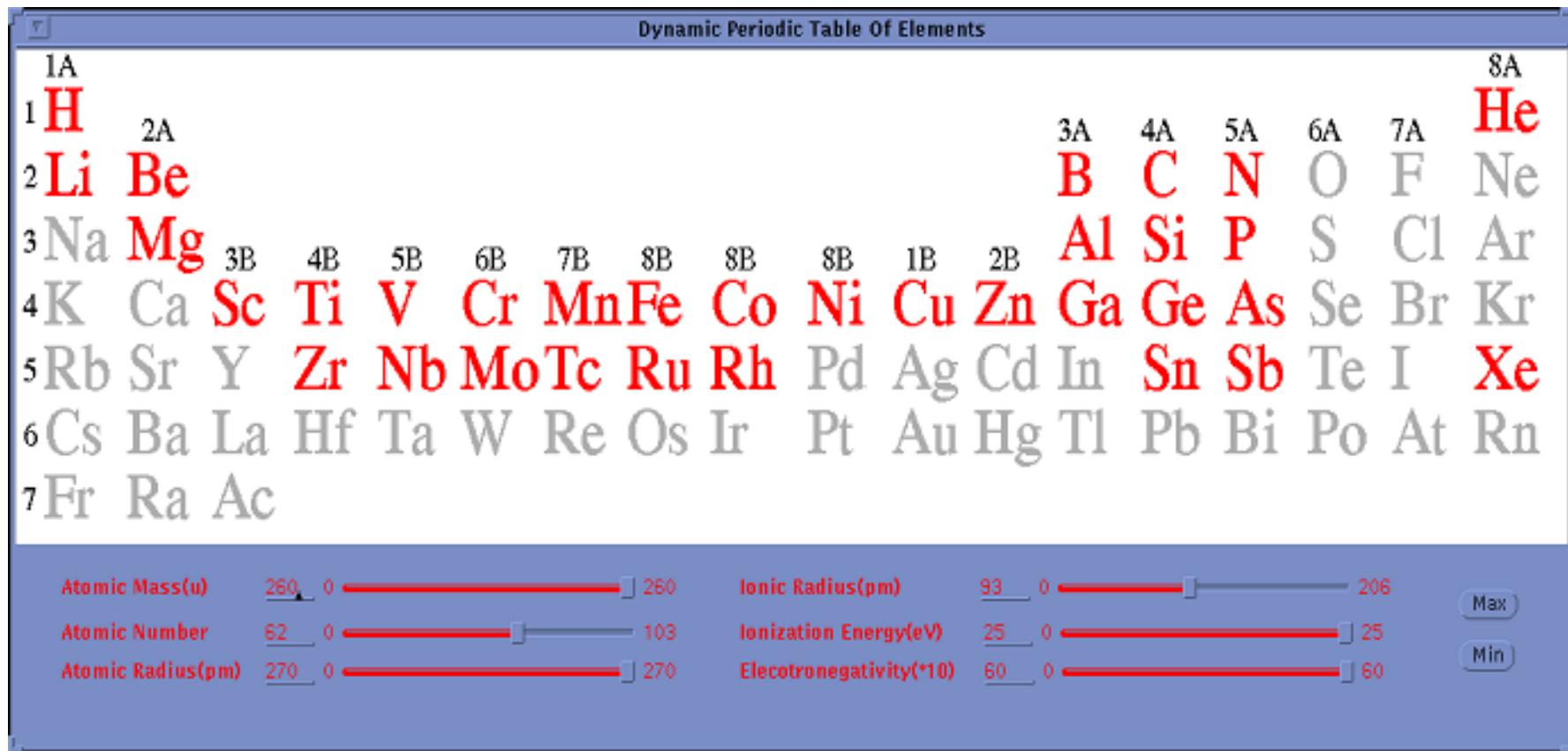
Dynamic Queries

**Selecting value ranges of variables via controls
with real time feedback in the display**

Principles:

- Visual presentation of query's components
- Visual presentation of results
- Rapid, incremental, and reversible control
- Selection by pointing, not typing
- Immediate and continuous feedback
- Support browsing
- Details on demand

Examples



Periodic Table of the Elements

Adjust properties with sliders on the bottom to highlight matching elements.

MoodPlay Visual Music Recommendations: Live Study

<http://bit.ly/1XPSGot>