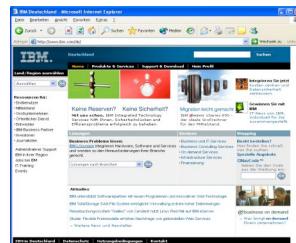


## Structure

- Chapter 1:  
HCI and the WWW



- Chapter 2:  
Mobile and Ubiquitous User Interfaces



- Chapter 3:  
Information Visualization



## 3 Information Visualization

### 3.1 Motivation and Examples

### 3.2 Basics of Human Perception

### 3.3 Principles and Terminology

### 3.4 Standard Techniques for Visualization

#### Literature:

- Marti Hearst
  - <http://bailando.sims.berkeley.edu/infovis.html>
  - <http://bailando.sims.berkeley.edu/talks/chi03-tutorial.ppt>
- Margret-Anne Storey
  - <http://www.csrvic.ca/~mstorey/>
  - [http://www.csrvic.ca/~mstorey/teaching/infovis/course\\_notes/introduction.pdf](http://www.csrvic.ca/~mstorey/teaching/infovis/course_notes/introduction.pdf)
- Ben Shneiderman
  - <http://www.cs.ubc.ca/~tmm/courses/cpsc533c-03-spr/readings/shneiderman96eyes.pdf>

*“Graphical excellence is that which gives to the viewer the greatest number of ideas in the shortest time with the least ink in the smallest space.”*

-- Edward R. Tufte  
(1942–)



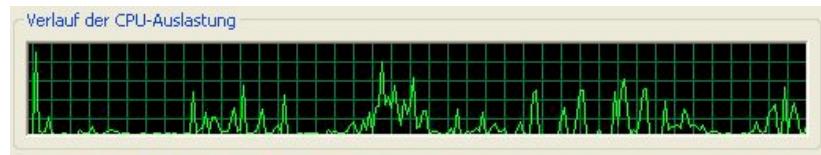
## Representation

- What is a good visual Representation?
  - Capture and present the essential
  - Deliberately hide irrelevant parts
  - Appropriate for the recipient and his/her abilities
  - Understandable and interpretable by the recipient
  - Appropriate for the task
- “Solving a problem simply means representing it so as to make the solution transparent” (Simon, 1981)
- Allow people to look at the presentation and draw the “right” conclusions!

## Representations

Physikalischer Speicher (KB)	
Insgesamt	514544
Verfügbar	177396
Systemcache	204792

- Figures / numbers
- Numbers in bar graph
- Plot with history



## How to Read Representations

- Read the plain facts
- Compare representations (visual calculations)
- Identify patterns
- Make interpretations
- Can be enhanced by active diagrams
  - Allow interactive manipulation

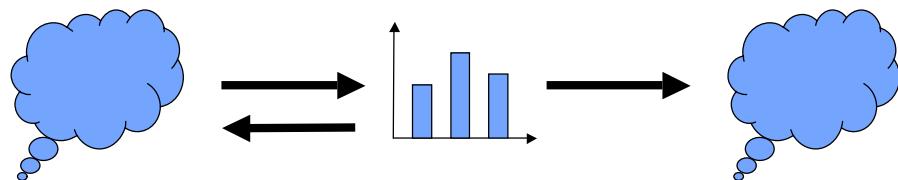
## External Aids for Thinking

*The power of the unaided mind is highly overrated. Without external aids, memory, thought, and reasoning are all constrained. But human intelligence is highly flexible and adaptive, superb at inventing procedures and objects that overcome its own limits. The real powers come from devising external aids that enhance cognitive abilities. How have we increased memory, thought, and reasoning? By the inventions of external aids: It is things that make us smart. (Norman, 1993)*

- External cognition
  - Internal and external representation and processing weave together in thought
- External cognitive aids can enhance cognition
- An important class of external cognitive aids that make us smart are graphical inventions
  - Charts for navigation
  - Diagrams

## Use of Visual Representations

- Pictures and diagrams are used to communicate existing ideas and thoughts
- Graphical representations can help in developing and formulating ideas and thoughts
- Using visual representations “to think”



## Information – to Visualize

- What is “Information”?
  - Entities, concepts, things, items that may not have a direct physical correspondence
  - Information is often abstract
- Large sets of data and information
  - Great amount of data
  - Information is generated in many processes
- To visualize: to form a mental image or vision of ...
- To visualize: to imagine or remember as if actually seeing.  
(American Heritage dictionary, Concise Oxford dictionary)

## What is Information Visualization?

- The use of computer-supported, interactive visual representations of data to amplify cognition.  
(Card, Mackinlay, Shneiderman '98)
- “Transformation of the symbolic into the geometric”  
(McCormick et al., 1987)
- “... augmenting ... natural intelligence in the best possible way, ... finding the artificial memory that best supports our natural means of perception.”  
(Bertin, 1983)
- “The depiction of information using spatial or graphical representations, to facilitate comparison, pattern recognition, change detection, and other cognitive skills that make use of the visual system.”  
(Hearst, 2003, CHI-Tutorial)
- “The purpose of visualization is insight, not pictures”  
(Hearst)

## Definition by Shneiderman

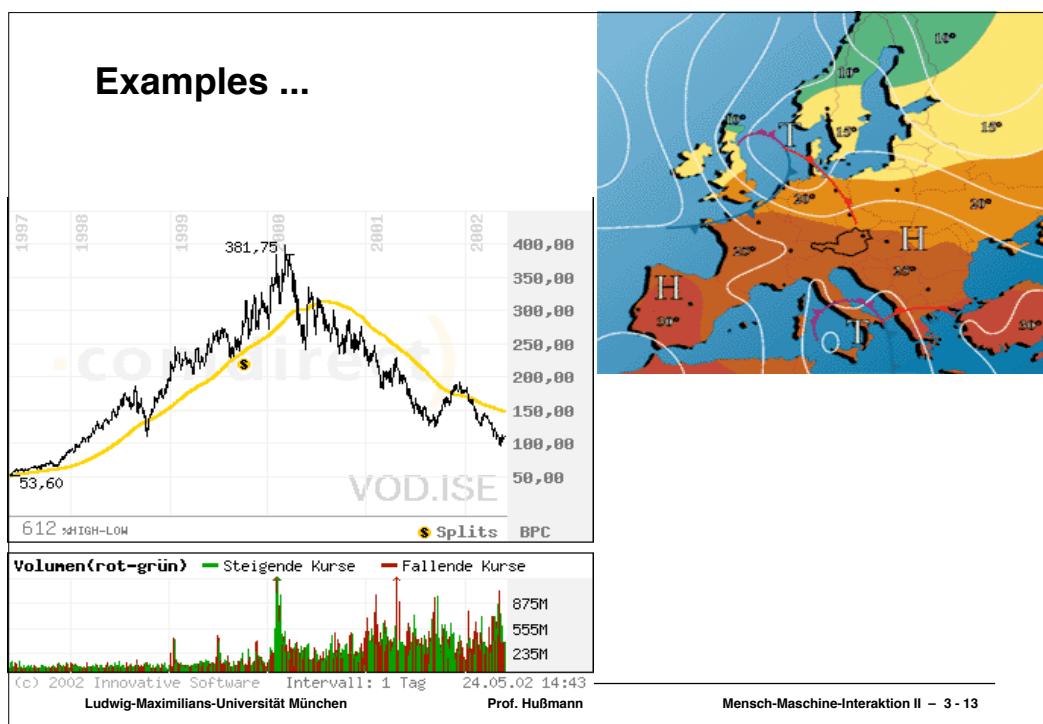


- Compact graphical presentation and
  - user interface for
  - manipulating large numbers of items ( $10^2 - 10^6$ ),
  - possibly extracted from far larger datasets.
- Enables users to make
  - discoveries,
  - decisions, or
  - explanations
- about
  - patterns (trend, cluster, gap, outlier...),
  - groups of items, or
  - individual items.

## Tasks Supported by Information Visualization

- Search
  - Finding a specific information in a data set
- Browse
  - survey, inspect, look for interesting information
- Analysis
  - Comparison-Difference, find outliers and extremes, spot patterns
- Many more...
  - Categorize, Associate
  - Locate, Rank
  - Identify, Reveal
  - Monitor, Maintain awareness

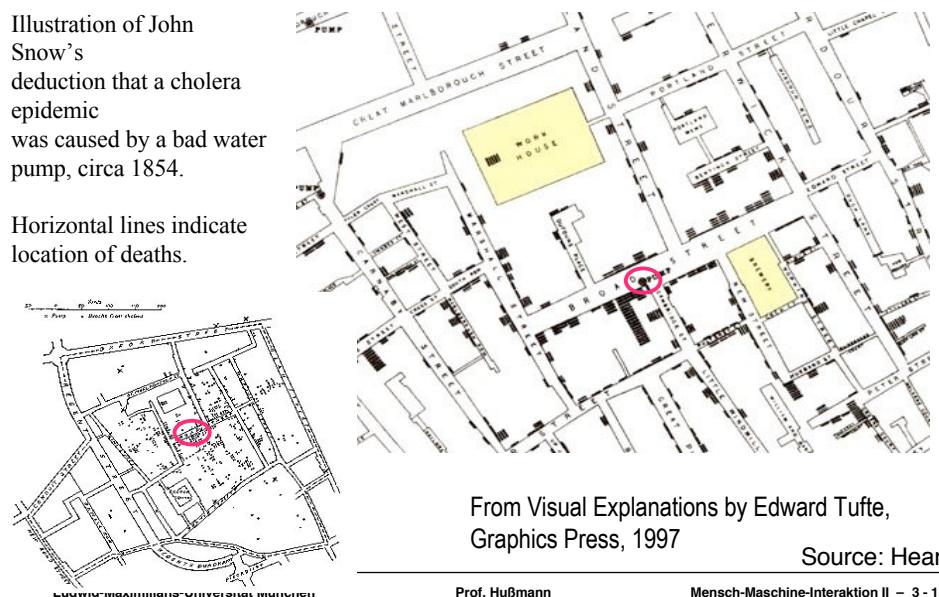
## Examples ...



## Visualization Success Story

Illustration of John Snow's deduction that a cholera epidemic was caused by a bad water pump, circa 1854.

Horizontal lines indicate location of deaths.



From Visual Explanations by Edward Tufte,  
Graphics Press, 1997

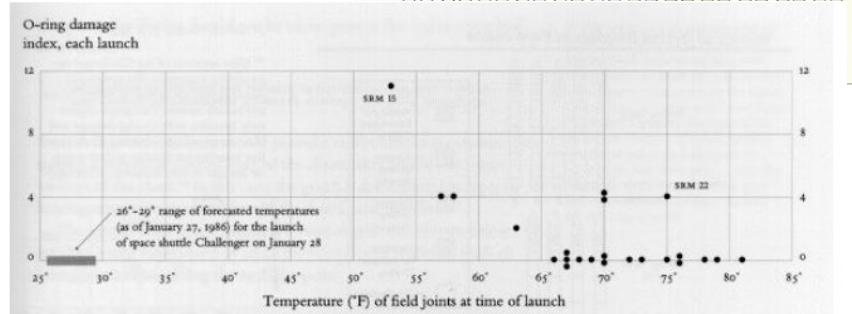
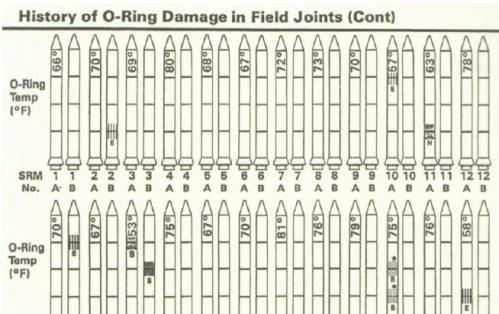
Source: Hearst

Prof. Hußmann

Mensch-Maschine-Interaktion II – 3 - 15

## Challenger Example

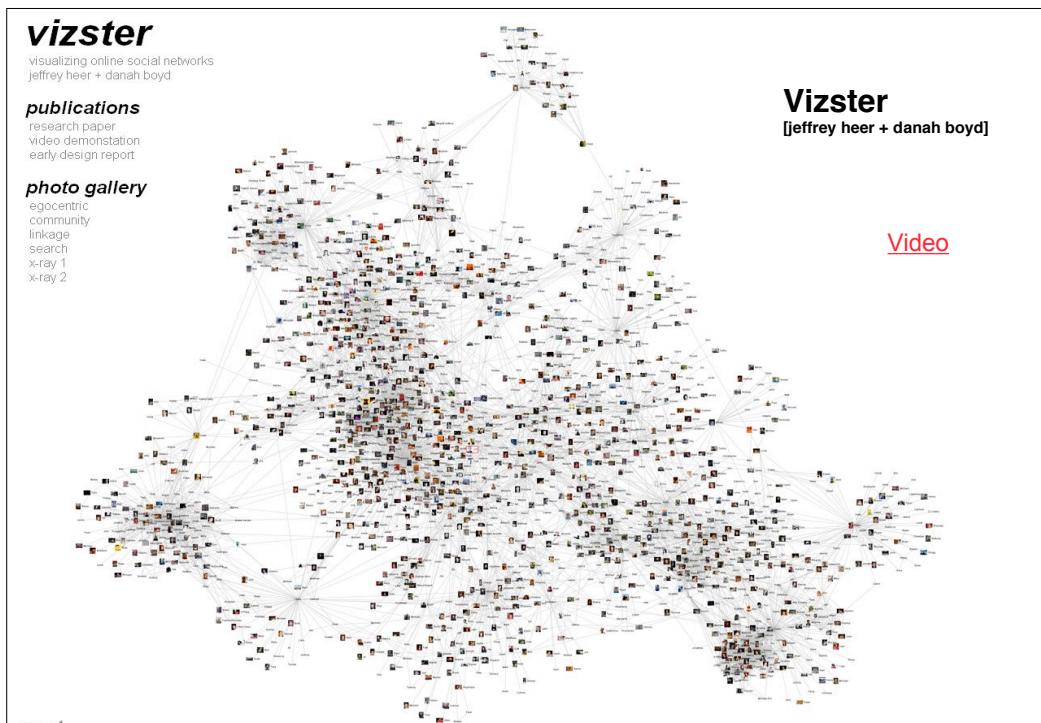
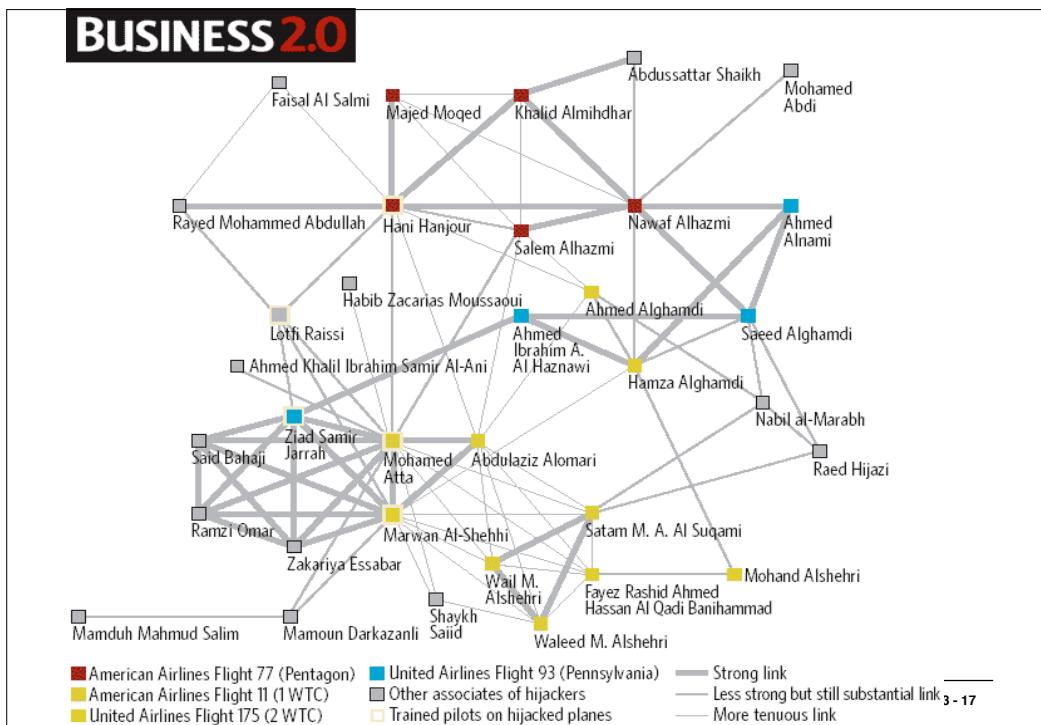
(Source: Storey)

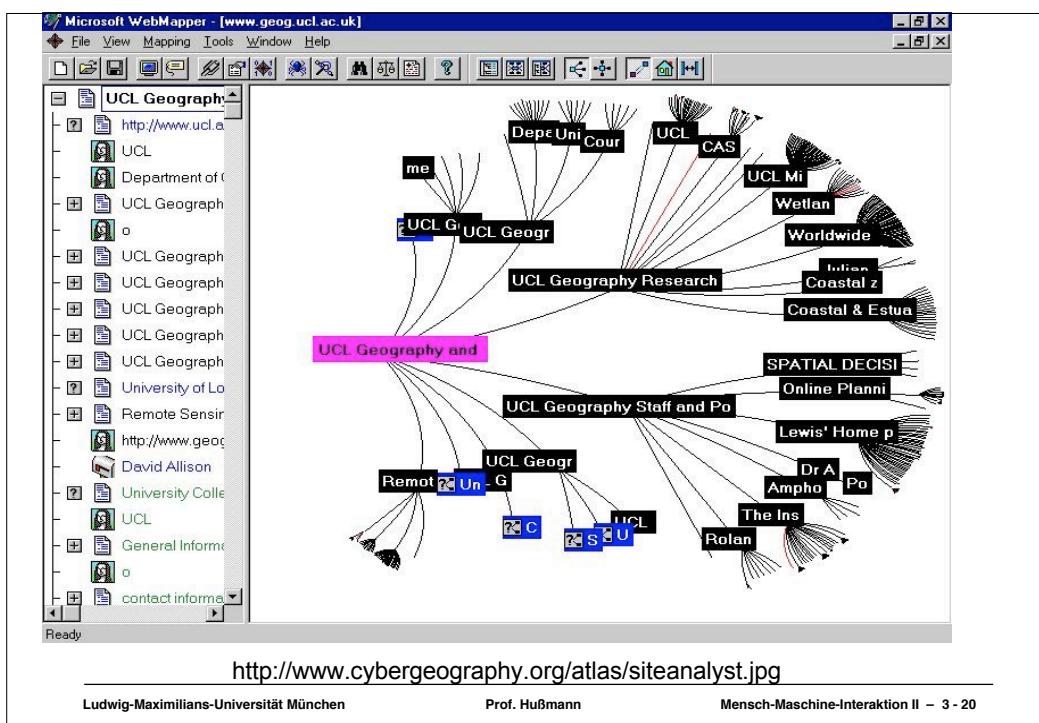
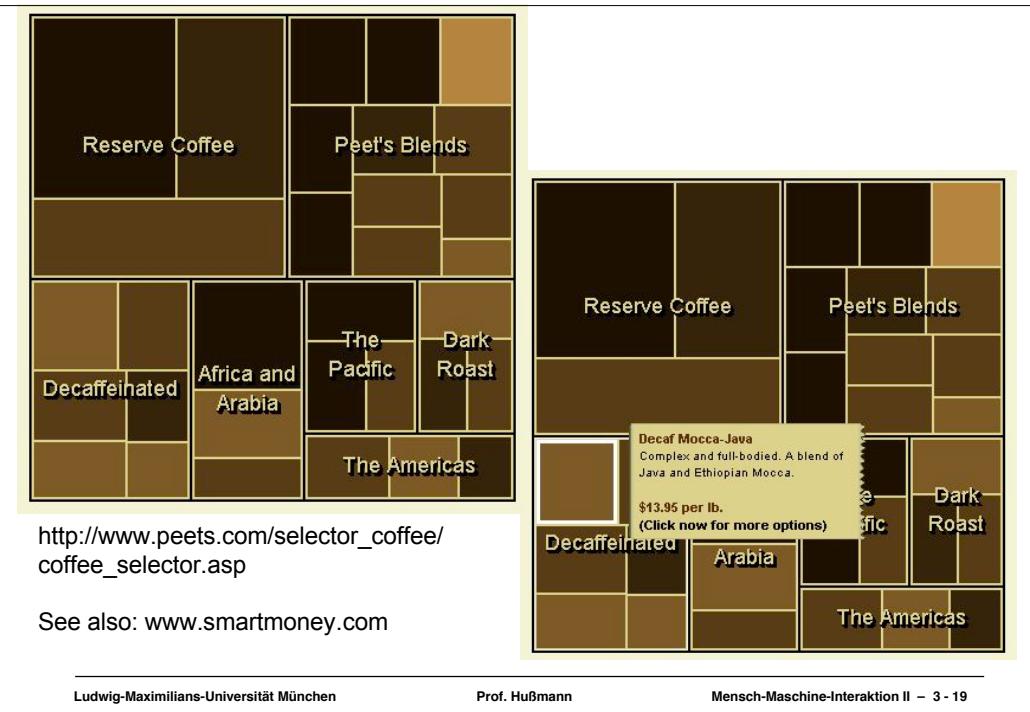


Ludwig-Maximilians-Universität München

Prof. Hußmann

Mensch-Maschine-Interaktion II – 3 - 16





**ImproViz [Snydal & Hearst, CHI 2005]**

## ALL BLUES

Written by Miles Davis; Recorded April 6, 1959 (Take 1), on the Columbia release "Kind of Blue".  
Improvisations by Miles Davis (trumpet), Julian "Cannonball" Adderley (alto sax) and John Coltrane (tenor sax)

**MELODIC LANDSCAPES**  
Each soloist played four choruses of the tune. Each soloist has 23 bar structures to analyze patterns of phrasing across choruses. Scales can be viewed in different ways, such as in a row in which multiple choruses are overlaid.

**HARMONIC PALETTES**  
The clusters of note heads below represent harmonic palettes. Each soloist's palette is his tendency to play particular notes over particular chords. The note heads in the clusters indicate that note was used.

**Empty noteheads represent notes that were not played in the previous measure but were heard in the player's cloud**

**Aggregations** (at bottom right): duration of notes played by a soloist

**ABOUT**  
Analysis & Visualization by Jon Crystal  
Based on Vassie's prior work (Rob Didur, Mark Gandy, Mark Davis and Jon Crystal)

**Noteheads**  
2 notes = 1 sec.  
 Each notehead icon shows how long the note was played. Noteheads with black dots are not the main tones of the chord.  
Noteheads:  
5 beats = 23 beats  
7 beats = 11 seconds

**Aggregations**  
Unfilled noteheads show tones of chords that were not played

**Noteheads**  
2 notes = 10 beats  
 Each notehead icon shows how long the note was played. Noteheads with black dots are not the main tones of the chord.  
Noteheads:  
5 beats = 23 beats  
7 beats = 11 seconds

**ALL BLUES**

Written by Miles Davis; Recorded April 6, 1959 (Take 1), on the Columbia release "Kind of Blue"  
Improvisations by Miles Davis (trumpet), Julian "Cannonball" Adderley (alto sax) and John Coltrane (tenor sax)

**MELODIC LANDSCAPES**  
Each soloist played four choruses of three measures each.  
Each soloist chose his track's 12 bar structure to reveal patterns of phrasing across choruses. Solos can be viewed individually or as a composite (one in which multiple choruses are overlaid).  
The solos have been transposed to concert key to facilitate comparison.

**HARMONIC PALETTES**  
The clusters of note heads below improvise on related harmonic palettes, but focus on particular notes over particular chords. The more notes in a cluster, the faster that note was used.

Empty noteheads represent harmonies that were present in the upper cloud that were not voiced by the soloist.

**AGGREGATIONS** (at bottom right)  
An aggregation is a distribution of notes into small groups by pitch.

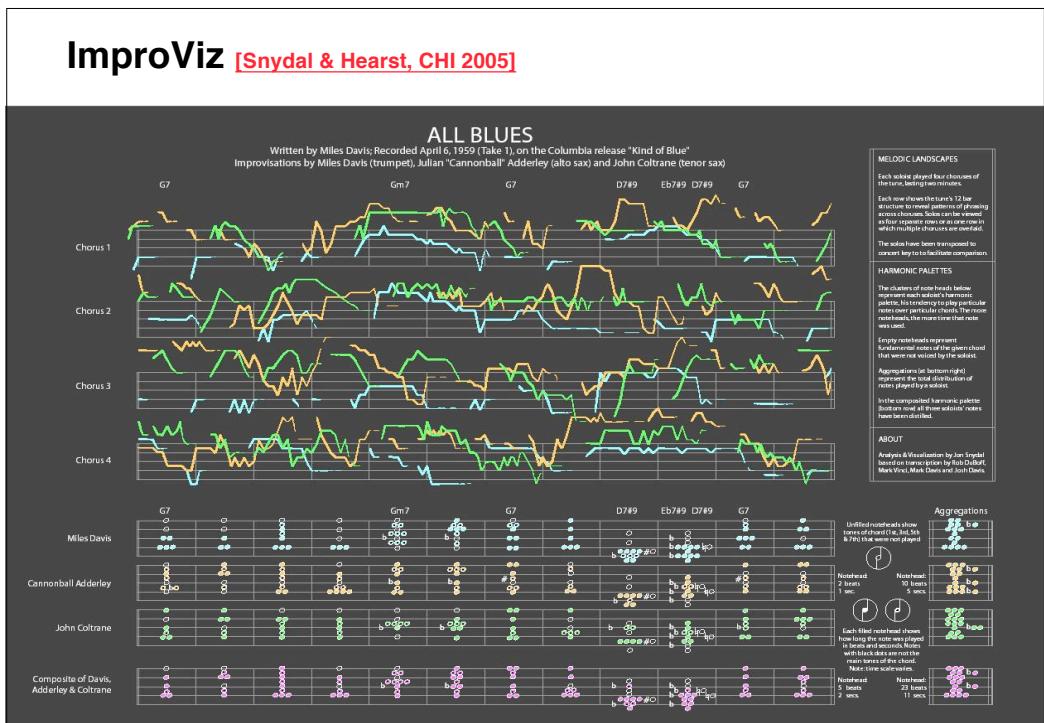
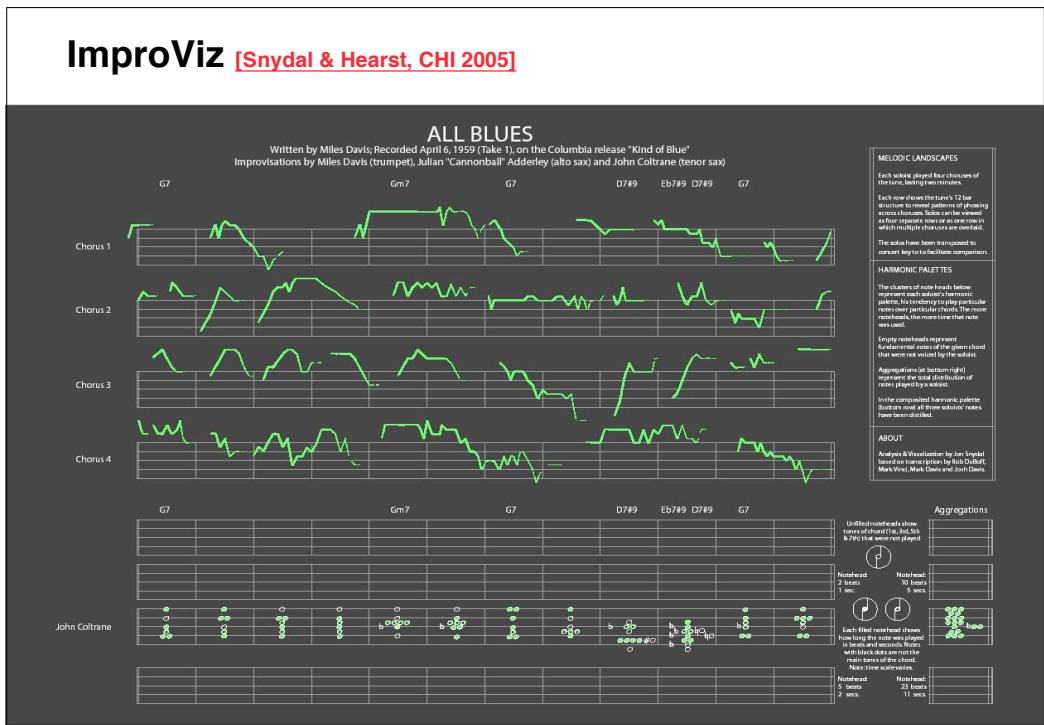
In the composed harmonic palette (bottom row), all three soloists' notes have been overlaid.

**ABOUT**  
Analysis & visualization by Jon Snydal based on transcriptions by Rob Daboff, Mark Erak, Miles Davis and Bob Charles.

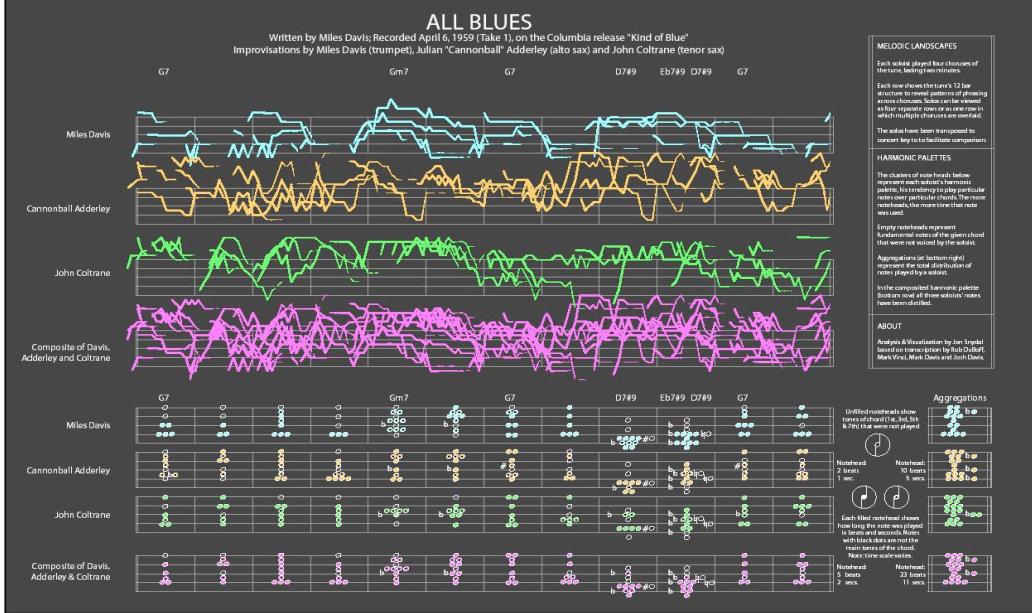
**Cannonball Adderley**

Unfilled noteheads show tones of chord (1st, 3rd, 5th & 7th) in eighth-note pairs.  
Notehead 2 beats  
Notehead 10 beats  
Each filled notehead shows how many eighth-note pairs are in beats and seconds. Notes with dots indicate the measure number for the note.

Notehead 5 beats  
Notehead 23 beats  
Notehead 11 seconds



## ImproViz [Snydal & Hearst, CHI 2005]

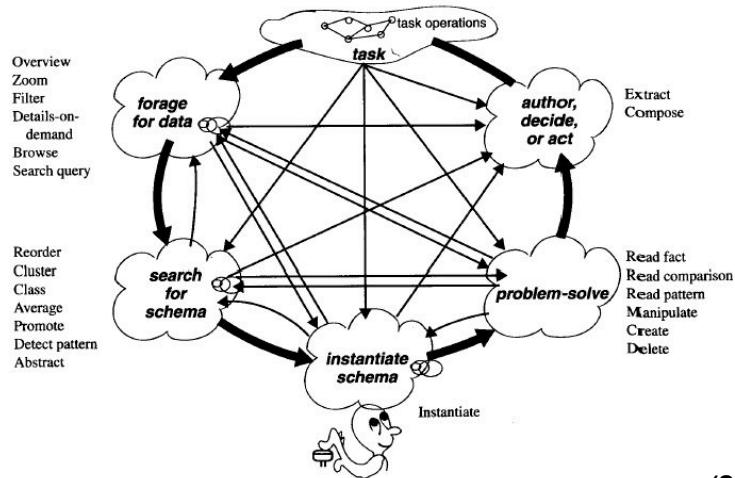


## Knowledge Crystallization

- Knowledge crystallization involves getting insight about data relative to some task
- Steps required in a Knowledge Crystallization task:
  - Information foraging/browsing (from repositories, people...)
  - Search for/build a schema (representation) – need to know what to include/omit
  - Instantiate schema with data
  - Problem solve to trade-off features
  - May have to search for a new schema..
  - Package the patterns found in some output product (i.e. a concise briefing of results)
- A visualization tool has to support or automate some of these steps, it is a cognitive aid during our process of schematization
- So we need data, a task and a schema



## Knowledge Crystallization (2)



(Storey, 2004)

FIGURE 1.15

Knowledge crystallization.

## Example – Air Fare (1)

**Change your search**

Departure airport: BOS (Boston)

Destination airport: YYJ (Victoria)

Departing: (DD/MM/YY) 6/1/2001

Returning: (DD/MM/YY) 13/11/2001

Airline: All Airlines

Nonstop flights only

**Start again** **Go**

**Boston, MA, United States (BOS-Logan Intl.) to Victoria, BC (YYJ-Victoria)**

Expert Picks

To build your own trip, first pick any departing flight

Sort by:  Lowest price    Shortest flights    Departure time    Arrival time

From C5753

7:45 AM Depart Boston (BOS)  
Arrive Victoria (YYJ) 12:35 PM  
Tue 6-Nov  
7hr 50min  
 Air Canada 763 / 6957 Connects to Vancouver (YVR)

From C5753

7:45 AM Depart Boston (BOS)  
Arrive Victoria (YYJ) 12:35 PM  
Tue 6-Nov  
8hr 50min  
 Air Canada 763 / 1613 Connects to Vancouver (YVR)

From C5753

4:00 PM Depart Boston (BOS)  
Arrive Victoria (YYJ) 19:20 PM  
Tue 6-Nov  
9hr 20min  
 Air Canada 307 / 129 / 1631 Connects to Montreal (YUL), Vancouver (YVR)

From C5753

4:00 PM Depart Boston (BOS)  
Arrive Victoria (YYJ) 19:30 PM  
Tue 6-Nov  
9hr 30min  
 Air Canada 307 / 129 / 1635 Connects to Montreal (YUL), Vancouver (YVR)

From C5768

7:00 AM Depart Boston (BOS)  
Arrive Victoria (YYJ) 13:5 PM  
Tue 6-Nov  
9hr 35min  
 Air Canada 001 / 132 / 1613 Connects to Toronto (YYZ), Vancouver (YVR)

From C5768

3:20 PM Depart Boston (BOS)  
Arrive Victoria (YYJ) 19:01 PM  
Tue 6-Nov  
9hr 41min  
 Air Canada 305 / 3953 Connects to Toronto (YYZ)

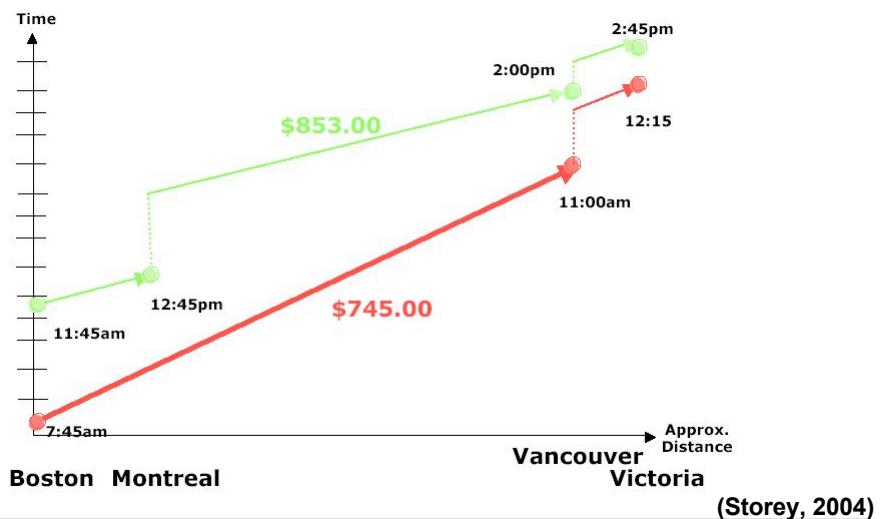
**Select to see prices**

7:45 AM Depart Boston (BOS)  
Arrive Victoria (YYJ) 2:40 PM  
Tue 6-Nov  
9hr 55min  
 Air Canada 763 / 1653 Connects to Vancouver (YVR)

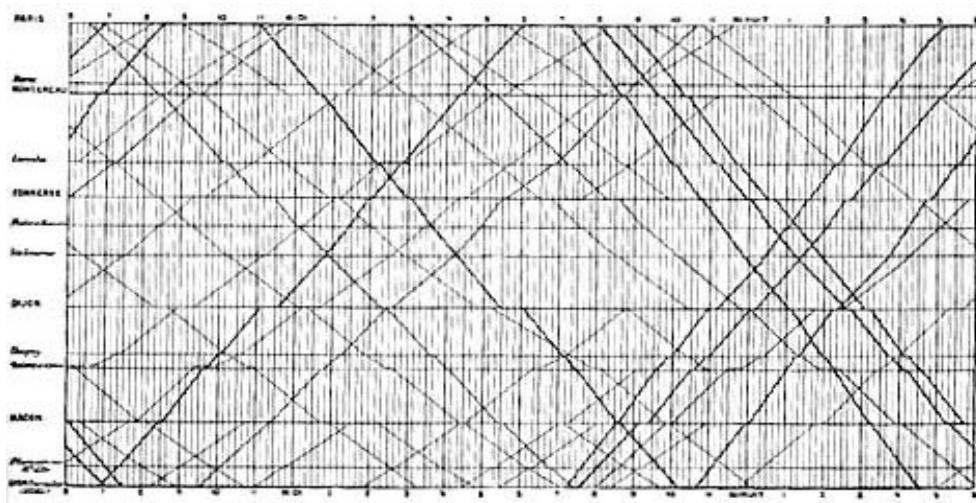
7:45 AM Depart Boston (BOS)  
Arrive Victoria (YYJ) 3:05 PM  
Tue 6-Nov  
10hr 20min  
 Air Canada 763 / 1510 Connects to Vancouver (YVR)

(Storey, 2004)

## Example – Air Fare (2)



## 1885 French Train Schedule by E.J. Marey



## Mapping Problem

- A lot of information does not imply any obvious spatial mapping!
- Basic Question:  
How to map non-spatial abstractions into effective visual representation?
- Approach:  
Use interactive techniques and visual representations to augment or amplify the user's cognition

## Information Visualization To Amplify Cognition

Different ways in which visualizations *could* help amplify cognition:

- By increasing memory and processing resources available
  - Parallel perceptual processing
  - Offload work from cognitive to perceptual system
- By reducing the amount of time to search
  - High data density
  - Greater access speed
- Enhancing the detections of patterns and enabling perceptual inference operations
  - Abstraction and Aggregation
- Aid perceptual monitoring
  - Color or motion coding to create pop out effect
- By encoding information in an Interactive Medium

### 3 Information Visualization

- 3.1 Motivation and Examples
- 3.2 Basics of Human Perception
- 3.3 Principles and Terminology
- 3.4 Standard Techniques for Visualization

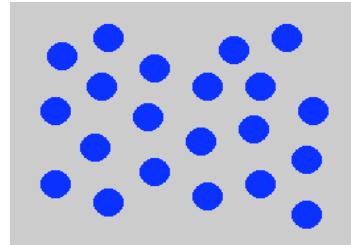
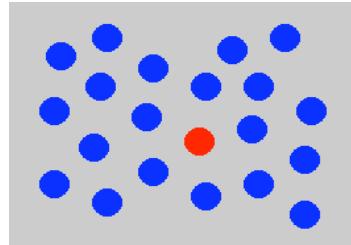
Literature:

- Preattentive Processing  
<http://www4.ncsu.edu/~healey/PP/>

### Preattentive Processing

- A limited set of visual properties are processed preattentively
  - (without need for focusing attention).
- This is important for design of visualizations
  - what can be perceived immediately
  - what properties are good discriminators
  - what can mislead viewers

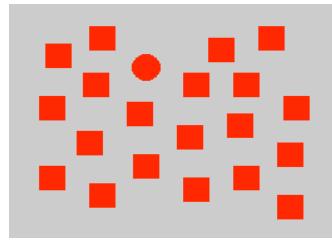
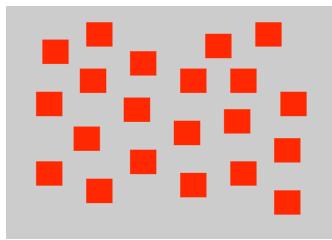
## Example: Color Selection



Viewer can rapidly and accurately determine whether the target (red circle) is present or absent.  
Difference detected in color.

Hearst, 2003

## Example: Shape Selection



Viewer can rapidly and accurately determine whether the target (red circle) is present or absent.  
Difference detected in form (curvature)

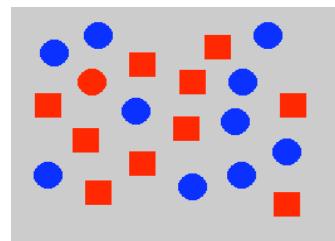
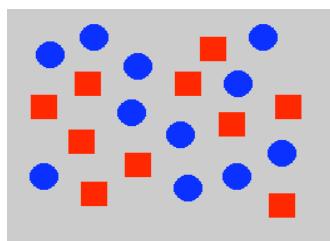
Hearst, 2003

## Pre-attentive Processing

- < 200 - 250ms qualifies as pre-attentive
  - eye movements take at least 200ms
  - yet certain processing can be done very quickly, implying low-level processing in parallel
- If a decision takes a fixed amount of time regardless of the number of distractors, it is considered to be preattentive.

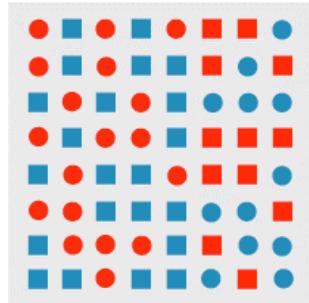
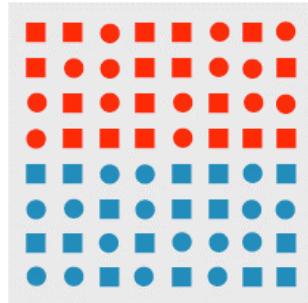
Hearst, 2003

## Example: Conjunction of Features (1)



Viewer *cannot* rapidly and accurately determine whether the target (red circle) is present or absent when target has two or more features, each of which are present in the distractors. Viewer must search sequentially.

## Example: Conjunction of Features (2)



Boundary detection (Treisman)

## Preattentive Visual Properties (Healey 97)

length	Triesman & Gormican [1988]
width	Julesz [1985]
size	Triesman & Gelade [1980]
curvature	Triesman & Gormican [1988]
number	Julesz [1985]; Trick & Pylyshyn [1994]
terminators	Julesz & Bergen [1983]
intersection	Julesz & Bergen [1983]
closure	Enns [1986]; Triesman & Souther [1985]
colour (hue)	Nagy & Sanchez [1990, 1992]; D'Zmura [1991] Kawai et al. [1995]; Bauer et al. [1996]
intensity	Beck et al. [1983]; Triesman & Gormican [1988]
flicker	Julesz [1971]
direction of motion	Nakayama & Silverman [1986]; Driver & McLeod [1992]
binocular lustre	Wolfe & Franzel [1988]
stereoscopic depth	Nakayama & Silverman [1986]
3-D depth cues	Enns [1990]
lighting direction	Enns [1990]

Hearst, 2003

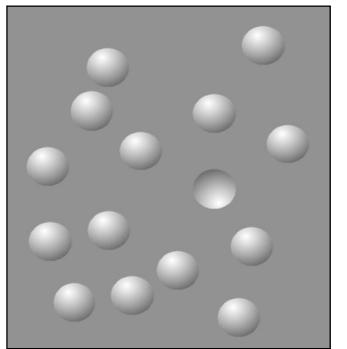
## Text NOT Preattentive

SUBJECT PUNCHED QUICKLY OXIDIZED TCEJBUS DEHCNUP YLKCIUQ DEZIDIXO  
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM  
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCR SNMULOC  
GOVERNS PRECISE EXAMPLE MERCURY SNREVOG ESICERP ELPMAXE YRUCREM  
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM  
GOVERNS PRECISE EXAMPLE MERCURY SNREVOG ESICERP ELPMAXE YRUCREM  
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCR SNMULOC  
SUBJECT PUNCHED QUICKLY OXIDIZED TCEJBUS DEHCNUP YLKCIUQ DEZIDIXO  
CERTAIN QUICKLY PUNCHED METHODS NIATREC YLKCIUQ DEHCNUP SDOHTEM  
SCIENCE ENGLISH RECORDS COLUMNS ECNEICS HSILGNE SDROCR SNMULOC

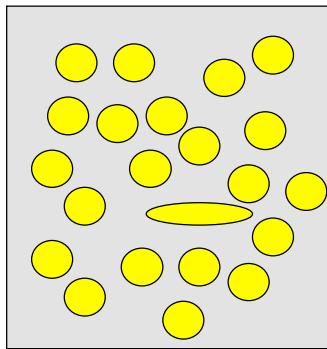
## Pop-Out Effect by Preattentive Processing

- Pop-Out =  
Time required to find target  
independent of overall number
- Form:
  - line orientation, length, width
  - spatial orientation, added marks,  
numerosity (4)
- Colour:
  - hue, intensity
- Motion:
  - flicker, direction of motion
- Spatial Position:
  - stereoscopic depth,  
convex/concave shape, shadows

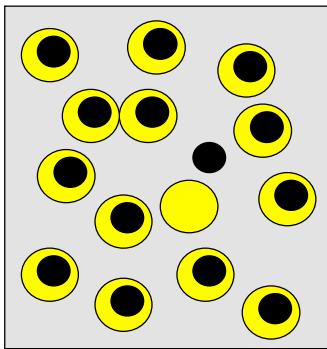
## Examples for Pop-Out (1)



Shading

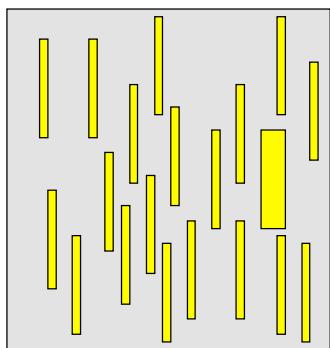


Shape

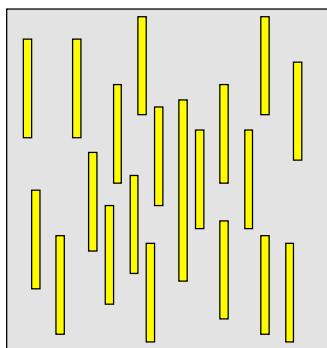


Enclosure

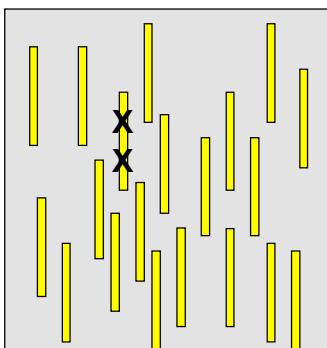
## Examples for Pop-Out (2)



width



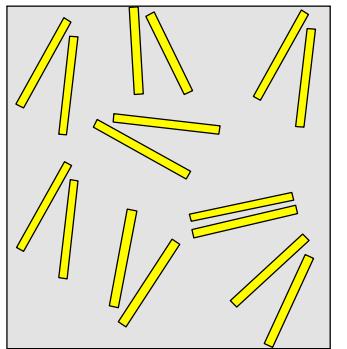
length



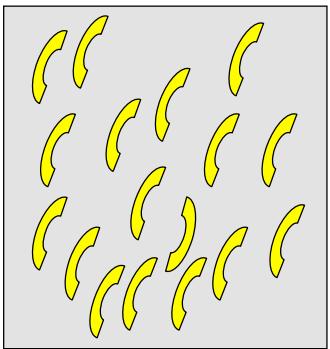
marked

Hiding features  
due to placement

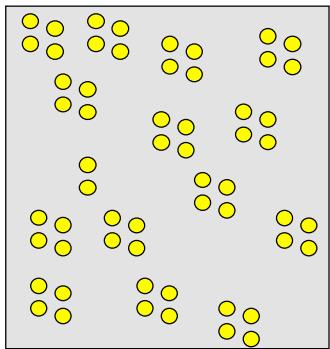
### Examples for Pop-Out (3)



angle

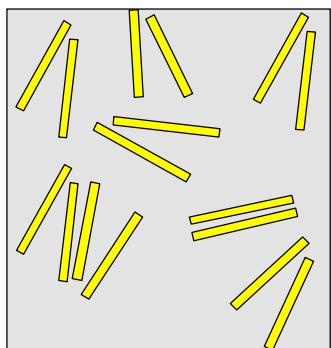


curve

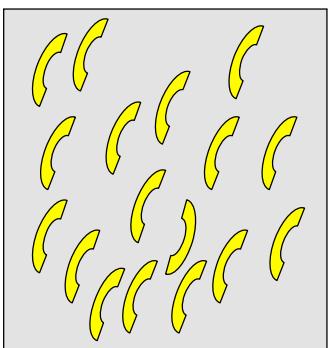


Clusters/count

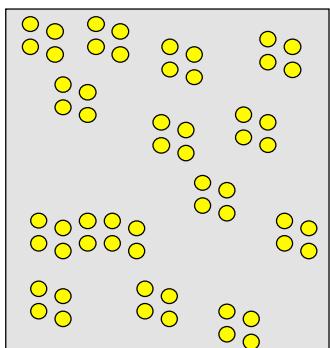
### Examples for Pop-Out (3)



angle



curve



Clusters/count

Hiding features  
due to placement

Hiding features  
due to placement

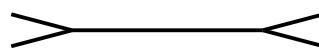
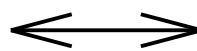
## Visual Illusions

- People don't perceive length, area, angle, brightness they way they "should".
- Some illusions have been reclassified as systematic perceptual errors
  - e.g., brightness contrasts (grey square on white background vs. on black background)
  - partly due to increase in our understanding of the relevant parts of the visual system
- Nevertheless, the visual system does some really unexpected things.

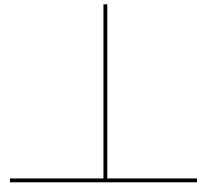
Hearst, 2003

## Illusions of Linear Extent

- Mueller-Lyon (off by 25-30%)



- Horizontal-Vertical



Hearst, 2003

