

# 3 Information Visualization

3.1 Motivation and Examples

3.2 Basics of Human Perception

3.3 Principles and Concepts

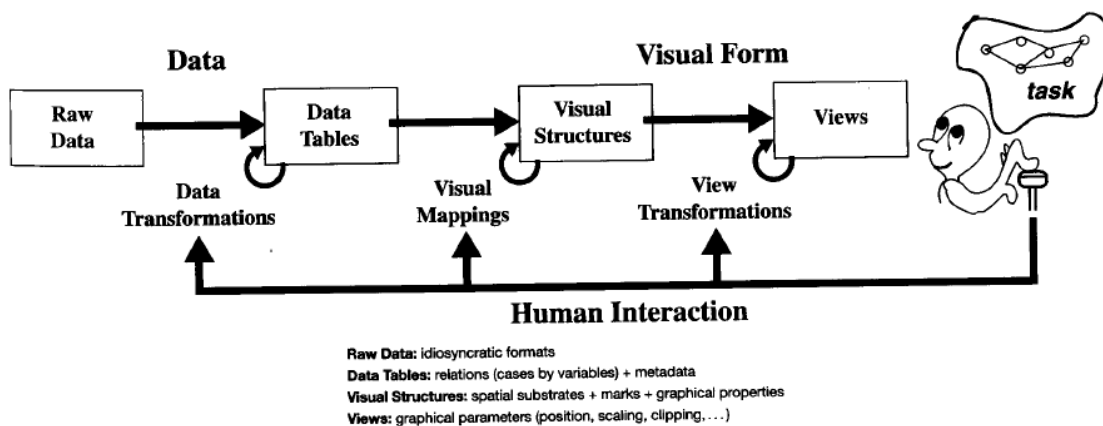
3.4 Standard Techniques for Visualization

3.5 Further Examples

Literature:

- E. Tufte: The Visual Display of Quantitative Information, 2nd ed., B&T 2001
- Marti Hearst
  - <http://bailando.sims.berkeley.edu/talks/chi03-tutorial.ppt>
- Margret-Anne Storey
  - [http://www.cs.uvic.ca/~mstorey/teaching/infovis/course\\_notes/introduction.pdf](http://www.cs.uvic.ca/~mstorey/teaching/infovis/course_notes/introduction.pdf)

## Visualization Reference Model



- Raw Data → Data Table  
filtering
- Data Table → Visual Structure  
pick mappings

- Visual Structure → Views  
probes, viewpoints, distortions

(Storey, 2004)

## Types of Data

- Entities
  - Objects of interest
- Relationships
  - Form structures that relate entities
  - Many kinds of relationships exist
    - » Is-part-of, is-kind-of, is-xyx-to, ...
- Attributes of entities or relationships
  - Attribute vs. Independent information (entity)
  - Attribute is variable of a certain value type
- Operations
  - Actions can also be considered as data
- Metadata
  - Data about data

## Basic Attribute Value Types

- Nominal (qualitative)
  - No inherent order (but can be tested for equality =)
  - Examples: City names, types of diseases, kind of fruit, ...
- Ordinal (qualitative)
  - Ordered (can be tested for  $<$ ,  $>$ ), but not at measurable intervals
  - Sequencing things, ranking
  - Examples: first, second, third, ...; cold, warm, hot
- Nominal/Interval (quantitative)
  - Integer or real numbers
  - Ordered (can be tested for  $<$ ,  $>$ )
  - Arithmetical operations, ratios are possible
  - Interval data: Derivation of gaps (e.g. time between departure and arrival)
  - Examples: Size and population of countries, schedule times, numeric grades

## Attribute Dimensions

- All kinds of *tensors* may appear as attribute values
- Tensor rank 0: Scalar
  - E.g. mass, temperature, length, price
- Tensor rank 1: Vector
  - E.g. force, momentum, location, direction
- Tensor rank 2: Matrix
  - E.g. linear transformation
- ...

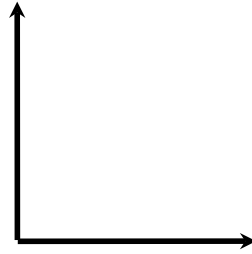
## Mapping to Visual Structures

- Mapping from data tables to visual structures is
  - expressive*
    - if all data in the table (and only this information) are presented in the structure
  - efficient*
    - if the visual representation is easier to interpret for humans, can convey more distinctions or leads to fewer errors

(Storey, 2004)

## Visual Structure

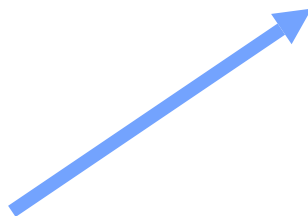
- Spatial substrate
  - Fixed number of dimensions
  - Inherently perceptual
- Axes
  - Unstructured axis
  - Nominal axis (division into subregions)
  - Ordinal axis (order has meaning)
  - Quantitative axis (metric associated with region)
- Graphical marks
  - Visible things that occur in space



(based on Storey, 2004)

## Graphical Marks

- Four elementary types:
  - Points (0D)
  - Lines (1D)
  - Areas (2D)
  - Volumes (3D)
- In practice, marks need more dimensions than in theory
  - E.g. Points can be seen only if painted as areas



(based on Storey, 2004)

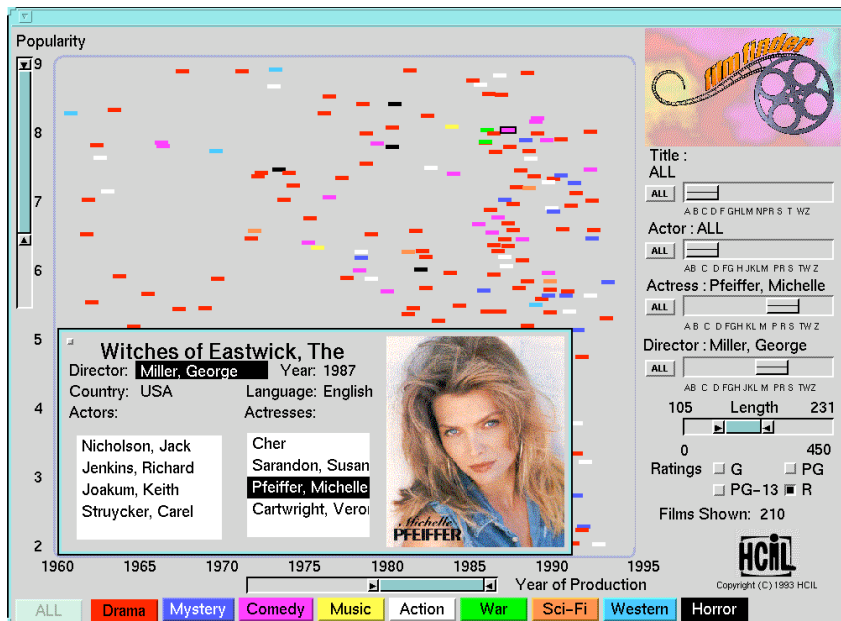
# Mapping Examples

(assume 2-dimensional representations)

- Two scalars:
  - Price vs. top speed of cars
- Ordinal and scalar:
  - Max. price vs. brand of cars
- Ordinal and vector:
  - Price range vs. brand of cars
- Vector and scalar:
  - Location vs. average temperature
- Vector and vector:
  - Location vs. temperature range

## Example: FilmFinder

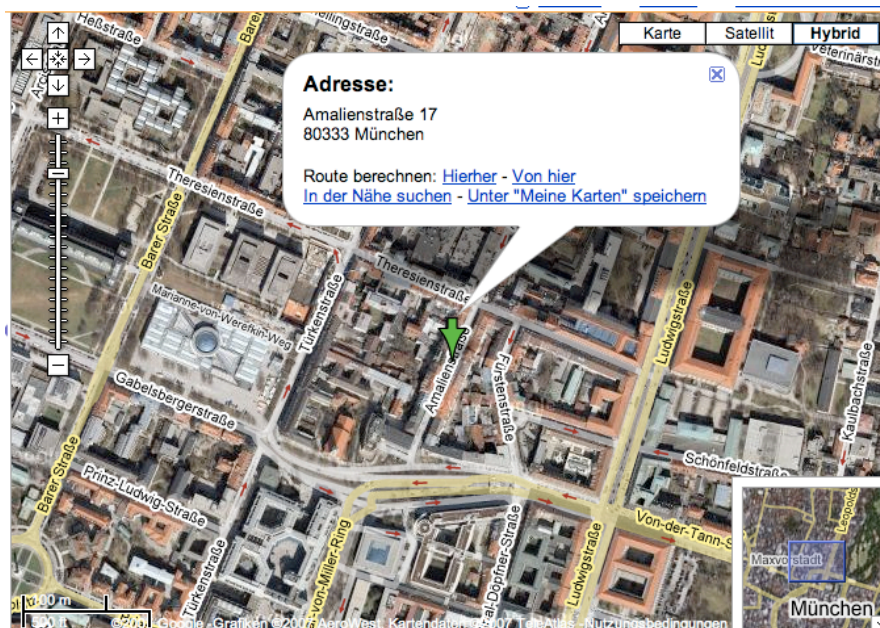
University  
of Maryland,  
HCIL



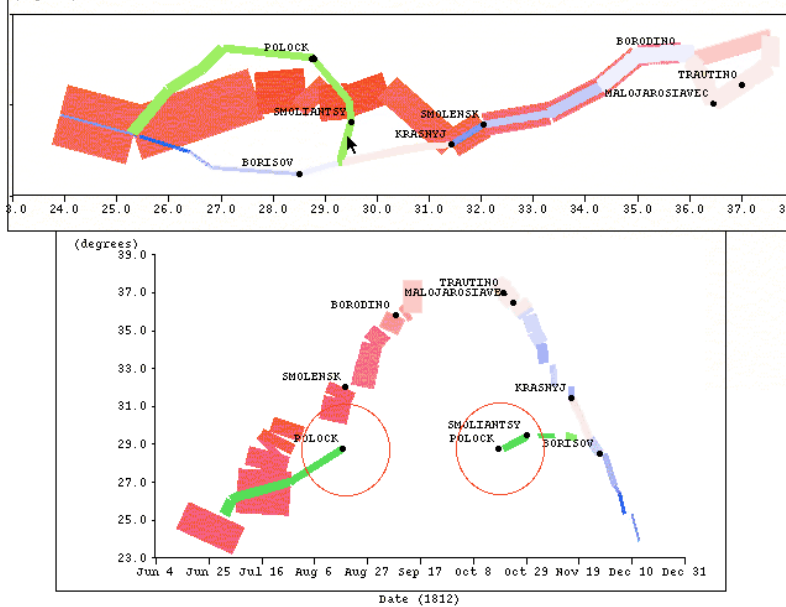
## View Transformations

- Ability to interactively modify and augment visual Structures
  - Turning static presentations into visualizations
- Time is exploited to display more information
  - Dynamic Visualizations exist in space time
- Three common view transformations:
  1. Location probes: use location to reveal additional info
  2. Viewpoint controls: zoom, pan, clip the viewpoint
  3. Distortion: focus + context view

## Example: View Transformations in Google Maps



## Example: Interactive Graphs



<http://www.cs.cmu.edu/~sage>

## Accuracy Ranking of Perceptual Tasks

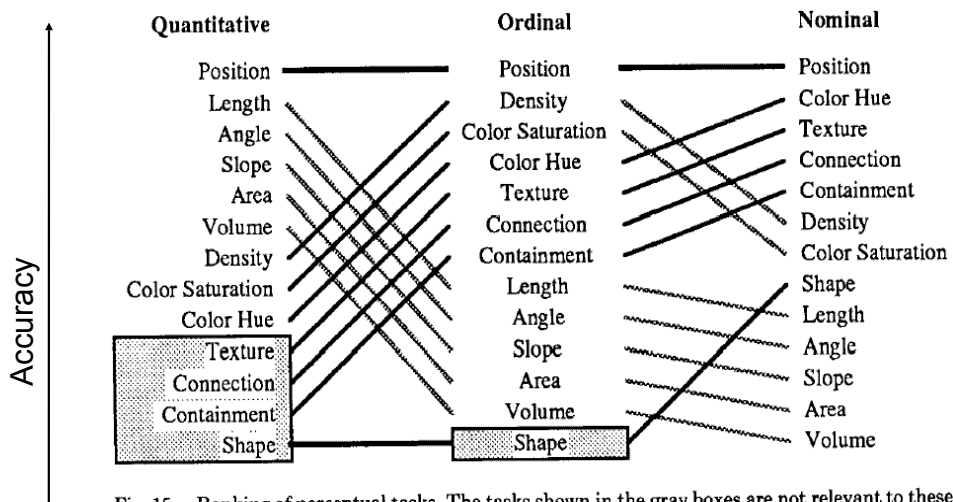


Fig. 15. Ranking of perceptual tasks. The tasks shown in the gray boxes are not relevant to these types of data.

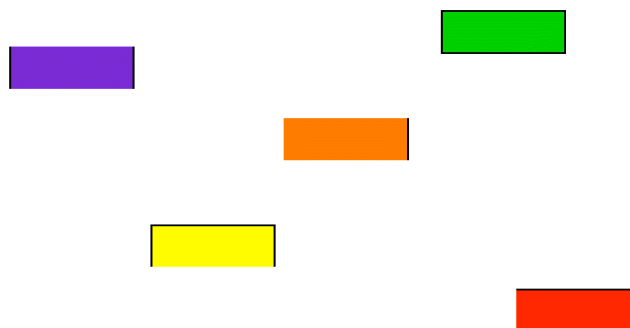
# Interpretations of Visual Properties

- Some properties have intrinsic meaning (Senay & Ingatious 97, Kosslyn, others)
  - Density (Greyscale)  
Darker -> More
  - Size / Length / Area  
Larger -> More
  - Position  
Leftmost -> first, Topmost -> first
- Some properties do not have intrinsic meaning, even some perceived quite accurately
  - Hue  
??? no intrinsic meaning
  - Slope  
??? no intrinsic meaning

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## Color Schemes (1)

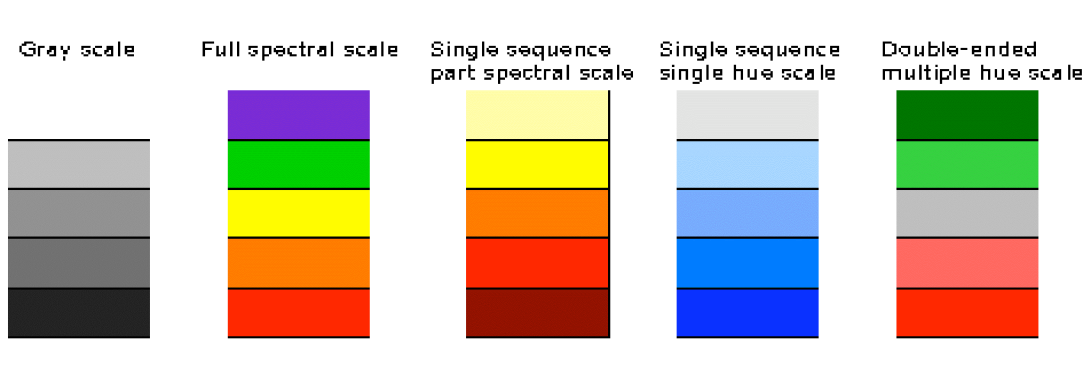
Order these (low->hi)



Hearst, 2003



## Color Schemes (2)



Hearst, 2003

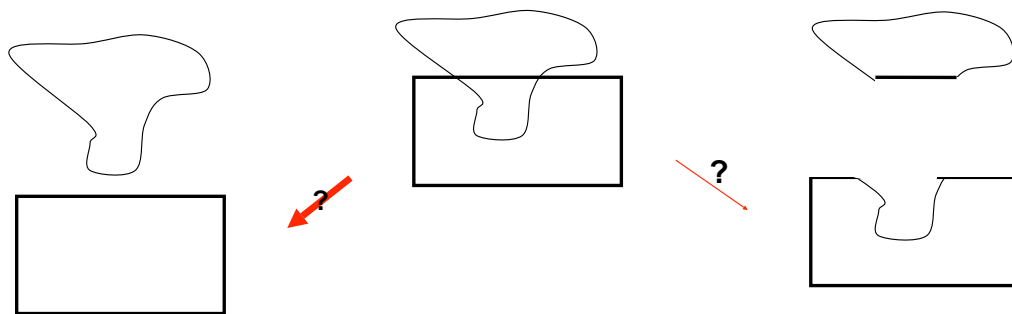
## Using Color

- Call attention to specific items
- Distinguish between classes of items
  - Increases the number of dimensions for encoding
- Increase the appeal of the visualization
- Proceed with caution
  - Less is more
  - Representing magnitude is tricky
- Examples
  - Red-orange-yellow-white
    - » Works for cost
  - Green-light green-light brown-dark brown-grey-white works for atlases
  - Grayscale is unambiguous but has limited range

Hearst, 2003

# Continuity

- Experience tells that visual elements are more likely to be continuous
- Implied connection
- connections are used to show relations



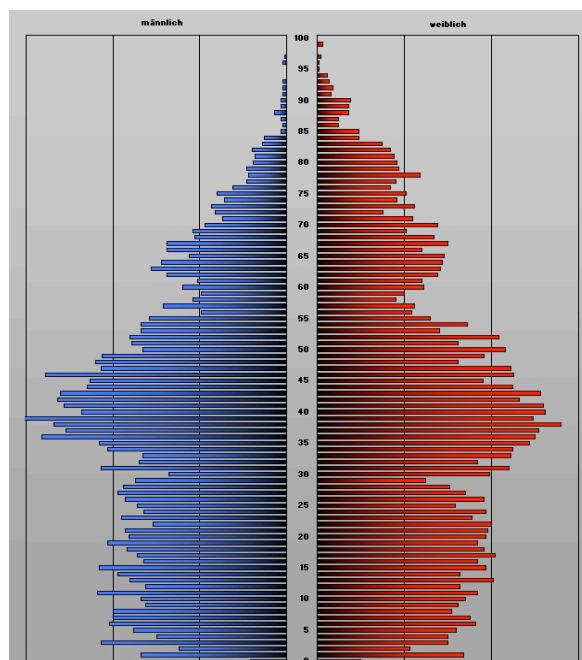
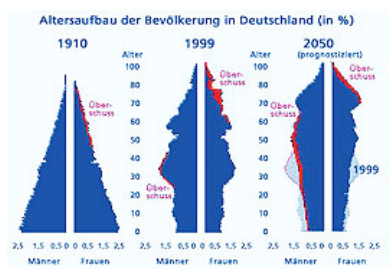
Ludwig-Maximilians-Universität München

A. Butz / R. Atterer

Mensch-Maschine-Interaktion II – 7 - 19

# Symmetry

- Symmetrical to emphasize relationship



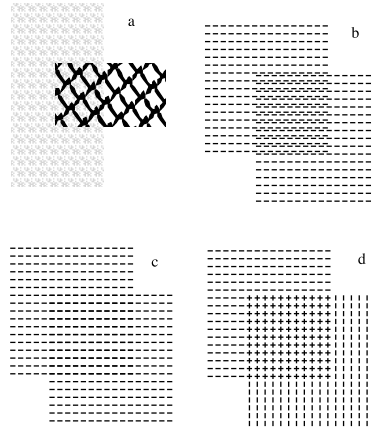
Ludwig-Maximilians-Universität München

A. Butz / R. Atterer

Mensch-Maschine-Interaktion II – 7 - 20

## Figure, Background, Transparency, Overlap

- What is foreground and what is background?
- Transparency is perceived only when good continuity and color correspondence exists.
- Visual interference in overlapping textures



## Principles of Graphical Excellence (E. Tufte)

- Graphical excellence
  - The well-designed presentation of interesting data – a matter of substance, of statistics, and of design
    - » consists of complex ideas communicated with clarity, precision and efficiency
    - » is that which gives to the viewer the greatest number of ideas in the shortest time with the least ink in the smallest space
    - » **requires telling the truth about the data.**

## Tufte Principle

Data ink = ink used for representing data

Chart ink = ink used for extra elements different from data

Avoid “chart junk”! Maximize the data-ink ratio:

$$\text{Data-ink ratio} = \frac{\text{data ink}}{\text{total ink used in graphic}}$$

Hearst, 2003

## Tufte’s Graphical Integrity

- Some lapses intentional, some not

$$\text{Lie Factor} = \frac{\text{size of effect in graph}}{\text{size of effect in data}}$$

- Misleading uses of area
- Misleading uses of perspective
- Leaving out important context
- Lack of taste and aesthetics

Hearst, 2003

## Lie factor

$$\text{lie factor} = \frac{\text{size of effect shown in graph}}{\text{size of effect in data}}$$




where

$$\text{size of effect} = \frac{|\text{second value} - \text{first value}|}{\text{first value}}$$

A lie factor that is either much higher or much lower than one is bad.

A **high** lie factor **exaggerates** differences between values. A **low** lie factor **obscures** differences between values.

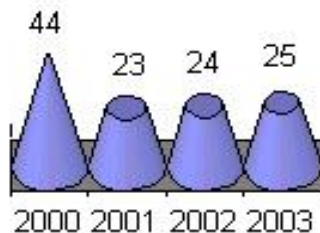
A common example of a **high** lie factor occurs when both dimensions of a two-dimensional figure are made proportional to the same data, so that the size of the figure is proportional to the square of the data; for instance,

Year	Books circulated
2001	100 
2002	141 
2003	200 

where the lie factor is about 2.4.

<http://instruct.uwo.ca/fim-lis/504/504gra.htm>

An example of a **low** lie factor can be seen in the "Cones" custom chart format in Microsoft Excel.



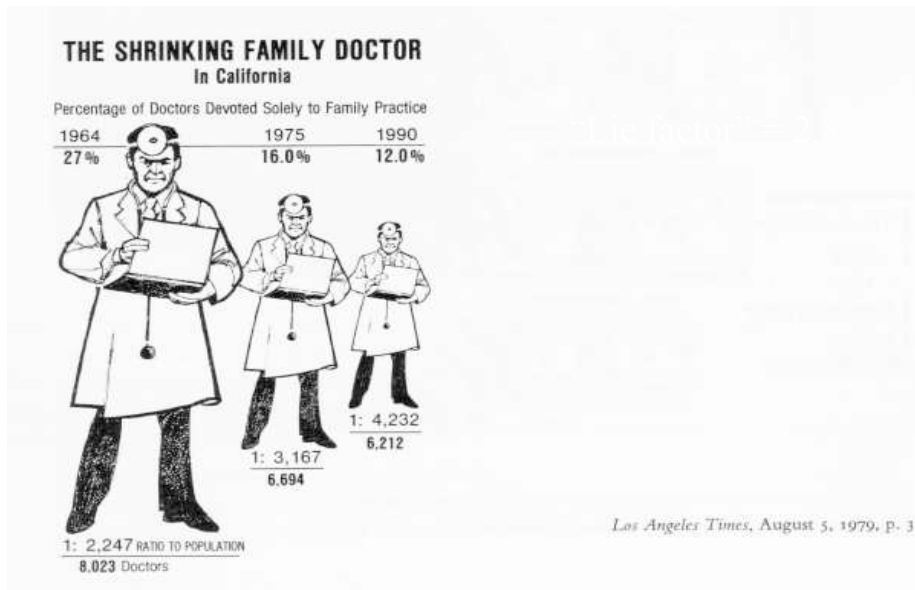
The heights of the (truncated) cones are proportional to the data, but their areas on the screen and their apparent volumes make the larger data values seem relatively small.

Charting on a **logarithmic** scale can also produce a low lie factor.

<http://instruct.uwo.ca/fim-lis/504/504gra.htm>

# How to Exaggerate with Graphs

from Tufte '83



Marti Hearst

# How to Exaggerate with Graphs

from Tufte '83

Error:  
Shrinking  
along both  
dimensions



Marti Hearst

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3.5 Further Examples

Literature:

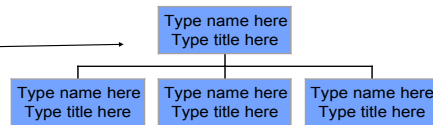
- Marti Hearst
  - <http://bailando.sims.berkeley.edu/talks/chi03-tutorial.ppt>
- Margret-Anne Storey
  - [http://www.cs.uvic.ca/~mstorey/teaching/infovis/course\\_notes/introduction.pdf](http://www.cs.uvic.ca/~mstorey/teaching/infovis/course_notes/introduction.pdf)

## Basic Types of Symbolic Displays (Kosslyn 89)

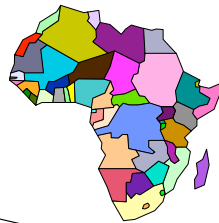
• Graphs



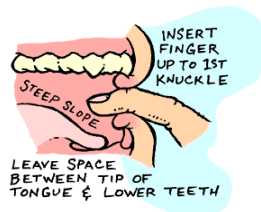
• Charts



• Maps



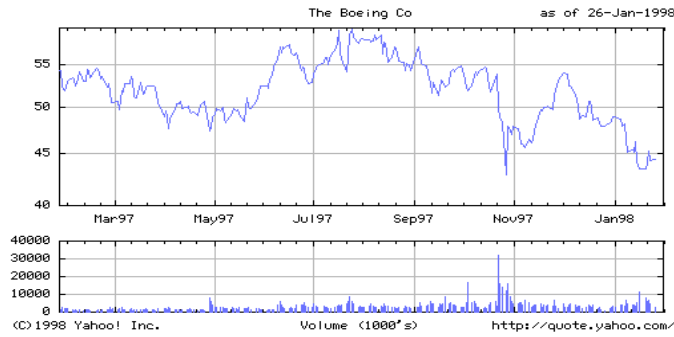
• Diagrams



From Hearst, 2003

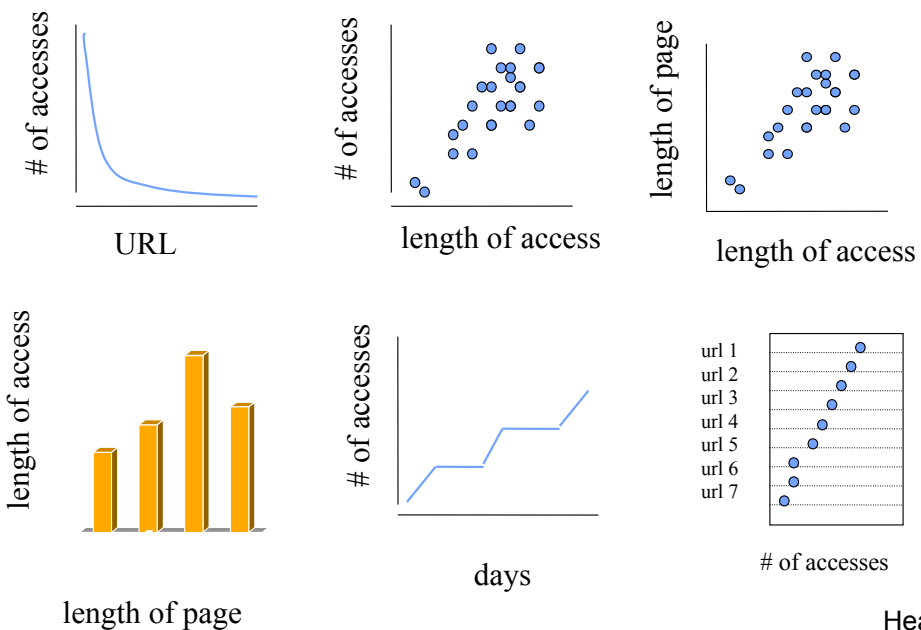
# Graphs

- At least two scales required
- values associated by a symmetric “paired with” relation
  - Examples: scatter-plot, bar-chart, line graph



Hearst, 2003

## Common Graph Types

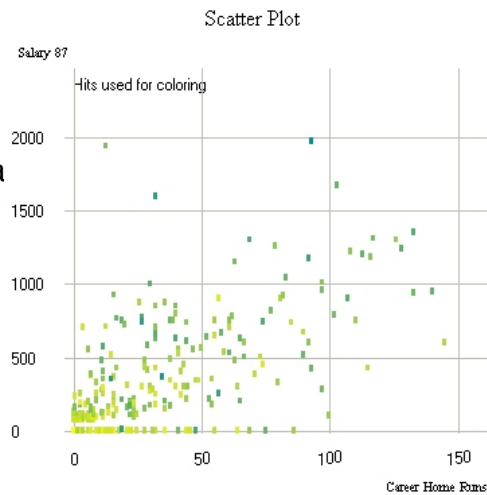


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## Scatter Plots

- Qualitatively determine if variables
  - are highly correlated
    - » linear mapping between horizontal & vertical axes
  - have low correlation
    - » spherical, rectangular, or irregular distributions
  - have a nonlinear relationship
    - » a curvature in the pattern of plotted points
- Place points of interest in context
  - Color representing special entities



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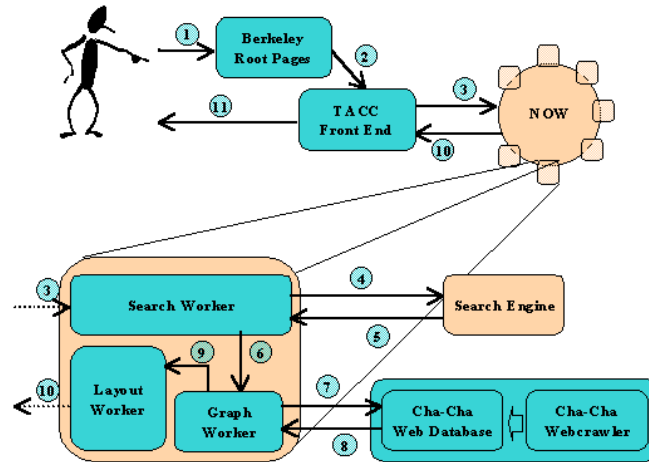
## When to use which type?

- Line graph
  - x-axis requires quantitative variable
  - Variables have contiguous values
  - Familiar/conventional ordering among ordinals
- Bar graph
  - Comparison of relative point values
- Scatter plot
  - Convey overall impression of relationship between two variables
- Pie Chart?
  - Emphasizing differences in proportion among a few numbers

Hearst, 2003

## Charts

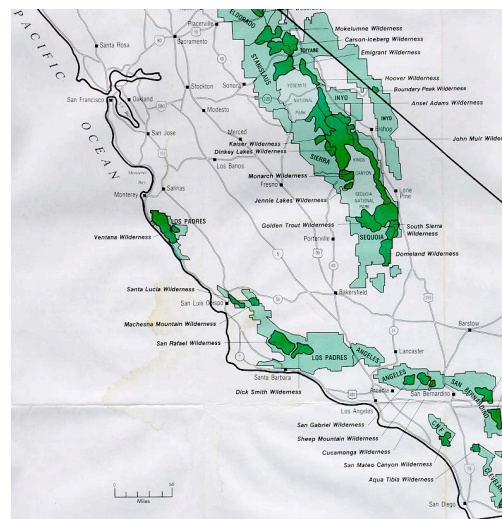
- Discrete relations among discrete entities
- Structure relates entities to one another
- Lines and relative position serve as links
- Examples: Family tree, flow chart



Hearst, 2003

## Maps

- Internal relations determined (in part) by the spatial relations of what is pictured
- Labels paired with locations

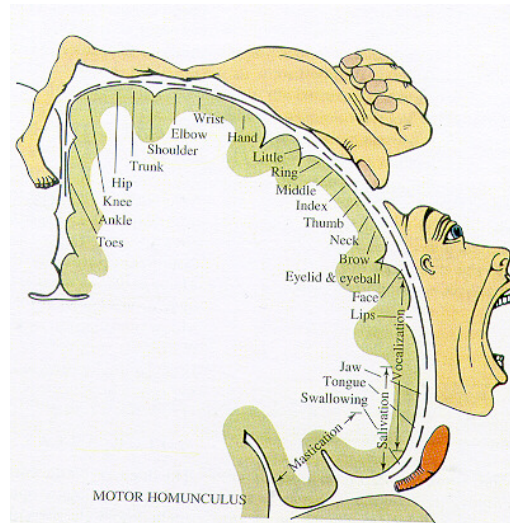


[www.thehighsierra.com](http://www.thehighsierra.com)

Hearst, 2003

## Diagrams

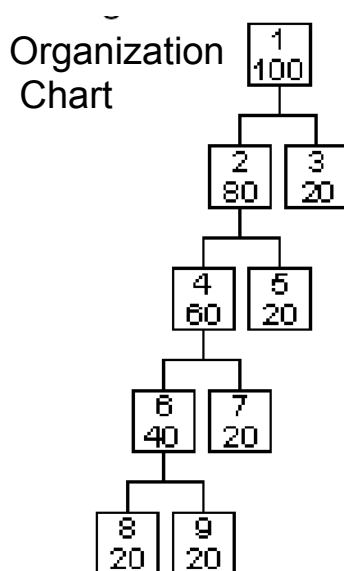
- Schematic pictures of objects or entities
- Parts are symbolic (unlike photographs)
  - How-to illustrations
  - Figures in a manual



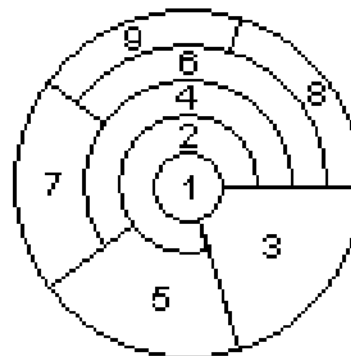
From Glietman, Henry. Psychology. W.W. Norton and Company, Inc. New York, 1995

Hearst, 2003

## Alternative Tree Visualizations (1)

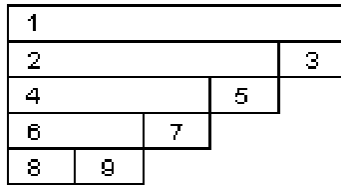


Tree Ring

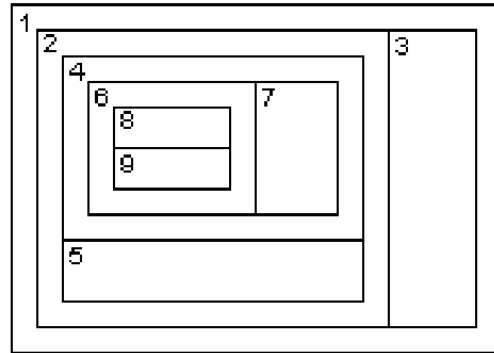


## Alternative Tree Visualizations (2)

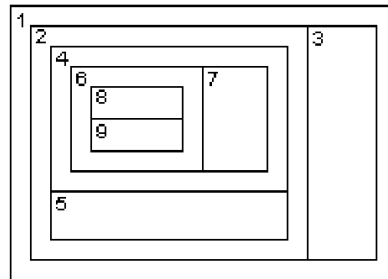
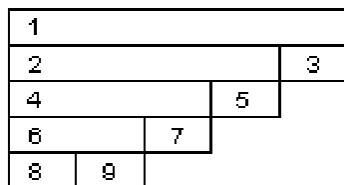
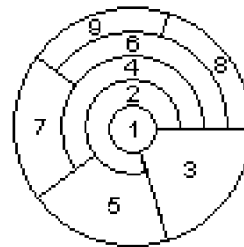
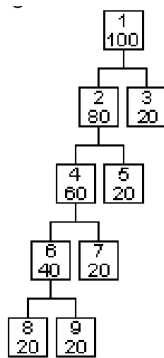
Icicle Plot



Tree Map



## Comparing Tree Visualizations



## Typical Tasks for Viewing Trees

- Determine the type of tree, e.g.
  - Binary
  - N-ary
  - Balanced
  - Unbalanced
- Find relations, e.g.
  - Deepest common ancestor
- Size of the tree, e.g.
  - How many levels
  - How many leaves
- Details about leaves, e.g.
  - Largest leaf
- Different representation may be better for a given task, e.g.
  - To find out if a tree is balanced or how many levels exist, the Icicle Plot is good

For more details see:

Barlow et al. "A Comparison of 2-D Visualizations of Hierarchies" INFOVIS'01  
<http://www.sims.berkeley.edu/courses/is247/s02/readings/barlow.pdf>

## Information Visualization Tasks

Tasks in interactive workflow using visualized information:

- **Overview** Gain an overview of the entire collection
- **Zoom** Zoom in on items of interest
- **Filter** Filter out uninteresting items
- **Details-on-demand** Select an item or group and get details when needed
- **Relate** View relationships among items
- **History** Keep a history of actions to support undo, replay, and progressive refinement
- **Extract** Allow extraction of sub-collections and of the query parameters



# Visualization Techniques for View Transformations

- Focus & Context
- Zoom & Pan

## Focus & Context: Background

- Useful Field of View (UFOV)
  - Expands searchlight metaphor
  - Size of region from which we can rapidly take information
  - Maintains constant number of targets
- Tunnel Vision and Stress
  - UFOV narrows as cognitive load/stress goes up
- Role of Motion in Attracting Attention
  - UFOV larger for movement detection

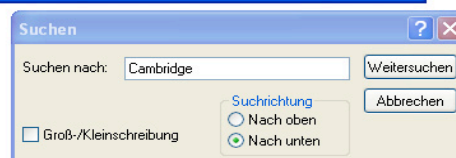
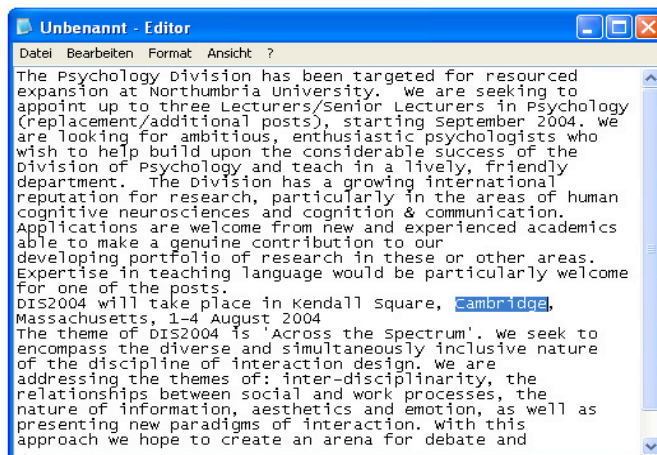


## Depth of Field

- Guiding user attention by blurring less relevant parts of an image
- Keeping the context
  
- Semantic Depth of field = blurring objects based on their relevance

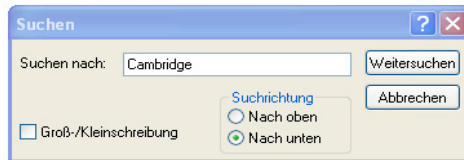
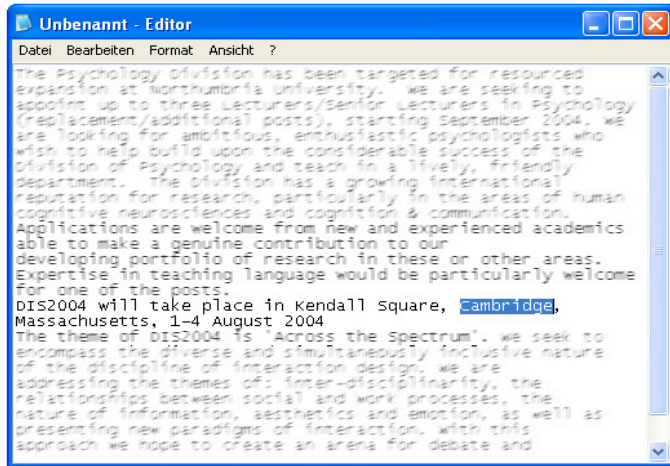


## Semantic Depth of Field - Example

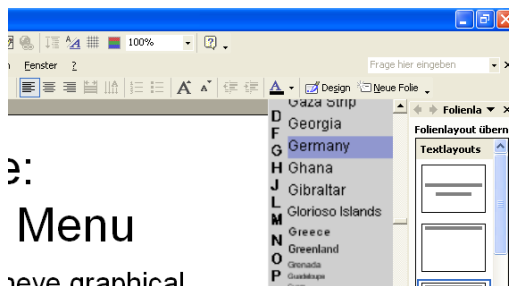




# Semantic Depth of Field - Example

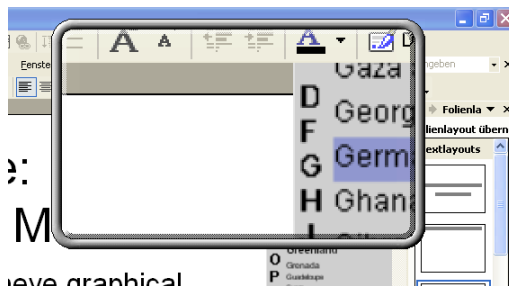


# Magnifying Glass



☺:  
Menu  
have graphical

- Magnifying glass hides context!
- This is not focus +context



☺:  
M  
have graphical

## Focus + Context

- Basic Idea:
  - Show selected regions of interest in greater detail (*focus*)
  - Preserve global view at reduced detail (*context*)
  - NO occlusion - All information is visible simultaneously
- Techniques
  - Fisheye views
  - Fisheye lens
  - Continuously variable zoom
  - Nonlinear magnification
  - Hyperbolic views
  - Distortion viewing
  - Rubber sheet views

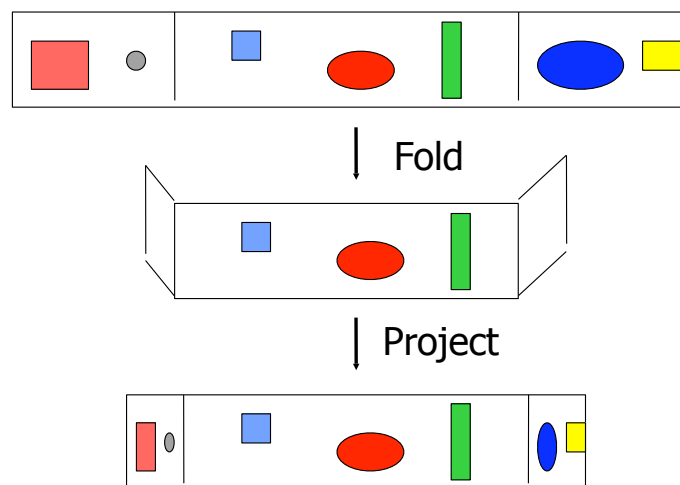
## Alternate Geometry

- Euclidean geometry – we use it since primary school...
  - 3 angles of a triangle add up to?
  - Shortest distance between two points?
- Spherical geometry
  - Geographical view of the world
    - » What is the shortest way from Moscow to San Francisco?
    - » Sum of angles of a triangle between Paris, NY, and Cape Town?
  - <http://math.rice.edu/~pcmi/sphere/>
- Hyperbolic Geometry / Space
  - Theory of Relativity
  - The “fifth” dimension
  - Can be projected into 2-D as a *pseudosphere*
  - Key: As a point moves away from the center towards the boundary circle, its distance approaches *infinity*
  - <http://cs.unm.edu/~joel/NonEuclid/NonEuclid.html> (Applet)

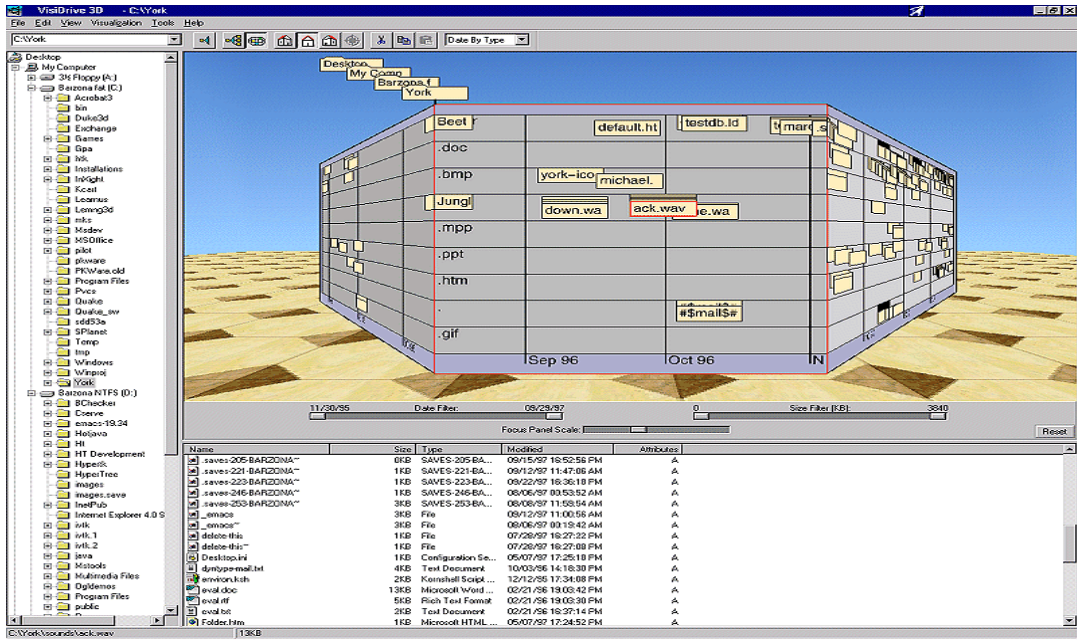
## Distorted vs. Non-distorted

- Non-distorted
  - Display only a selection at a time
  - Scrolling
  - Paging access
  - hierarchical structure
  - Structure-specific presentation
- Distorted
  - See the following slides

## Basic Idea – Perspective Wall



From <http://www.cs.ubc.ca/~tmm/courses/cpsc533c-03-spr/0324.fengdongdu.ppt>

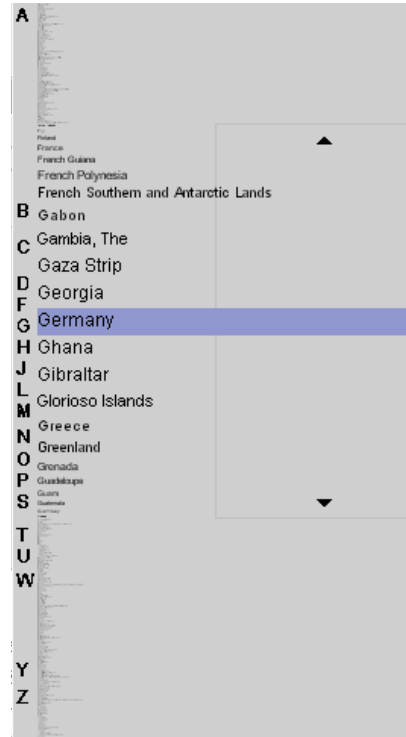


## Fisheye View

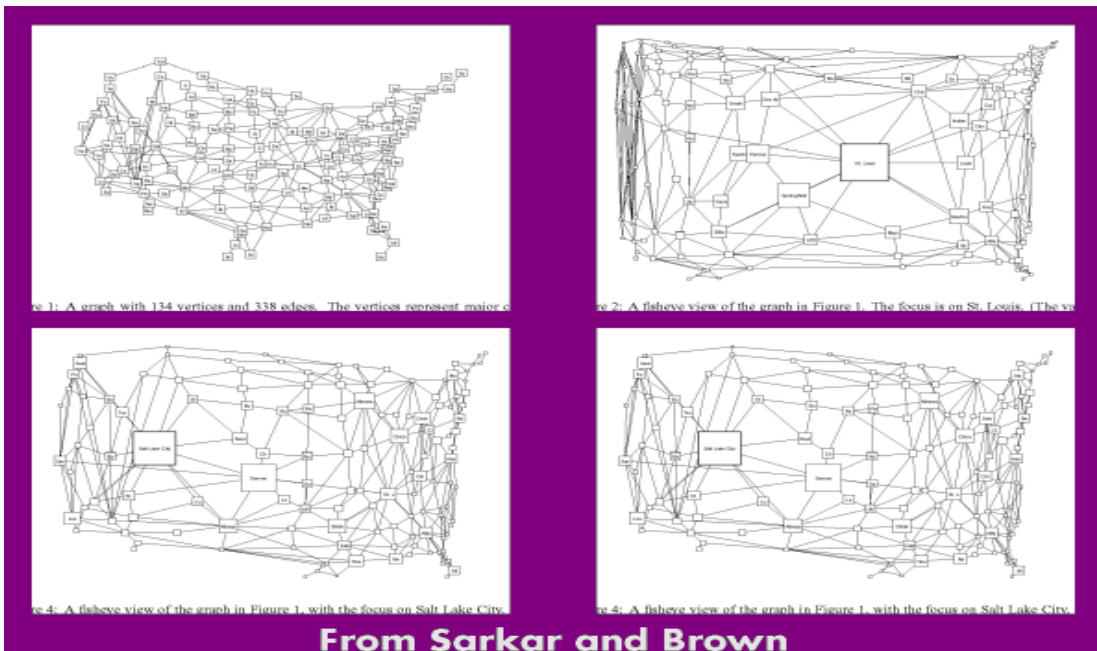
Unit	State	County	Output	Problems	Health
Unit38	Arizona	J	35	0	9
Unit39	Arizona	J	40	0	9
Unit40	Arizona	J	30	2	9
Unit41	Arizona	K	23	0	9
Unit42	Arizona	K	24	1	9
Unit43	Arizona	K	25	0	9
Unit44	Arizona	L	50	1	9
Unit45	Arizona	L	50	0	9
Unit46	Arizona	L	50	0	9
Unit47	Nebraska	V	90	2	9
Unit48	Nebraska	V	90	1	9
Unit49	Nebraska	V	50	2	8
Unit50	Nebraska	F	50	3	7
Unit51	Nebraska	F	70	0	9
Unit52	Nebraska	P	60	1	9
Unit53	Nebraska	P	50	1	8
Unit54	Nebraska	P	90	0	9
Unit55	Nebraska	P	90	0	9
Unit56	Nebraska	Q	90	0	9
Unit57	Nebraska	Q	90	1	9
Unit58	Nebraska	Q	90	1	9
Unit59	Nebraska	Q	90	1	9
Unit60	Mississippi	S	50	0	9
Unit61	Mississippi	S	70	0	9
Unit62	Mississippi	S	60	1	9
Unit63	Mississippi	S	50	1	9
Unit64	Mississippi	S	50	1	9

## Example: Fisheye Menu

- Applies fisheye graphical visualization techniques to linear menus
- For very long menus as alternative to
  - Hierarchies
  - Scrolling
  - Arrow-bars
- Benjamin B. Bederson. Fisheye Menus. UIST'00
- Demo  
<http://www.cs.umd.edu/hcil/fisheymenu/fisheymenu-demo.shtml>



## Fisheye View - Networks



# Panning and Zooming

- Panning
  - Smooth movement of camera across scene (or scene moves and camera stays still)
- Zooming
  - Increasing or decreasing the magnification of the objects in a scene
- Useful for changing focal point
- Also used in creating moving pictures from still pictures
  - “Ken Burns effect”, see Mac OS X photo screensaver

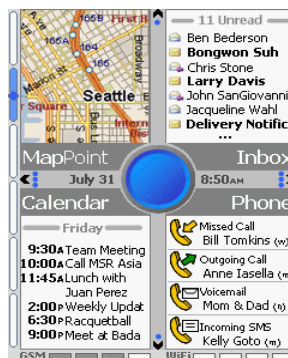
## Example: LaunchTile Visual Design



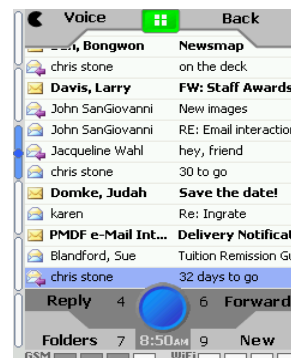
- Three (pure) zoom levels



World



Zone



Application

Karlson, Bederson, SanGiovanni,  
CHI 2005