

2D Visualization Techniques: Taxonomy and overview

Lyn Bartram
IAT 814 week 10
10.11.2009

These slides have been largely adapted from D. Keim, B. Zupan and M. Hearst

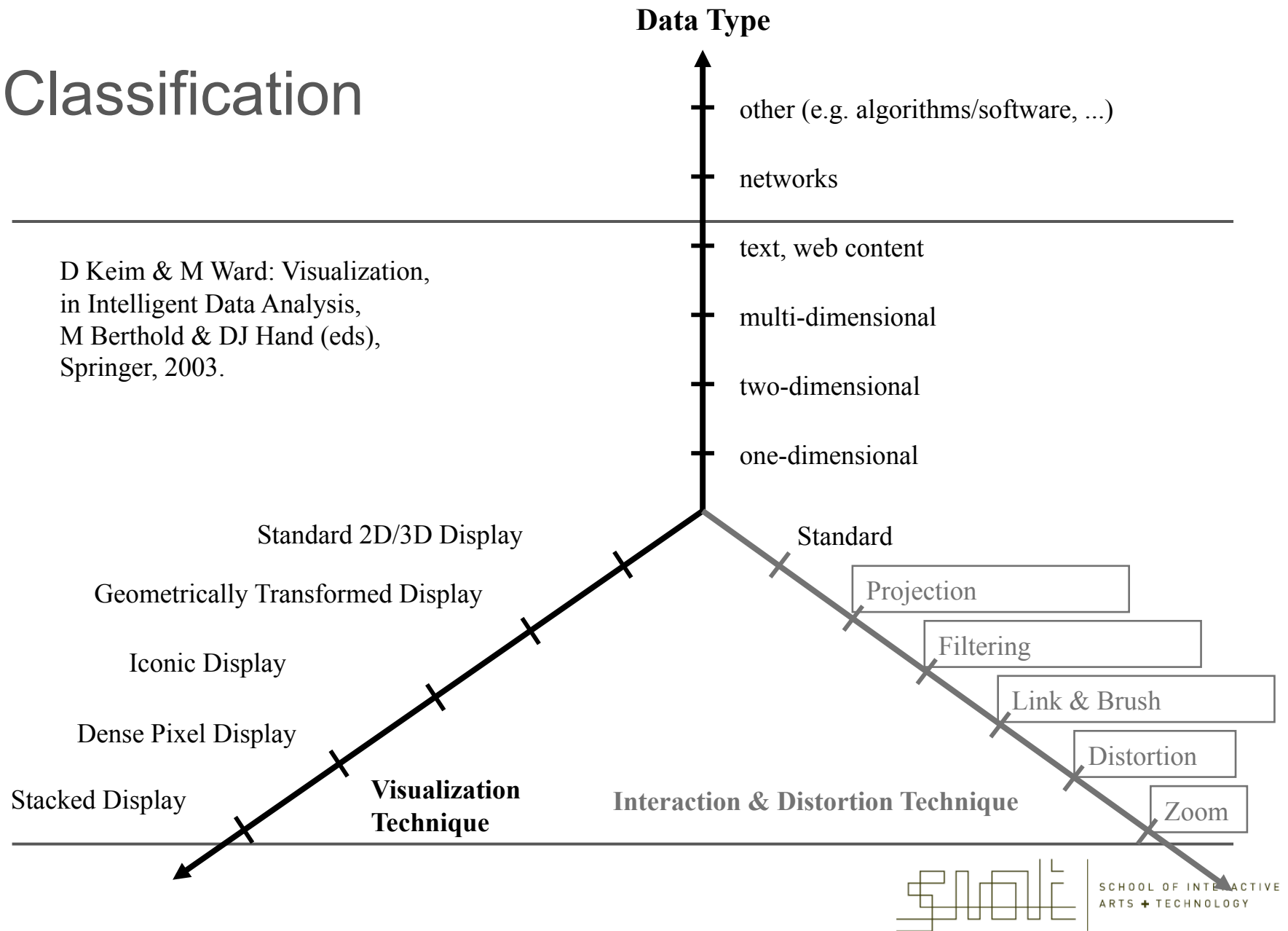
Today

- Assignments and presentations
- Assignment 3 out this week
- Presentations start next week (Thursday)

- Project presentations Week 13 and 14
- Project papers due Week 14.

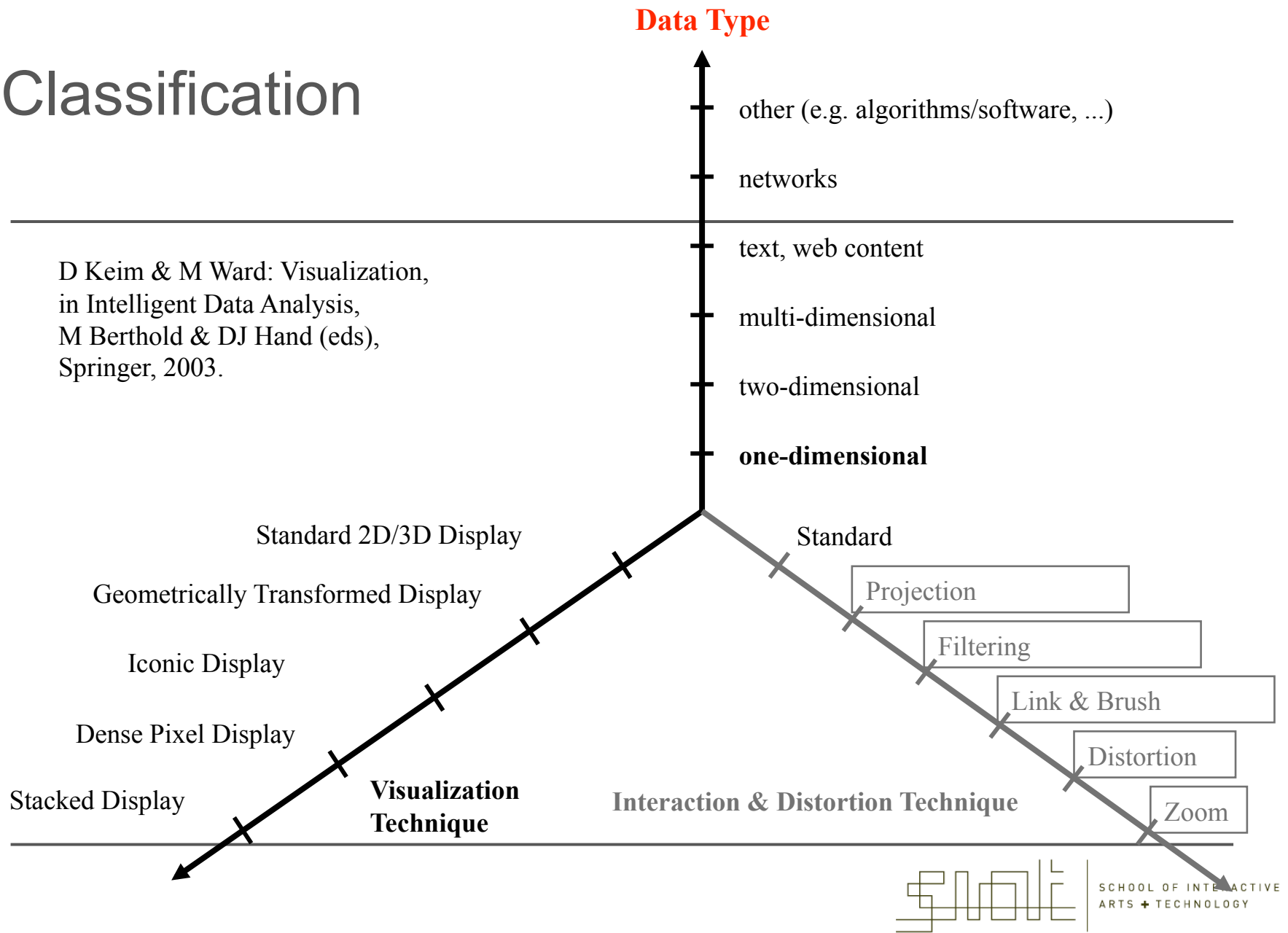
Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.

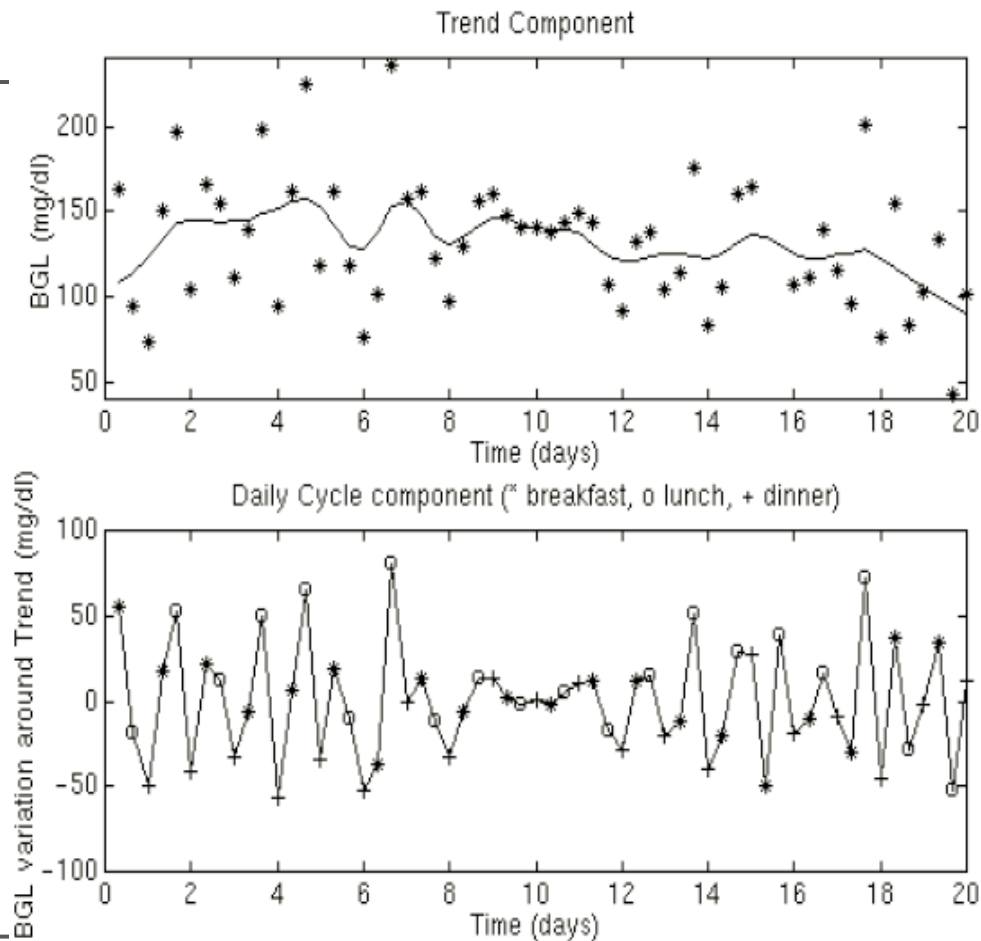


Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



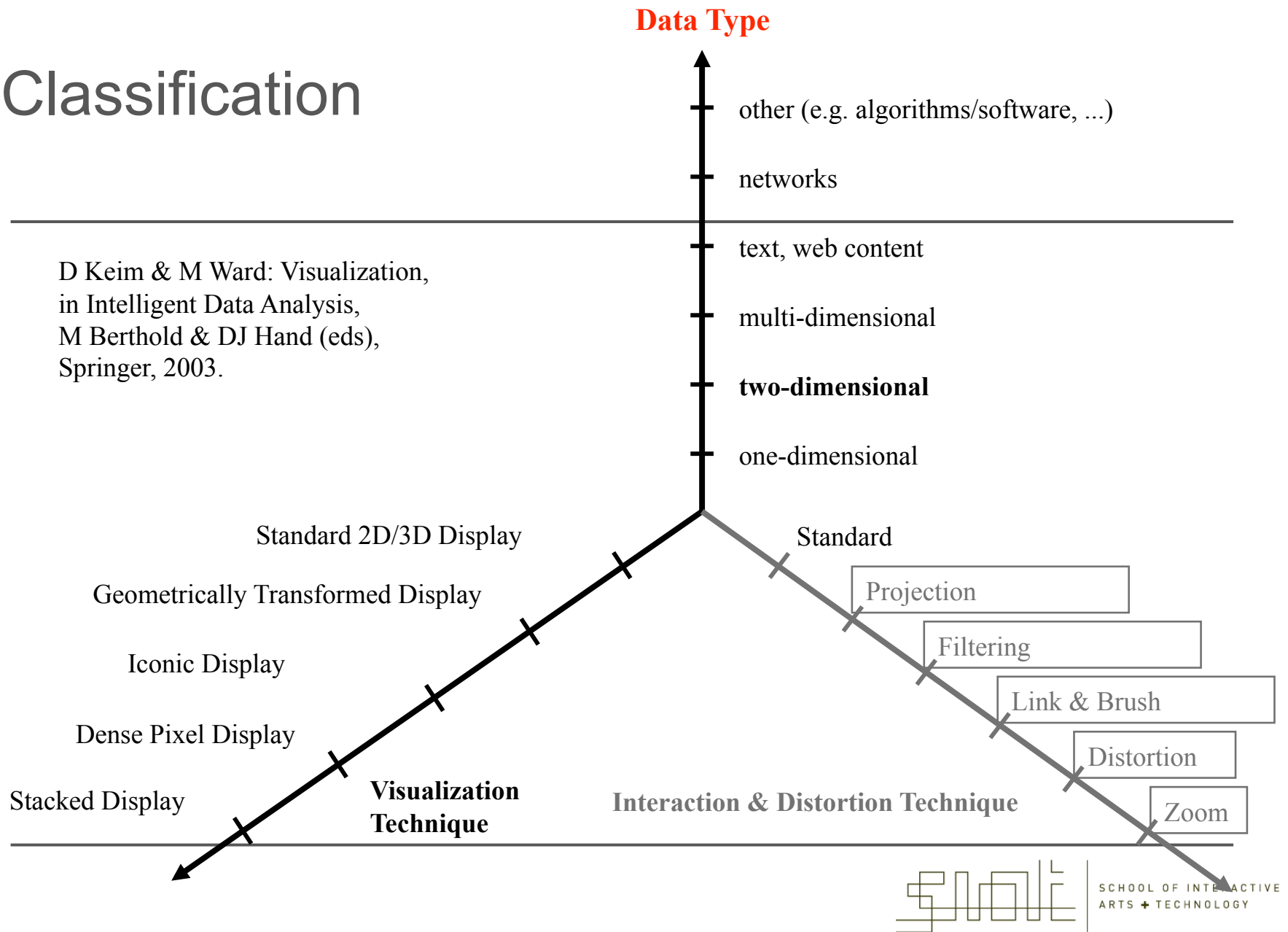
Data: One-Dimensional



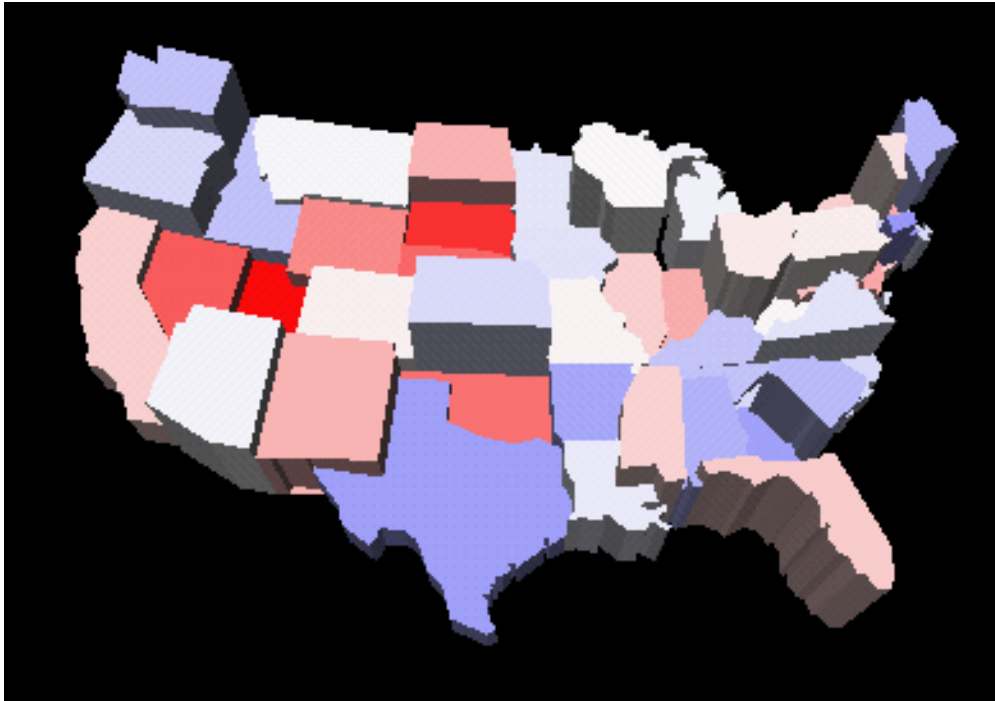
R Bellazzi: Mining Biomedical Time Series by Combining Structural Analysis and Temporal Abstractions,
In Proc. of AMIA 1998.

Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



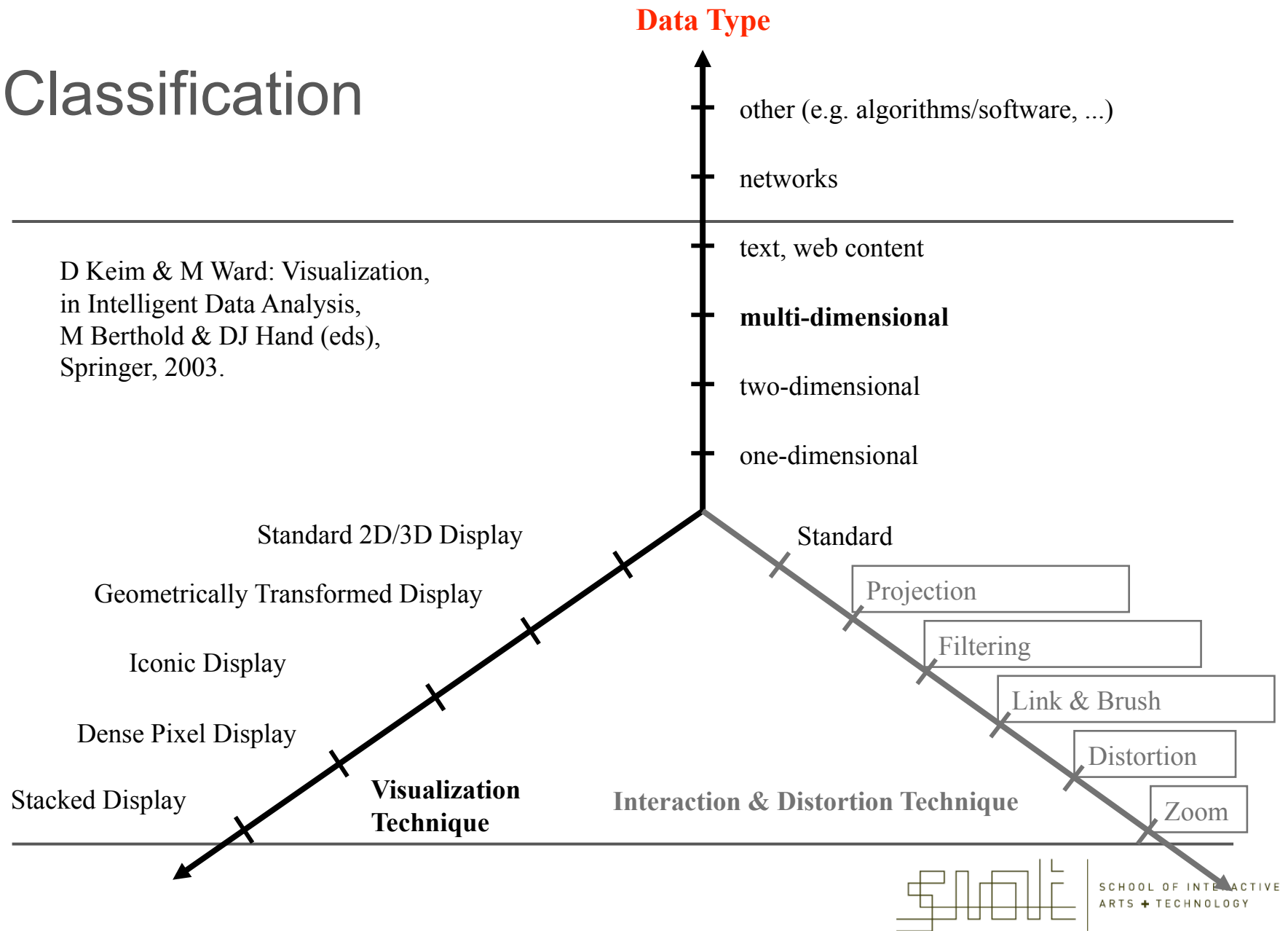
Data: Two-Dimensional



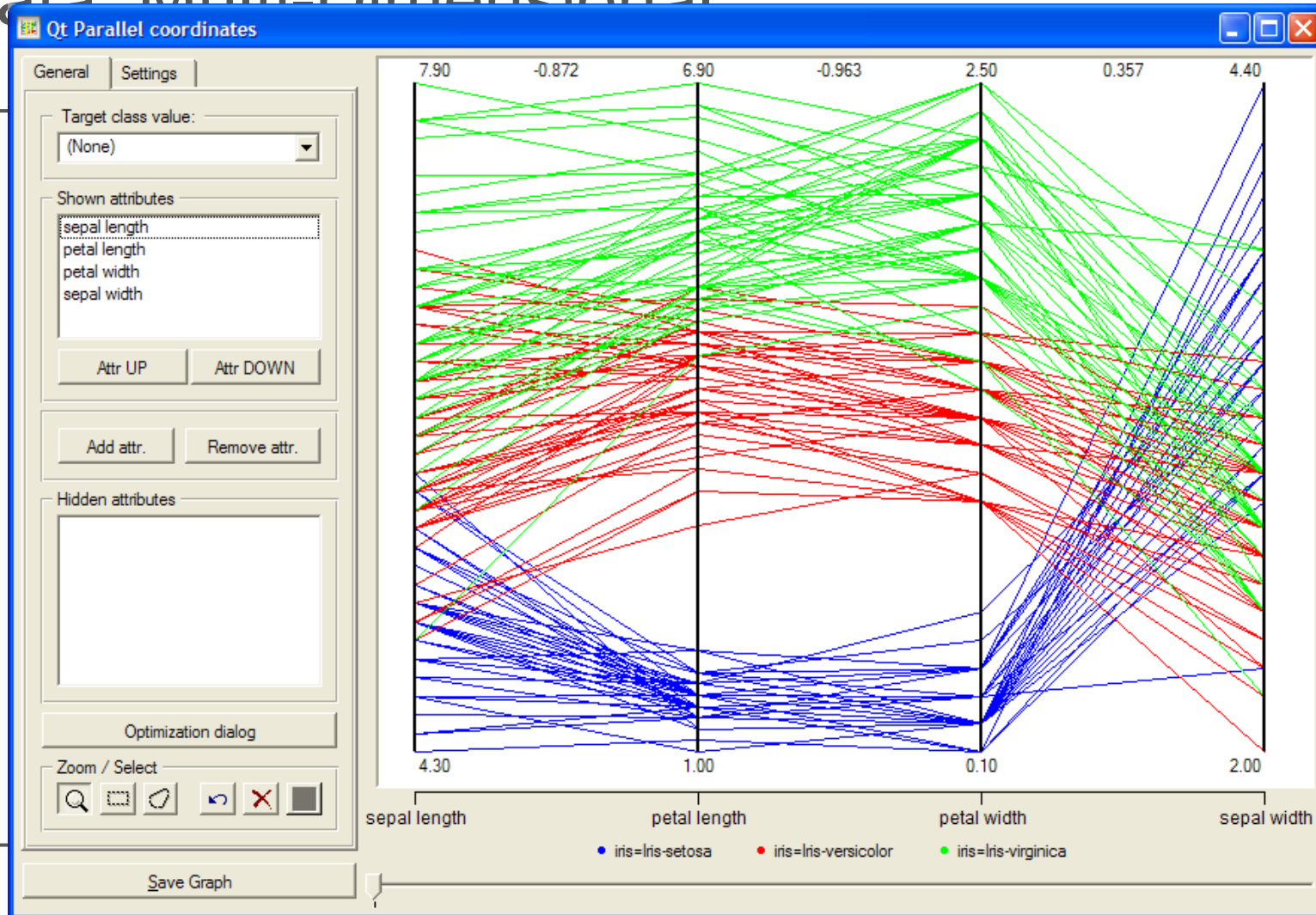
MineSet's Map Visualizer.

Classification

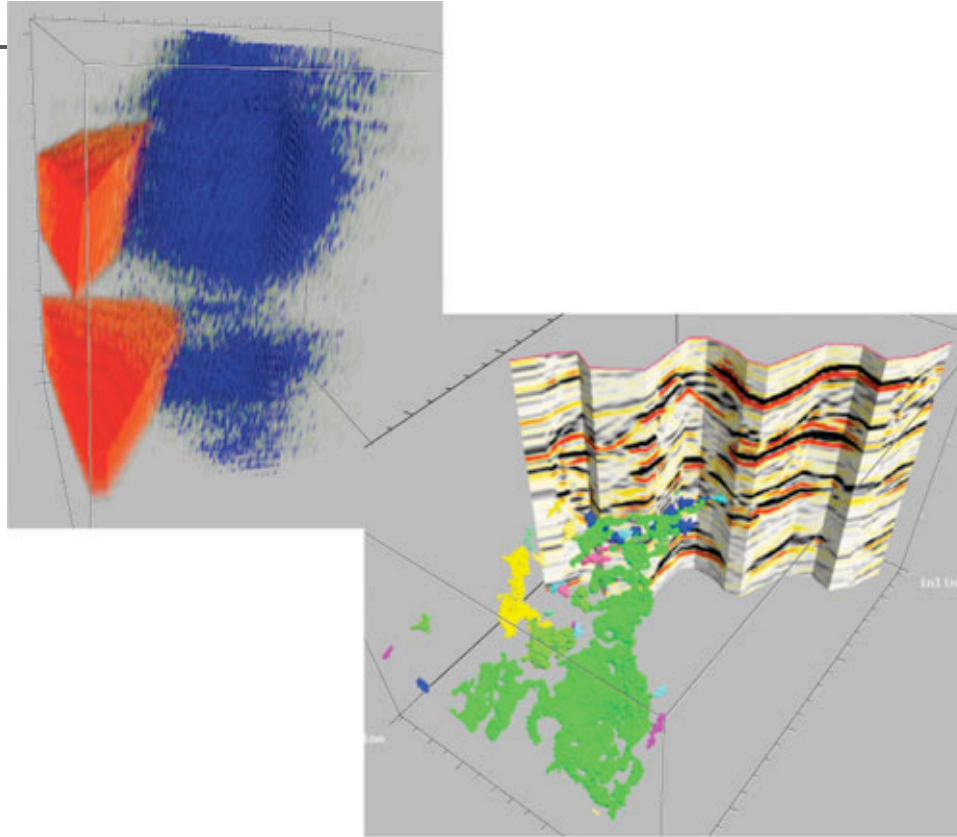
D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



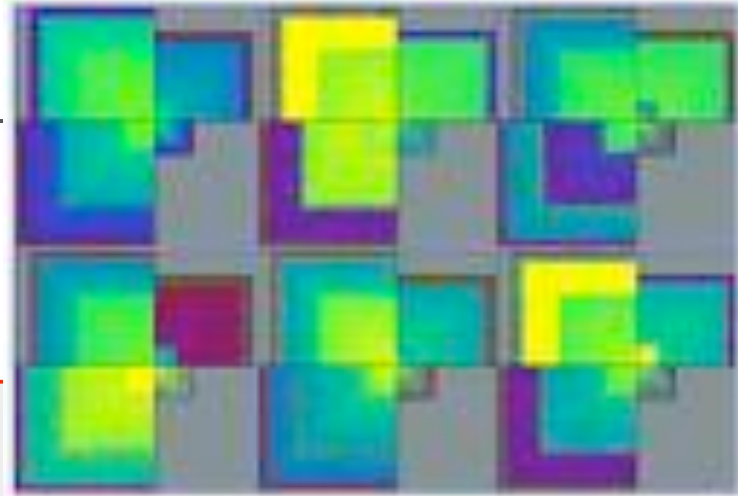
Data: Multi-Dimensional



Data: Multi-Dimensional

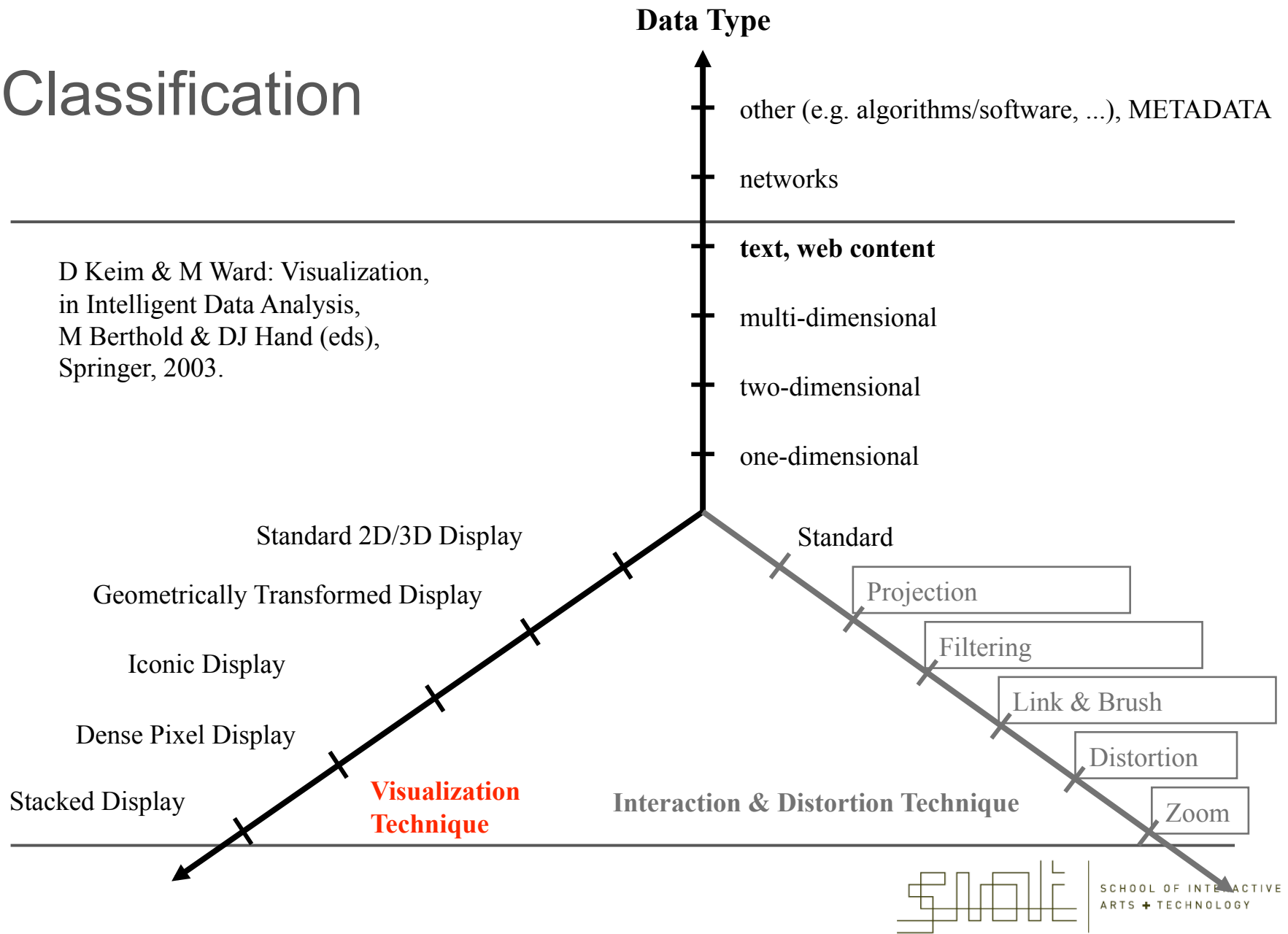


Data: Multi-Dimensional

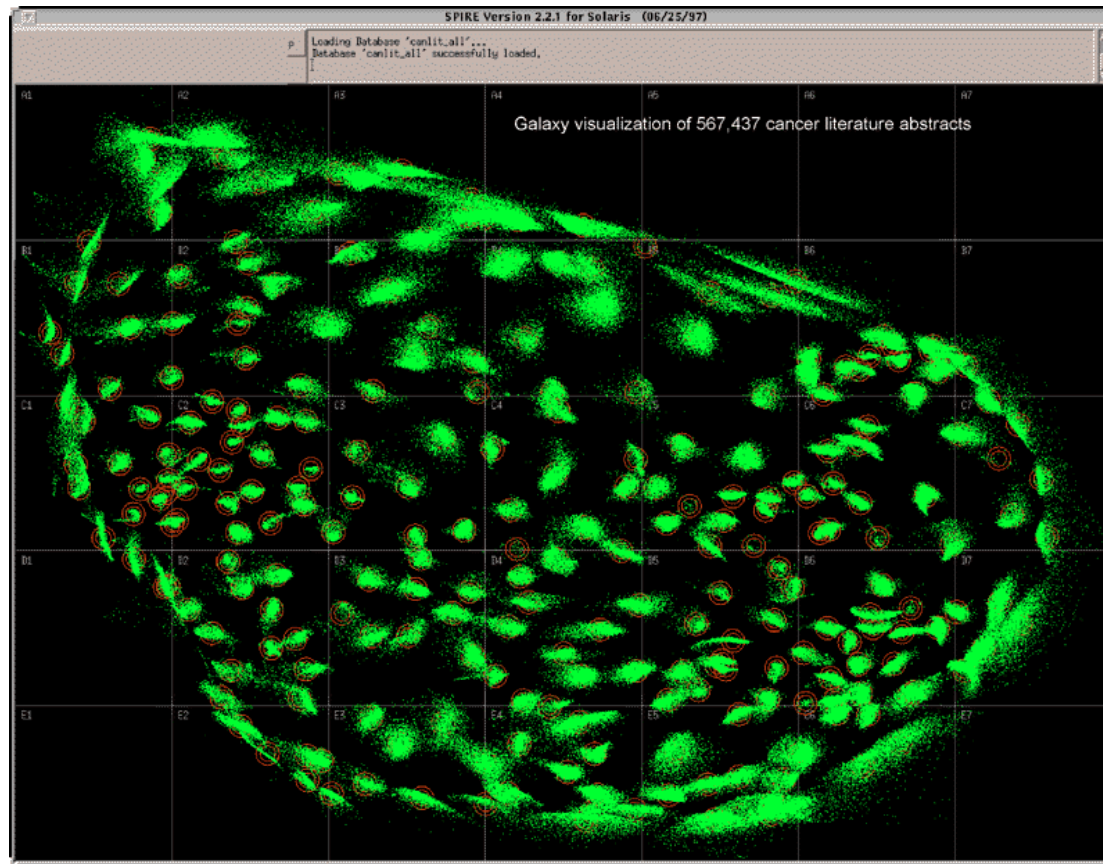


Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



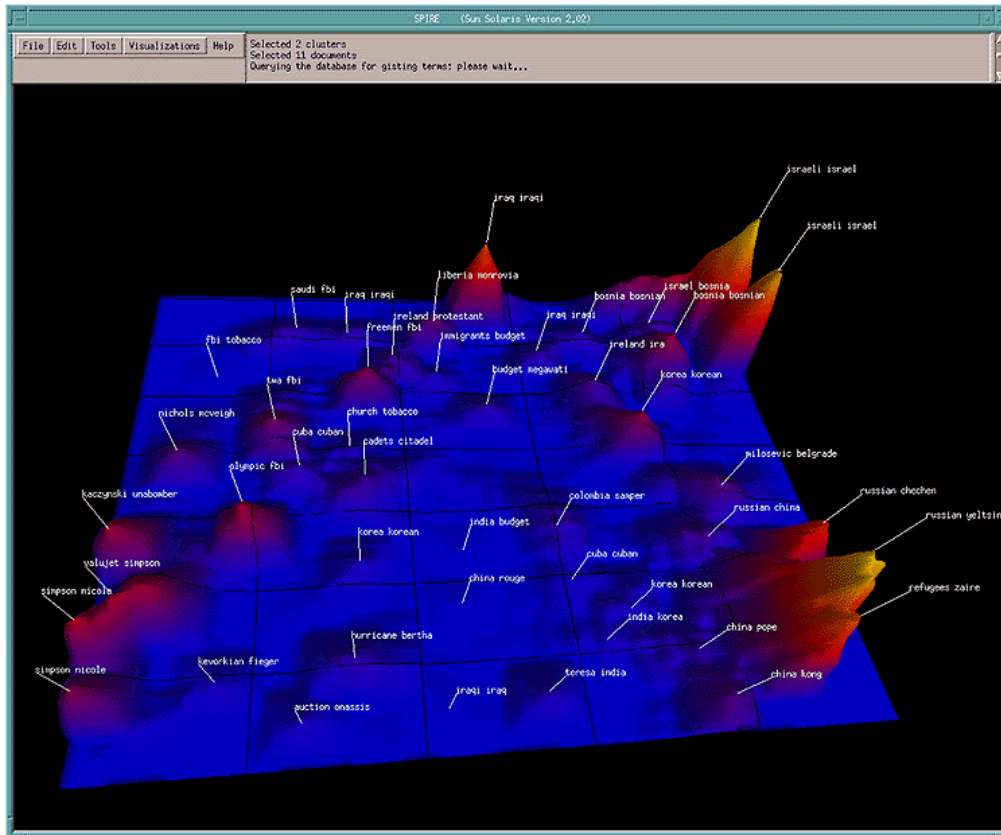
Data: Text



- Galaxies visualization
- Uses the “night sky” visualization to represent a set of documents
- One document – one star
- Stars clustered together represent related documents
- Includes analytical tools to investigate groups and time-based trends, query contents

From Inspire (TM) Software, see
www.pnl.gov/infoviz/technologies.html

Data: Text

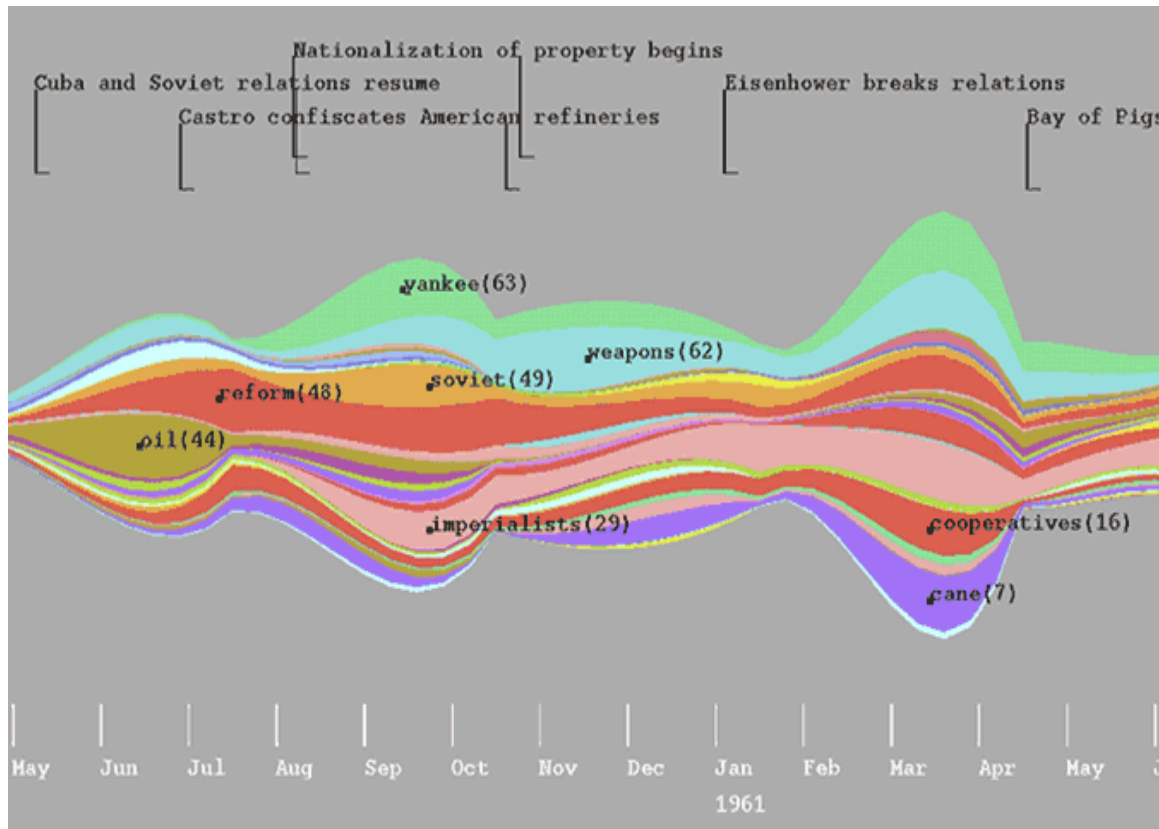


ThemeView (TM)

- Topics or themes of text documents shown in relief map of a natural terrain
- The height of a peak relates to the strength of the topic

From Inspire (TM) Software, see
www.pnl.gov/infoviz/technologies.html

Data: Text



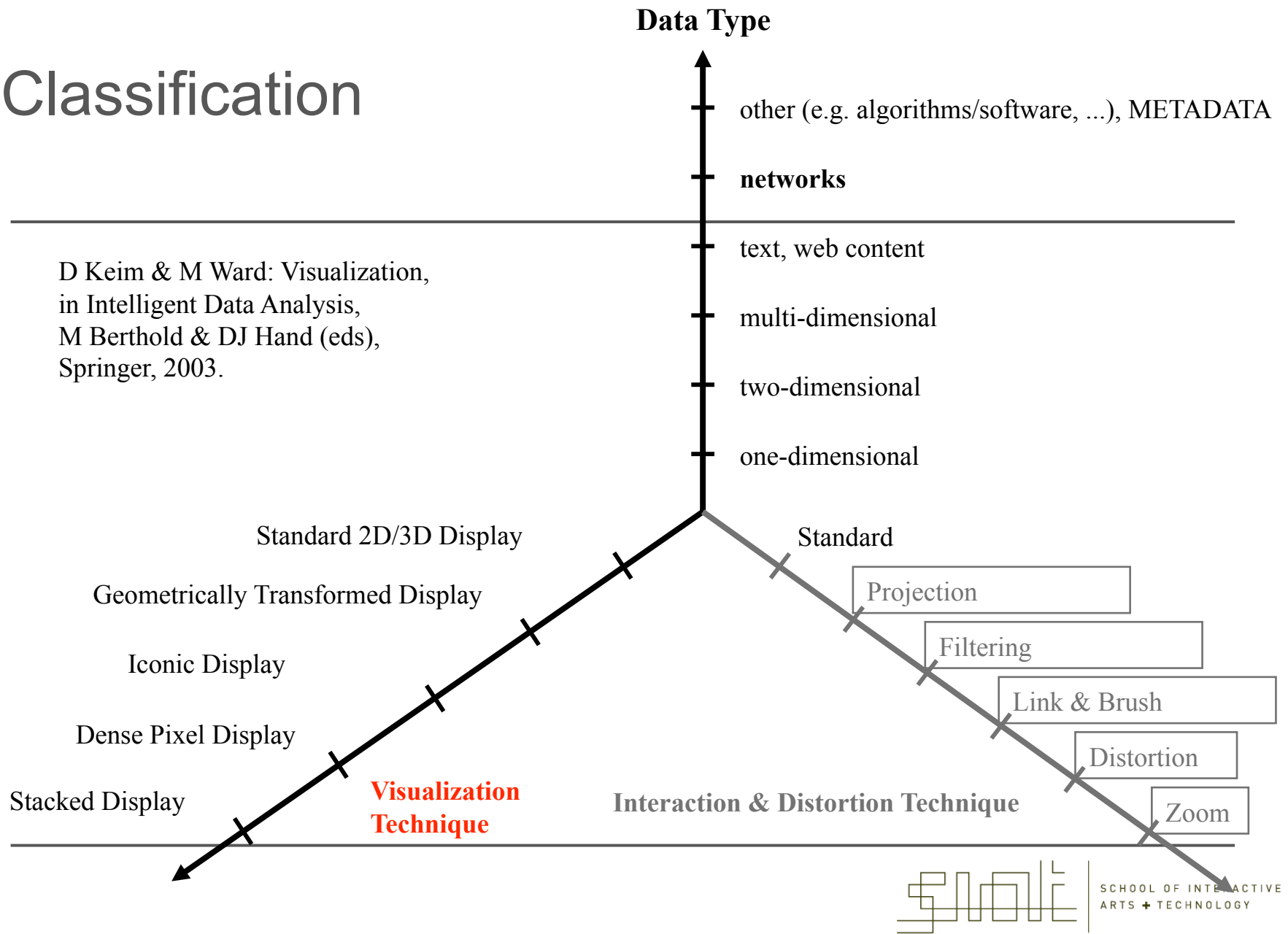
Theme River (TM)

- Identification of time related trends and patterns
- Themes represented as colored streams
- The width of the stream relates to the collective strength of a theme

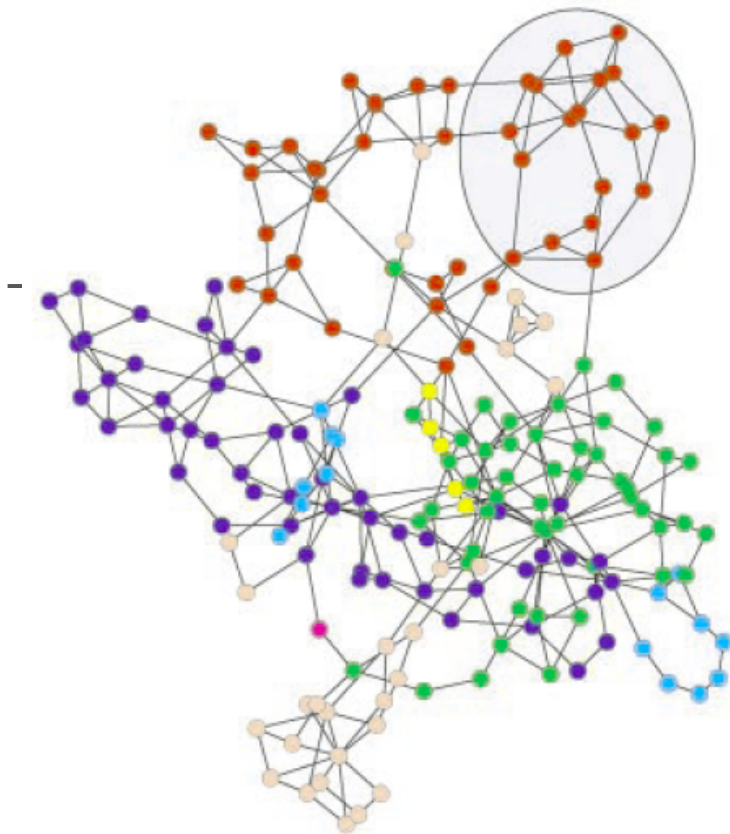
From Inspire (TM) Software, see
www.pnl.gov/infoviz/technologies.html

Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.

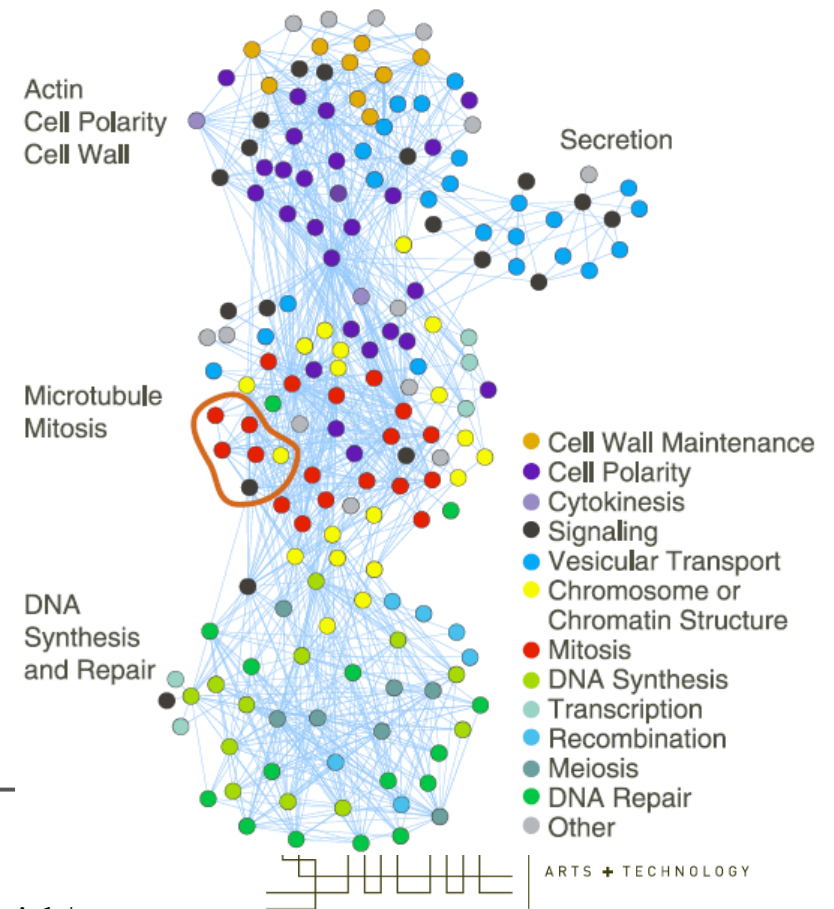


Data: Networks



E. coli metabolic network (colors denote predominant biochemical class of metabolites)
Ravasz et al., Science 297, 30 Aug 2002.

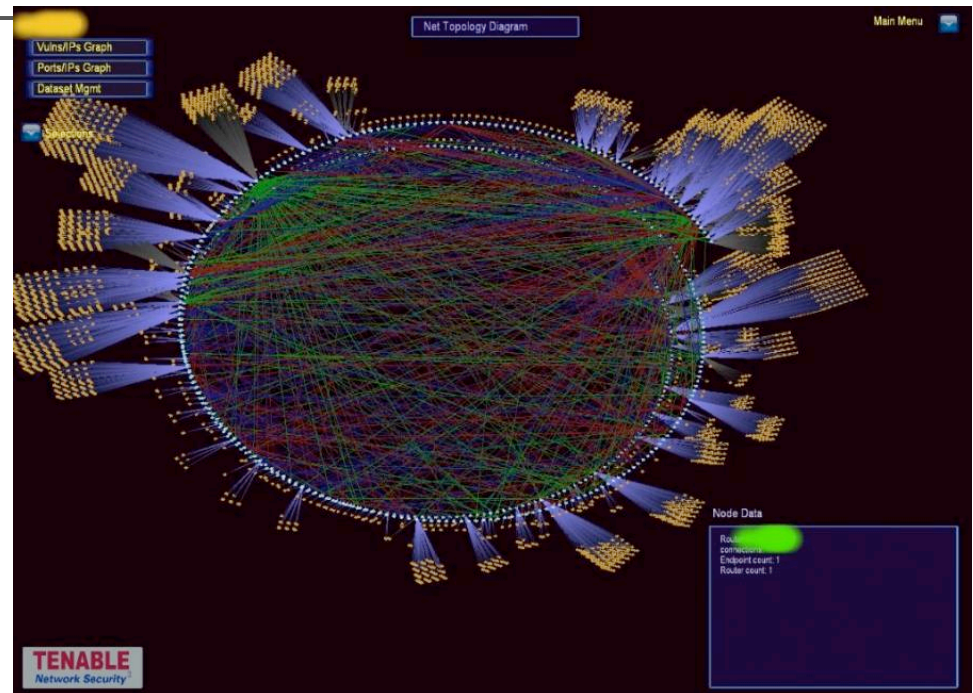
S. cerevisiae gene interaction network
Tong et al., Science 303, 6 Feb 2004.



Data: Networks

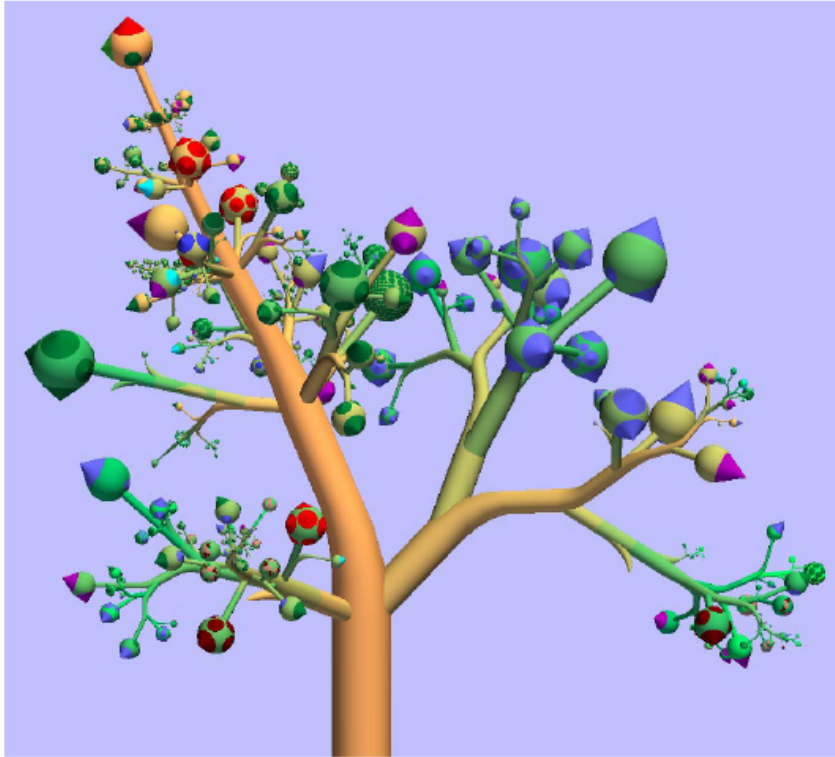
Topology

- What's connected to what
- Strength/nature of relationship
- Balance

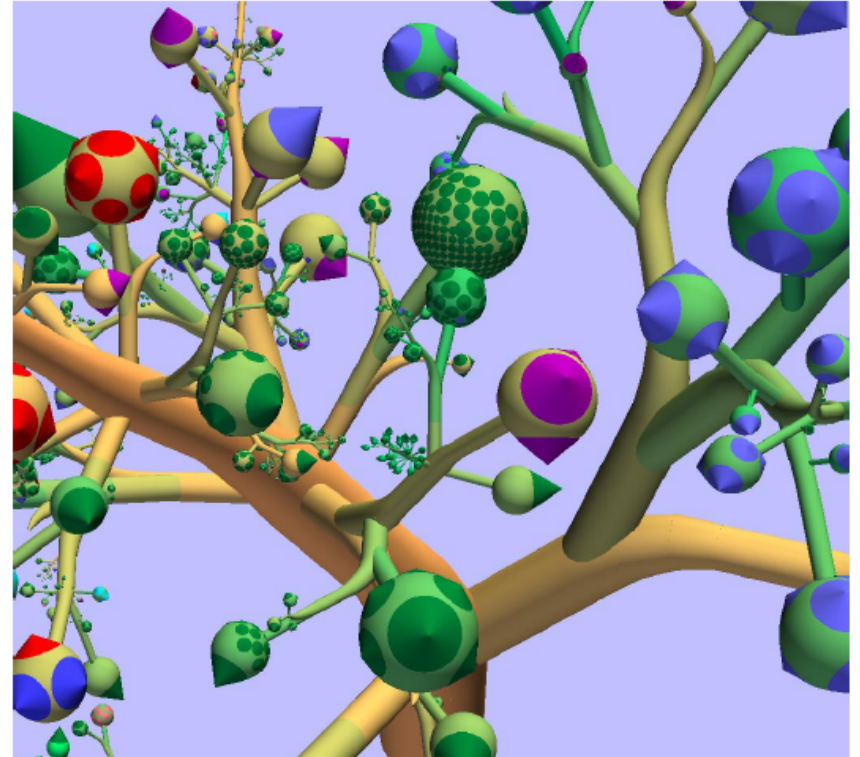


Tenable Network Security's [Security Center](#)

Data: Tree Hierarchies



Unix home directory

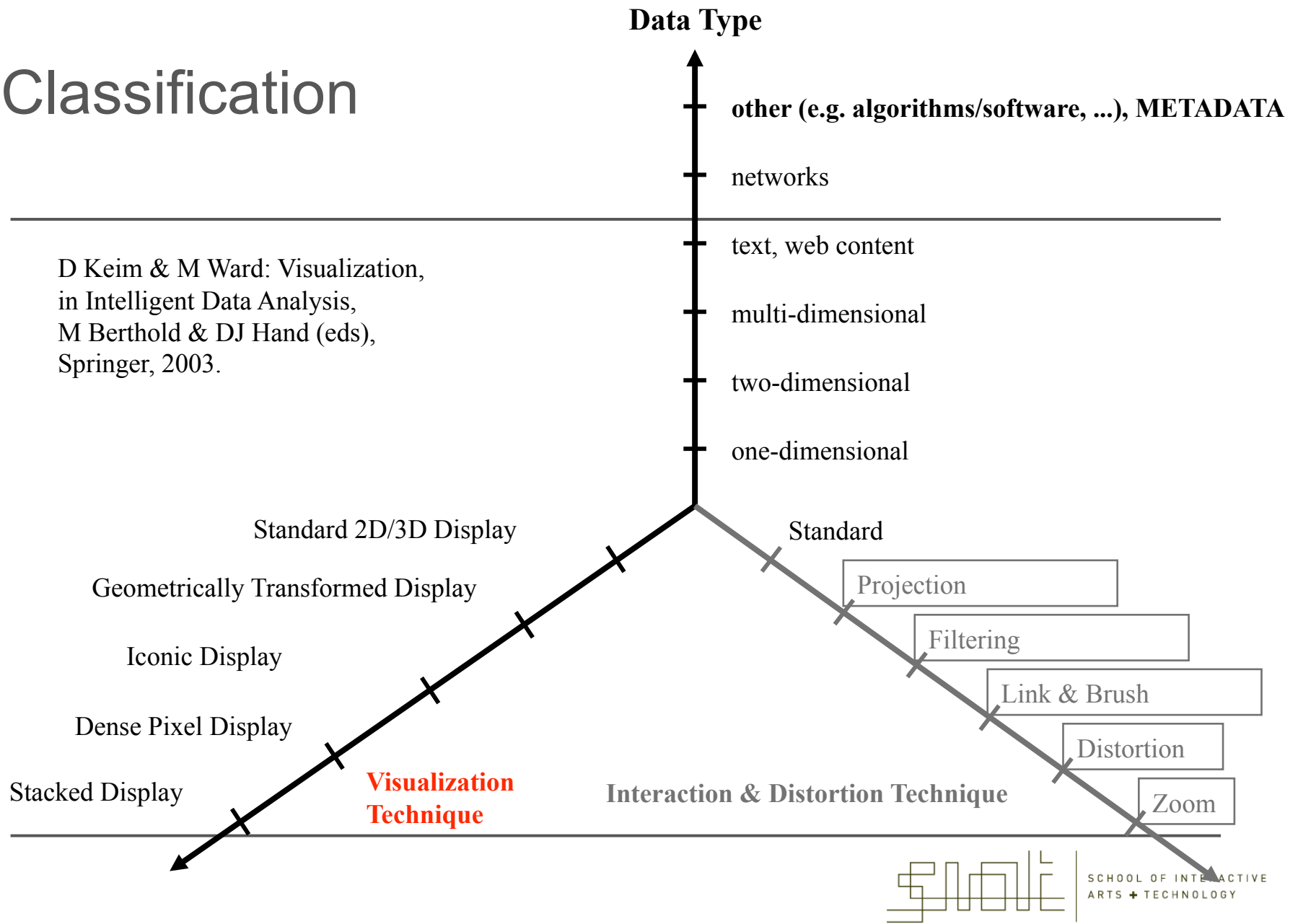


Selected detail

Kleiberg *et al.*: Botanic Visualization of Huge Hierarchies, In InfoVis, 2001.

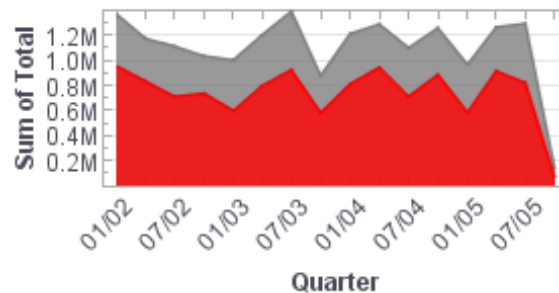
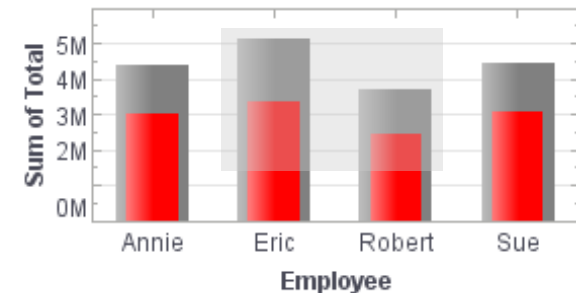
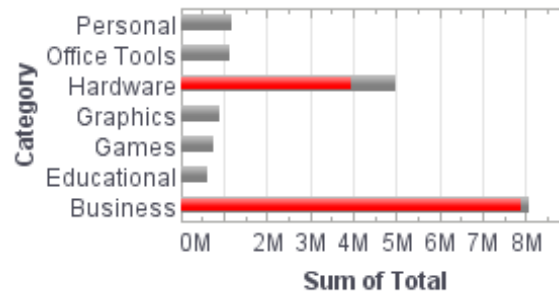
Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



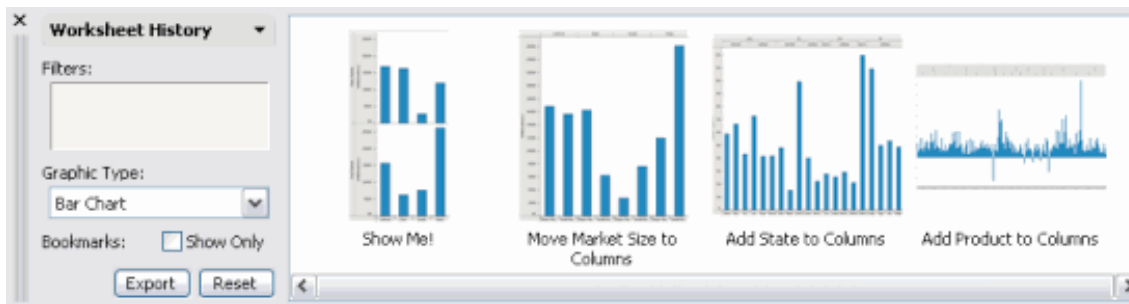
Data: Metadata

- Brushing
- Uncertainty
- History
- Navigation



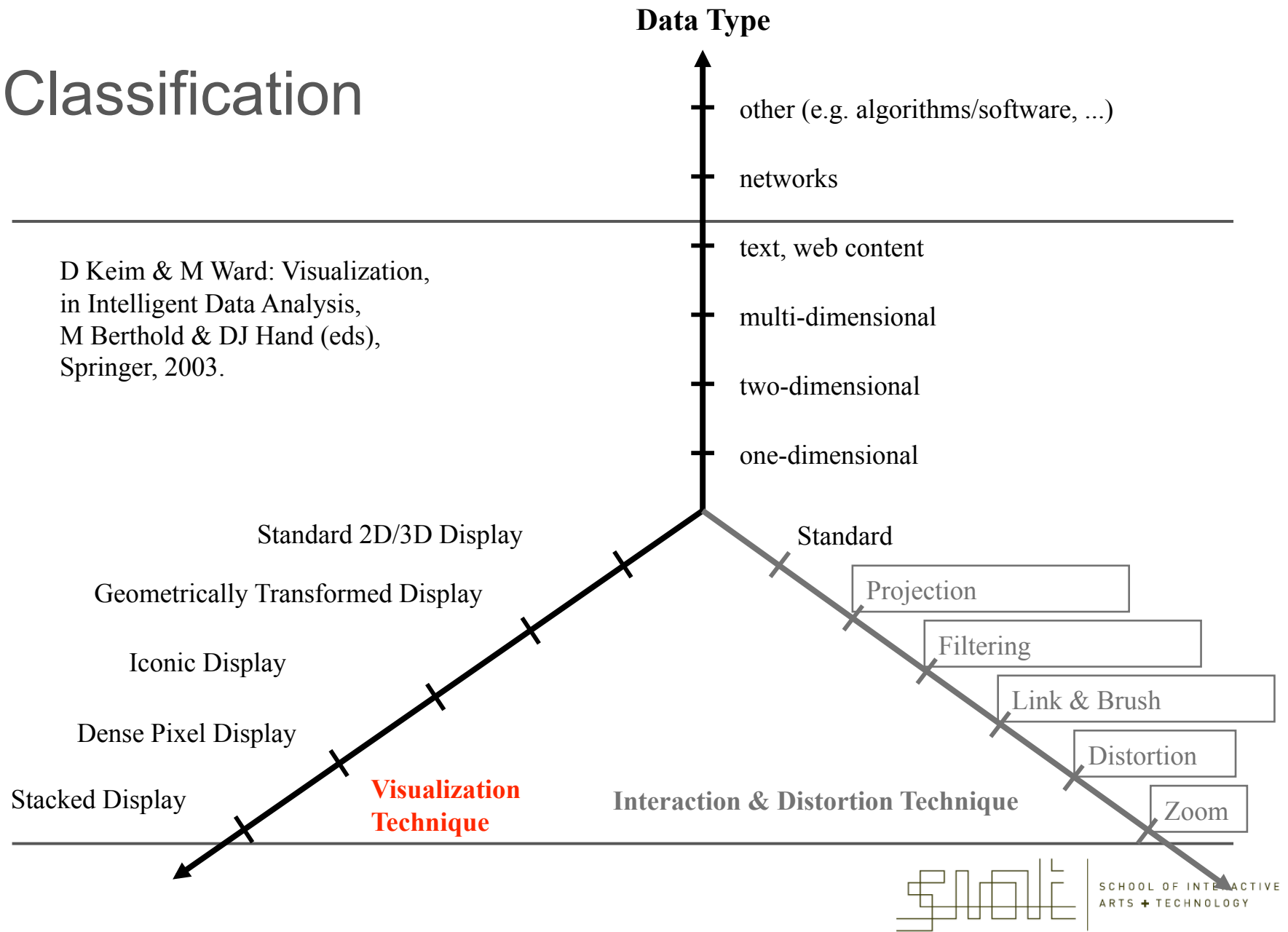
Data: Metadata

- History
- Navigation



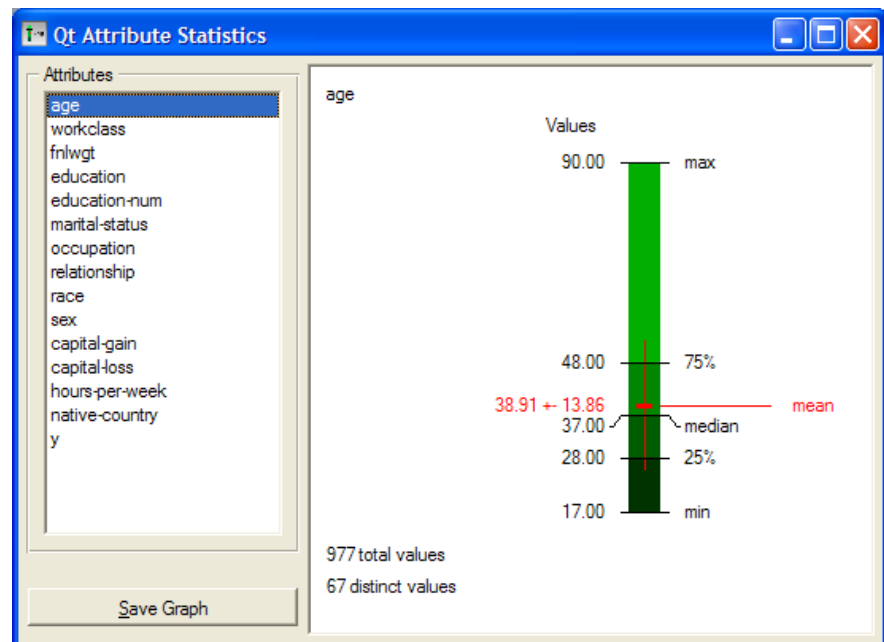
Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



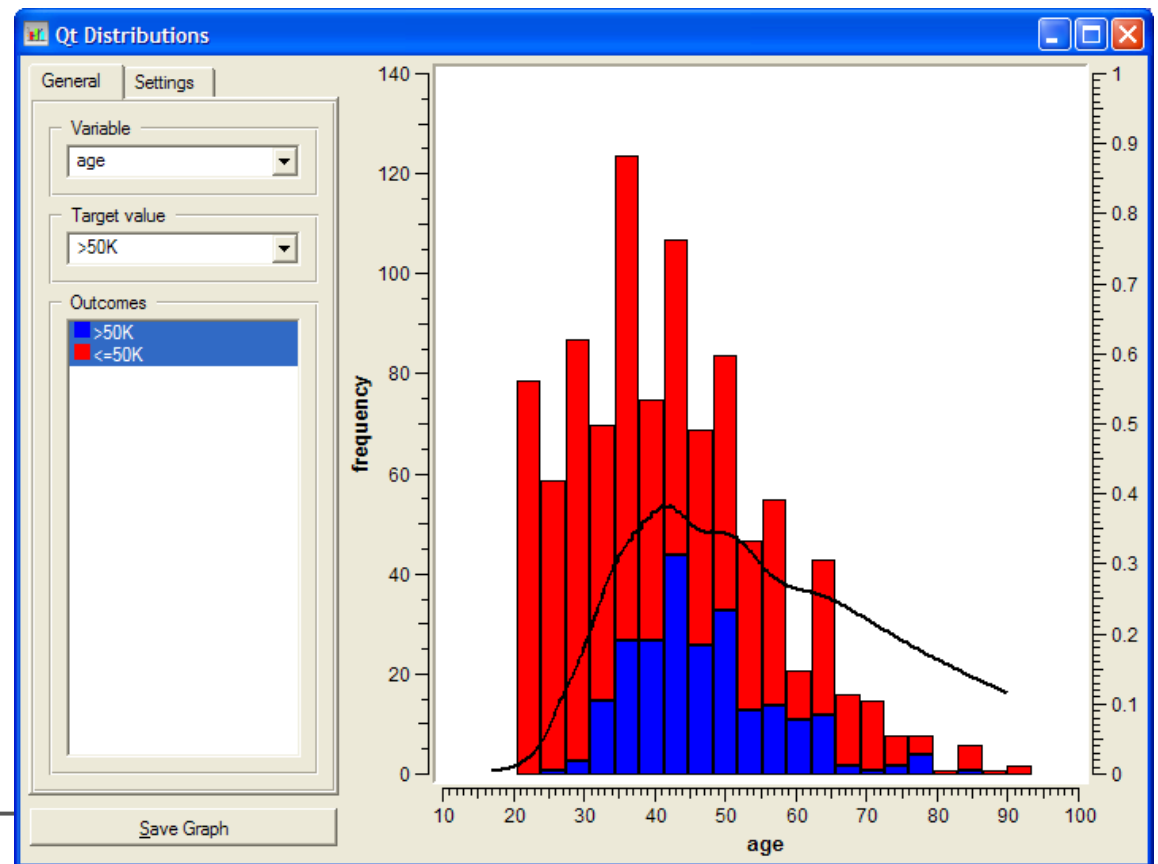
Standard 2D/3D

- x-y (x-y-z) plots
- bar charts
- line graphs
- histograms
- maps



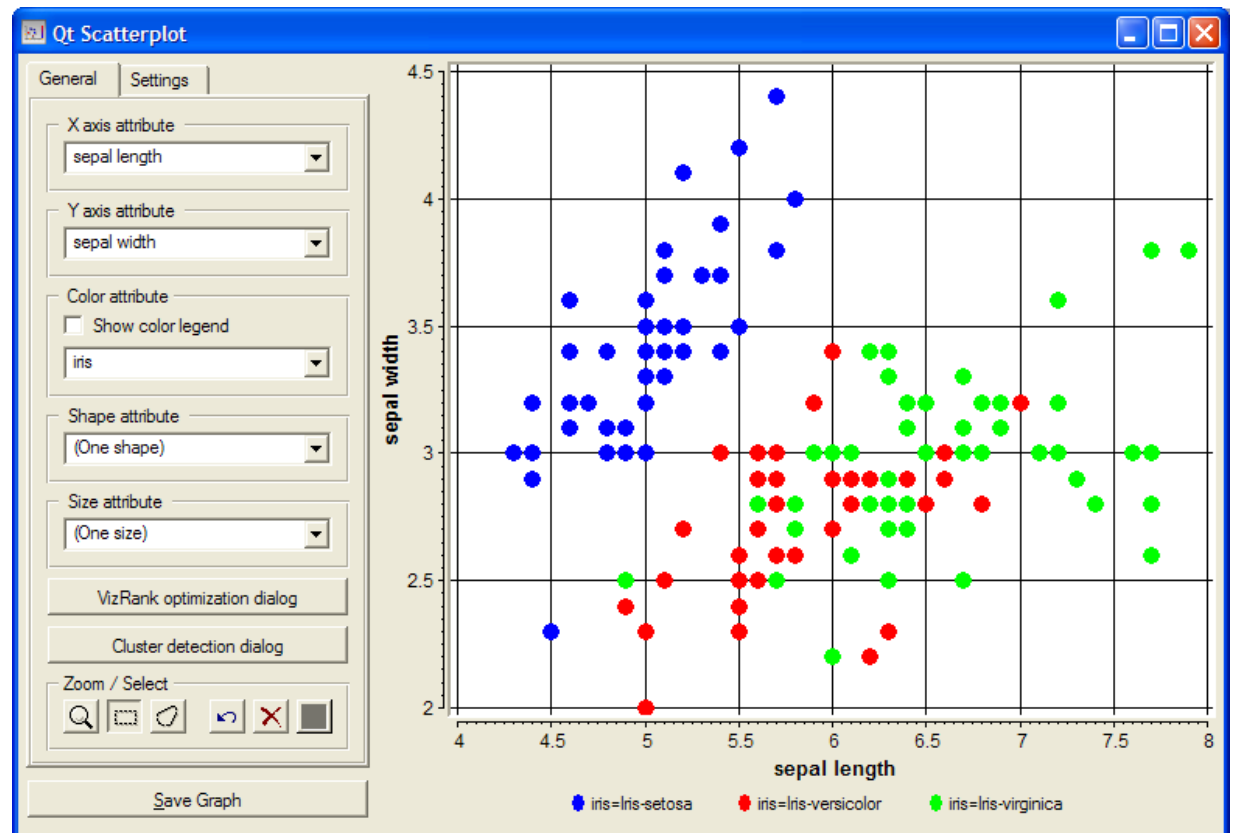
Standard 2D/3D

- x-y (x-y-z) plots
- bar charts
- line graphs
- histograms
- maps



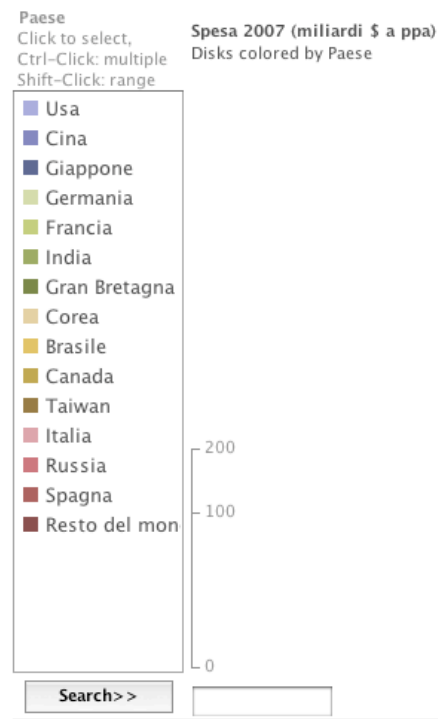
Standard 2D/3D

- x-y (x-y-z) plots
- bar charts
- line graphs
- histograms
- maps



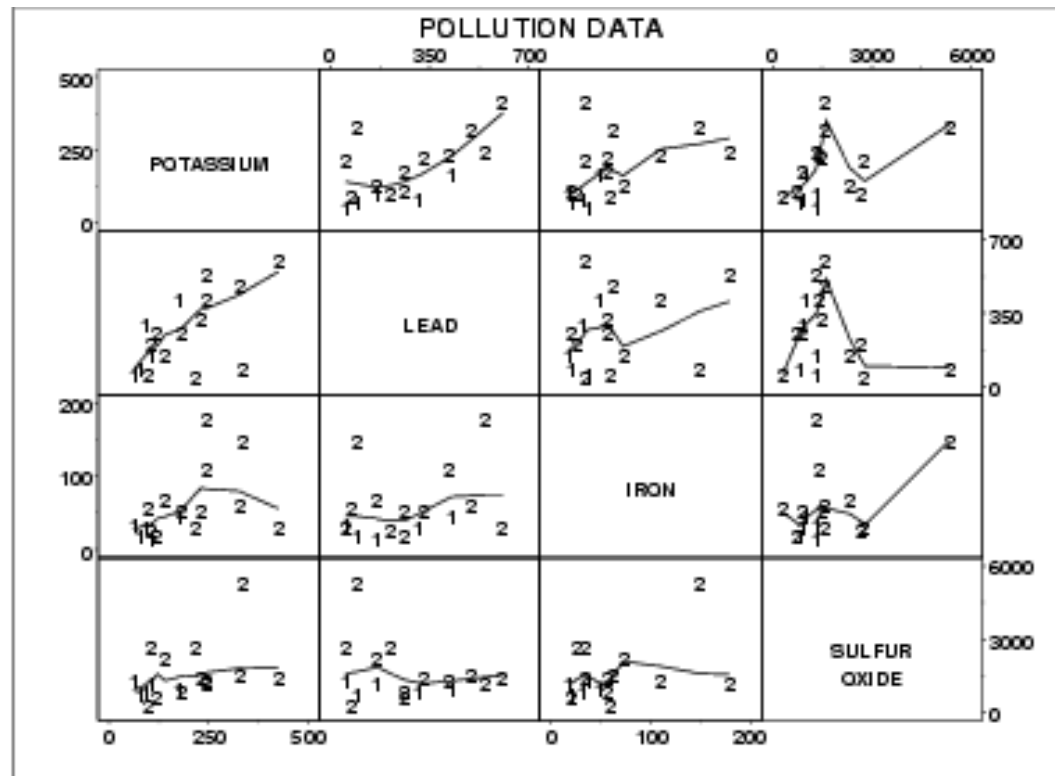
Standard 2D/3D

- x-y (x-y-z) plots
- bar charts
- line graphs
- Bubble charts
- histograms
- maps



Geometrically Transformed Displays

- includes several classes of visualizations
- projection pursuit, finding “interesting transformations” of multi-dim data set
- scatterplot matrix
- parallel coordinates



Geometrically Transformed I

- Parallel coordinates

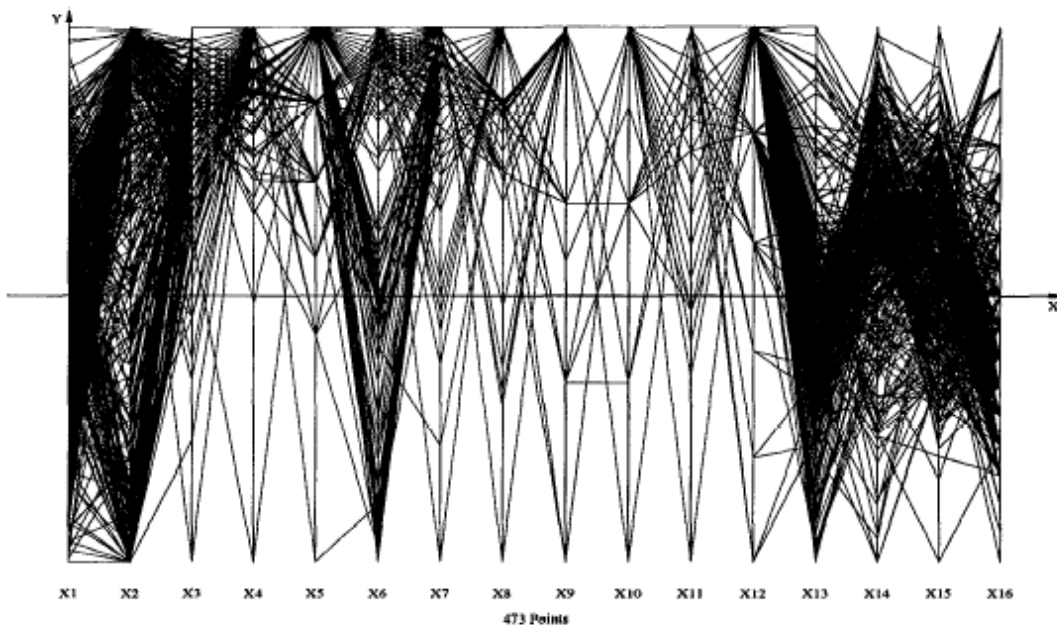


Figure 1: The full dataset consisting of 473 batches

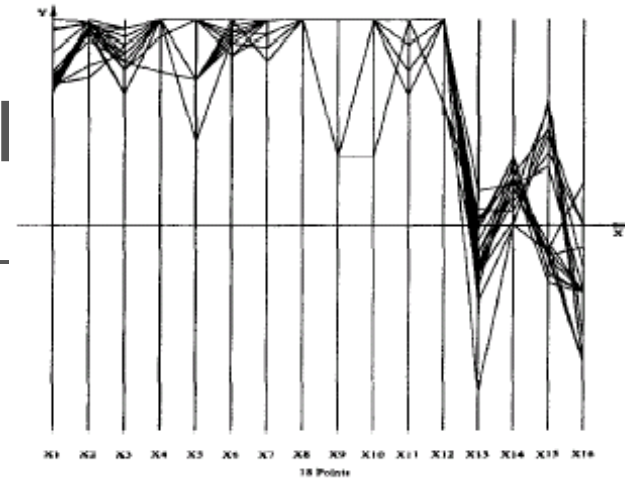


Figure 2: The batches high in Yield, X1, and Quality, X2.

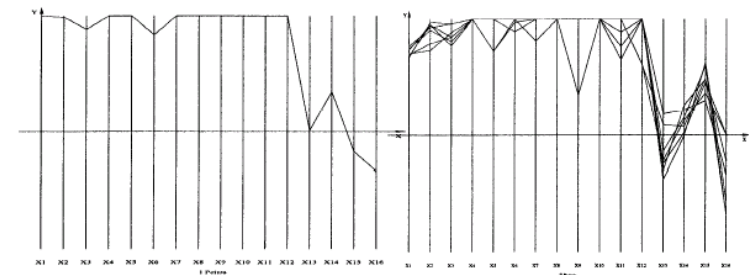
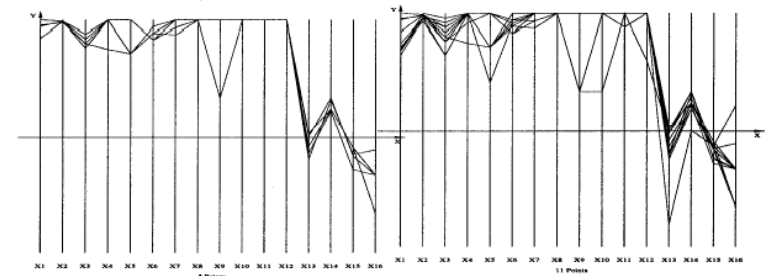
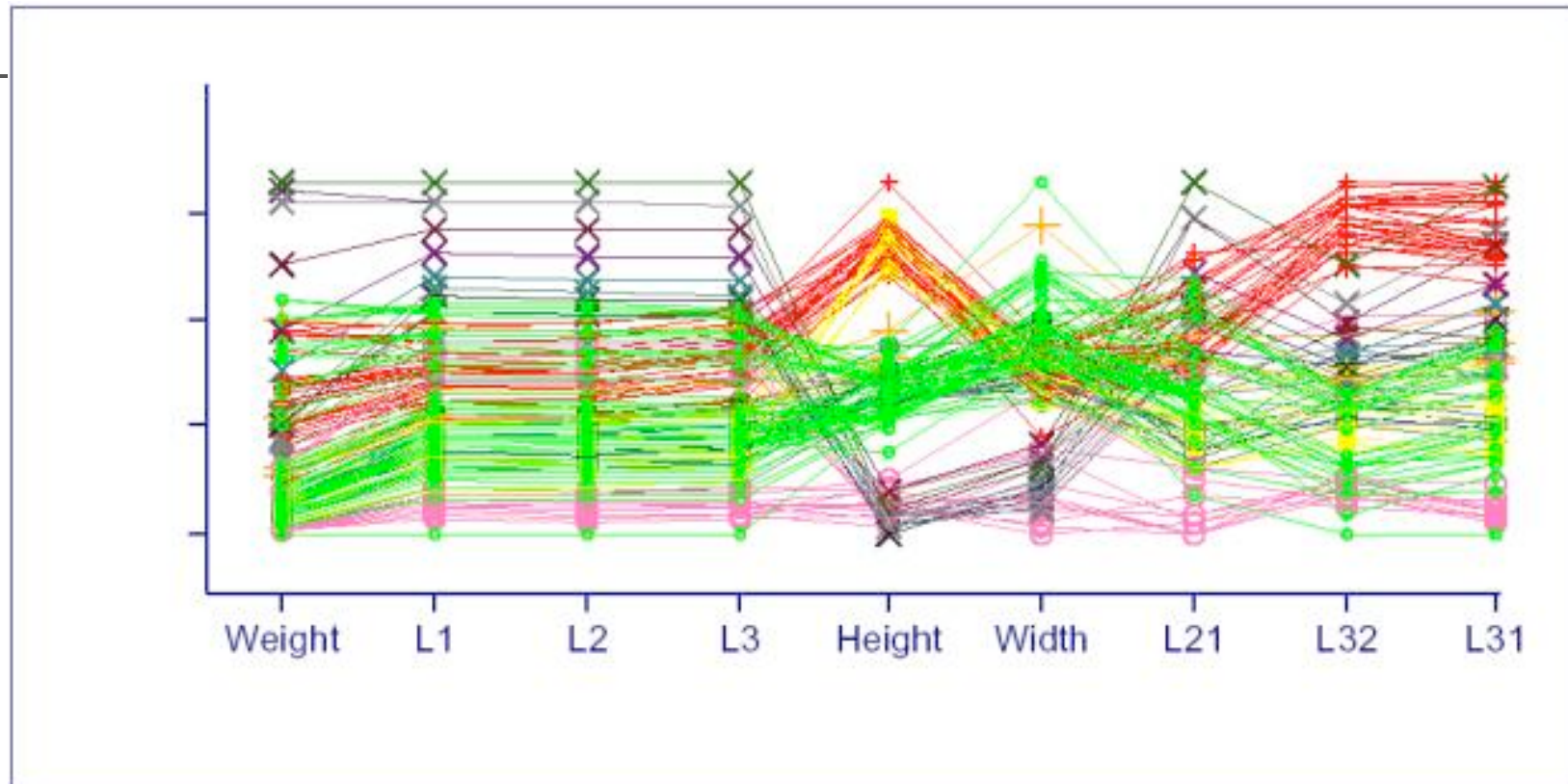


Figure 5: The best batch. Highest in Yield, X1, and very high in Quality, X2.

Figure 7: Upper range of split in X15

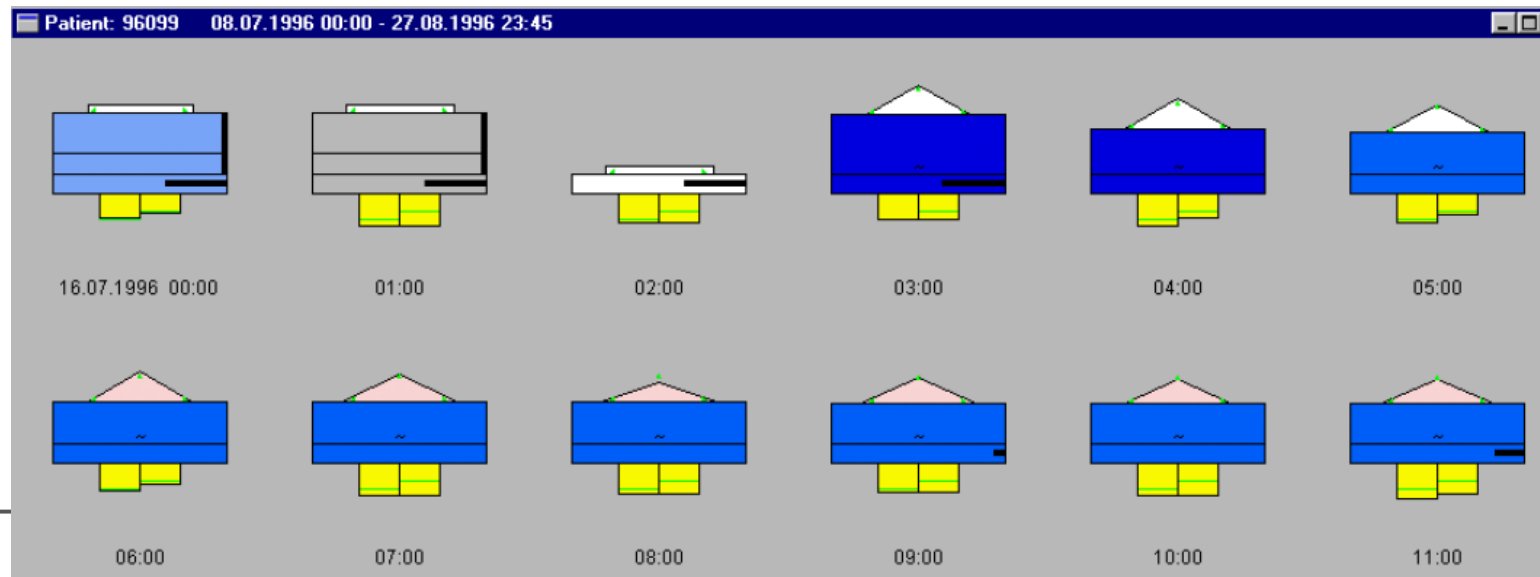
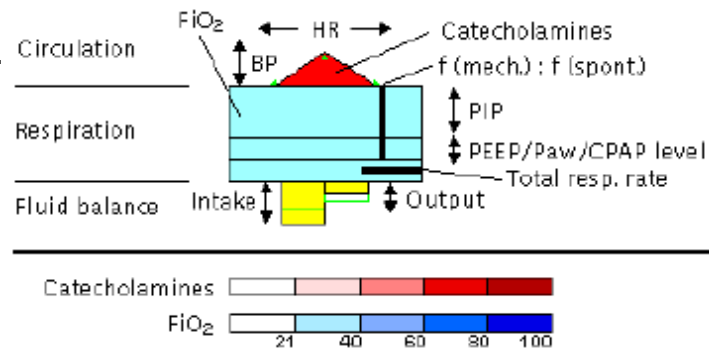


Parallel Coordinates



<http://www.evl.uic.edu/aej/526/kyoung/Training-parallelcoordinate.html>

Iconic Displays

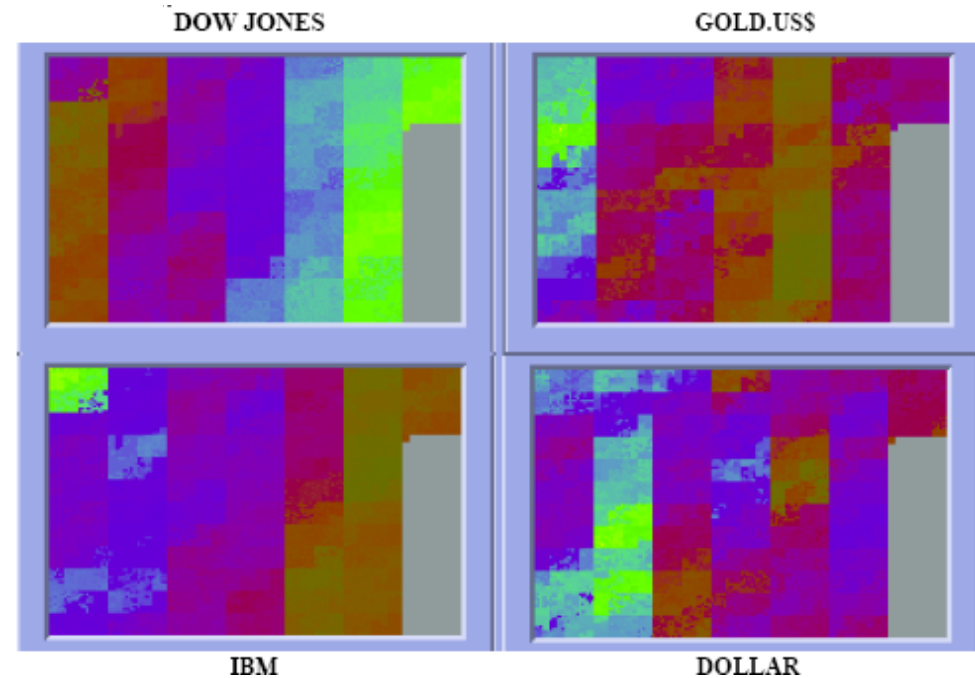
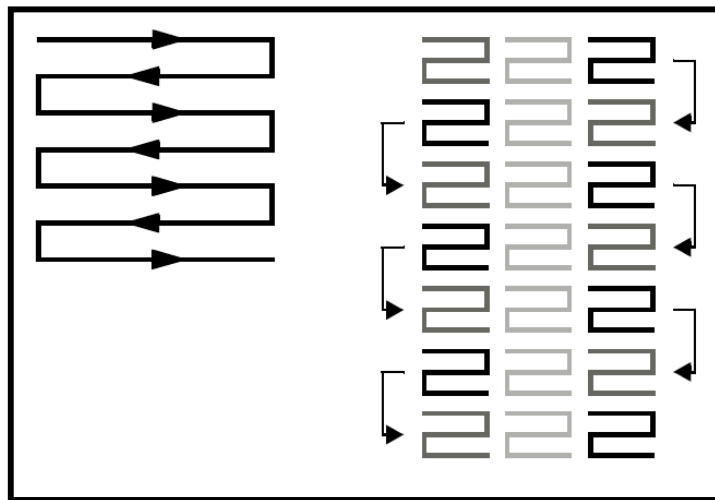


W Horn *et al.*: Metaphor graphics to visualize ICU data over time, In IDAMAP 1998.



INTERACTIVE
ARTS + TECHNOLOGY

Dense Pixel Displays

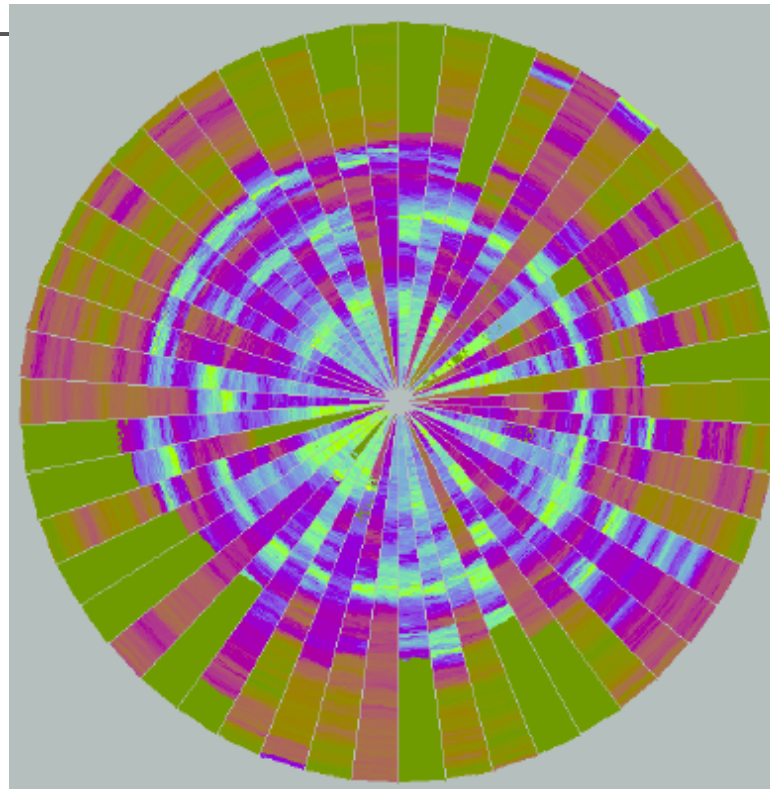
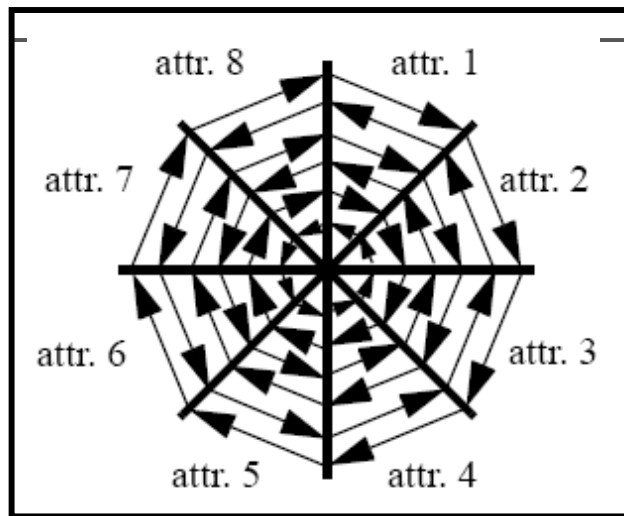


DA Keim *et al.*: Recursive Pattern: A technique for visualizing very large amounts of data
Proc. Visualization 95, pages 279-286, 1995.



SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

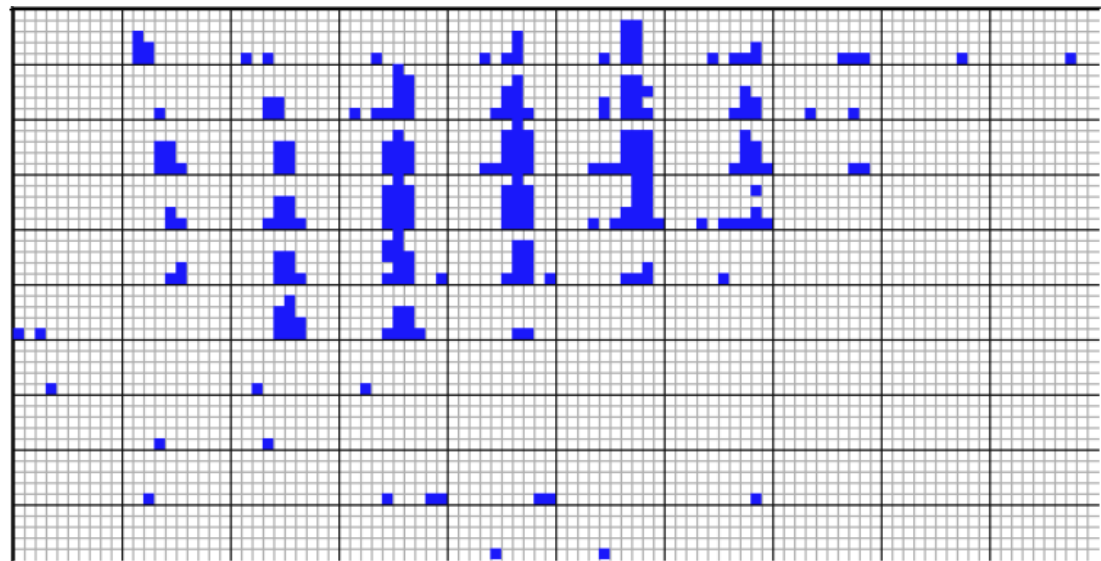
Dense Pixel Displays



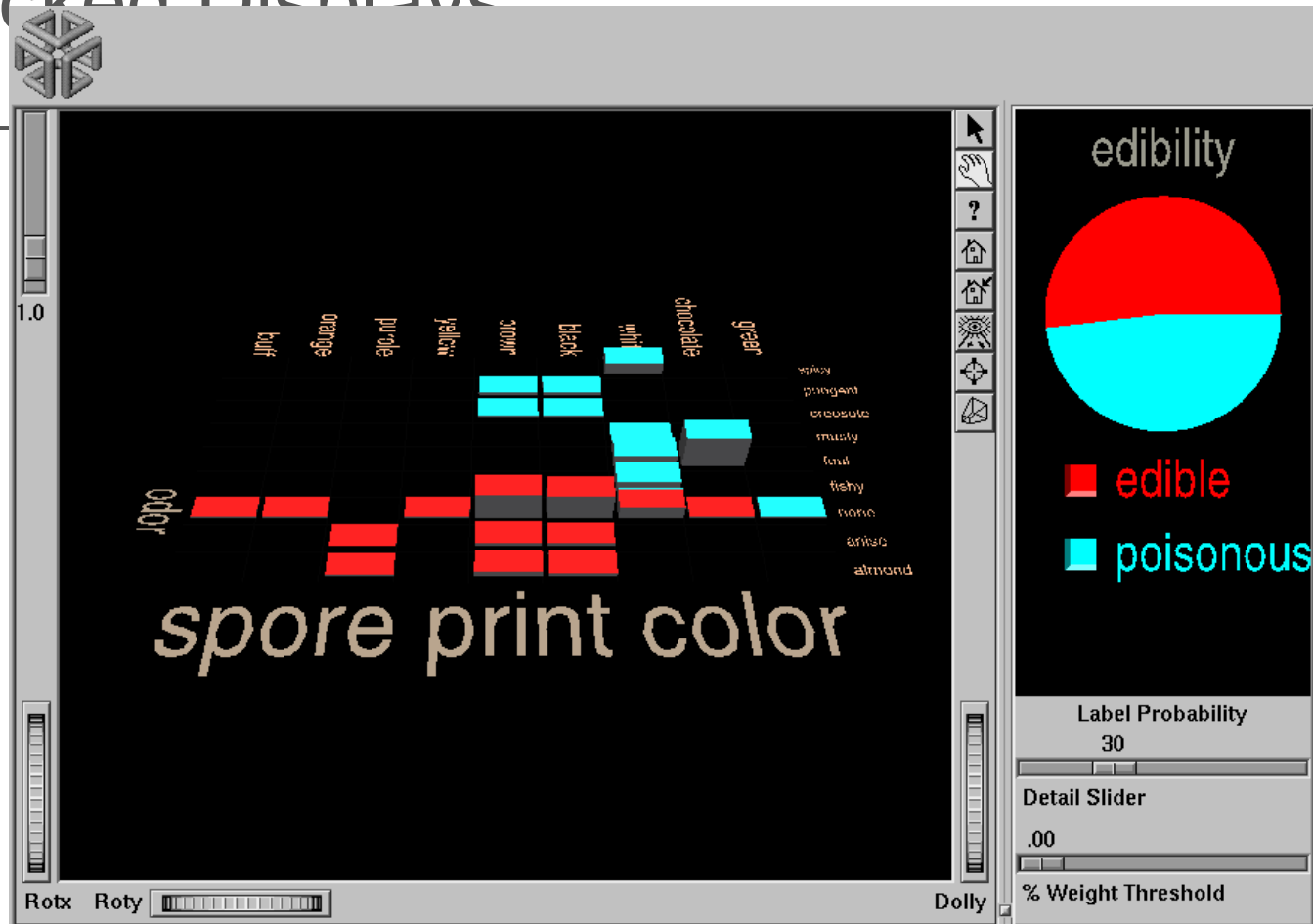
Ankerst *et al.*: Circle Segments: A technique for visually exploring large multidimensional data sets.
In Proc. Visualization 96, Hot Topic Session, 1996.

Stacked Displays

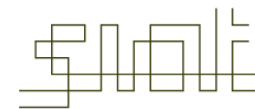
- an example is dimensional stacking
- embed one coordinate system within the other
- e.g. two attributes in one system, then another two when drilling down



Stacked Displays

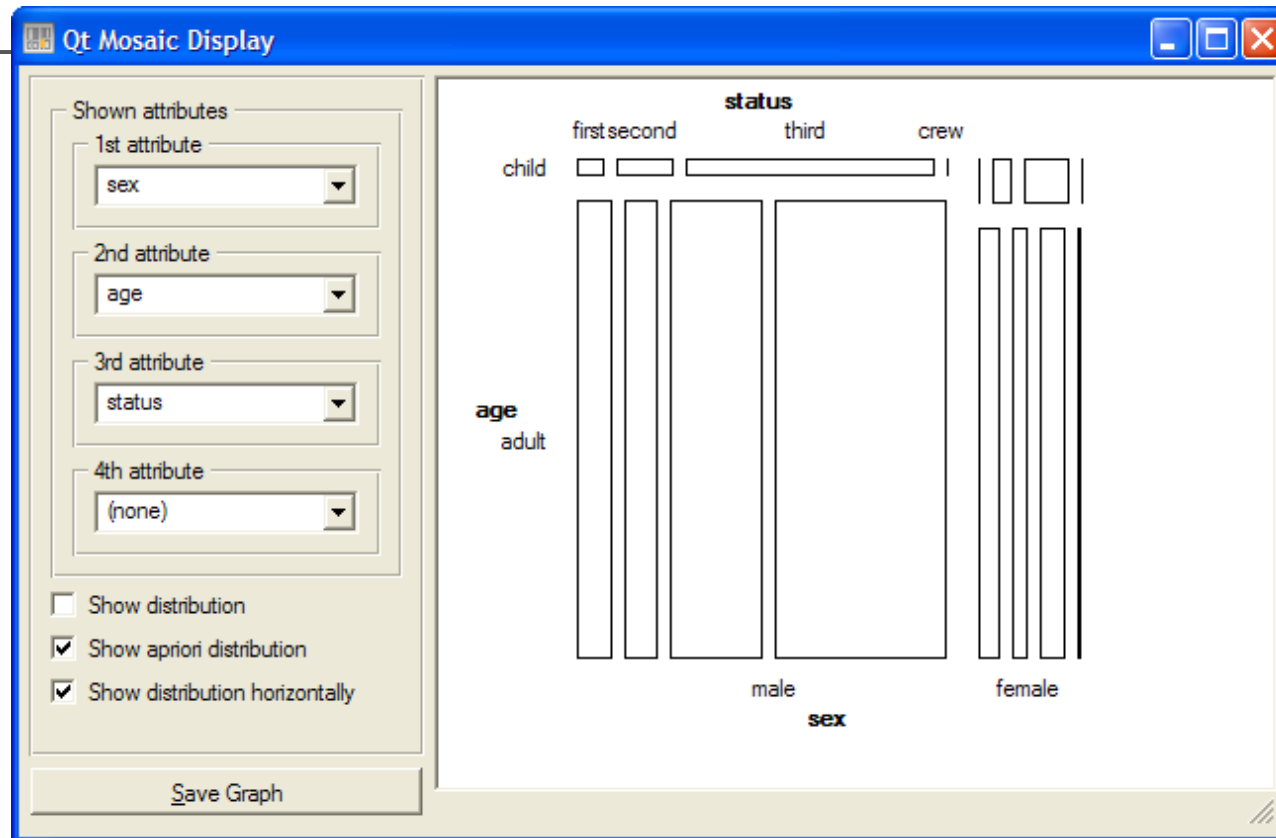


Decision table visualization from SGI's MineSet



SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

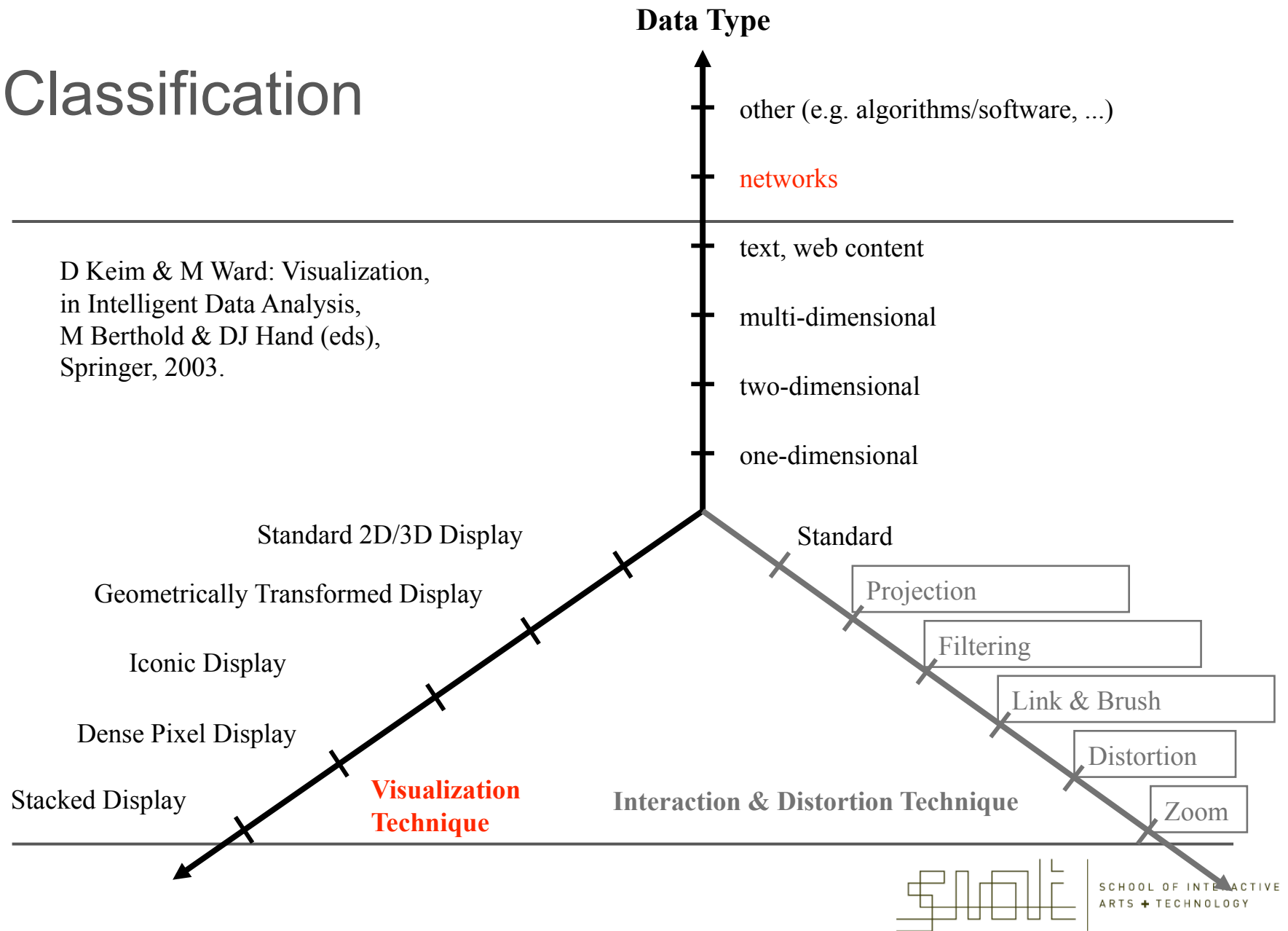
Stacked Displays



Mosaic display in Orange.

Classification

D Keim & M Ward: Visualization,
in Intelligent Data Analysis,
M Berthold & DJ Hand (eds),
Springer, 2003.



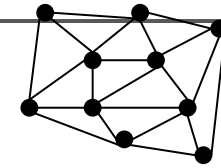
Visualizing Networks

- Networks/graphs vs trees
- Algorithms for network layout
- Multidimensional networks
- New toolkits

Graph and Tree Data Structures

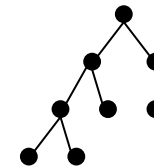
- **Graphs:**

- Representations of structured, connected data
- Consist of a set of **nodes** (data) and a set of **edges** (relations)
- Edges can be **directed** or **undirected**



- **Trees:**

- Graphs with a specific structure
 - connected graph with $n-1$ edges
- Representations of data with natural hierarchy
- Nodes are either **parents** or **children**



When is Graph Visualization Applicable?

- Ask the question: *is there an inherent relation among the data elements to be visualized?*
 - If YES – then the data can be represented by nodes of a graph, with edges representing the relations.
 - If NO – then the data elements are “unstructured” and goal is to use visualization to analyze and discover relationships among data.

Source: Herman, Graph Visualization and Navigation in Information Visualization: a Survey

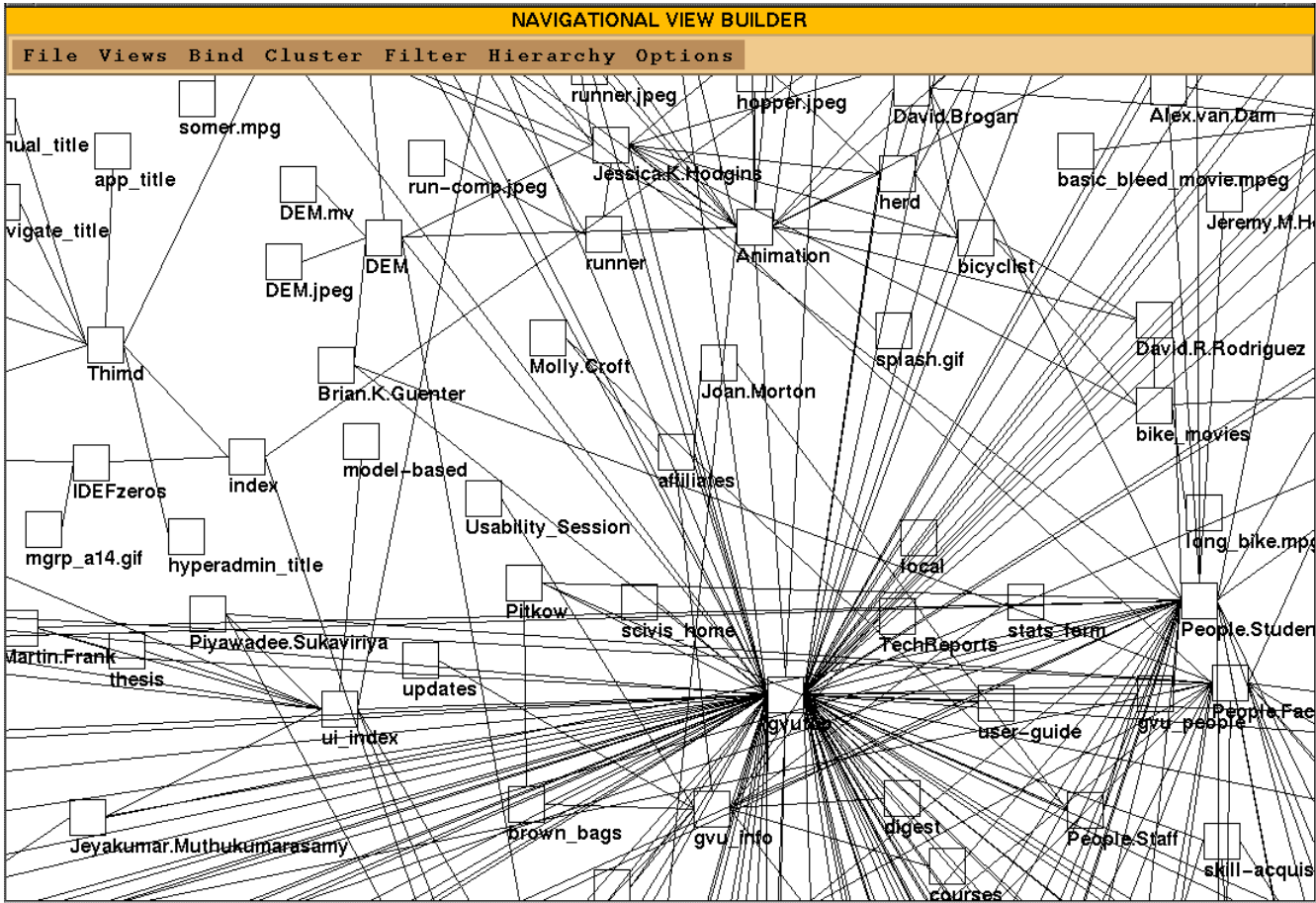
Common Applications

- Process Visualization (e.g., Visio)
- Dependency Graphs
- Biological Interactions (Genes, Proteins)
- Computer Networks
- Social Networks
- Simulation and Modeling

Graph Layout

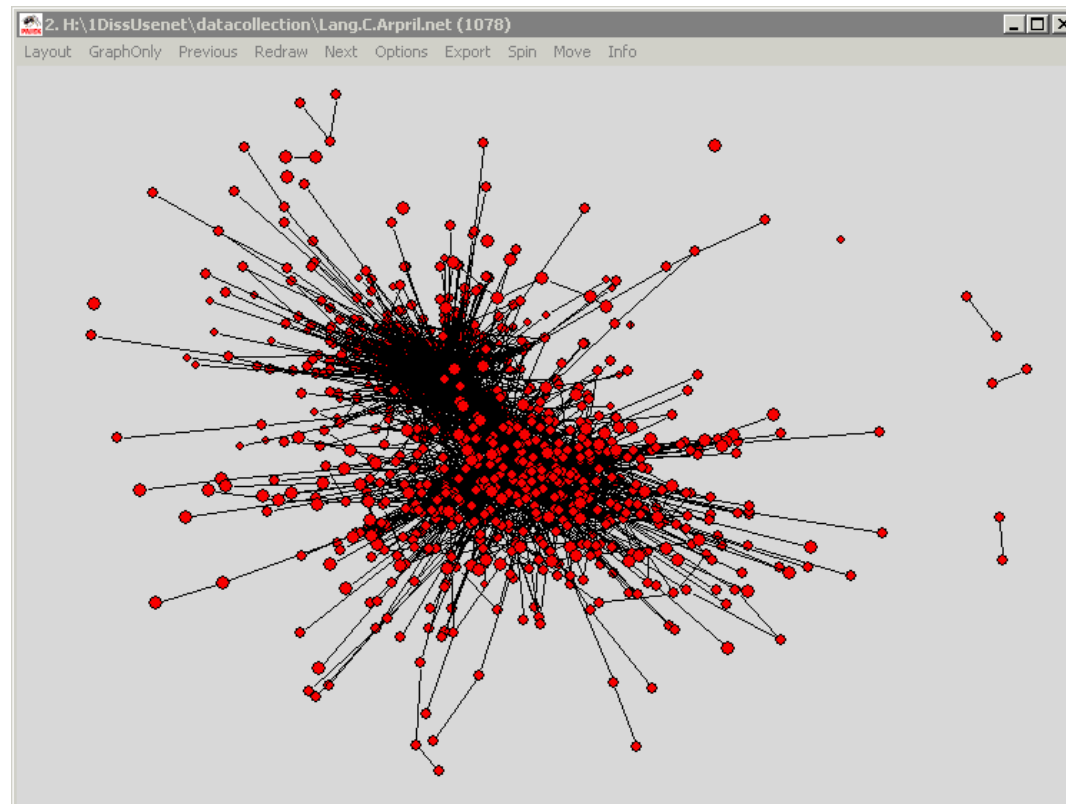
- How to position the nodes and edges?
- The **primary** concern with networks
 - while inheriting other issues such as color, size, etc
- The topic of the Graph Drawing conference (as well as numerous InfoVis papers) and even multiple books.

Graphs: the problem

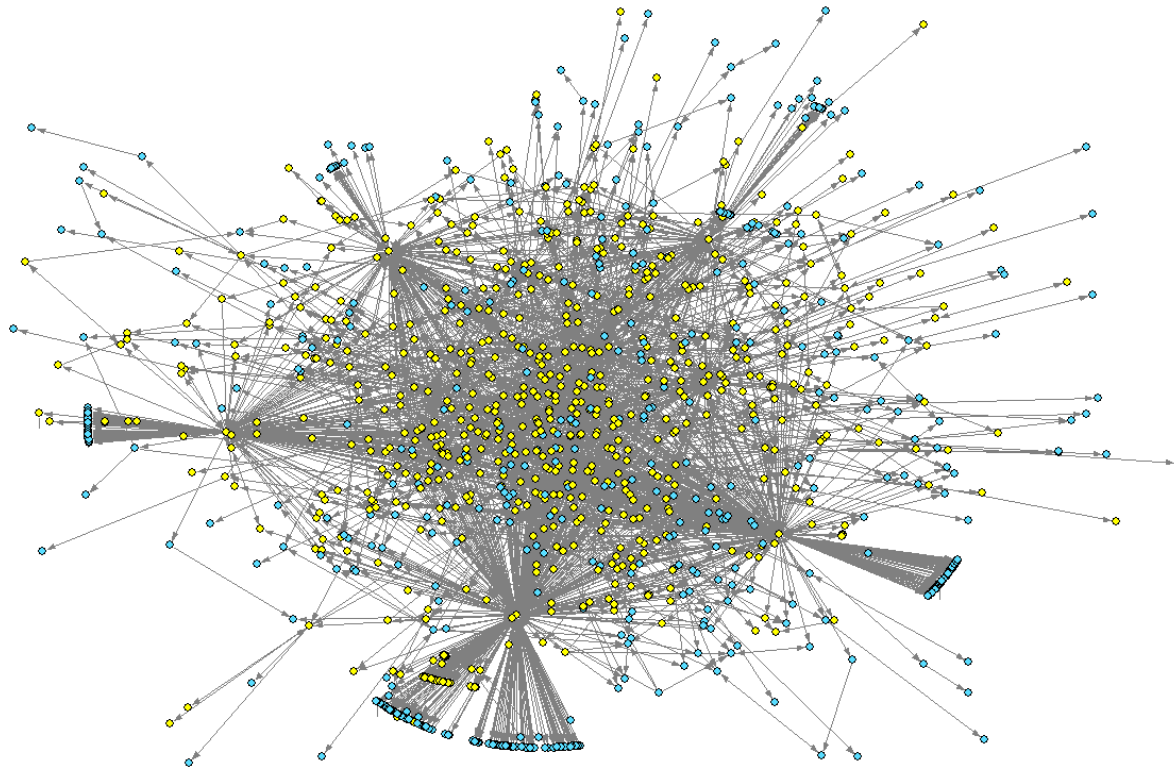


- YUK

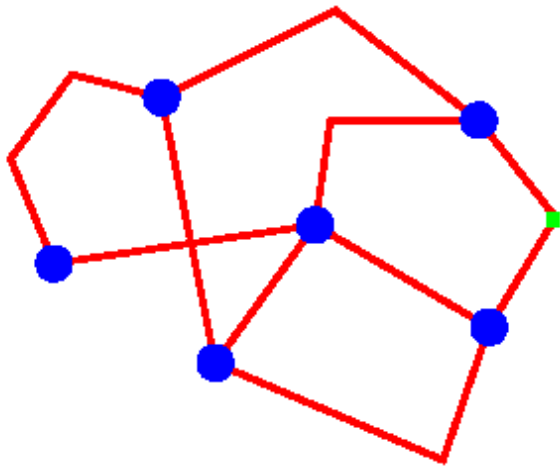
Graph Layout: The Problem



Graph Layout: The Problem

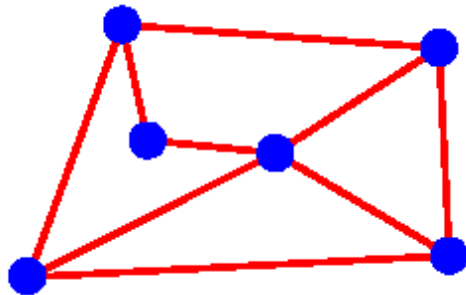
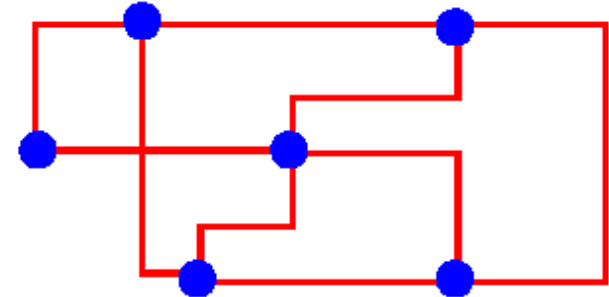


Traditional Graph Drawing



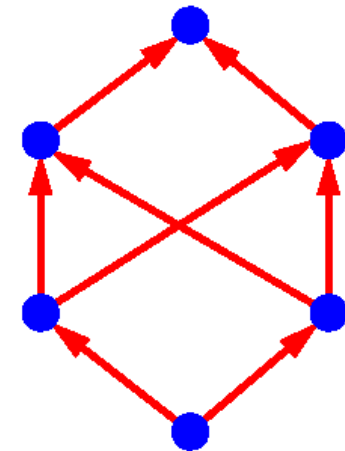
poly-line graphs
(includes bends)

orthogonal
drawing



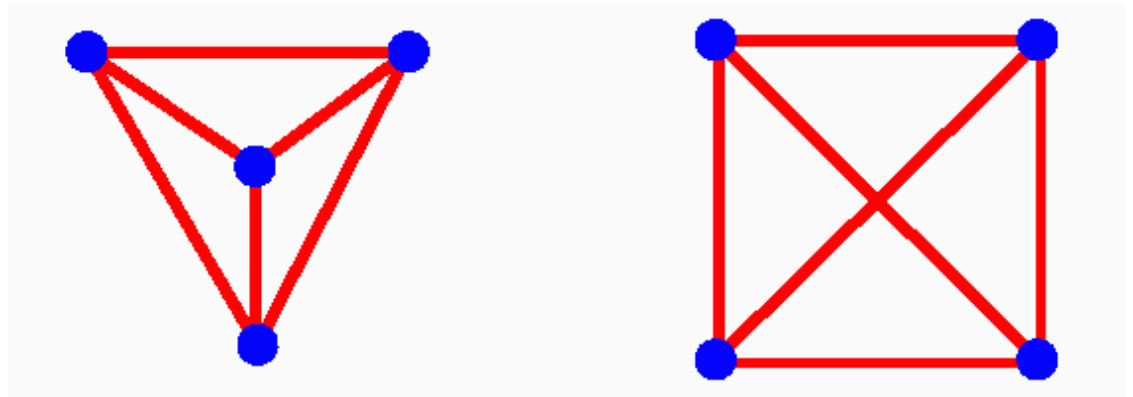
planar, straight-
line drawing

upward drawing of DAGs



Aesthetic constraints

- Minimize link crossings
 - Minimize link lengths
 - Minimize link bends
 - Maximize symmetries
 - Mathematically difficult to do everything
-
- Unsited for interactive visualization
 - Prioritise and precompute



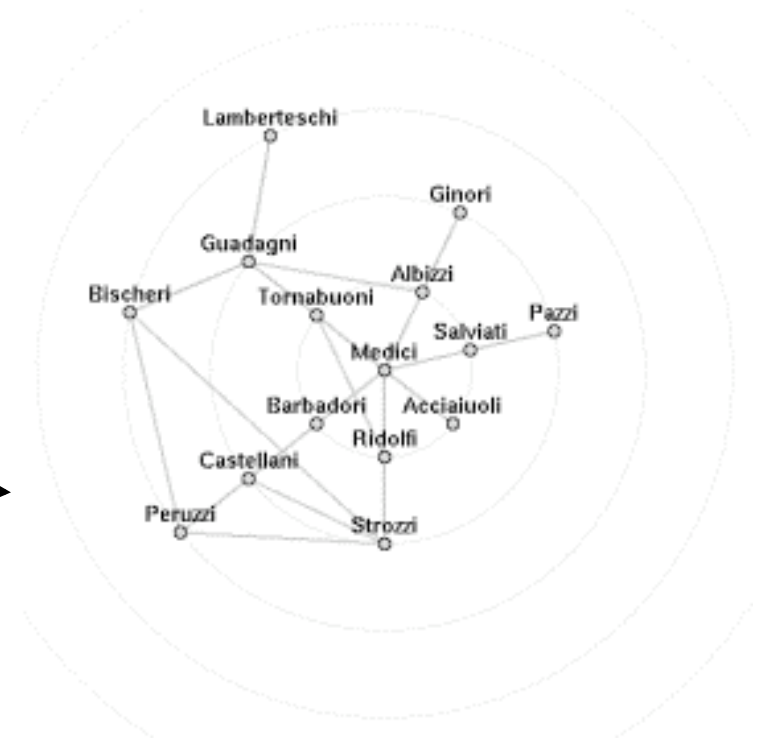
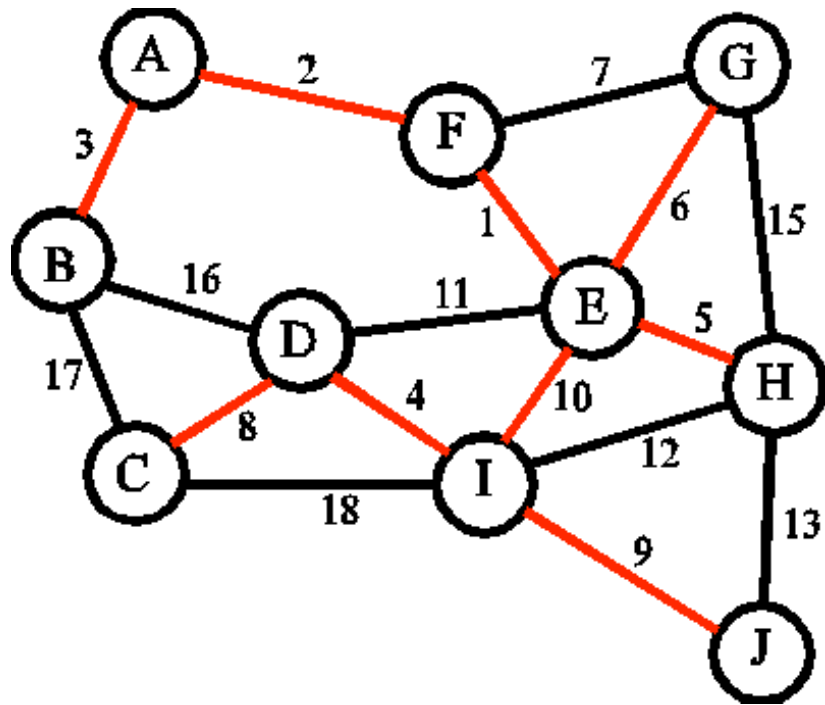
Layout Approaches

- Tree-ify the graph - then use tree layout
 - Hierarchical graph layout
 - Radial graph layout
 - Optimization-based techniques
 - Includes spring-embedding / force-directed layout
 - Adjacency matrices
 - Structurally-independent layout
 - On-demand revealing of subgraphs
 - Distortion-based views
 - Hyperbolic browser
 - (this list is not meant to be exhaustive)
-

Tree-based graph layout

- Select a tree-structure out of the graph
 - Breadth-first-search tree
 - Minimum spanning tree
 - Other domain-specific structures
- Use a tree layout algorithm
- Benefits
 - Fast, supports interaction and refinement
- Drawbacks
 - Limited range of layouts

Tree-ify the graph

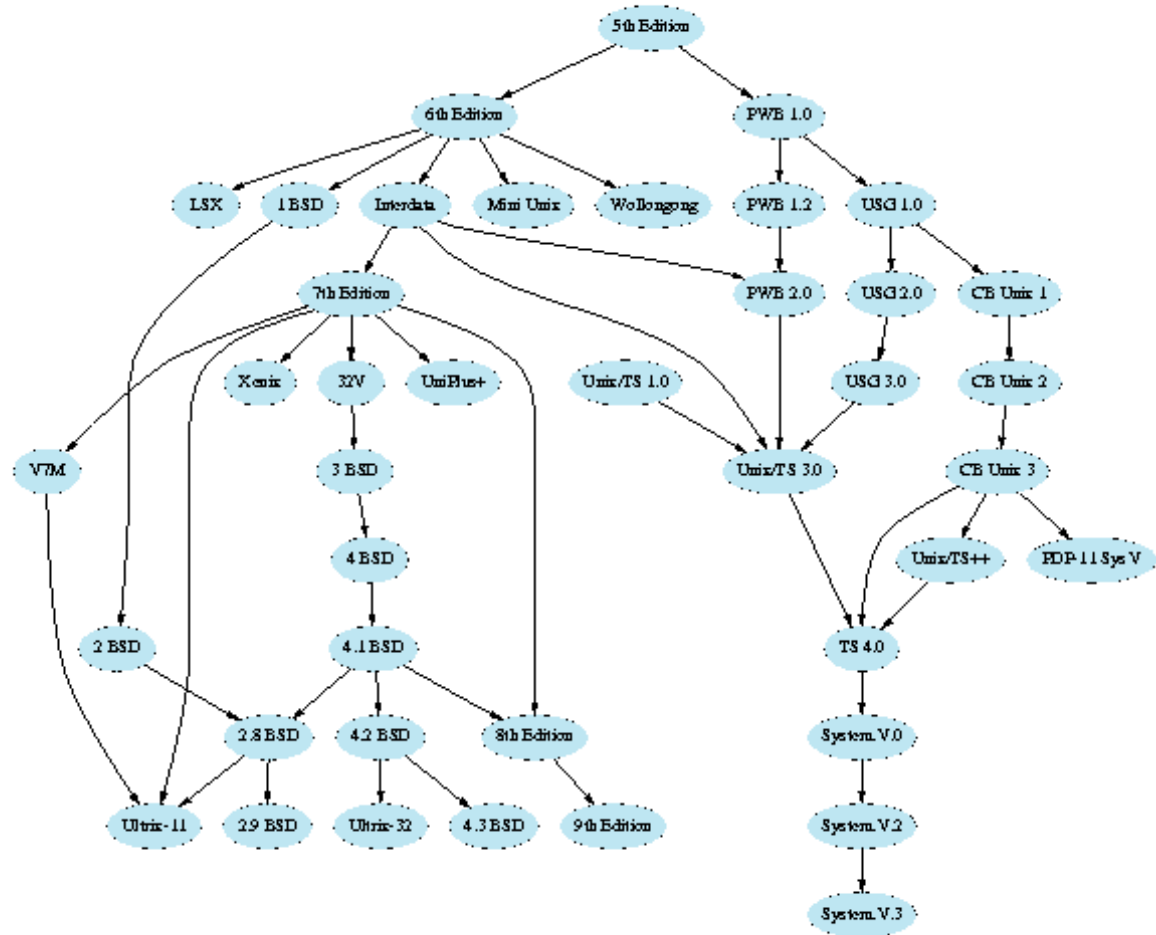


Hierarchical graph layout

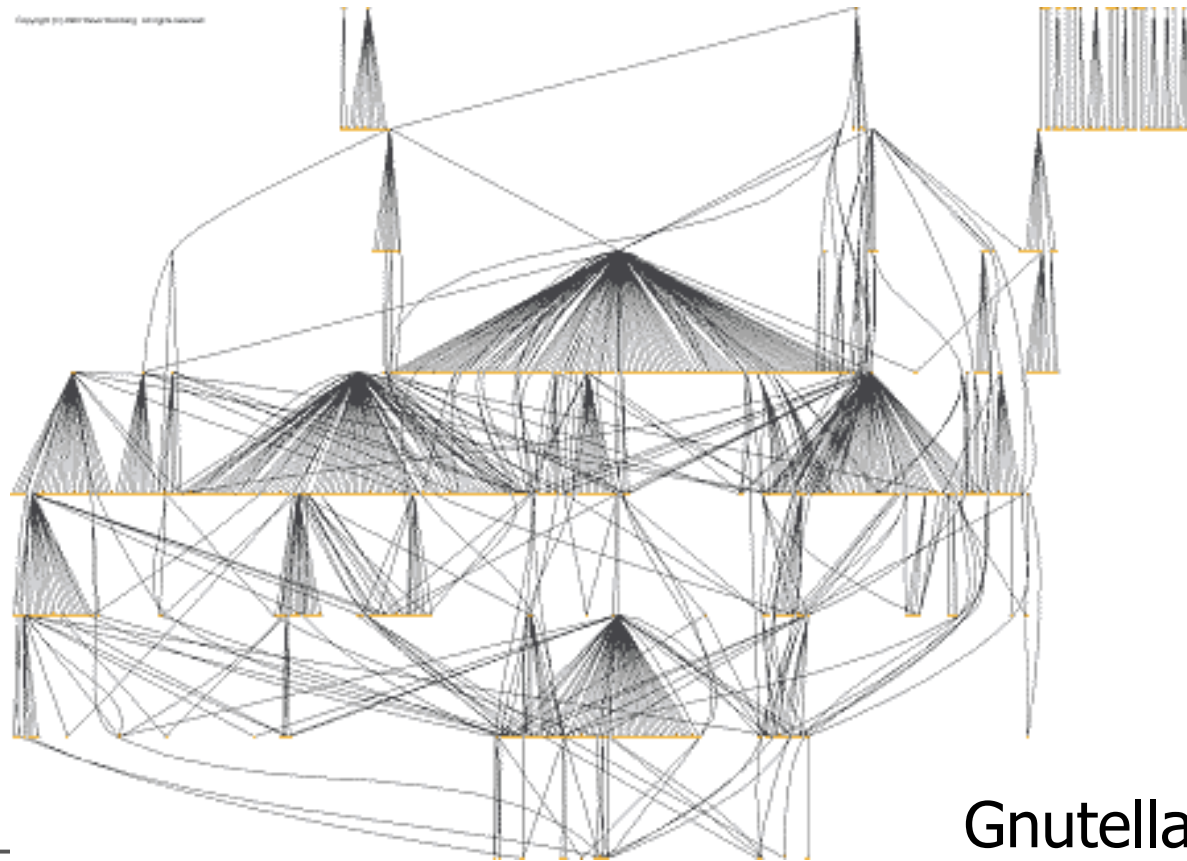
- Use directed structure of graph to inform layout
- Order the graph into distinct levels
 - this determines one dimension
- Now optimize within levels
 - determines the second dimension
 - minimize edge crossings, etc
- The method used in graphviz's "dot" algorithm
- Great for directed acyclic graphs, but often misleading in the case of cycles

Hierarchical Graph Layout

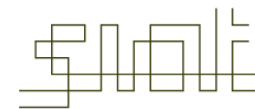
- Evolution of the UNIX operating system
- Hierarchical layering based on descent



Hierarchical graph layout



Gnutella network

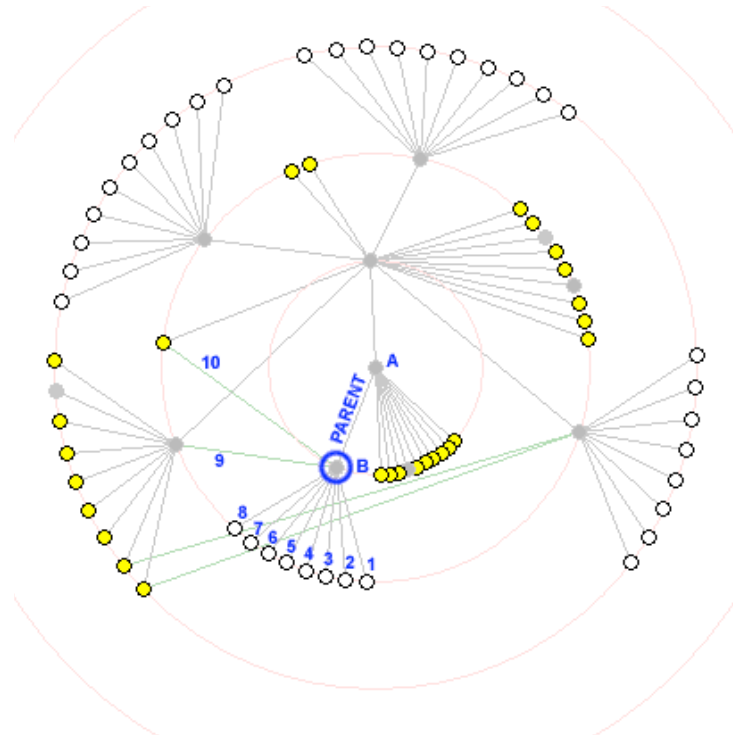


SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

Slide adapted from Jeff Heer

Radial Layout

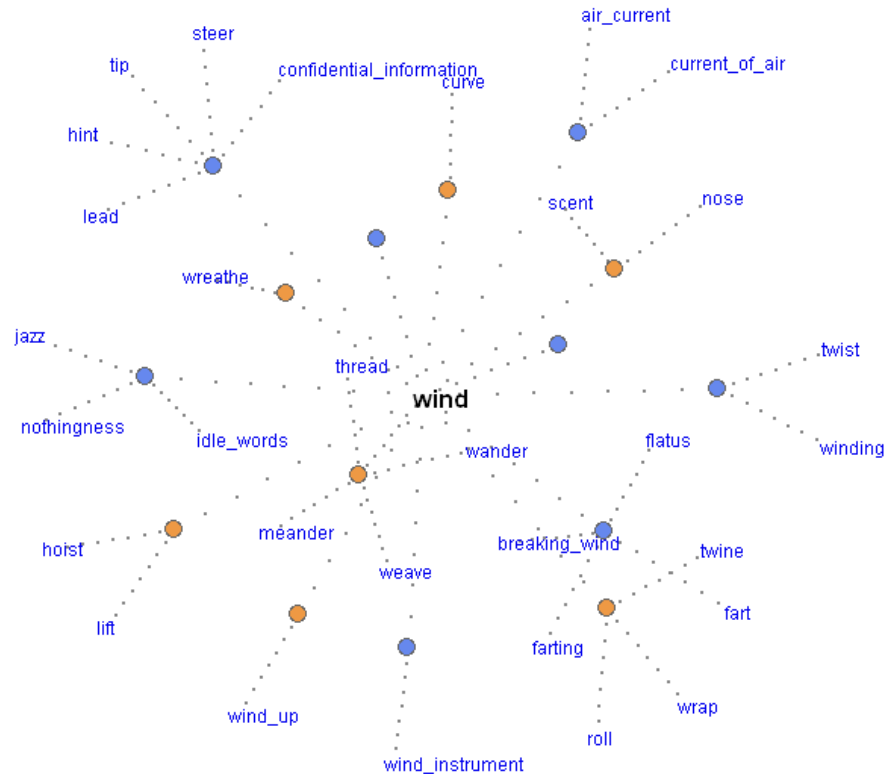
- **Animated Exploration of Graphs with Radial Layout**, Yee et al., 2001
- Gnutella network



Optimization-based layout

- Specify constraints for layout
 - Series of mathematical equations
 - Hand to “solver” which tries to optimize the constraints
- Examples
 - Minimize edge crossings, line bends, etc
 - Multi-dimensional scaling (preserve multi-dim distance)
 - Force-directed placement (use physics metaphor)
- Benefits
 - General applicability
 - Often customizable by adding new constraints
- Drawbacks
 - Approximate constraint satisfaction
 - Running time; “organic” look not always desired

Example: Force-Directed Layout



Uses physics model to layout graph,

Nodes repel each other, edges act as springs, and some amount of friction or drag force is used.

Special techniques to dampen “jitter”.

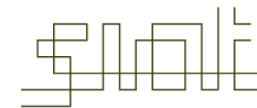
visual wordnet

<http://www.kylescholz.com/projects/wordnet>

visuwords

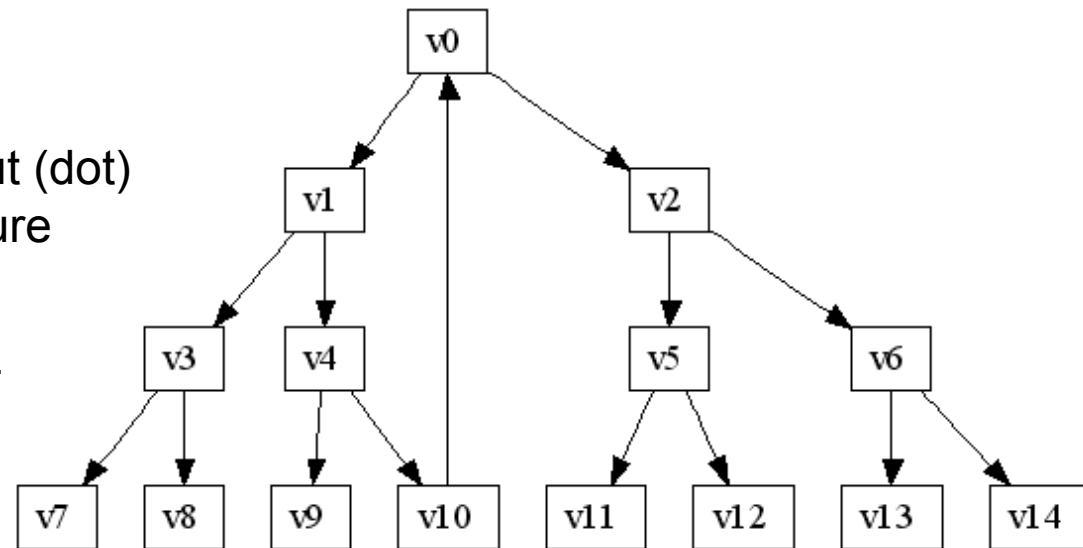
<http://www.visuwords.com/>

Slide adapted from Jeff Heer

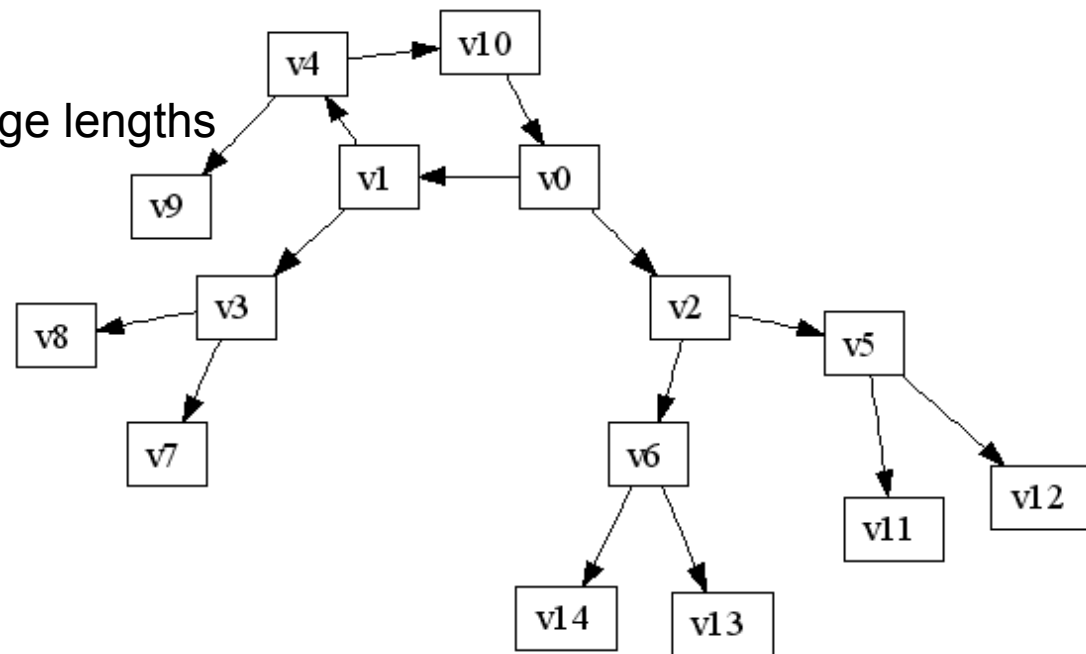


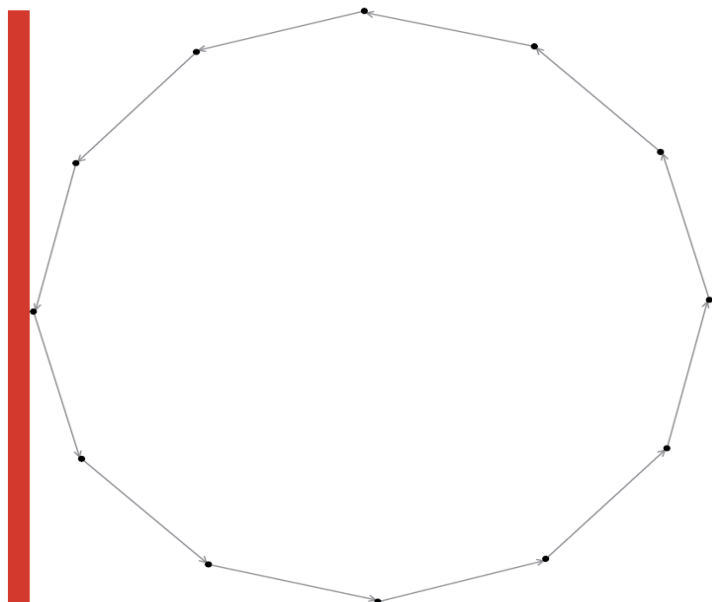
SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

Typical Sugiyama layout (dot)
- preserves tree structure

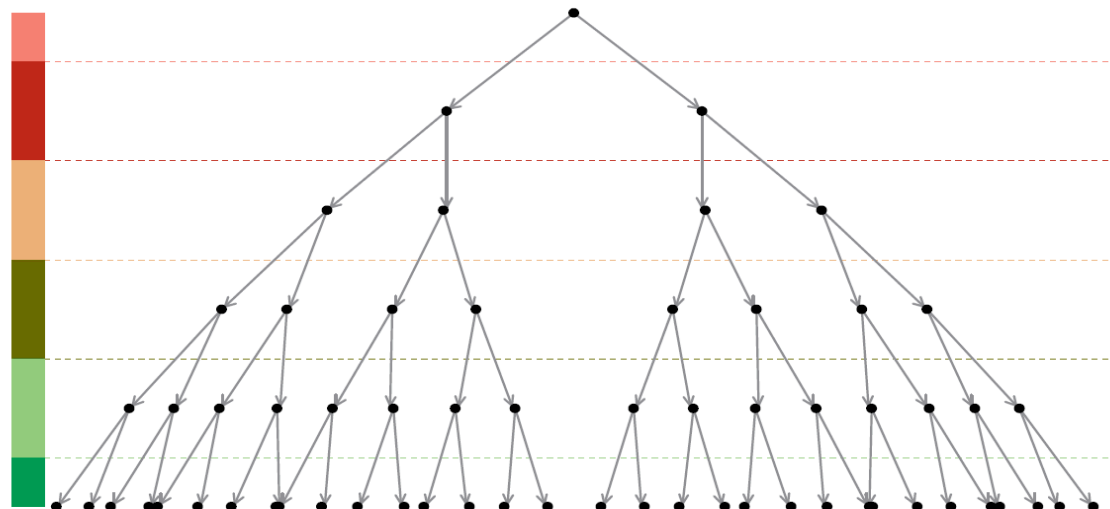


Alternative method
- preserves uniform edge lengths

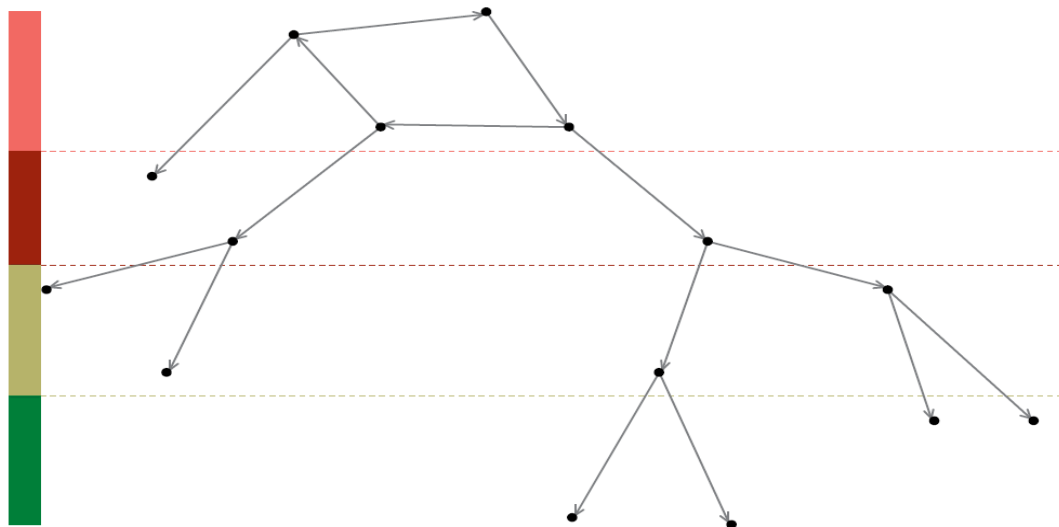




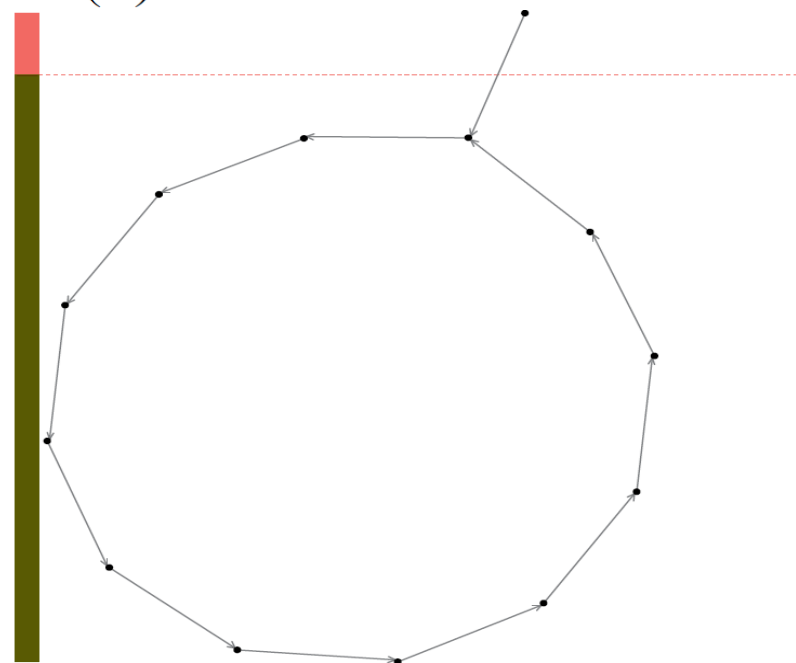
(a) 1 band



(b) 6 bands



(c) 4 bands

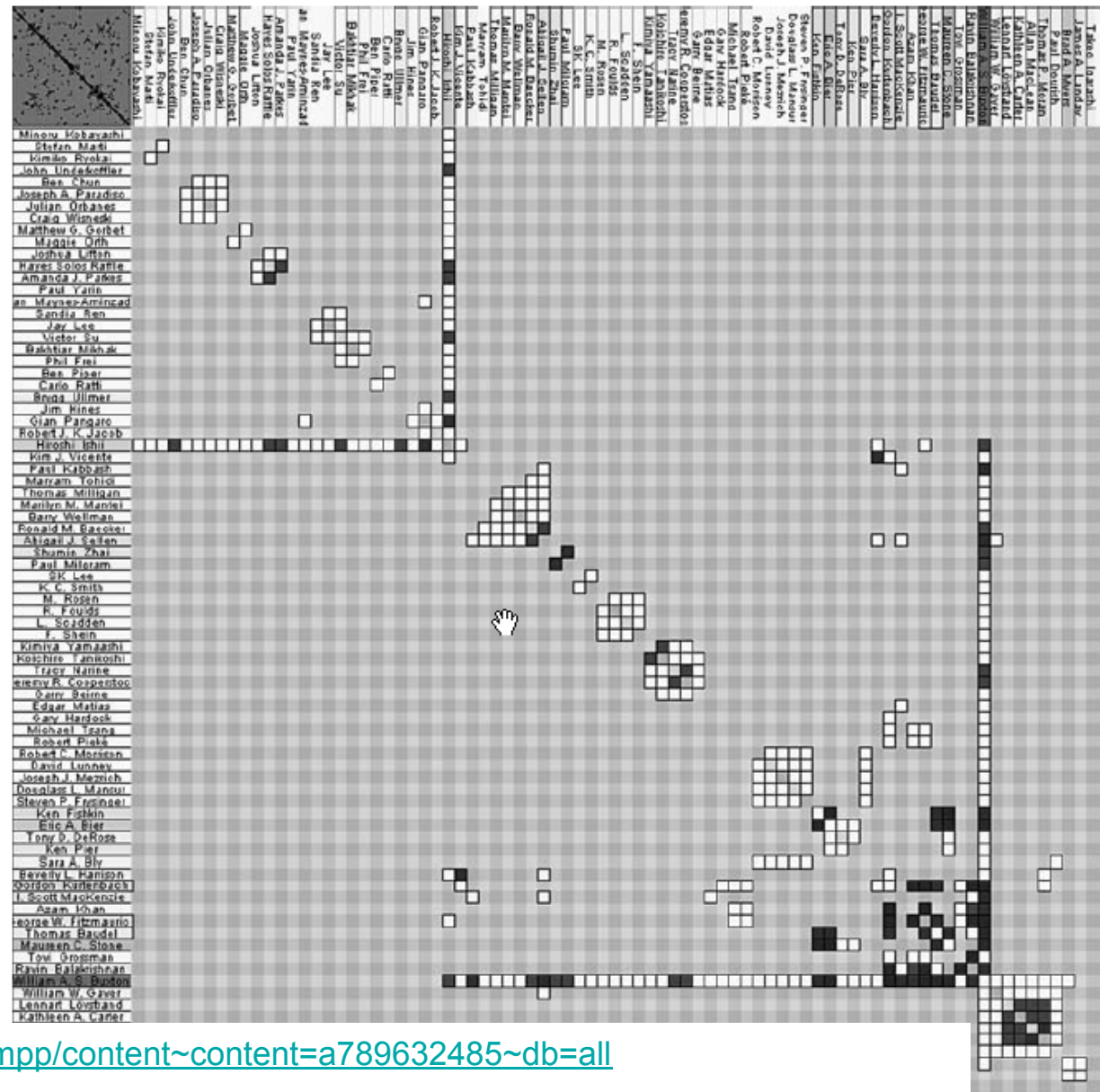


(d) 2 bands

Adjacency Matrices

- So far, only looked at node-link diagrams
- Often doesn't scale well due to edge-crossings, occlusion, etc. --> hard to read
- One solution: adjacency matrix
 - show graph as table
 - nodes as rows/columns
 - edges as table cells

Matrices

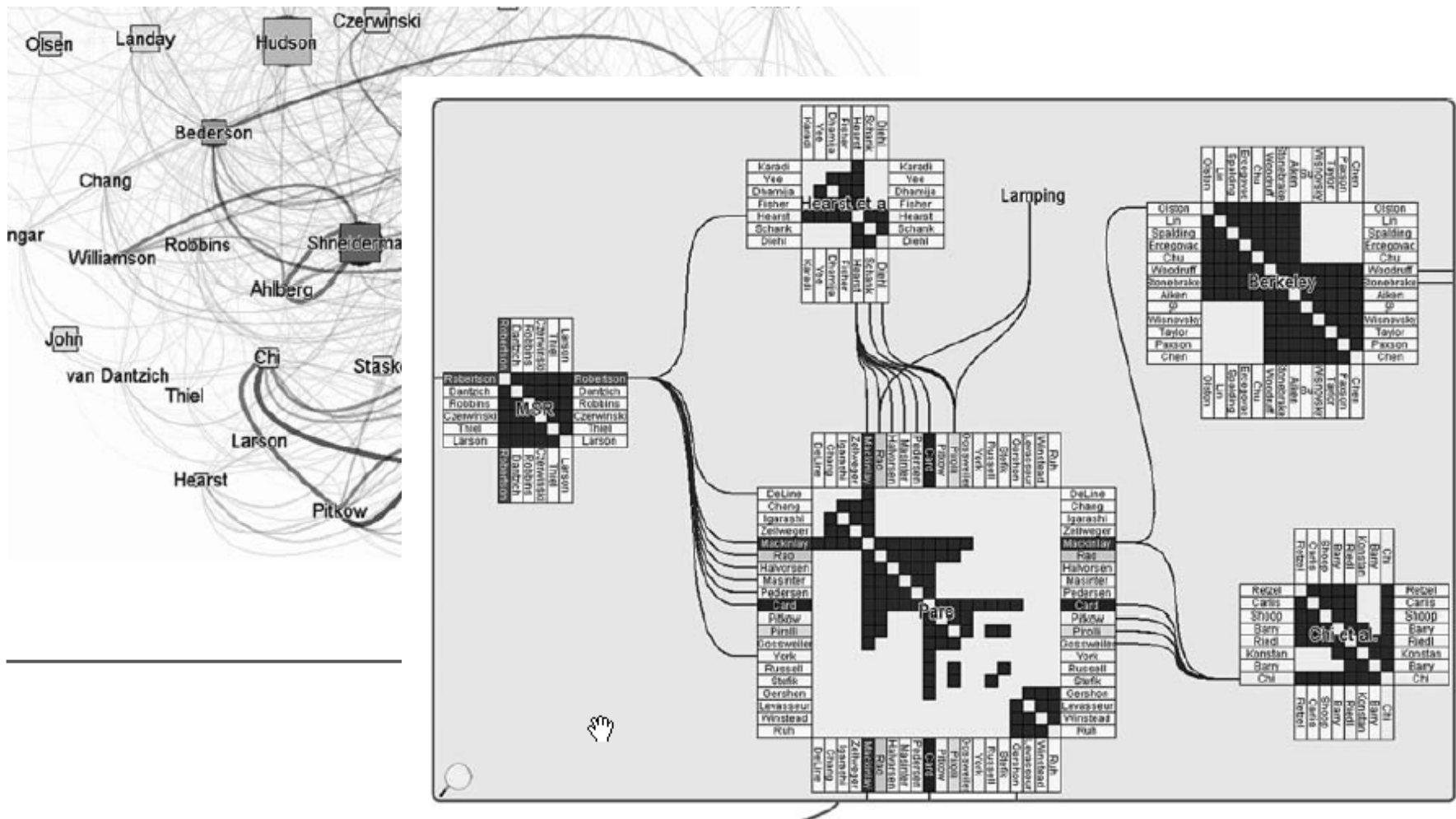


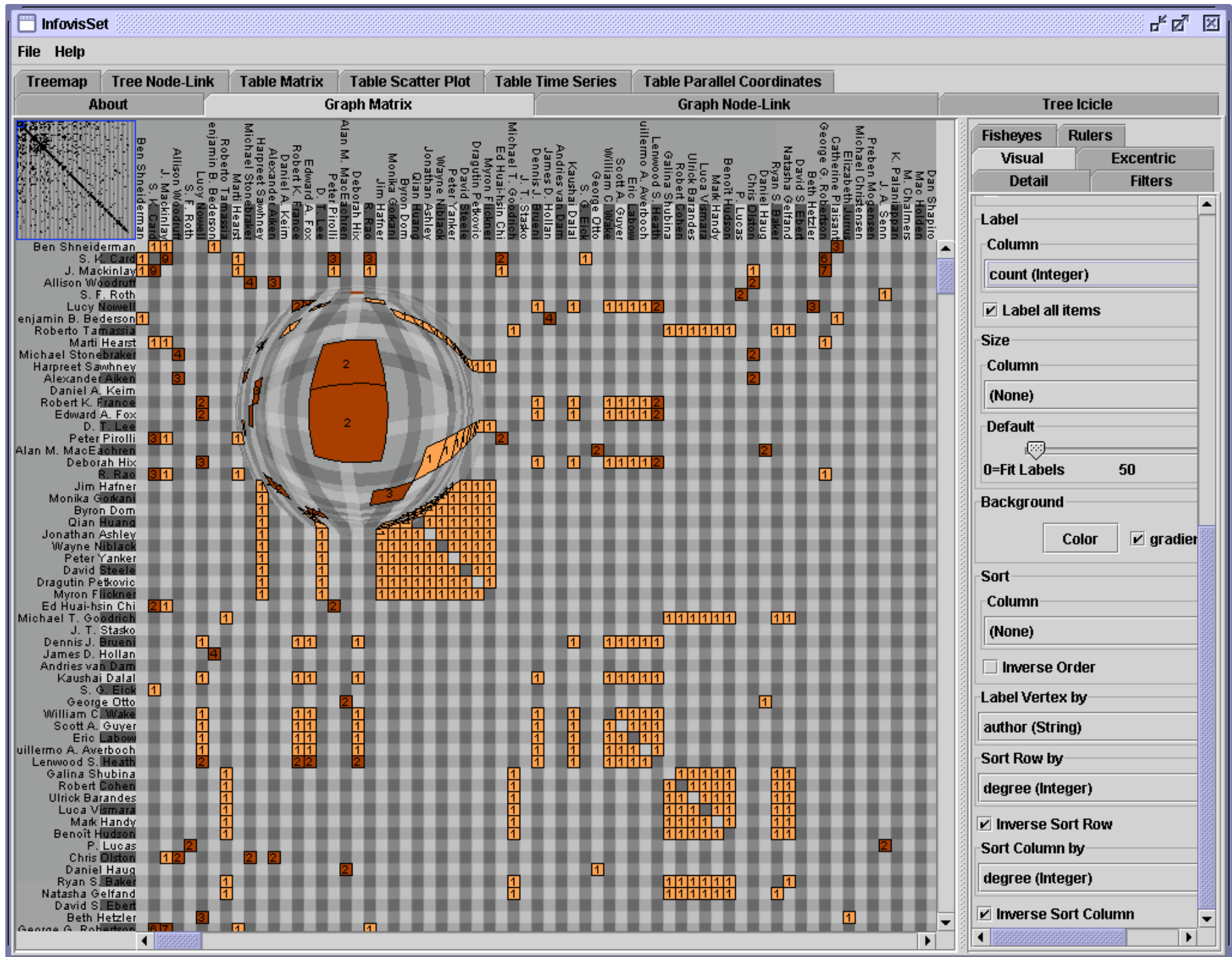
<http://www.informaworld.com/smpp/content~content=a789632485~db=all>

20 Years of Four HCI Conferences: A Visual Exploration
Henry et al. IHCI 2007

Matrices with Submatrices

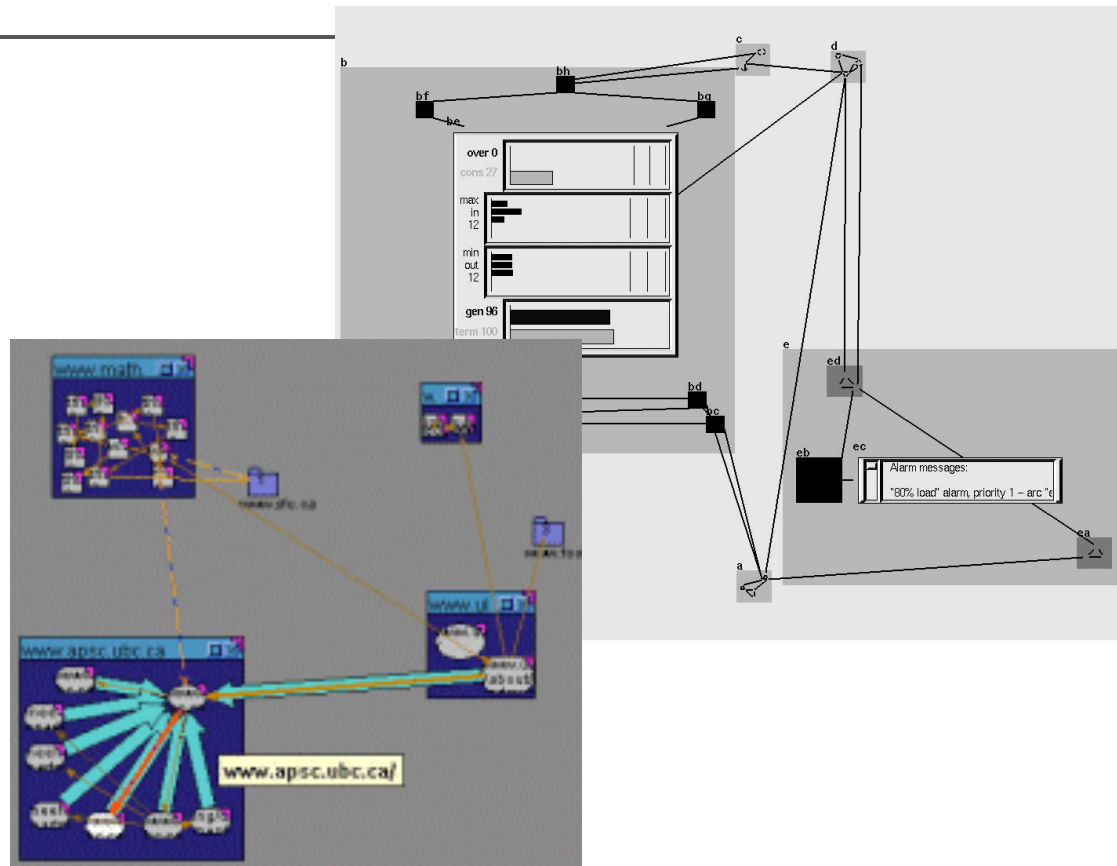
- <http://www.informaworld.com/smpp/content~content=a789632485~db=all>





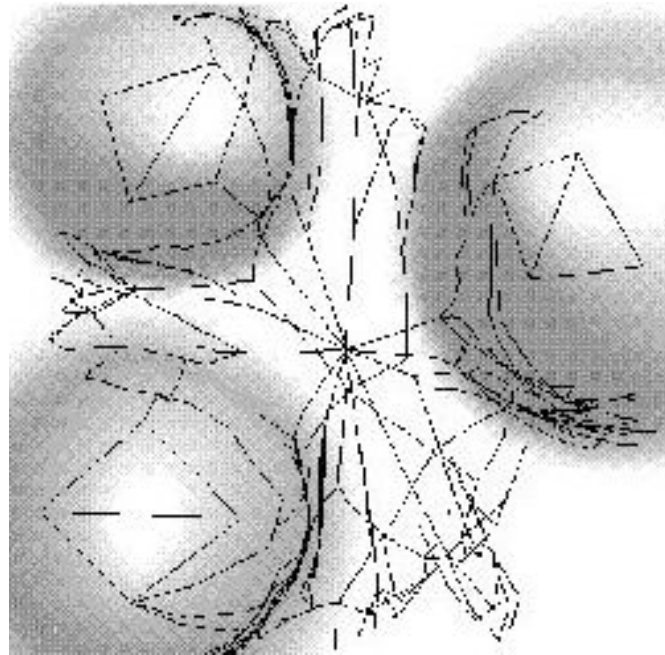
Focus+Context

- Pioneered by Furnas
- Continuous Zoom (Bartram, Ho, Dill)
 - CZWeb
 - CZSaw



Fisheye and Nested Approaches

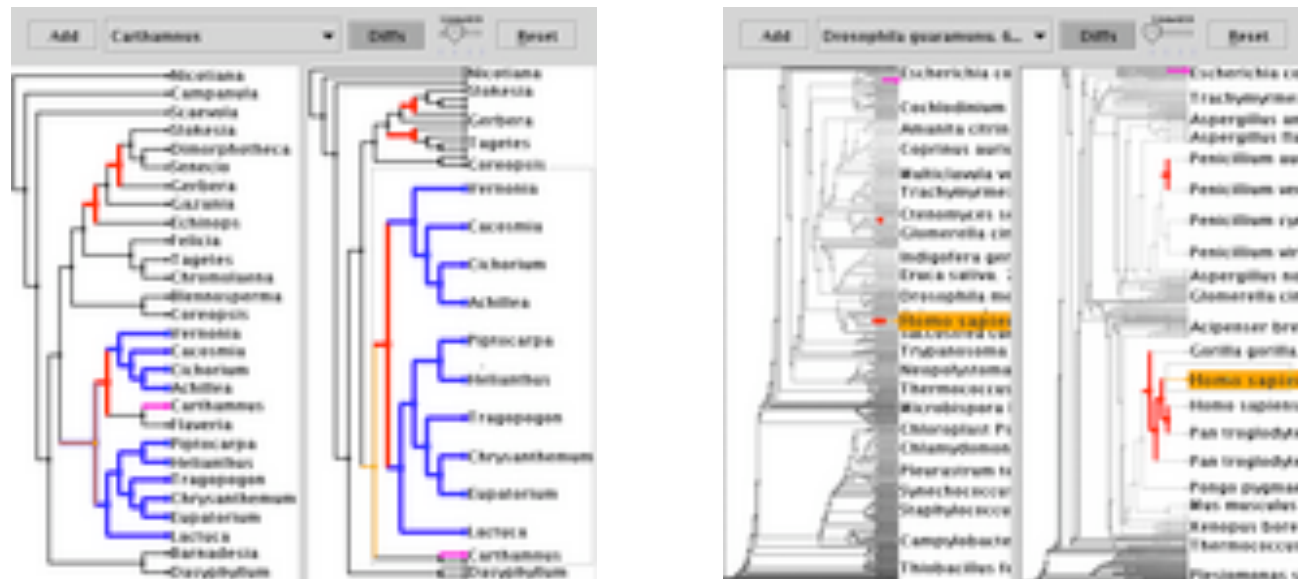
- Carpendale : Extended Pliable Surfaces



Slide adapted from Jeff Heer

Fisheye and Nested Approaches

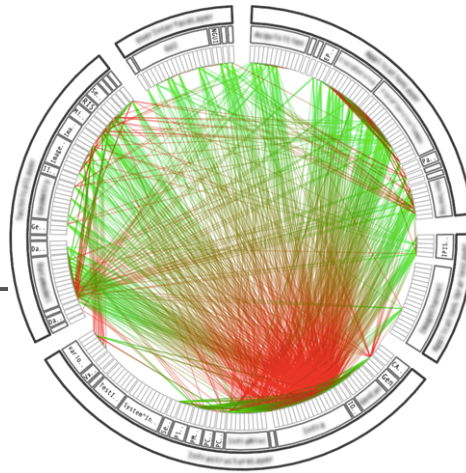
- TreeJuxtaposer (Munzner, 2006)



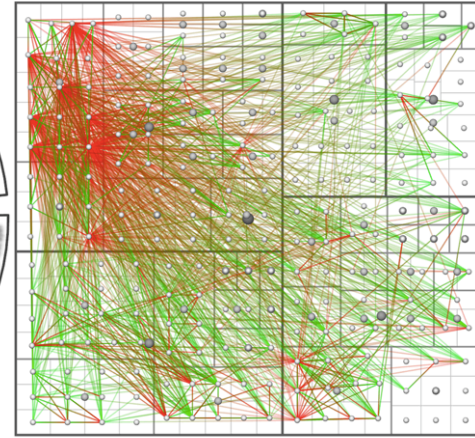
Slide adapted from Jeff Heer

Detail and Context with Links

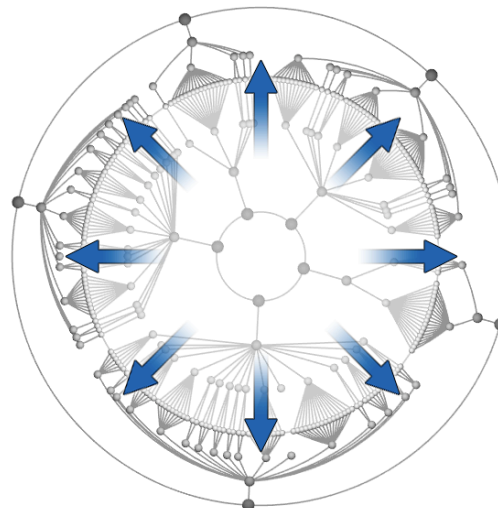
- Edge Bundles (Holten)



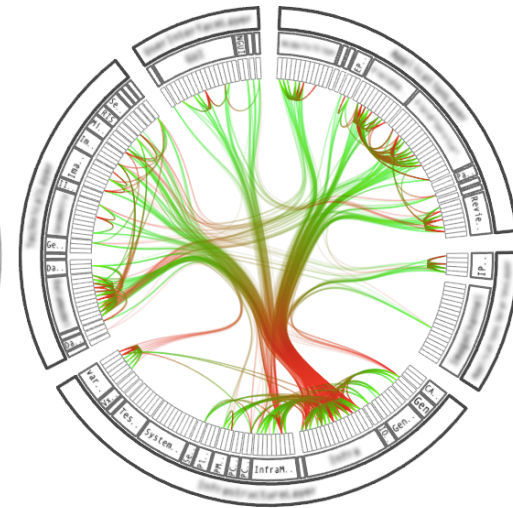
(a)



(b)

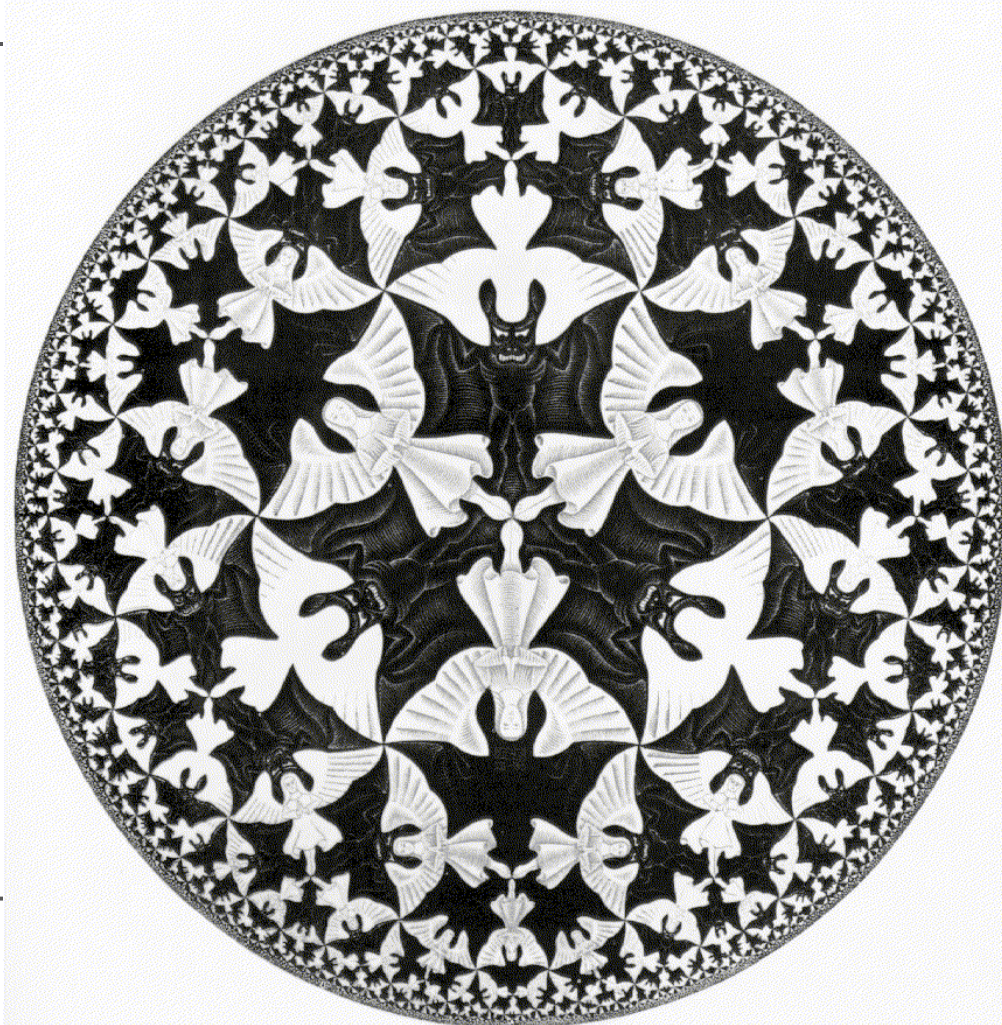


(a)



(b)

Hyperbolic Browser: Inspiration



SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

Using Distortion and Focus + Context

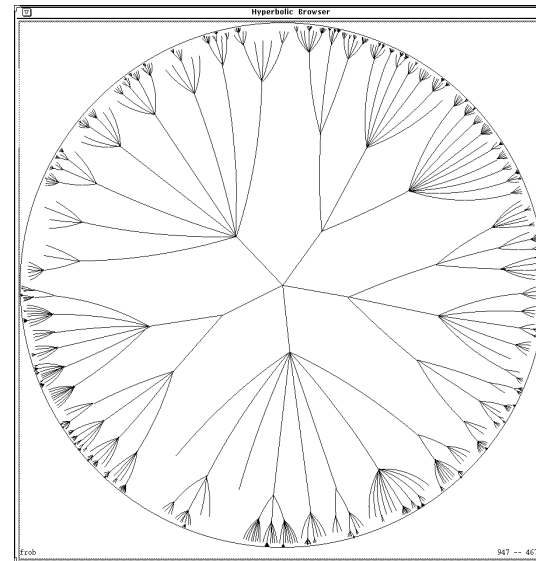
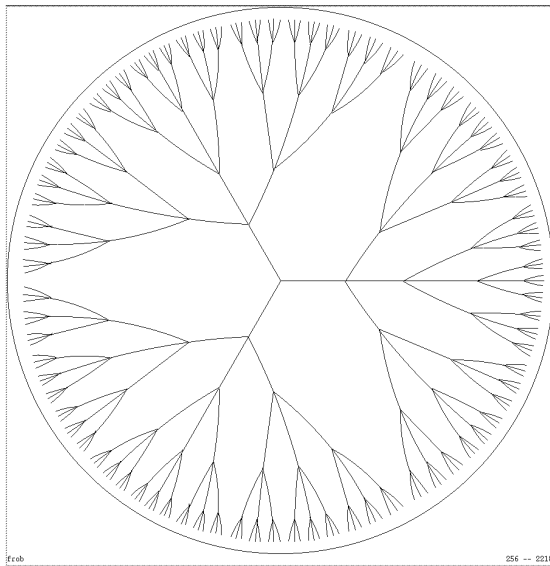
- The Hyperbolic Tree Browser

The Hyperbolic Browser: A Focus + Context Technique for Visualizing Large Hierarchies, Lamping & Rao, CHI 1996.

- <http://www.inxight.com/products/sdks/st/>
 - Uses non-Euclidean geometry as basis of focus + context technique
 - The hyperbolic browser is a projection into a Euclidean space – a circle
 - The circumference of a circle increases linearly with radius ($2\pi r$)
 - The circumference of a circle in hyperbolic space increases exponentially
- Exponential growth in space available with linear growth of radius
 - Makes tree layout easy
 - Size of objects decreases with growth of radius
 - Reduces expense of drawing trees when cut-off at one pixel

Appearance of Initial Layout

- Root mapped at center
- Multiple generations of children mapped out towards edge of circle
- Drawing of nodes cuts off when less than one pixel

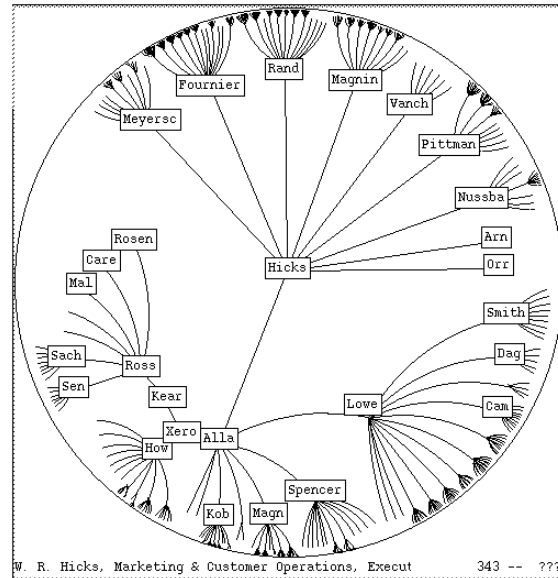
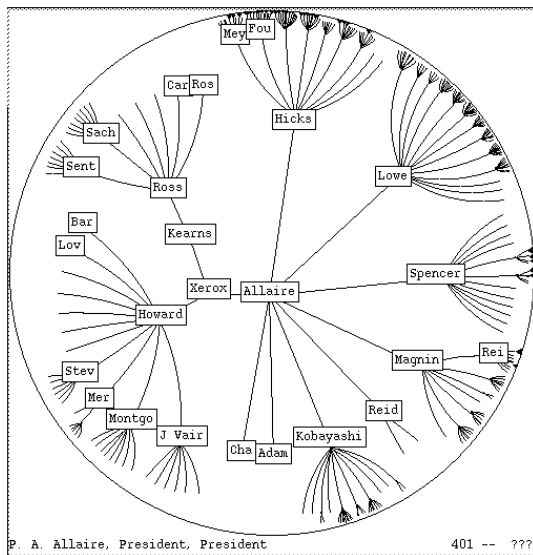


User orientation on refocus

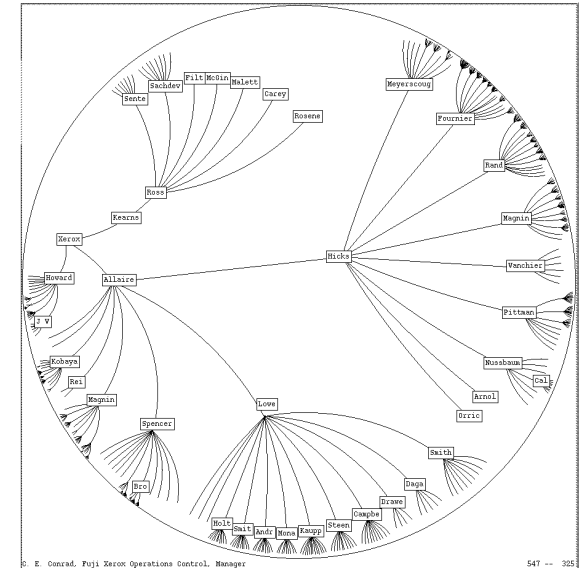
- Problem
 - Hyperbolic Geometry can allow disorienting rotations of objects when refocusing
- Solution one:
 - Preserve initial angular orientation of parent to child nodes
- Solution two:
 - Preserve left to right orientation of parent to child nodes beginning with initial display

User orientations - Solutions

Preserving Angular Orientation



Left to Right Ordering



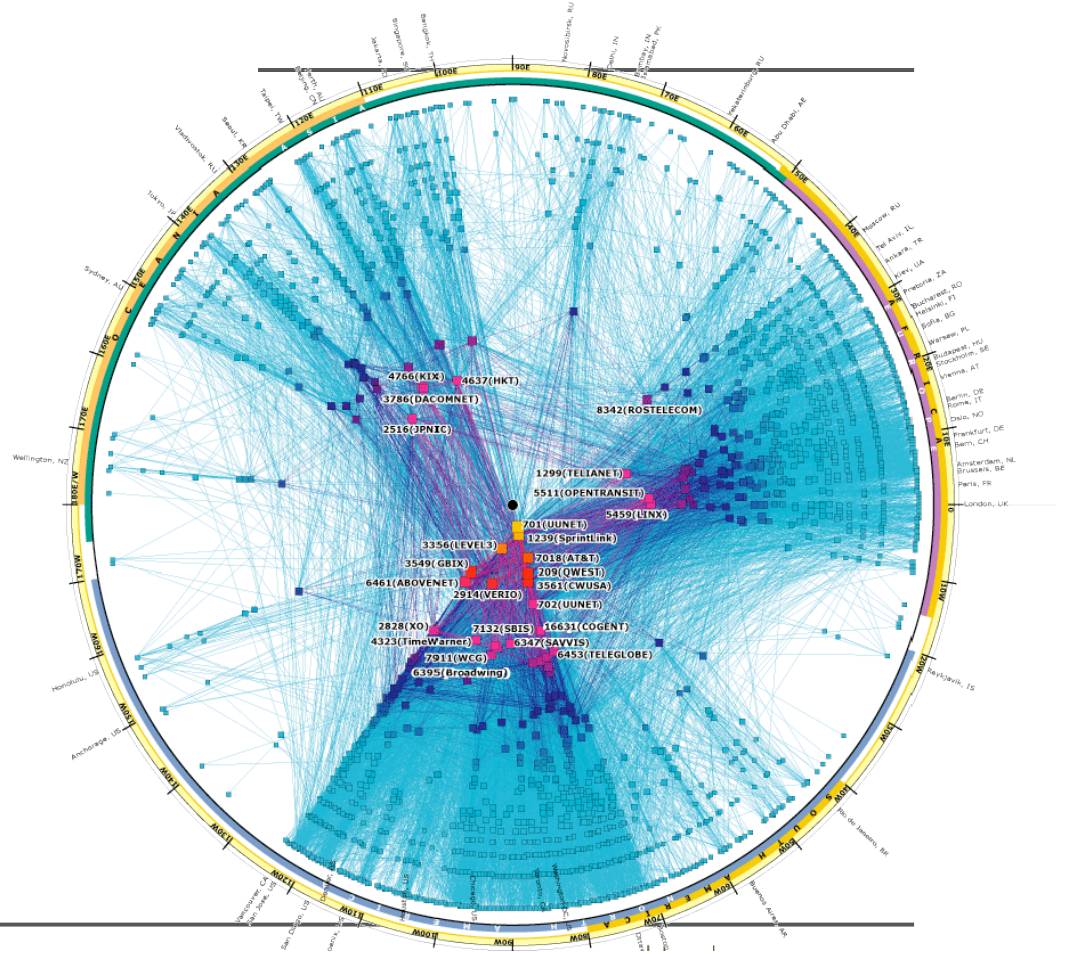
Structurally-Independent Layout

- Ignore the graph structure.
- Base the layout on other attributes of the data
- Examples:
 - Geography
 - Time
- Benefits
 - Often very quick layout
 - Optimizes communication of particular features
- Drawbacks
 - May or may not present structure well

Structurally Independent Layout

- The “Skitter” Layout
 - Internet Connectivity
- Angle = Longitude
 - geography
- Radius = Degree
 - # of connections

Skitter, www.caida.org

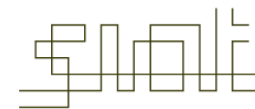
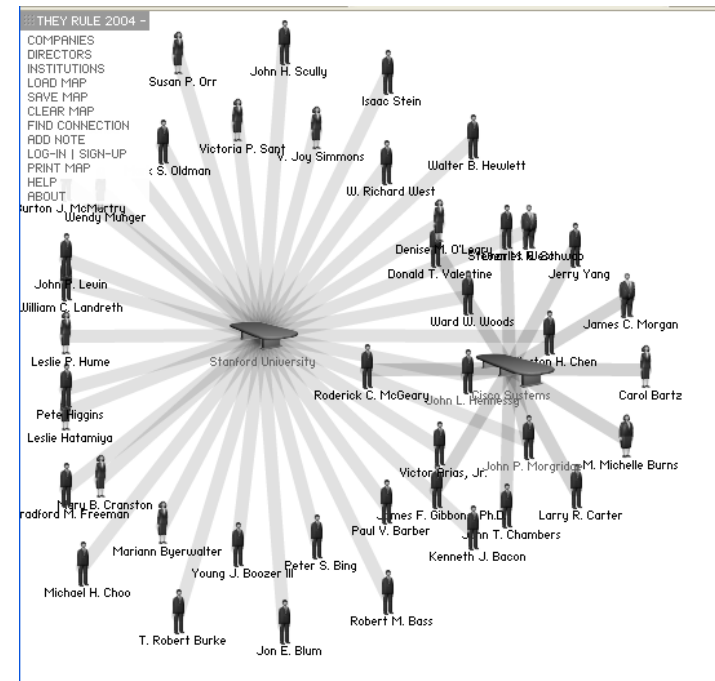


http://www.caida.org/research/topology/as_core_network/2007/images/ascore-simple.2007_big.png

SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

Progressive Disclosure

- Only show subsets that are currently selected
- <http://www.theyrule.net/>
- <http://kylescholz.com/projects/wordnet/wordnet2.html>



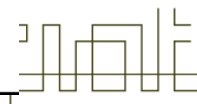
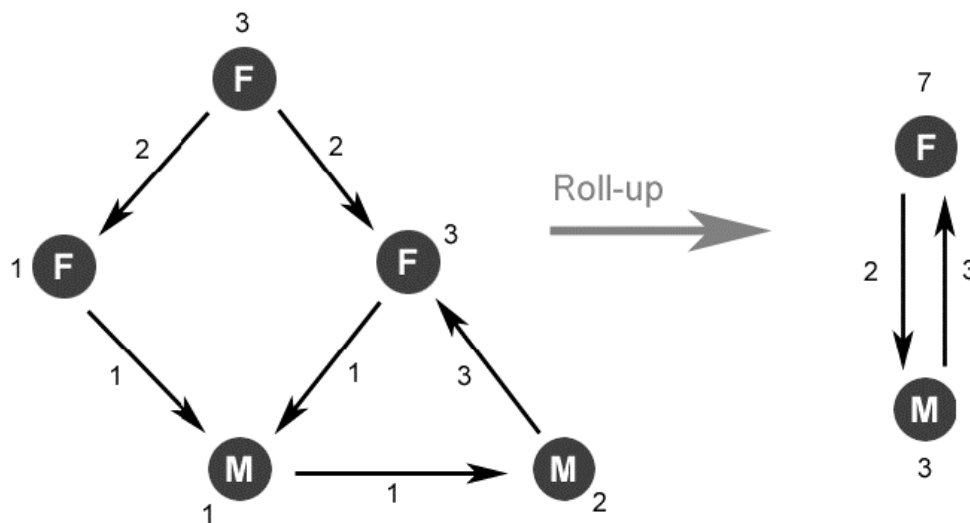
SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

Problem: Multivariate Graphs

- What if you want to associate information with the nodes and edges?
- Typical approach: vary
 - Size of nodes
 - Color of nodes
 - Fatness of edges
 - Colors of edges
- However, it's hard to make quantitative comparisons when these retinal cues are spread throughout the graph.

Solution: Wattenberg's Pivot Graphs

- Use “roll-up” idea from OLAP to compress and re-express graph data.
 - Aggregate all nodes that have the same values on each of those dimensions, and aggregate edges accordingly.
- In graph below,
F = Female, M = Male, Numbers mean counts

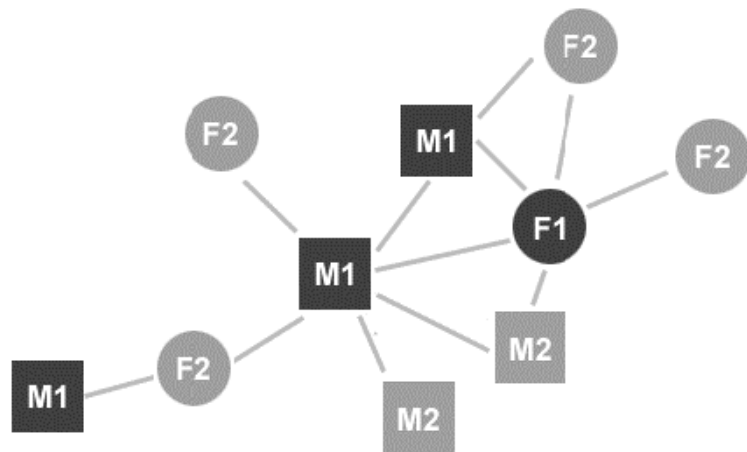


SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY

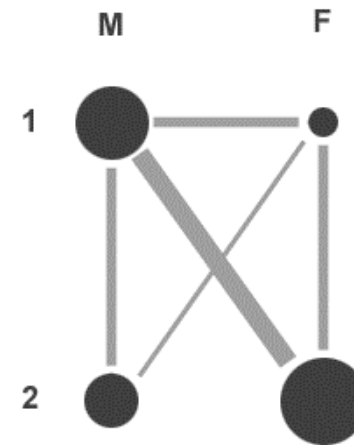
Visual Exploration of Multivariate Graphs, Wattenberg, IEEE Infoviz ???

Multidimensional Pivot Graphs

- What is added, and what is lost, from this transformation?



Node and Link Diagram



PivotGraph Roll-up



X-Axis:

Gender

Y-Axis:

Location

Flip X/Y

Clear

People



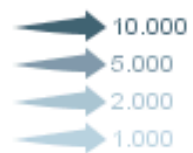
In vs. Out Degree



Relationships



Rel. / Person



Select:

Gender

(All Values)

Legacy

(All Values)

Department

(All Values)

Level

(All Values)

Location A

Location B

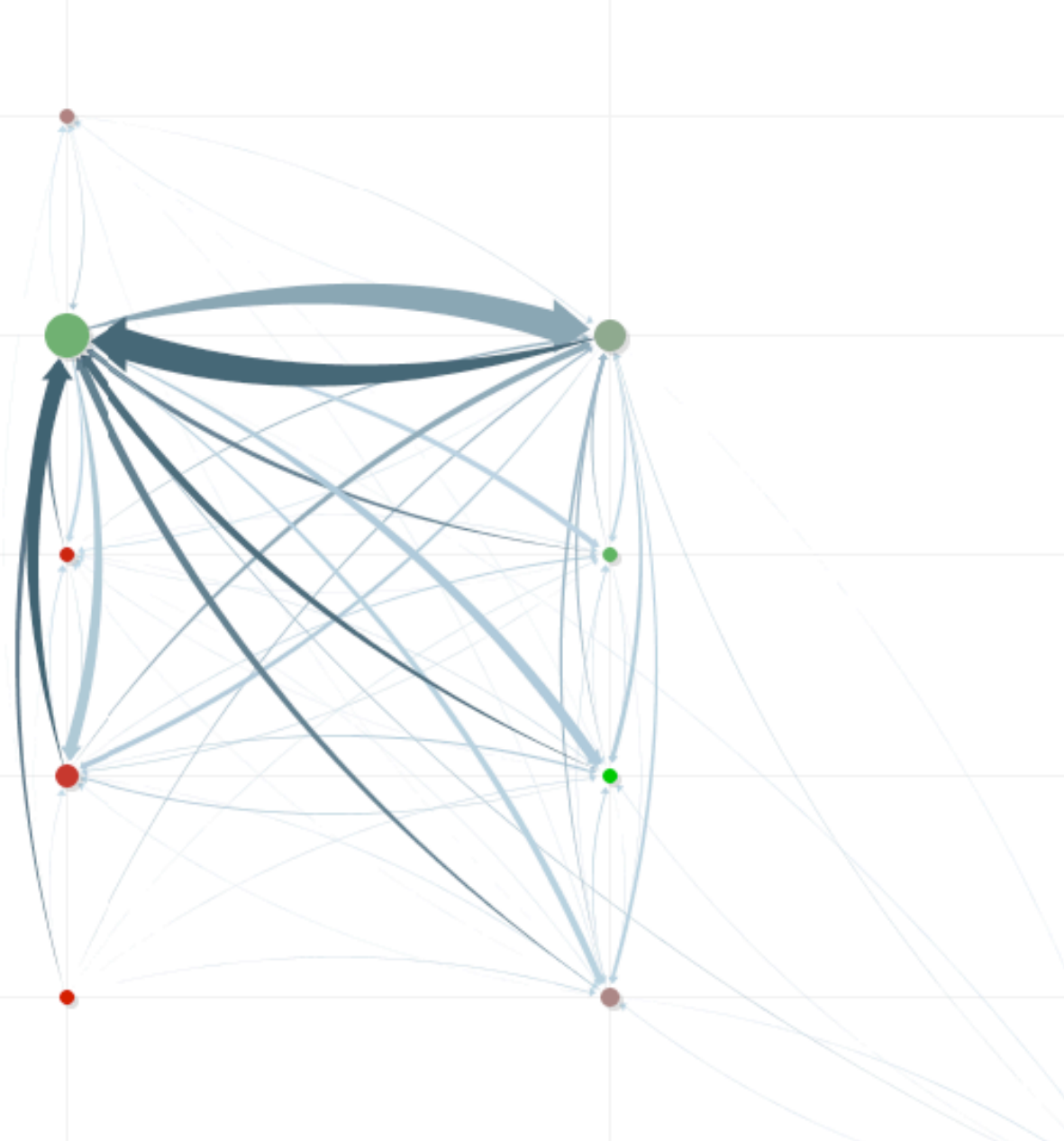
Location C

Location D

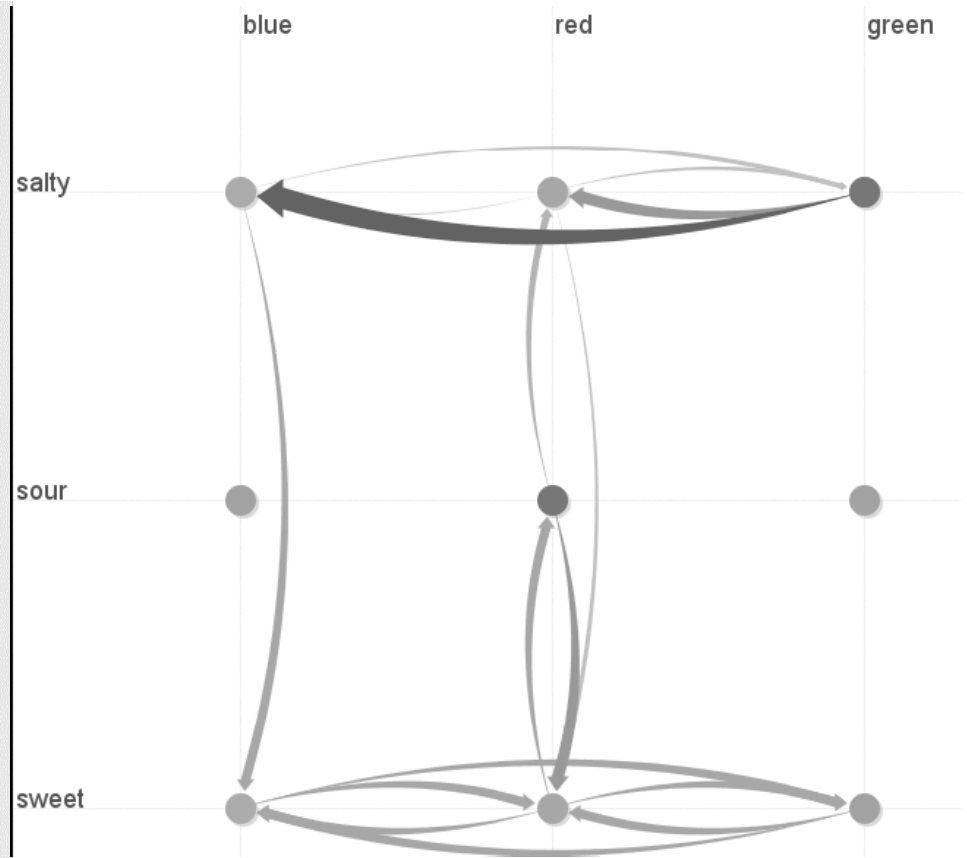
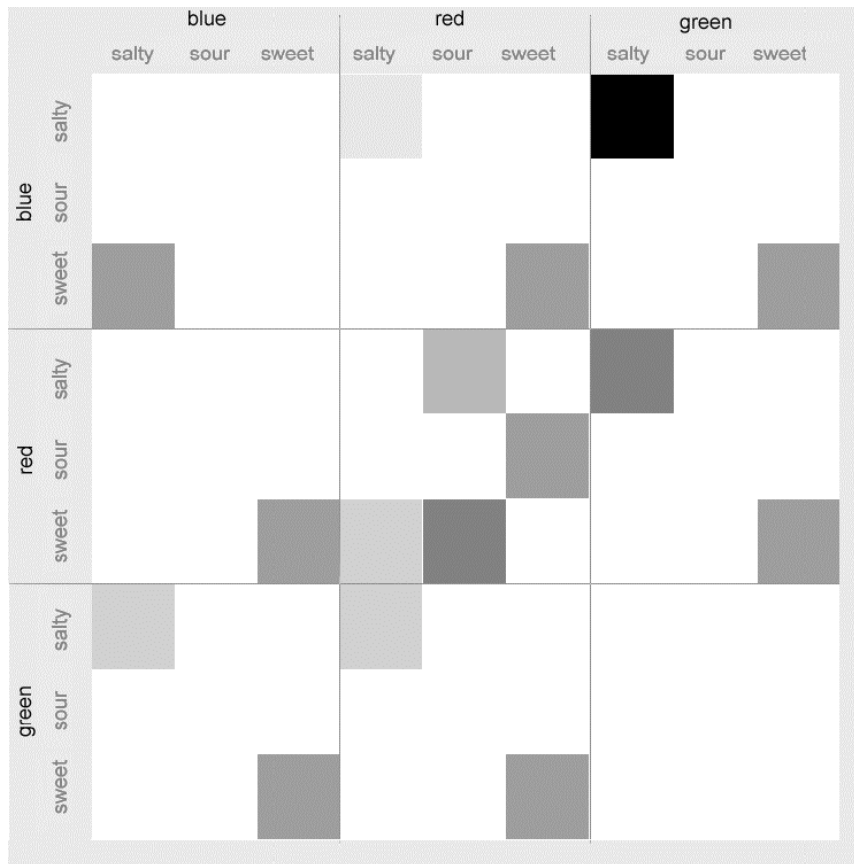
Location E

M

F



Compare 2D Pivot Graph with 2D Matrix



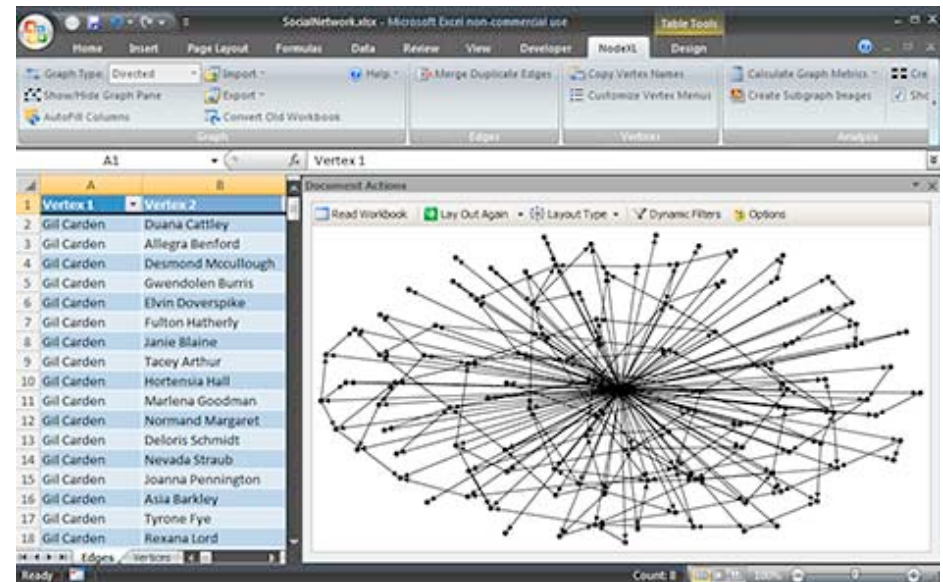
Issues with Pivot Graphs

- Disconnected components may become connected
- Acyclic graphs may obtain cycles

New toolkits!

Networks for excel by Marc Smith et al. at Microsoft research

- Used to be called .Netmap
 - Now called NodeXL
 - Requires windows-specific software
- (Search on “excel NodeXL”)
 - Chart Tamer for Excel
 - Stephen Few et al.



.NetMap: Edges Worksheet

The screenshot shows the Microsoft Excel interface with the 'Table Tools' ribbon selected. The ribbon includes tabs for 'Design' and 'Table Tools'. The 'Table Tools' tab is active, showing options for 'C#UNG' and 'Mindjet MindManager'. The 'Show Graph' checkbox is checked. The 'Table Tools' tab also includes a 'C#UNG 2008' section.

The worksheet is titled 'SampleSocialNetworkv5.xlsx - Microsoft Excel'. The active cell is F3, containing the formula 'Yes'.

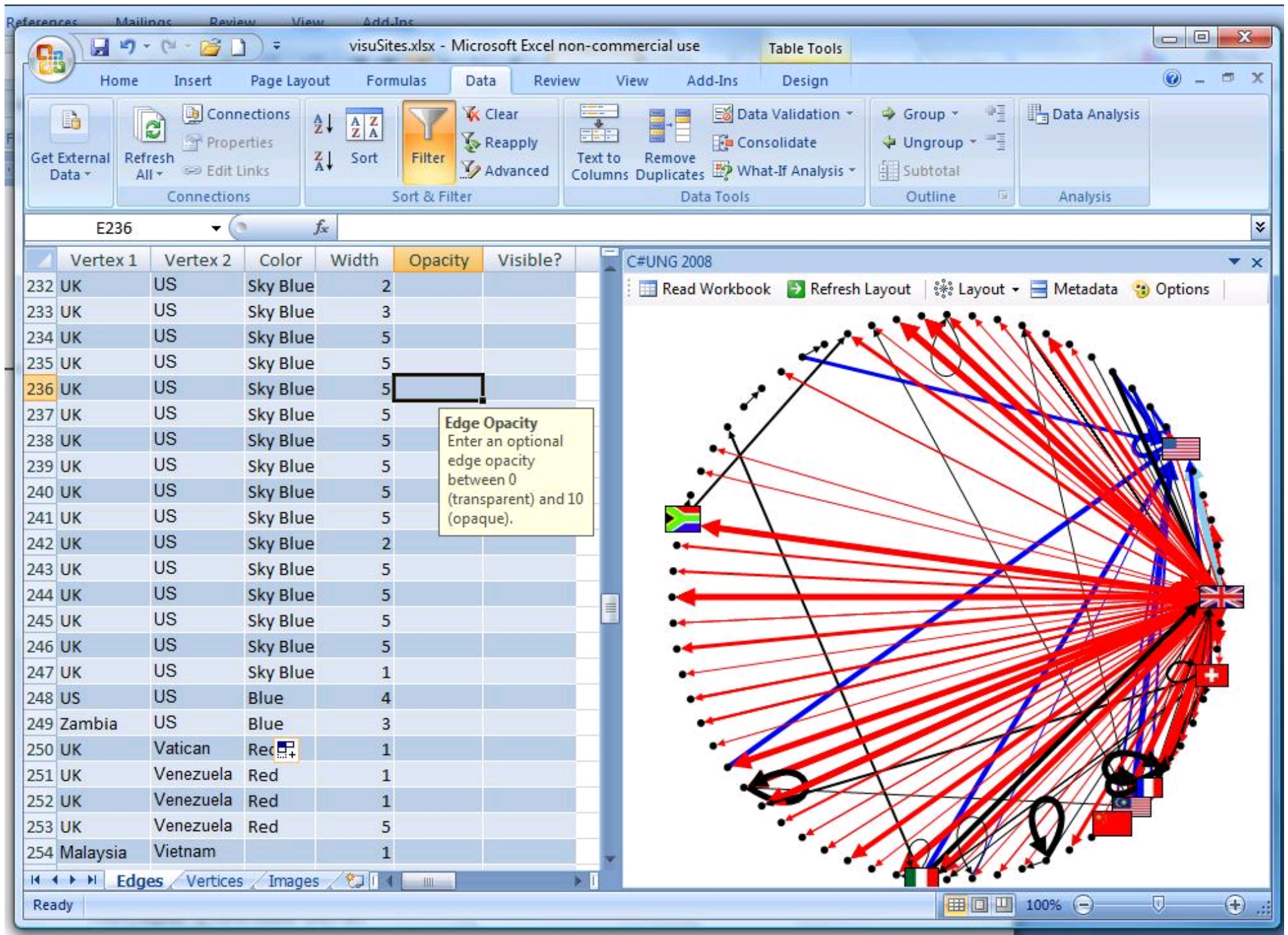
	A	B	C	D	E	F	G	H	I
1	Vertex 1 ▼	Vertex 2 ▼	Color ▼	Width ▼	Opacity ▼	Visible? ▼			
2	16899266	14258203				Yes			Edges Worksheet

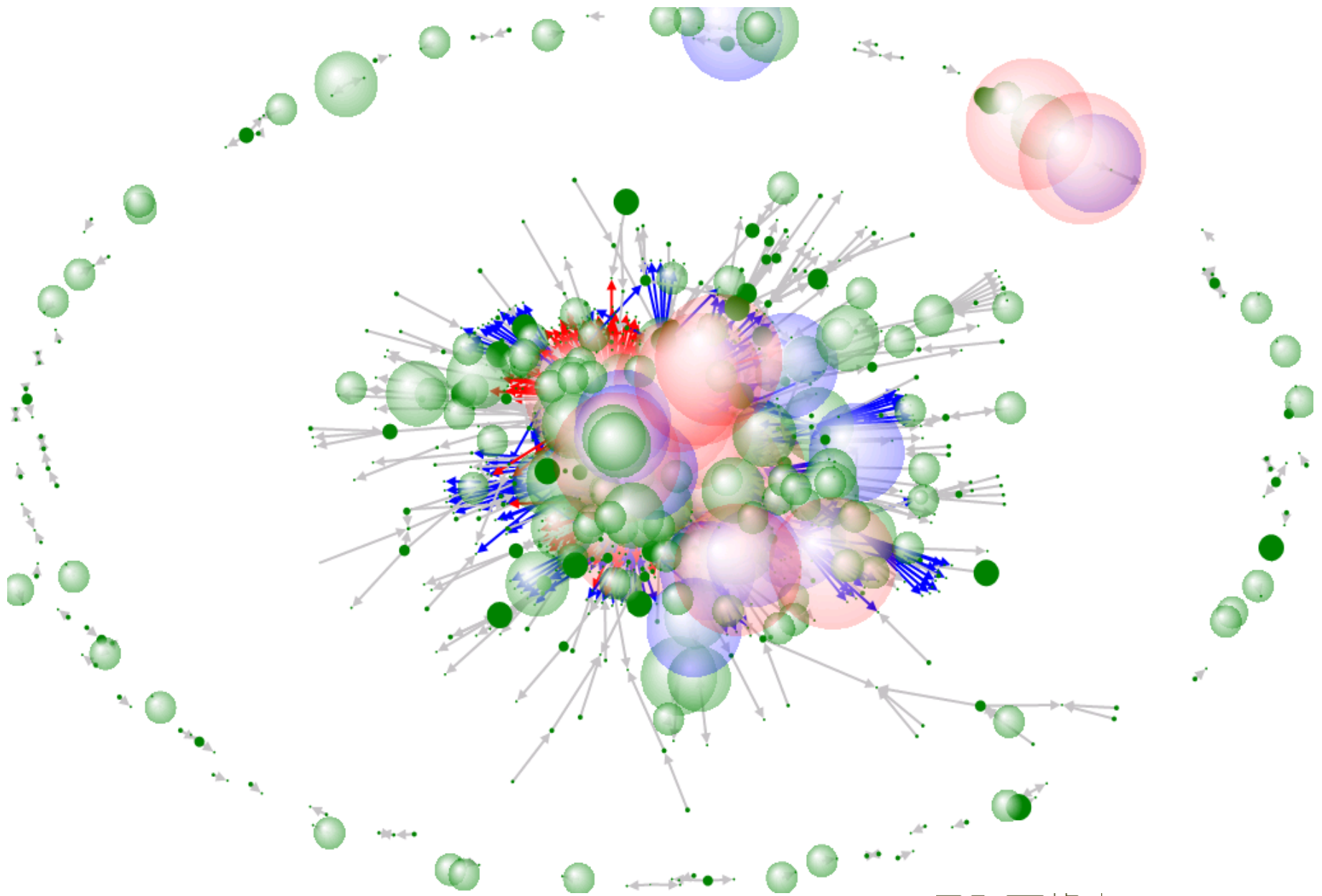
Slide courtesy Marc Smith

.NetMap: Vertices Worksheet

	A	B	C	D	E	F	G	H	I	J	K
1	Vertex ▾	Color ▾	Shape ▾	Radius ▾	Opacity ▾	Image ID ▾	Primary Label ▾	Secondary Label ▾	Tooltip ▾	Visible ▾	
2	16899266		Circle					16899266	16899266		
3	15522825		Circle					15522825	15522825		
4	11305793		Circle					11305793	11305793		
5	42502628		Circle					42502628	42502628		
6	41929652		Circle					41929652	41929652		
7	41901803		Circle					41901803	41901803		
8	41000857		Circle					41000857	41000857		

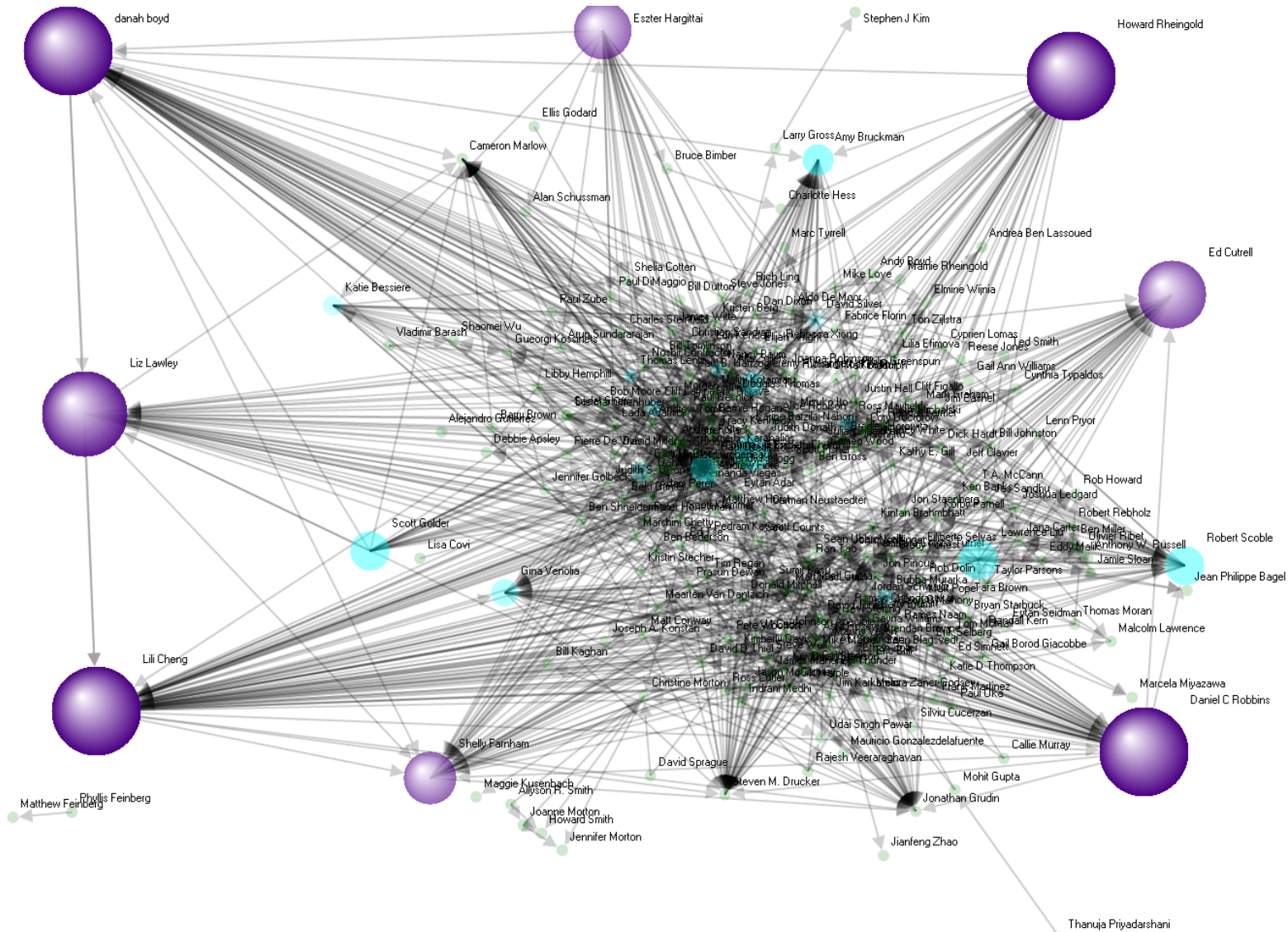
Vertex Radius
Enter an optional
vertex radius
between 0.1 and
50.





Slide courtesy Marc Smith

Marc's Facebook Graph



Neil Gascoigne
Tracy Anne Guest

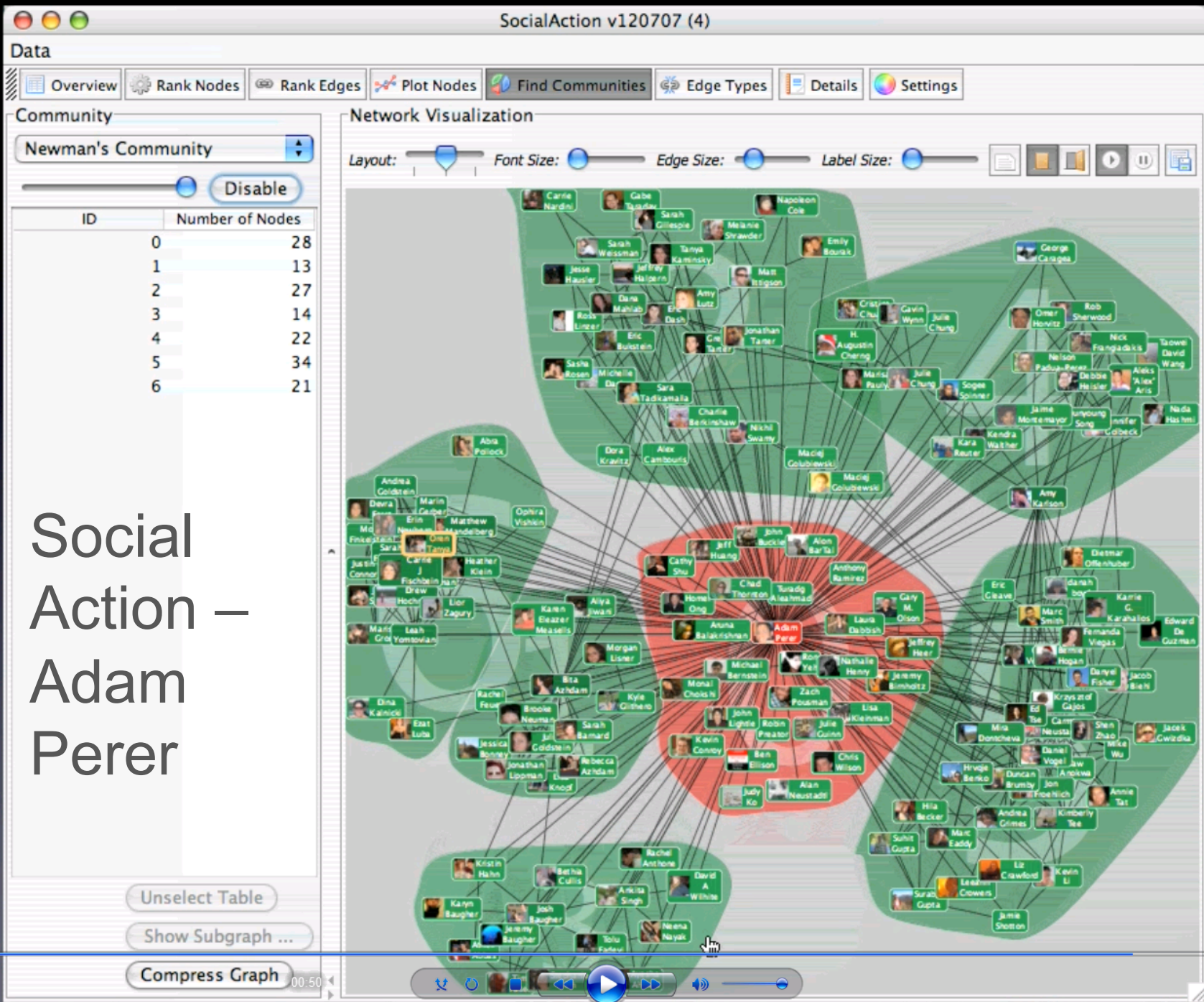


Chart Tamer

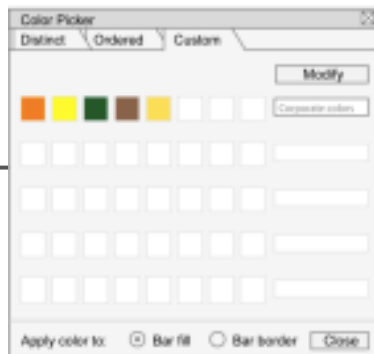


Chart Picker

1. Select the relationship(s) you want to display.

Simple Value Comparison

Time Series

Part-to-Whole/Ranking

Distribution

Single

Multiple

Correlation

2. Select what you want to feature.

Overall trends or patterns

Individual values or intervals

Both of the above

Objects available for encoding data

Bars

Lines

Points

Boxes

3. Select the type of chart you want to use.

Column

Bar

Dot and Strip

Line

Box and Stock

Scatter and Bubble

Combination

You will present a distribution relationship using bars in the form of a...

Reset

OK

Cancel

- Stephen Few + XL³
- Function-based



SCHOOL OF INTERACTIVE
ARTS + TECHNOLOGY