

6. Graphs & Networks

Visualizing relations



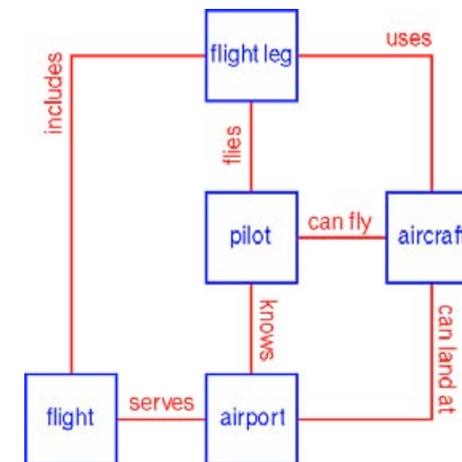
Dr. Thorsten Büring, 29. November 2007, Vorlesung Wintersemester 2007/08

Outline

- ☰ Graph overview
 - ☰ Terminology
 - ☰ Networks and trees
 - ☰ Data structures
 - ☰ Graph drawing
- ☰ Comparison of graph layouts
- ☰ Graph visualization examples
 - ☰ Social networks
 - ☰ Copurchase network
 - ☰ Music network
 - ☰ Transportation network
- ☰ Case study: Telephone network visualizations
- ☰ Comparing node-link and matrix representations
- ☰ Interaction and animation

Graph Overview

- ≡ Graph definition: an abstract structure that is used to model information
- ≡ Can represent any information that can be modeled as objects and connections between those objects
- ≡ Objects represented by vertices
- ≡ Relations between objects represented by edges
- ≡ Commonly visualized as node-link diagrams
- ≡ Example domains
 - ≡ World Wide Web
 - ≡ Telephone networks
 - ≡ Financial transactions
 - ≡ Call graph in software engineering (which functions call which other functions)
 - ≡ CVS repositories
 - ≡ Social networks
 - ≡ Transportation networks
 - ≡ Co-citations...
- ≡ Graphs in InfoVis shall facilitate the understanding of complex patterns



Automatically generated airline database schema, Tamassia et al. 1988

Challenges in Graph Drawing

≡ Graph Visualization (layout and positioning)

- ≡ How to present a graph to convey the most information and to make it easy to read and interpret it

≡ Scale

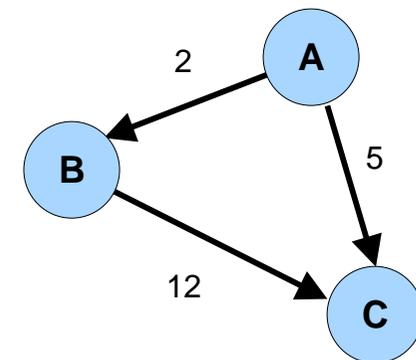
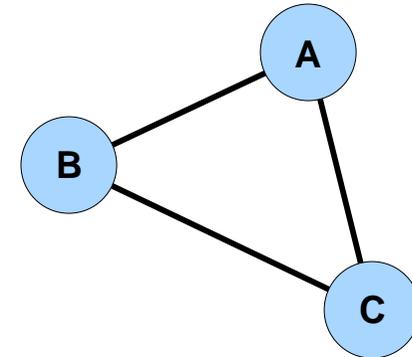
- ≡ Performance of layout algorithms
- ≡ Limited real estate of display area

≡ Navigation and Interaction

- ≡ How to enable the user to move around the graph and inspect portions of the graph in detail

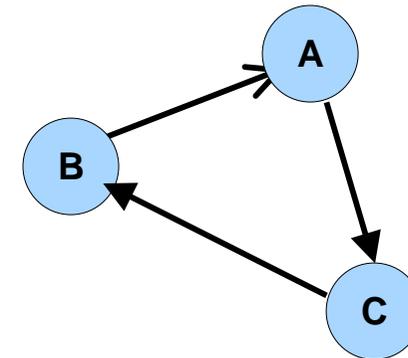
Graphs Terminology

- ≡ Graph consists of
 - ≡ Nonempty set of vertices (points)
 - ≡ Set of edges that link together the vertices
- ≡ Undirected graph
- ≡ Directed graph (usually indicated by arrows)
- ≡ Mixed graph – contains both directed and undirected graphs
- ≡ Unweighted vs. weighted (nominal, ordinal quantitative) edges
- ≡ Degree of a vertex: the number of edges connected to it
- ≡ In-degree and out-degree for directed graphs
- ≡ Adjacency
 - ≡ Two edges sharing a common vertex
 - ≡ Two vertices sharing a common edge



Graphs Terminology

- ≡ Path: a traversal of consecutive vertices along a sequence of edges
- ≡ Length of the path: number of edges that are traversed along the path
- ≡ Simple path: no repeated vertices within the path
- ≡ Cycle: a path in which the initial vertex of the path is also the terminal vertex of the path
- ≡ Acyclic: a simple directed graph not containing any cycles

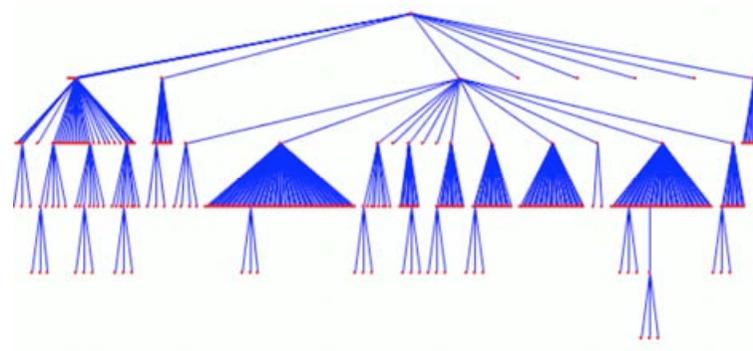


Directed Graph Cycle

Special Types of Graphs

≡ Network

- ≡ Directed Graph
- ≡ Usually weighted edges
- ≡ No topological restrictions
- ≡ Examples: social, economic, transportation networks

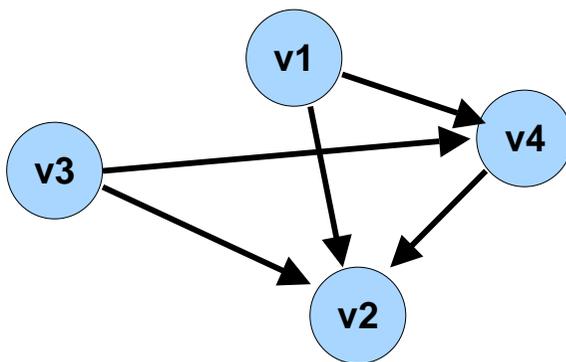


≡ Tree

- ≡ No cycles
- ≡ Usually directed edges
- ≡ Usually special designated root vertex
- ≡ Example: organizational chart
- ≡ Will be topic of next lecture!

Data Structures for Graphs

- ≡ Storing and processing a graph on a computer
- ≡ Adjacency List - usually used for graphs with small numbers of edges
- ≡ Adjacency Matrix - allows powerful matrix operations but is often more memory demanding
 - ≡ Row: edges leaving the vertex
 - ≡ Column: edges entering the vertex
- ≡ Example for directed graph



```
v1 -> v2 -> v4  
v2 ->  
v3 -> v2 -> v4  
v4 -> v2
```

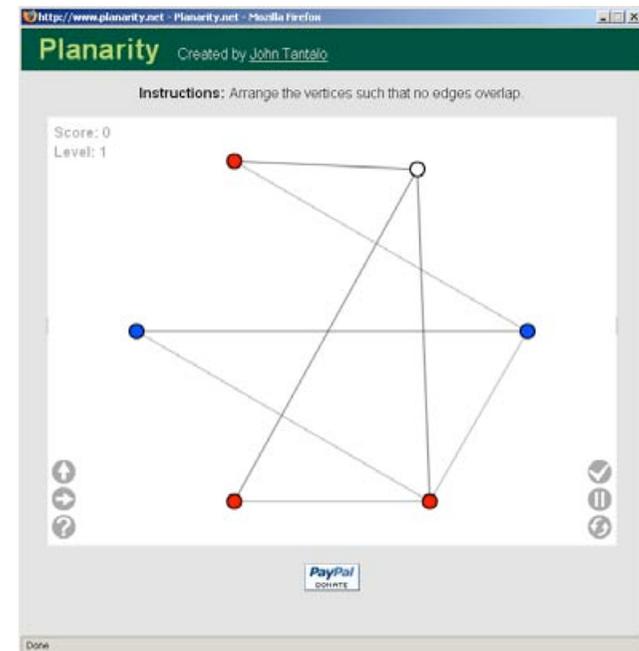
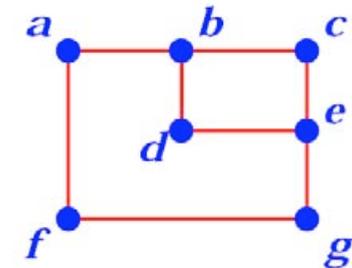
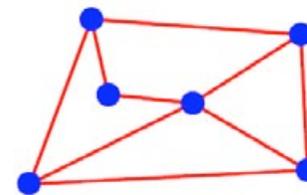
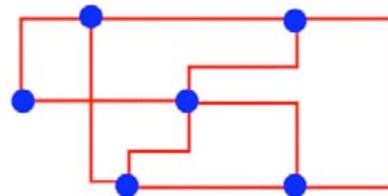
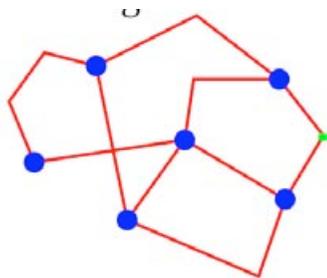
	v1	v2	v3	v4
v1	0	1	0	1
v2	0	0	0	0
v3	0	1	0	1
v4	0	1	0	0

Graph Drawing

- ≡ Many ways to draw a graph
- ≡ Vertices are usually represented by circles
- ≡ Edges are usually represented by open curves between vertices
- ≡ Node-link diagram
- ≡ Potential encoding attributes
 - ≡ Color
 - ≡ Size
 - ≡ Form / Shape
- ≡ Labeling is often difficult due to clutter

Graph Drawing

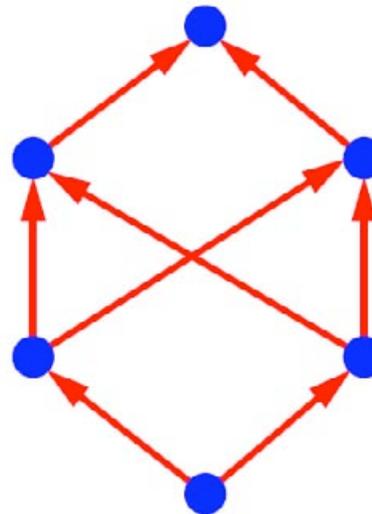
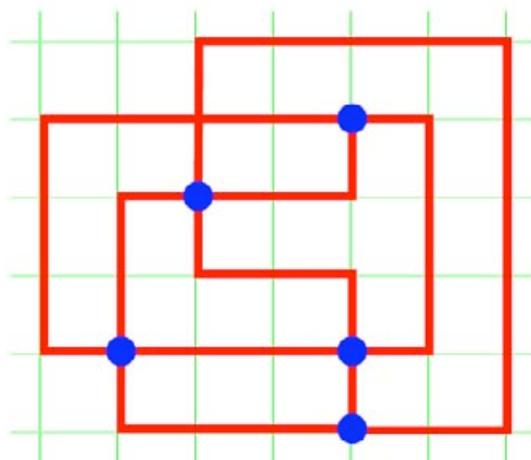
- ≡ Layout algorithms can be categorized by the type of layout they generate
- ≡ Planar: edges do not intersect
- ≡ Straight, polyline (edge with bends) or curved lines
- ≡ Orthogonal: polyline drawing that maps each edge into a chain of horizontal and vertical segments



Images taken from Cruz & Tamassia

Graph Drawing

- ≡ Grid-based: vertices (and bends of the edges) have integer coordinates – implies minimum distance between vertices and nonincident edges
- ≡ Upward / downward drawing for directed acyclic graphs: make edges flow in the same direction, e.g. for visualizing hierarchies



Images taken from Cruz & Tamassia

Layout Aesthetics

- ≡ Minimize crossing – keep the number of times that lines cross to a minimum (hardly applicable in interactive systems)
- ≡ Minimize area – keep the area that the graph takes up to a minimum by producing a compact graph
- ≡ Minimize the sum of the edge lengths
- ≡ Obtain a uniform edge length – try to keep each of the edges at the same lengths
- ≡ Minimize bends – keep the number of times there is a bend to a minimum
- ≡ Display symmetry of graph structure
- ≡ Maximize minimum angles between edges
- ≡ ...

Empirical Results

≡ Purchase 1997

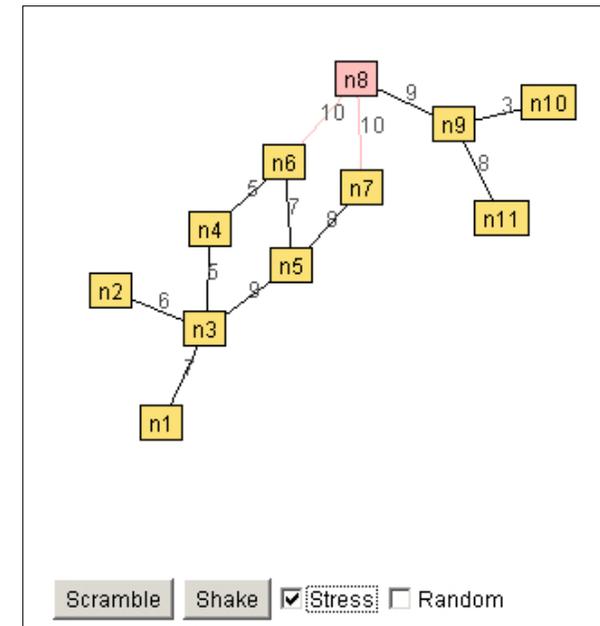
- ≡ Compare task performance on five pairs of graphs
- ≡ Graph pairs differed according to numbers of edge bends, edge crosses, maximizing the minimum angle, orthogonality and symmetry
- ≡ Result: Reducing crossings is by far most important

≡ Ware et al. 2002

- ≡ Experimental task: finding the shortest path in spring layout graphs
- ≡ Results indicate the following prioritization of metrics
 - ≡ Geometric length of the path (implicit property of a graph)
 - ≡ Continuity (keeping multi-edge paths as straight as possible)
 - ≡ Number of edge-crossings

Spring Embedder

- ≡ Force-directed model for graph layout
- ≡ Eades 1984
- ≡ Intuitive approach: apply physical model of forces
 - ≡ Every vertex is considered a steel ring
 - ≡ Every edge a spring
- ≡ Resulting layout represents a configuration of minimum energy (force exerted on each ring is 0)
- ≡ Can produce well-balanced, symmetrical graphs
- ≡ Problem: time consuming – quality of the graph depends on the number of full iterations (visit all pairs of vertices to calculate the effect of the forces) - demo



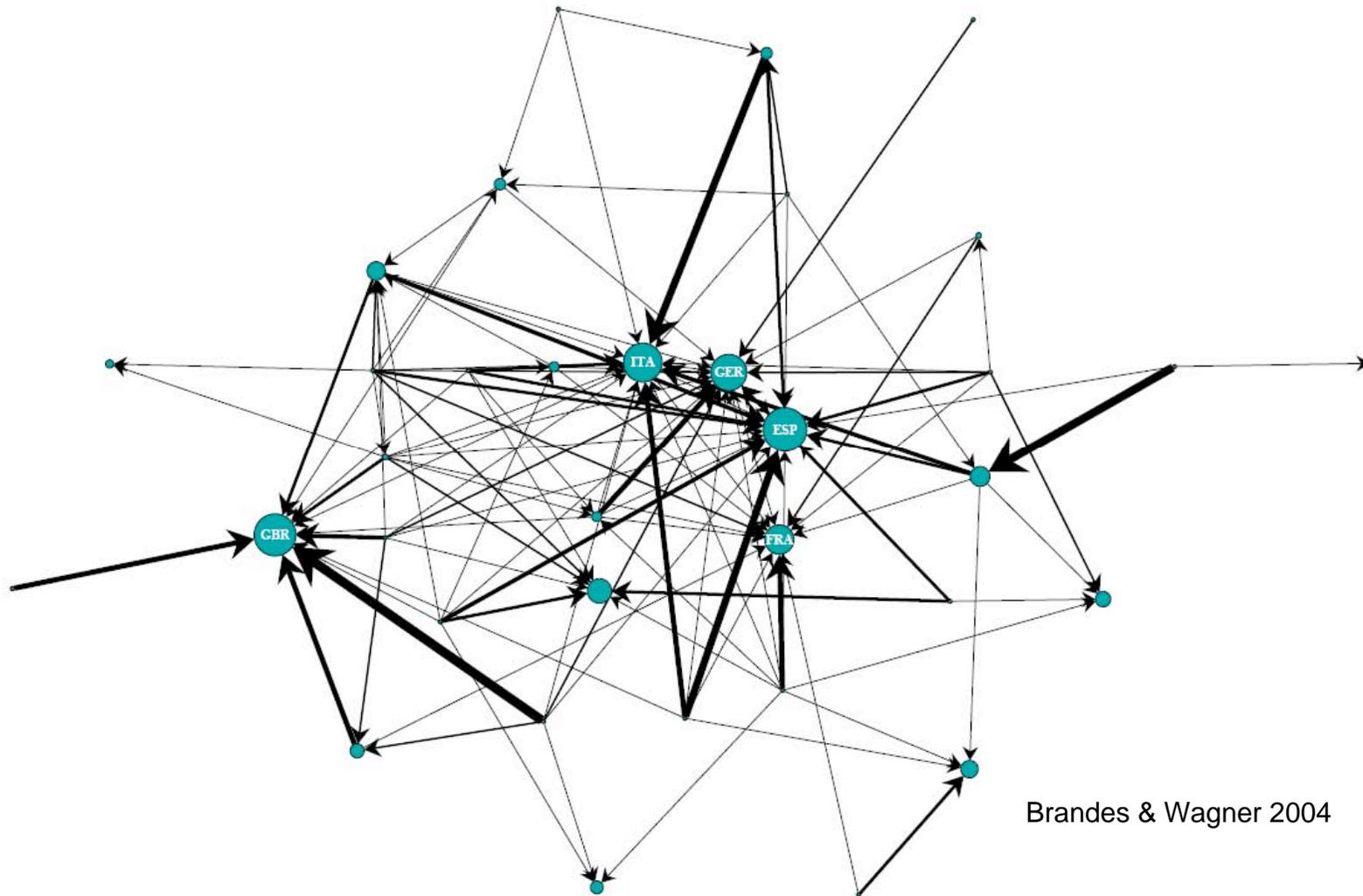
Spring embedder Java applet + source code
<http://www.inf.uni-konstanz.de/algo/lehre/ss04/gd/demo.html>

- ≡ Overview of graph drawing algorithms: Pajntar 2006 (<http://kt.ijs.si/dunja/SiKDD2006/Papers/Pajntar.pdf>)
- ≡ Graph drawing library AGD: <http://www.ads.tuwien.ac.at/AGD/>
- ≡ Graph drawing tutorial: <http://www.cs.brown.edu/~rt/papers/gd-tutorial/gd-constraints.pdf>

Outline

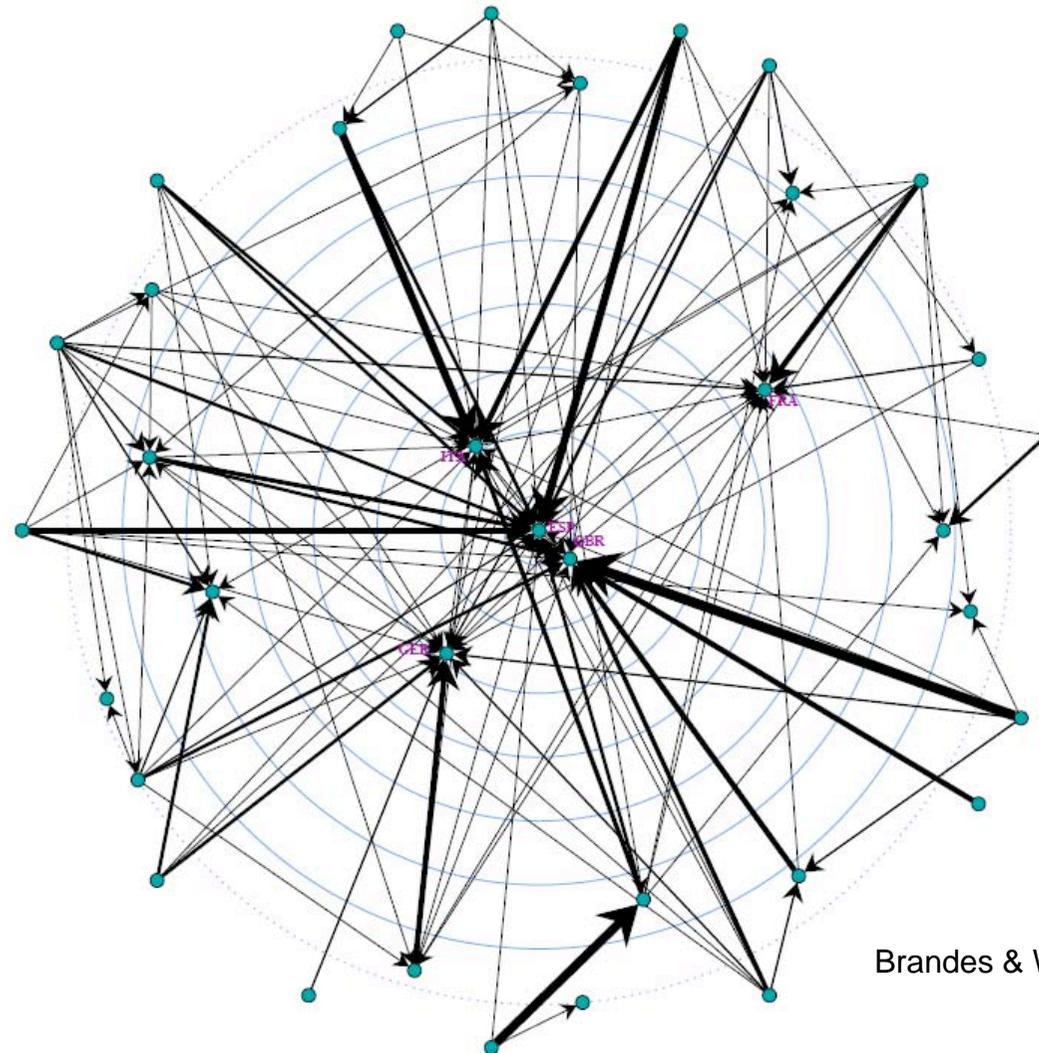
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Graph Layout Example



Brandes & Wagner 2004

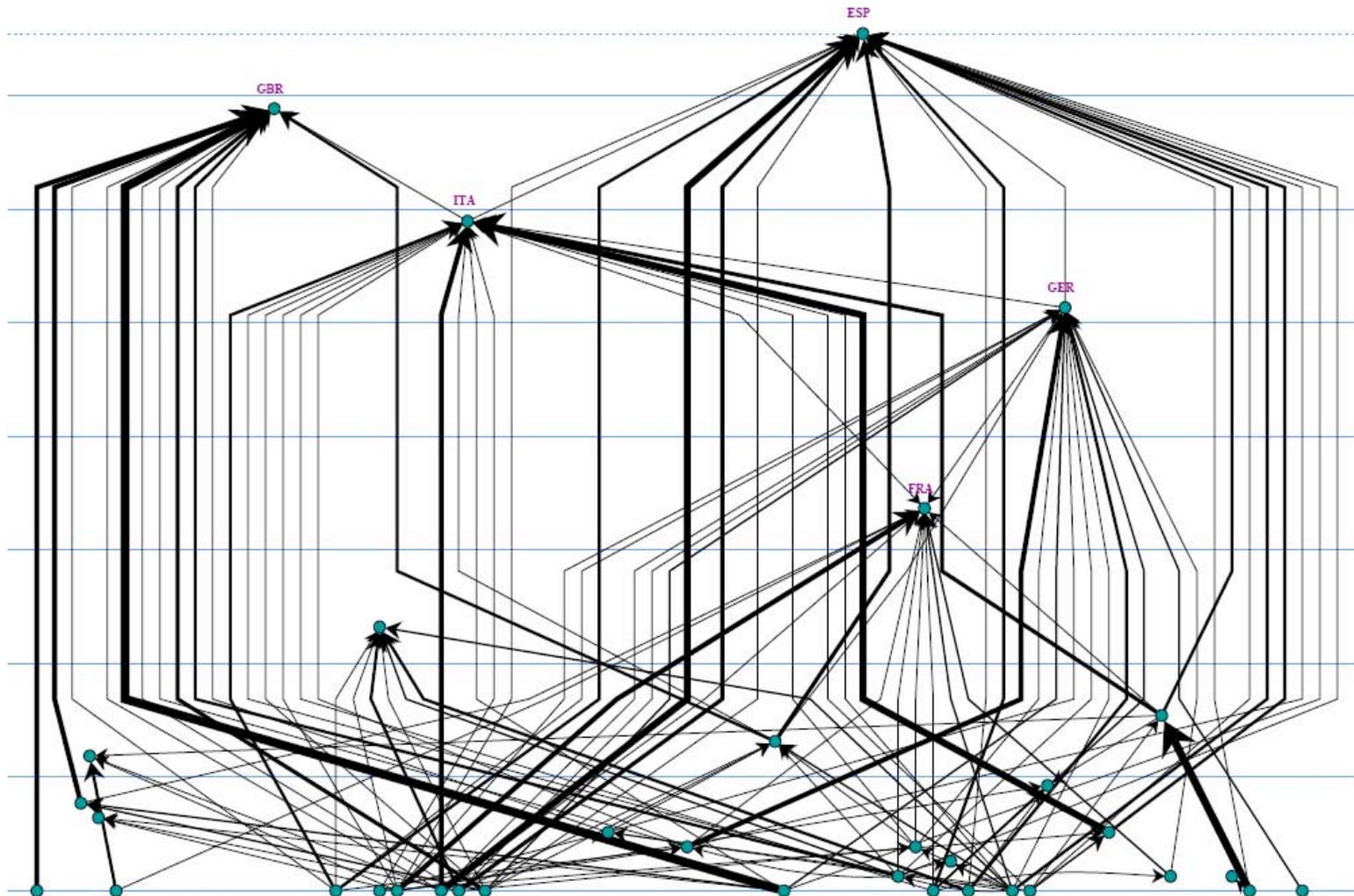
Graph Layout Example



Brandes & Wagner 2004

Graph Layout Example

Brandes & Wagner 2004

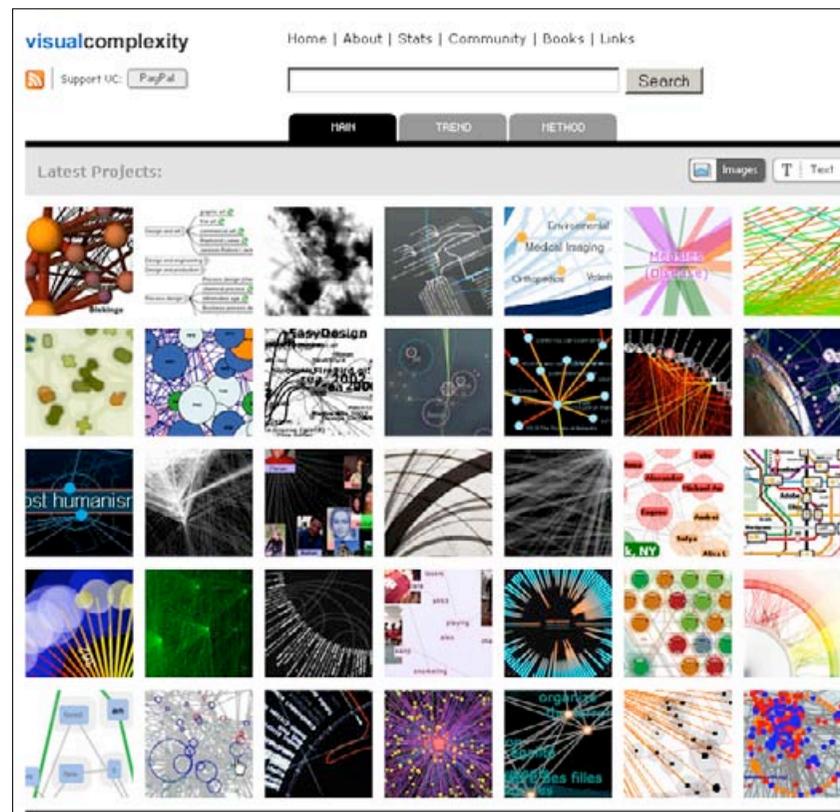


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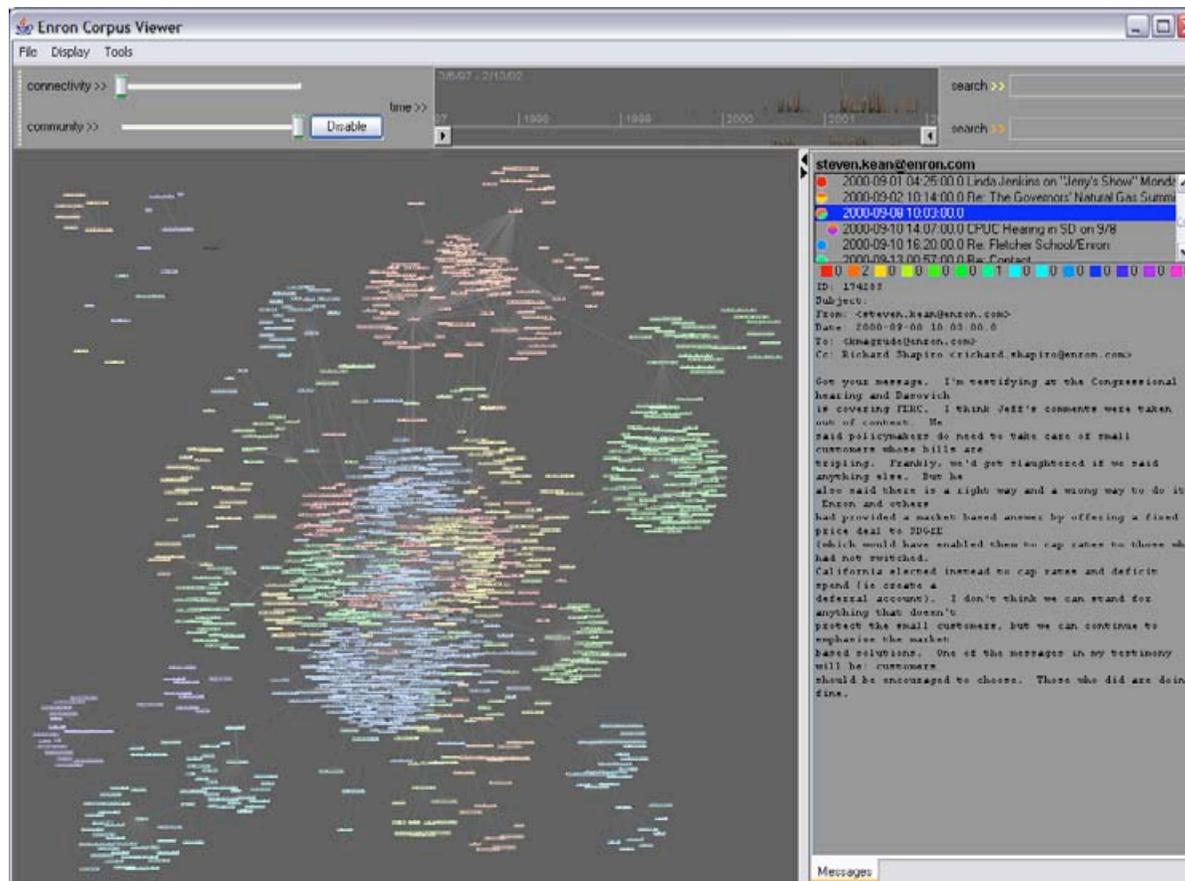
Various Examples of Graph Drawings

≡ <http://www.visualcomplexity.com/>



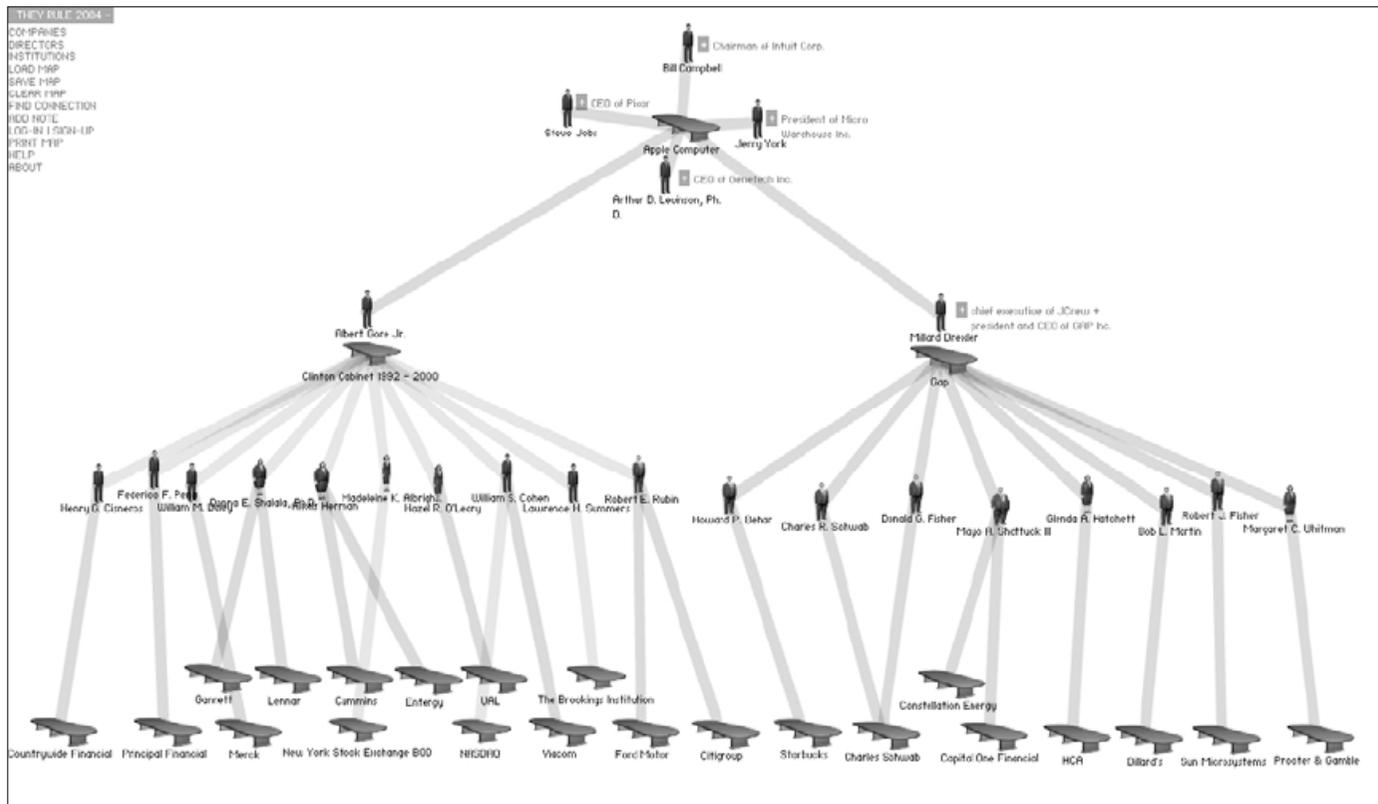
Social Network

☰ Exploring Enron: <http://jheer.org/enron/>



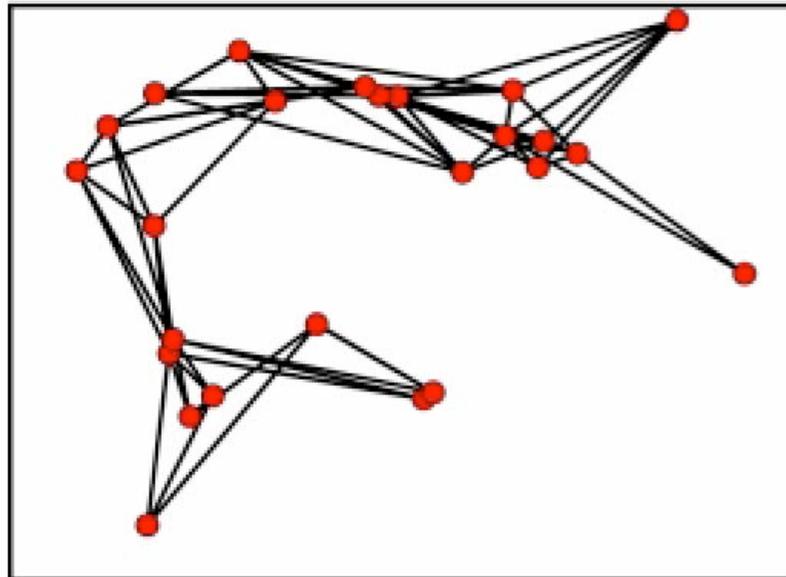
Social Network

They rule: <http://www.theyrule.net/2004/tr2.php>



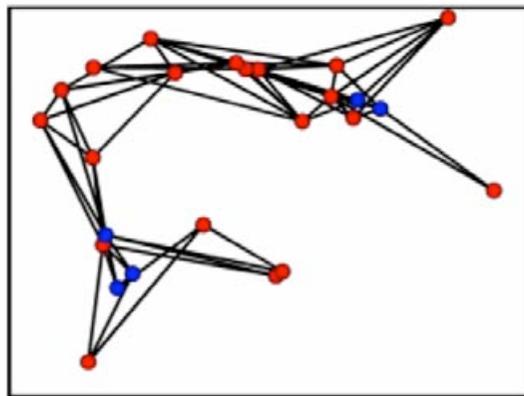
Social Network

- ≡ Freeman 2005 (Example taken from Spence 2007)
- ≡ Employees of a department store spending leisure time together
- ≡ Length of paths represents the shortest path between a pair of employees
- ≡ What is the drive-force behind the pattern?

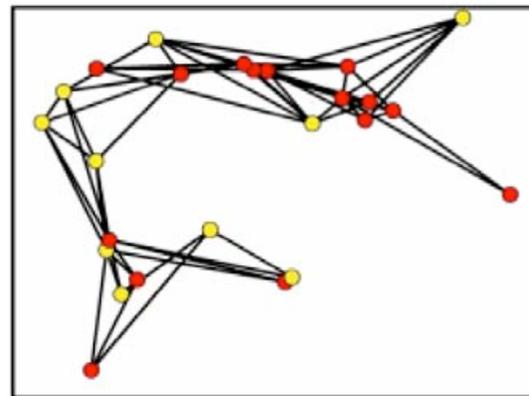


Social Network

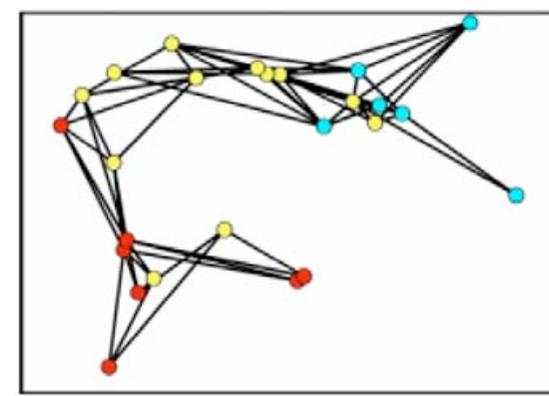
≡ Color-code attributes to detect patterns



Middle-Eastern Ethnic Background



Married persons

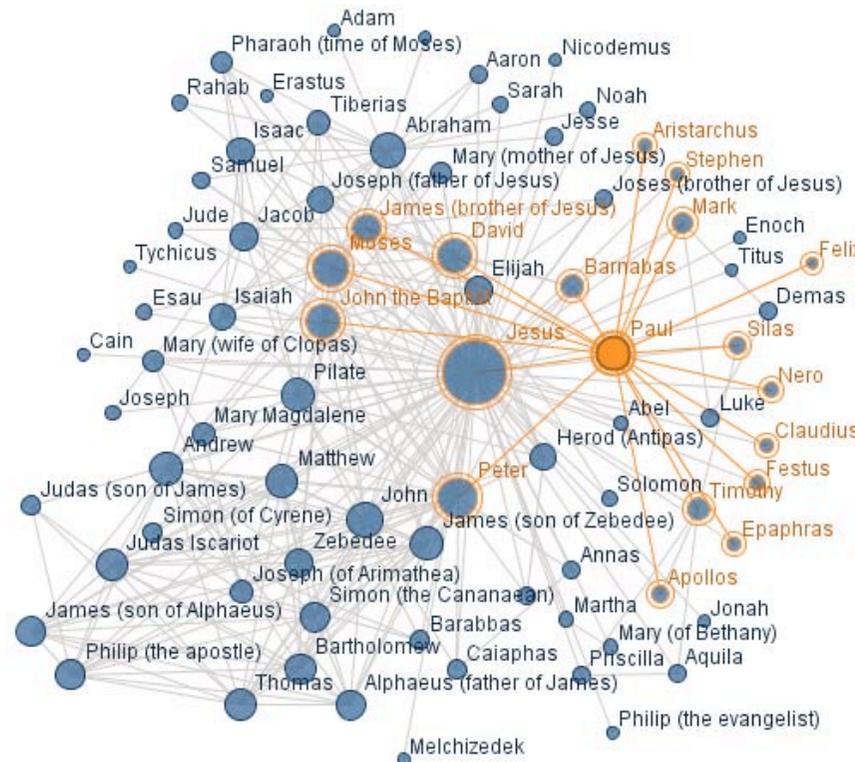


Actor's Age Grades

Social Network?

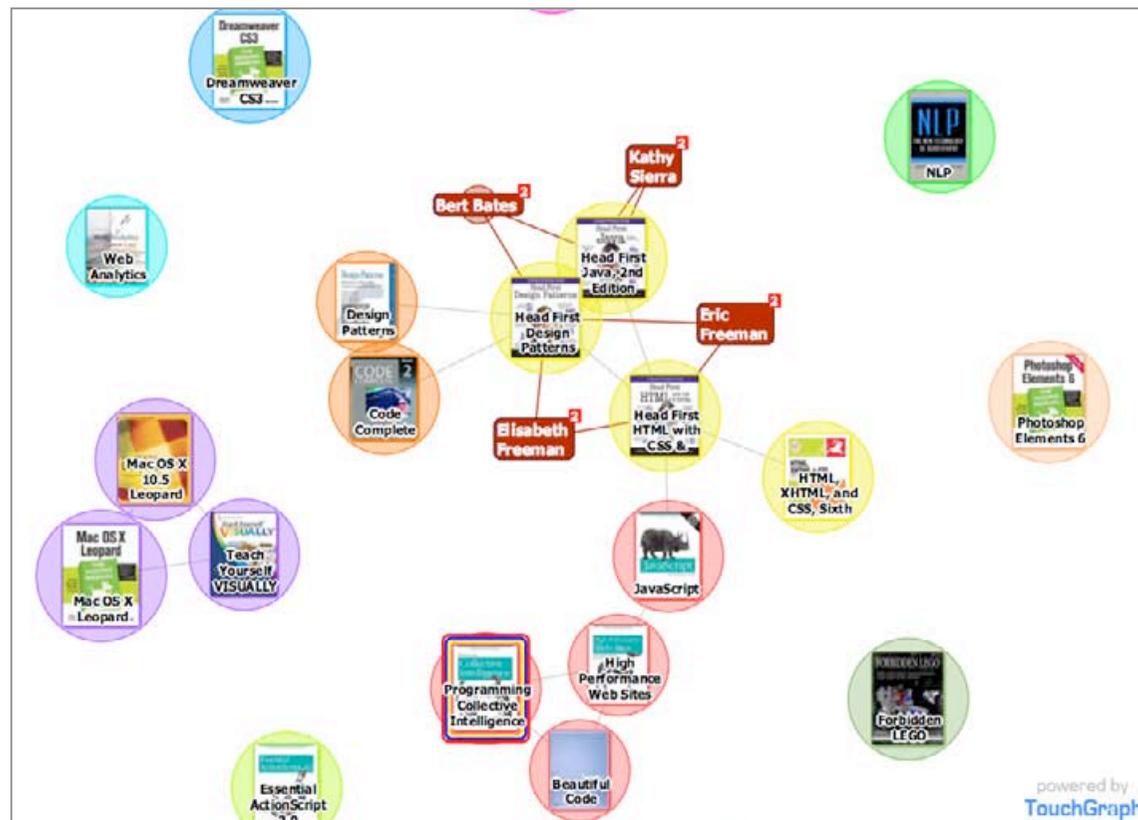
≡ Co-occurrences of names in the new testament:

<http://services.alphaworks.ibm.com/manyeyes/view/SMGTJEsOtha6GEktsYeKE2->



Copurchase Network

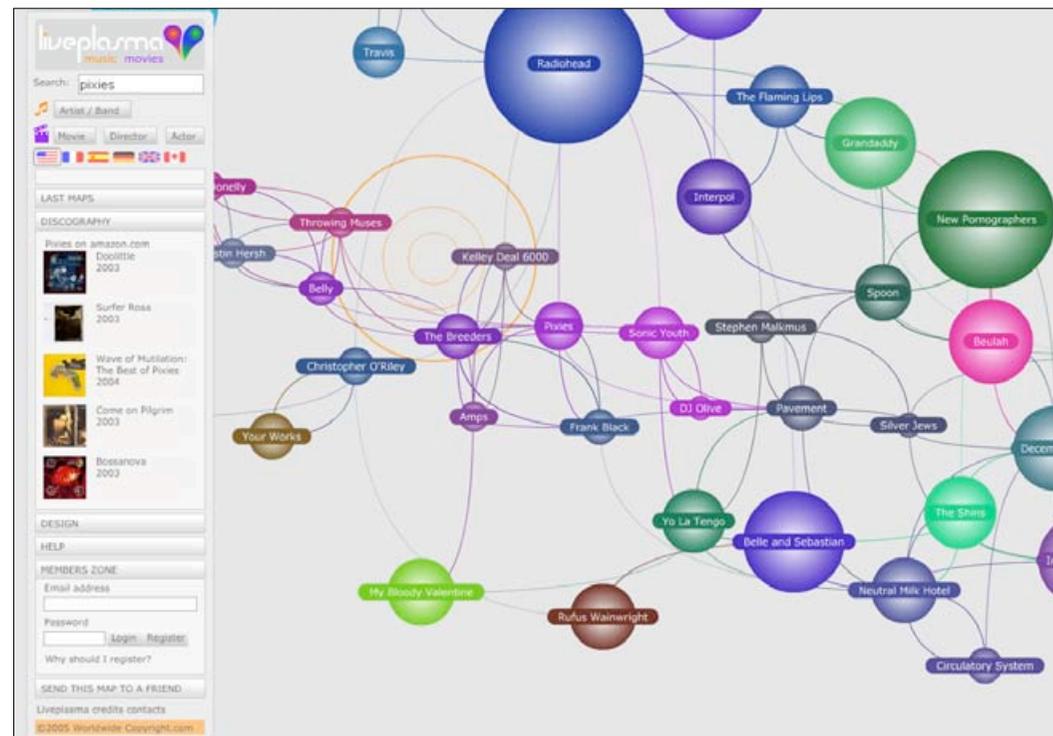
☰ Touch graph: <http://www.touchgraph.com/TGAmazonBrowser.html>



Music + Movie Network

≡ Liveplasma: <http://www.liveplasma.com/>

≡ Mapping and data source unclear

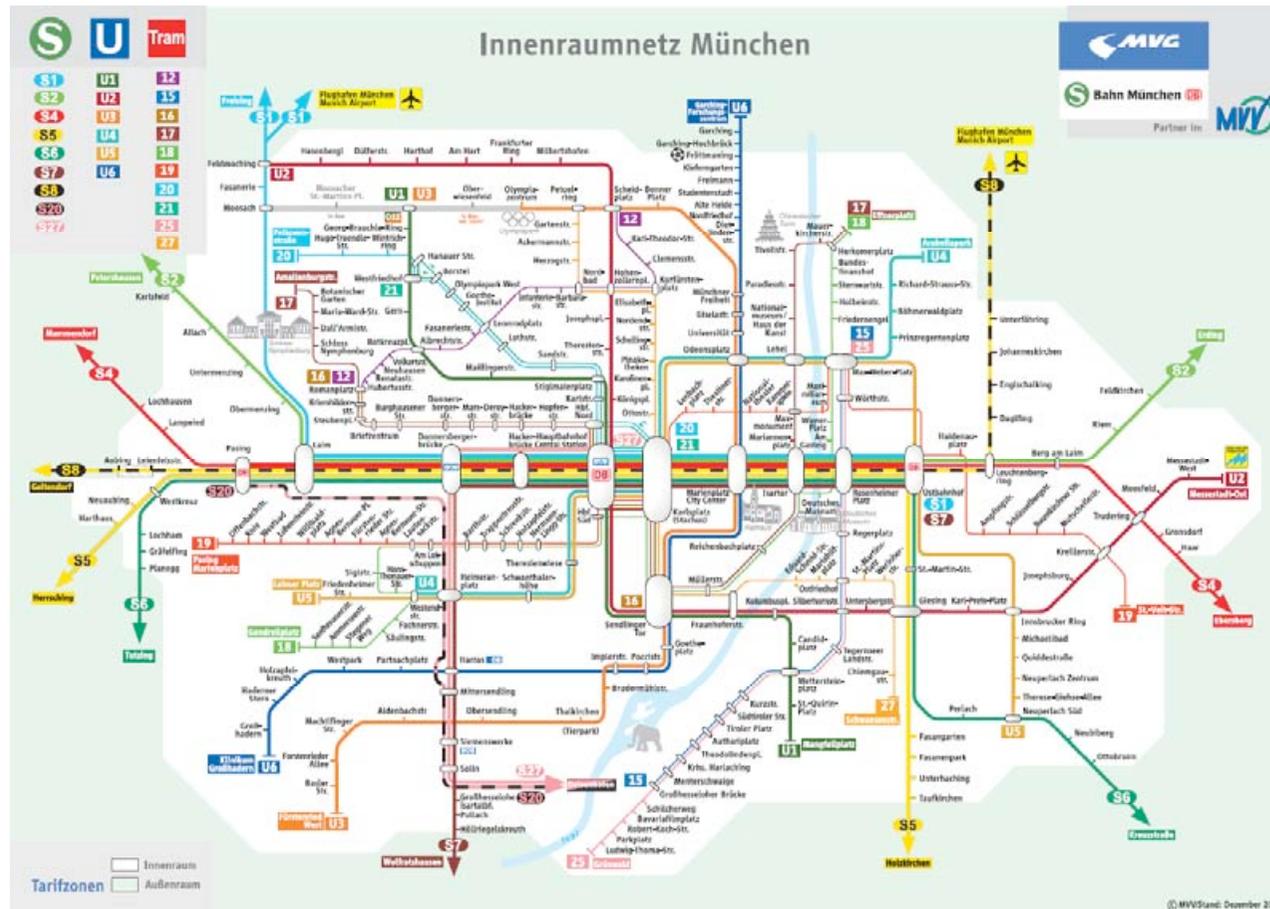


Transportation Network



http://de.wikipedia.org/wiki/U-Bahn_M%C3%BCnchen

Transportation Network



Transportation Network

Objectives

- Facilitate understanding of network connections
 - Fit size and aspect ratio constraint (positioned above the doors in the underground)
- Heavily distorted geographic positions, but still good readability for identifying shortest paths between stations
- Despite landmarks such as rivers, more graph than map



http://de.wikipedia.org/wiki/U-Bahn_M%C3%BCnchen

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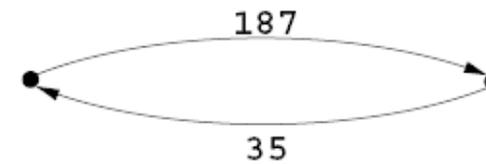
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Telephone Network

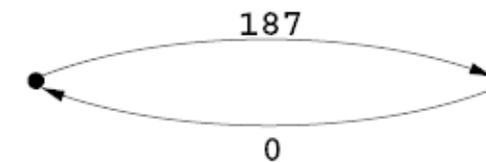
- ≡ Becker et al. 1995 - AT&T data
- ≡ 110 switches (nearly) completely connected
 - ≡ Each vertex has a geographic location
 - ≡ Statistics for each vertex, new data every five minutes
- ≡ 12,000 links between switches
- ≡ October 17, 1989 – **earthquake** in San Francisco Bay area
- ≡ Questions related to network capacity and traffic flows
 - ≡ Where are the overloads?
 - ≡ Which links are carrying the most traffic?
 - ≡ Was there network damage?
 - ≡ Are there any pockets for underutilized network capacity?
 - ≡ Is the overload increasing or decreasing?
 - ≡ Are calls into the affected area completing or are they being blocked elsewhere in the network?
- ≡ Different representations: linkmap, nodemap, matrix display

Linkmap Encoding

- ≡ Switches (vertices) are arranged according to their geographical position
- ≡ Two-tiled edges represent overload of in- and outgoing calls between switches
- ≡ Redundant coding to make the important edges more apparent: color and line-thickness both indicate amount of overload
- ≡ Reduce clutter by omitting edge segments where the overload value is zero

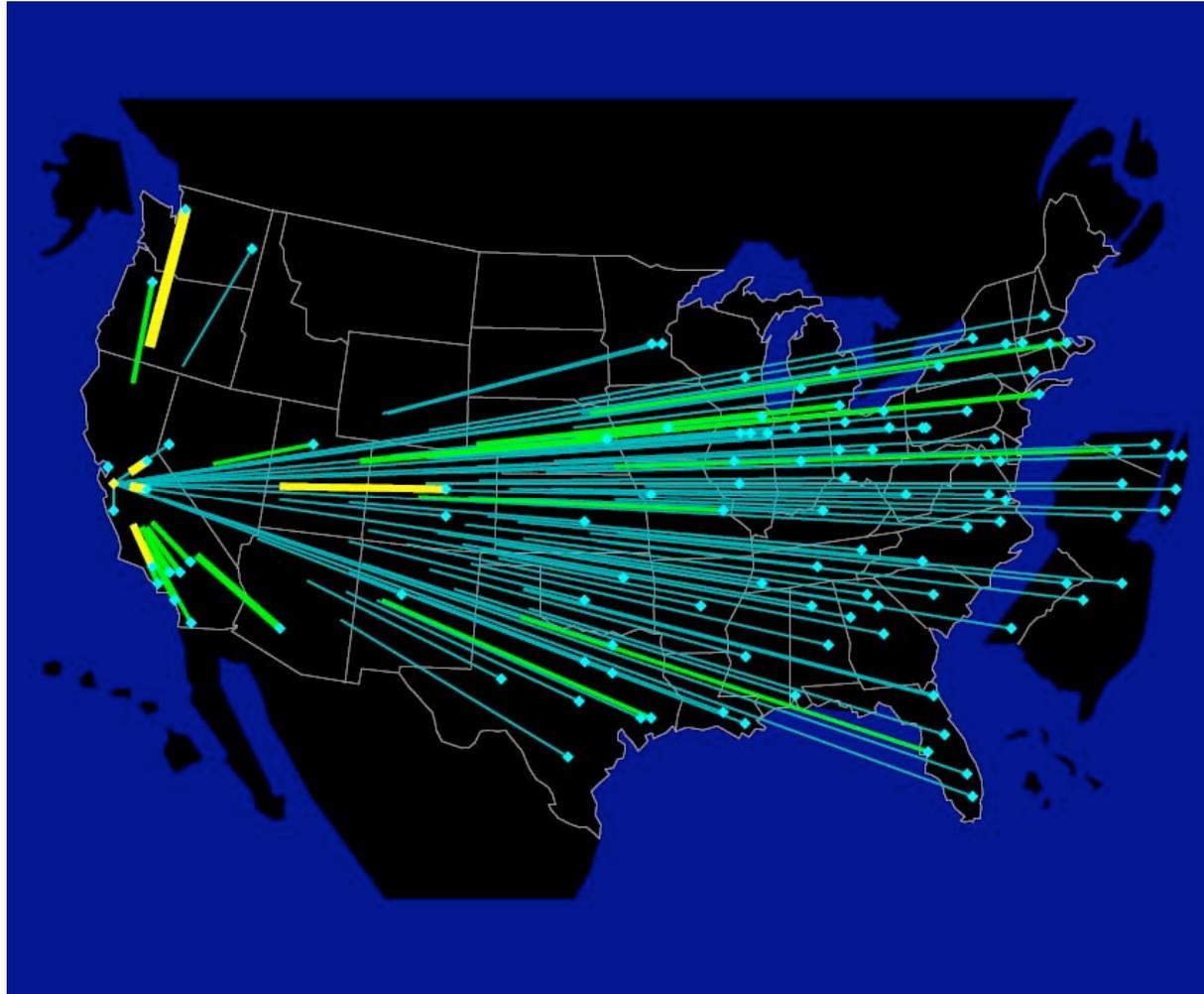


(a)



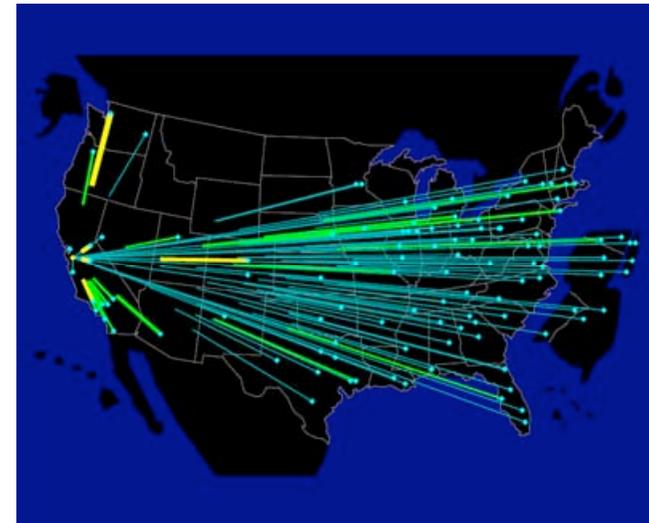
(b)

Linkmap - Oakland Switch



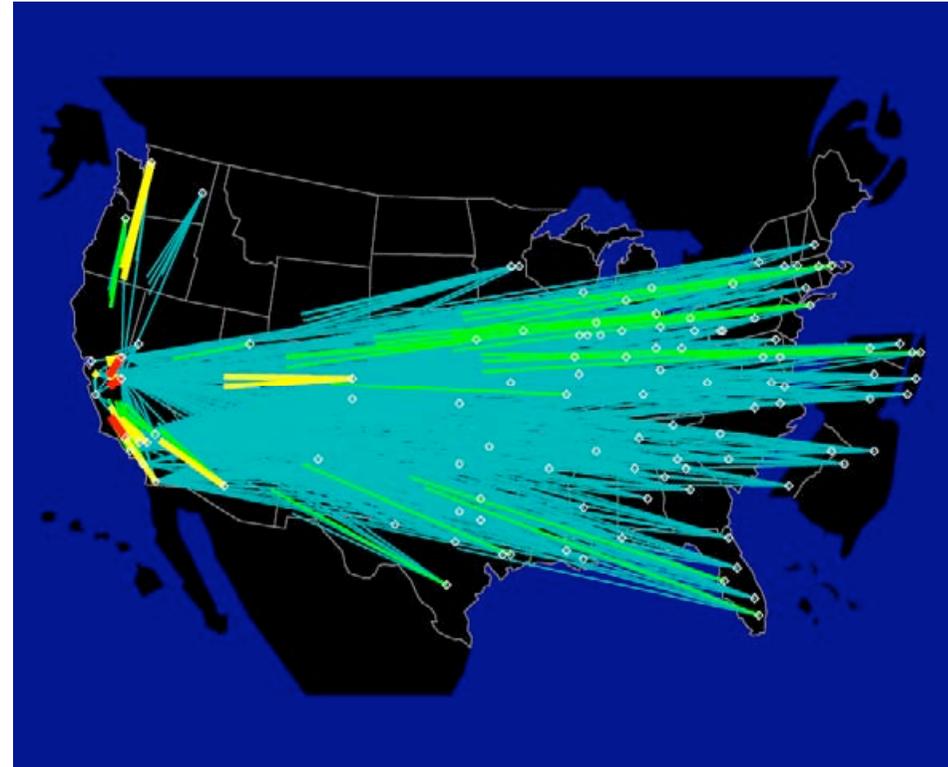
Linkmap - Oakland Switch

- ≡ Overload into one switch
 - ≡ Into Oakland switch from every other node (most heavily from Seattle and Denver)
 - ≡ Out of Oakland switch to many switches particularly on the east coast
- ≡ Island in the Atlantic Ocean is a blow-up of NY / New Jersey area (to reduce density of switches)
- ≡ Does work well because the edges hardly overlap
- ≡ What about showing total overload?

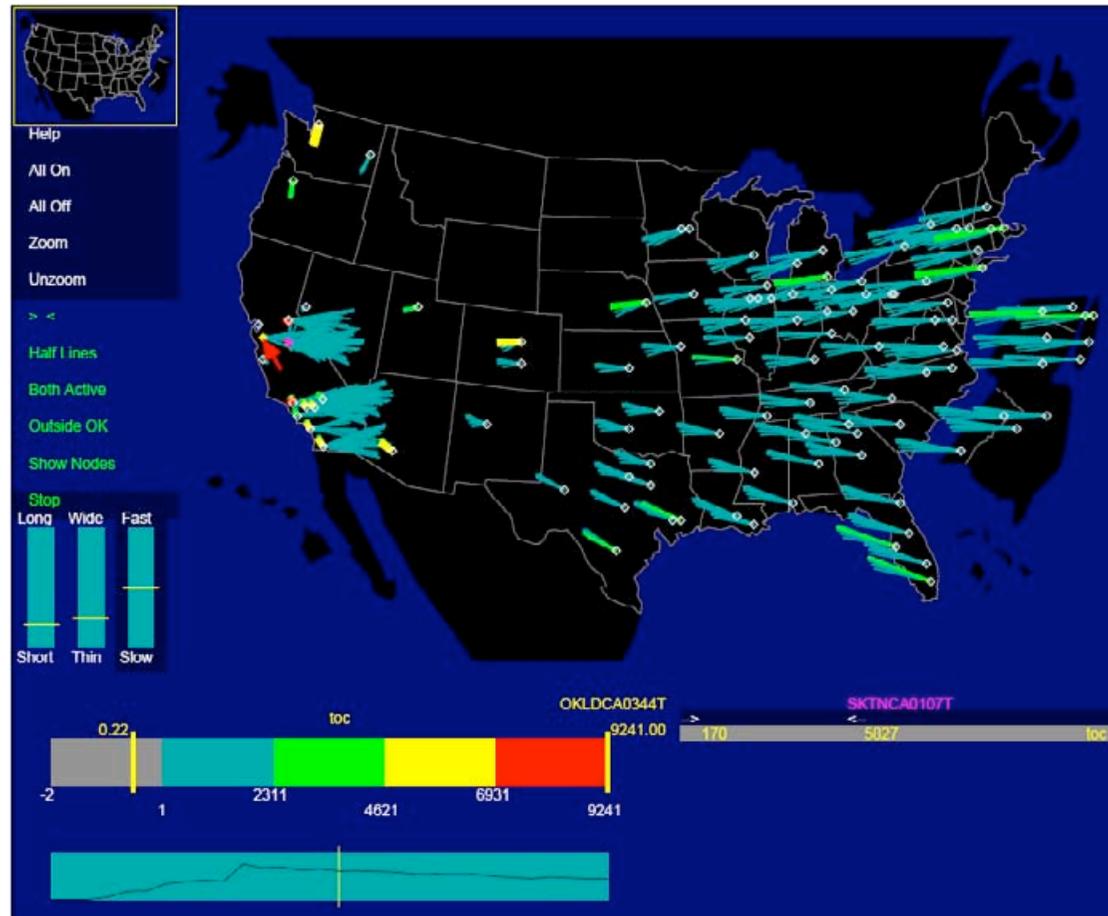


Linkmap - Total Overload

- ≡ Most important links are drawn last
- ≡ Still: display is ineffective because long edges from one coast to another obscure much of the country
- ≡ To reduce clutter: edge may be drawn only part way between the vertices they connect



Linkmap - Total Overload



Nodemap

≡ Glyph encoding

- ≡ Aggregate overload into and out of each switch
- ≡ Rectangle width: proportional to the square root of the number of incoming calls
- ≡ Rectangle height: proportional to the square root of the number of outgoing calls
- ≡ Area of rectangle proportional to total overload

≡ Interpretation: overload of outgoing calls from nodes to northern and southern California

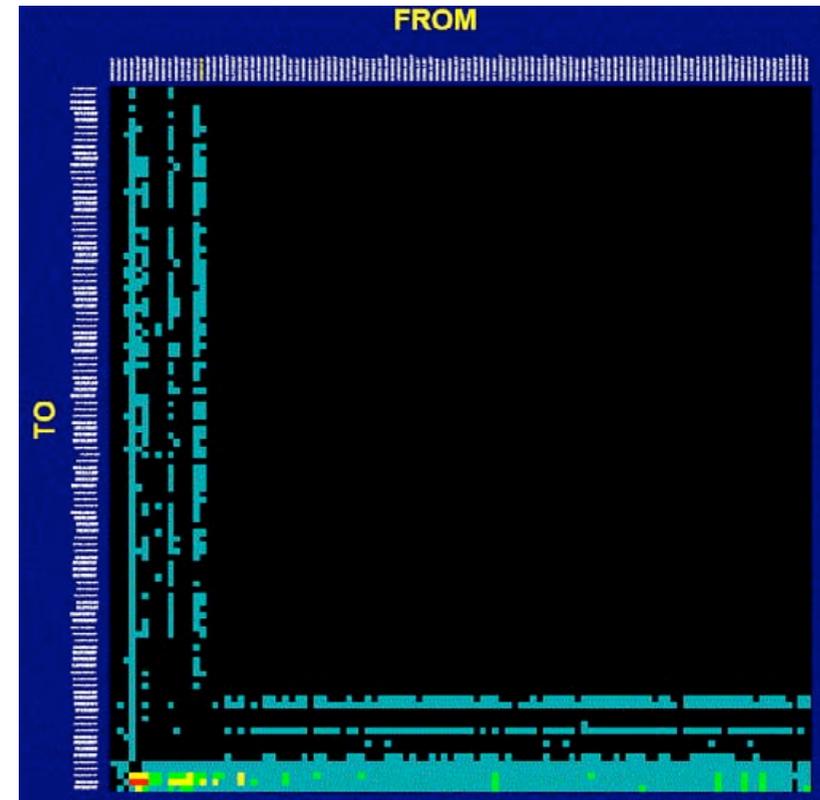
≡ Problem with this kind of representation?

≡ No clutter, but detailed information about particular links between switches is lost



Matrix Display

- ≡ Omits information about geography
- ≡ Each matrix element is allocated to a directed link (half-line)
- ≡ Each switch is assigned to one row (incoming calls) and one column (outgoing calls)
- ≡ Switches are arranged west-to-east
- ≡ Interpretation
 - ≡ Five switches with major incoming overload (rows)
 - ≡ One switch with outgoing overload to almost every other node (column)
- ≡ Very compact visualization without clutter
- ≡ Problems with this kind of representation?
- ≡ Inference of the visualization is influenced by the ordering of the rows and columns
- ≡ Intuitiveness and readability when compared to a node-link diagram?

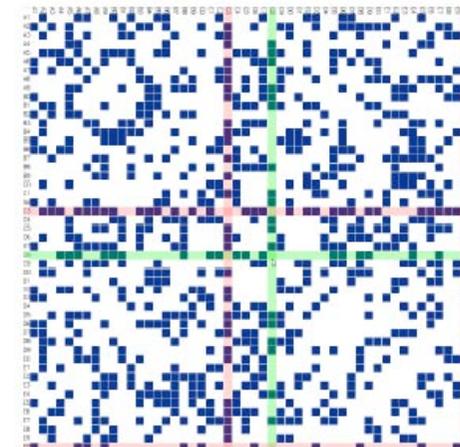
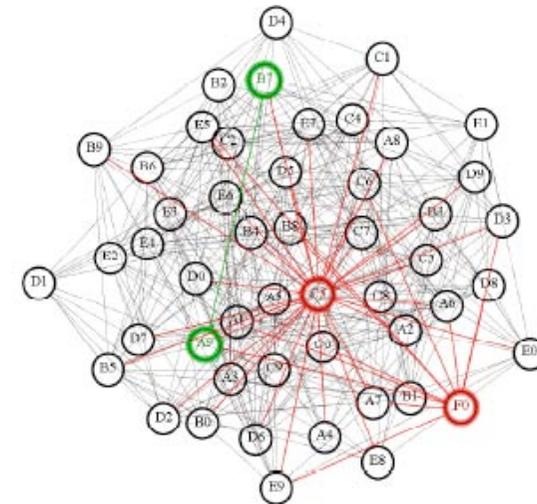


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Node-link versus Matrix

- ≡ Ghoniem et al. 2004
- ≡ On-demand highlighting of selected nodes and links
- ≡ 36 participants
- ≡ Tasks to test readability
 - ≡ Estimation of number of vertices in the graph
 - ≡ Estimation of number of edges
 - ≡ Locating most connected node
 - ≡ Locate node by label
 - ≡ Find link between two specified nodes
 - ≡ Finding a common neighbor between two specified nodes
 - ≡ Finding a path between two nodes
- ≡ Random undirected graphs of three different sizes (number of vertices) and density (relative number of edges)



Node-link versus Matrix

- ≡ Independent variables
 - ≡ Graph representation
 - ≡ Number of vertices
 - ≡ Relative number of edges
- ≡ Dependent variables
 - ≡ Answer time (results not shown here)
 - ≡ Number of correct answers
- ≡ All users were familiar with node-link diagrams, but not with matrices
- ≡ Node-link diagrams seem to be well suited for small graphs but their readability quickly deteriorates with a growing size of the graph and link density
- ≡ Matrix provides a superior readability for large or dense graphs
- ≡ Node-link diagram only clearly superior for find-path task

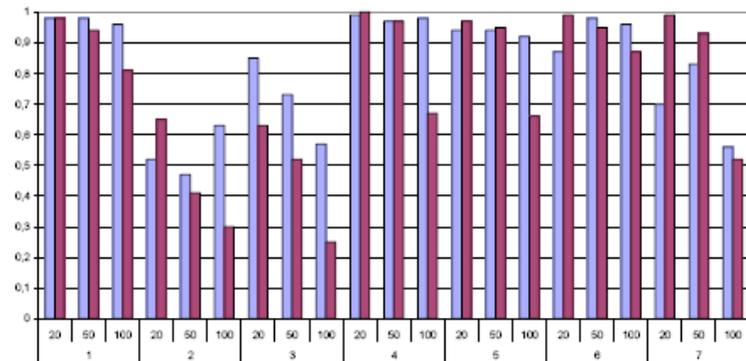


Figure 2 Percentage of correct answers split by task and by size. The matrix representation appears in blue and the node-link in purple.

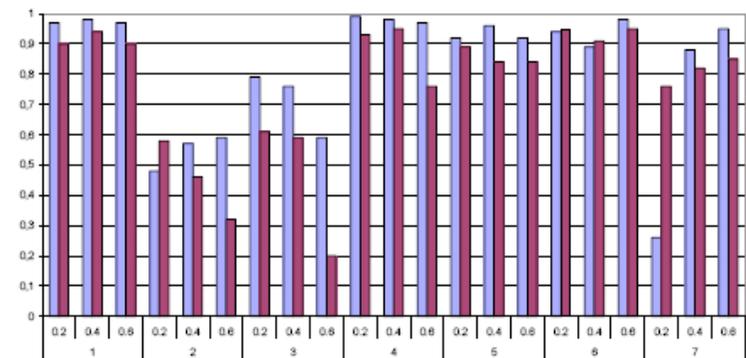


Figure 3 Percentage of correct answers split by task and by density. The matrix representation appears in blue and the node-link in purple.

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Graph Interaction

- ≡ Dynamic visualization & interaction is essential for exploring / navigating graphs
 - ≡ Dragging and highlighting of vertices and edges
 - ≡ Filtering
 - ≡ Zooming & panning
 - ≡ Focus+context distortion
- ≡ **Animation** can support exploration



Focus+Context graph - Jankun-Kelly et al. 2003

Transitions in Radial Tree Layout

- ≡ Yee et al. 2001
- ≡ Radial tree layout: common technique in which the graph is arranged around a focus node
- ≡ Users can change the layout by selecting a different focus node
- ≡ Animated transitions of node translation
- ≡ Objective: keep the transitions easy to follow
- ≡ Animation mechanism
 - ≡ Linear interpolation of polar coordinates of the nodes
 - ≡ Follows ordering and orientation constraints
- ≡ Movie

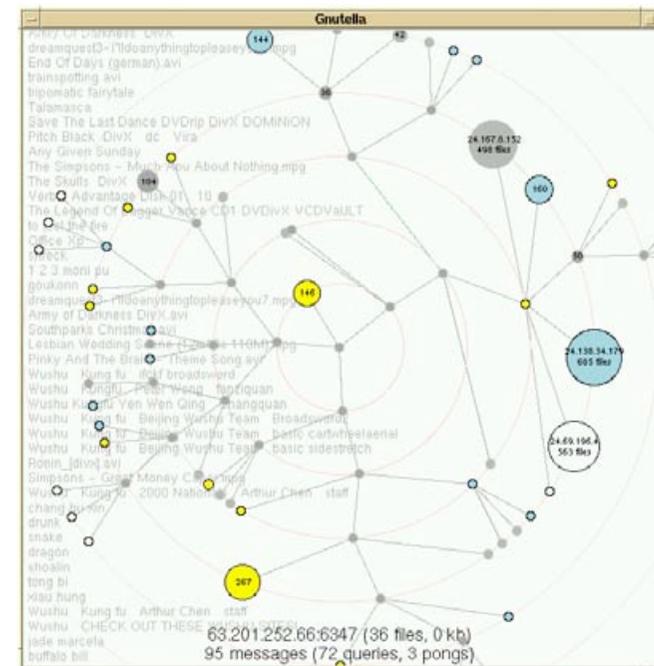


Figure 1: Visualization of the Gnutella network.



Additional Sources and Literature

☰ Obligatory reading

- ☰ Nathalie Henry, Jean-Daniel Fekete, and Michael J. McGuffin: “NodeTrix: A Hybrid Visualization of Social Networks“, InfoVis, 2007.
- ☰ <http://insitu.lri.fr/~nhenry/docs/Henry-InfoVis2007.pdf>

☰ Tutorials for graph theory and graph drawing

- ☰ http://www.cs.usask.ca/resources/tutorials/csconcepts/1999_8/
- ☰ <http://davis.wpi.edu/~matt/courses/graphs/>