



NYU | TANDON

# Data Visualization

Qi Sun

[qisun@nyu.edu](mailto:qisun@nyu.edu)

CUSP – GX 6006 A

# Logistics

- Guest lecture next week : in-person

Omer Shapira, NVIDIA Research, AI-Mediated Digital Human



# Where We Are

- Basic mathematical tools
- Color: definition, space, map, and design
- 2D visualization: data -> spatial, temporal, network
- Human perception and geometries of 3D
- 3D visualization: projection and interaction
- Application case studies

# Visualizing Network Data

# What is network data?

# Tabular Data

**Objects**

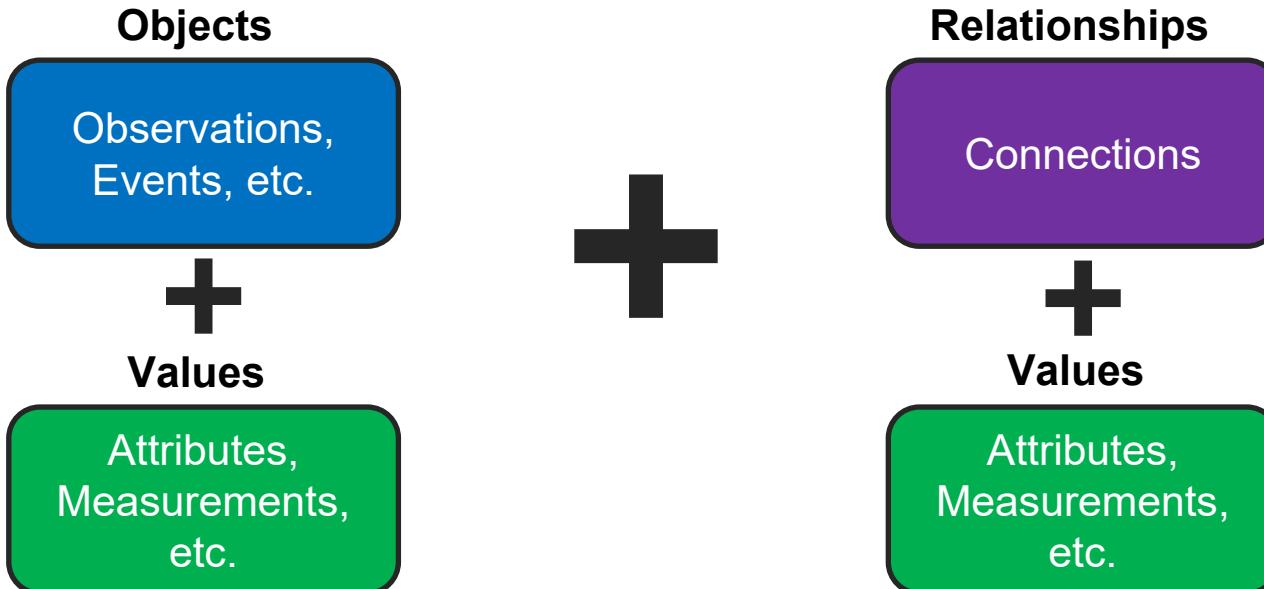
Observations,  
Events, etc.



**Values**

Attributes,  
Measurements,  
etc.

# Network Data



# Network Data

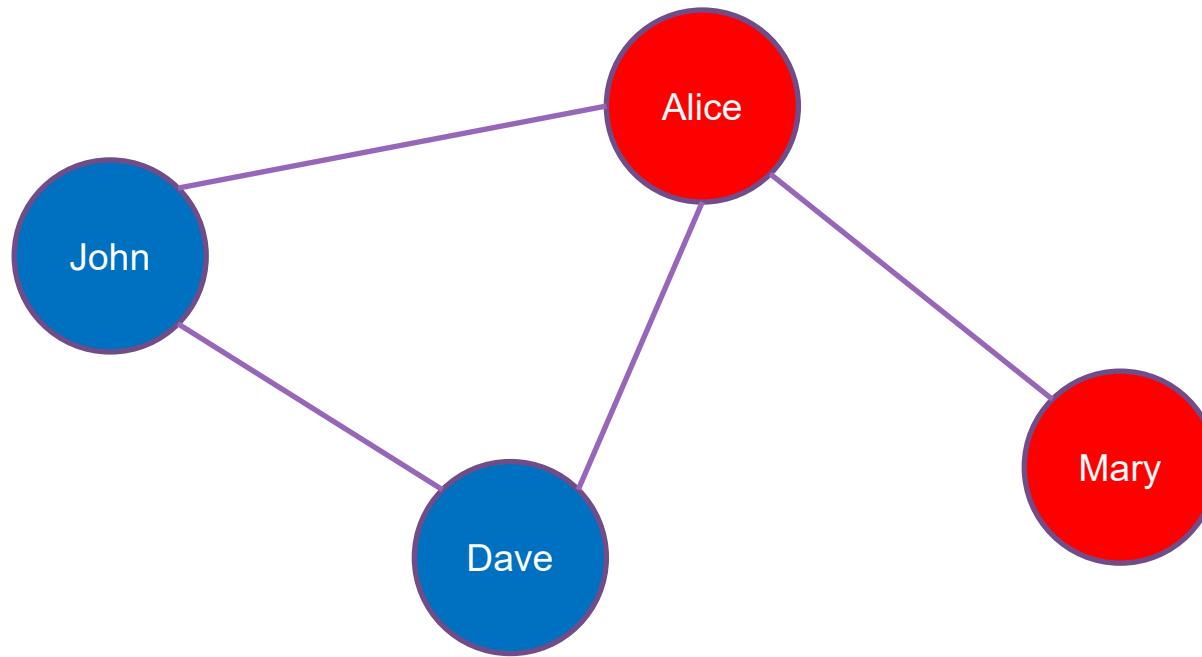
**Nodes**

Label	Value
A	5
B	10
C	15

**Links**

N1	N2	Value
A	B	9
A	C	27
B	C	18

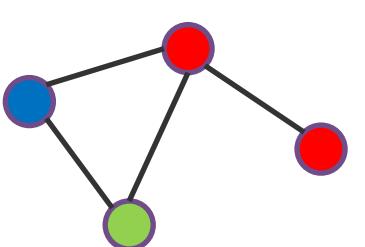
# Friendship Network



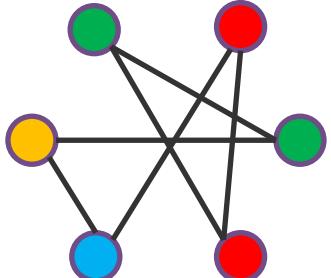
# Network Visualization Techniques

# Node-Link Diagram

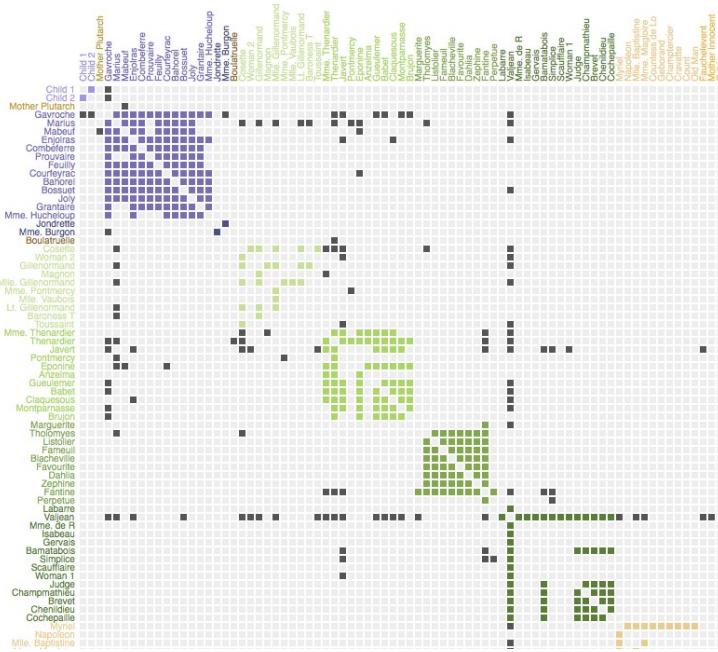
# Force-Directed Layouts



# Fixed Layouts



# Matrices



# Node-Link Diagram

# Node-Link Diagram

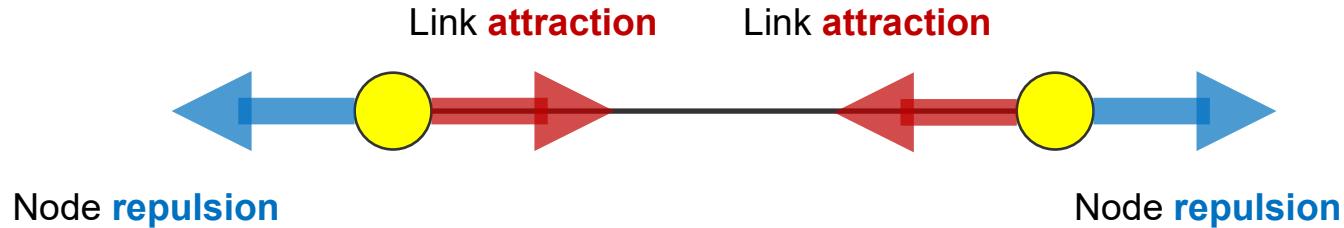
- **Nodes:** dots/markers.



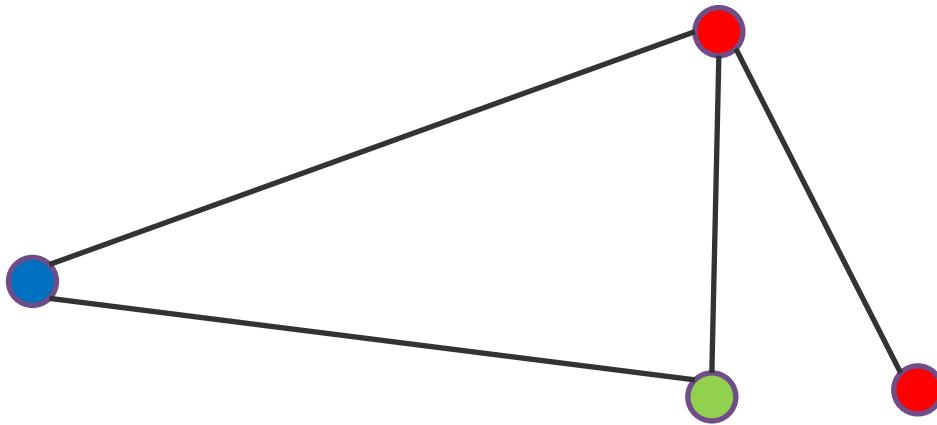
- **Links:** lines connecting dots.



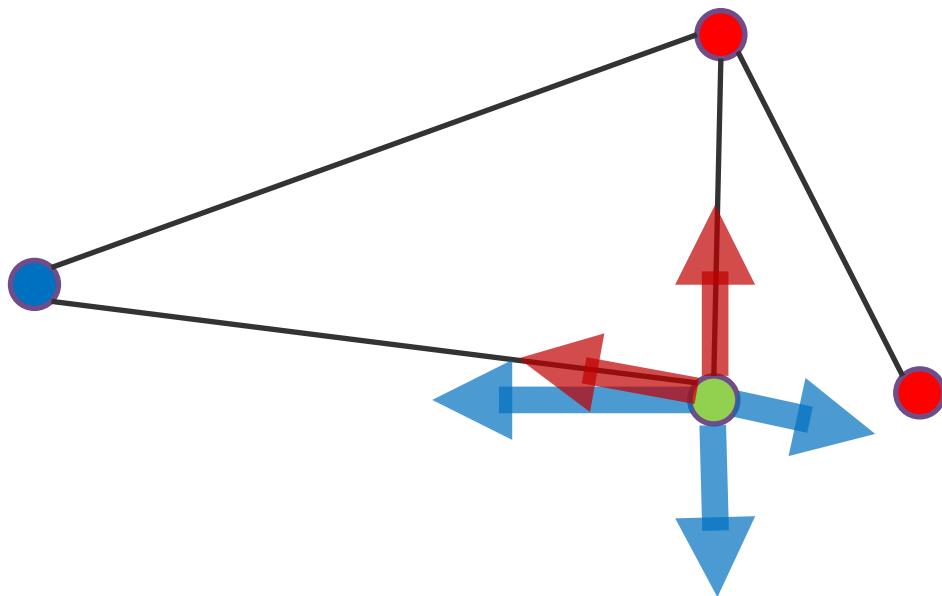
# Force-Directed Layout



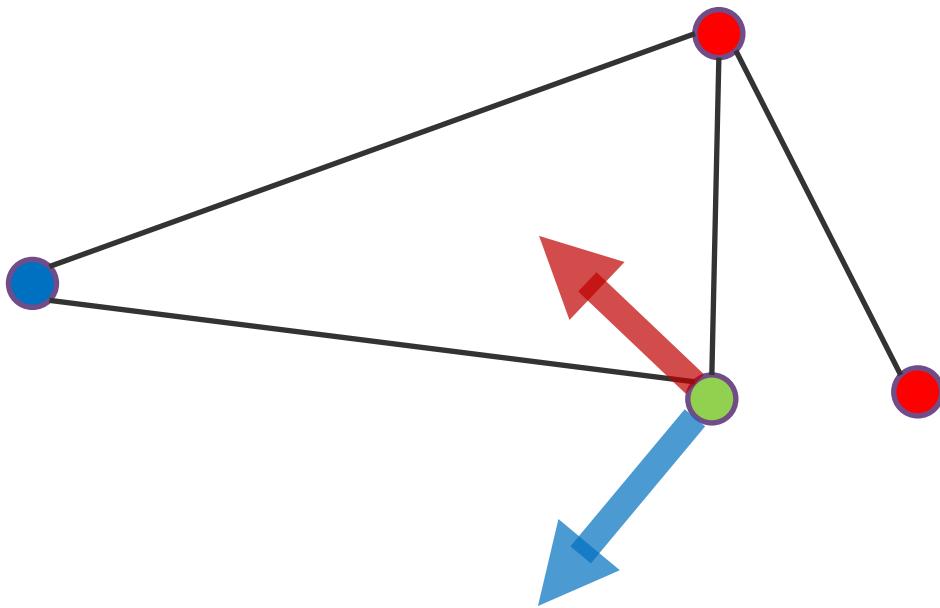
## Initialize with random layout



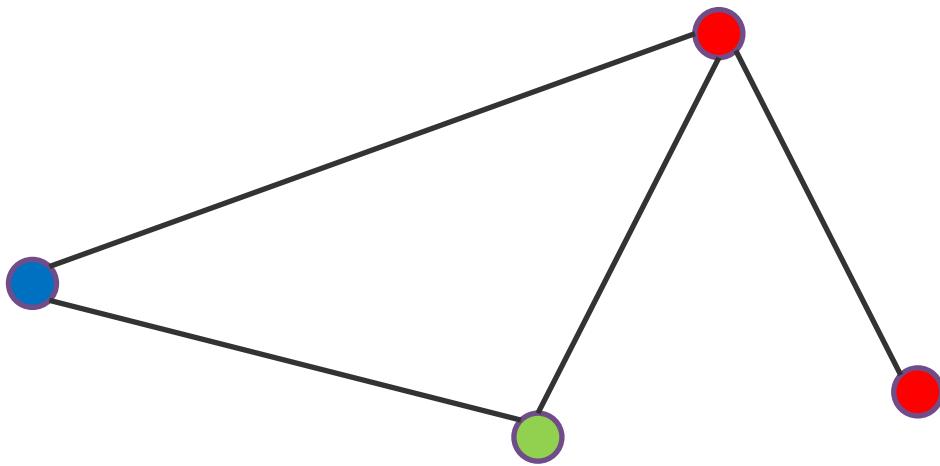
## Compute attraction and repulsion forces per node



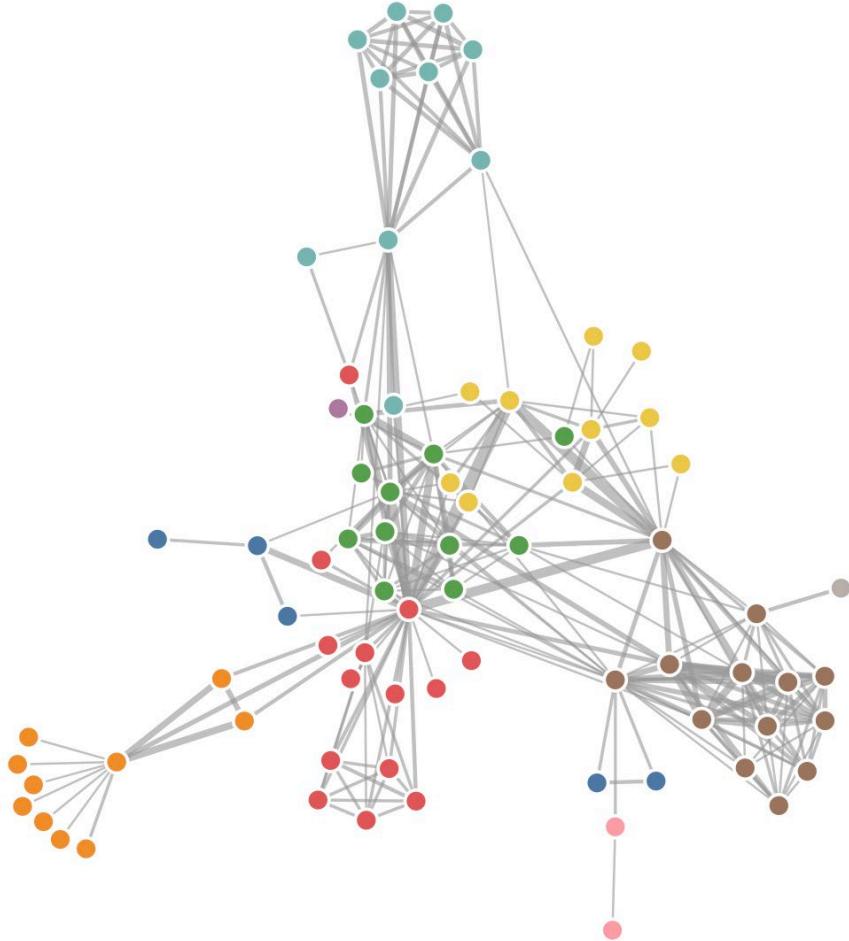
**Compute the net force per node**



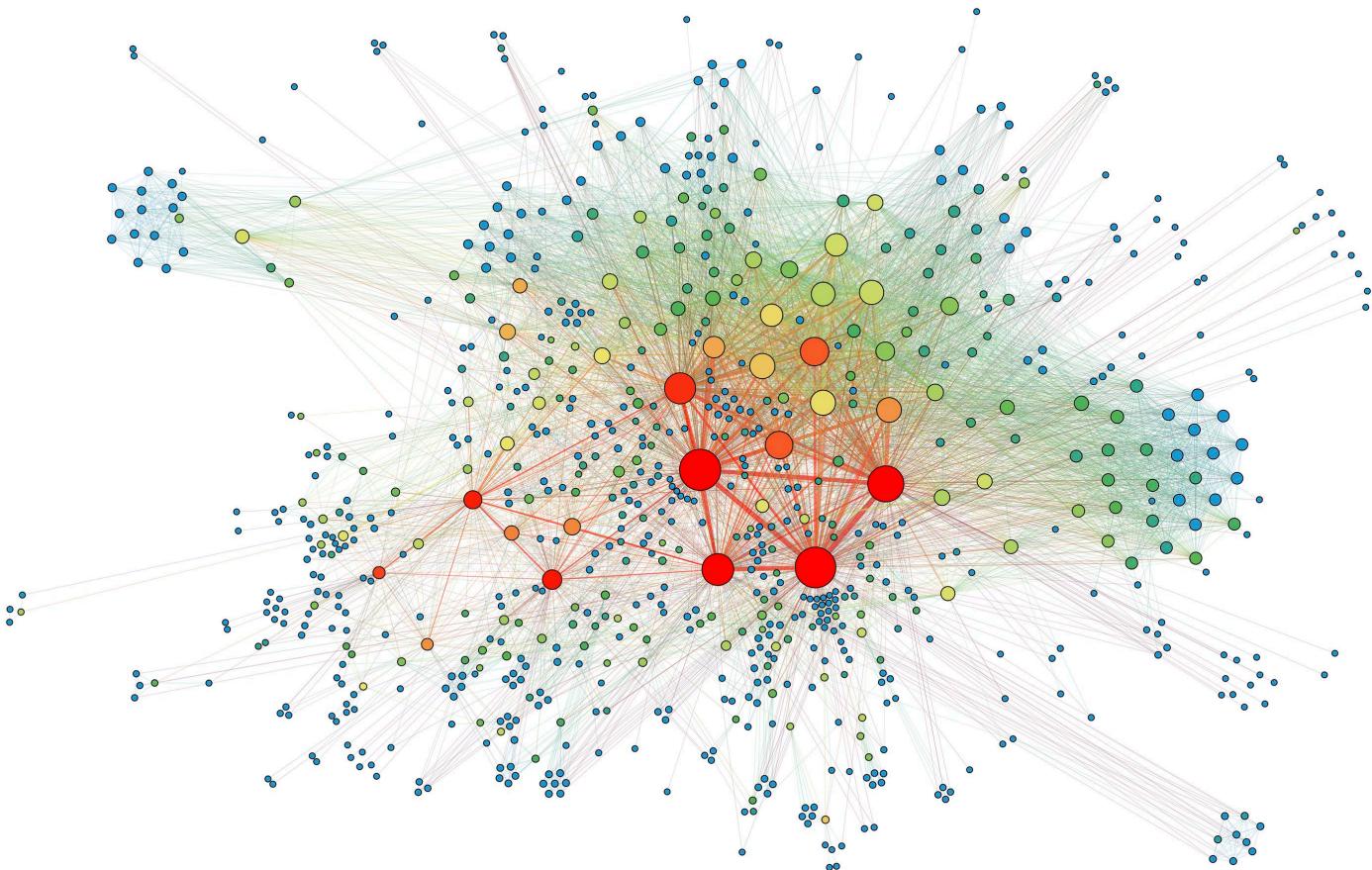
**Move the node according to the net force**



**And repeat...**

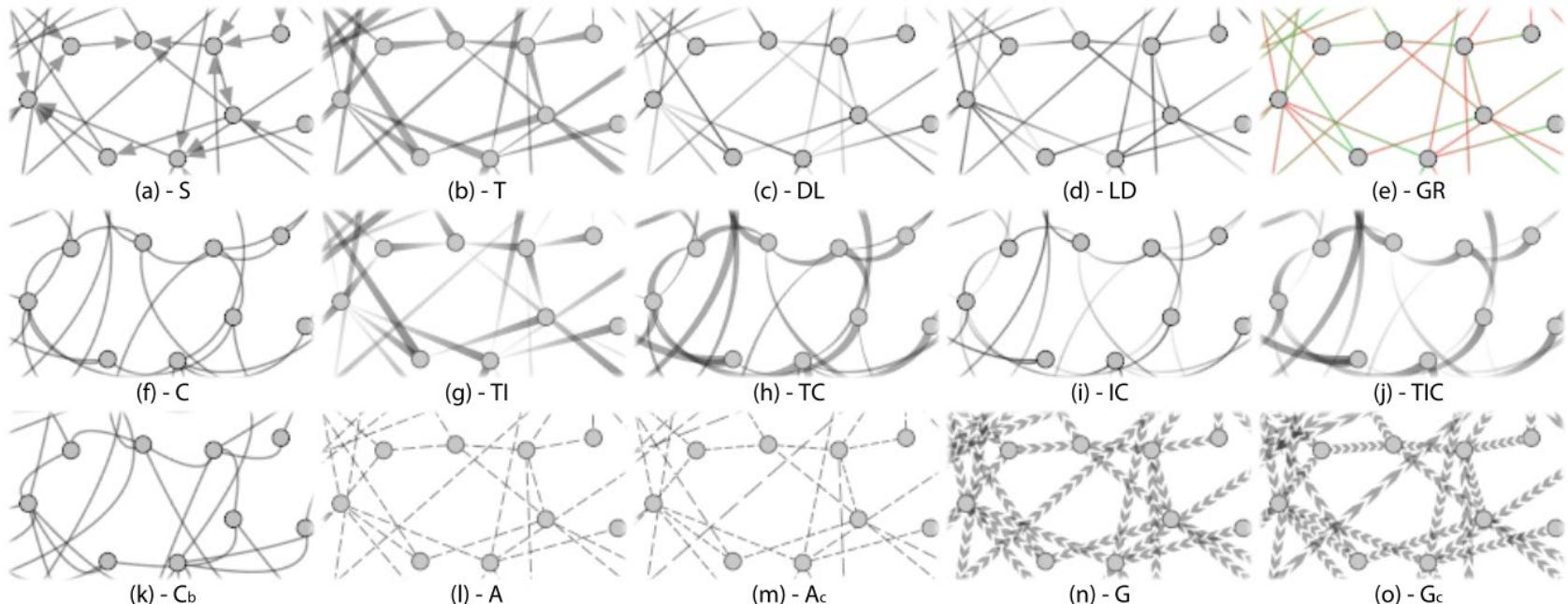


Source: <https://observablehq.com/@d3/force-directed-graph>



Source: [https://en.wikipedia.org/wiki/Force-directed\\_graph\\_drawing#/media/File:SocialNetworkAnalysis.png](https://en.wikipedia.org/wiki/Force-directed_graph_drawing#/media/File:SocialNetworkAnalysis.png)

# Directed Graphs



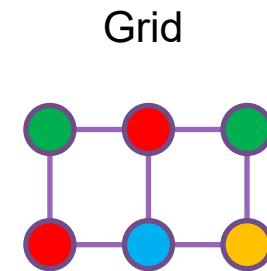
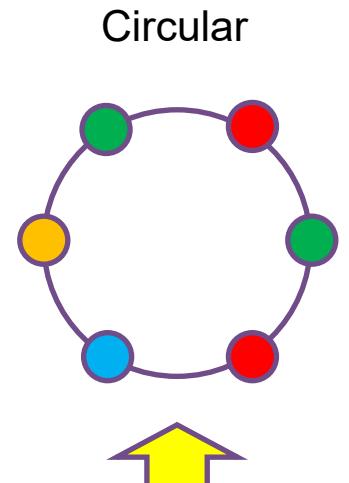
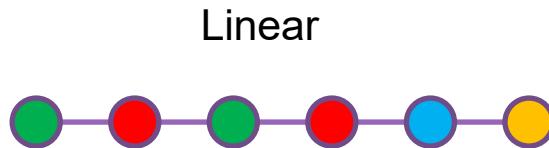
Holten, Danny, et al. "An extended evaluation of the readability of tapered, animated, and textured directed-edge representations in node-link graphs." *IEEE Pacific Visualization Symposium (PacificVis)*, 2011.

# Fixed Layout

Positions of the nodes are fixed based on some criteria.

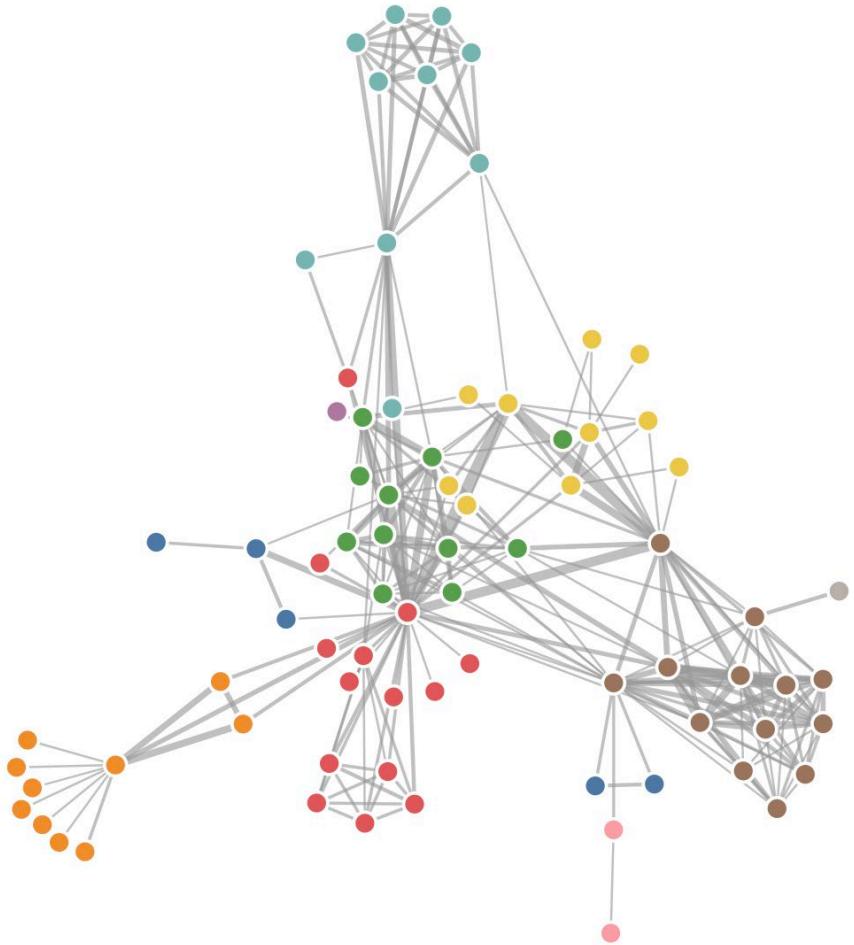


# Fixed Layout

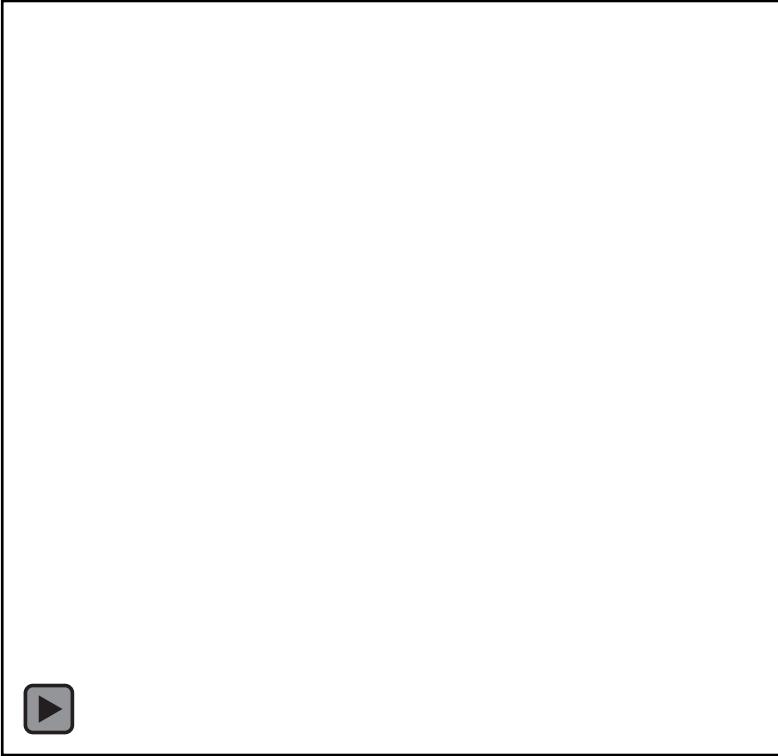


Most Common

When is fixed layout  
more appropriate than  
force-direct layout?



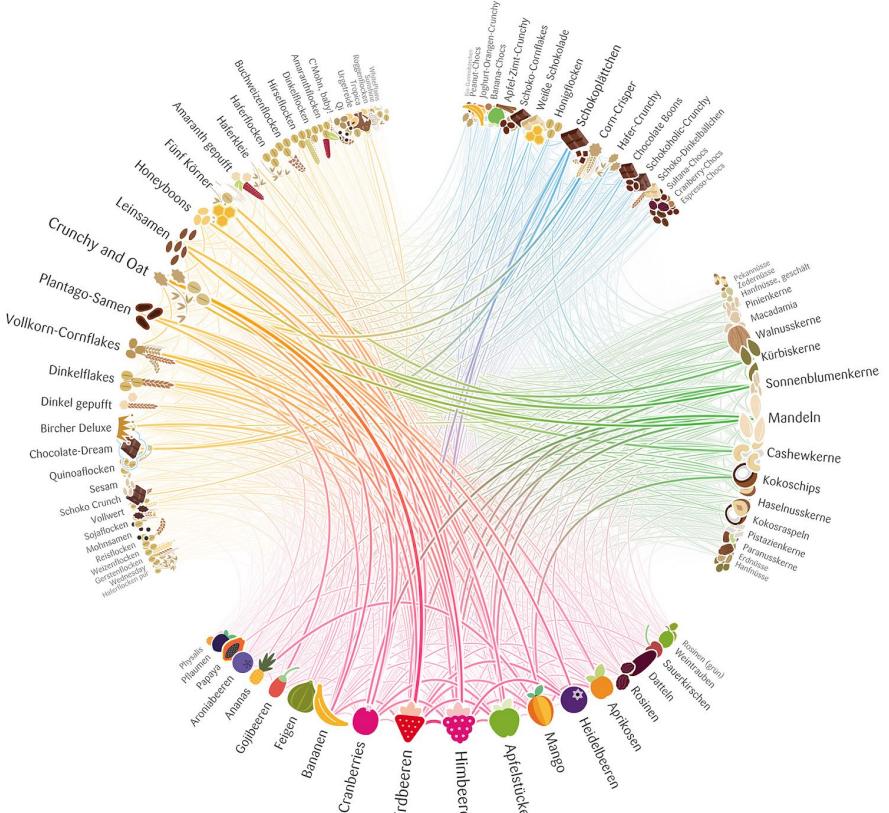
Force-directed layout reveals  
the **structure** of the network.



- A small gray square icon containing a white right-pointing triangle, located at the bottom-left corner of the large box.

## Advantages of fixed layout:

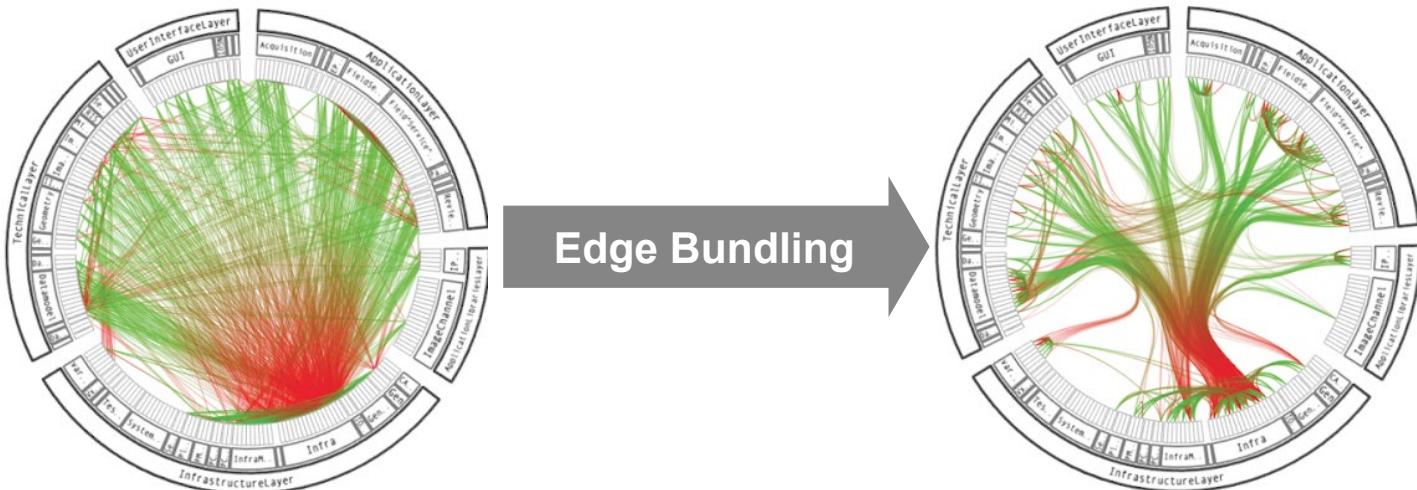
- Visibility of nodes.
- Visibility of edges.



## Advantages of fixed layout:

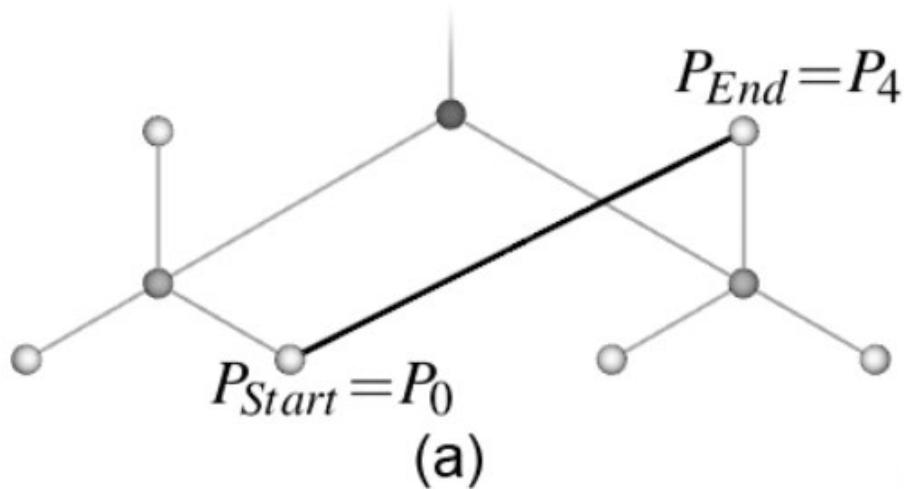
- Visibility of nodes.
- Visibility of edges.
- When nodes can be grouped into meaningful categories.

# Avoid Overplotting



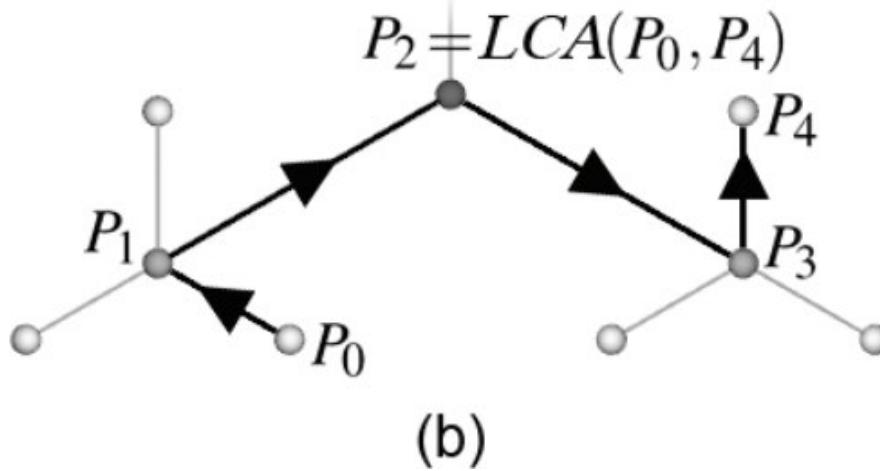
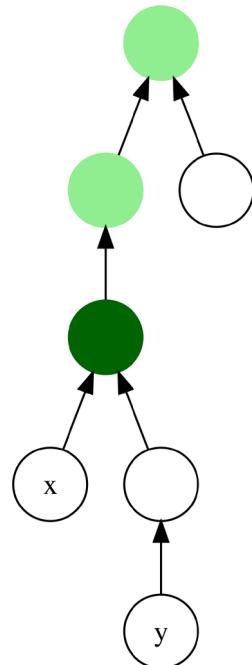
Holten, Danny. "Hierarchical edge bundles: Visualization of adjacency relations in hierarchical data." IEEE Transactions on visualization and computer graphics 12.5 (2006): 741-748.

# Edge Bundling



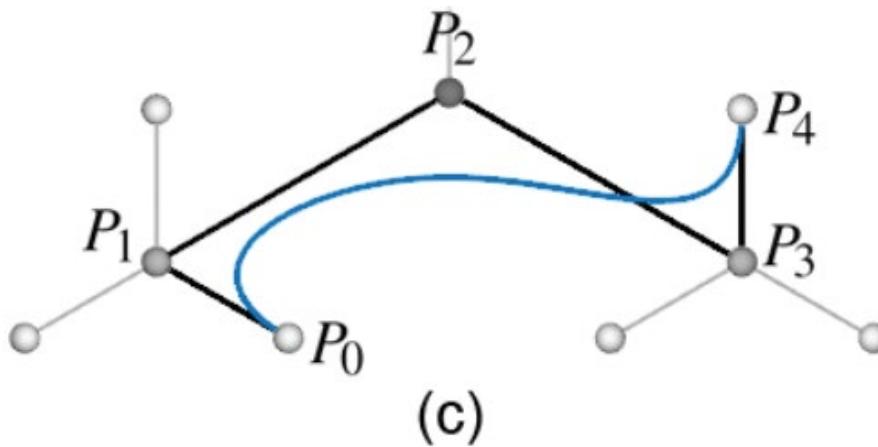
Holten, Danny. "Hierarchical edge bundles: Visualization of adjacency relations in hierarchical data." IEEE Transactions on visualization and computer graphics 12.5 (2006): 741-748.

# Edge Bundling - lowest common ancestor



Holten, Danny. "Hierarchical edge bundles: Visualization of adjacency relations in hierarchical data." IEEE Transactions on visualization and computer graphics 12.5 (2006): 741-748.

# Edge Bundling



Holten, Danny. "Hierarchical edge bundles: Visualization of adjacency relations in hierarchical data." IEEE Transactions on visualization and computer graphics 12.5 (2006): 741-748.

# Spline

Example 1

$$S(t) = P_0(t) = -1 + 4t - t^2, \quad 0 \leq t < 1$$

$$S(t) = P_1(t) = 2t, \quad 1 \leq t < 2$$

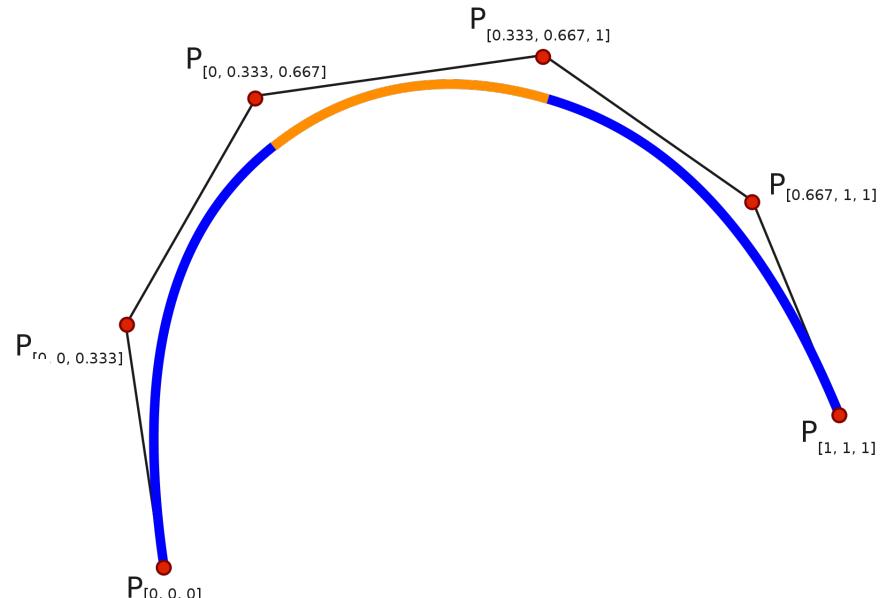
$$S(t) = P_2(t) = 2 - t + t^2, \quad 2 \leq t \leq 3$$

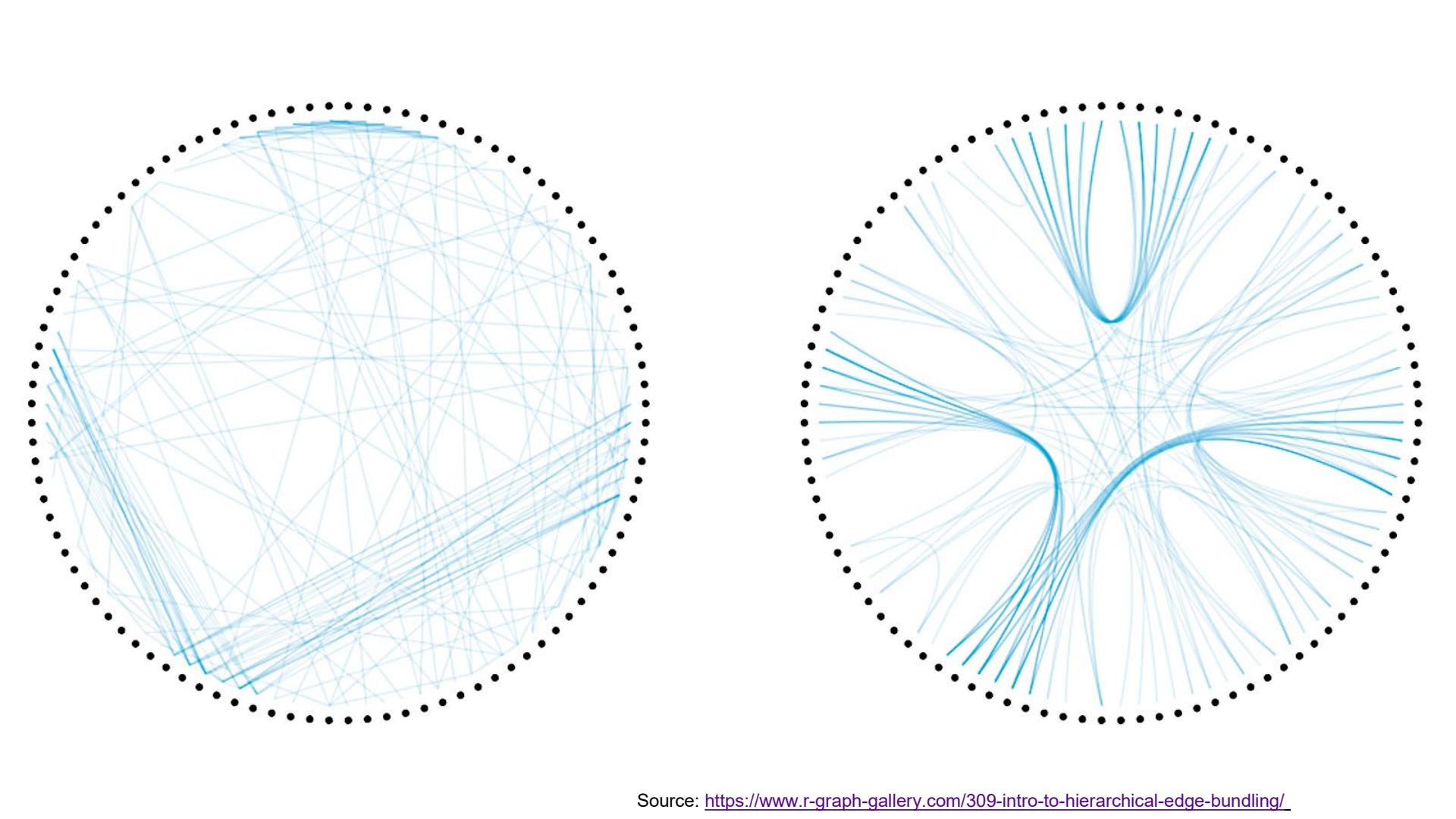
Example 2

$$S(t) = P_0(t) = -2 - 2t^2, \quad 0 \leq t < 1$$

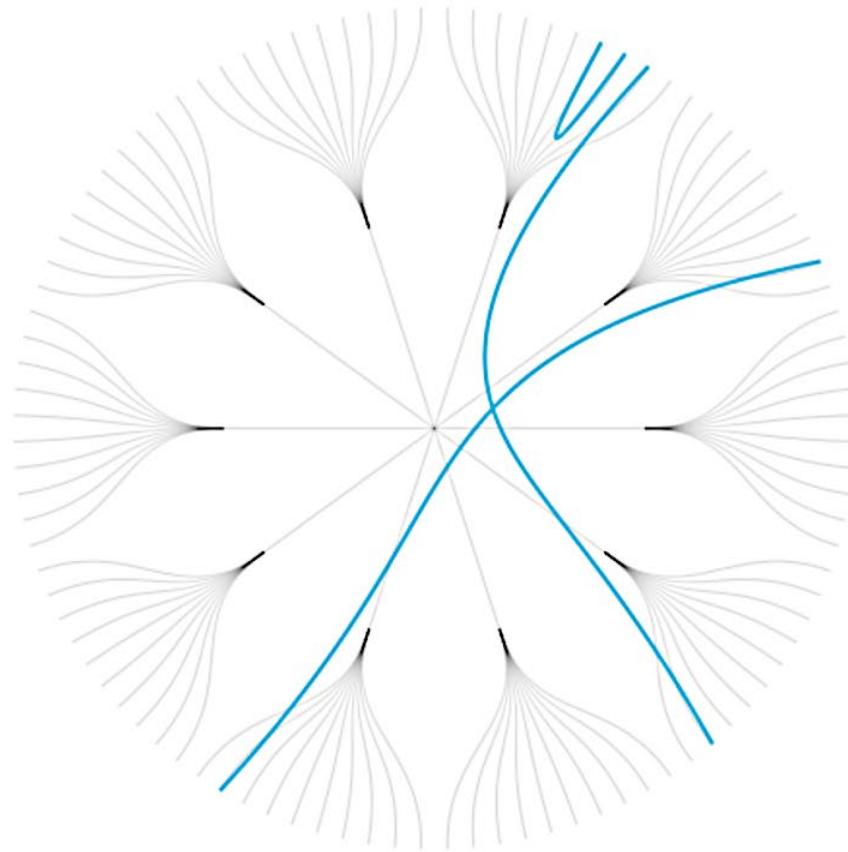
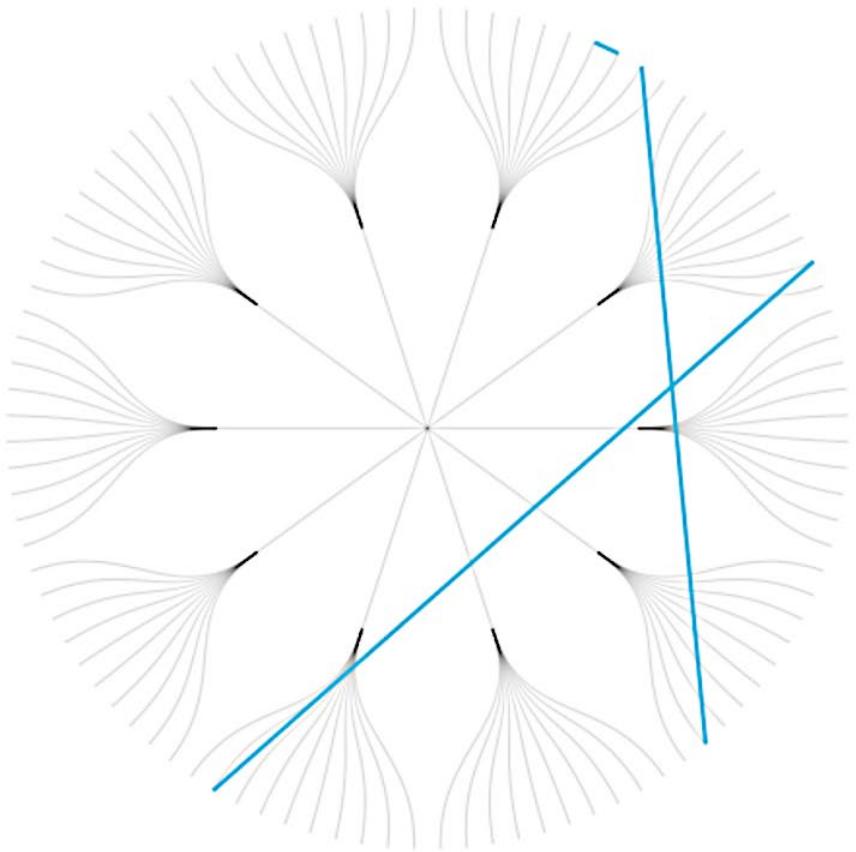
$$S(t) = P_1(t) = 1 - 6t + t^2, \quad 1 \leq t < 2$$

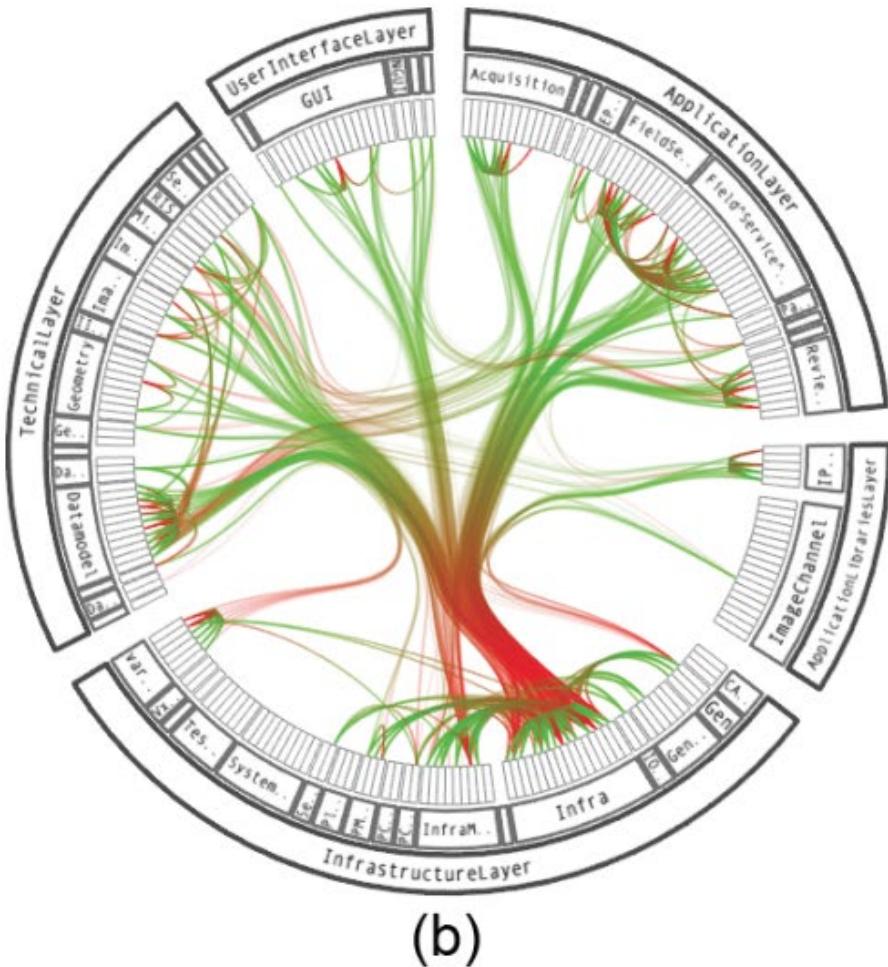
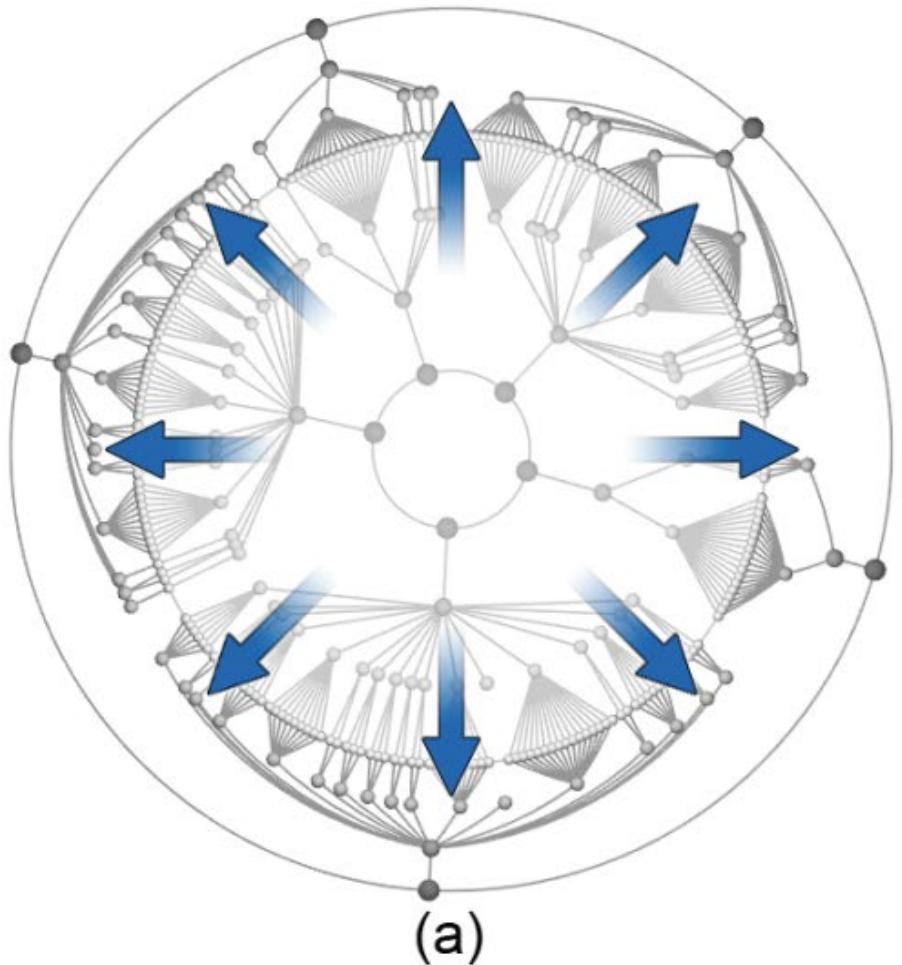
$$S(t) = P_2(t) = -1 + t - 2t^2, \quad 2 \leq t \leq 3$$





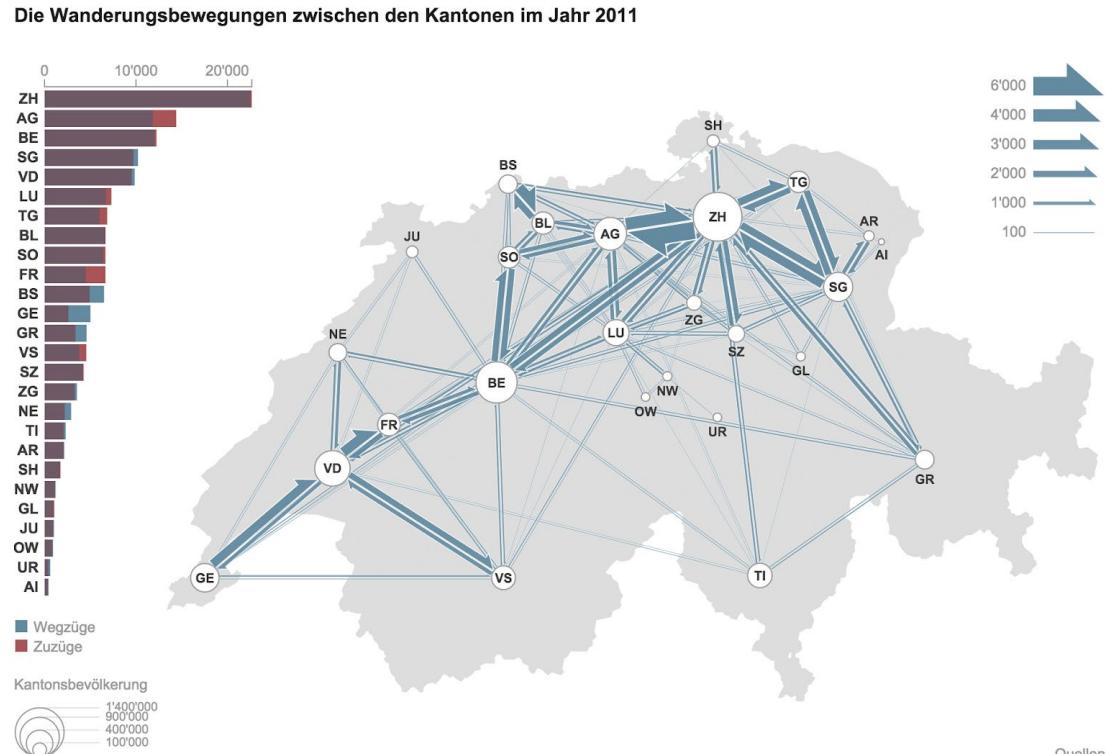
Source: <https://www.r-graph-gallery.com/309-intro-to-hierarchical-edge-bundling/>



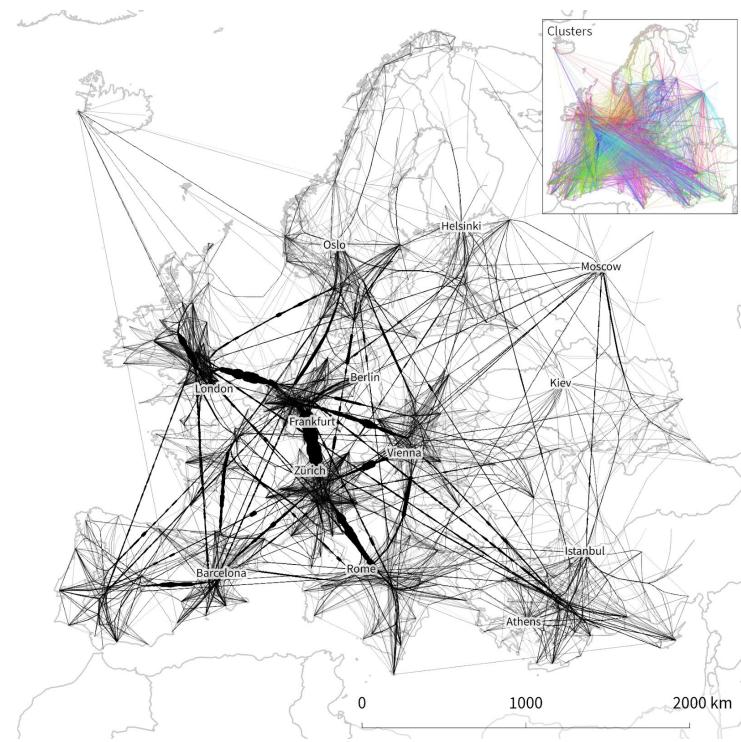


# Fixed Layout: Spatial

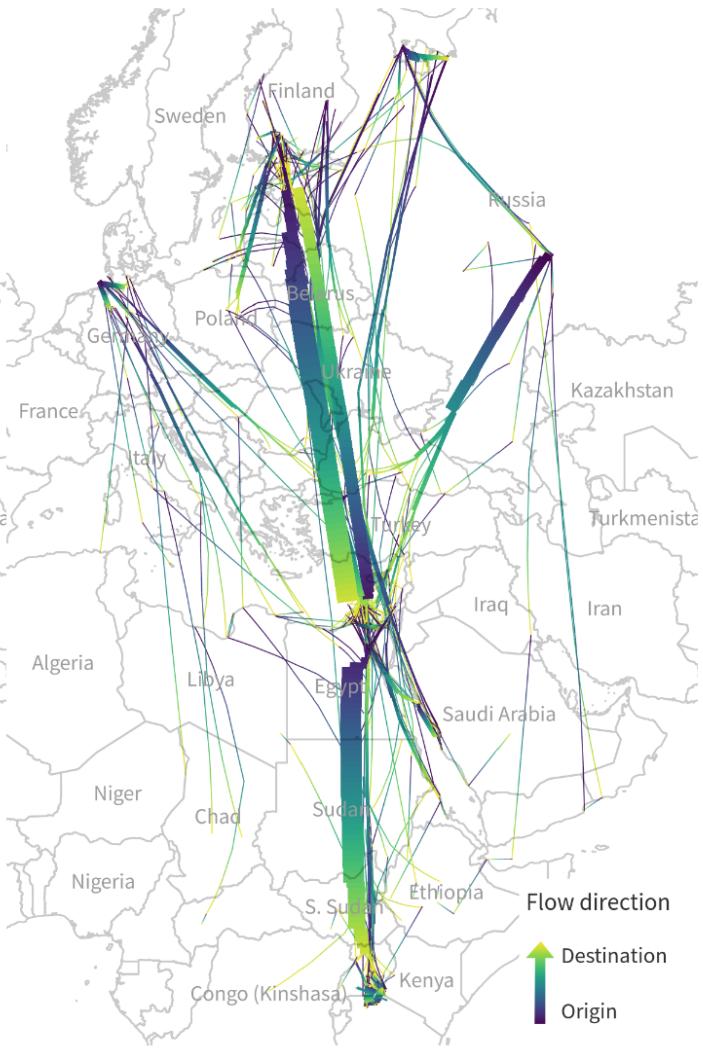
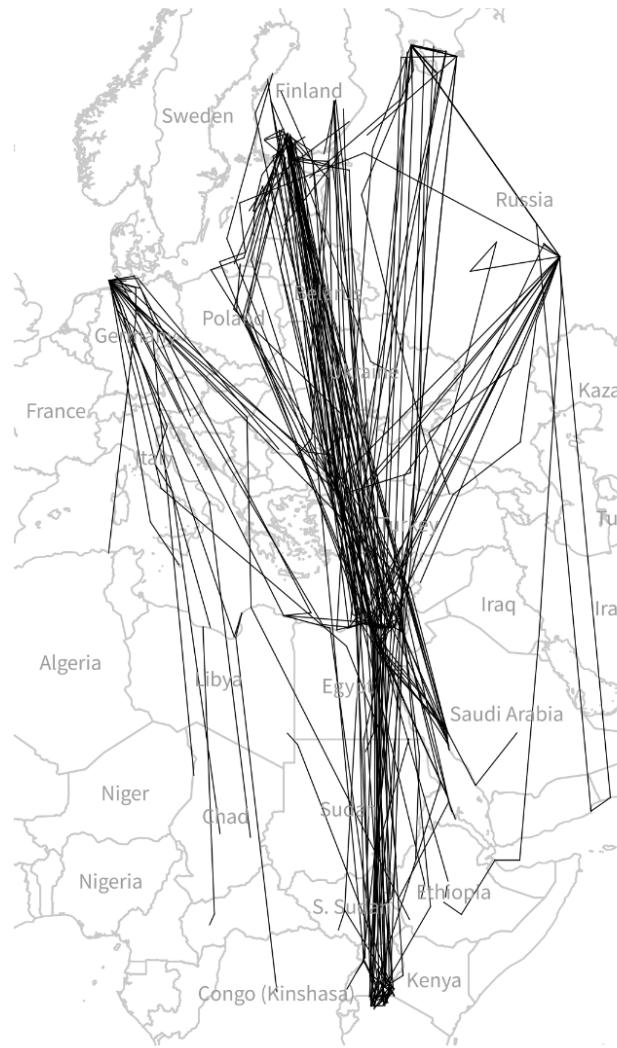
- Nodes are placed based on geographical coordinates.



# Problem: Clutter



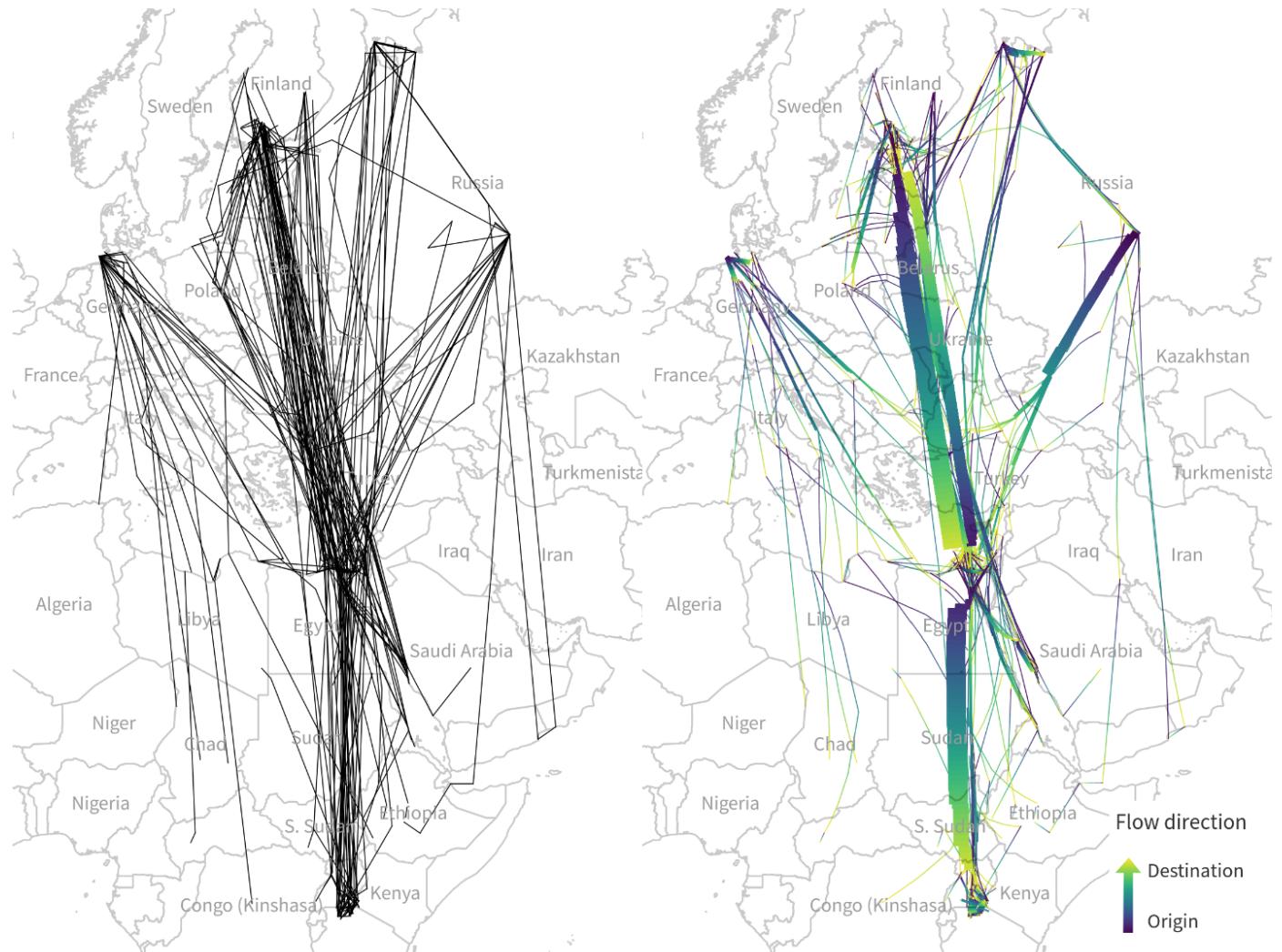
Source: <https://github.com/dts-ait/qgis-edge-bundling>



# Clutter Reduction Methods

# Clutter Reduction

- Edge Bundling.
- Clustering.
- Removing Edges.
- Draw edges on demand.
- Aggregation/Simplification.

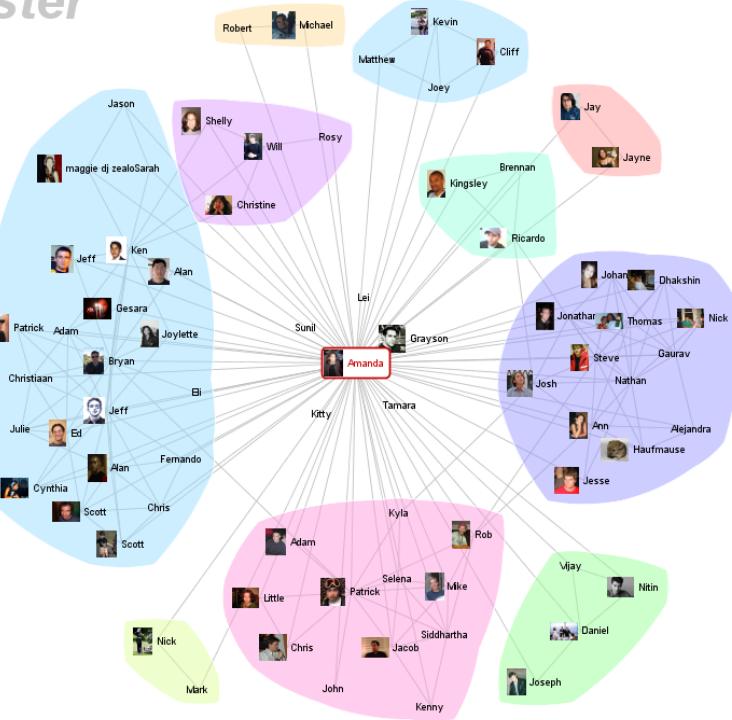


# Clustering

vizster

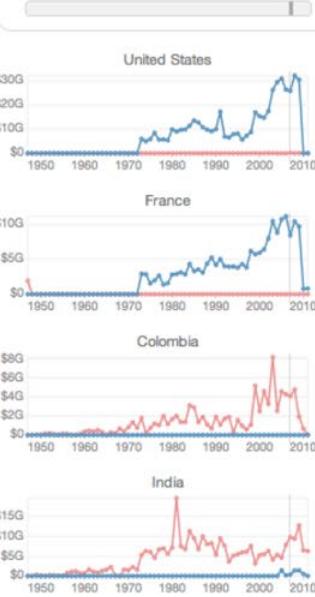


vizster

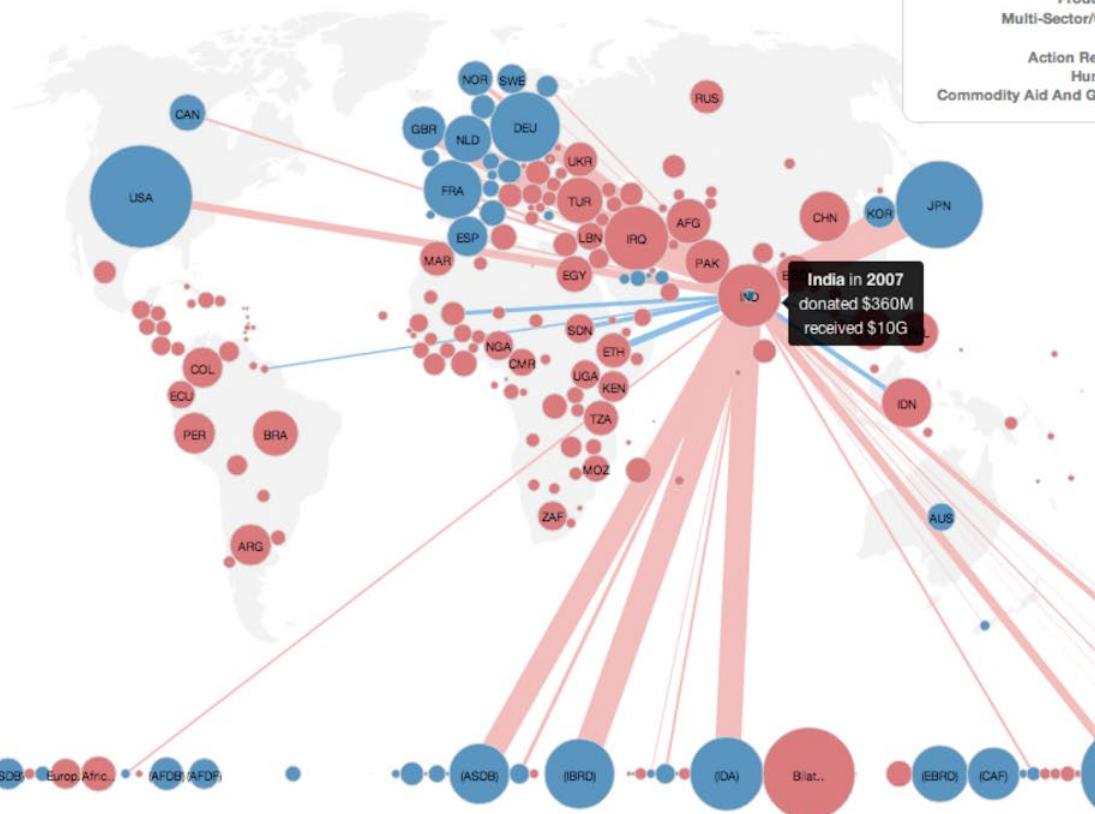


Save

# 2007

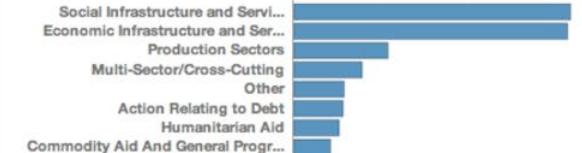


## Drawing edge on demand

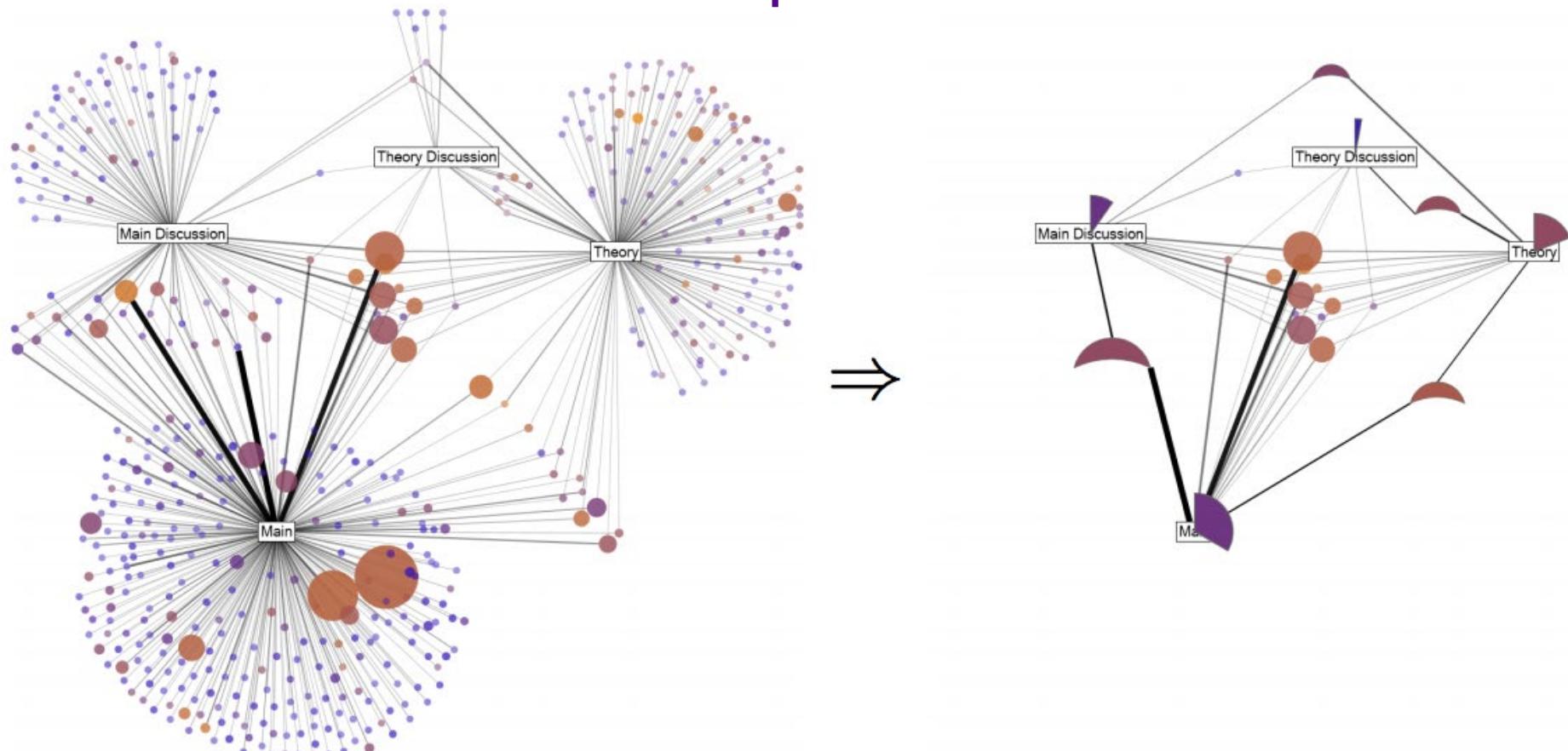


### Purposes

\$20G (100.00% of total)

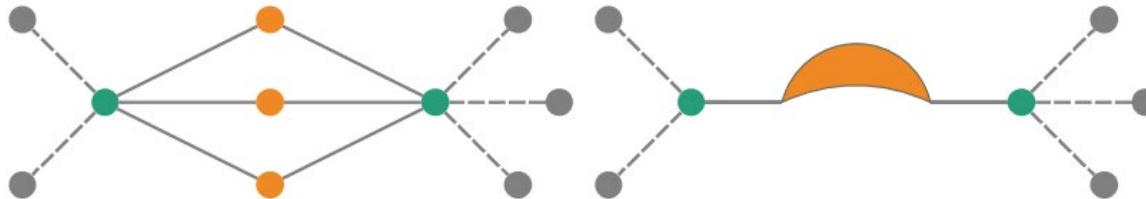
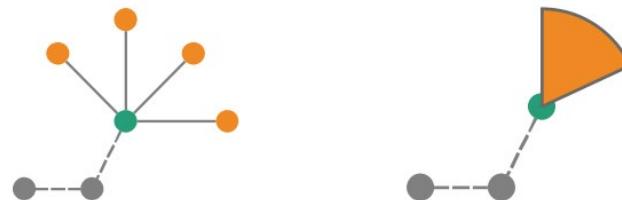


# Motif Simplification

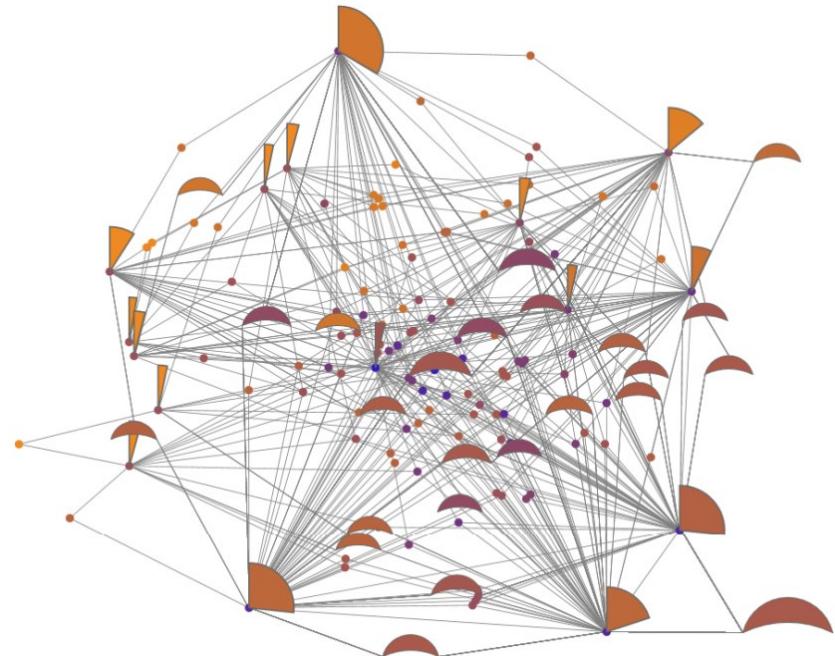
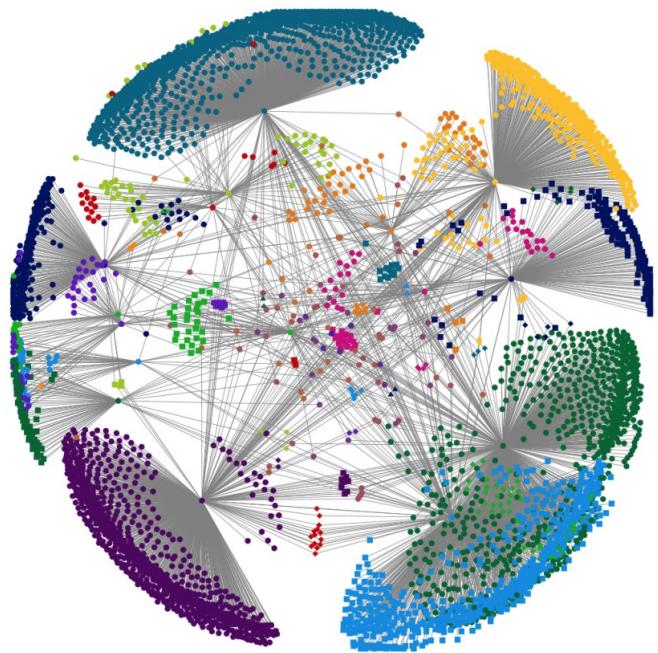


Dunne, Cody, and Ben Shneiderman. "Motif simplification: improving network visualization readability with fan, connector, and clique glyphs." Proceedings of the SIGCHI Conference on Human Factors in Computing Systems. ACM, 2013.

# Motif Simplification



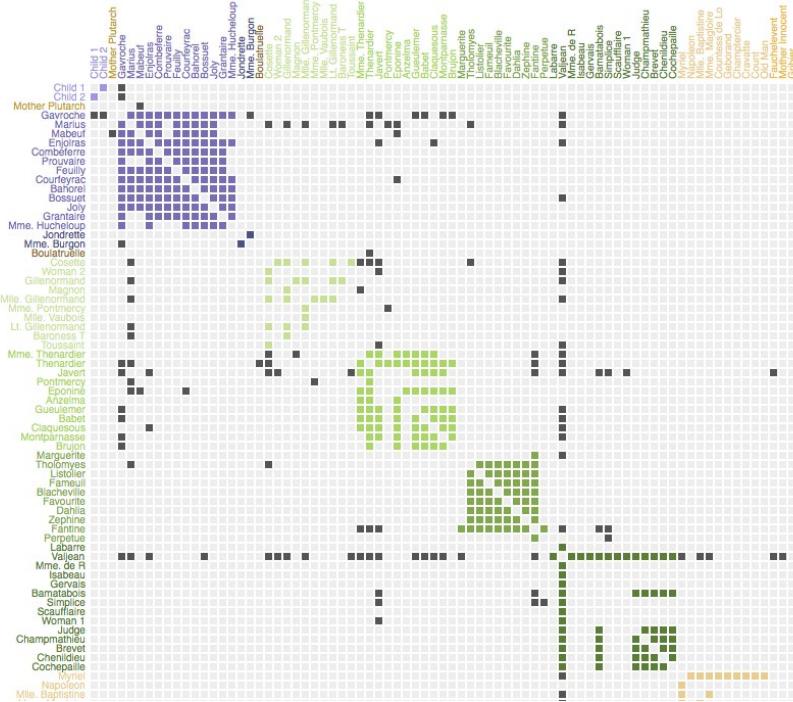
# Motif Simplification

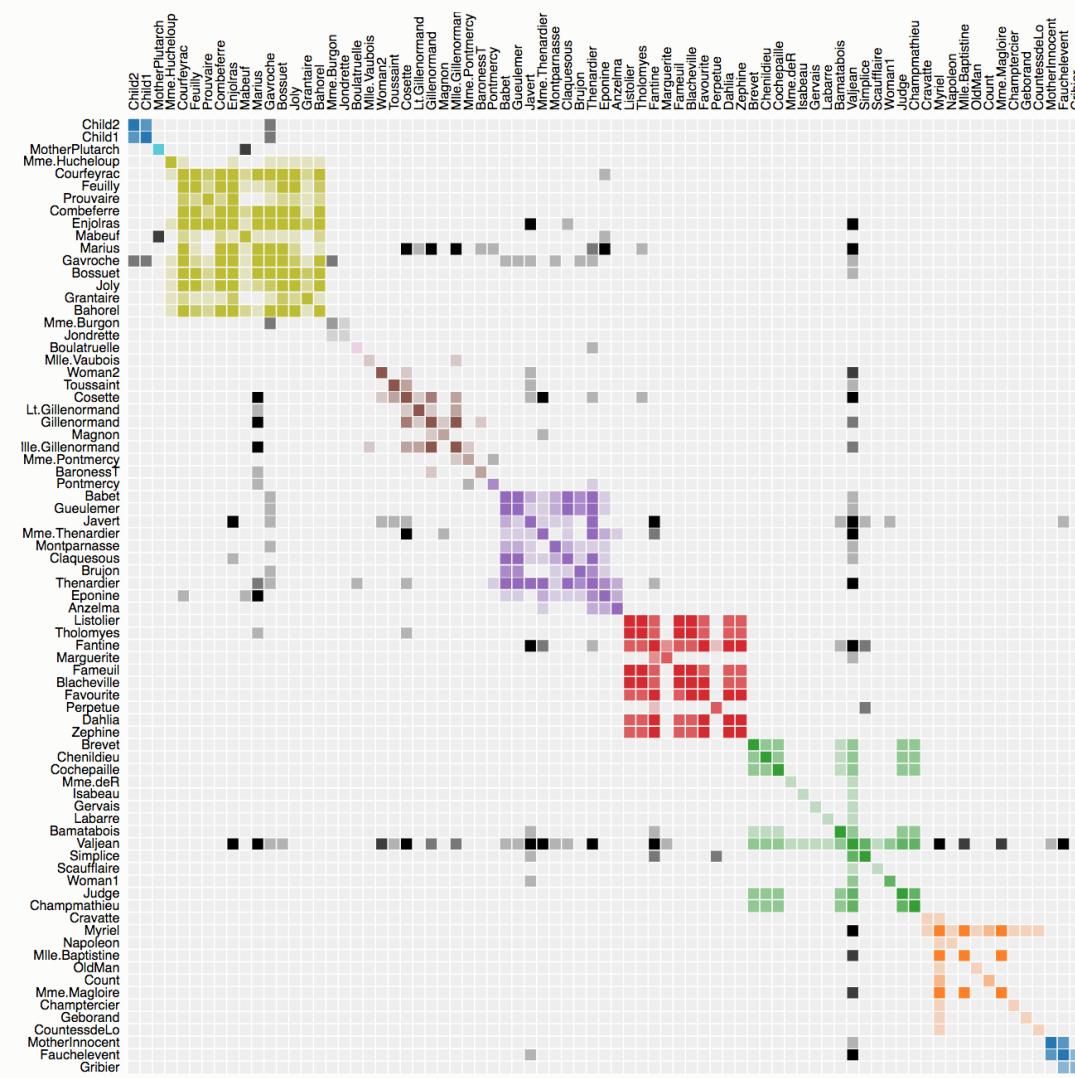


# Matrices

# Adjacency Matrix

- Nodes become rows and cols.
- Edge become cells.



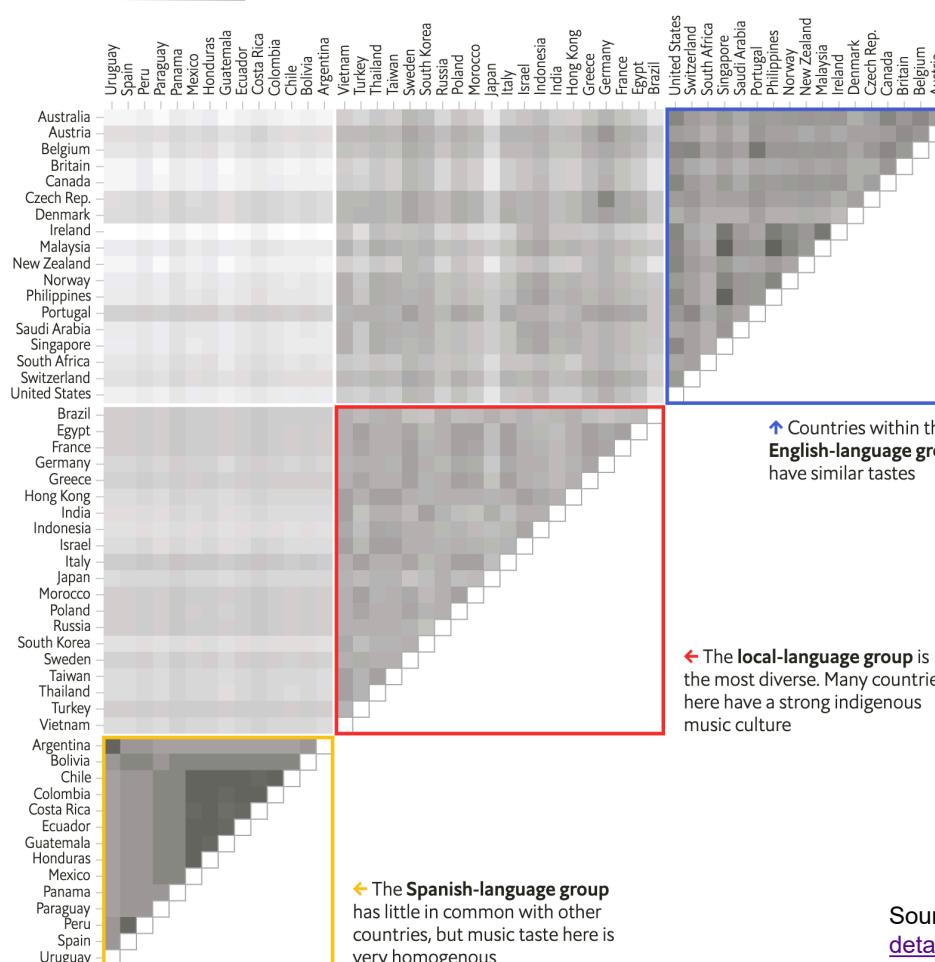


# Character Co-occurrence in “Les Misérables”

## Similarity of music streamed on Spotify\*

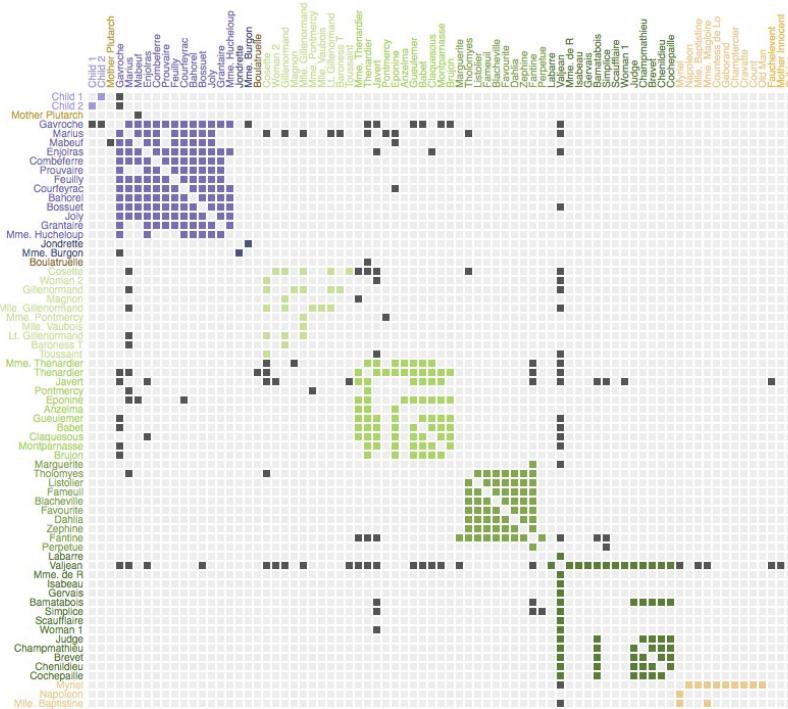
Least similar

Most similar



Source: <https://www.economist.com/interactive/graphic-detail/2022/01/29/what-spotify-data-show-about-the-decline-of-english>

# When to Use Matrix?

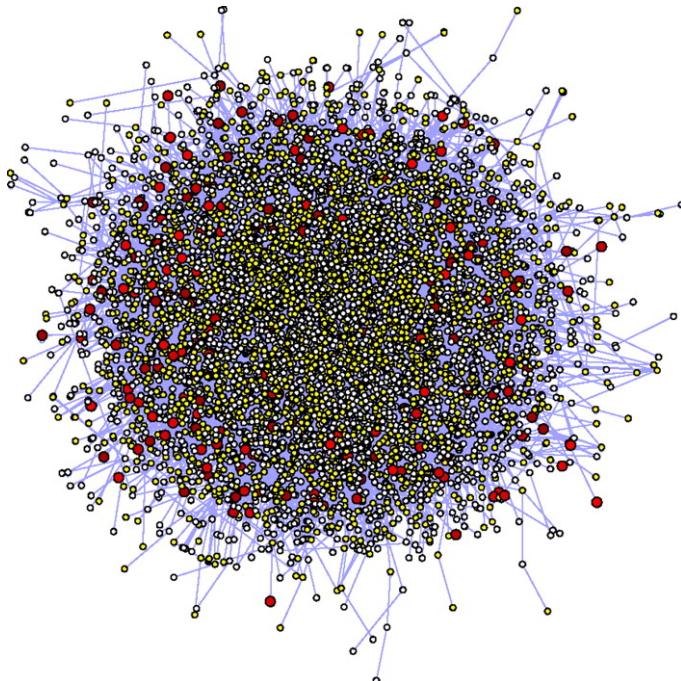


## **Advantages:**

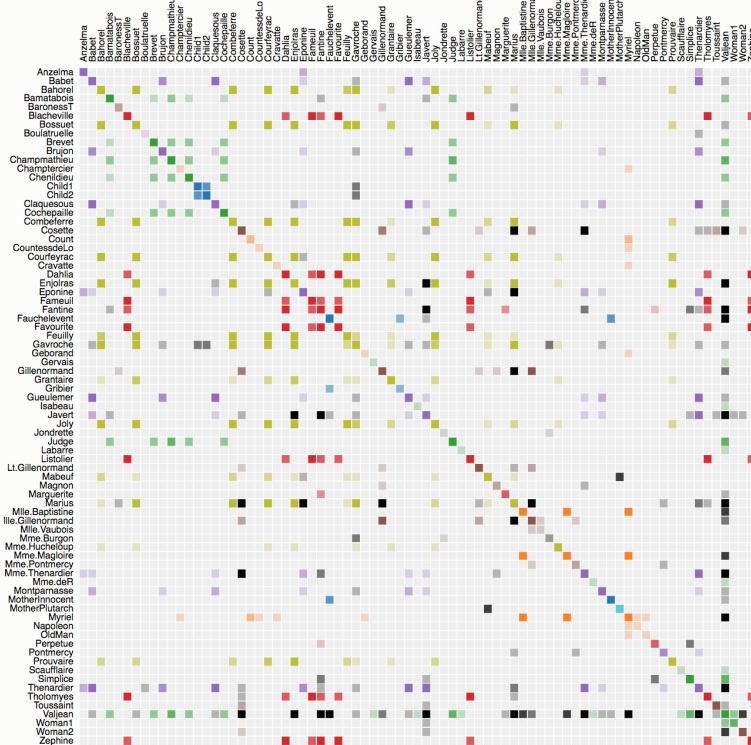
- Node visibility. No line crossing.

## **Disadvantages:**

- Familiarity, scalability, needs reordering.

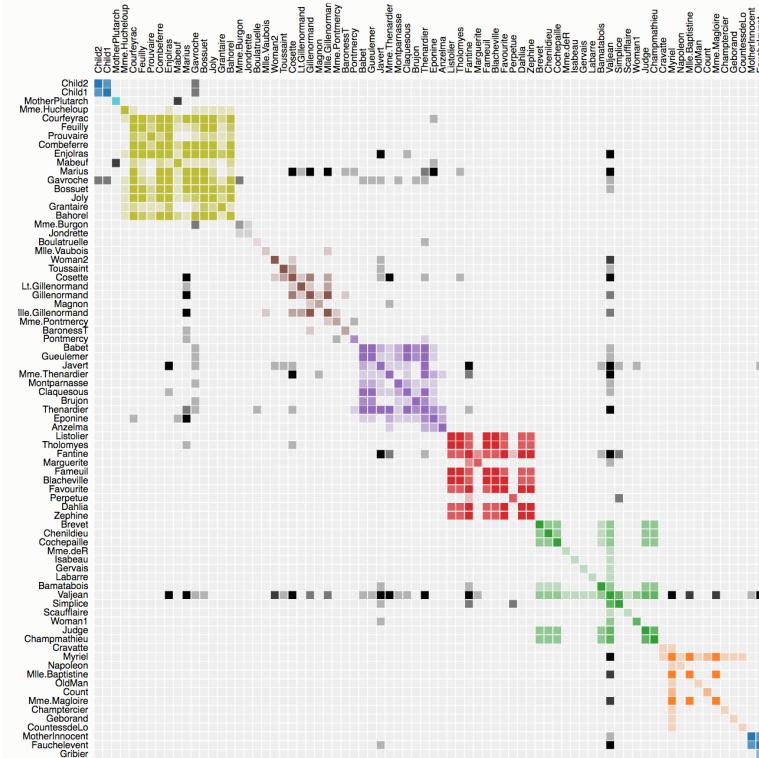
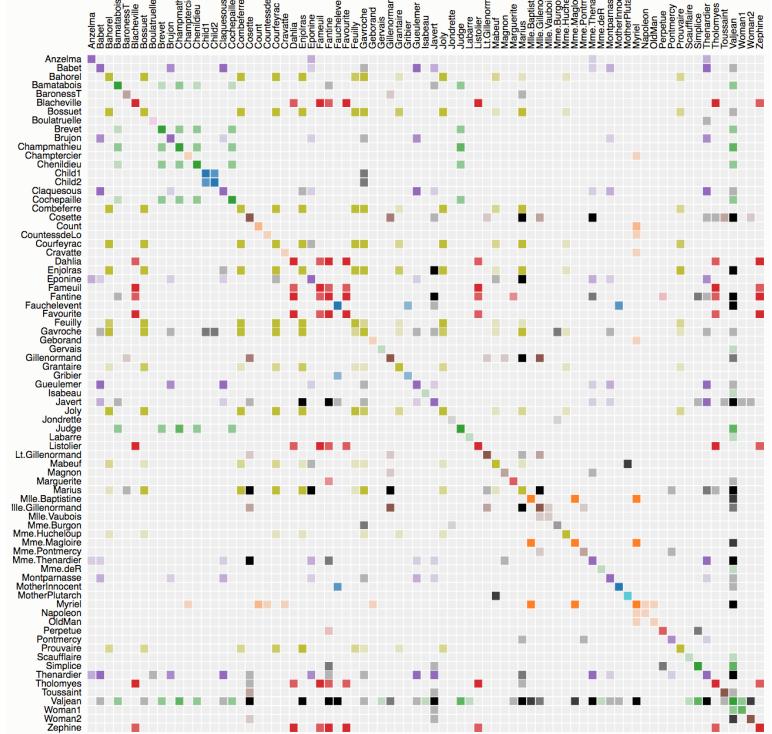


Biggest **advantage** of matrix:  
Avoids hairball effect!

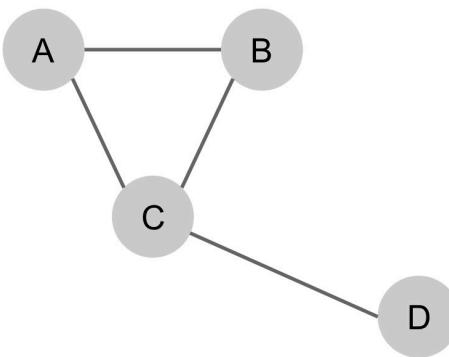


Biggest **disadvantage** of matrix:  
Pattern visibility depends on how  
columns are ordered.

## PART 01

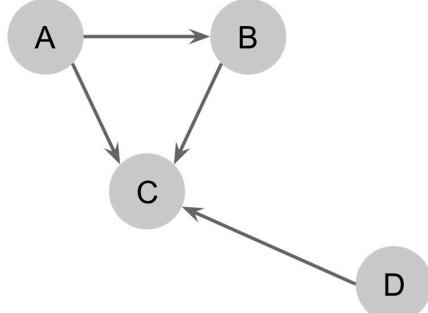


## Undirected Network



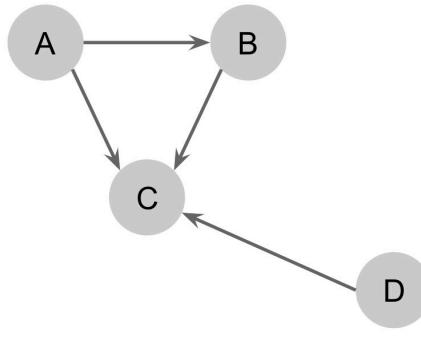
	A	B	C	D
A				
B				
C				
D				

## Directed Network

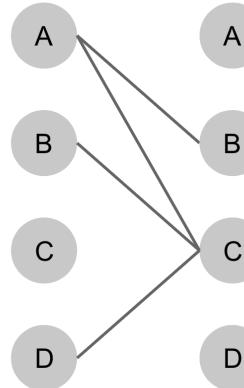


	A	B	C	D
A				
B				
C				
D				

## Directed Network

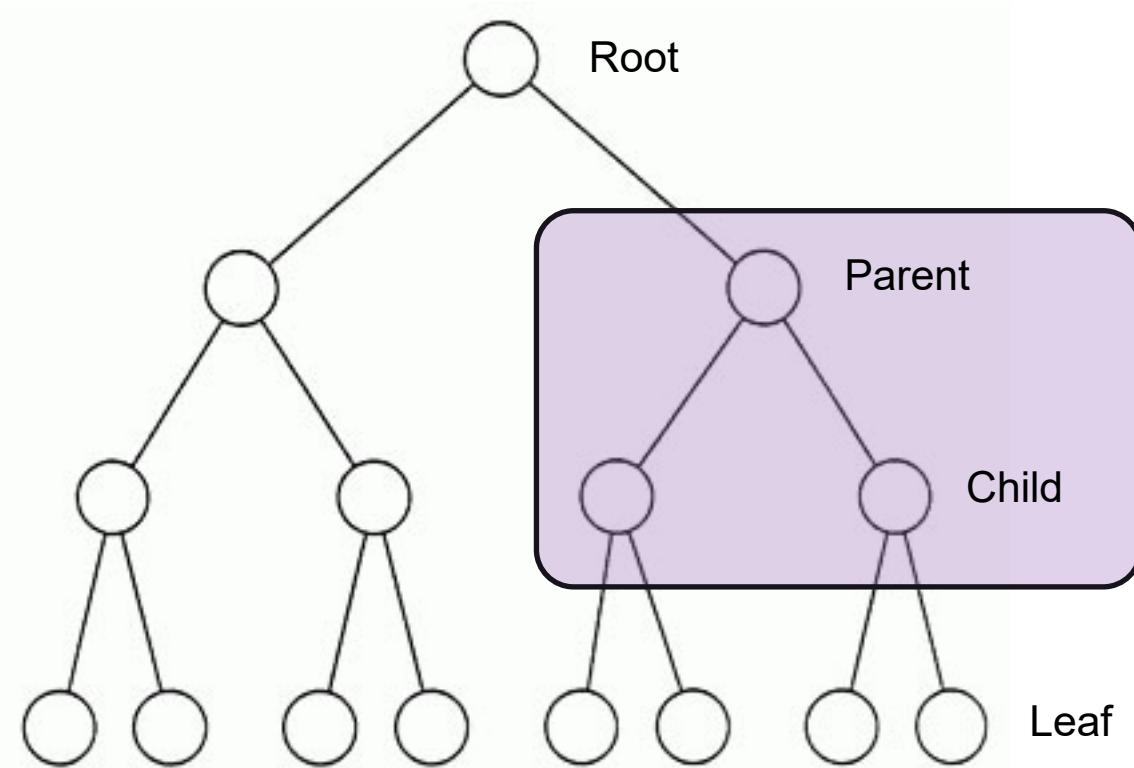


FROM            TO



Parallel Axes

# Trees & Hierarchies



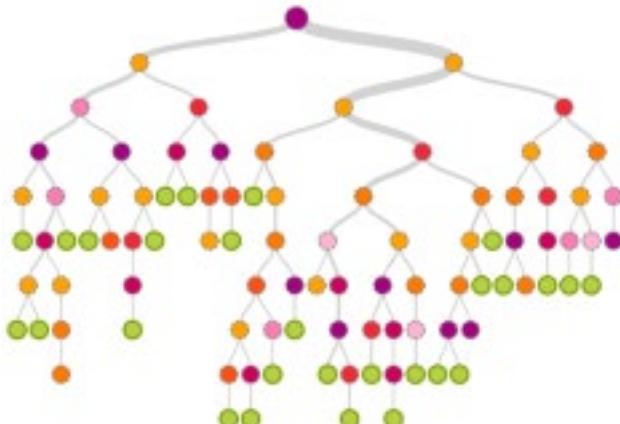
# Application of Trees

- File system tree.
- Evolutionary tree.
- Organization tree.
- Language structure tree.
- Etc.

```
:
  advanced_topics
    └── custom_plugins.rst
  api_reference
    └── intro.rst
  developer_guide
    ├── building_documentation.rst
    ├── debugging.rst
    ├── intro.rst
    ├── polarization.rst
    ├── testing.rst
    └── variants_cpp.rst
      └── writing_plugin.rst
  getting_started
    ├── cloning.rst
    ├── compiling.rst
    ├── differences.rst
    ├── faq.rst
    ├── file_format.rst
    ├── intro.rst
    └── variants.rst
  inverse_rendering
    ├── advanced.rst
    ├── diff_render.rst
    ├── intro.rst
    └── pytorch.rst
  plugin_reference
    ├── intro.rst
    ├── section_bsdf.rst
    ├── section_emitter.rst
    ├── section_film.rst
    ├── section_integrator.rst
    ├── section_phase.rst
    ├── section_rfilter.rst
    ├── section_sampler.rst
    ├── section_sensor.rst
    ├── section_shape.rst
    ├── section_spectrum.rst
    └── section_texture.rst
  python_interface
    ├── bsdf_eval.rst
    ├── intro.rst
    └── parsing_xml.rst
    └── rendering_scene.rst
```

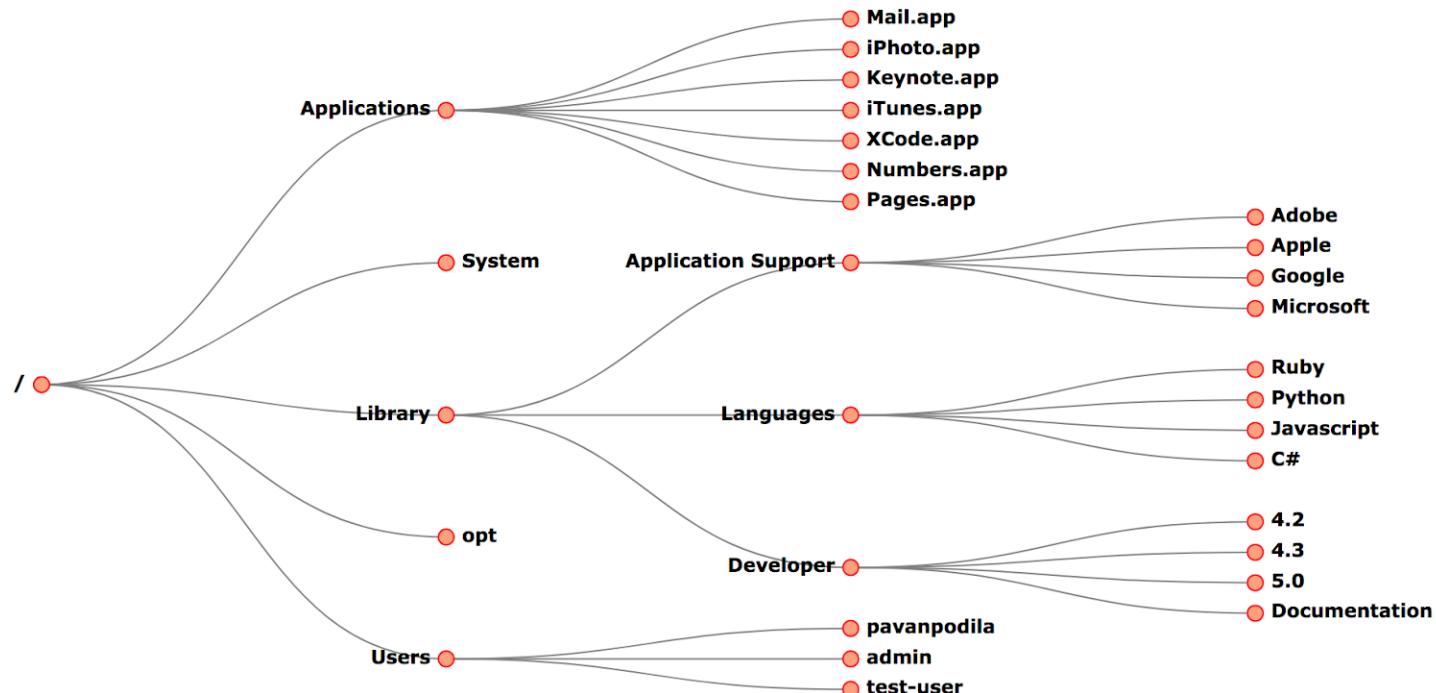
# Visualizing Trees

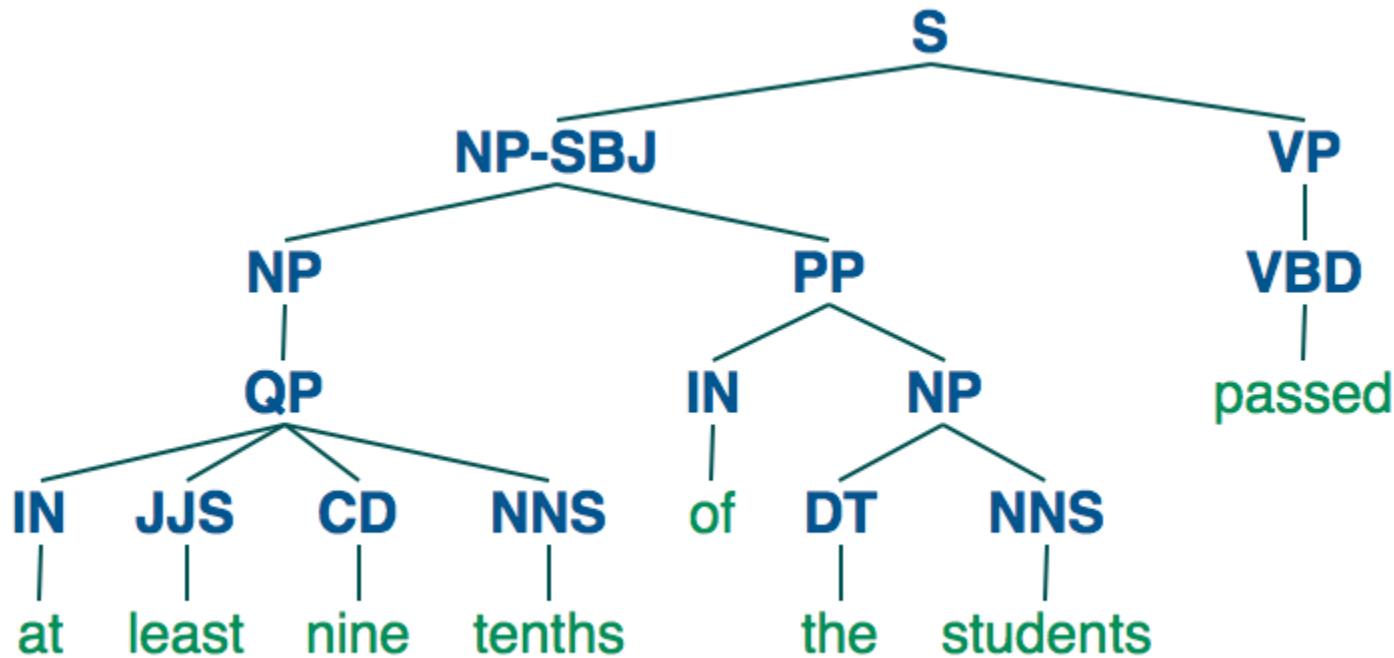
# Node-Link Diagram



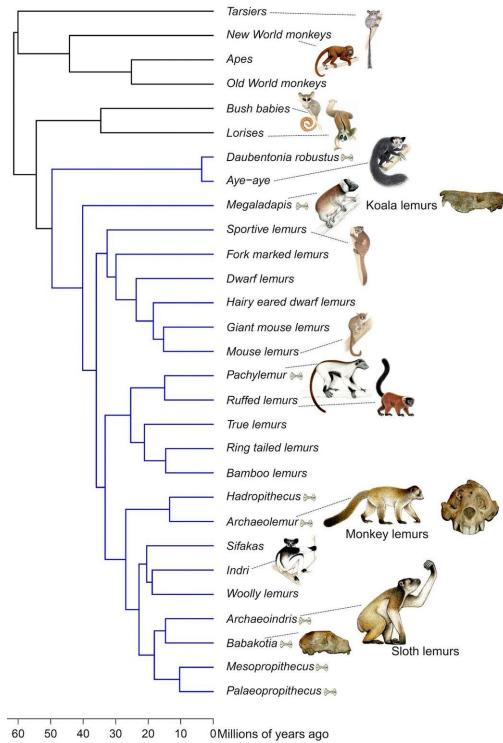
# Containment

Technology	Basic Materials	Services	Consumer Goods
Microsoft Corporation AT&T Inc  INTERNATIONAL BUSINESS MACHINES Google Inc.	Exxon Mobil Corp. Chevron Corporation QUALC...  Schlumberger Ltd. (Netherlands) Occidental Petroleum... Mons...  ConocoPhillips Dev... Hall... DuPont... Natl...  Apple Inc. Cisco Systems, Inc. Oracle Corporation	United Parcel Service Inc Comcast... Walgreens... Target...  CVS Caremark Corporation Home... Time Warner... Lowe's...  Disney (Walt) Co... Amazon... Master...  Pfizer Inc	McDonald's... Procter & Gamble Co. Coca-Cola Co (The)  PepsiCo Inc. Kraft Foods... Colgate-Palmolive Co.  Philip Morris Int'l Atria Group... Ford Motor Co.  General Electric Co Loc... Boe...  3M Co Honeywell Int'l  United Technologies... 3M Co Hon...  Wells Fargo & Co. Bank of America Corp. Goldman Sachs Group, Inc.  BANK... MORG... Amer... U.S.... Citi...  Utilities Alist... Exelon Corp. Southwicks...  General Electric Co Loc... Boe...  3M Co Hon...  United Technologies... 3M Co Hon...  Wells Fargo & Co. Bank of America Corp. Goldman Sachs Group, Inc.  BANK... MORG... Amer... U.S.... Citi...  Utilities Alist... Exelon Corp. Southwicks...
Healthcare		Financial	Conglomerates
Johnson & Johnson Abbott Laboratories Wyeth Amgen...  Merck & Co., Inc. Schering-Plough... Medtronic, Inc.  Gilead Sciences... Bristol-Myers Squibb Co. UnitedHealth Group Inc.	JPMorgan Chase & Co. Bank of America Corp. Goldman Sachs Group, Inc.  BANK... MORG... Amer... U.S.... Citi...  Utilities Alist... Exelon Corp. Southwicks...	JPMorgan Chase & Co. Bank of America Corp. Goldman Sachs Group, Inc.  BANK... MORG... Amer... U.S.... Citi...  Utilities Alist... Exelon Corp. Southwicks...	General Electric Co Loc... Boe...  3M Co Hon...  United Technologies... 3M Co Hon...  Wells Fargo & Co. Bank of America Corp. Goldman Sachs Group, Inc.  BANK... MORG... Amer... U.S.... Citi...  Utilities Alist... Exelon Corp. Southwicks...
		Industrial Go...	

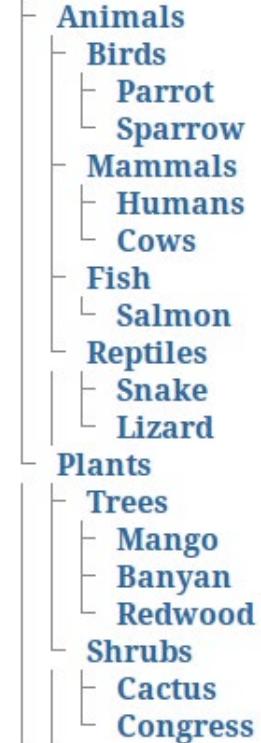




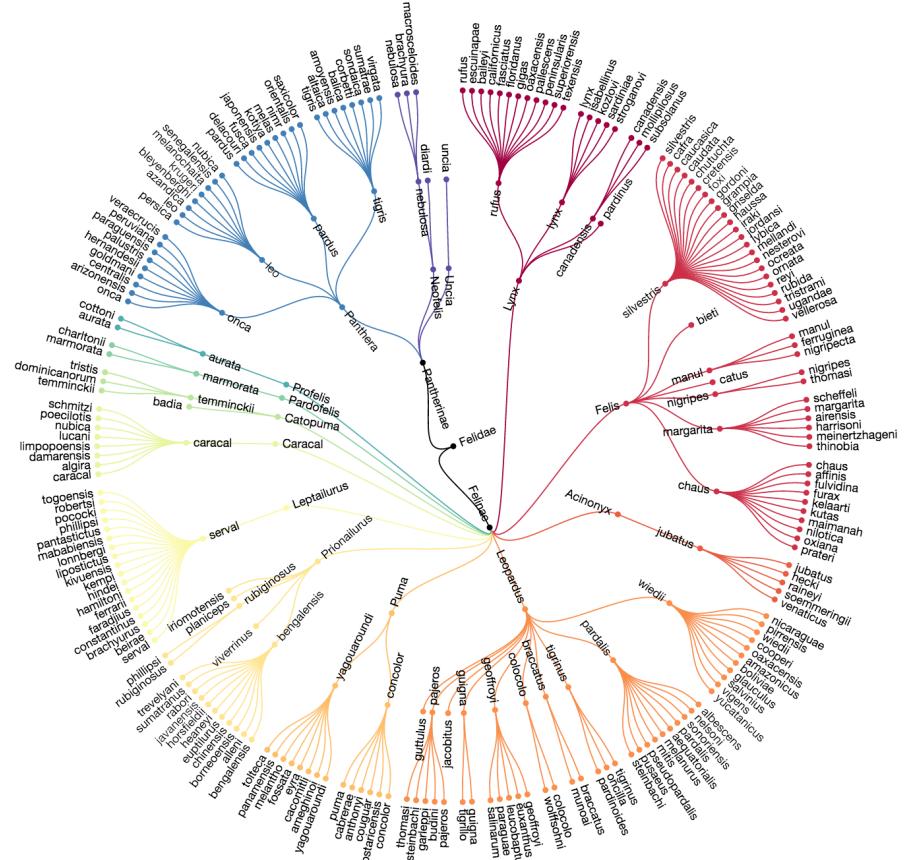
Source: <https://stackoverflow.com/questions/23429117/saving-nltk-drawn-parse-tree-to-image-file>



Source: <http://novataxa.blogspot.com/2016/04/>



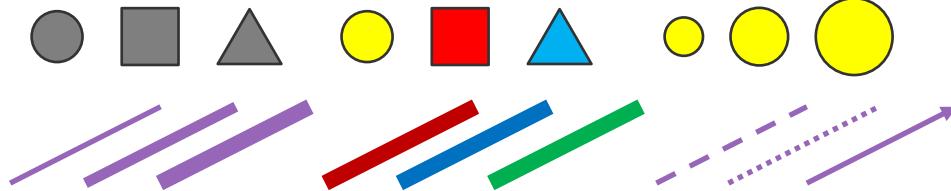
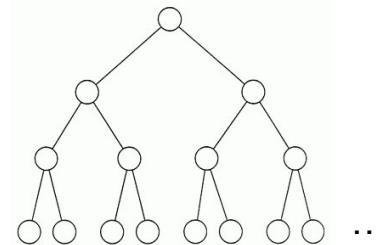
Source: <https://stackoverflow.com/questions/14922247/how-to-get-a-tree-in-html-using-pure-css>



Source: <https://www.safaribooksonline.com/library/view/expert-data-visualization/9781786463494/274b60c6-4b5f-42f0-8b02-393c91ae18dc.xhtml>

# Node-Link Diagram

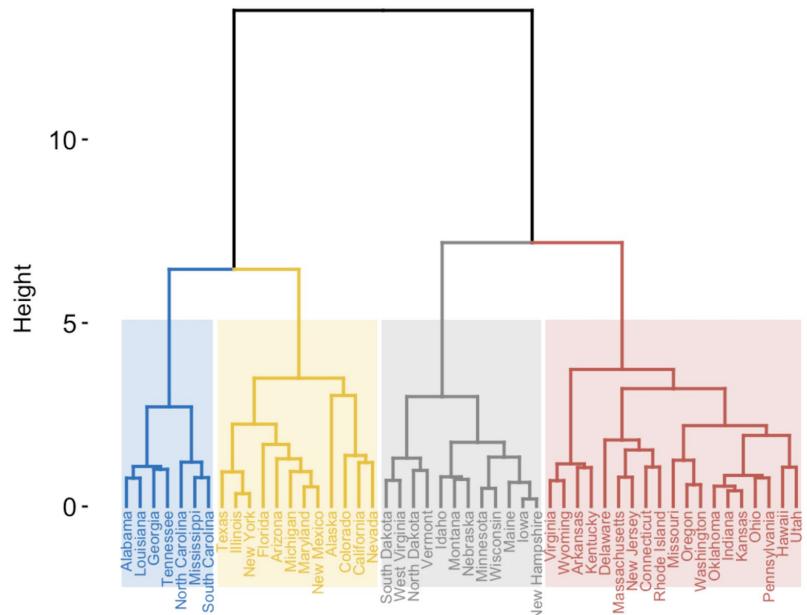
- Scalability (1D growth).
- Labeling.
- Encoding information.



# Dendrogram

# Dendrogram

Cluster Dendrogram

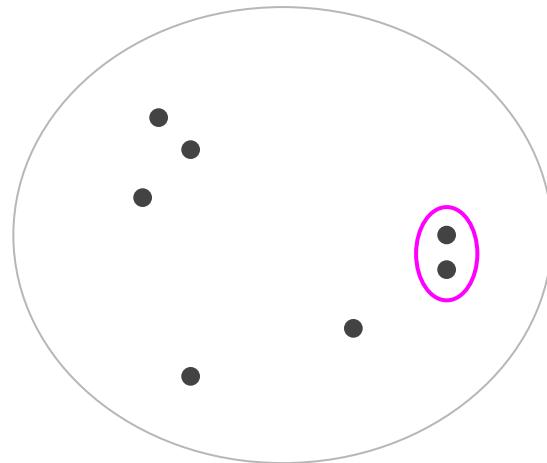


- Binary Tree
- Represent **hierarchical cluster**.

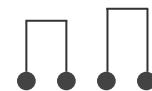
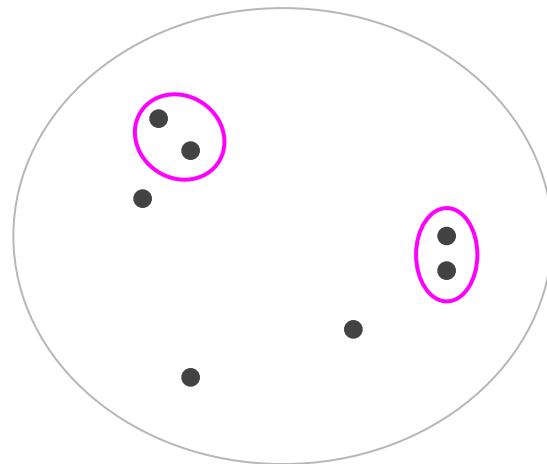
## Hierarchical clustering:

Data mining algorithm to organize objects into a hierarchy according to a similarity metric defined between the objects.

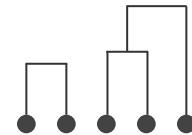
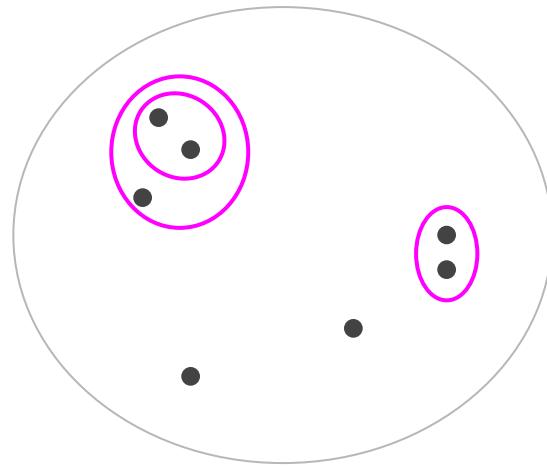
# Hierarchical Clustering



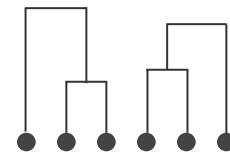
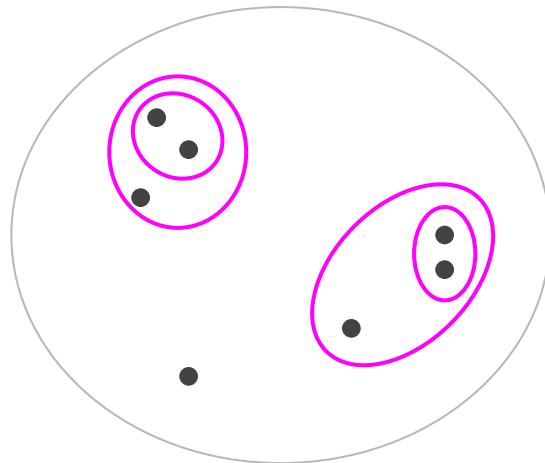
# Hierarchical Clustering



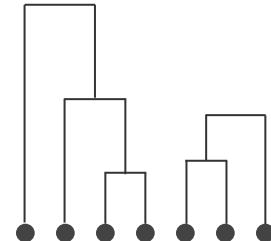
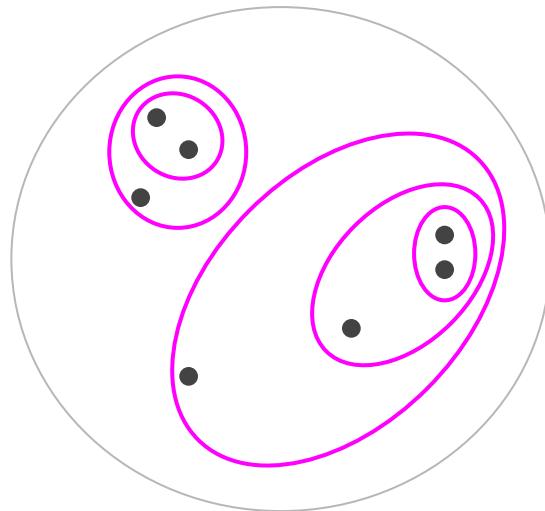
# Hierarchical Clustering



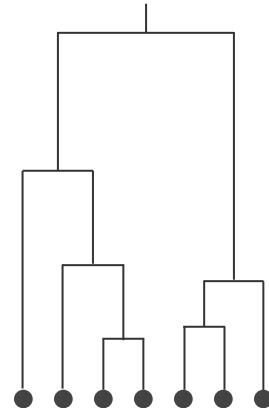
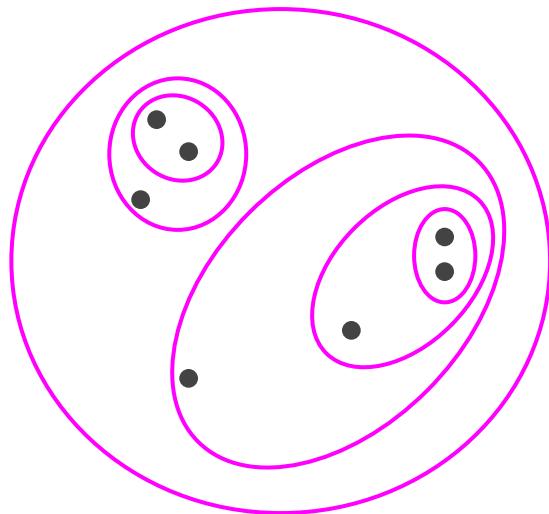
# Hierarchical Clustering



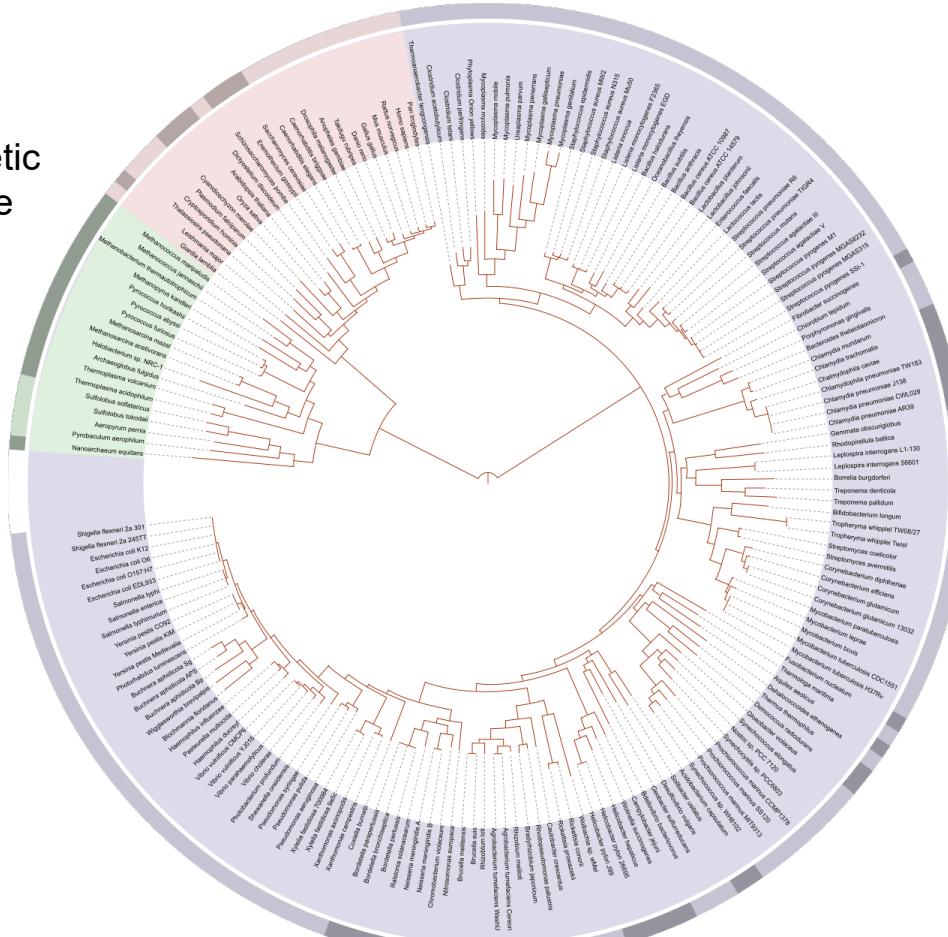
# Hierarchical Clustering

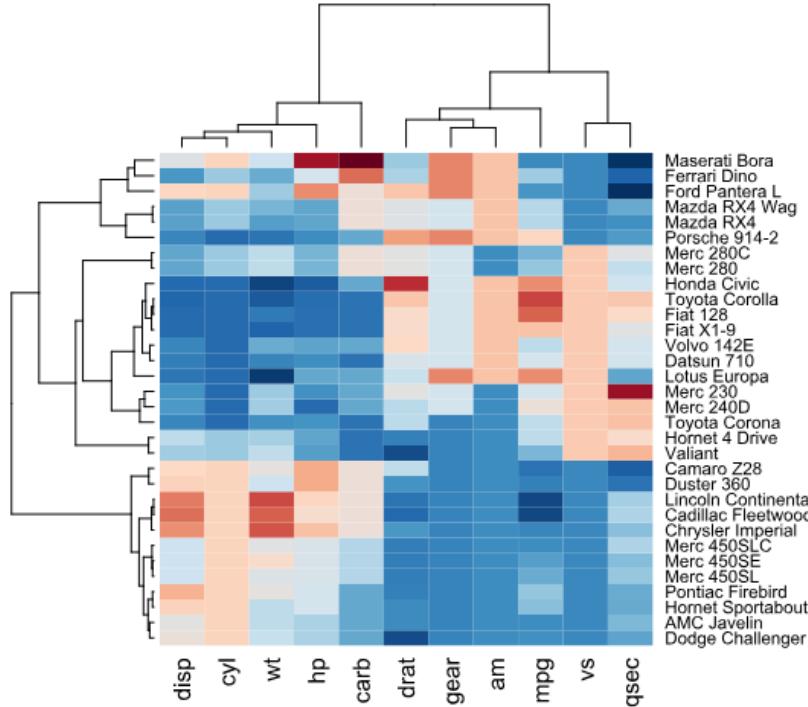


# Hierarchical Clustering

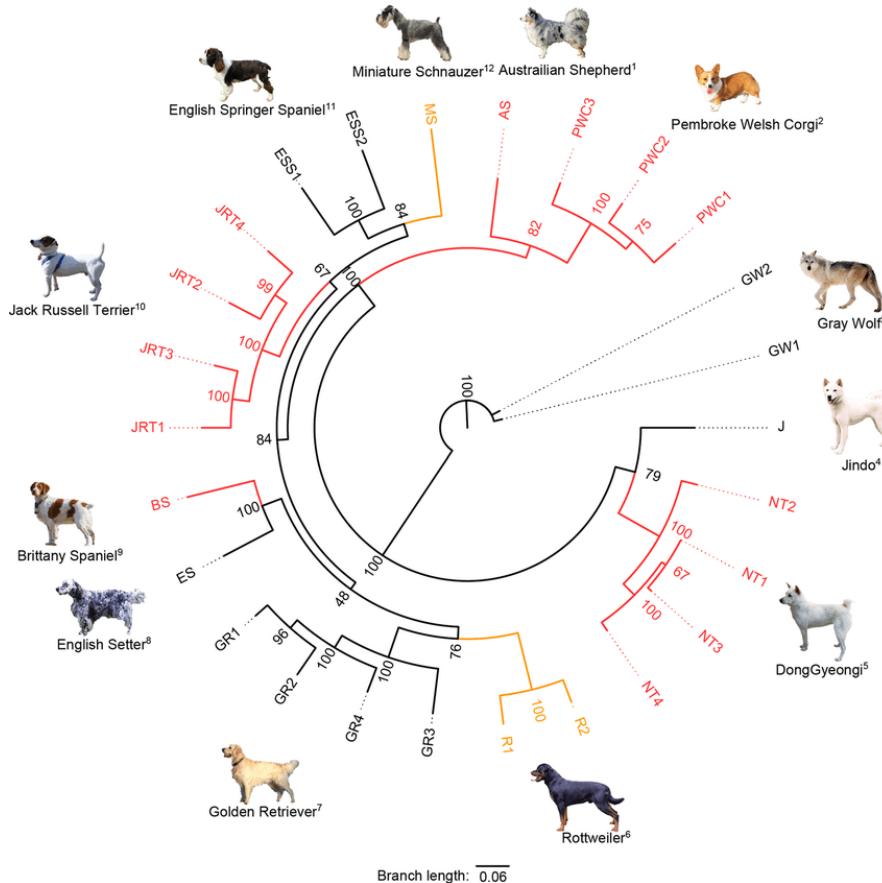


Phylogenetic Trees  
Computed from “Genetic  
Distance” from multiple  
sequence alignments.



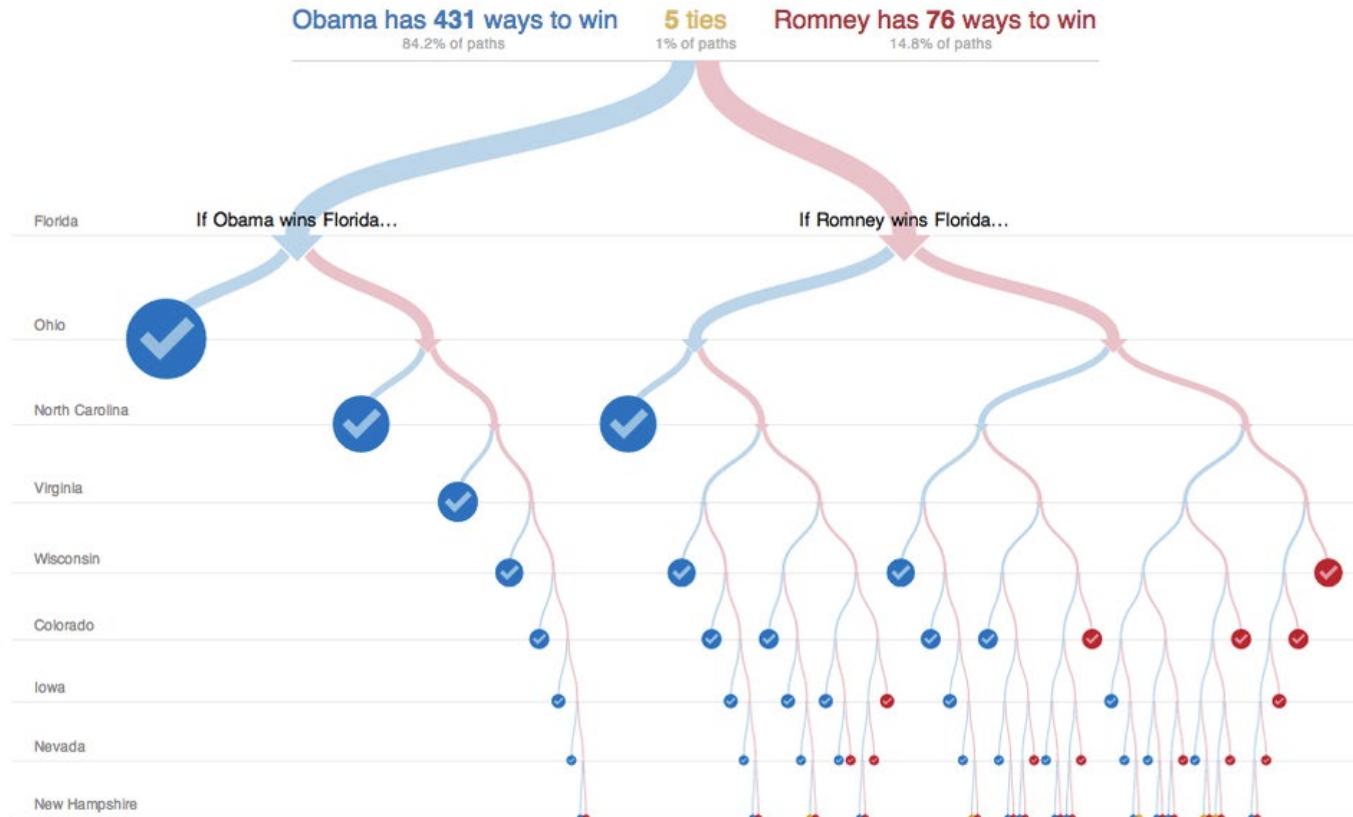


Useful to group together and visualize  
any set of complex objects on top of  
which a distance function can be  
defined ...

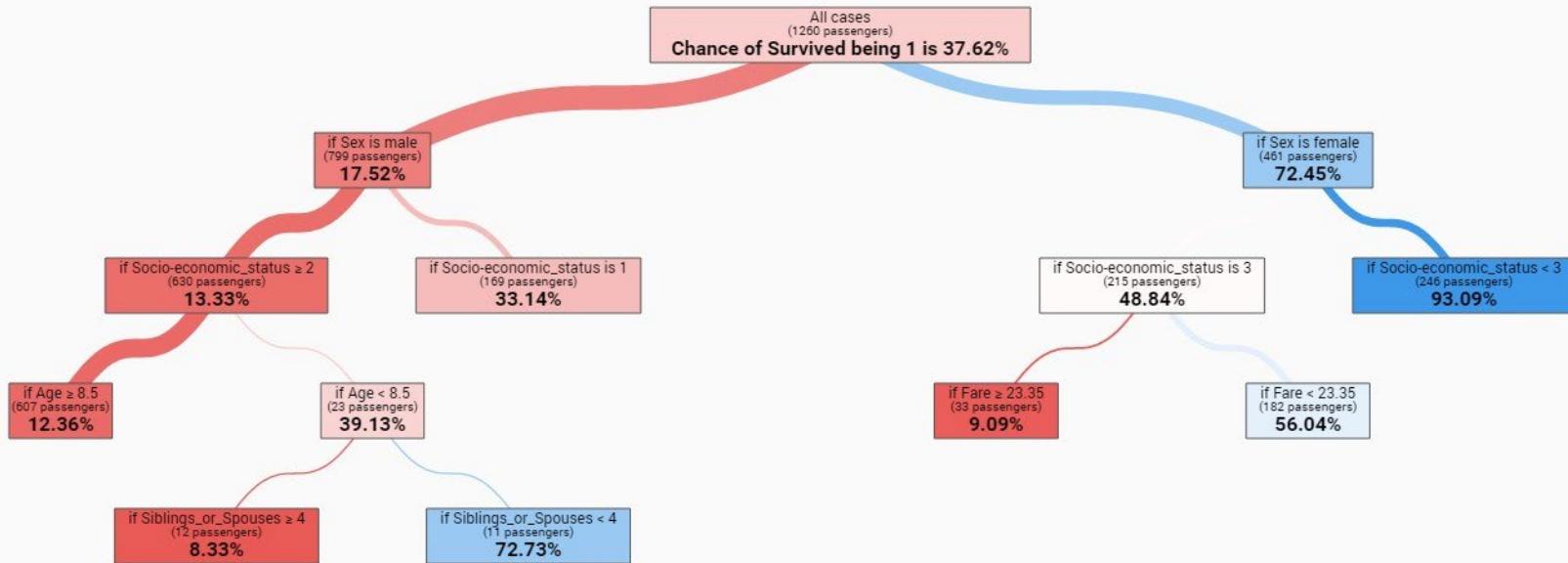


# Decision Trees

# 512 Paths to White House



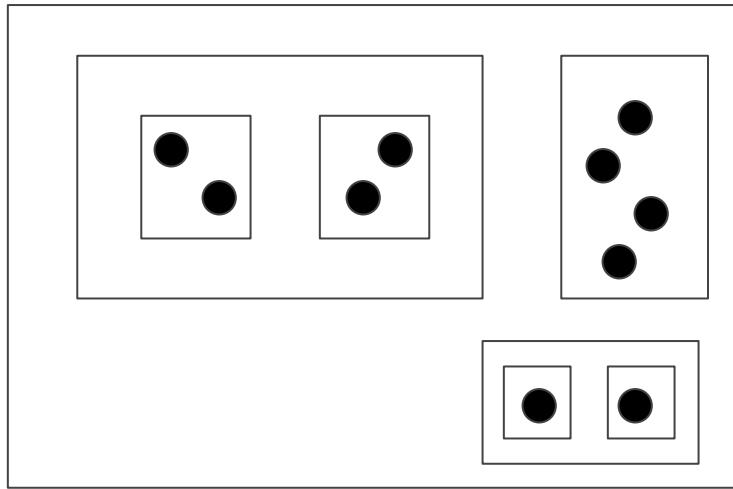
Source: <https://source.opennews.org/articles/nyts-512-paths-white-house/>



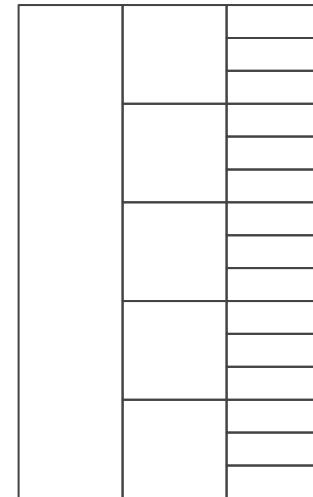
Decision Trees can be built automatically from data.

# Space Partitioning & Containment Methods

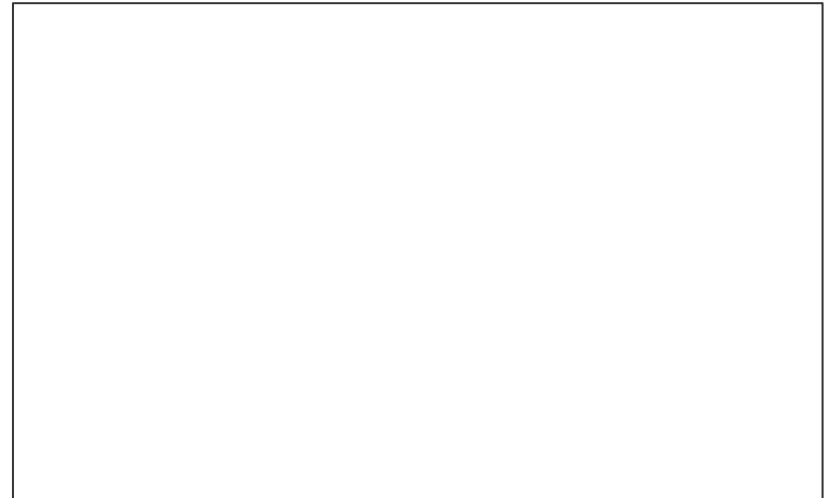
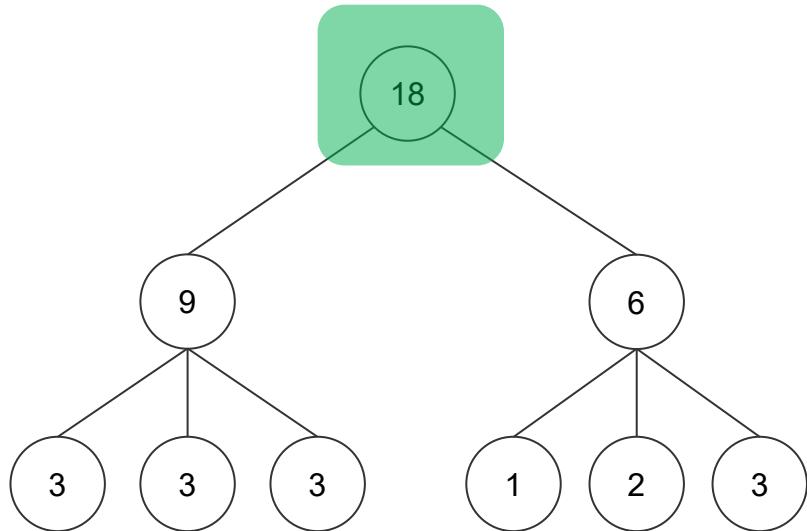
## Containment



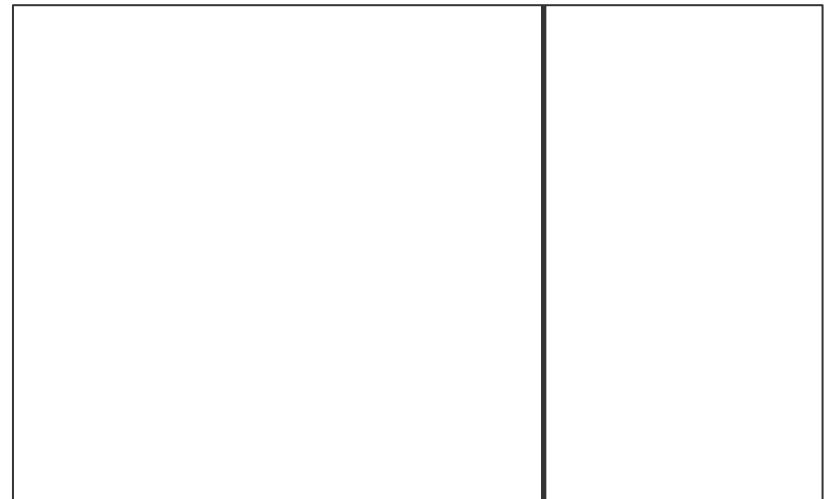
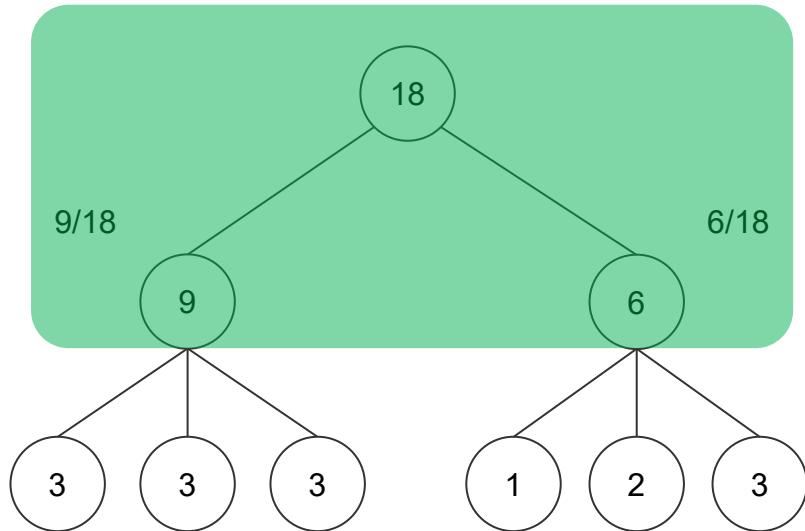
## Partitioning



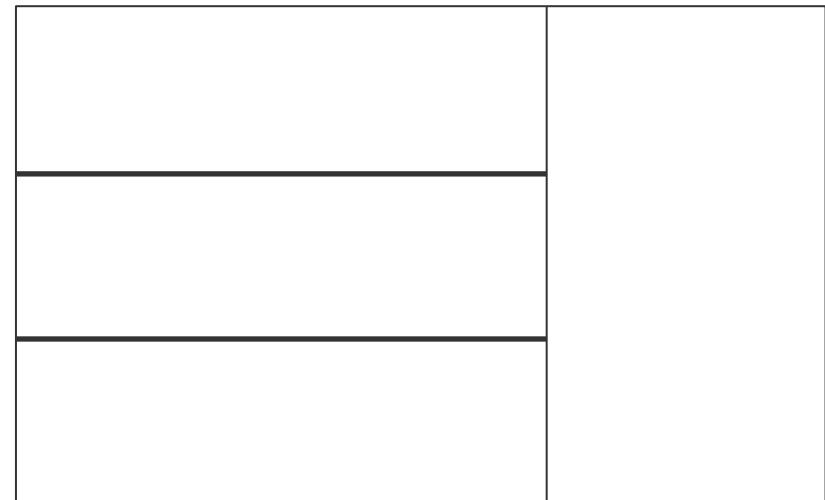
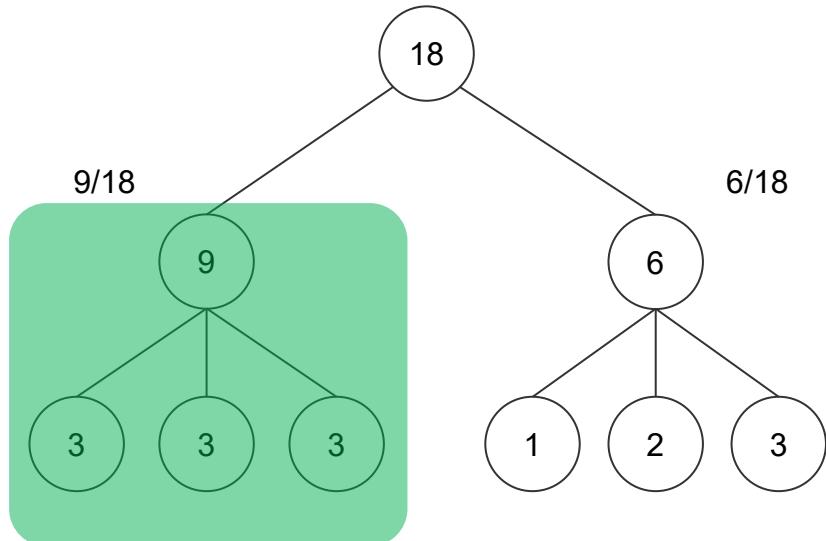
# Tree Map



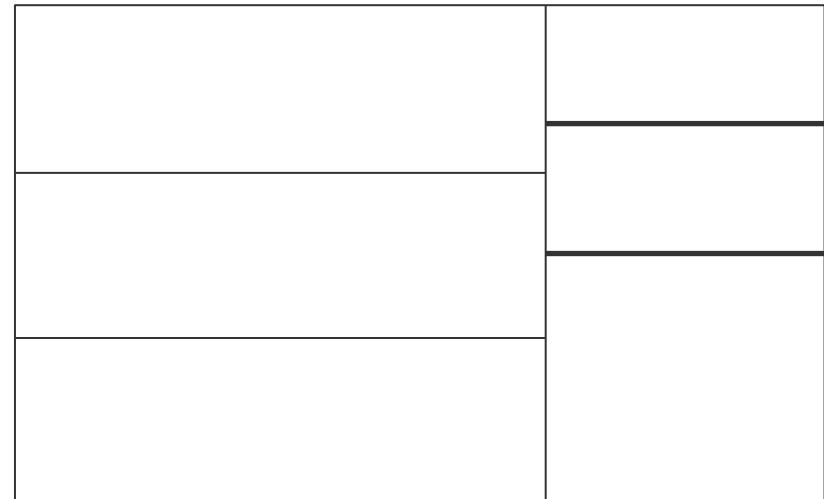
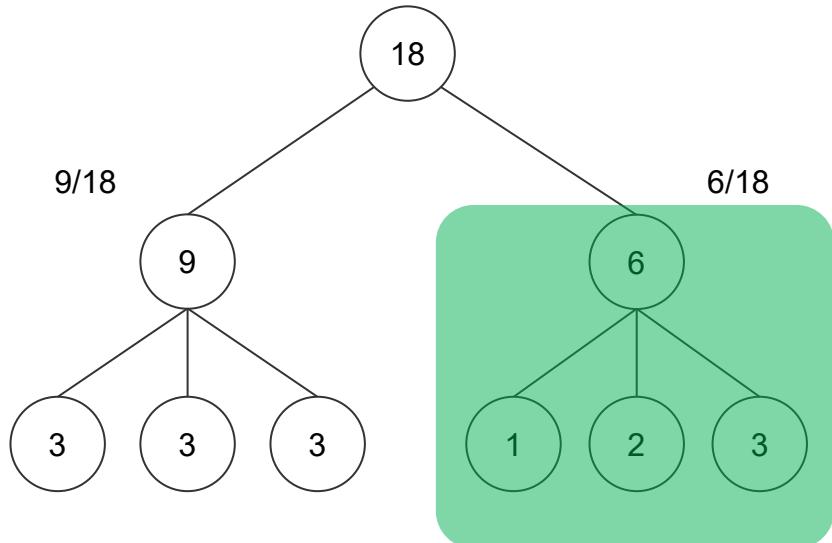
# Tree Map



# Tree Map

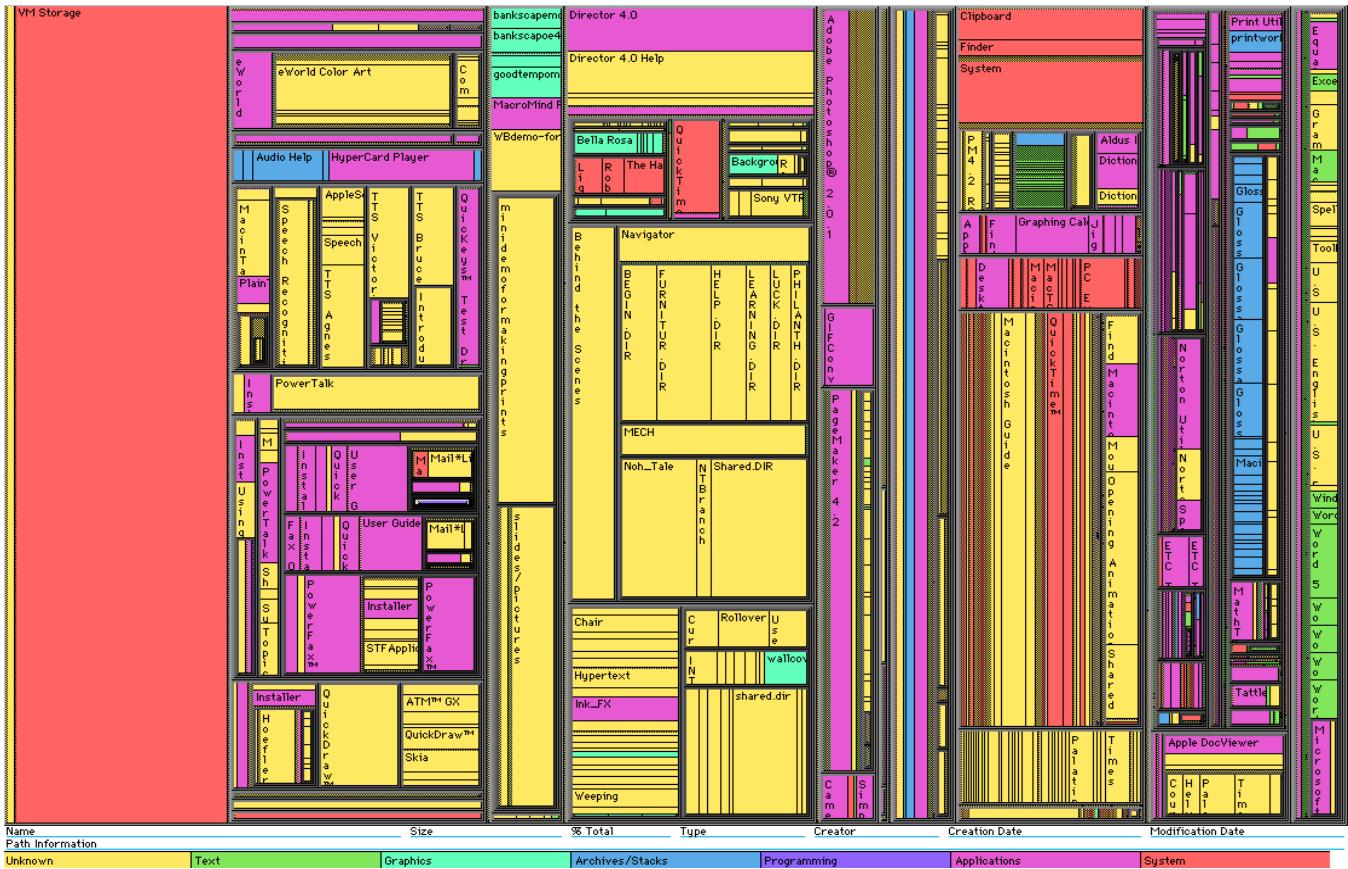


# Tree Map



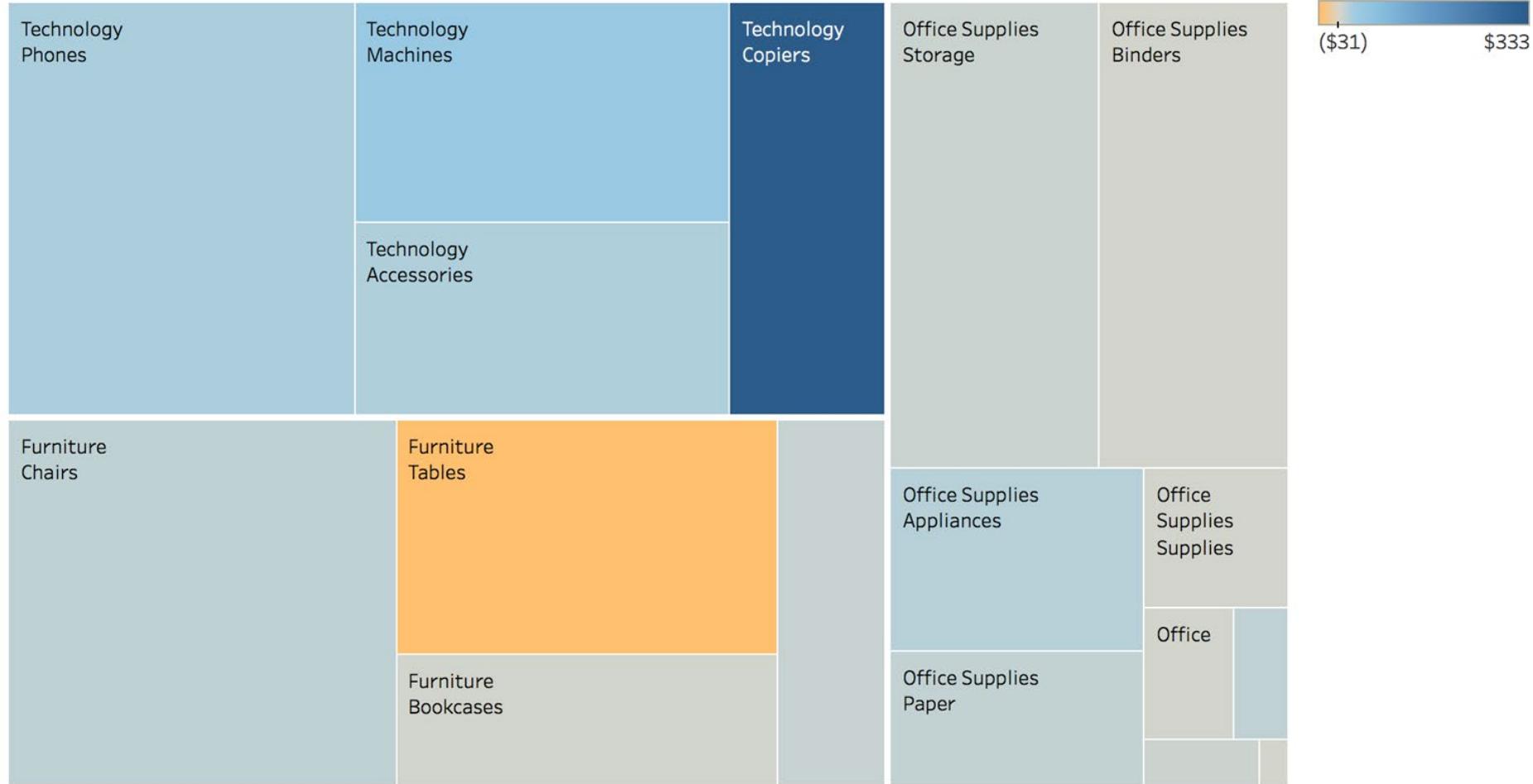


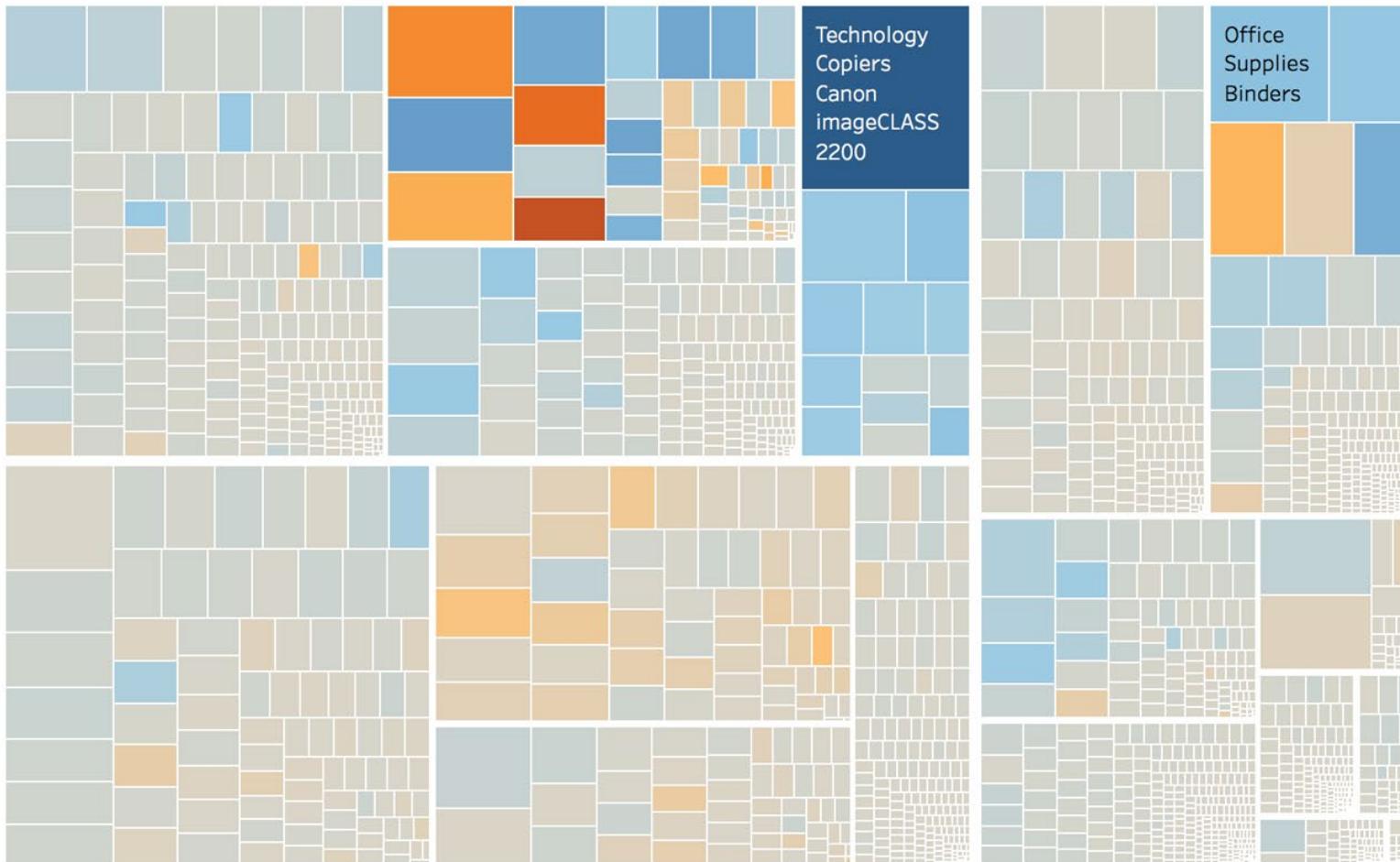
*“During 1990, in response to the common problem of a filled hard disk, I became obsessed with the idea of producing a compact visualization of directory tree structures.”* - Ben Shneiderman



## What information can be visualized with a tree map?

Area: Quantity  
Color: Quantity/Category  
Hierarchy: Nesting





(\$3,840)      \$5,040

# Linux Kernel

Source files: yellow

Header files: pink

Text files: dark blue

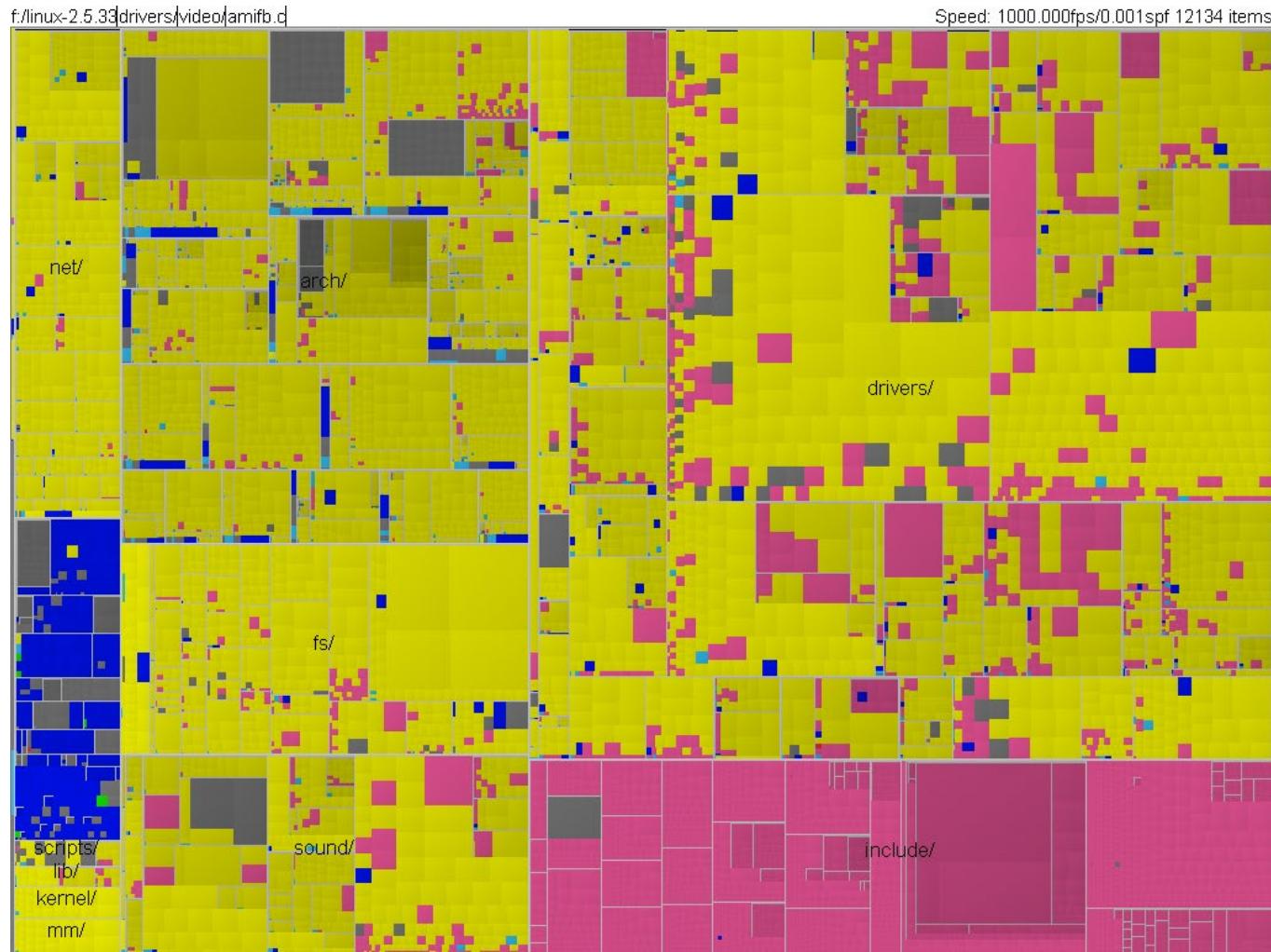
Makefiles: light blue

Shell scripts: red

Images: green

Non-registered suffixes:

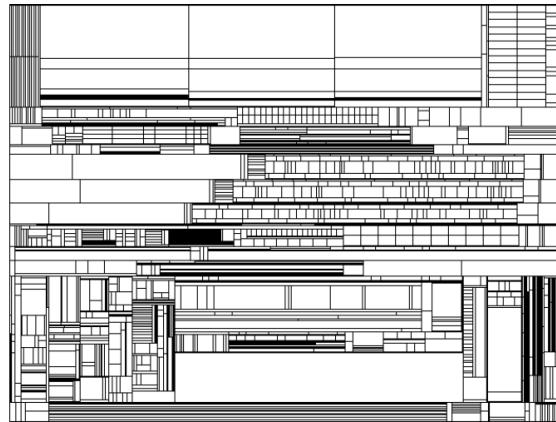
grey



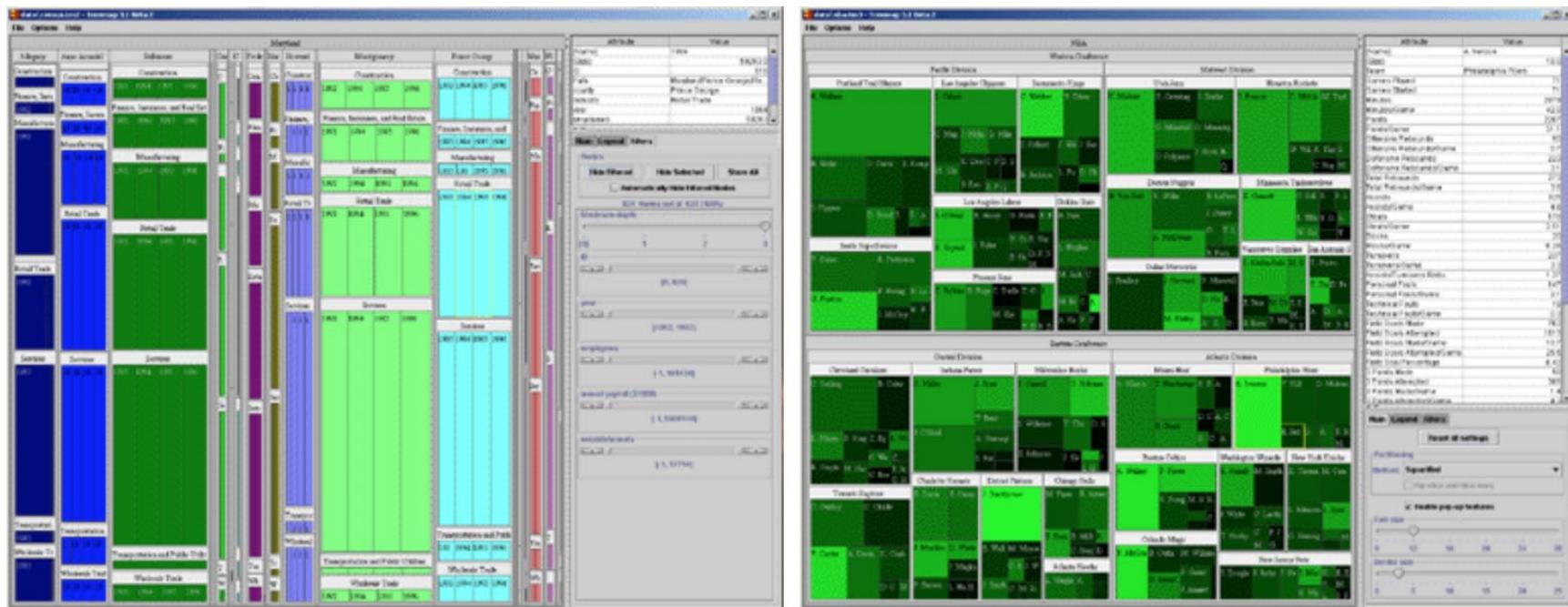
# Tree Map: Drawbacks

When the rectangles have very different aspect ratios (proportion of height vs. width), comparing areas gets harder (especially with thin elongated rectangles).

Solution: Squarified Tree Maps.



## PART 02



**Late-Breaking Results**

ACM ISBN: 1-58113-158-5

CHI '99 15-20 MAY 1999

**Visualizing the Stock Market****Martin Wattenberg**

Dow Jones & Co. (SmartMoney Magazine)  
 1755 Broadway  
 New York, NY 10019 USA  
 +1 212 830 9226  
 mwattenberg@smartmoney.com

**ABSTRACT**

We describe a new 2-dimensional visualization algorithm capable of presenting hierarchical information on hundreds of items while emphasizing overall patterns in the data. This display method, which builds on Shneiderman's treemap technique, makes use of both hierarchy and similarity information. We have implemented this display in the *SmartMoney Map of the Market*, a web page that reports current data on over 500 publicly traded companies.

**Keywords**

Visualization, interactive graphics, treemap, investing

**INTRODUCTION**

A key goal of financial journalism is to answer the question "How is the market doing today?" What makes this question tough is that there are so many possible answers: on a given day, the market as a whole may be up, but technology stocks could be down—but Apple Computer's stock might be up. Summing up the market with one or two index values hides a lot of the action. But if you give all the stocks as much space as they deserve, a new result is hard to read and there is no way to spot overall trends. This paper describes a new interactive graphical display, related to Shneiderman's treemap diagram [3], that allows a user to track the performance of hundreds of stocks at once without losing sight of the bigger picture.

**PROBLEM**

Using a treemap to provide a snapshot of stock market performance across several sectors and with hierarchical classifications of companies (by broad sectors and, within sectors, specific industries) are common. Companies also have a natural "size," namely their market capitalization. Finally, price performance can be indicated by color coding. However, previous approaches to using treemaps to display stock market data[2] present two problems.

Firkin the "slice-and-dice" layout method often creates a partition containing rectangles with extremely large aspect ratios. Figure 1, a slice-and-dice layout with two levels of hierarchy, clearly shows this effect.

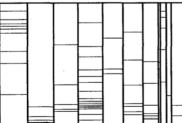


Figure 1: Typical slice-and-dice layout



Figure 2: New layout scheme, described below

Rectangles with high aspect ratios are often hard to see, let alone compare in size. Extreme aspect ratios also make a zoom option problematic, since the zooming transformation must stretch or contract more than the other, which can distort the tree. Previous attempts to solve this problem, such as intentionally distorting rectangle sizes or eliminating the high-aspect-ratio rectangles[2,4], interfere with the accuracy of the diagram.

The second problem is that we wish to place similar companies and sectors next to each other. Doing so gives the user added cues to the relationships between companies and sectors, and increases the chance that when several similar companies experience related price movements, the

**Squared Treemaps**

Mark Bruls, Kees Huizing, and Jarke J. van Wijk

Eindhoven University of Technology  
 Dept. of Mathematics and Computer Science,  
 P.O. Box 513,  
 5600 MB Eindhoven, The Netherlands  
 email: {keesj, jarke}@wxs.fwi.eur.nl

**Abstract.** An extension to the treemap method for the visualization of hierarchical information, such as directory structures and organization structures, is presented. The standard treemap method often gives thin, elongated rectangles. As a result, rectangles are difficult to compare and to select. A new method is presented to generate layouts in which the rectangles approximate squares. To strengthen the visualization of the structure, shaded frames are used around groups of related nodes.

**1 Introduction**

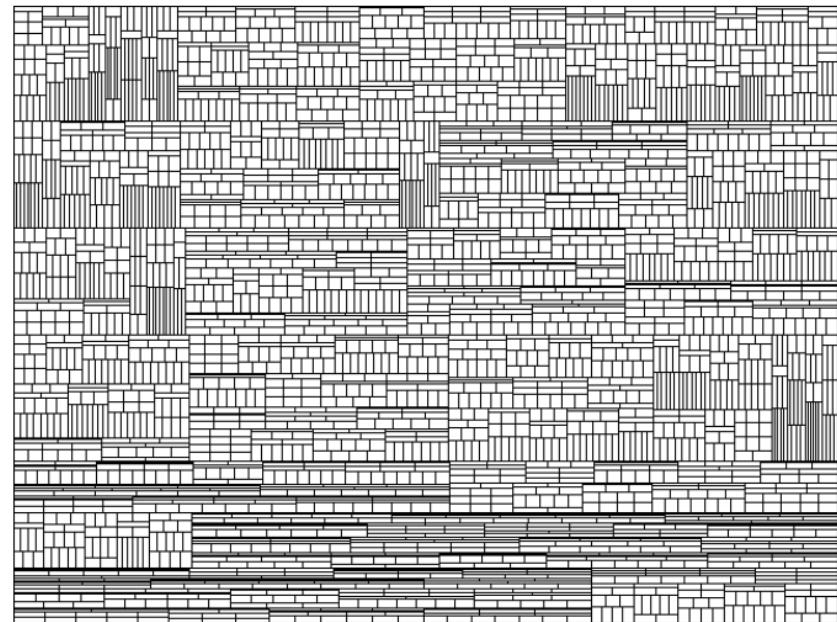
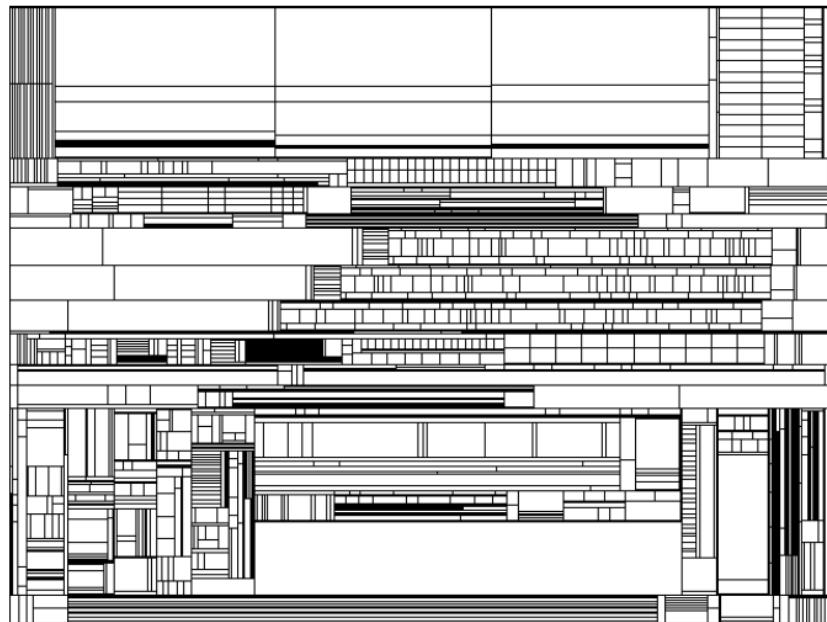
Hierarchical structures of information are everywhere: directory structures, organization structures, family trees, catalogues, computer programs, and so on. Small hierarchical structures are effective to locate information, but the content and organization of large structures is harder to grasp. We present a new method for visualizing hierarchical structures: Squarified Treemaps. The method is based on Treemaps, developed by Shneiderman and Johnson [9,6]. Treemaps are efficient and compact displays, which are particularly effective to show the size of the final elements in the structure. In a previous paper [10] we introduced Cushion Treemaps, which provide shading as an extra cue to emphasize the size of the innermost, or deepest, rectangles. In this paper we present a new method to handle the emerging of thin, elongated rectangles. We propose a new method to subdivide rectangular areas, such that the resulting subrectangles have a lower aspect ratio. These rectangles use space more efficiently, are easier to point at in an interactive environment, and are easier to compare relative to size. Because these structures are easier to grasp, we also introduce a related method to visualize nested structures. A variant on nested treemaps is presented, where the rectangular enclosures have been replaced by shaded frames. The combination of these two methods leads to displays of hierarchical structures that are efficient and easy to understand.

In section 2 we discuss existing methods to visualize hierarchical structures. The new method for improved subdivision is presented in section 3. The shaded frames are described in section 4. Finally, we discuss the results in section 5.

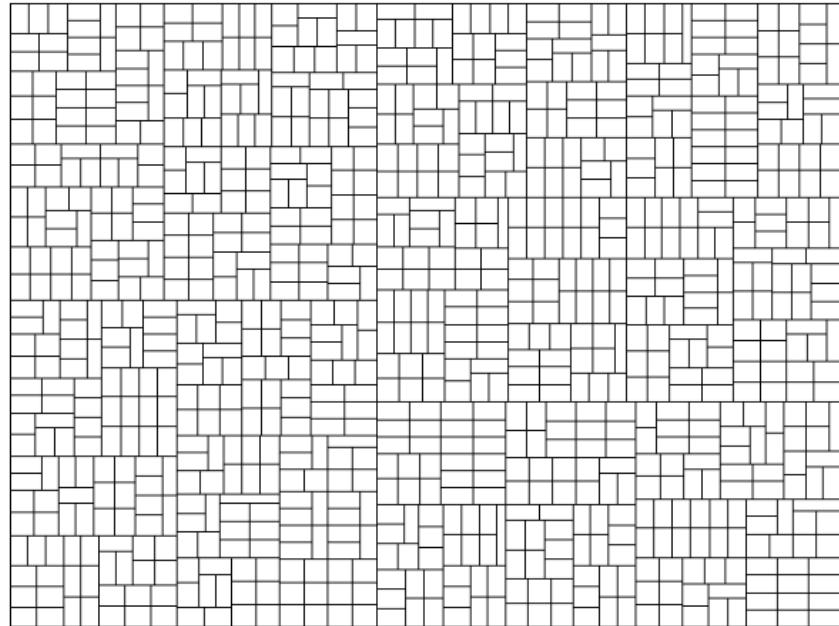
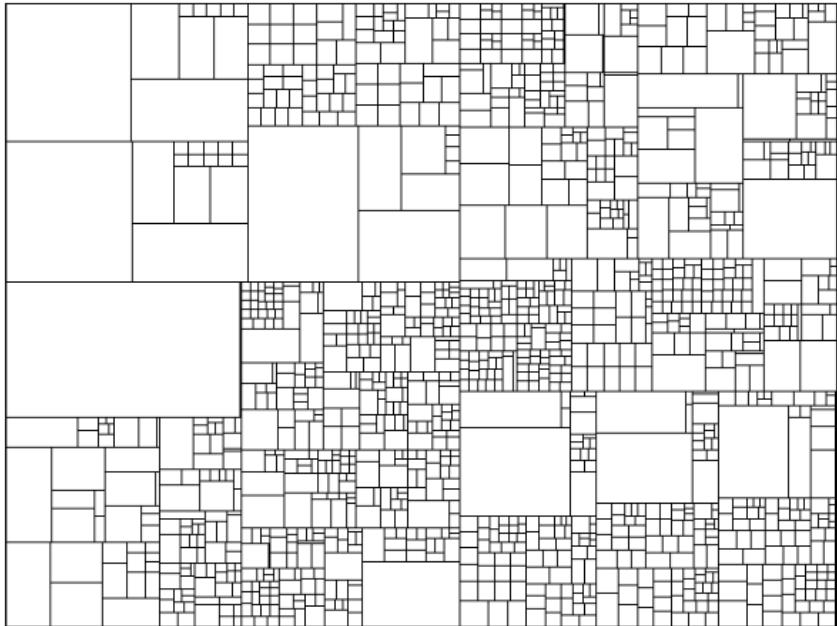
**2 Background**

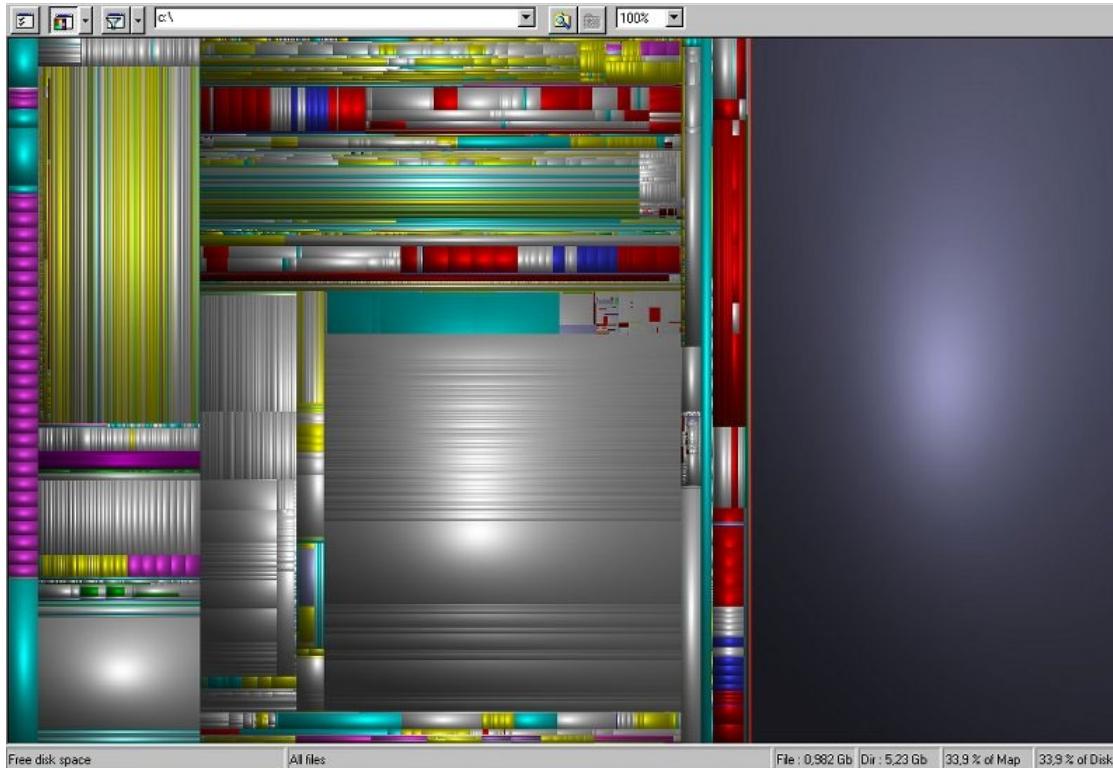
Many methods exist to browse through and to display hierarchical information structures, or, for short, trees. File browsers are the best known example. Usually a listing of

PART 02



PART 02





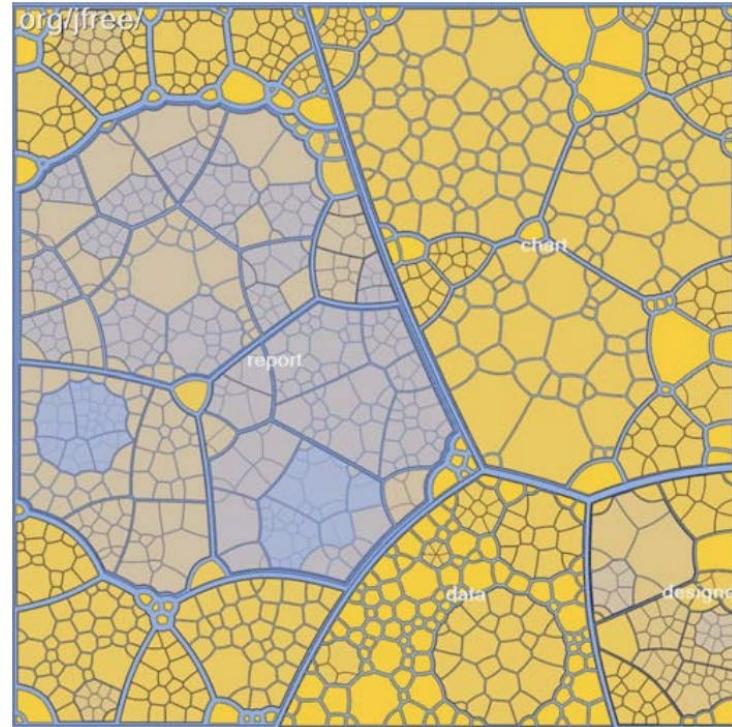
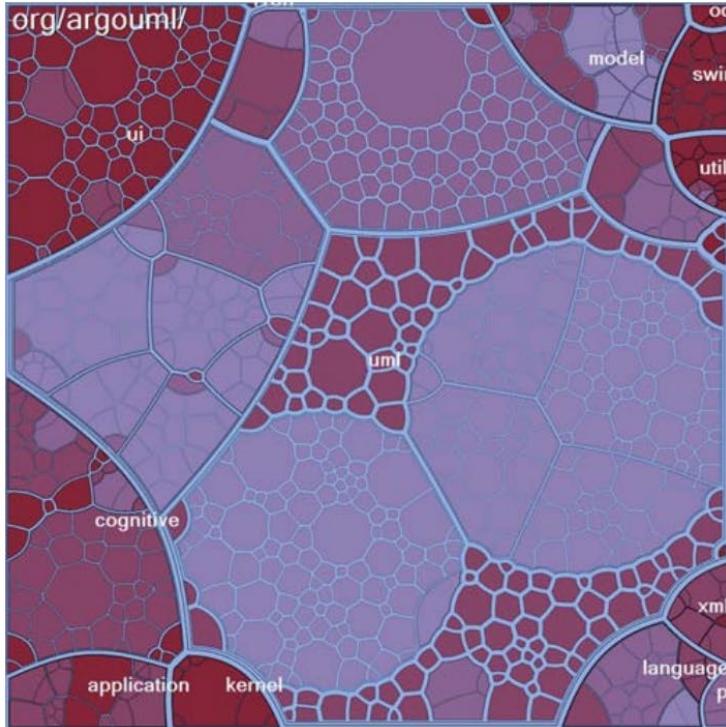
## Cushion Tree Maps

<http://www.win.tue.nl/~vanwijk/ctm.pdf>



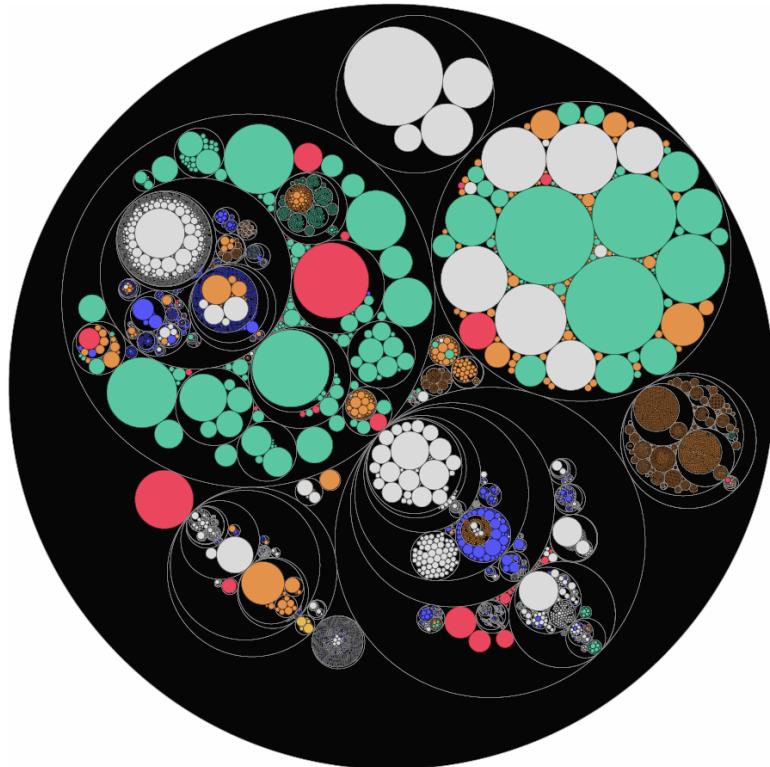
## News Tree Maps

<https://www.addictivetips.com/internet-tips/newsmap-google-news-with-a-color-coded-treemap-visualization/>



## Voronoi Tree Maps

<http://delivery.acm.org/10.1145/1060000/1056041/p165-balzer.pdf>



## Circle-Packing Tree Maps

# Treemaps for space-constrained visualization of hierarchies

## Including the History of Treemap Research at the University of Maryland

Started Dec. 26th, 1998 by Ben Shneiderman

Later updates by Ben Shneiderman and Catherine Plaisant - Last update Sept 2014

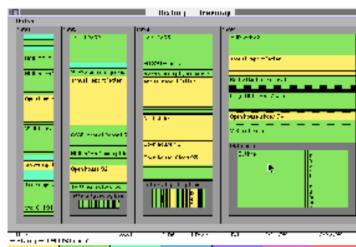
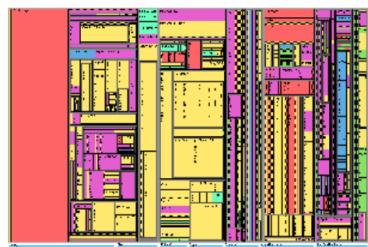
Our treemap products:

- [Treemap 4.0](#): General treemap tool (Free demo version, plus licensing information for full package)
- [PhotoMesa](#): Zoomable image library browser (Free demo version, plus licensing information for full package)
- [Treemap Algorithms](#) and [Algorithm Animations](#) (Open source Java code)

### A History of Treemap Research at the University of Maryland

During 1990, in response to the common problem of a filled hard disk, I became obsessed with the idea of producing a compact visualization of directory tree structures. Since the 80 Megabyte hard disk in the HCIL was shared by 14 users it was difficult to determine how and where space was used. Finding large files that could be deleted, or even determining which users consumed the largest shares of disk space were difficult tasks.

Tree structured node-link diagrams grew too large to be useful, so I explored ways to show a tree in a space-constrained layout. I rejected strategies that left blank spaces or those that dealt with only fixed levels or fixed branching factors. Showing file size by area coding seemed appealing, but various rectangular, triangular, and circular strategies all had problems. Then while puzzling about this in the faculty lounge, I had the Aha! experience of splitting the screen into rectangles in alternating horizontal and vertical directions as you traverse down the levels. This recursive algorithm seemed attractive, but it took me a few days to convince myself that it would always work and to write a six line algorithm. This algorithm and the initial designs led to the first Technical Report ([HCIL TR 91-03](#)) in March 1991 which was published in the ACM Transactions on Graphics in January 1992 (<http://www.acm.org/pubs/citations/journals/tog/1992-11-1/p92-shneiderman/>). Choosing the right name took probably as long, but the term 'treemap' described the notion of turning a tree into a planar space-filling map.



My initial design simply nested the rectangles, but a more comprehensible design used a border to show the nesting. Finding an effective visualization strategy took only a few months but producing a working piece of software took over a year. Brian Johnson implemented the algorithms and refined the presentation strategies while preserving rapid performance even with 5,000 node hierarchies. The [TreeViz application](#) ran on color Macintosh models and led to the widely cited paper ([HCIL TR 91-06](#)) jointly authored paper in the October 1991 IEEE Conference on Visualization. This paper was

reprinted in [Readings in Information Visualization](#). I think treemaps are a convenient representation that has unmatched utility for certain tasks. The capacity to see tens of thousands of nodes in a fixed space and find large areas or duplicate directories is very powerful. I still use TreeViz for cleaning up my Macintosh. It does take some learning for novices to grasp the tree structure layout in treemaps, but the benefits are great.

Source: <http://www.cs.umd.edu/hcil/treemap-history/>

# Tree Map Summary

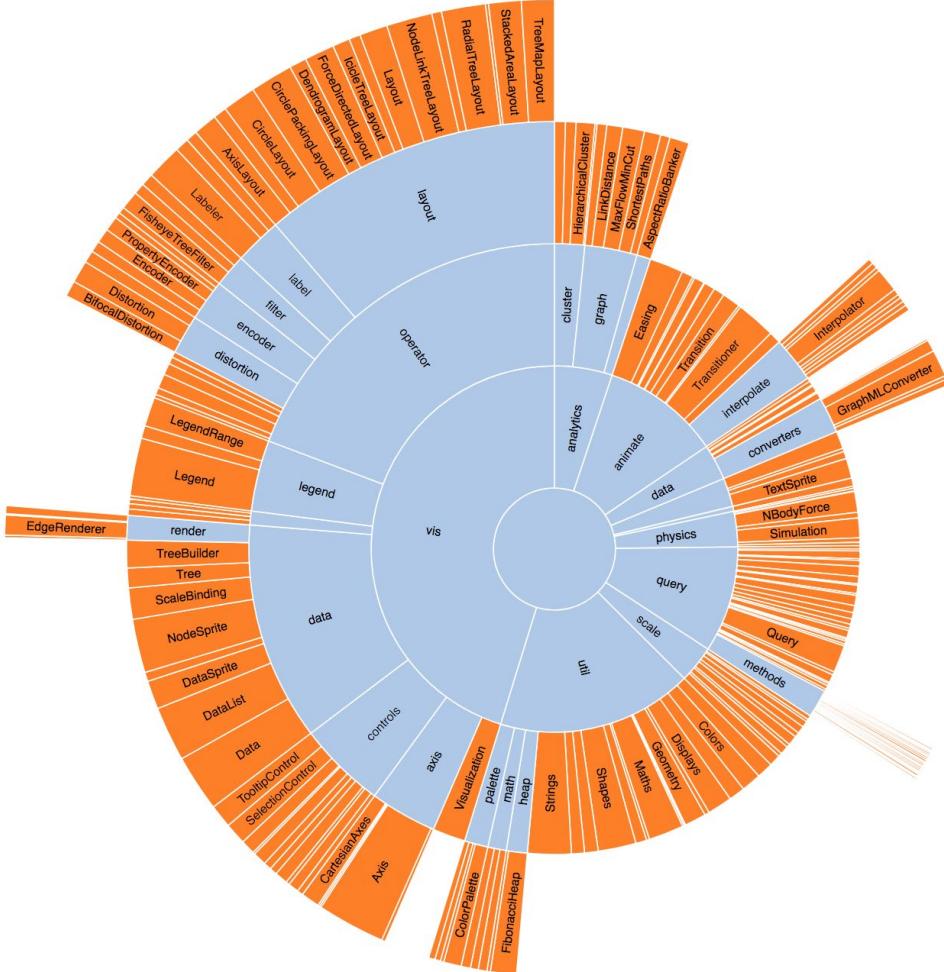
## Advantages:

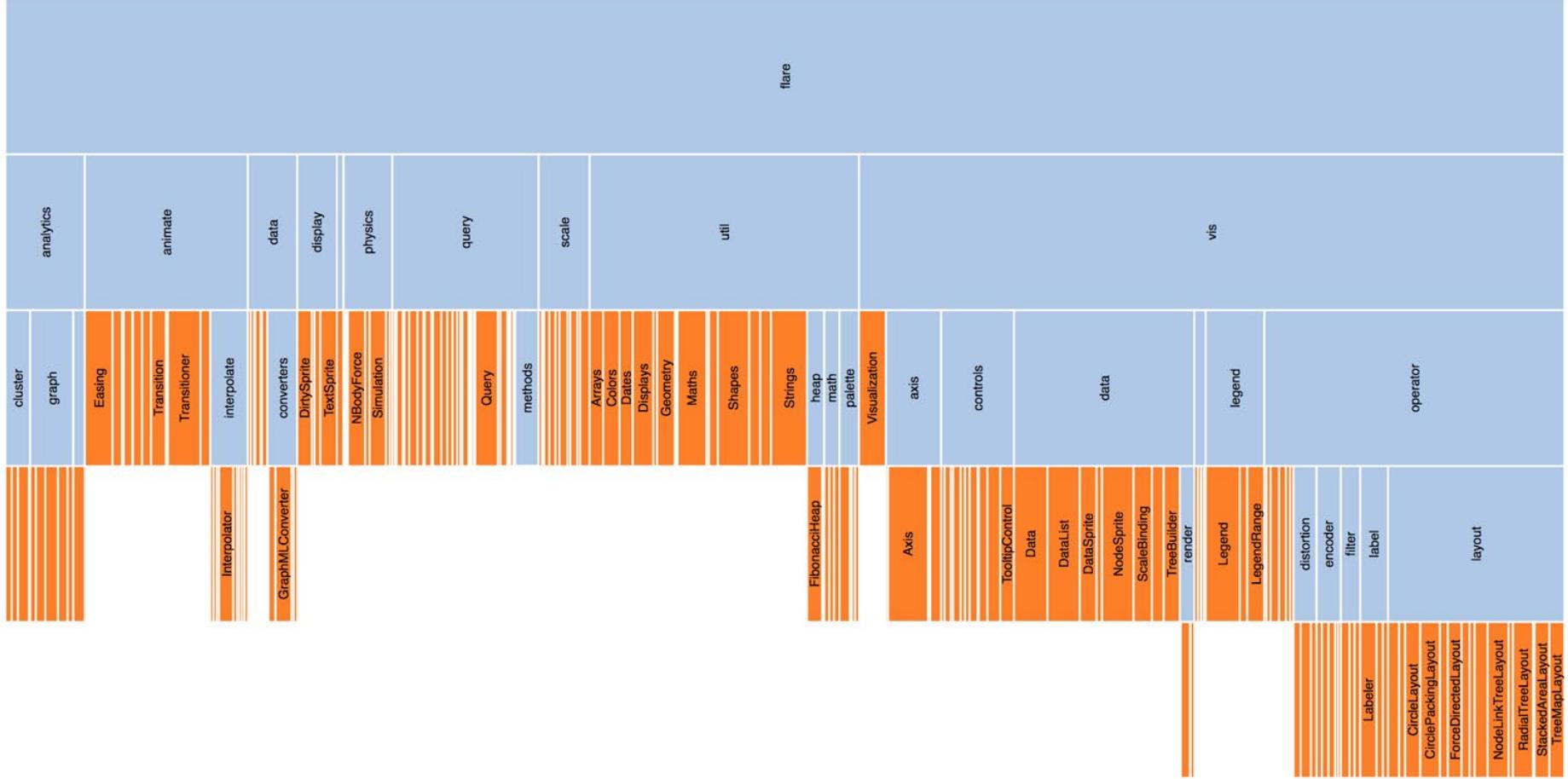
- Scalability.
  - Node visibility.
  - No Overlapping marks.
  - Supports size and color.

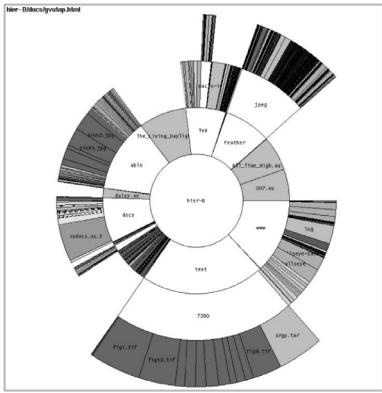
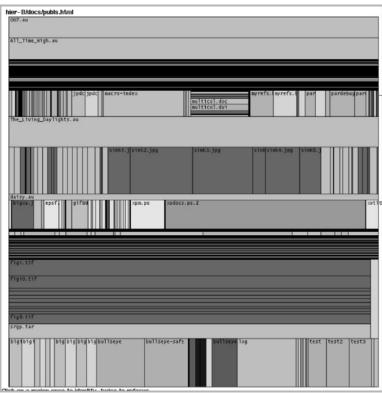
## Disadvantages:

- Size is not the most accurate channel.
- Structures is hard to discern.

# Sunburst and Icicle Plots







## An evaluation of space-filling information visualizations for depicting hierarchical structures

JOHN STASKO

*Graphics, Visualization and Usability Center, College of Computing,  
Georgia Institute of Technology, Atlanta, GA 30332-0280, USA.  
email: stasko@cc.gatech.edu*

RICHARD CATRAMBONE

*School of Psychology, Georgia Institute of Technology, Atlanta, GA 30332-0170, USA*

MARK GUZDIAL AND KEVIN McDONALD

*Graphics, Visualization and Usability Center, College of Computing,  
Georgia Institute of Technology, Atlanta, GA 30332-0280, USA*

(Received 31 January 2000, and accepted in revised form 31 May 2000)

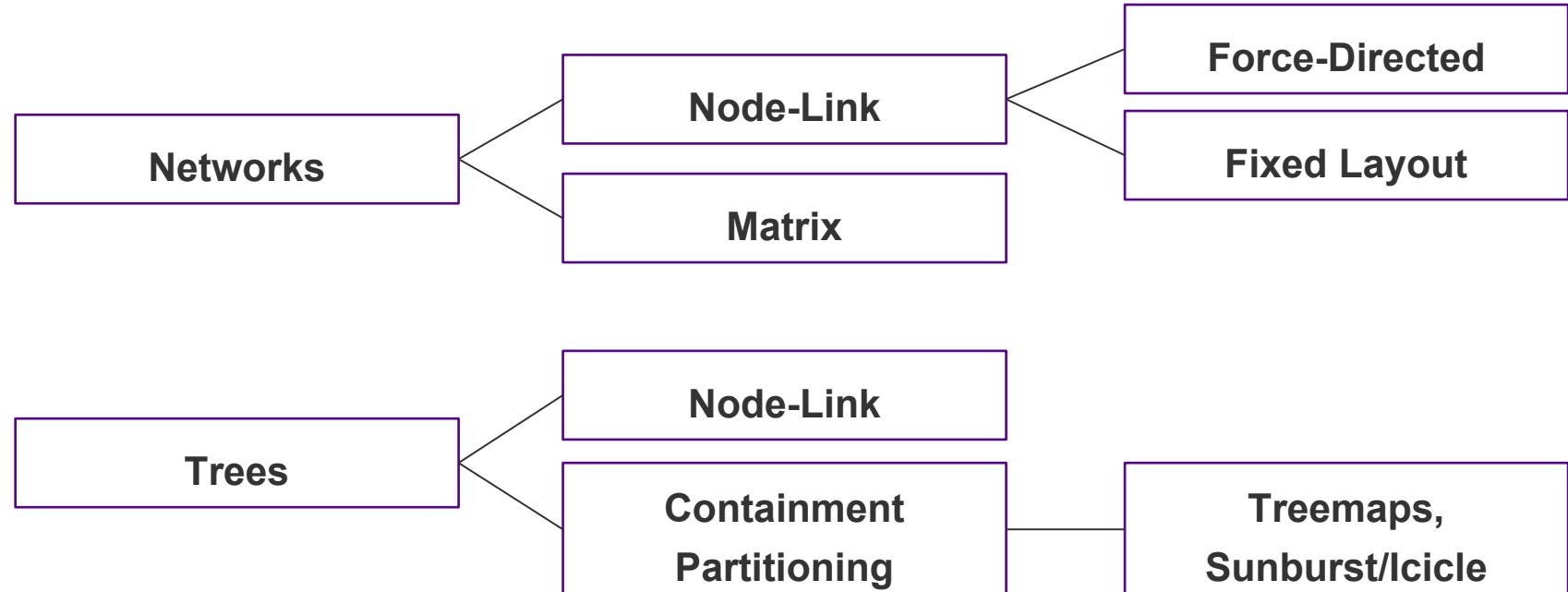
A variety of information visualization tools have been developed recently, but relatively little effort has been made to evaluate the effectiveness and utility of the tools. This article describes results from two empirical studies of two visualization tools for depicting hierarchies, in particular, computer file and directory structures. The two tools examined implement space-filling methodologies, one rectangular, the Treemap method, and one circular, the Sunburst method. Participants performed typical file/directory search and analysis tasks using the two tools. In general, performance trends favored the Sunburst tool with respect to correct task performance, particularly on initial use. Performance with Treemap tended to improve over time and use, suggesting a greater learning cost that was partially recouped over time. Each tool afforded somewhat different search strategies, which also appeared to influence performance. Finally, participants strongly preferred the Sunburst tool, citing better ability to convey structure and hierarchy.

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### 1. Introduction

In most areas of computer science, early research efforts focus on developing new, innovative techniques and algorithms. As the area matures, one can and should expect more critical, analytical studies to emerge. The area of information visualization is no different. Early research has largely focused on the development of innovative visualization techniques. Relatively little empirical study of the effectiveness of the visualizations has been conducted, however. In the opening plenary at the 1998 Information Visualization Symposium, George Robertson stressed the importance of empirical evaluation in this area. Careful empirical study of a visualization tool can help us to better understand its relative strengths and weaknesses, the tasks for which it is most appropriate, and can suggest improvements.

# Summary



# Summary

- Properties/Trade-offs
  - Clutter.
  - Scalability.
  - Structure.
  - Reordering/Aggregation.
  - Familiarity.
  - Intuitiveness.