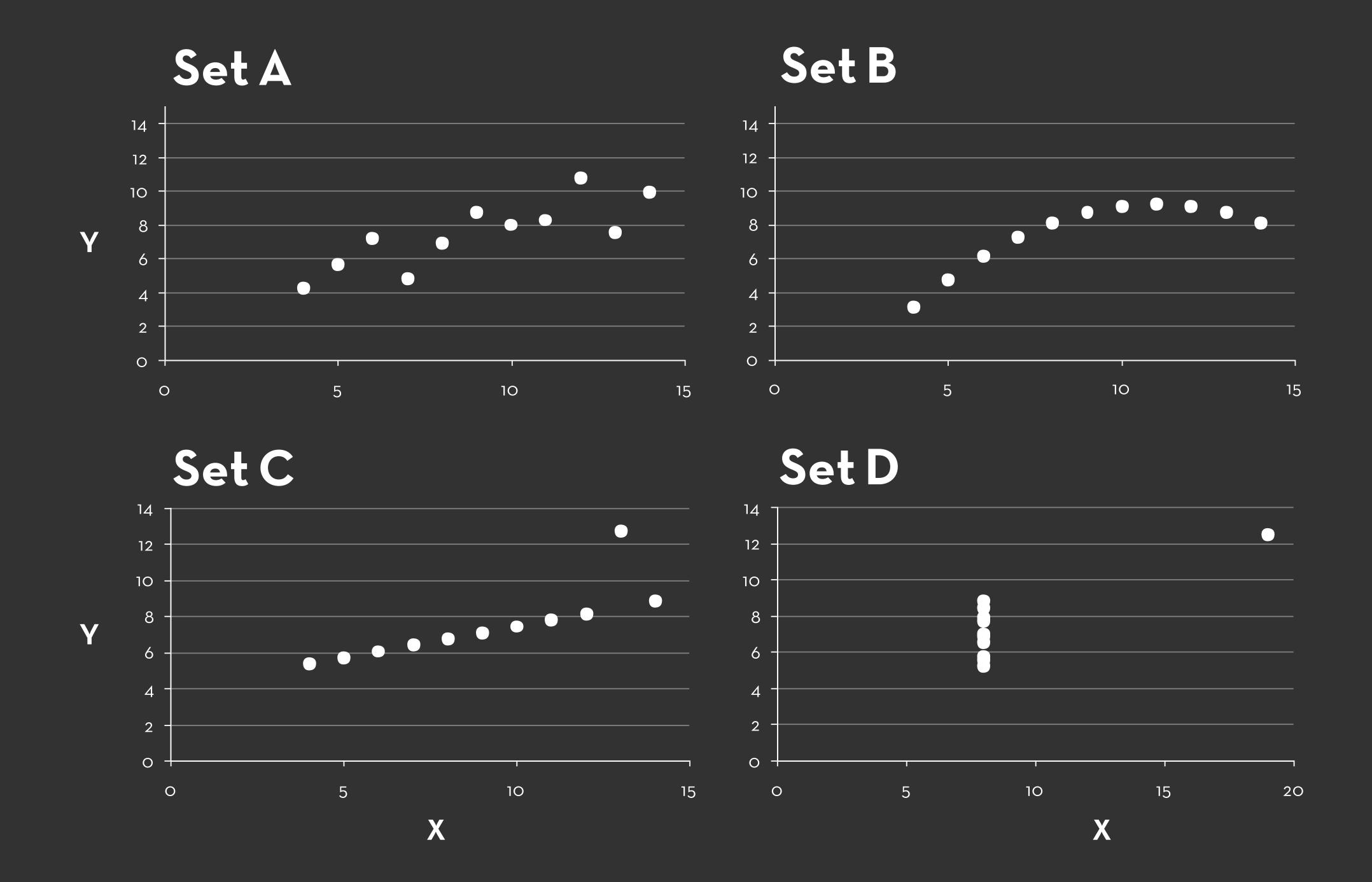
Visualization

MICHAEL BERNSTEIN
THANKS TO DIANA MACLEAN AND JEFF HEER
CS 376

Anscombe's Quartet

	E D	Set	t C	Se	B	Se	: A	Set
Summary Statistics	Υ	X	Υ	X	Υ	X	Υ	X
$u_X = 9.0 \sigma_X = 3.317$	6.58	8	7.46	10	9.14	10	8.04	10
$u_Y = 7.5 \sigma_Y = 2.03$	5.76	8	6.77	8	8.14	8	6.95	8
	7.71	8	12.74	13	8.74	13	7.58	13
Linear Regression	8.84	8	7.11	9	8.77	9	8.81	9
Y = 3 + 0.5 X	8.47	8	7.81	11	9.26	11	8.33	11
$R^2 = 0.67$	7.04	8	8.84	14	8.1	14	9.96	14
	5.25	8	6.08	6	6.13	6	7.24	6
	12.5	19	5.39	4	3.1	4	4.26	4
	5.56	8	8.15	12	9.11	12	10.84	12
	7.91	8	6.42	7	7.26	7	4.82	7
[Anscombe 73] 2	6.89	8	5.73	5	4.74	5	5.68	5

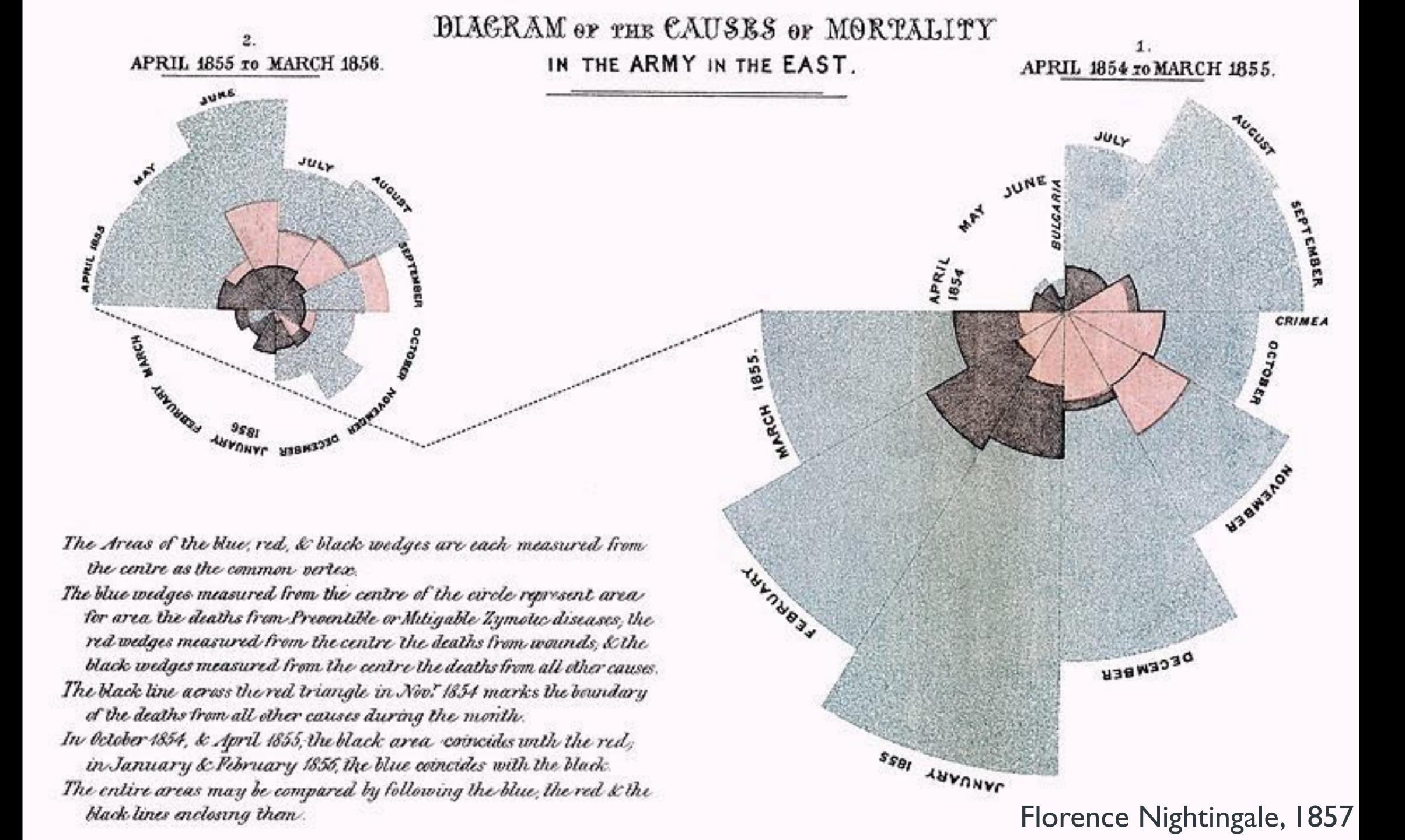


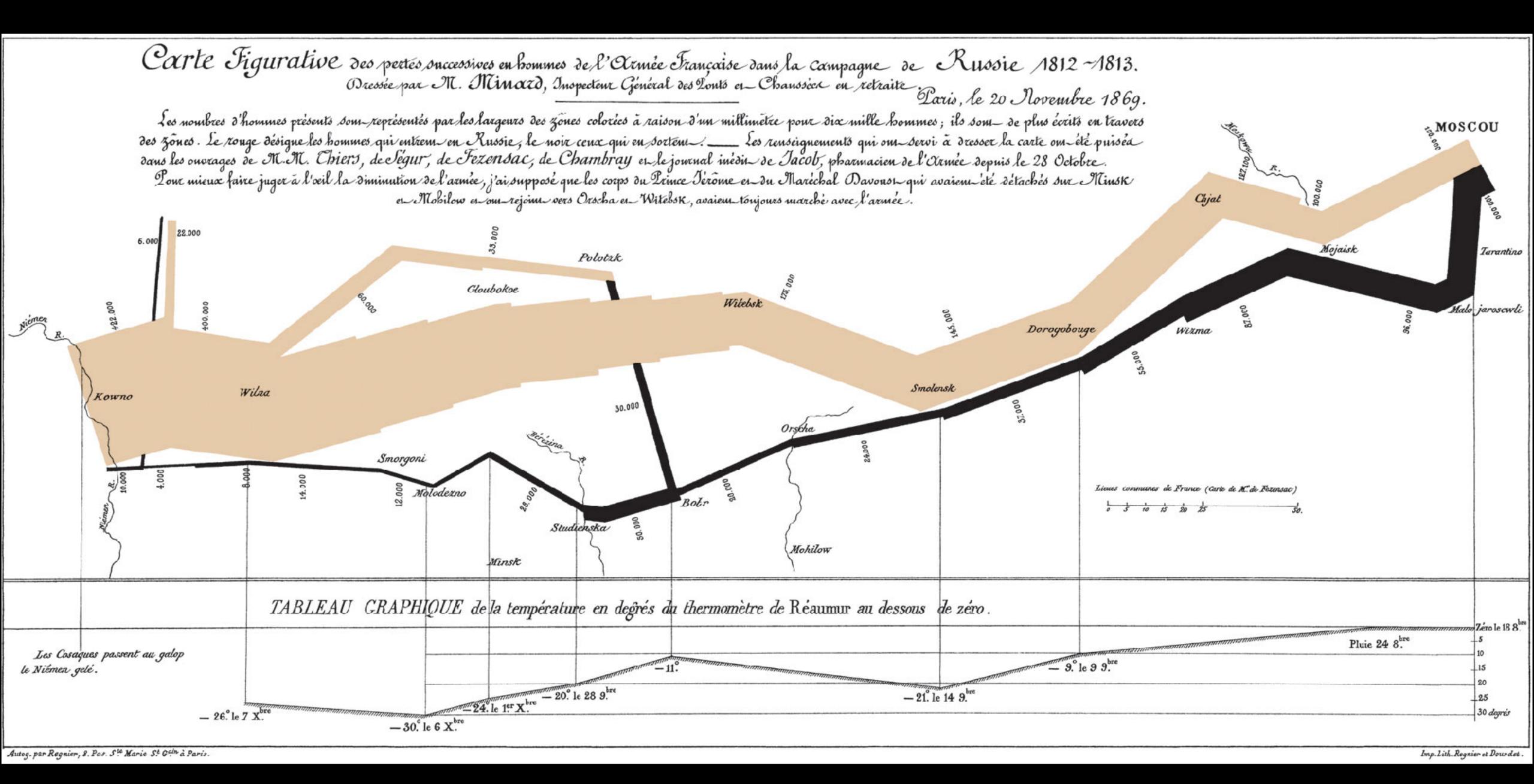
What is visualization?

"Transformation of the symbolic into the geometric"
 [McCormick et al., 1987]

"...finding the artificial memory that best supports our natural means of perception."
[Bertin 1967]

"The use of computer-generated, interactive, visual representations of data to amplify cognition." [Card, Mackinlay, and Shneiderman 1999]

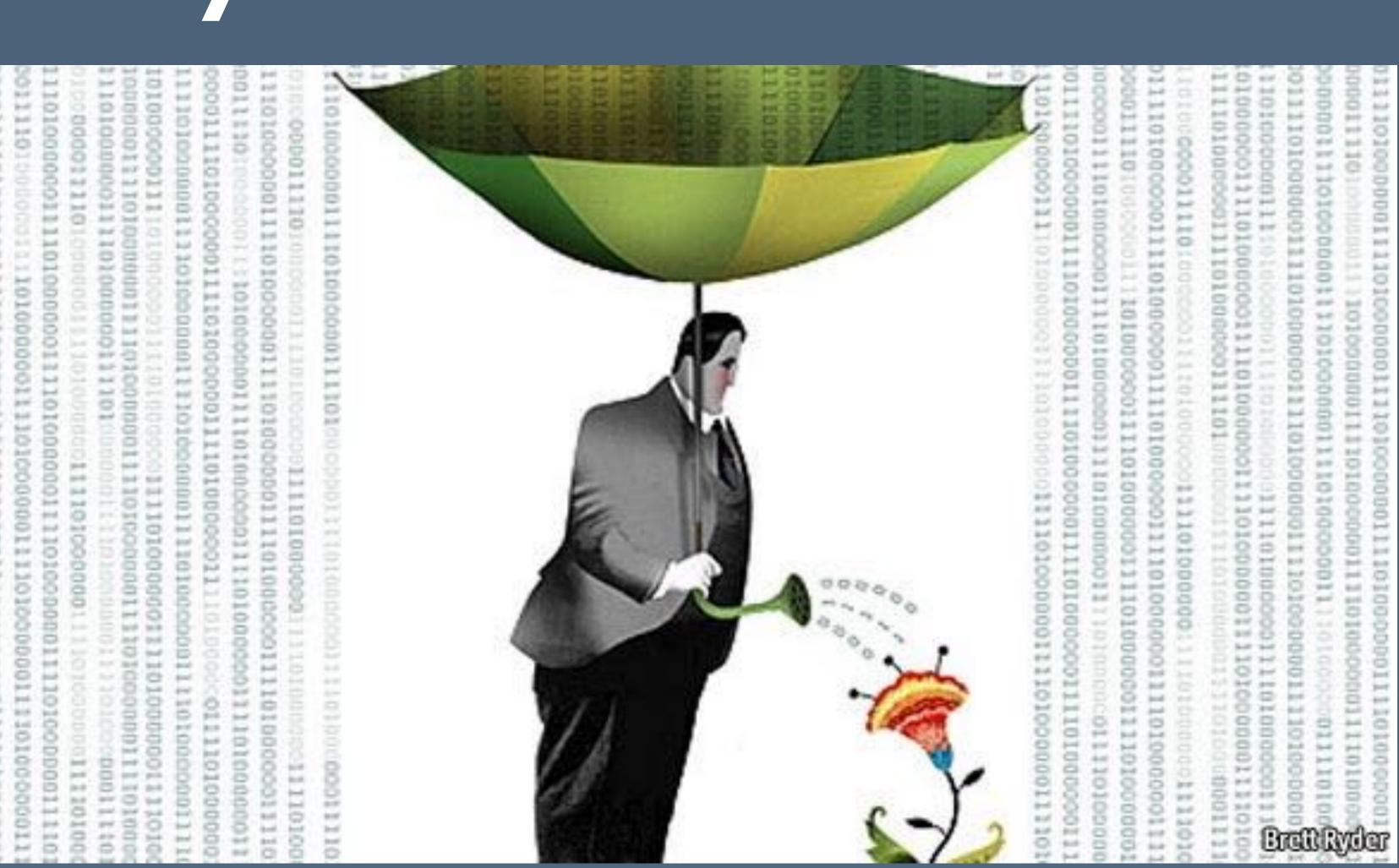




Why visualize data?

- · Story or explanation
- · Get answers (or questions!)
- Find patterns
- Find mistakes
- Support reasoning
- Convince others
- Share

Why visualize data?



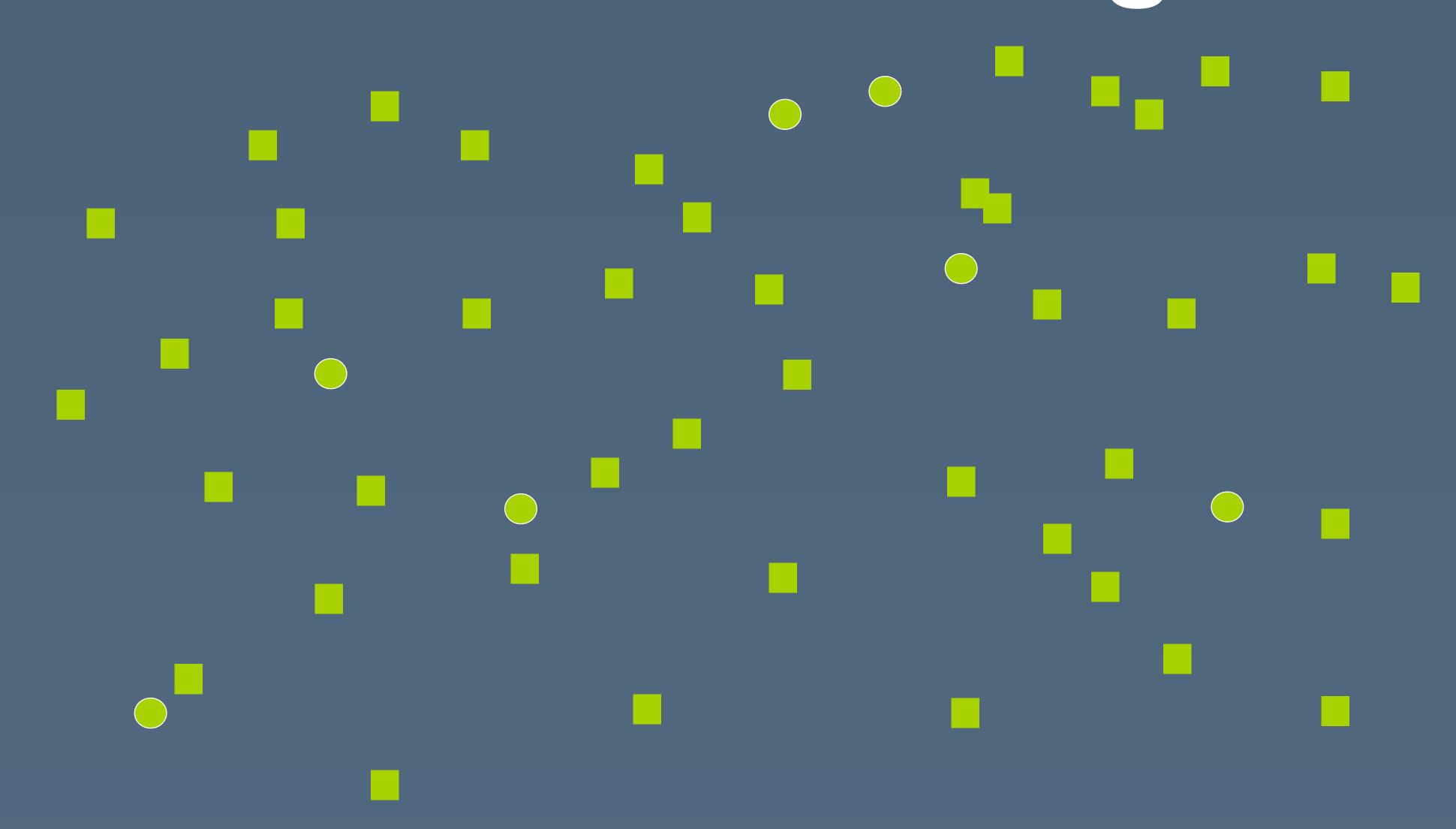
Goals of visualization research

- Understand how visualizations convey information
 What do people perceive and comprehend?
 How do visualizations correspond with mental models?
- Develop principles and techniques for creating effective visualizations and supporting analysis
 - Amplify perception and cognition
 - Strengthen the tie between visualization and mental models

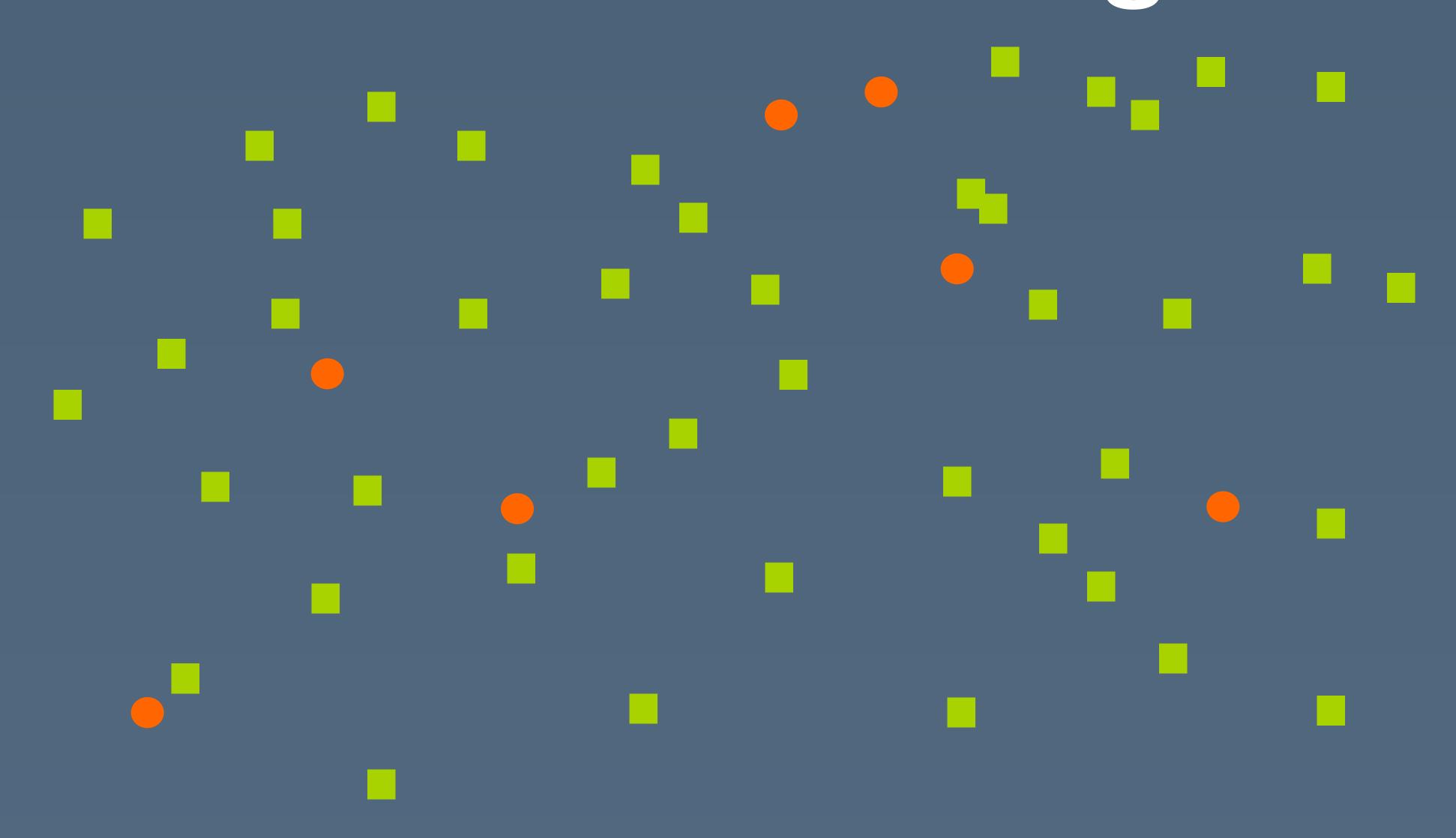
Graphical Perception

"The visual decoding of information encoded on graphs" [Cleveland & McGill, '84]

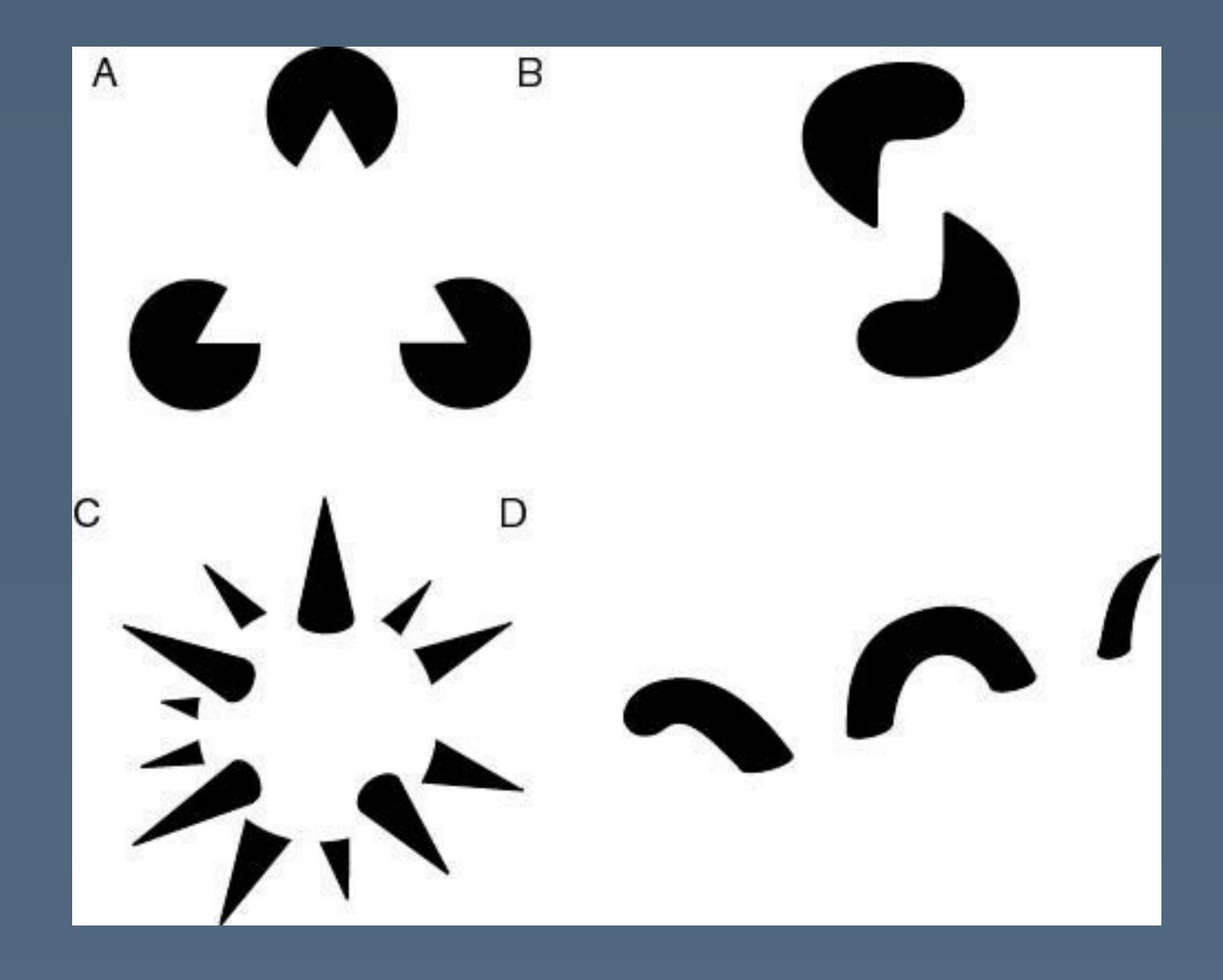
Pre-attentive Processing



Pre-attentive Processing

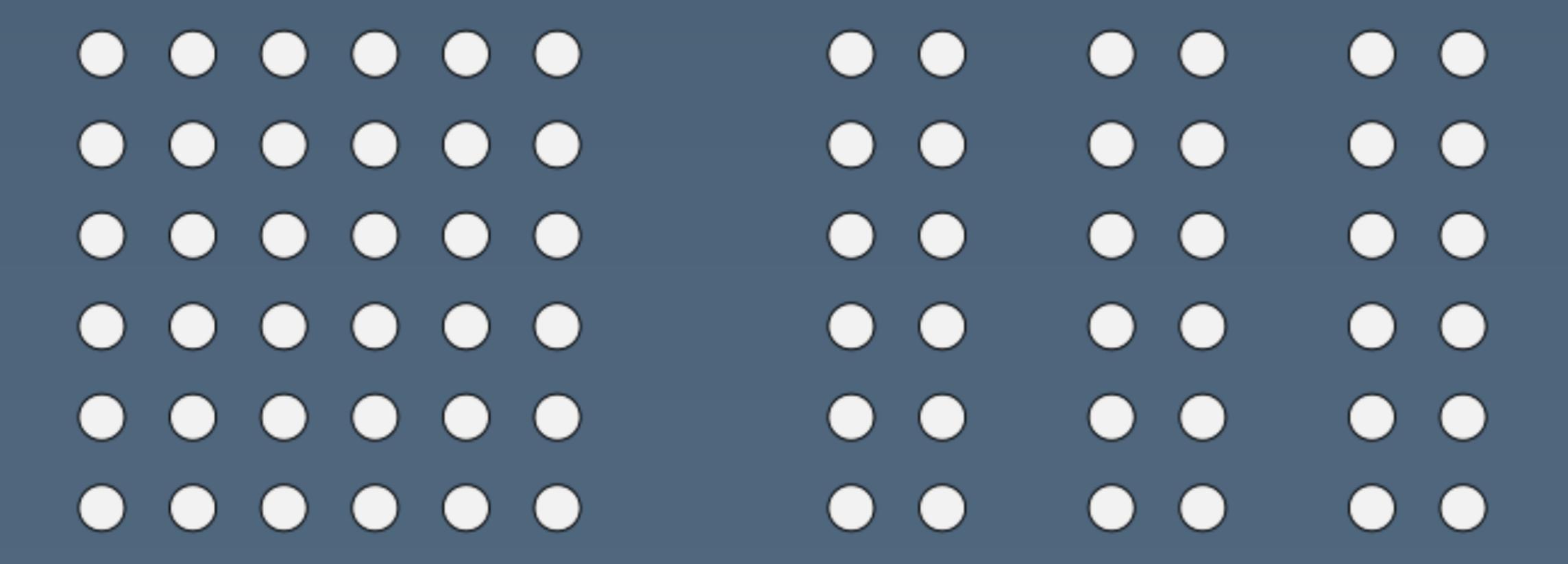


Reification



http://en.wikipedia.org/wiki/File:Reification.jpg

Gestalt law of Proximity



Gestalt law of Similarity

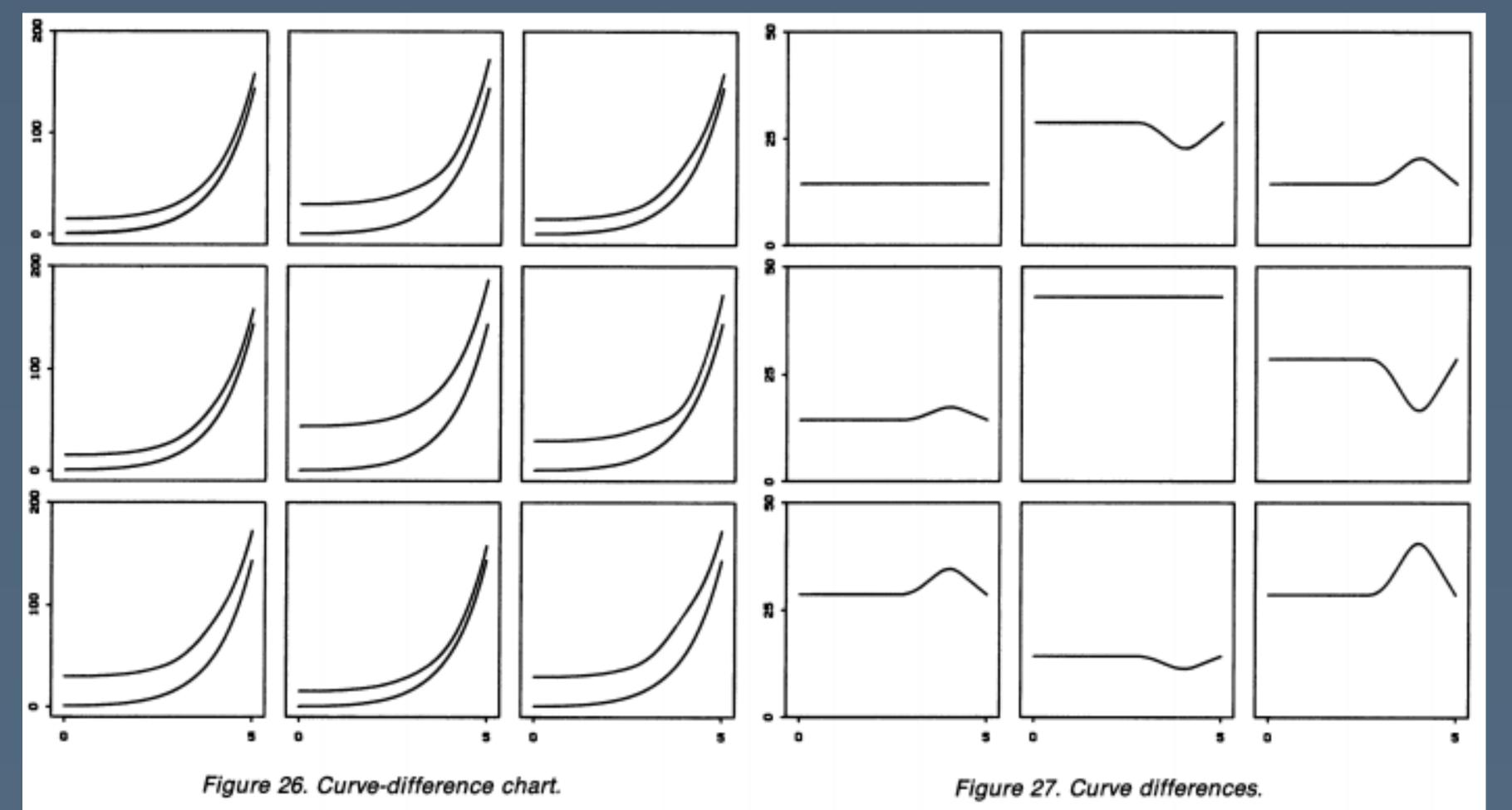






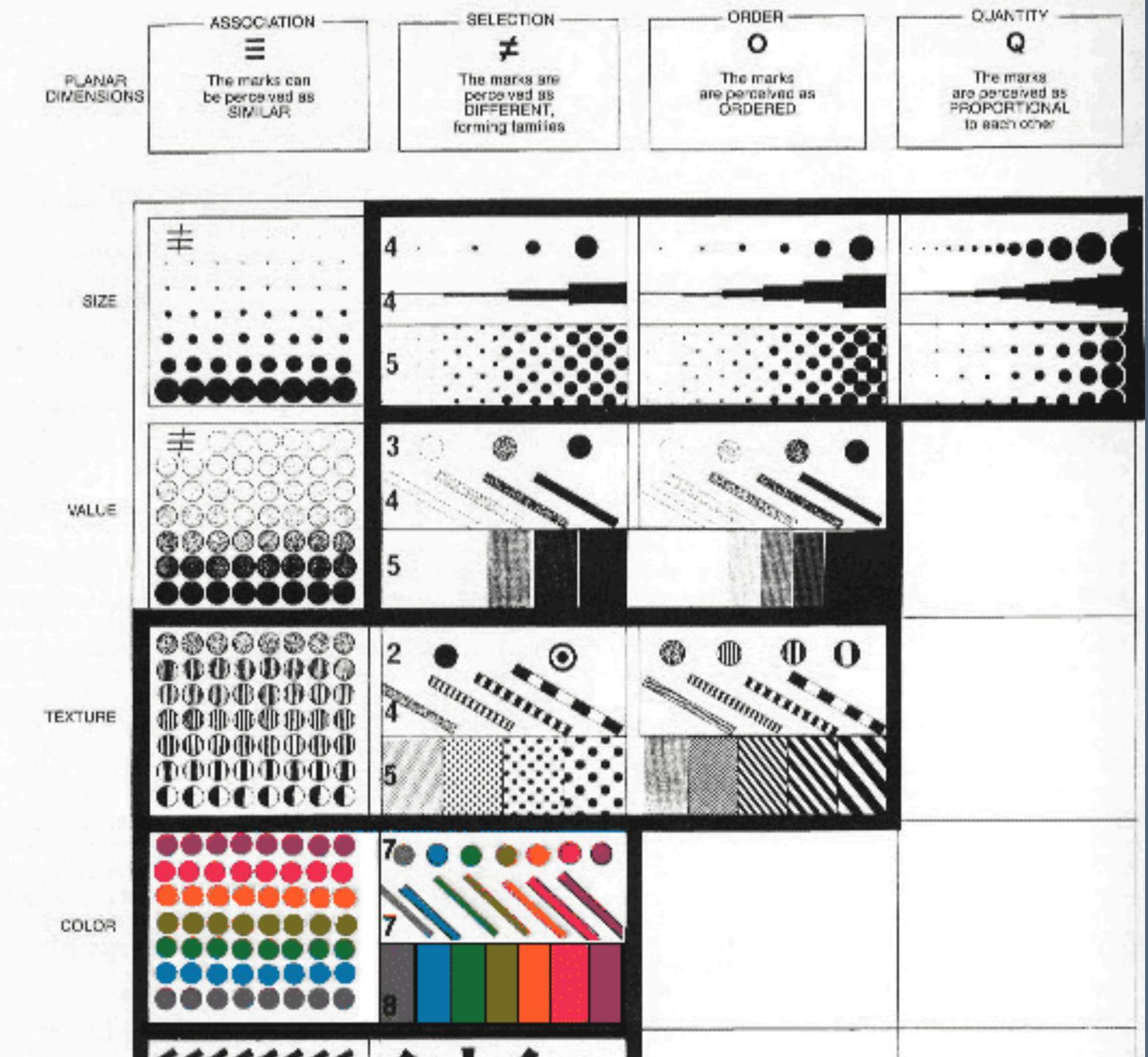


People are poor at perceiving differences



Cleveland & McGill, 1984

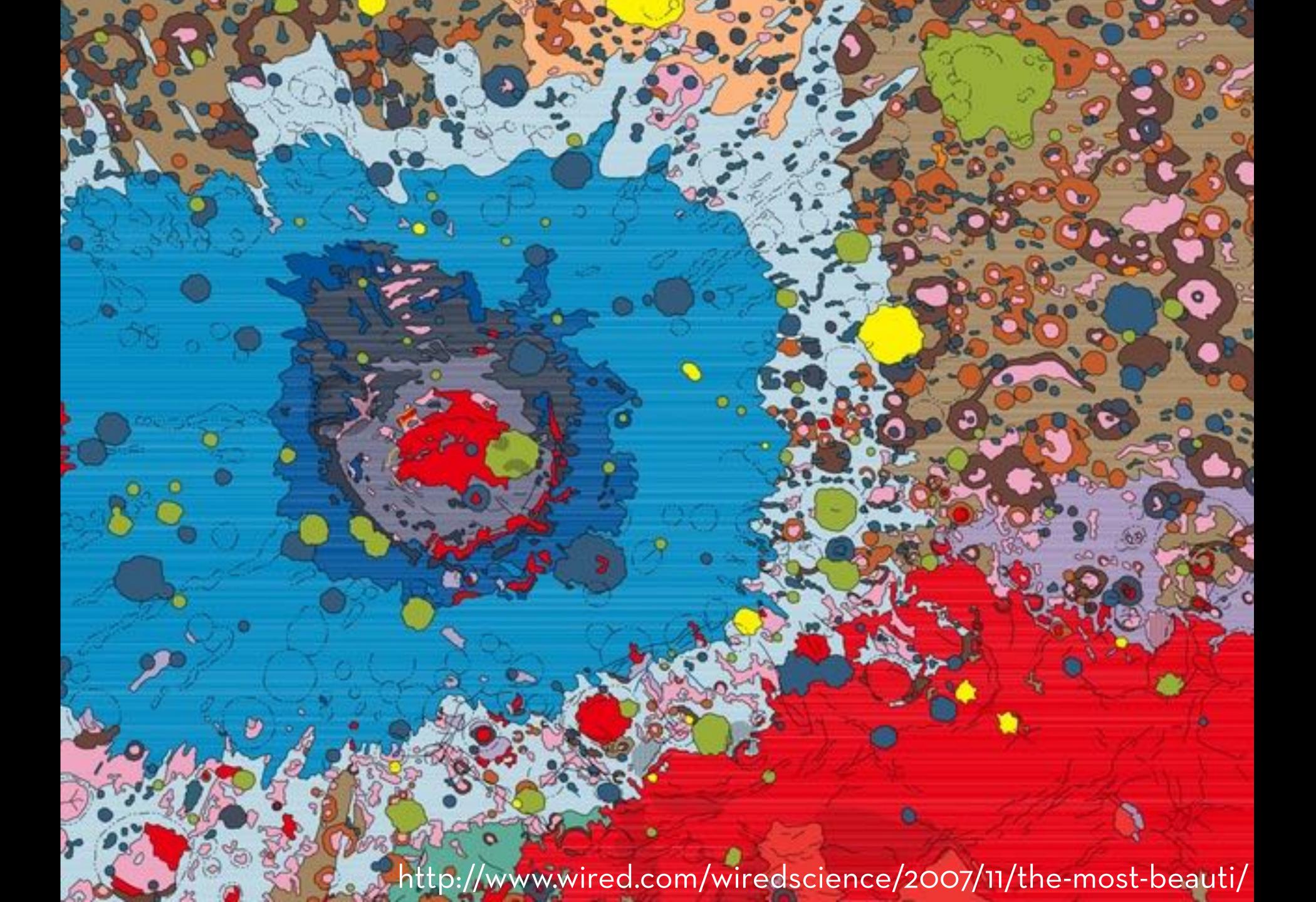
Semiologie Graphique

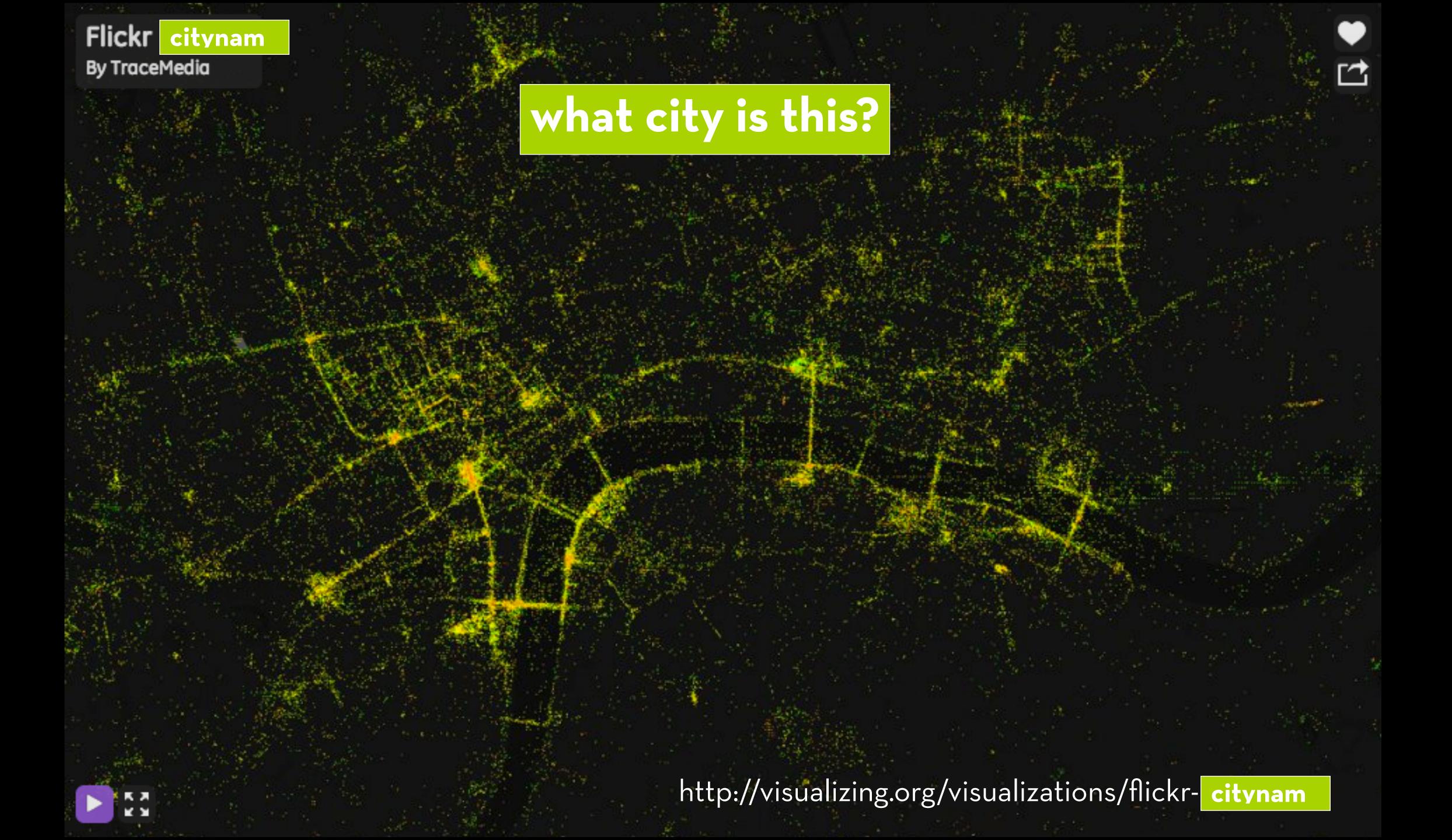


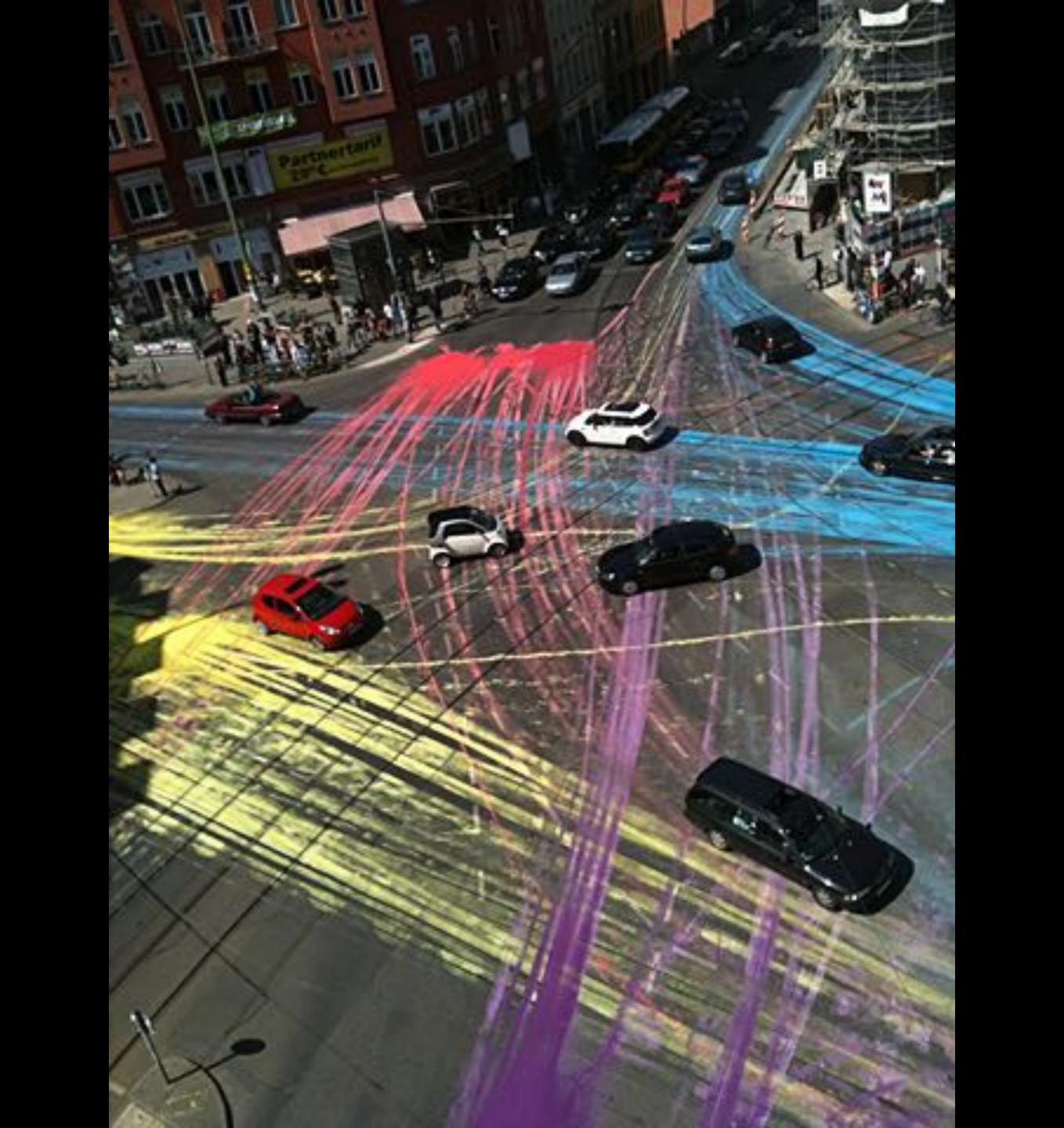
Jaques Bertin, 1976

The Process of Visualization

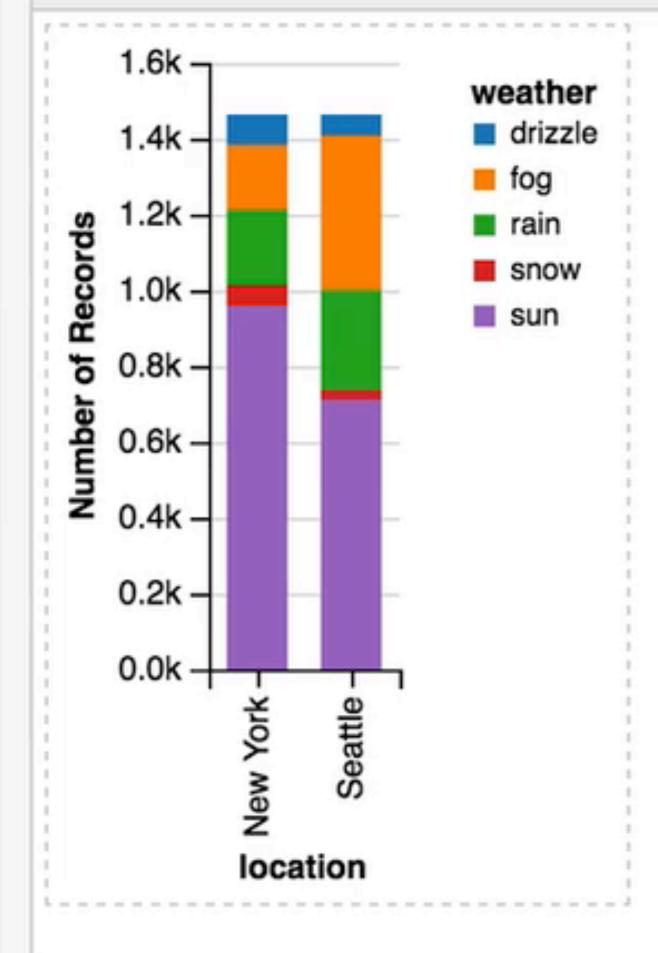
Recording & Storing







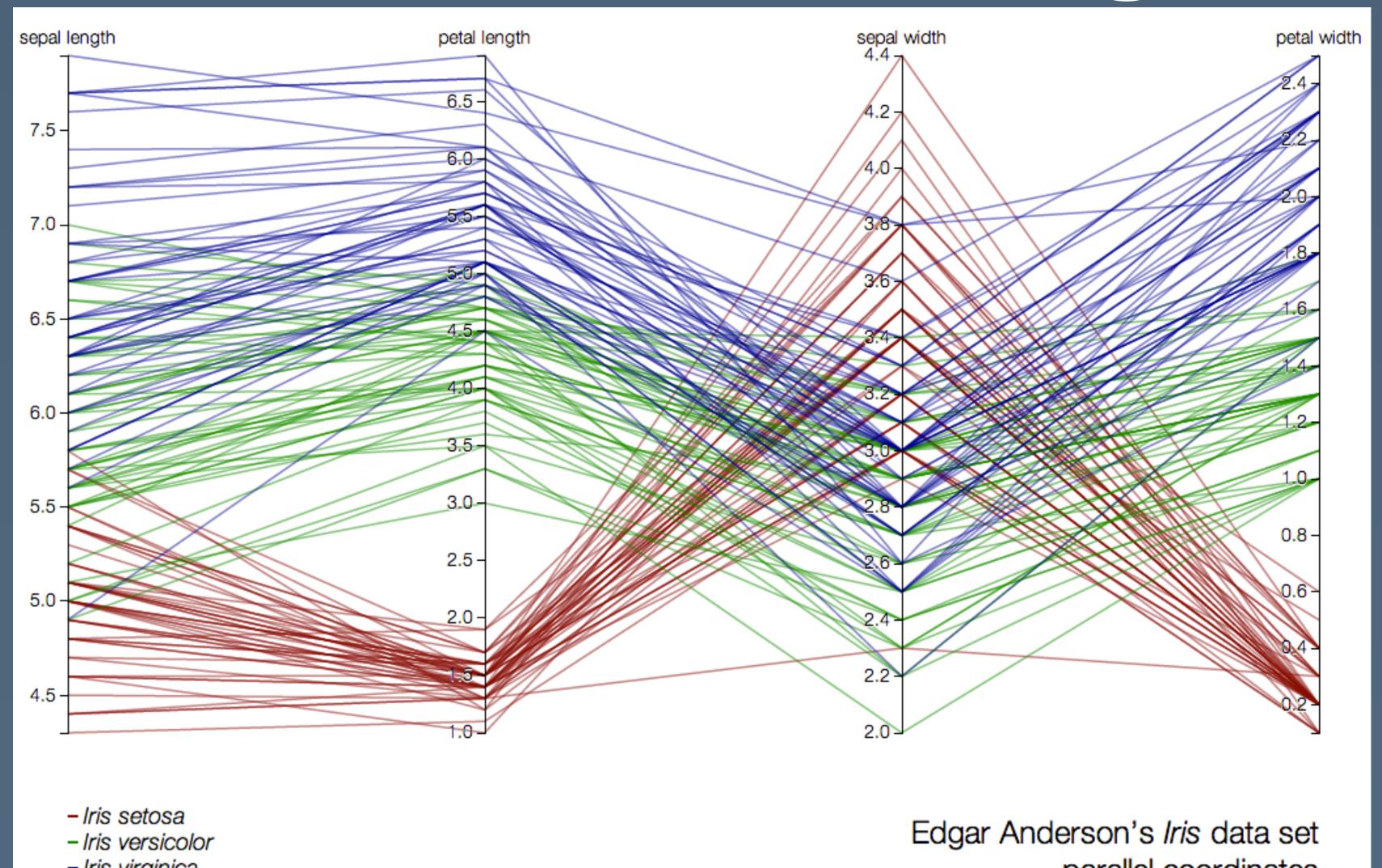
Authoring



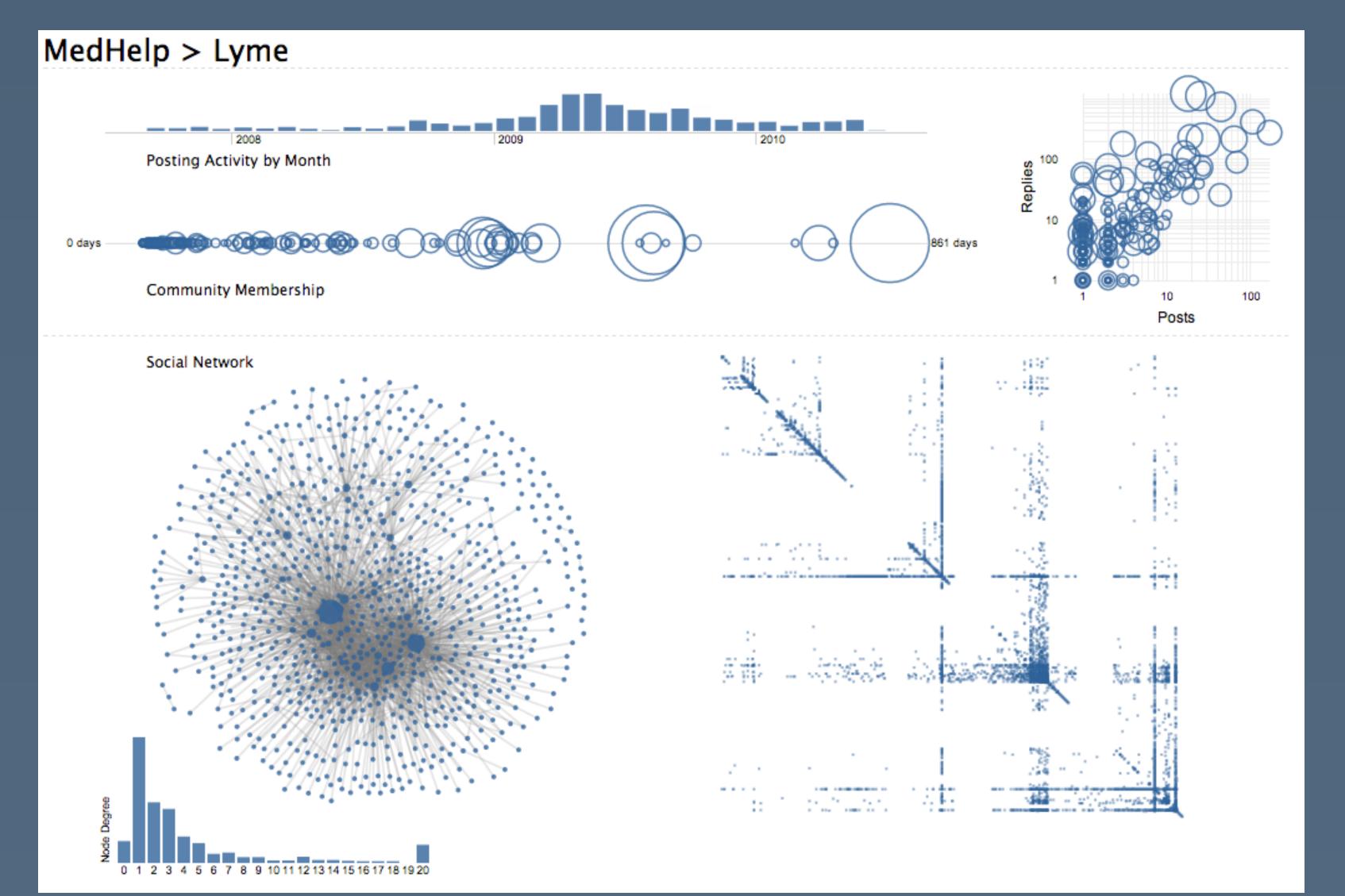
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Analyzing

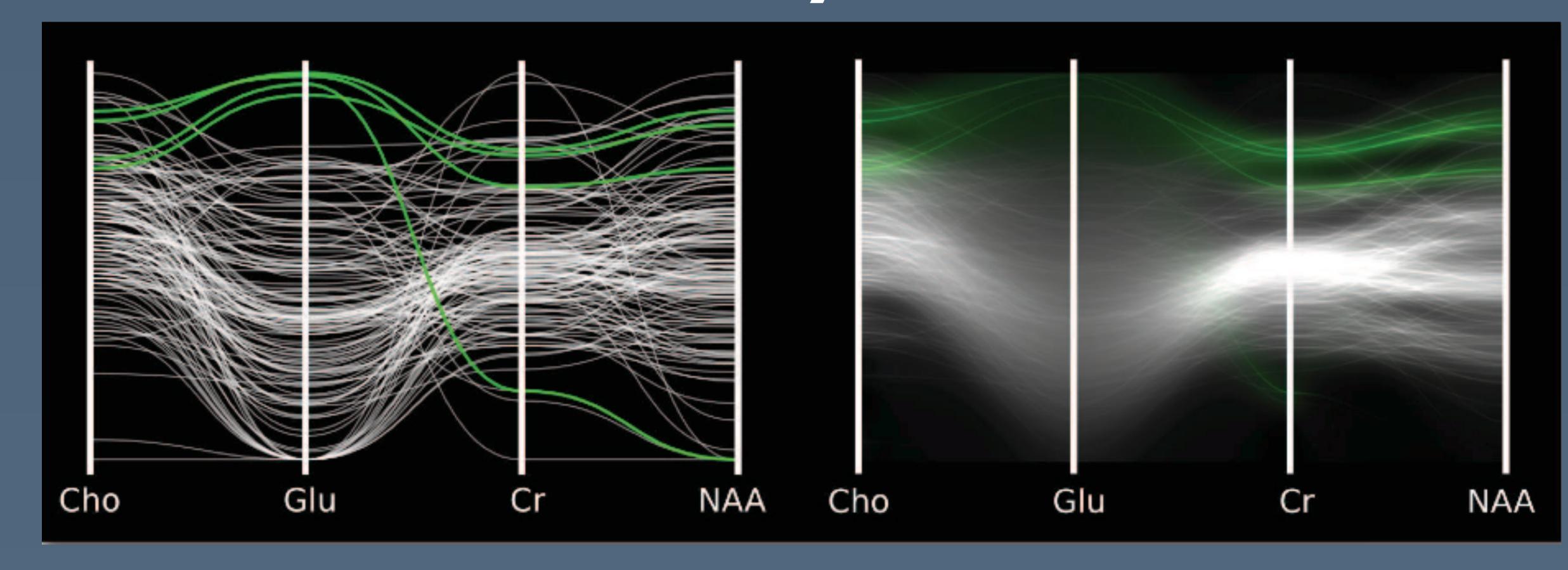
Interaction: Filtering



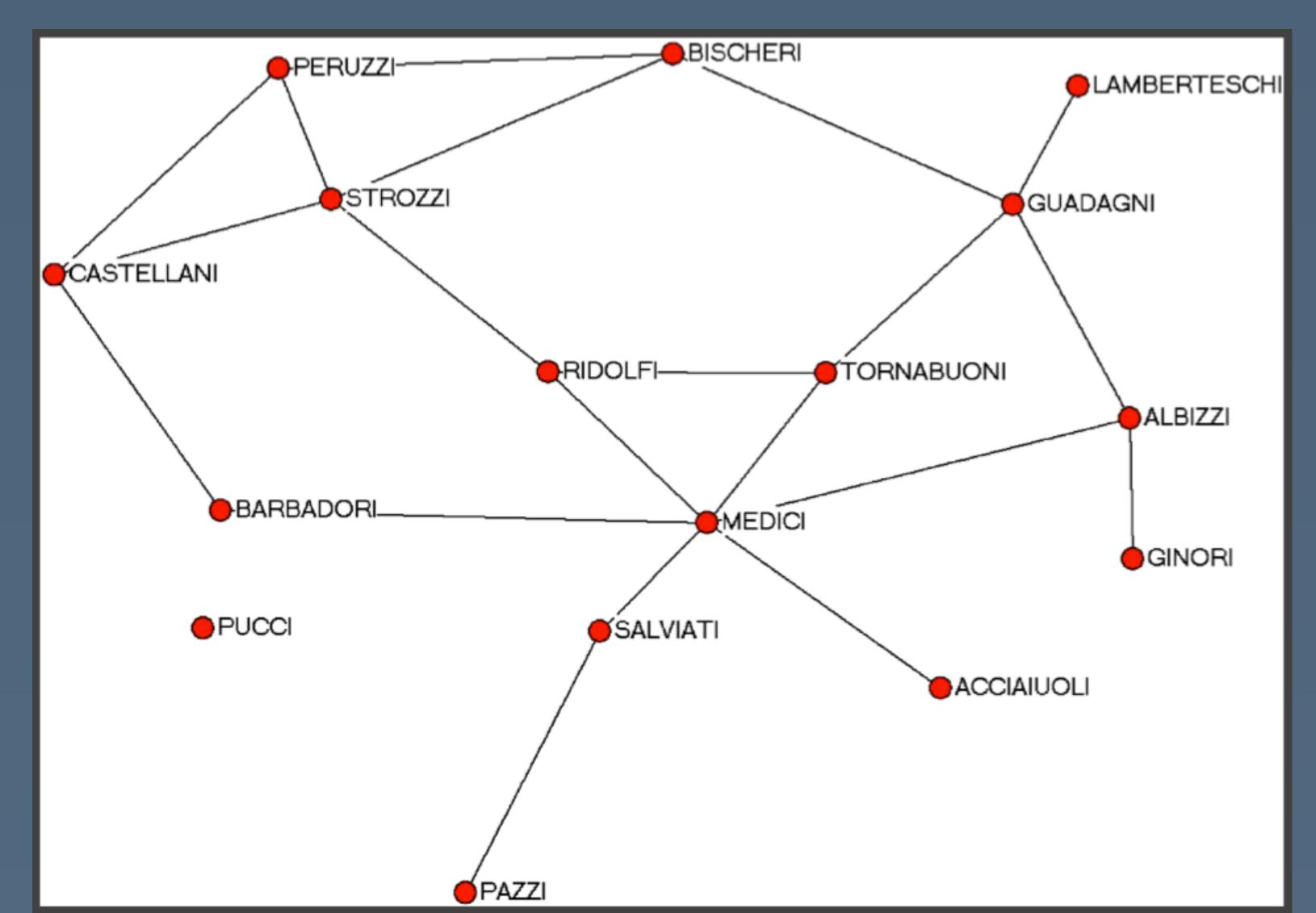
Interaction: Brushing and Linking

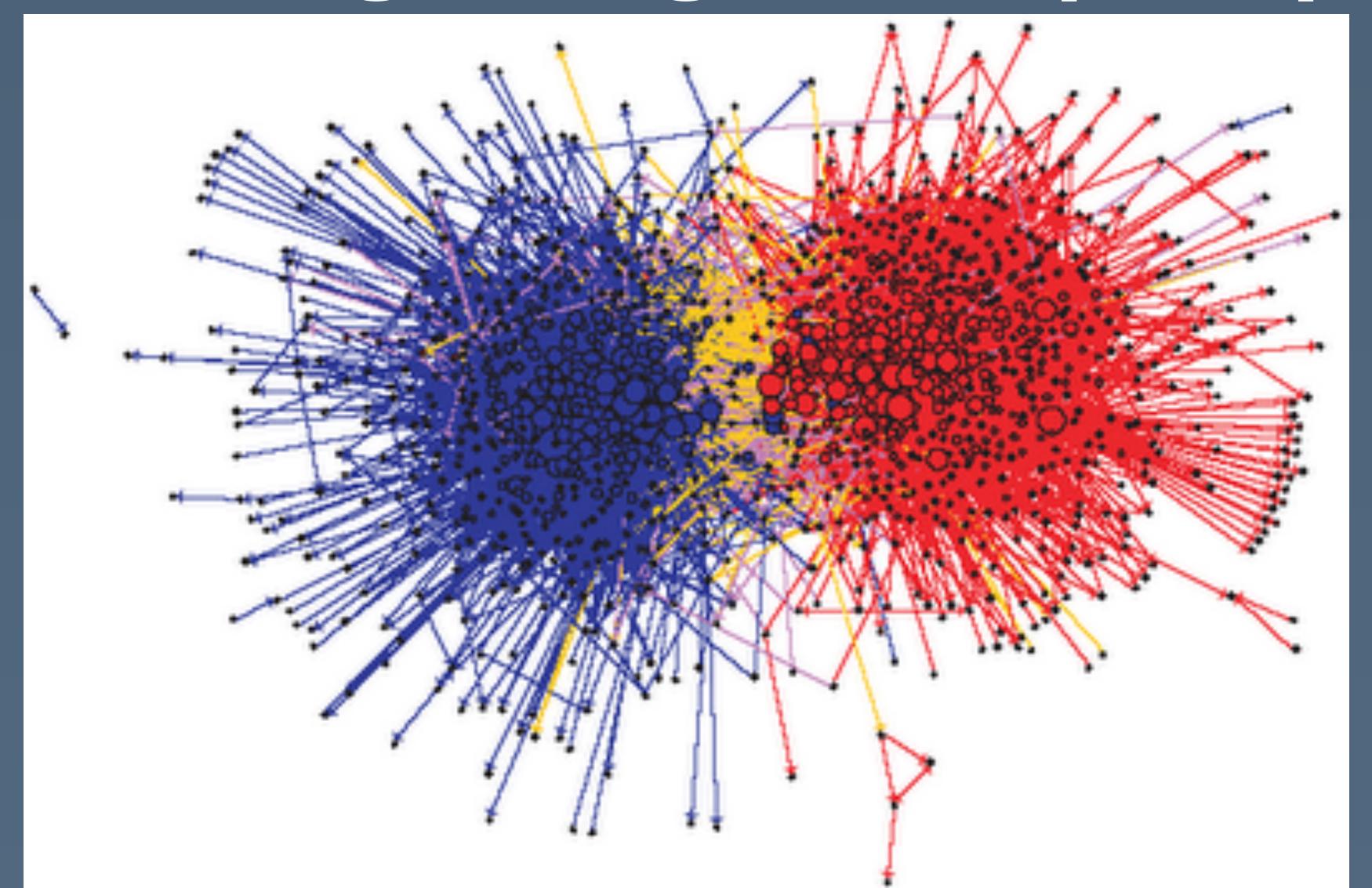


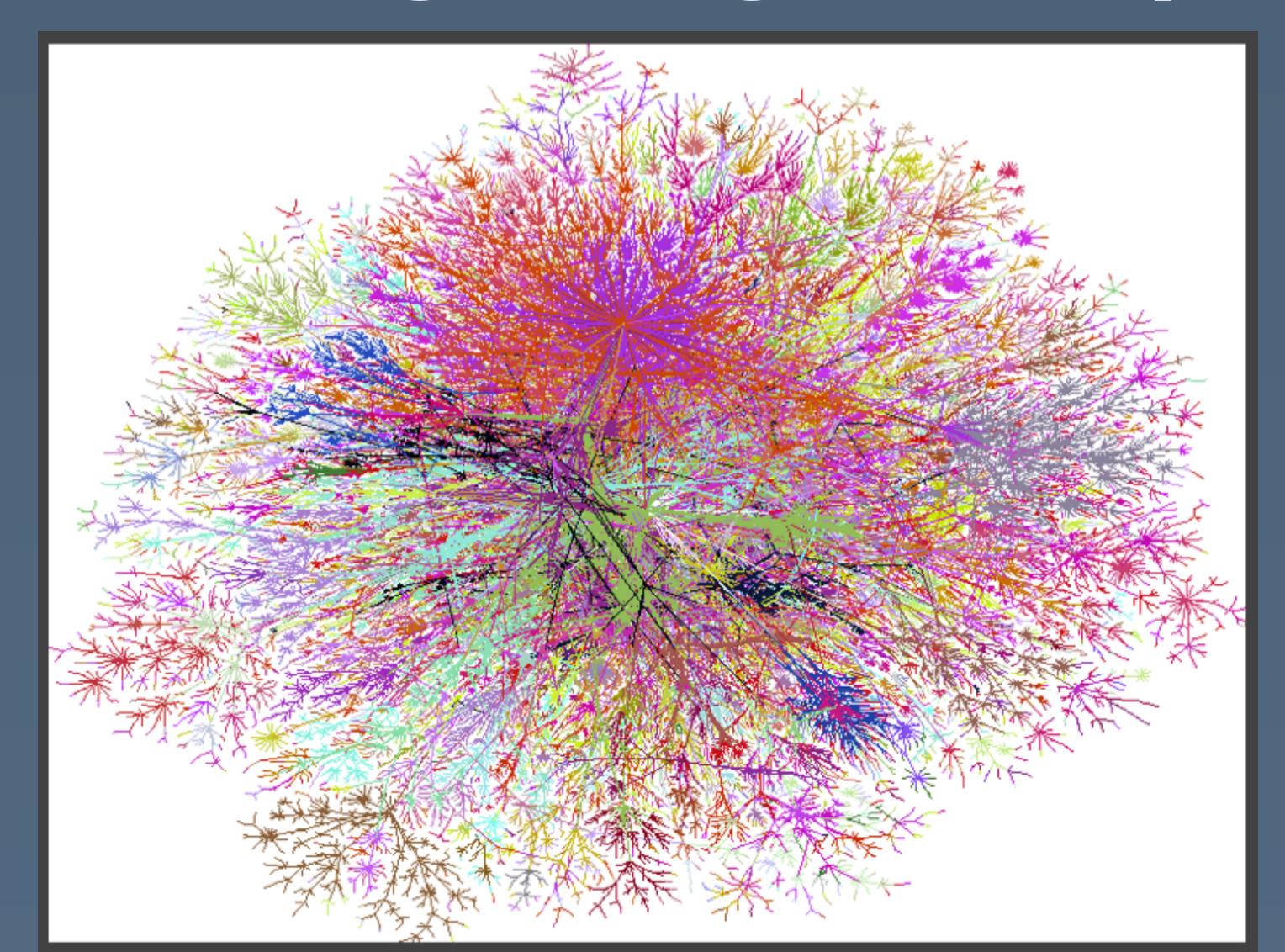
Visual Uncertainty



Network Visualization



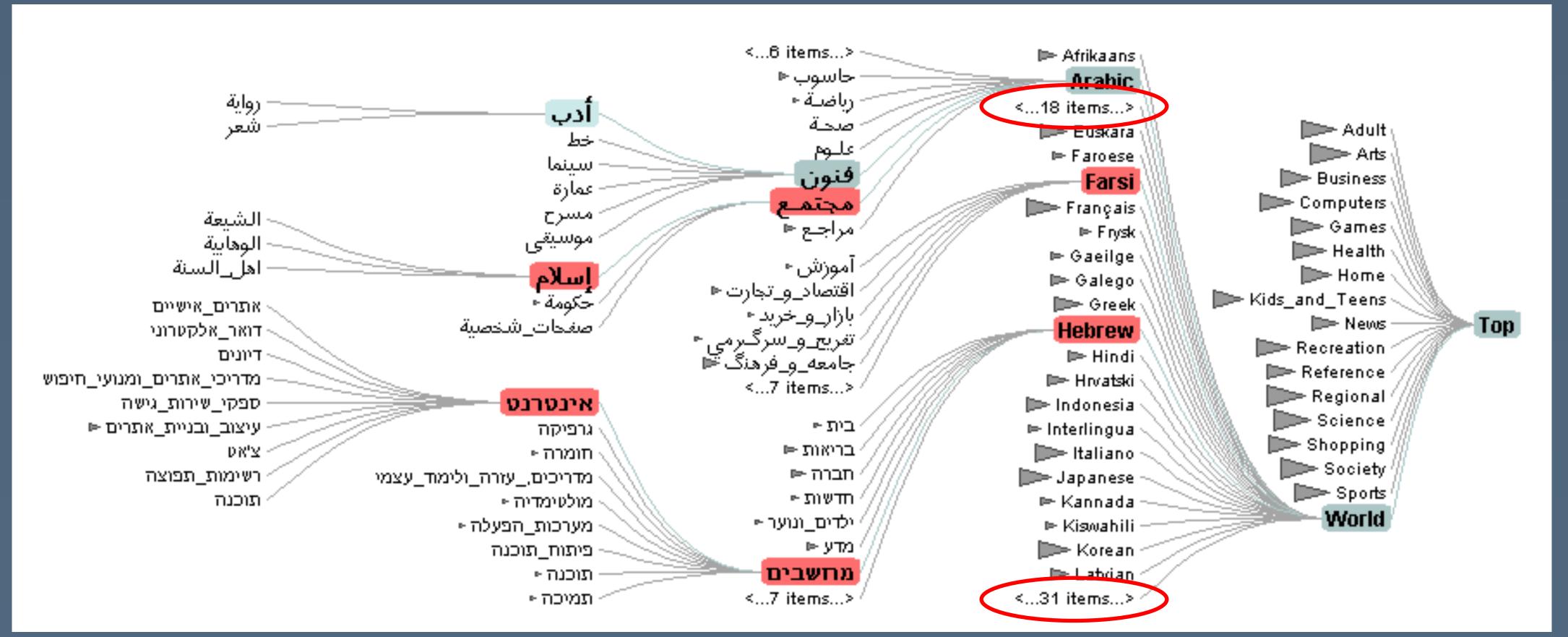




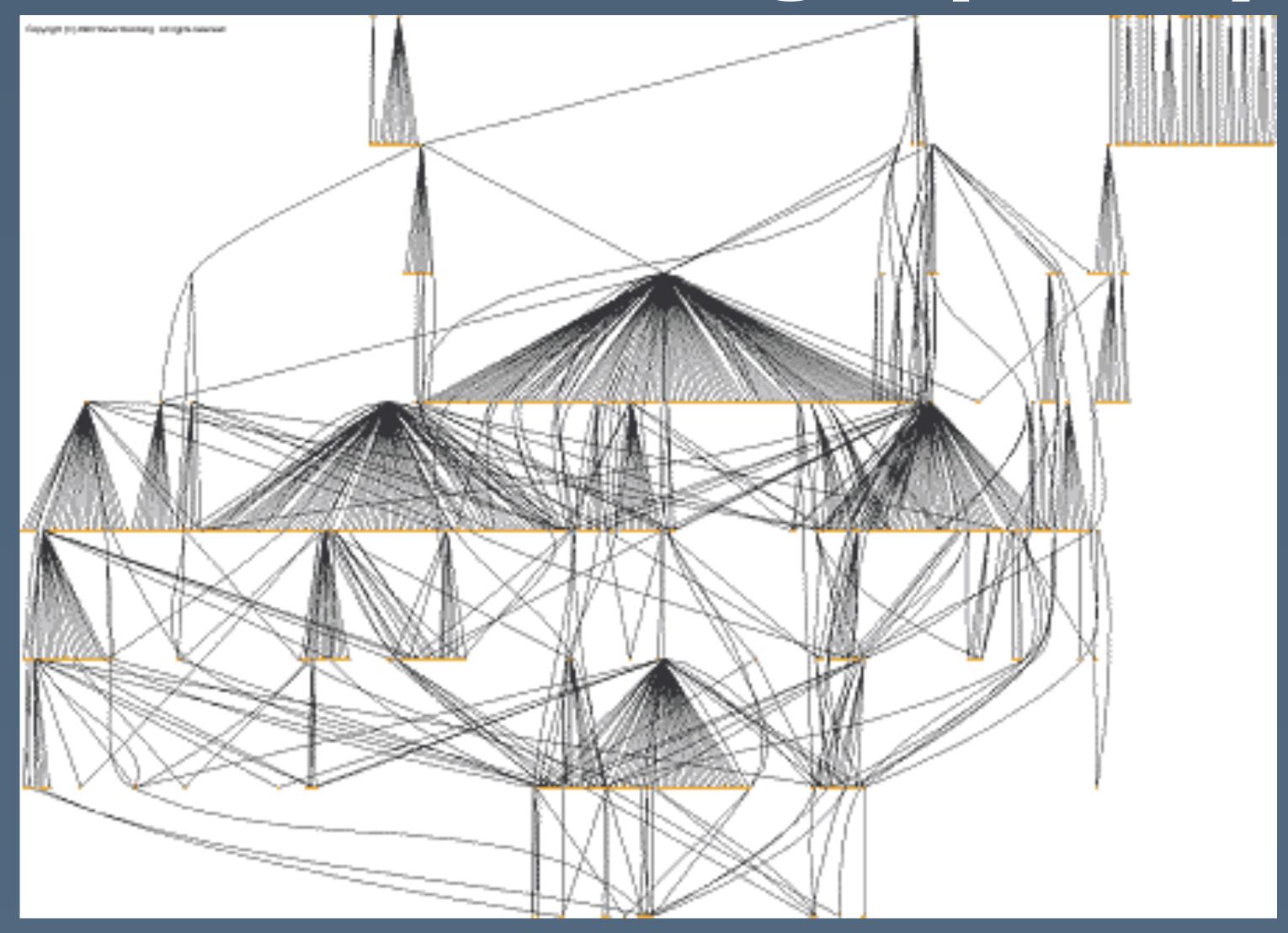


Degree-of-interest trees

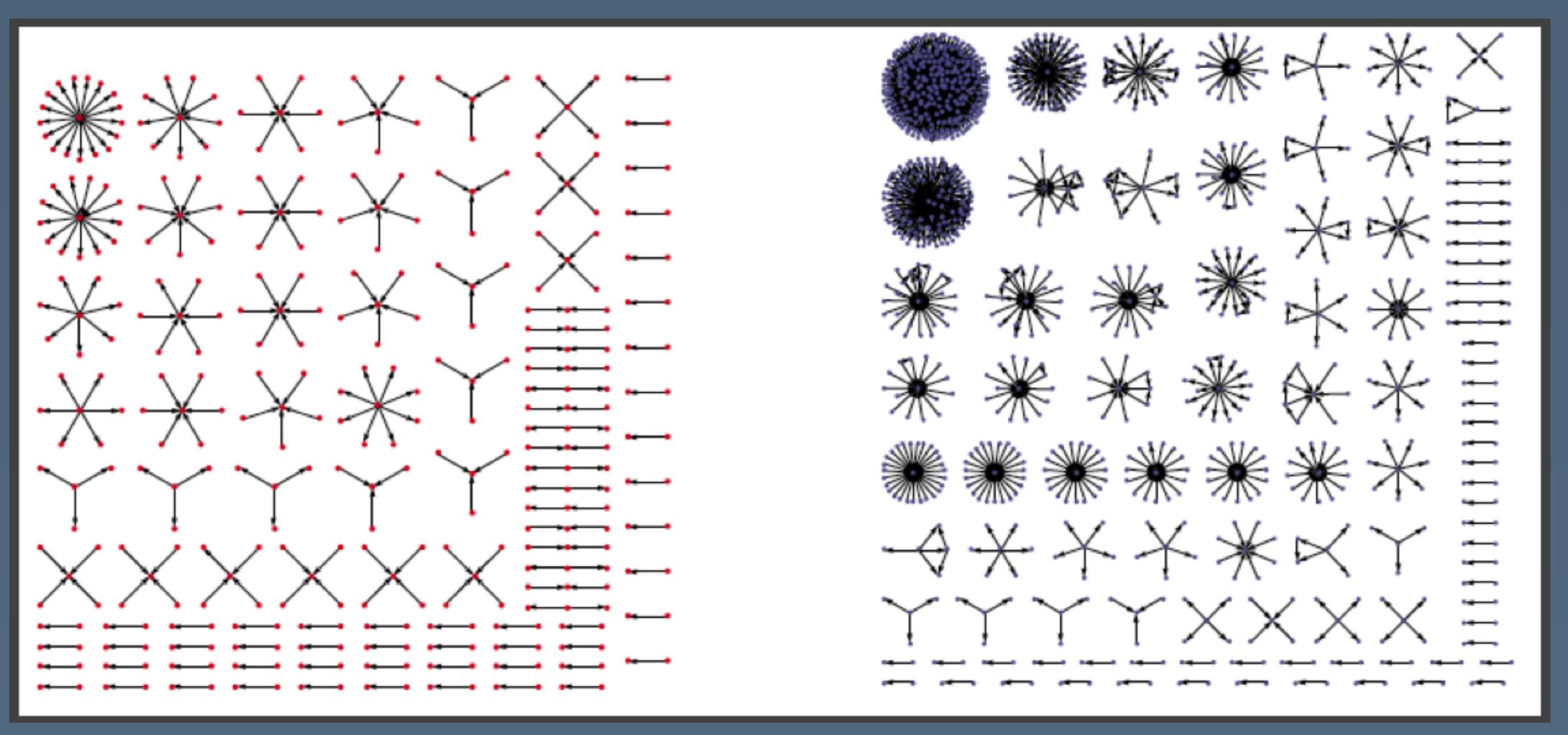
Space-constrained, multi-focal tree layout



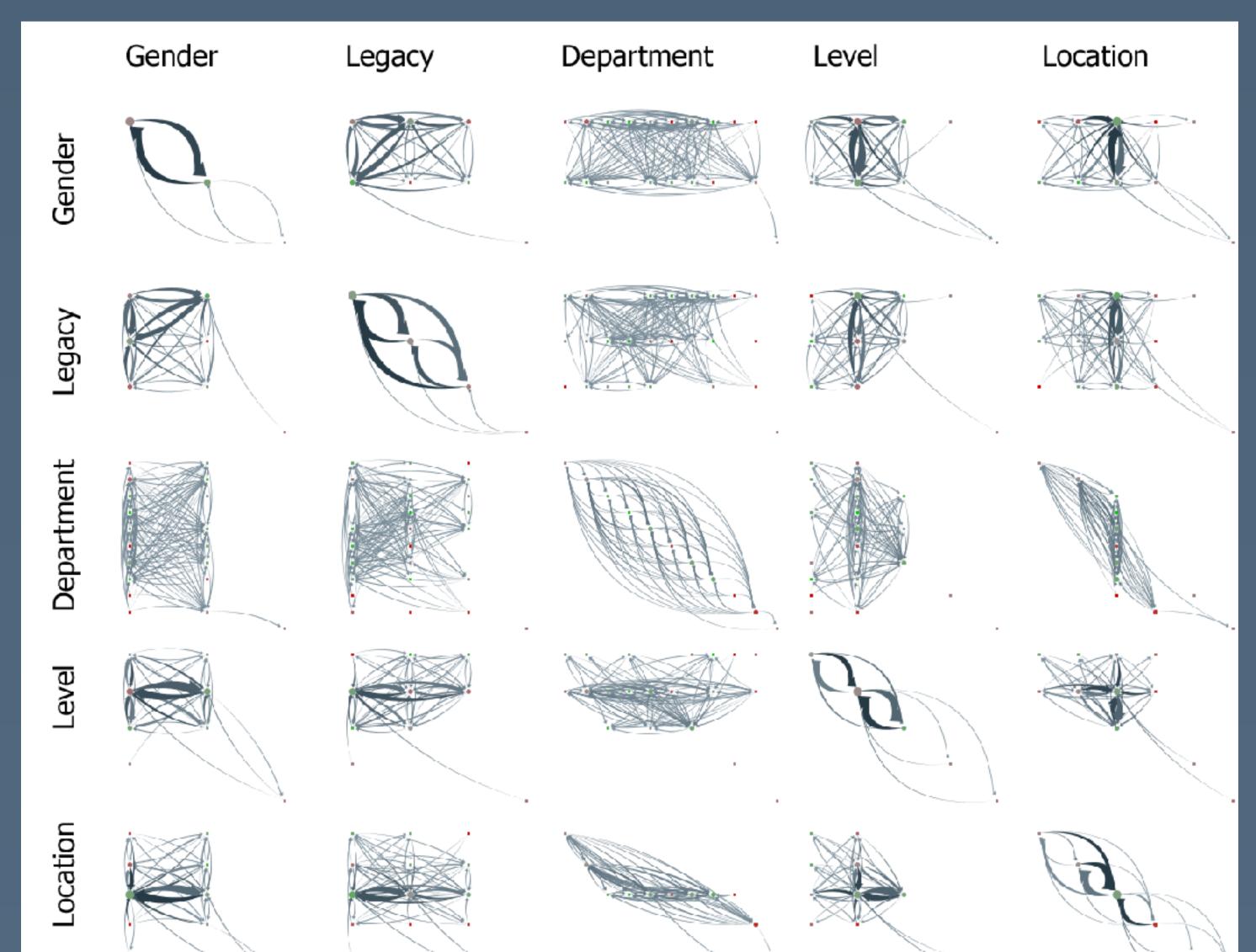
Hierarchical graph layout



Motifs

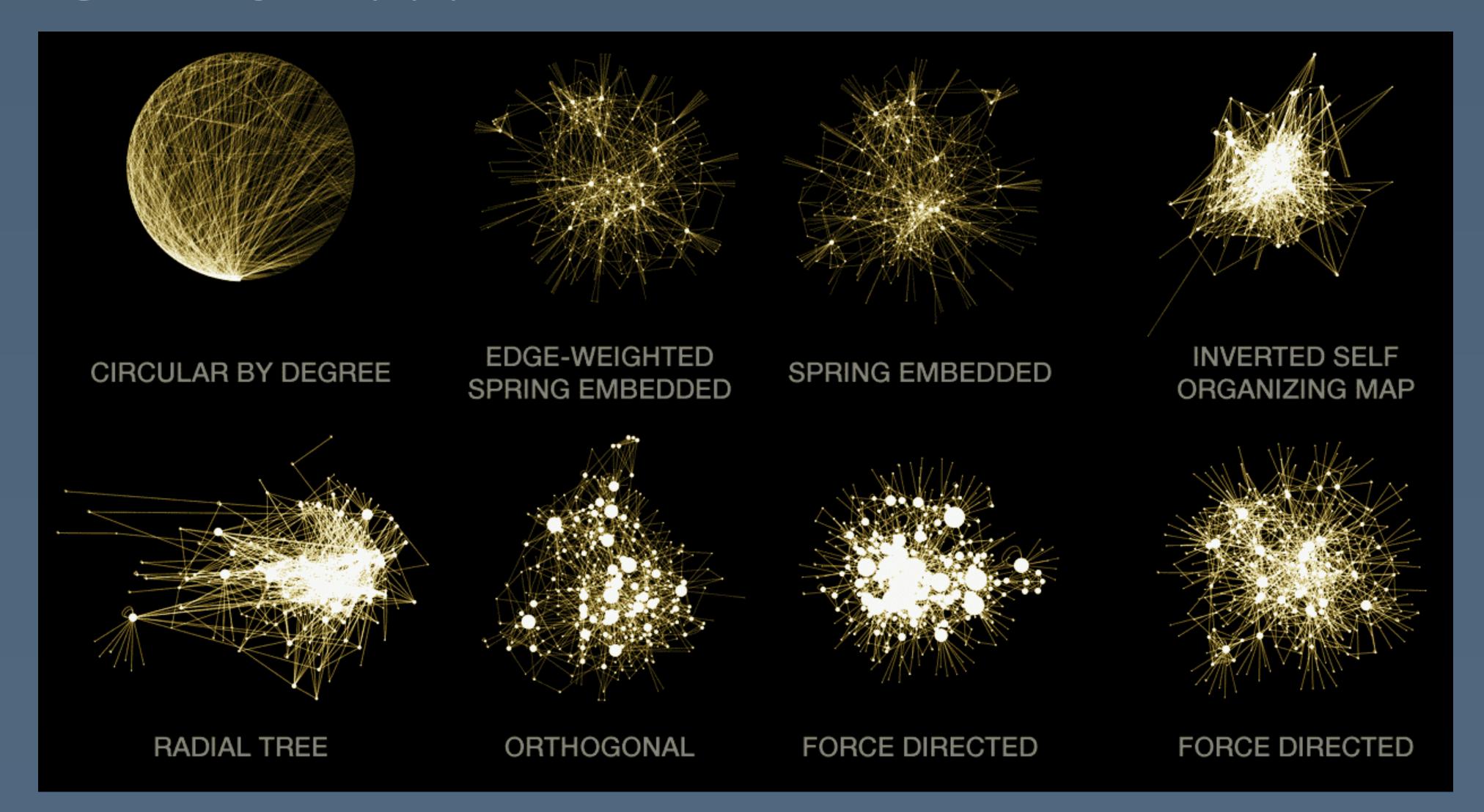


Attribute-based aggregation



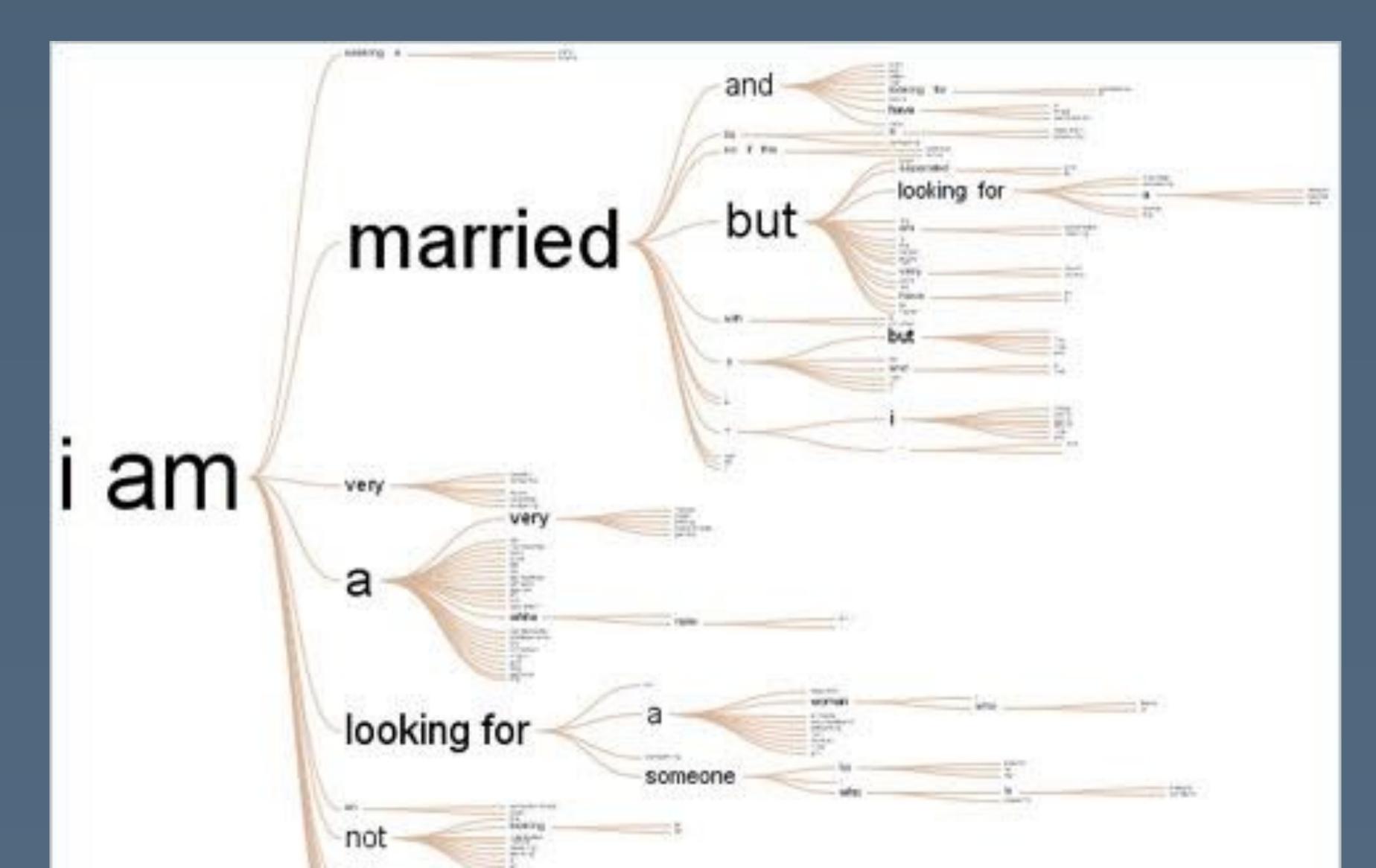
PivotGraph Matrix Wattenberg, 2005

Uh oh...

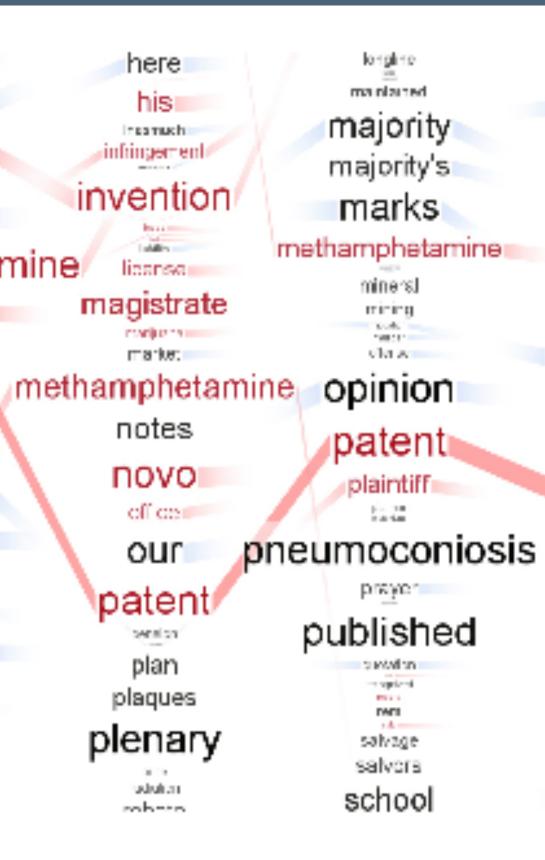


Text Visualization

Word Tree



Parallel Tag Clouds





see

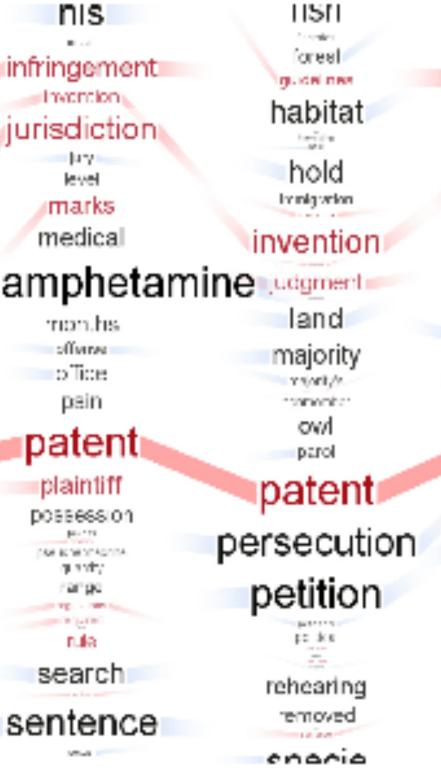




90.113

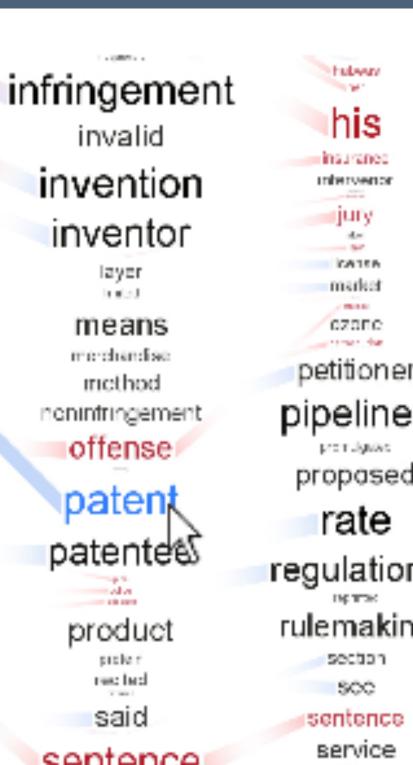
section

she



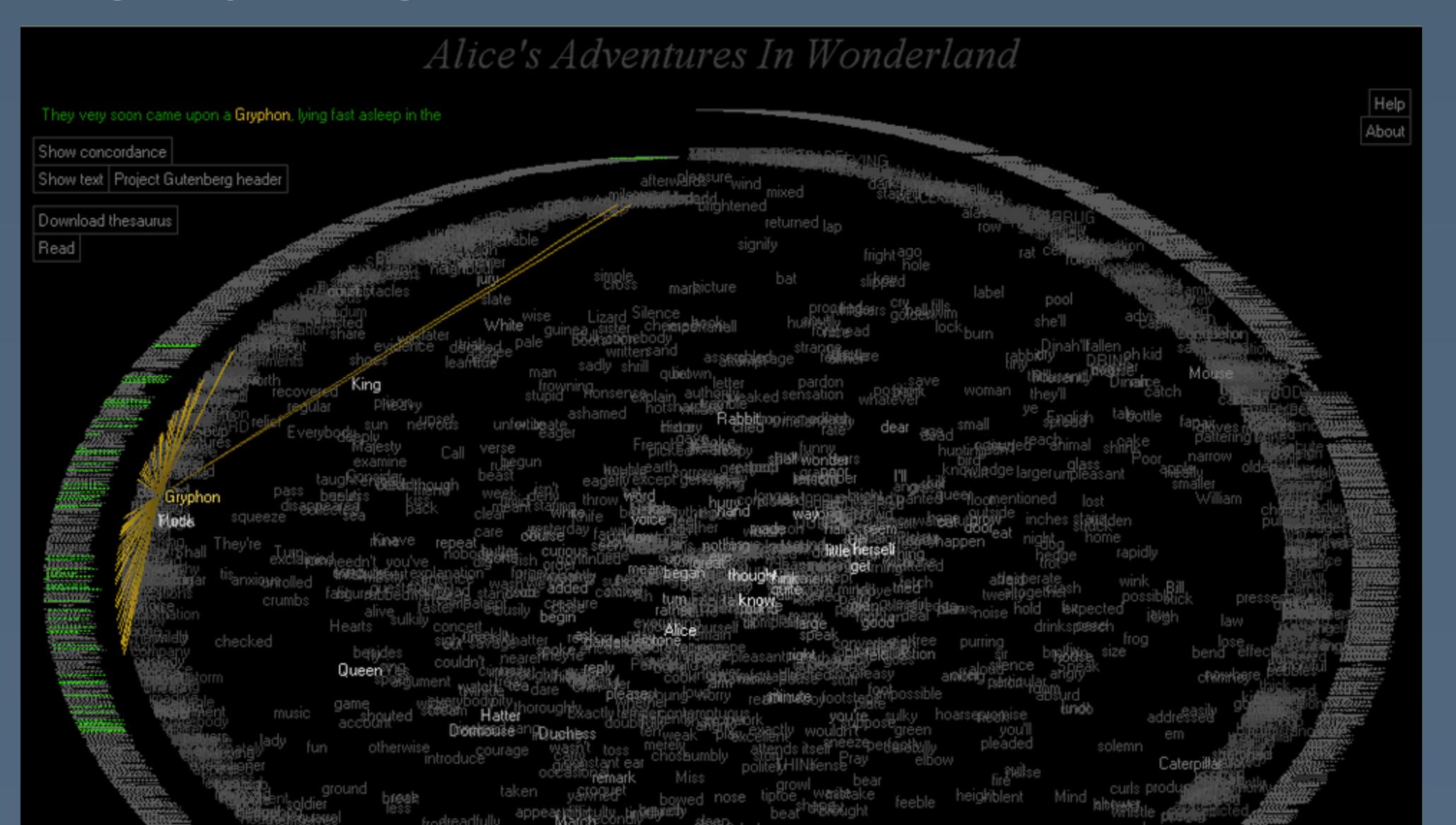






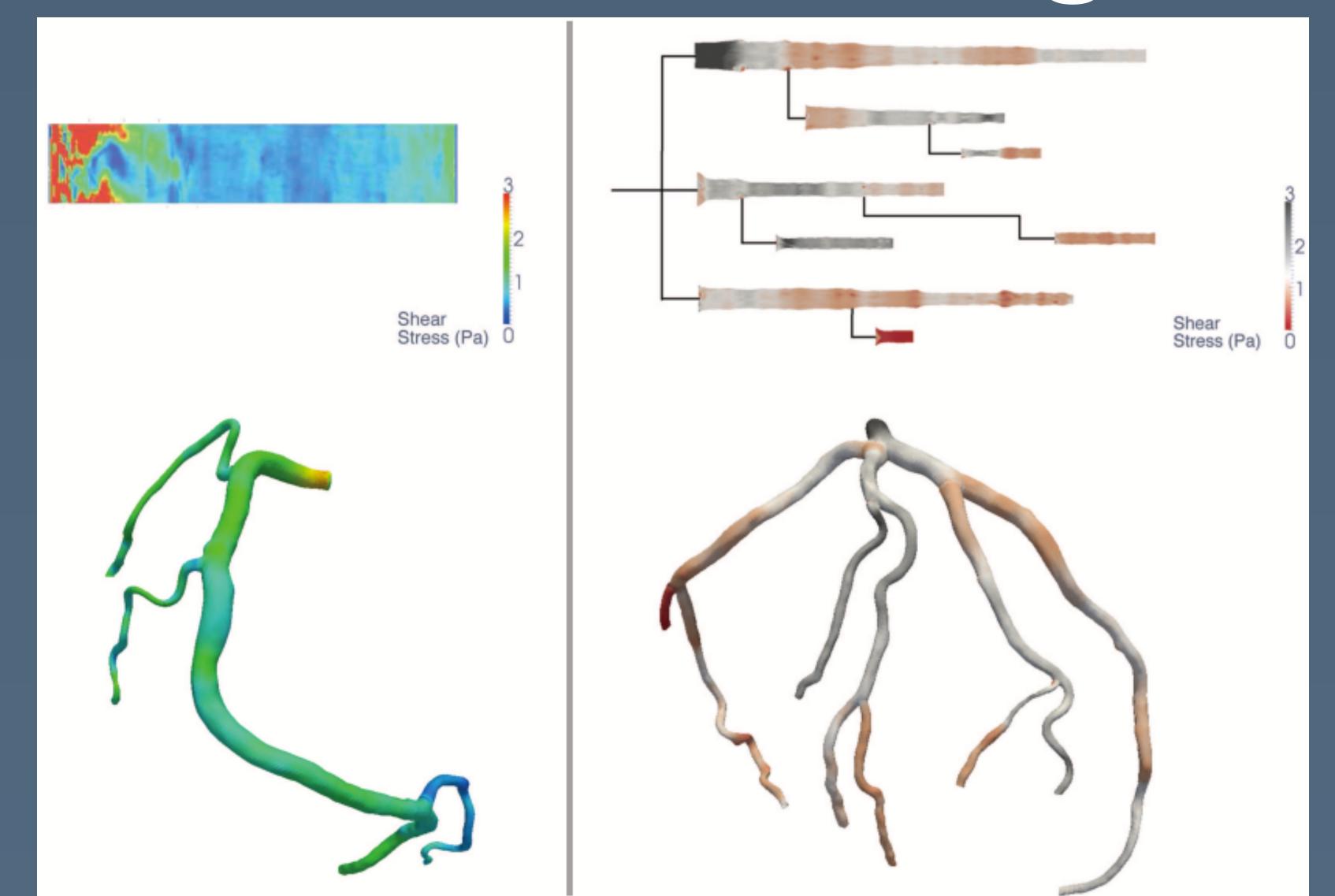
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TextArc

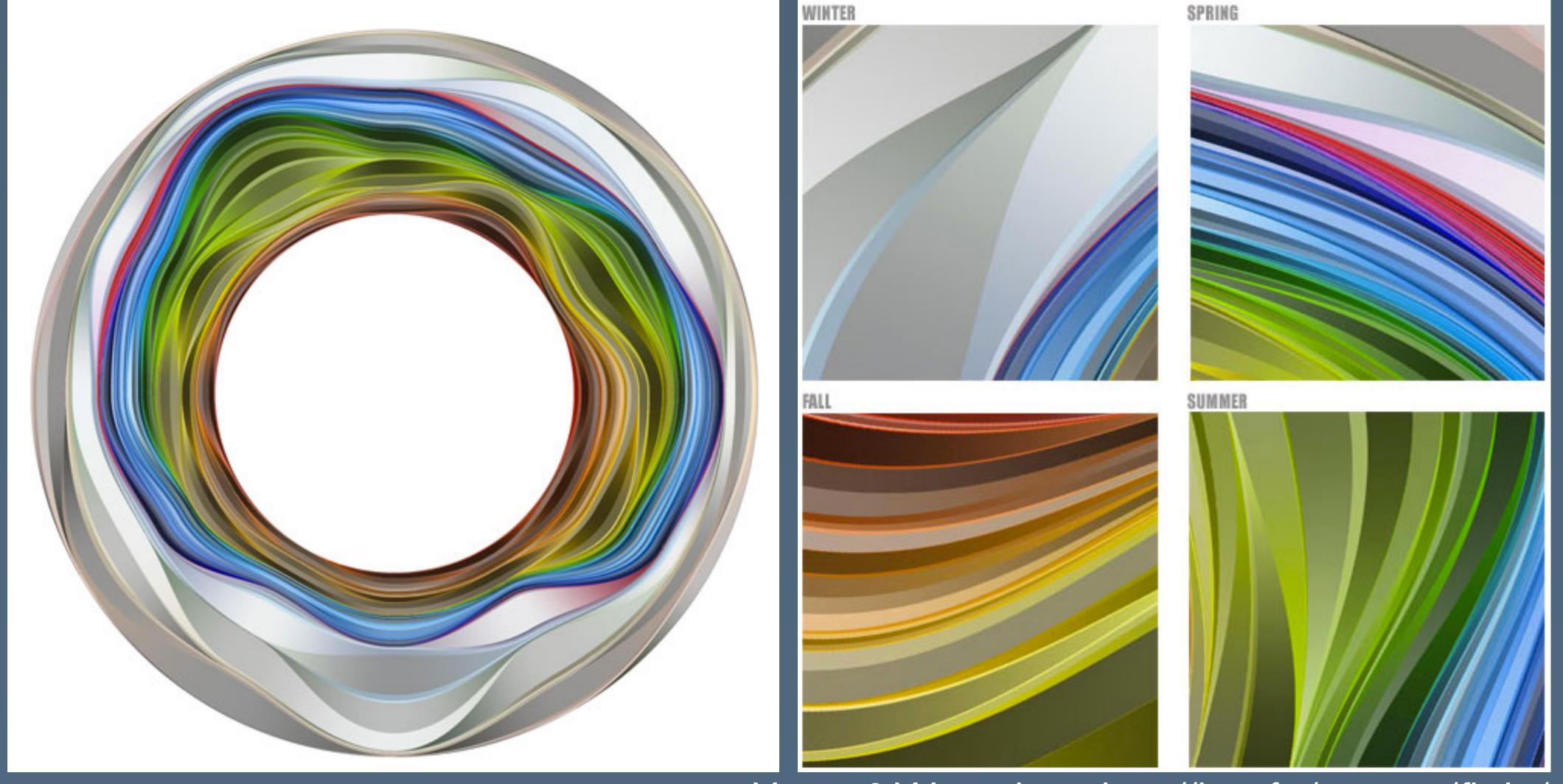


Sharing/ Communicating

Heart Disease Diagnosis



Flickr Flow



45

Discussion rooms

Rotation	Littlefield 107	Littlefield 103
a	12	34
b	24	13
C	14	23
d	34	12
e	13	24
f	23	14