

POIR 613: Measurement Models and Statistical Computing

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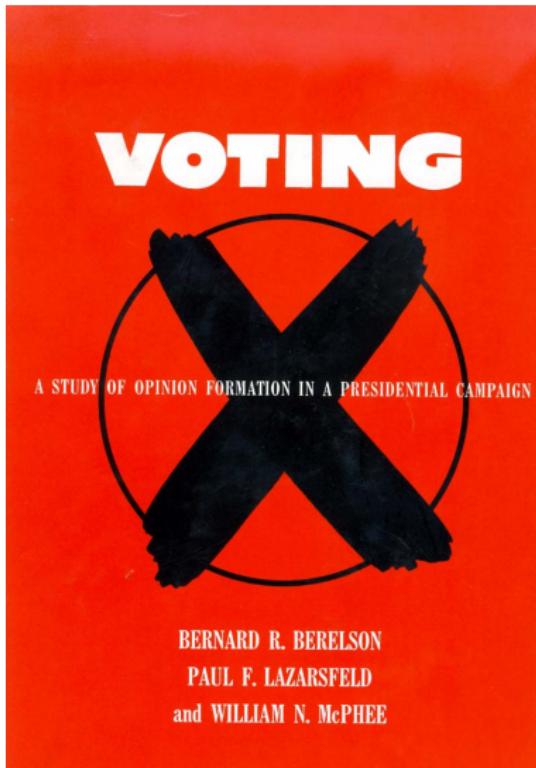
Today

1. Solutions for last week's challenge
2. Next deadline: October 30 for descriptive statistics
3. Other announcements:
 - ▶ No class on November 21st
 - ▶ Office hours at regular time tomorrow
4. Today:
 - ▶ Introduction to network analysis

Introduction to social network analysis

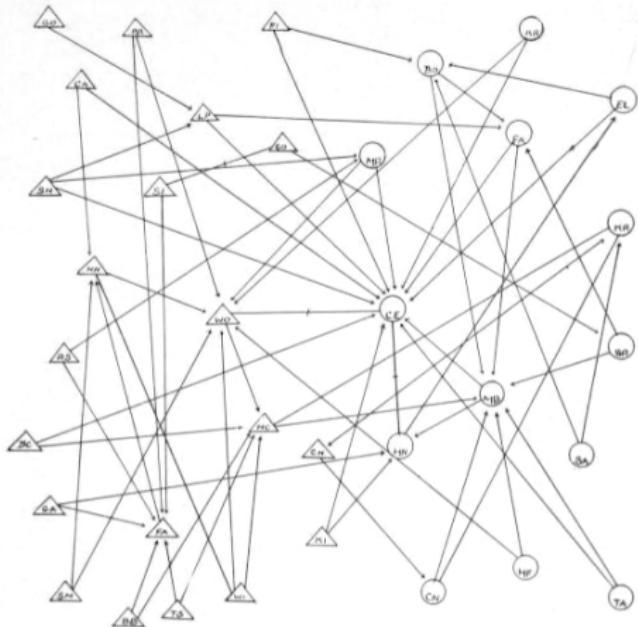
Political behavior is social

- ▶ Opinion formation as a *social process* (Berelson et al, 1954)



- ▶ *Voting is contagious* (Nickerson, 2008)

EVOLUTION OF GROUPS



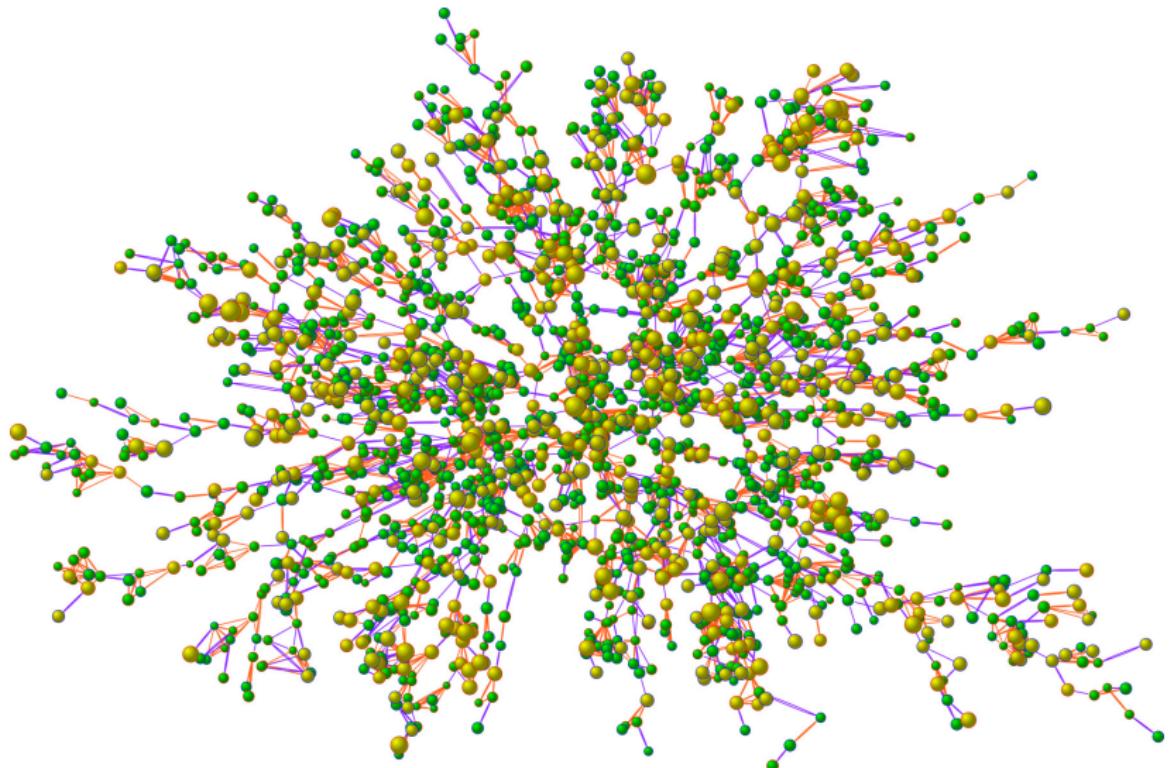
CLASS STRUCTURE, 1ST GRADE

21 boys and 14 girls. *Unchosen*, 18, GO, PR, CA, SH, FI, RS, DC, GA, SM, BB, TS, WI, KI, TA, HF, SA, SR, KR; *Pairs*, 3, EI-GO, WO-CE, CE-HN; *Stars*, 5, CE, WO, HC, FA, MB; *Chains*, 0; *Triangles*, 0; *Inter-sexual Attractions*, 22.

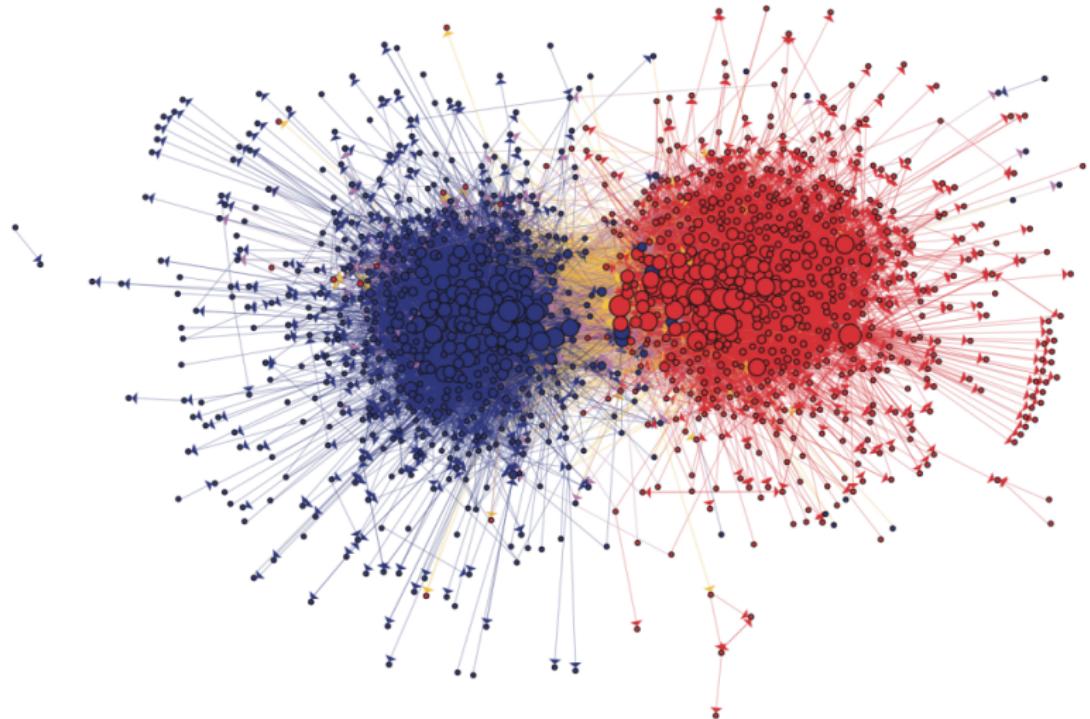


CLASS STRUCTURE, 2ND GRADE

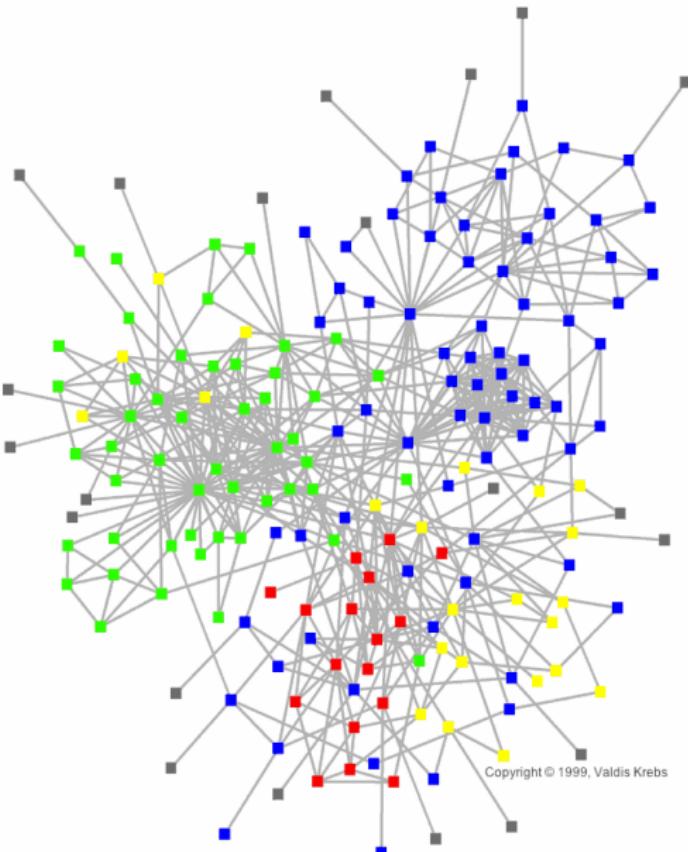
14 boys and 14 girls. *Unchosen*, 9, WI, KP, N, SH; *Pairs*, 11, ZV-MK, MK-LN, OW-ZI, GR-H, JN-PO, PO-SL, HF-BE, GL-GU; *Stars*, 2, SL, SL-JN-PO; *Inter-sexual Attractions*, 14.



Christakis & Fowler, NEJM, 2007

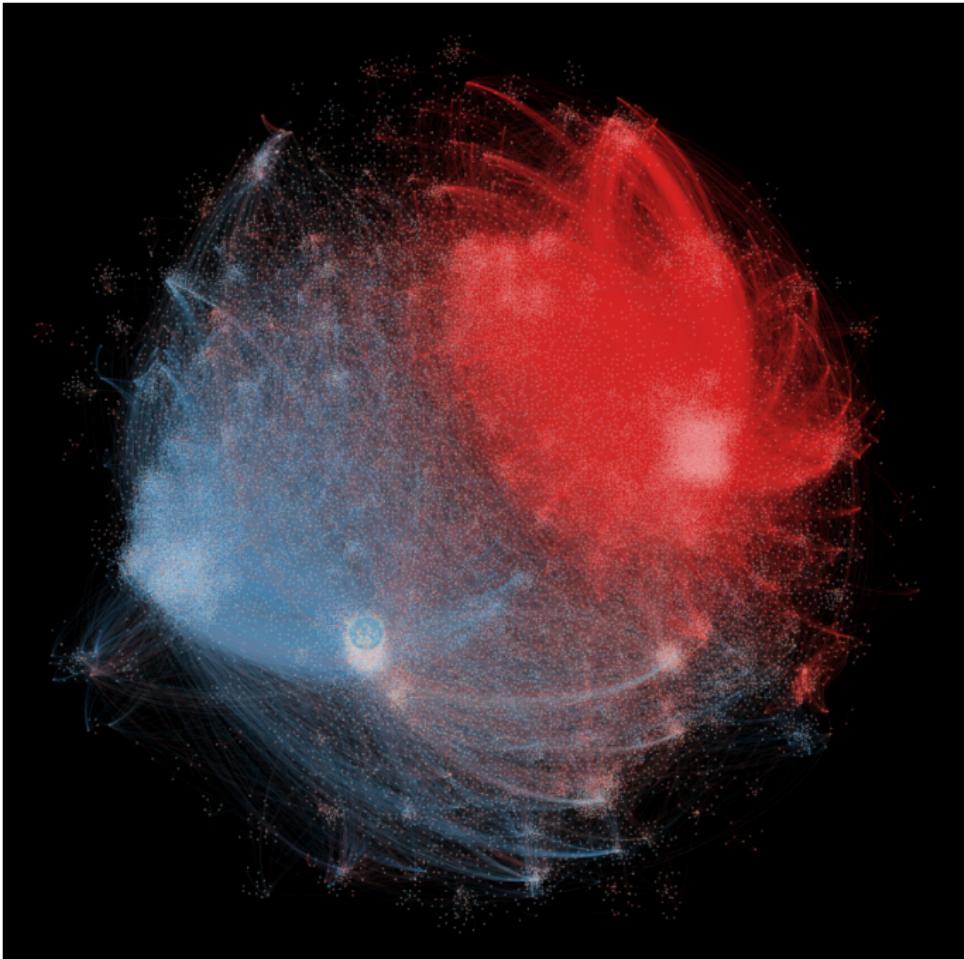


Adamic & Glance, 2004, IWLD

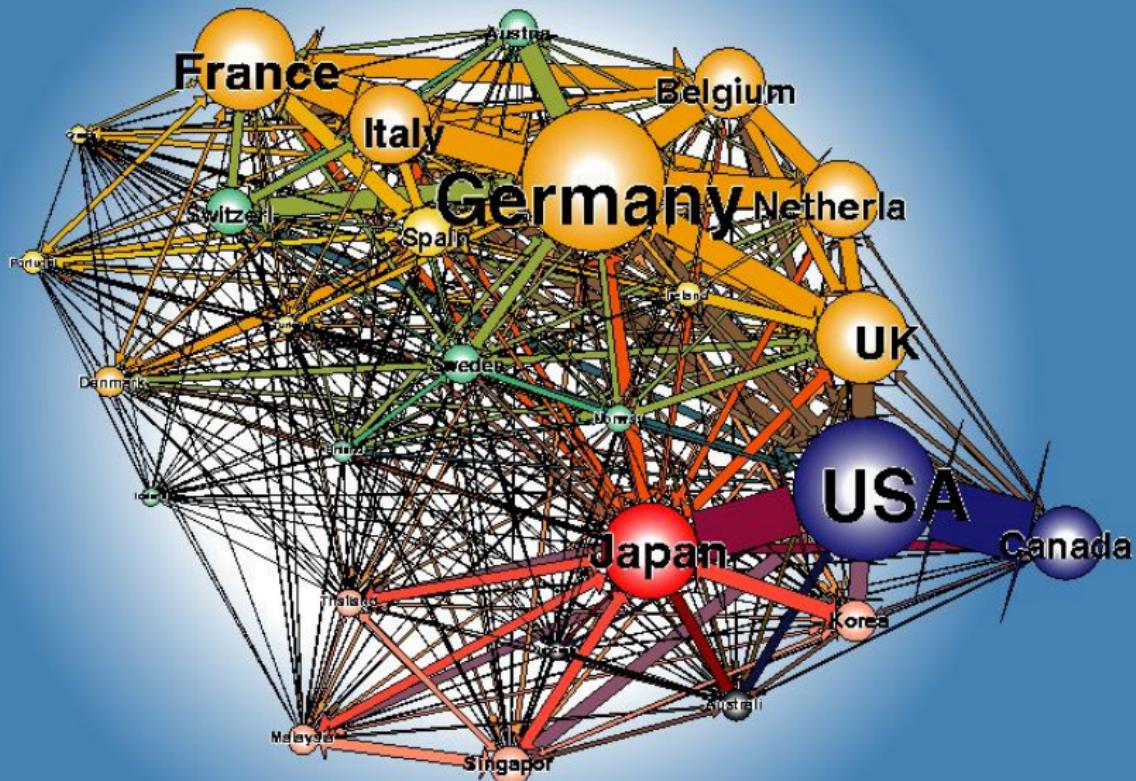


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Email network of a company



Barbera et al, 2015, Psychological Science



Basic concepts

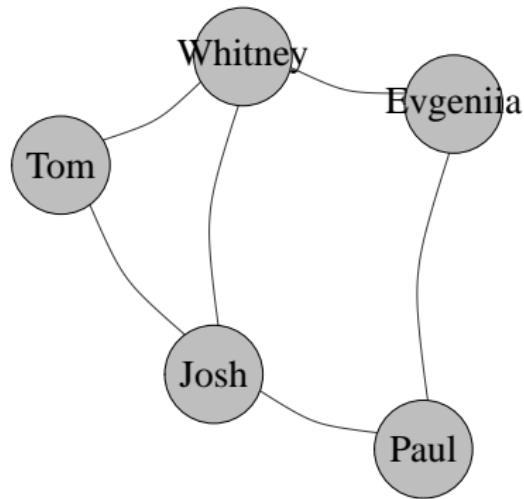
- ▶ **Node** (vertex): each of the units in the network
- ▶ **Edge** (tie): connection between nodes
 - ▶ Undirected: symmetric connection, represented by lines
 - ▶ Directed: imply direction, represented by arrows
- ▶ A **network** consists of a set of nodes and edges

Networks everywhere

- ▶ Classroom: students / friendships
- ▶ Twitter: users / retweets
- ▶ Academic literature: papers / citations
- ▶ Internet: websites / hyperlinks
- ▶ Trade: countries / trade flows
- ▶ Biology: neurons / connections
- ▶ Text: documents / cosine similarity

Basic concepts

Network Visualization

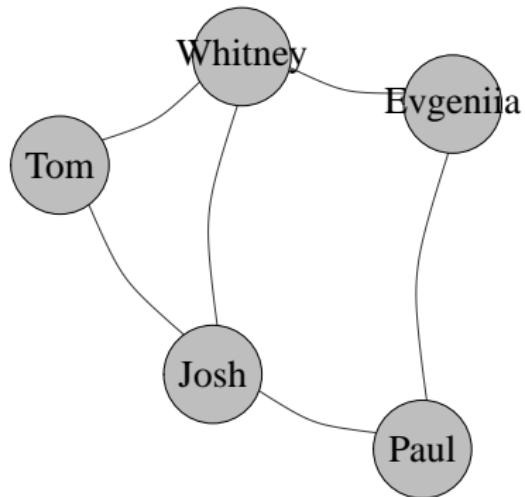


Adjacency Matrix

	P	J	E	W	T
P	0	1	1	0	0
J	1	0	0	1	1
E	1	0	0	1	0
W	0	1	1	0	1
T	0	1	0	1	0

Basic concepts

Network Visualization



Edgelist

	Node1	Node2
1	Paul	Josh
2	Paul	Evgeniia
3	Josh	Whitney
4	Josh	Tom
5	Whitney	Tom
6	Evgeniia	Whitney

Social network analysis

Three levels of analysis:

1. **Micro**: who are the most *influential* nodes? (centrality measures)
2. **Meso**: what type of communities or clusters emerge in the network? (community detection, latent space models...)
3. **Macro**: what are the mechanisms that explain how nodes are connected? (hierarchy, homophily, diffusion..)

Three types of tools

1. **Visualization**: layout algorithms
2. **Quantification**: measures of centrality
3. **Experimentation**: at node and network level