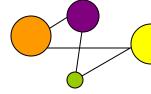
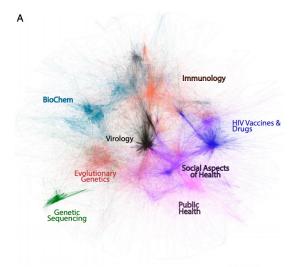
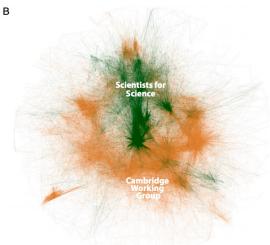


Social Network Analysis Introduction











Disparate foundations of scientists' policy positions on contentious biomedical research

Achim Edelmann^{a,b,1}, James Moody^{b,c,d}, and Ryan Light^e

anstitute of Sociology, University of Bern, 3012 Bern, Switzerland; Duke Network Analysis Center, Duke University, Durham, NC 27708; Department of Sociology, Duke University, Durham, NC 27708; Ling Abdulaziz University, Jeddah 21589, Saudi Arabia; and Department of Sociology, University of Socio

Edited by Peter S. Bearman, Columbia University, New York, NY, and approved April 21, 2017 (received for review September 1, 2016)

What drives scientists' position taking on matters where empirical answers are unavailable or contradictory? We examined the contentious debate on whether to limit experiments involving the creation of potentially pandemic pathogens. Hundreds of scien-

science rests on a community of scholars sharing ideas and working together (3). Implicit understandings in scholarly communities are shaped by multiple nonempirical factors (4-6), and debates often swing between states of contestation and consen-

What factors contribute to whether scientists publicly express support or concern a contentious scientific issue?

Gain-of-function research involves generation of new properties or characteristics in a scientific lab.

In this case the new property is mammalian transfer of H5N1 influenza virus.

Fig. 2. Correspondence between research topics and position on gain-of-function research. Map of the largest component of scientists' paper-to-paper coterm network: edges link papers (n = 19,257) weighted by their cosine similarity (see the SI Appendix for details); layout is via Fruchterman-Reingold, which places similar papers near one another; layout positions are constant in both A and B. (A) Edges colored by papers' highest loading topic (eight colors, corresponding labels positioned near the center of topic clusters). (B) Edges colored by the authors' camp (green, SFS; orange, CWG).

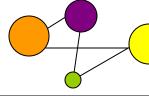
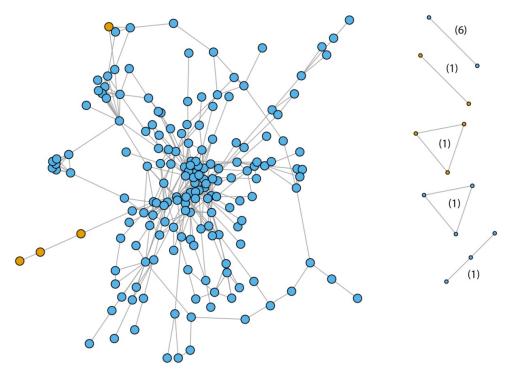


Figure 1. A Climate Science Co-Authorship Network





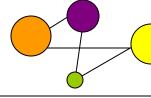
Component Characteristics N = 176 Edges = 449 IPCC = 172

NIPCC = 4

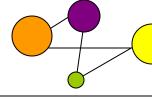
Clouding climate science:

A key criteria for a successful scientific idea is the development of a community. Good ideas beget good ideas and science accumulates accordingly – "standing on the shoulders of giants."

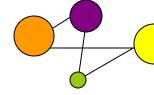
Do anti-consensus climate scientists form a community?

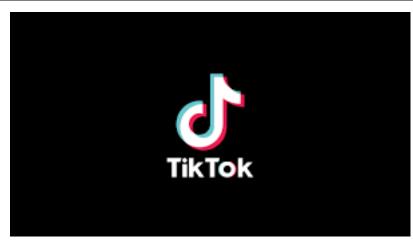


Introduction to the foundation of the basics of social network analysis



What do you think of when you think of the internet?





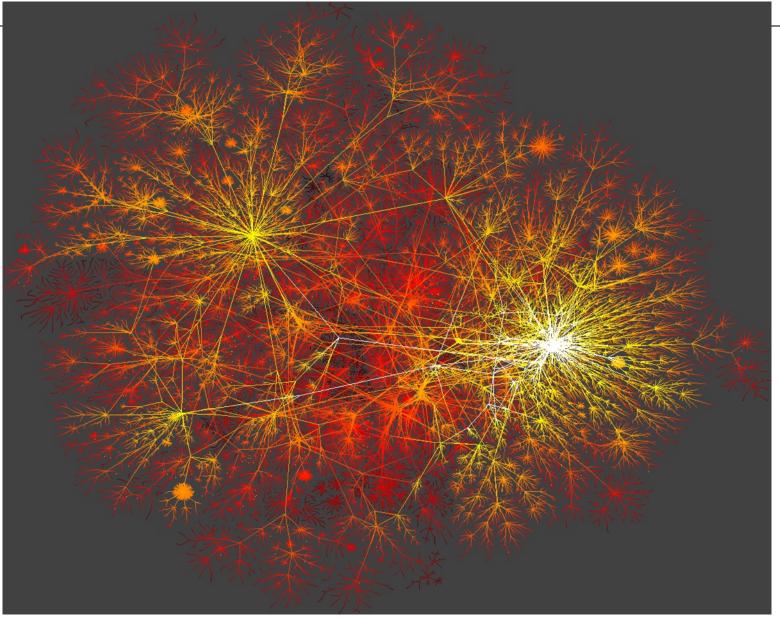




Google Search

I'm Feeling Lucky

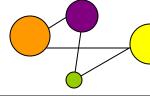




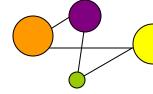
http://barabasilab.com and caida.org



What is high school?



















STUDENT PROGRESS AND GRADE REPORT

TUDENT	NUMBER	SEX	GRADE	SC	CHOOL NAME SCHOOL YEAR											NR .	QTR.	DATE				
			м	11	2	2191 WELLINGTON HIGH											06-07		4	06/08 2007		
ERIOD	STATE NUMBER 2000360 8303020 1001380 1206330 1211300 2100320 8300410B 8300410A			INSTRUCTOR		1ST QUARTER			2ND QUARTER			EXAM	SEM. AVG.	G C PA			4TH G	QUARTE C PA	EXAM	SEM. AVG.	FINAL AVG. MID. SCH.	H. S.
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G - GRADE PA- PERIOD ABSENCES

MORE DETAILS ON REVERSE SIDE

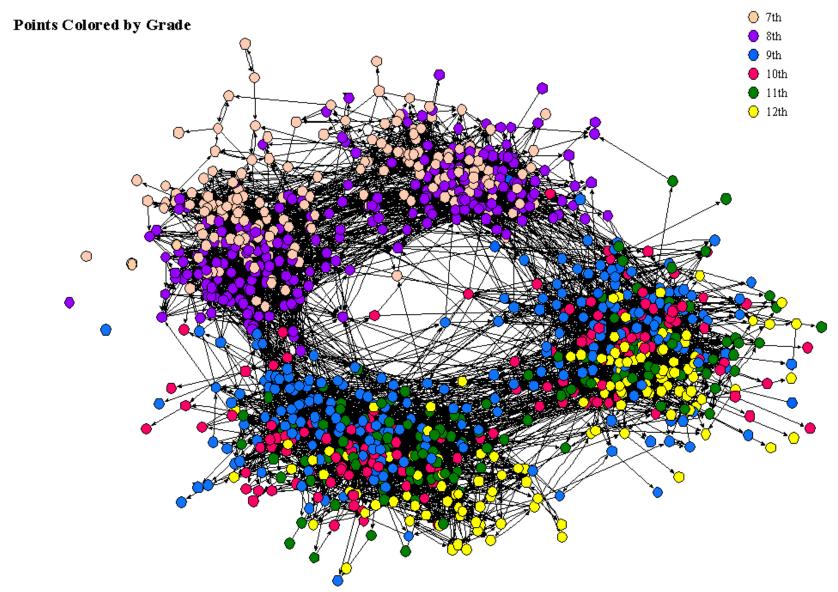
La traducción en español de la nota explicativa se puede conseguir de su escuela. Lekól ou a gen tradiksyon senból yo an kreyól.

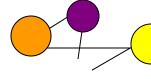
HIGH SCHOOL CUMULATIVE GPA = 3.7872

USING CUMULATIVE GPA: STUDENT IS ON-TRACK TO GRADUATE: YES

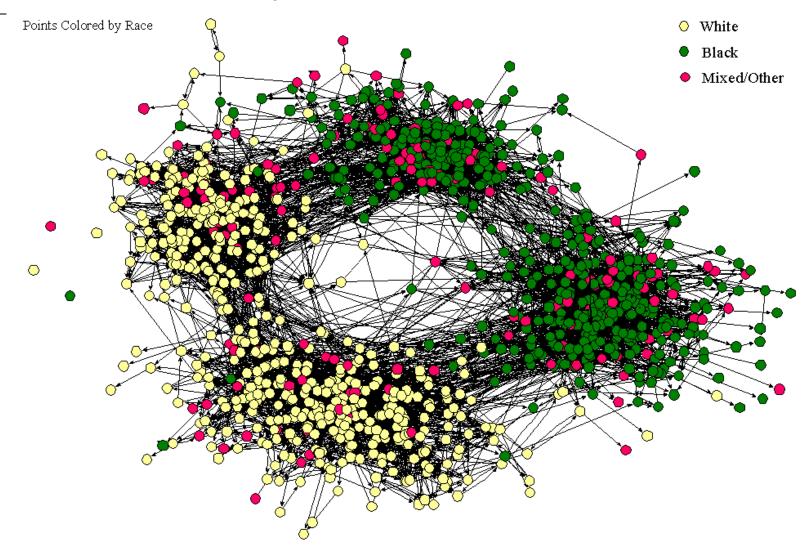
TOTAL HIGH SCHOOL CREDITS EARNED: 23.50

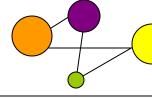
The Social Structure of "Countryside" School District



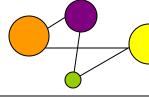


The Social Structure of "Countryside" School District



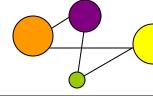


How is academic knowledge produced?











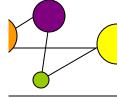
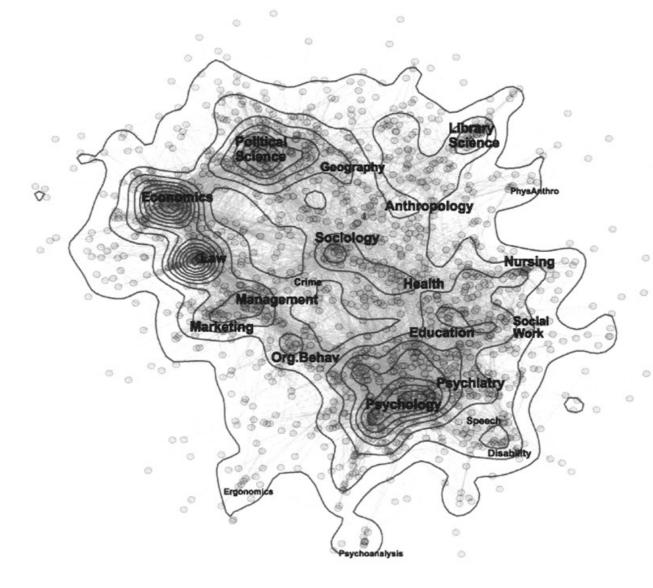
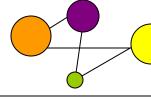
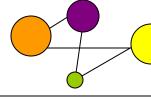


Figure 1 The Discipline Structure of Social Science Journals Co-citation ties among 1657 Social Science Journals

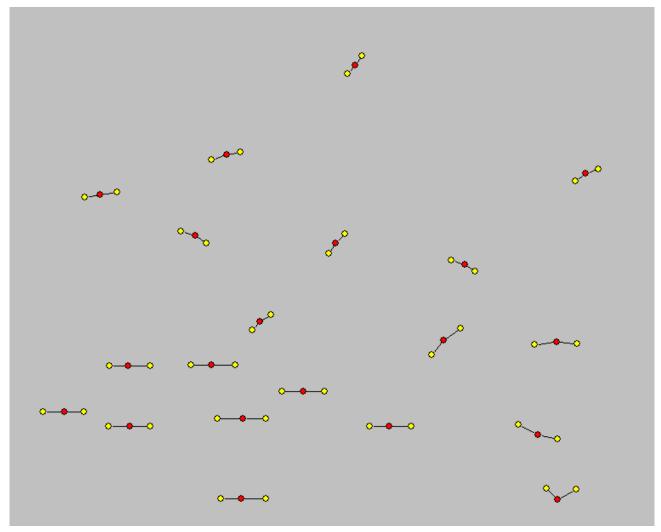




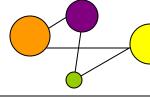
Social network analysis challenges us to see the world relationally.



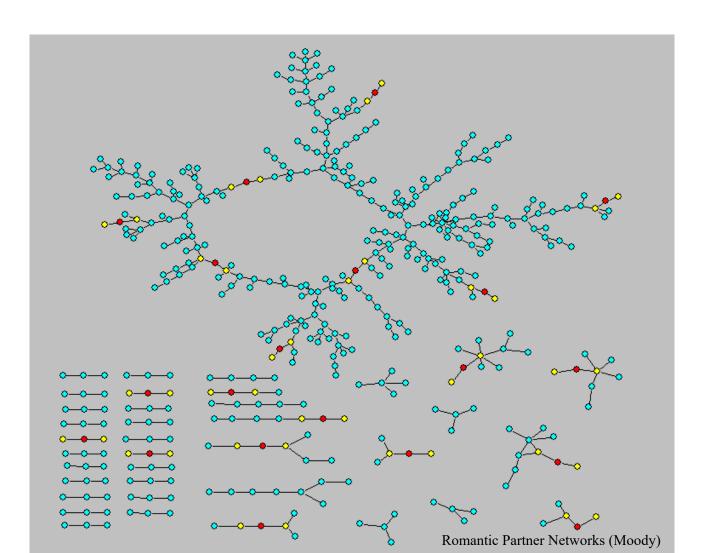
Theoretically, sociology is interested in moving between local and...

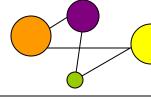


Romantic Partner Networks (Moody)



...and global vision.

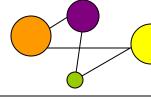




What is Social Network Analysis?

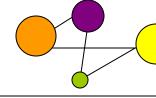
 A theoretical perspective that attempts to explain how individual and group behaviors and relations are linked to patterns in society, and

 A set of relational methods for systematically analyzing the ties/relations between nodes/actors.



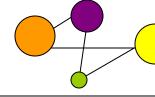
What is Social Network Analysis?

- A theory and a method for social scientific analysis that relies on:
 - structural intuition
 - systematic collection of relational data
 - use of graphic visualizations
 - mathematical or computational models



What do we study?

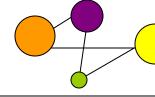
- 1. Social network analysts often study relations as *systems* focusing on how the *pattern* of relations among actors affects individual behavior or system properties.
 - Hierarchy and domination
 - Relational views of class
- Emergent clusters/communities in "big data"



What do we study?

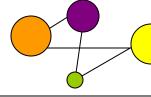
- 2) Networks as social contexts
 - •How does the network environment affect an actor's behavior?
 - •Examples:

Peer influence on delinquency Corporate interlocks and political participation International trade and war

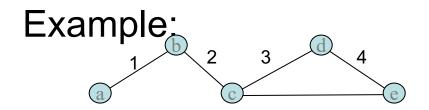


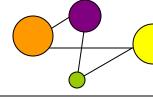
What do we study?

- 3) Conduits for diffusion
 - •Relations are like wires or pipes: risks and resources flow through relations. This can have very *wide* implications:
 - Diffusion of innovations (fads, rumors, etc.)
 - Disease diffusion (Coronavirus, STDs)



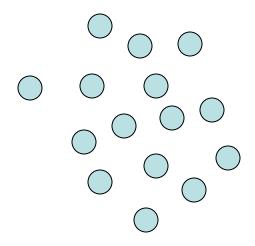
The unit of interest in a network are the combined sets of actors and their relations. Therefore, social network data consists of two linked classes of data: Nodes {a...e} and Edges {1...5}





Thinking about Some Basic Network Forms

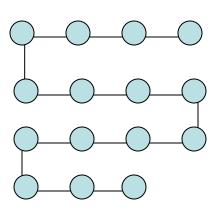
n=15



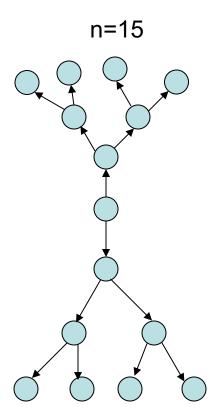
Unconnected Group, or an Empty Graph

Note: disconnected nodes are called "isolates" making this a collection of isolates.

n=15

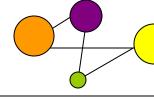


Bucket Brigade

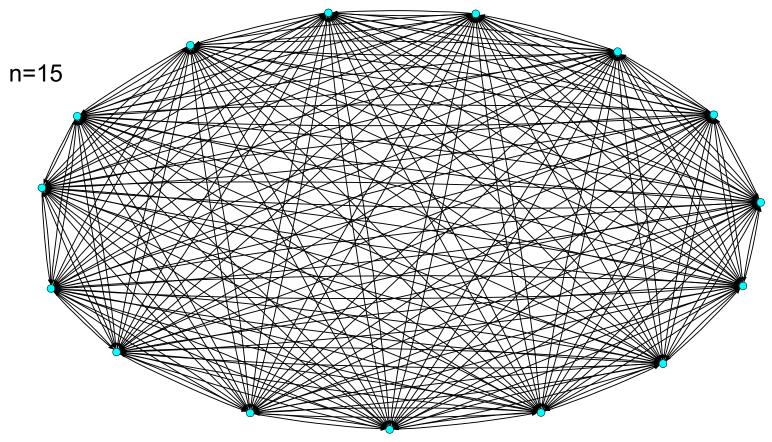


Telephone Tree

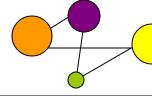
(See Christakis and Fowler 2009)



Thinking about Some Basic Network Forms



Complete Graph..."Where Everybody Knows Your Name"



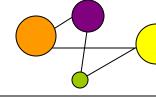
Nodes: Information on the individuals (actors, nodes, points, vertices)

- -Network nodes are most often people, but can be any other unit capable of being linked to another (schools, countries, organizations, personalities, etc.)
- -The information about nodes is what we usually collect in standard social science research: demographics, attitudes, behaviors, etc.
- -Often includes dynamic information about when the node is active

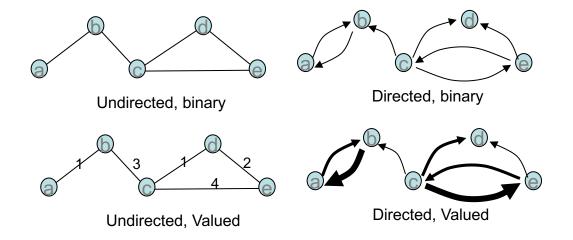


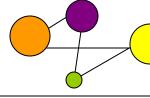
Edges: Information on the relations among individuals (lines, arcs)

- -Records a connection between the nodes in the network
- -Can be valued, directed (arcs), binary or undirected (edges)
- -One-mode (direct ties between actors) or two-mode (actors share membership in an organization)
- Mutuality is when directed ties are reciprocated.
- Anti-symmetrical ties are ties where symmetry is by definition impossible (mothers genetic connections to sons).
- -Includes the times when the relation is active

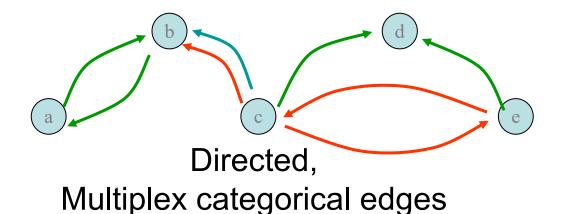


In general, a relation can be: (1) Binary or Valued (2) Directed or Undirected

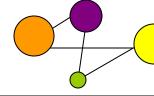




Nodes can also be connected by different types of edges at one time



(e.g., co-workers at the same university, play on the same soccer team, and are friends)

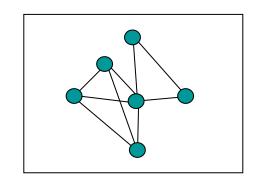


We examine networks across multiple levels:

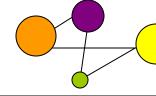
Ego - Networks

A respondent (ego) and the set of people they have relations with (alters).

This may include estimates of connections among alters.



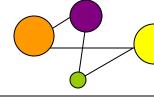
Example: A specific person's friendship network or family tree. Common in survey data collection (e.g., General Social Survey).



Partial network

- Ego networks plus some amount of tracing to reach contacts of contacts (often referred to as **steps**, as in direct connections are 1-step and friends of friends are 2-steps).
- Something less than full account of connections among all pairs of actors in the relevant population

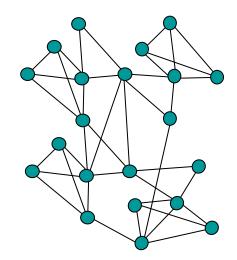
Example: Covid-19 contact tracing.

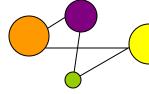


Socio-centric network

- The connections among all members of a population or relevant boundary.
- Never exactly complete (due to missing data, but boundaries are set).

Example: Co-acting data among all actors in horror films, friendships among

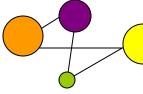


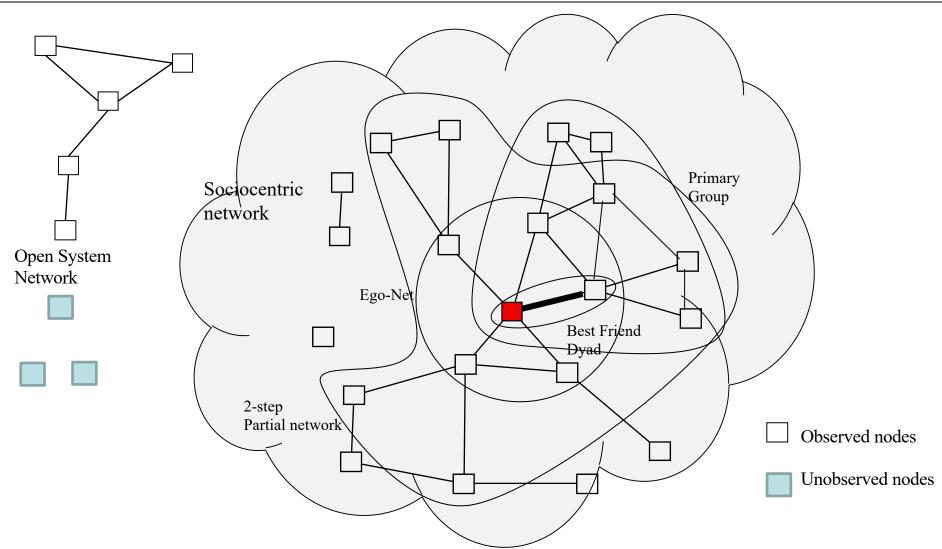


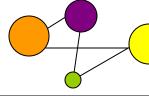
Open system network

- A network where boundaries aren't as clear. Network isn't boxed.
- Incomplete by definition.

Example: All friendships of students in a high school; elite connections in the United States, the dark web



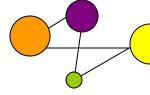




What connects us?

Propinquity – co-location, being in the same place at the same time

Homophily – birds of a feather flock together. "[I]f two people have characteristics that match in a proportion greater than expected in the population from which they are drawn or the network of which they are a part, then they are more likely to be connected."

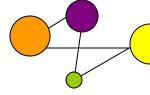


Thinking through homophily

Status-homophily: either ascribed (e.g., race and sex) or acquired (e.g., occupation, education, marital status)

Value-homophily: (attitudes, beliefs)

Homophily or influence? – Chicken-and-egg situation. Do people with same taste in music hang out together or do they influence each other to have the same taste.

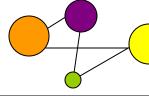


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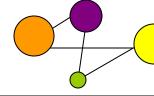


Triads – three nodes

Basic unit – "molecule" of networks.

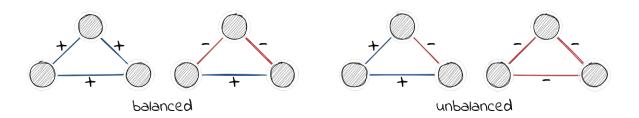
Computationally triads are useful because counting units bigger than three nodes can be intractable. (In large, connected networks counting all triads alone is difficult).

For our purposes we are interested in **balance** and **transitivity**.

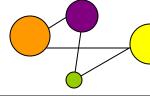


Triads – three nodes

Balance identifies what some think are fundamental tendencies in social relationships – " a friend of a friend is a friend" or "my enemy's enemy is a friend."



Can we think of times when unbalance is useful?

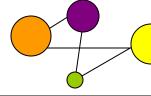


Triads – three nodes

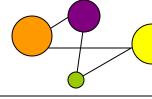
Transitivity is a related concept that captures the difference between connected triads where every node is connected to one another versus **intransitive triads** where the nodes are not entirely connected.

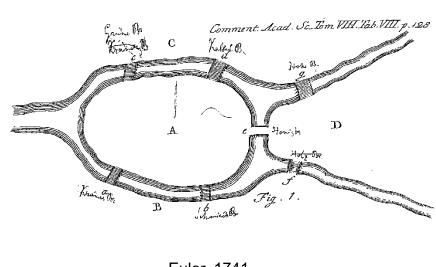


Transitivity plays a role in network clustering.

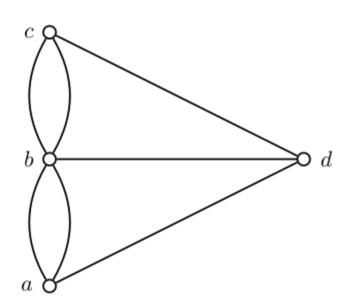


- The foundations of SNA are subject to debate.
 - •Advancements attributed to Galton (statistics), Euler (graph theory), Comte, Simmel, and so forth.
- Most agree that Jacob Levy Moreno and the development of sociometry mark a turning point, but an impermanent one.
- SNA as we know it begins in earnest with Harrison White and students among other in the 1970s.
- The take home: People have been "thinking in networks" for some time (picture biblical lineages")...but contemporary SNA only a couple of decades old.

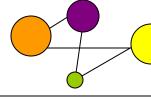




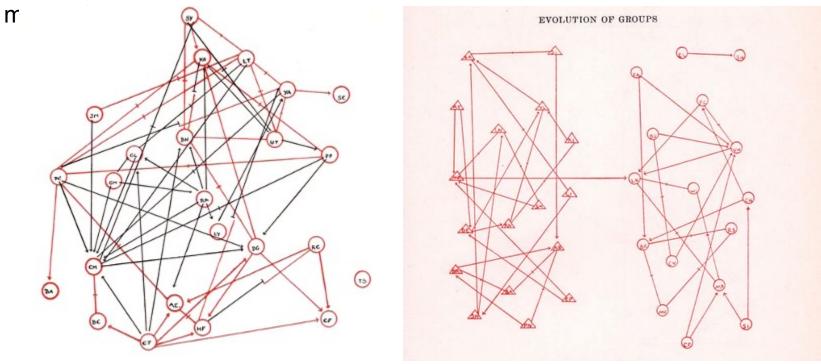
Euler, 1741



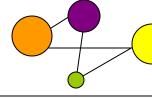
Euler's treatment of the "Seven Bridges of Kronigsberg" problem is one of the first moments of graph theory....



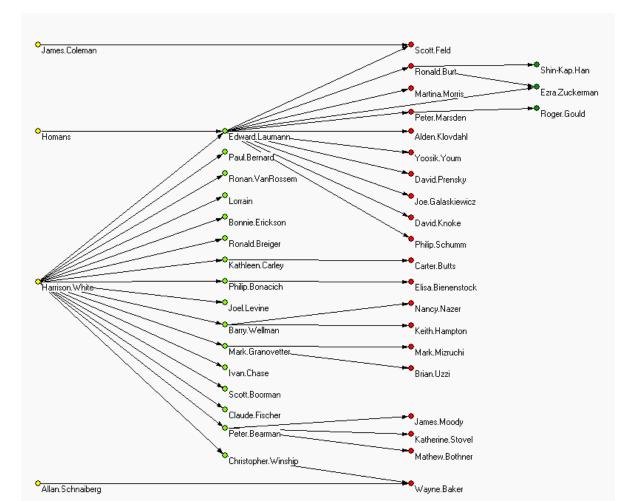
The study of network has depended on a graphical element since its first

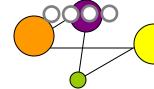


..but Moreno's sociograms from *Who Shall Survive* (1934) are typically seen as the beginnings of social network analysis (certainly if you were to ask Moreno!).

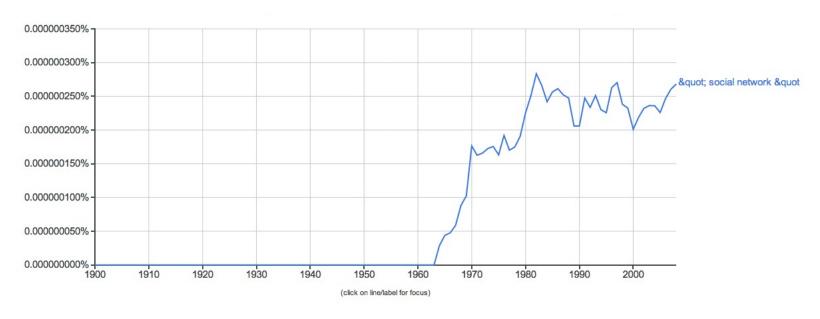


- Harvard Renaissance
 - The key idea here is that things took off under Harrison White at Harvard.





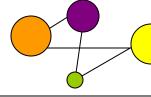
"Social Network" before "Social Networks" were cool



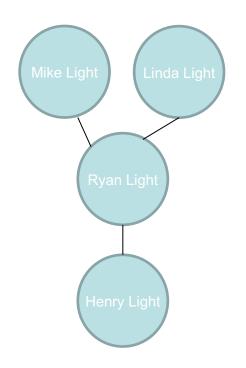
Search in Google Books:

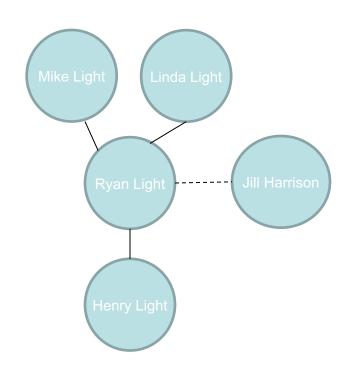
1900 - 1972	<u> 1973 - 1992</u>	<u> 1993 - 1995</u>	1996 - 2004	2005 - 2008	"social network"	English
1900 - 1972	1973 - 1992	1993 - 1995	1996 - 2004	2005 - 2008	" social network "	English

Run your own experiment! Raw data is available for download here.



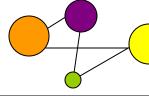
Family Tree Networks



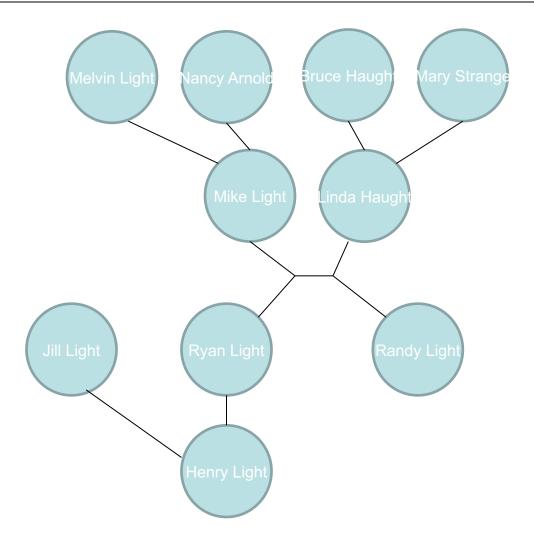


One step, One tie type (parental)

One step, two tie types (parental, marital)



Family Tree Networks



Two step, One tie type (parental)