

History



Center for Public Health
Systems Science

Brown School



Washington University in St. Louis

Overview

- History of network analysis
 - Roots in multiple disciplines
- Network analysis in public health and the social sciences
- Network analysis as:
 - Method
 - Theory
 - Paradigm
 - Discipline



History of Network Analysis

Role of mathematics, psychology, sociology, anthropology, computer science, physics, political science, public health, and Hollywood



Graph theory

- Study of graphs, mathematical structures used to model pairwise relations between objects from a certain collection.
 - More formally a graph is a collection of *vertices* and a collection of *edges* that connect pairs of vertices.
- Euler & Leibniz laid foundations of graph theory
 - Rich foundation - led to topology, data structures such as trees, mapping problems, and network analysis



Euler's *Seven Bridges of Königsberg*

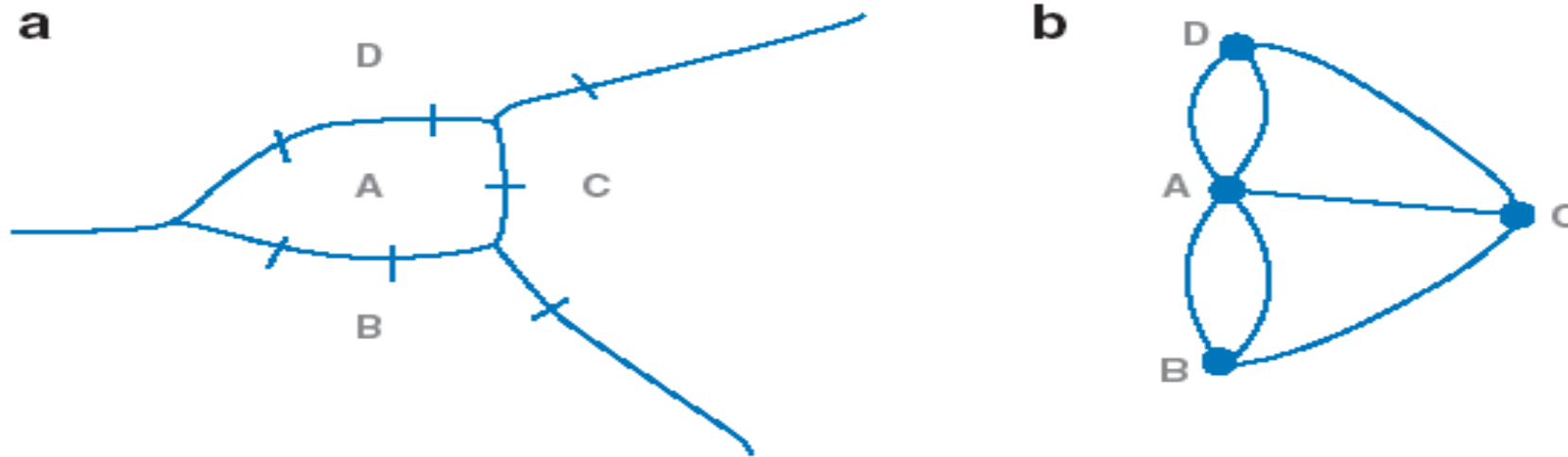
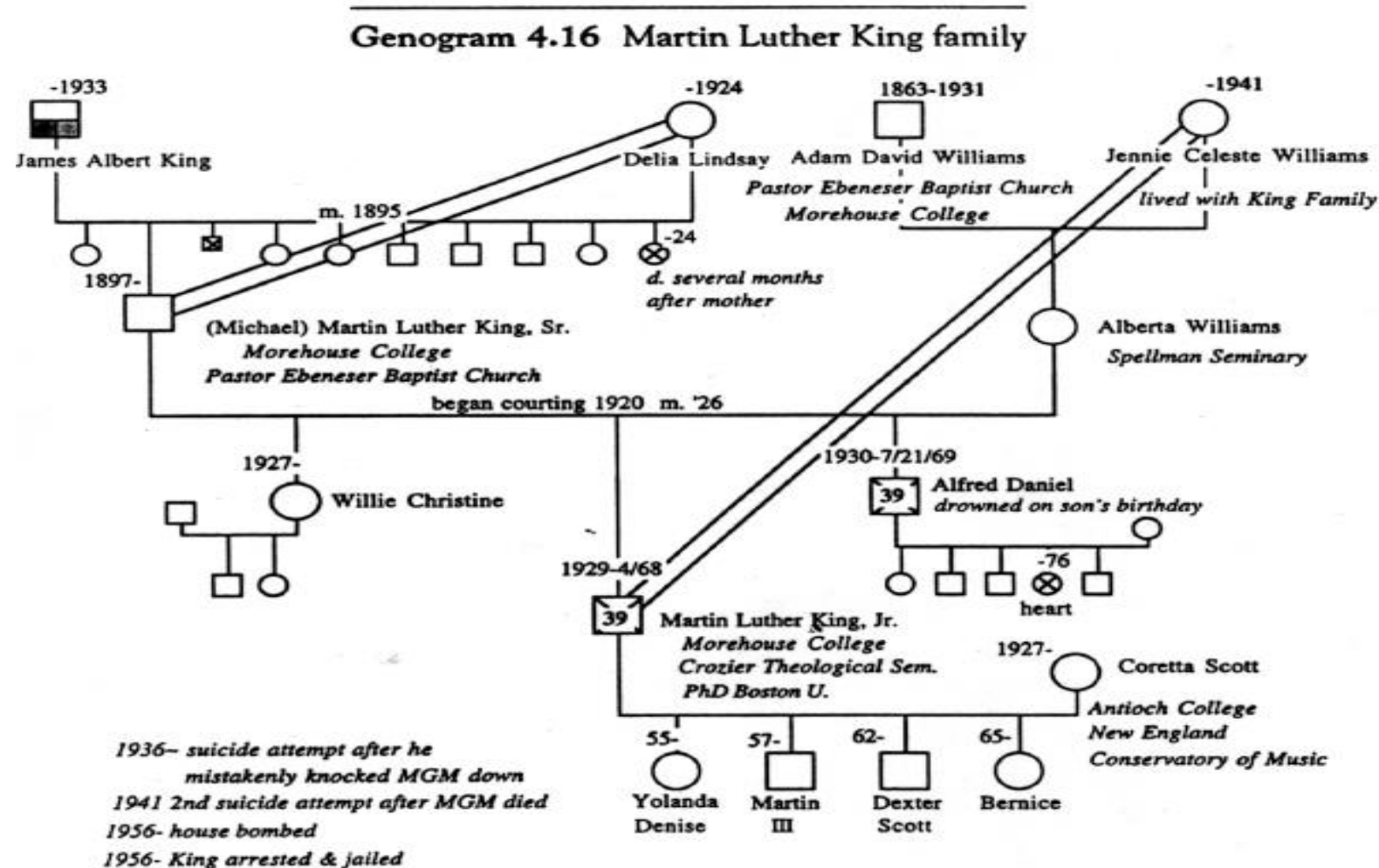


Figure 2

A simplified map of the Königsberg bridges (*a*) and the corresponding graph used by Euler to examine the Königsberg bridge problem (*b*). This graphic was adapted from <http://www.amt.canberra.edu.au/euler.html>.



Kinship & genealogy - Genogram example



Six Degrees

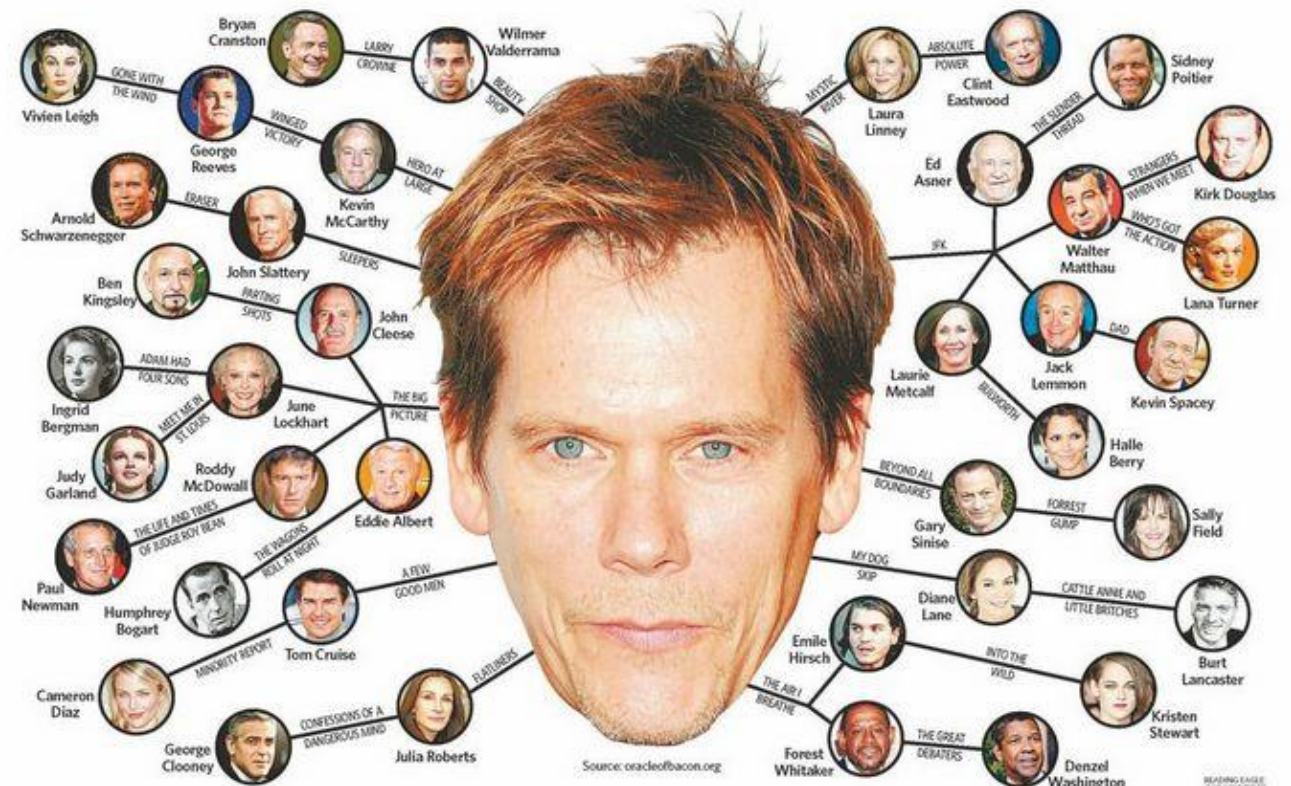
- Frigyes Karinthy
 - In short story (*Chains*, 1929) a character asserted that he could link anyone in the world to himself through at most five acquaintances.
 - First mention of the concept of six degrees of separation
- Has entered popular culture
 - John Guare's play of the same name
 - Kevin Bacon
 - Erdős number (<http://www.oakland.edu/enp/>)



Six Degrees of Kevin Bacon

- Is Kevin Bacon the best B-actor of all time; or
- Does he represent a fundamental property of human social systems?

- <https://oracleofbacon.org>



Sociometry

- Jacob Moreno, 1934, psychiatrist by training
 - Interested in investigating how psychological well-being was related to the structural features of what he termed 'social configurations'
- Invented a new way of representing relationships on paper, called a *sociogram*
- Founded the journal *Sociometry*

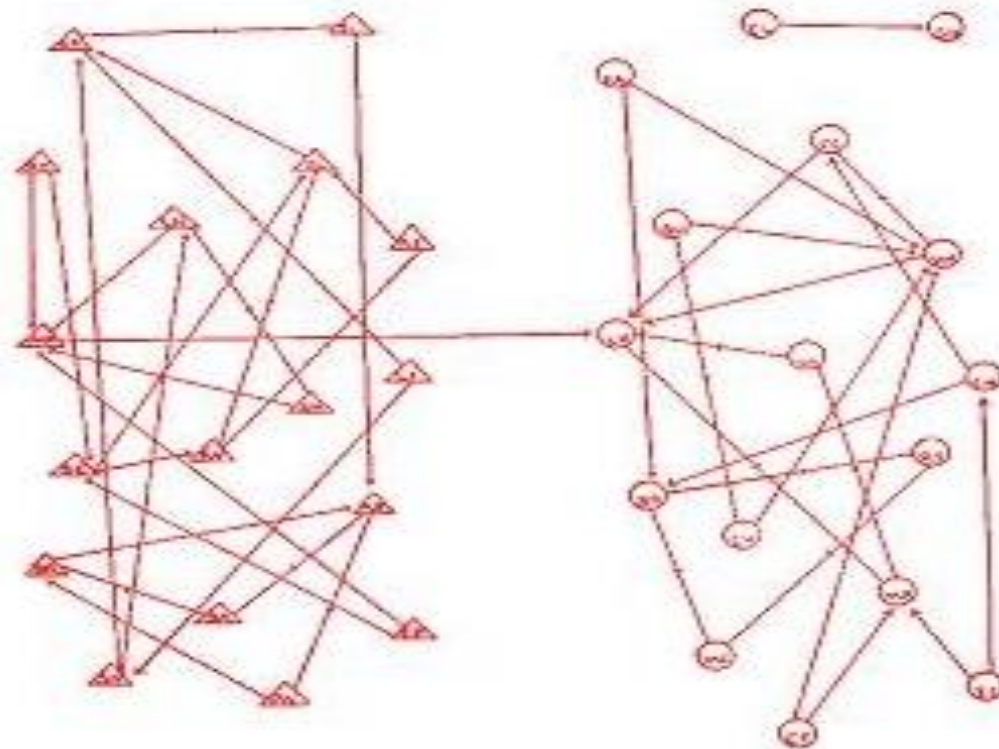


Example of Moreno sociogram

EMOTIONS MAPPED BY NEW GEOGRAPHY

Charts Seek to Portray the
Psychological Currents of
Human Relationships.

New York Times
April 3, 1933

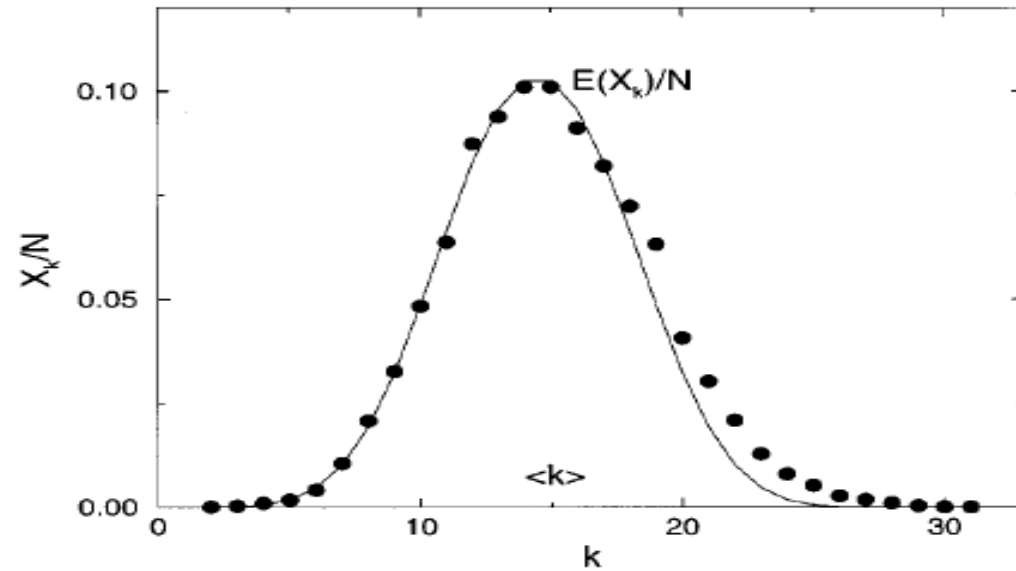
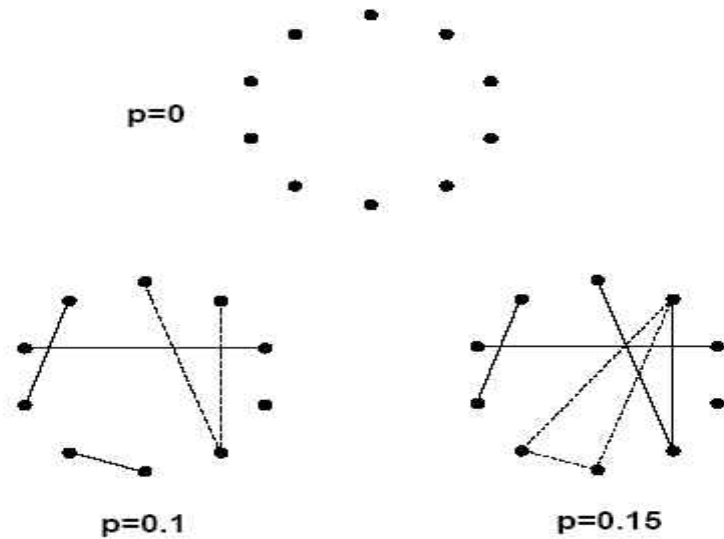


Math 1 - Random graphs

- Erdős-Renyi random graphs
- Random graph - take a set of nodes (vertices), and randomly connect pairs of vertices with ties (edges)
 - Important finding - only a small percentage of pairs need to be randomly connected before the entire graph is connected, and this percentage goes down as the network gets larger
 - E.g., for the Earth's population, people only need to have around 24 connections to have the entire planet included in one social network



Erdos-Renyi random graphs

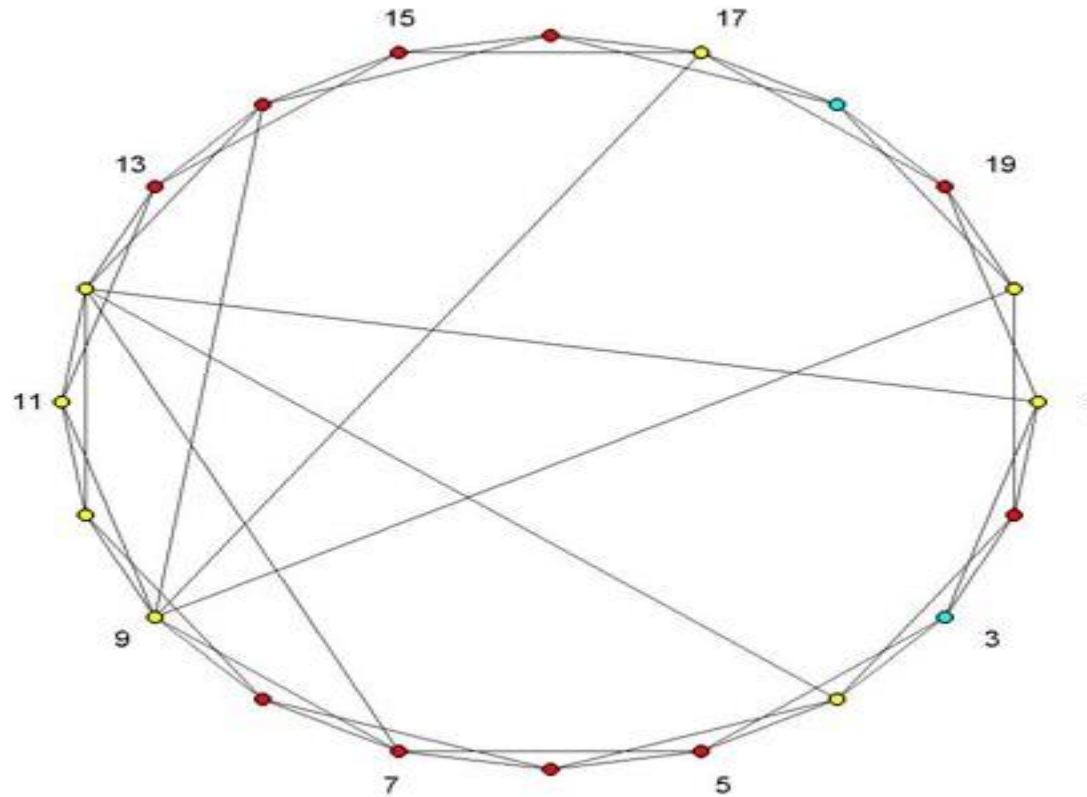


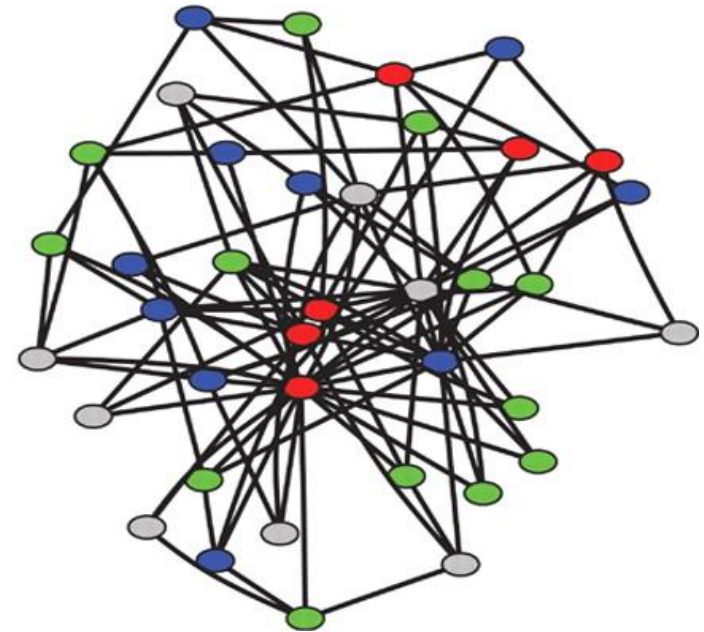
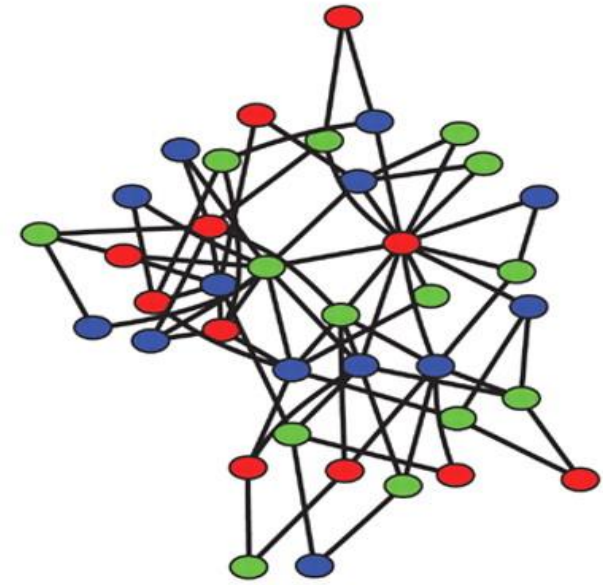
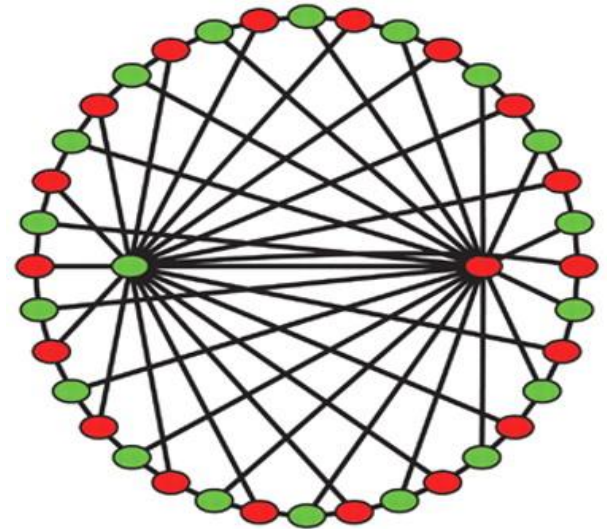
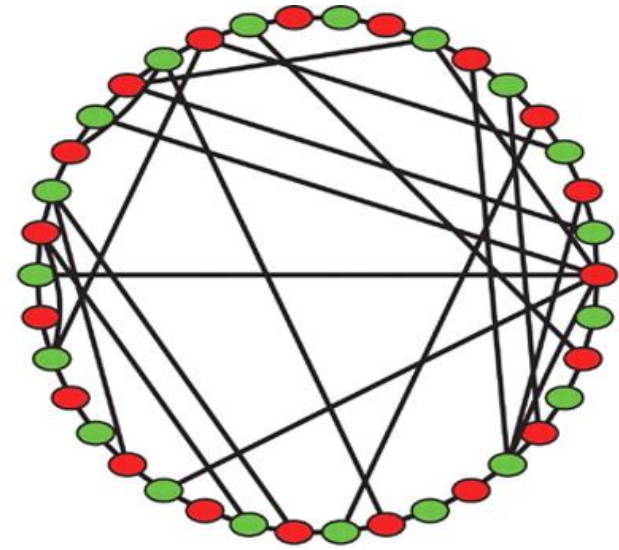
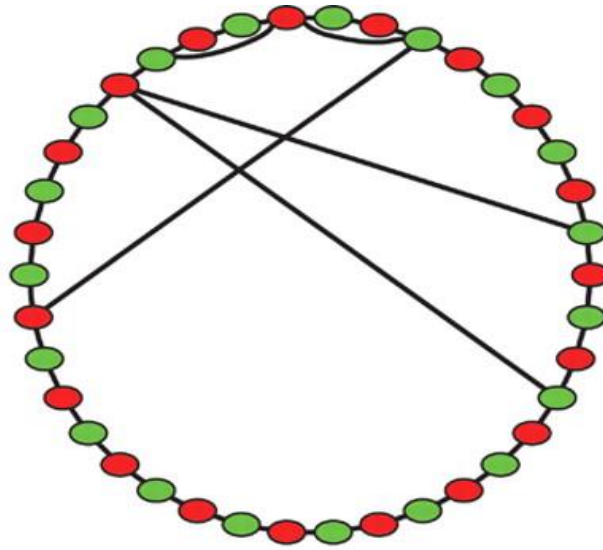
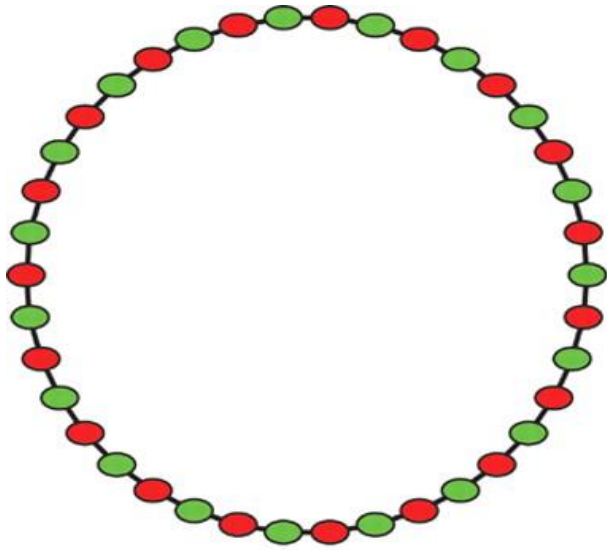
Math 2 - Small-world model

- Watts, Strogatz - mathematicians trying to understand how large, widely distributed networks could show coordinated activity
 - e.g., firing neurons, chirping crickets, clapping crowds
- Discovered that large structured networks suddenly exhibit ‘small-world’ properties when a small number of random ties are added to the structured network



Example - small world network



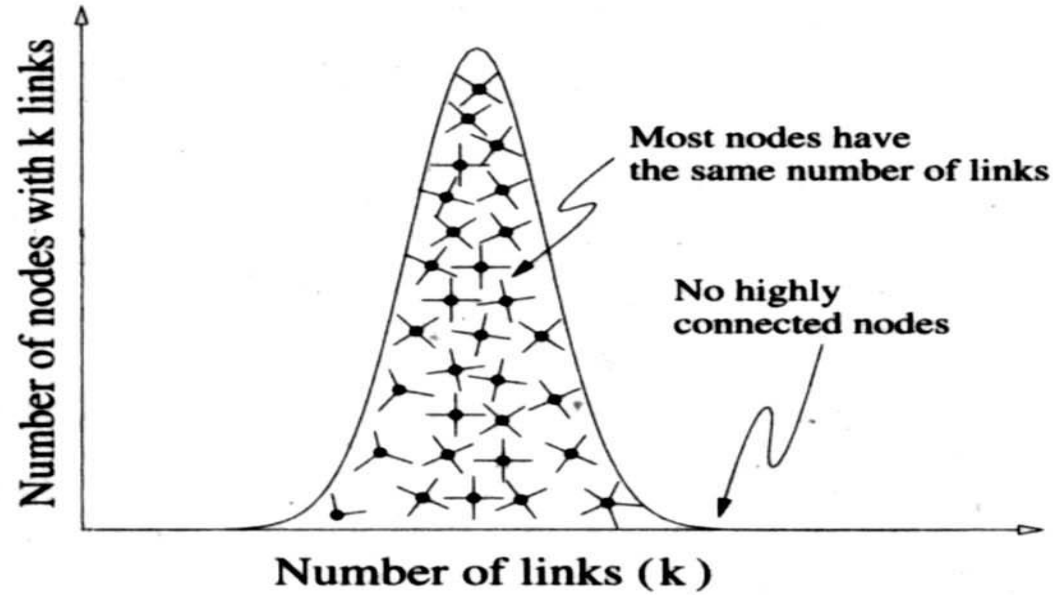


Math 3 - Scale-free networks

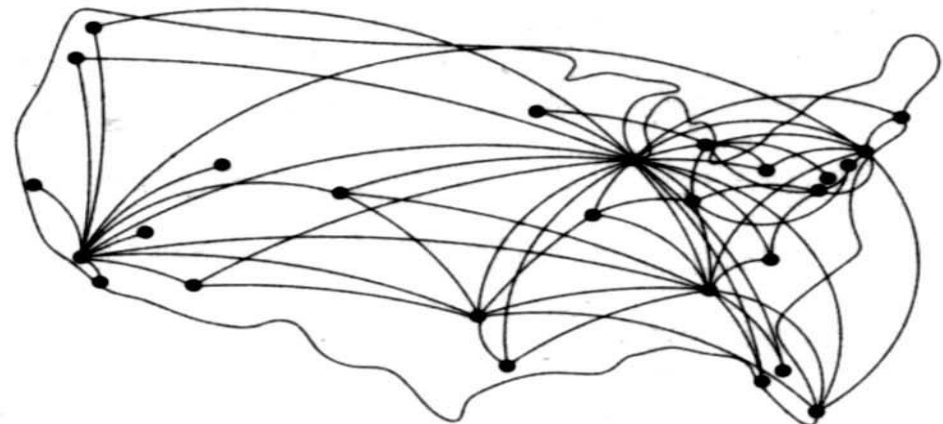
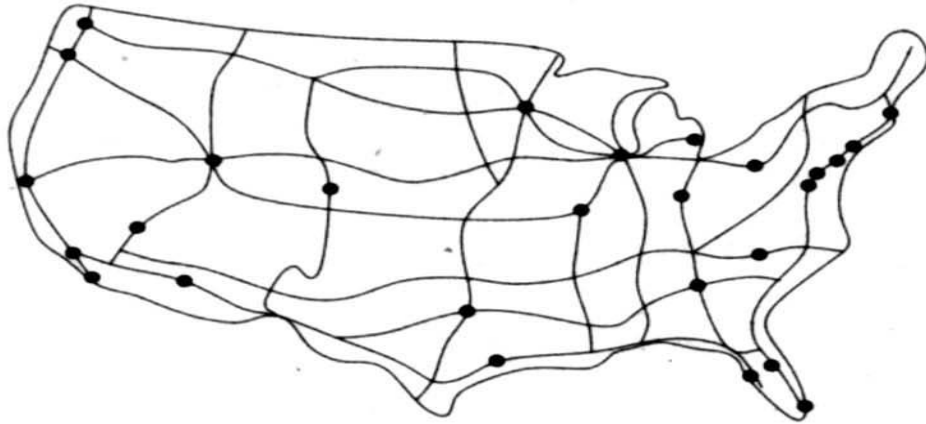
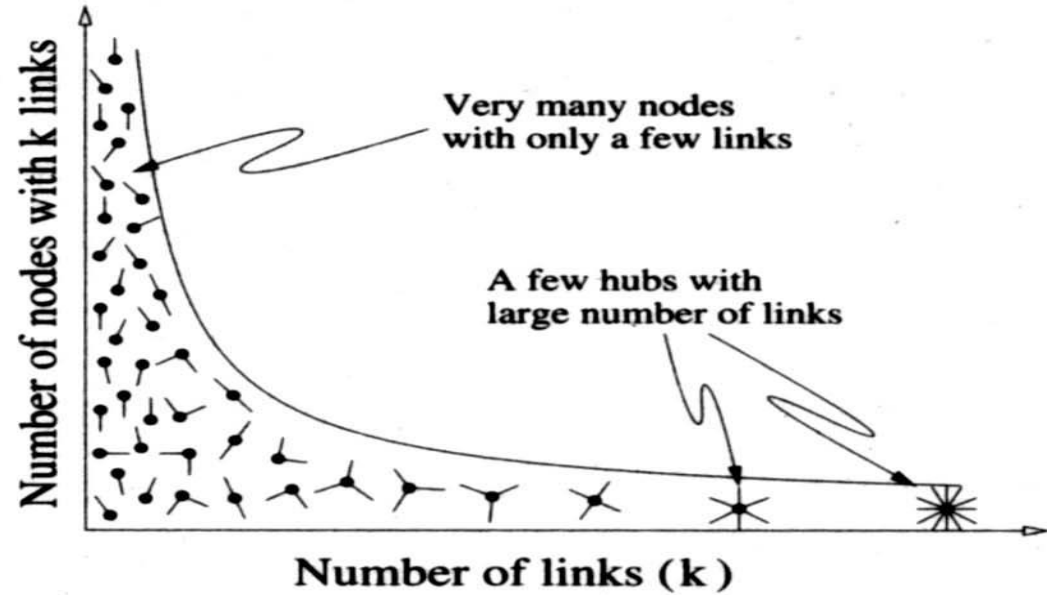
- Distribution of node degree follows a power law (scale free)
- Current understanding is that many networks grow according to a process of cumulative advantage ('rich get richer'), this leads to the distinctive power law relationship



Bell Curve



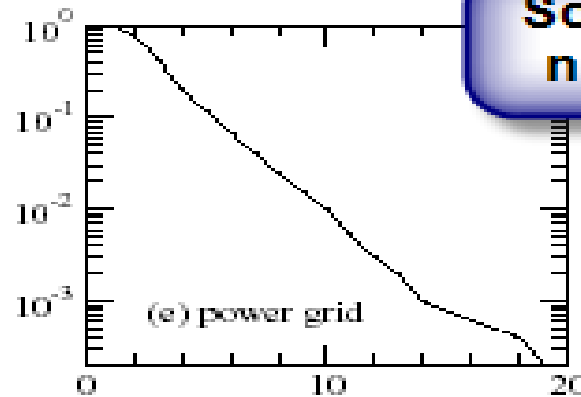
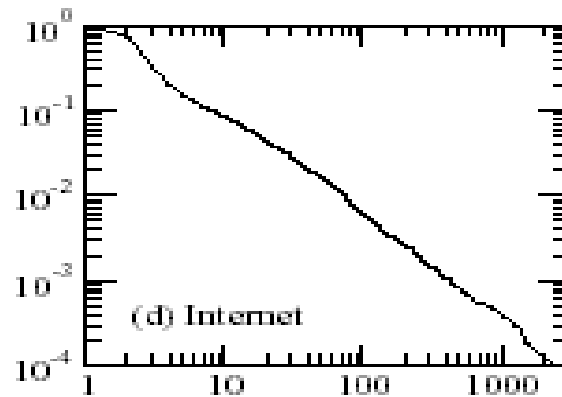
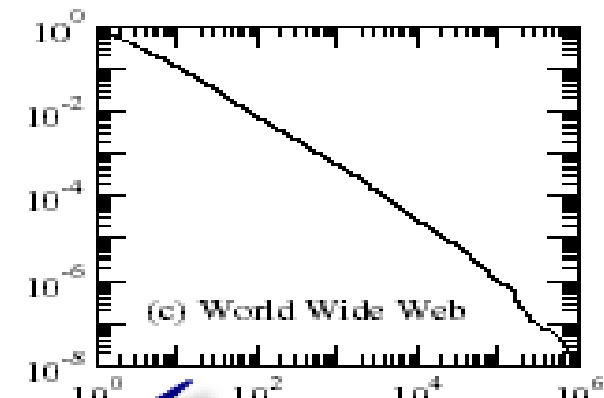
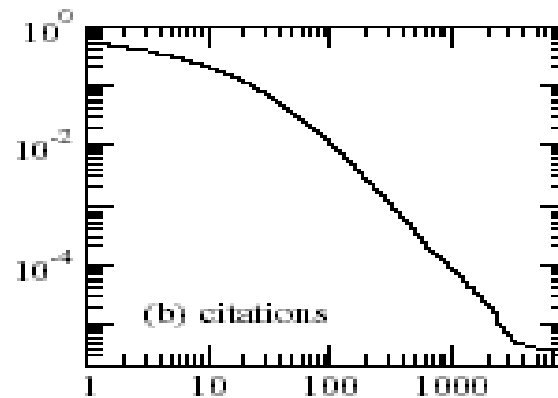
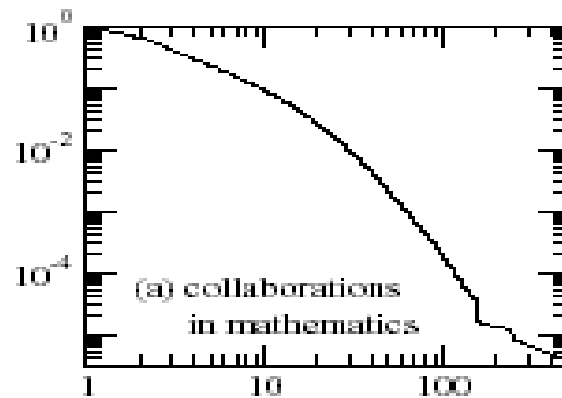
Power Law Distribution



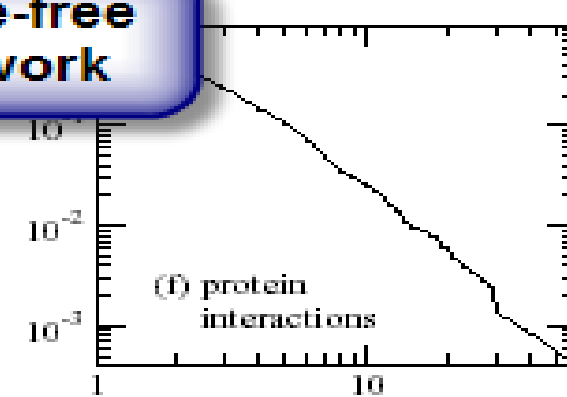
Reprinted from *Linked: The New Science of Networks* by Albert-Laszlo Barabasi



Degree distributions for some real networks



**Scale-free
network**



From Newman (2003)



Sex is scale-free

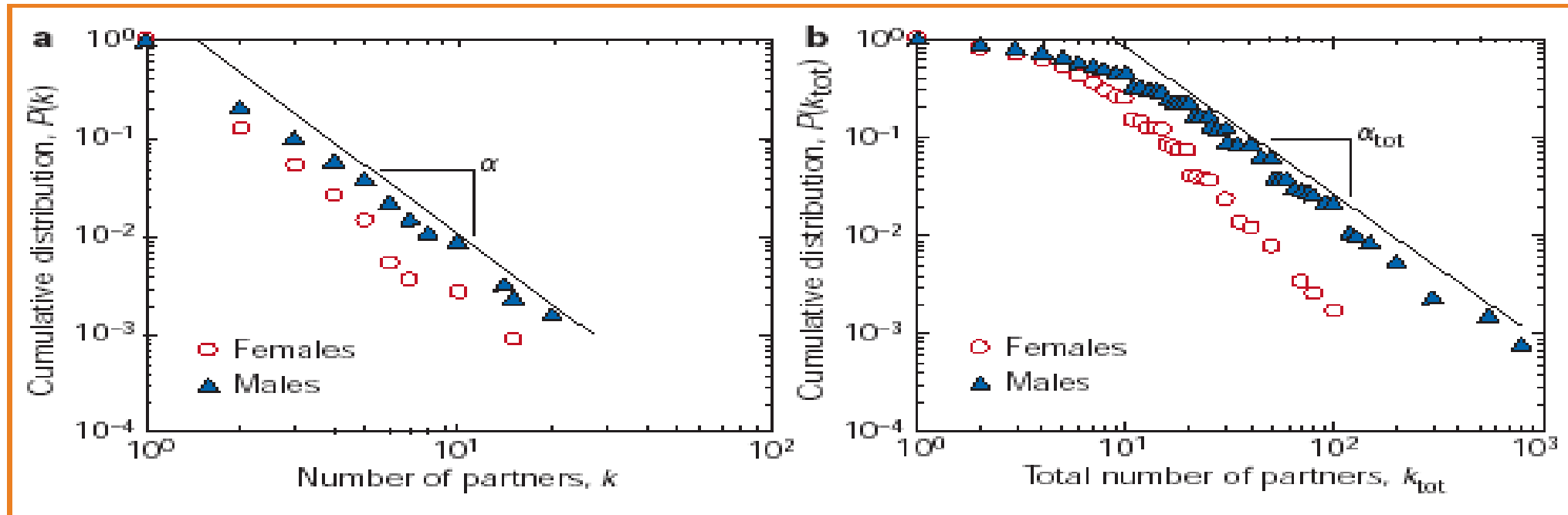


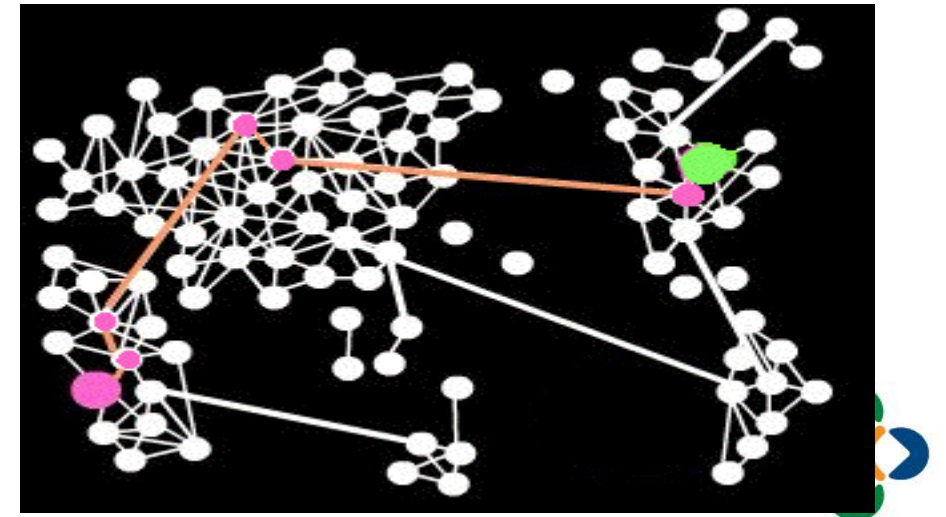
Figure 2 Scale-free distribution of the number of sexual partners for females and males. **a**, Distribution of number of partners, k , in the previous 12 months. Note the larger average number of partners for male respondents: this difference may be due to 'measurement bias' — social expectations may lead males to inflate their reported number of sexual partners. Note that the distributions are both linear, indicating scale-free power-law behaviour. Moreover, the two curves are roughly parallel, indicating similar scaling exponents. For females, $\alpha = 2.54 \pm 0.2$ in the range $k > 4$, and for males, $\alpha = 2.31 \pm 0.2$ in the range $k > 5$. **b**, Distribution of the total number of partners k_{tot} over respondents' entire lifetimes. For females, $\alpha_{\text{tot}} = 2.1 \pm 0.3$ in the range $k_{\text{tot}} > 20$, and for males, $\alpha_{\text{tot}} = 1.6 \pm 0.3$ in the range $20 < k_{\text{tot}} < 400$. Estimates for females and males agree within statistical uncertainty.

From Liljeros, et al. (2001). The web of human sexual contacts.
Nature, 411, 907-908.



Milgram - Test of *Six Degrees*

- Stanley Milgram performed first formal study of the *Six Degrees* idea
 - Asked strangers to try to send a letter to a particular person in Boston
 - "If you do not know the target person on a personal basis, do not try to contact him directly. Instead, mail this folder to a personal acquaintance who is more likely than you to know the target person."
 - Found that most letters arrived taking around six steps (median 5.5).
 - Results have been critiqued, but replicated.



Net picture from Logan Scott

Granovetter - *Strength of weak ties*

- Are you more likely to find a job by asking a close personal friend, or by asking a casual acquaintance?
 - Mark Granovetter discovered that connections with acquaintances or distant contacts were more important for finding a job. Strong connections between close friends and colleagues are less likely to lead to new information.
 - *Strength of Weak Ties* one of the most cited articles in sociology



Modern history

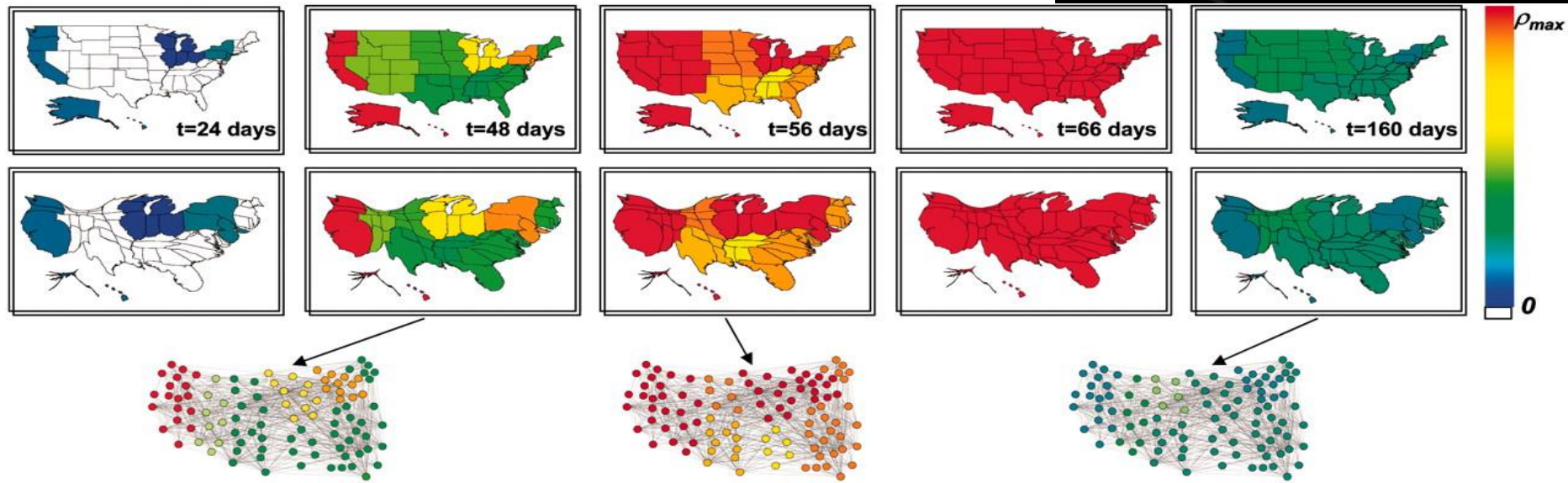
- Computer methods: algorithms, software, visualization, large-scale databases
- Physics rediscovers network analysis
- Interest in very large networks
- Integration of network analysis into statistical theory



Geographical representation of the disease evolution in the United States for an epidemics starting in Hong Kong based on a SIR dynamics within each city.



MICHAEL MARKIETA/ARUP



Tipping point

- Paradigm shift, networks enters into mainstream consciousness
- Kevin Bacon, Six Degrees
- Role of the Internet
 - Amazon
 - MySpace, Facebook, Instagram
- Networks seen as way to understand (and change) terrorism, global warming, integrated circuit design, etc.



Ways to view network analysis

Social network analysis can be viewed as a methodology, and set of theories, a paradigm, and as a discipline



Theories of networks

- Development of theories explaining network formation, network structure, effects of networks on individuals, etc.
- Example, social science theories of communication networks (Monge & Contractor, 2003)
 - Self-interest & collective action
 - Contagion
 - Cognitive
 - Exchange, dependency
 - Homophily, proximity
 - Social support
 - Evolutionary



Ways to view network theory

- Connected to, but distinct from many social science theories
 - See <http://lrs.ed.uiuc.edu/tse-portal/analysis/social-network-analysis/#network%20theories>
- Networks as predictors, networks as outcomes, co-evolution of network structure and (health) behavior
- Simple example from Contractor
 - It is *who* you know...
 - It is what *who* you know *knows*...
 - It is what you *think* *who* you know knows...



Network analysis as a paradigm

- Paradigm in the Kuhnian sense
- Paradigmatic lenses for network analysis
 - Reductionism vs. holism
 - Individual (survey) approach vs. social groups, contexts
 - Linear science vs. systems science



SNA as a discipline

- Characteristics of field (Freeman, 2004)
 - Social network analysis is motivated by a structural intuition based on ties linking social actors
 - It is grounded in systematic empirical data
 - It draws heavily on graphic imagery
 - It relies on the use of mathematical and/or computational models
- Distinctive theories and methods



Professional organizations & outlets

- Professional organization
 - International Network of Social Network Analysis
 - <http://www.insna.org>
- Scientific outlets
 - *Social Networks*
 - *Connections*
 - Sunbelt International Social Network Conference

