

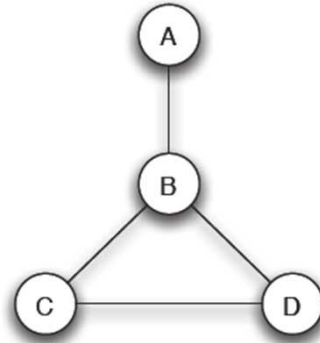
Graphs

Objectives

- Study of network structure
- Basic ideas behind graph theory
- Formulate basic network properties in a unifying language
- Some fundamental applications of the definitions

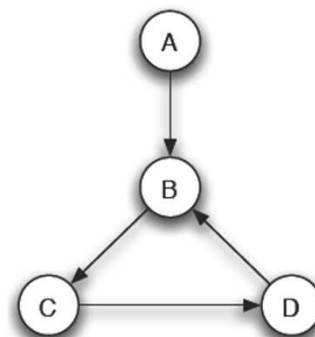
Definitions

- A **graph** is a way of specifying relationships among a collection of items
- A graph consists of a:
 - set of objects, called **nodes**,
 - with certain pairs of these objects connected by links called **edges**

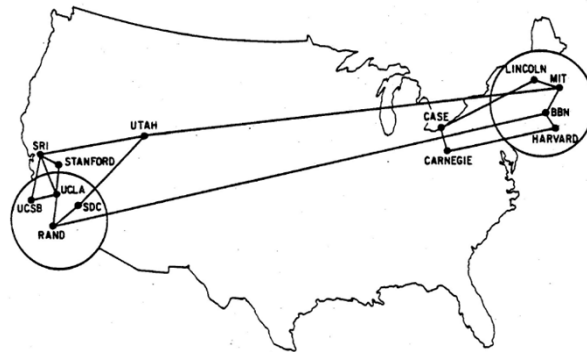


Definitions

- In many settings we want **asymmetric** relationships
 - Ex: *A* points to *B* but not vice versa
- A **directed graph** consists of:
 - a set of **nodes** (as before),
 - together with a set of **directed edges**
 - each directed edge is a link from one node to another (direction being important)



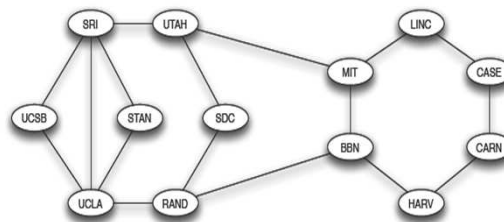
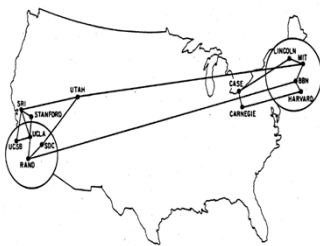
Graphs as Models of Networks



<http://som.csudh.edu/cis/lpress/history/arpamaps>

- The network structure of the Internet (then called the Arpanet) in 1970
 - 13 nodes represent computing hosts, edges joining when direct communication link

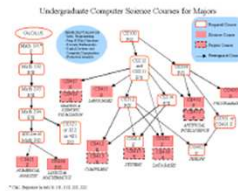
Graphs as Models of Networks



- The actual placement of nodes is immaterial
- All that matters is which nodes are linked to which others

Graphs as Models of Networks

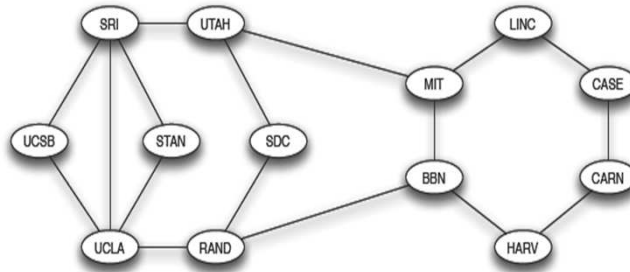
- Graphs appear in many domains
 - In previous lecture we saw examples from social networks, information networks (Web pages), etc.



Paths

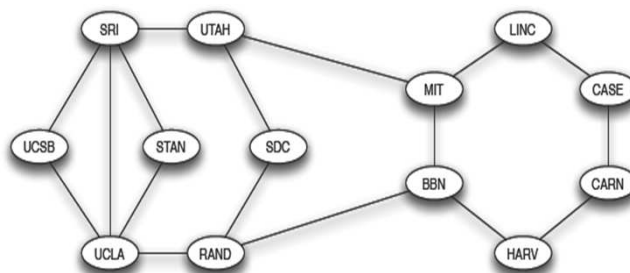
- Travel across the edges of a graph, moving from
- node to node in sequence
 - Ex: a passenger taking a sequence of airline flights
 - a piece of information being passed from person to person in a social network,
 - a computer user or piece of software visiting a sequence of Web pages by following links
- A path is simply a sequence of nodes with the property that each consecutive pair in the sequence is connected by an edge

Paths



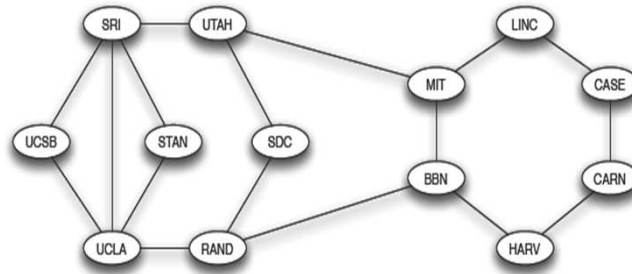
- MIT, BBN, RAND, UCLA is a **(simple) path**
- **SRI, STAN, UCLA, SRI, UTAH, MIT** is a path with **repeated nodes**
- **SRI, STAN, UCLA, SRI, UCSB, UCLA, SRI** is a path with **repeated nodes and edges**

Cycles



- A “ring” structure
 - Ex: LINC, CASE, CARN, HARV, BBN, MIT, LINC
- A cycle is:
 - a path with at least three edges,
 - in which the **first and last nodes** are the **same**,
 - but otherwise all nodes are **distinct**

Cycles



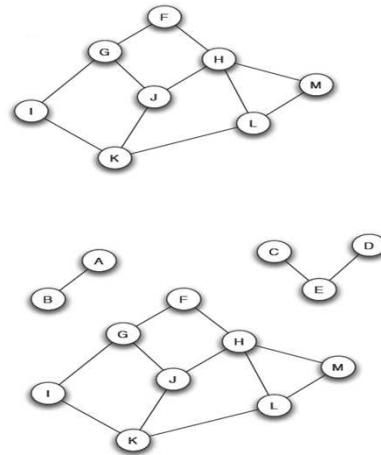
- Notice: every edge in 1970 Arpanet belongs to a cycle
- This was by design:
 - if any edge were to fail there would still be a way to get from any node to any other node

Cycles

- Communication and transportation networks often contain (by design) cycles
 - allow for redundancy and provide for alternate routings that go the “other way” around the cycle
- In the social network of friendships we notice cycles in everyday life
- Ex: your wife’s cousin’s close friend from high school is in fact someone who works with your brother
 - This is a cycle: you, your wife, her cousin, his high-school-friend, your brother), you

Connectivity

- Does every node can reach every other node by a path?
- A graph is **connected**, if for every pair of nodes, there is a path between them
- Otherwise is called **disconnected**

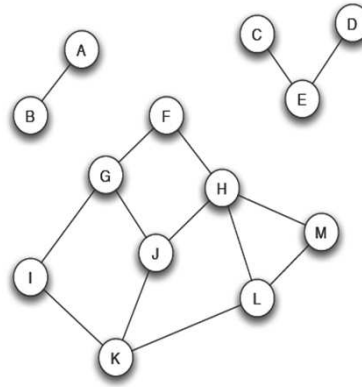


Connectivity

- the 13-node Arpanet graph is connected
- Most communication and transportation networks are connected
 - their goal is to move traffic from one node to another
- In a social network, there might exist people for which it's not possible to construct a path from one to the other

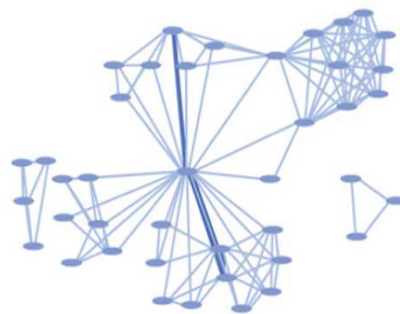
Components

- Connected component of a graph: a subset of the nodes such that
 - (i) every node in the subset has a **path to every other**; and
 - (ii) the subset is **not part** of some larger set with the property that every node can reach every other
- Ex:
 - 3 components in figure
 - {F, G, H, J} not a component, violates part (ii)



Components

- Graph components: a first, global way of describing its structure
- Within a given component, there may be richer internal structure that is important
- Ex (figure):
 - a prominent node (**gatekeeper**) at the center (the largest connected component would break apart into three distinct components if this node were removed)
 - tightly-knit groups linked to this node but not to each other
 - More in details in next lecture



The collaboration (co-authorship) graph of the biological research center *Structural Genomics of Pathogenic Protozoa*

Giant Components

You are in one of many components

- Thought experiment
 - social network of the entire world
 - a link between two people if they know each other
- Is this graph connected?
 - Presumably not (we don't have this graph)
 - a single person with no living friends would constitute a one-node component



Your component is giant

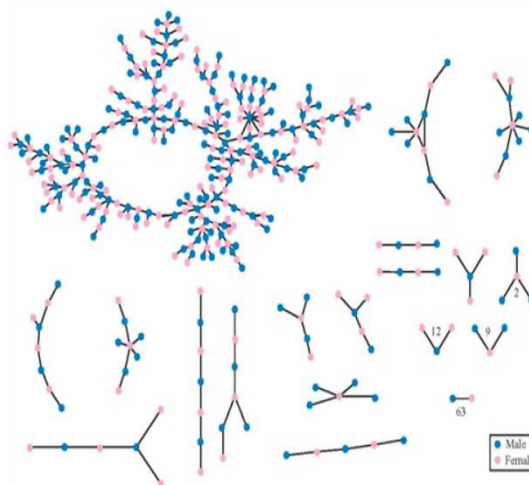
- You have friends in other countries
- Consider the parents of these friends, their friends, their friends etc.
- All these people in the same component
 - People who have never heard of you,
 - may well not share a language with you,
 - May have never traveled anywhere near where you live, and
 - may have had enormously different life experiences

Giant Components

- Large, complex networks often have what is called a giant component
 - contains a significant fraction of all the nodes
 - almost always contains **only one** giant component
 - All it would take is a single edge and the two giant components would merge
- Examples of merging:
 - half a millenium ago European explorers began arriving in America
 - technology and diseases of one quickly and disastrously overwhelmed the other

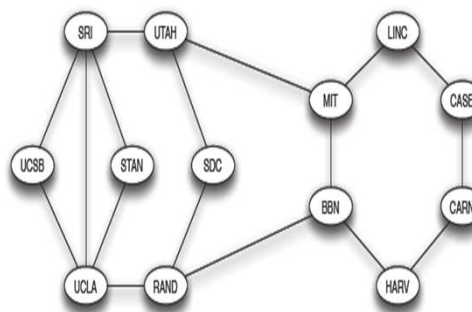
Giant Components

- Ex (figure):
 - Nodes are students in a large American high school
 - Edge joins two with romantic relationship at some point during a 18-month period (not all present at once)
- Graph contains large component
 - spread of sexually transmitted diseases
 - many paths of potential transmission



Distance

- In addition to asking whether two nodes are connected by a path, it is also interesting to ask how long such a path is
 - transportation, Internet communication, or the spread of news and diseases
- **Length** of a path:
 - number of steps it contains from beginning to end
 - Ex (figure):
 - (MIT, BBN, RAND, UCLA) has length 3
- **Distance** between two nodes:
 - the length of the shortest path between them
 - Ex (figure):
 - the distance between LINC and SRI is 3

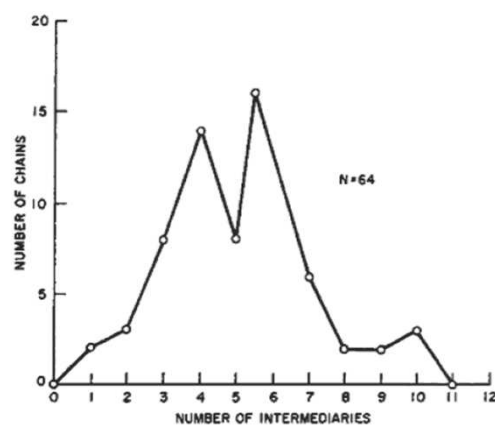


The Small-World Phenomenon

- Return to thought experiment (global social network)
 - not only do you have paths of friends connecting you to a large fraction of the world's population (giant component),
 - but these paths are surprisingly short (small distance)
 - Ex:
 - friends in another country, their parents, their friends
 - in three steps ended up in a different part of the world, in a different generation
- The small-world phenomenon:
 - the idea that the world looks “small” when you think of how short a path of friends it takes to get from you to almost anyone else
 - social networks tend to have very short paths between essentially arbitrary pairs of people

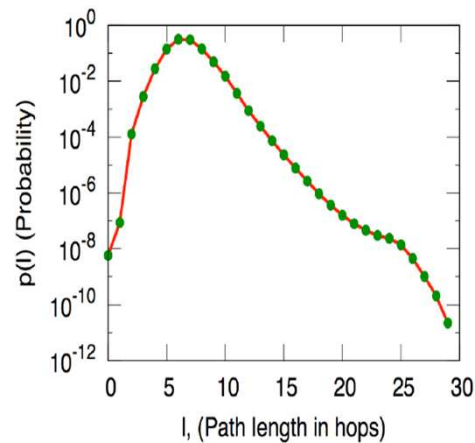
“Six degrees of separation”

- Experiment by Stanley Milgram (1960)
 - Budget \$680
 - 296 randomly chosen “starters”
- Figure: distribution of path lengths (64 chains succeeded)
- Caveats:
 - small set of people
 - only 64 made it
 - even if you can reach someone, is this useful to you?
 - But: potential speed with which information, diseases, and other kinds of contagion can spread through society

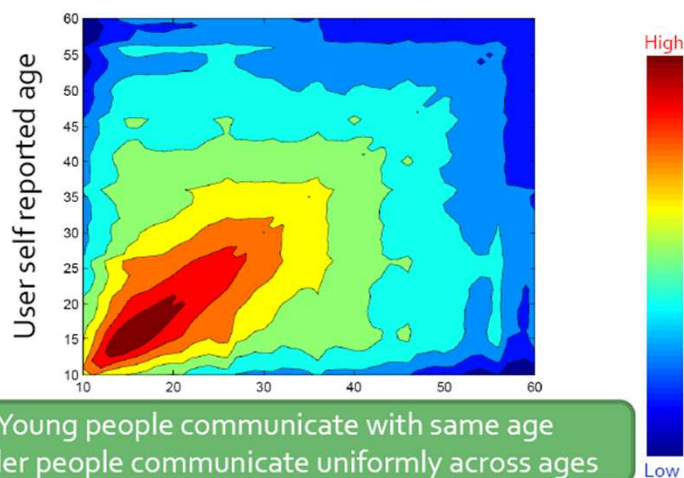


Instant Messaging

- Experiment by Leskovec and Horvitz
 - 240 million active user accounts on Microsoft Instant Messenger
 - edge between two users if they engaged in a two-way conversation at any point during a month-long observation period
 - Graph had a giant component
 - Distances within this giant component were very small (average distance of 6.6)



Instant Messaging

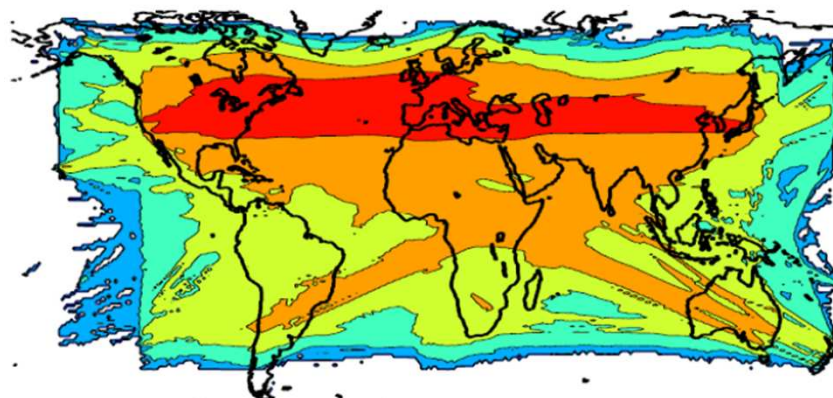


Instant Messaging

- Is gender communication biased?
 - **Homophily:** Do female talk more among themselves?
 - **Heterophily:** Do male-female conversations took longer?
- **Findings:**
 - Num. of. conversations is not biased (follows chance)
 - Cross-gender conversations take longer and are more intense (more attention invested)



Instant Messaging



For each conversation between geo points (A,B) we increase the intensity on the line between A and B

Erdős Number

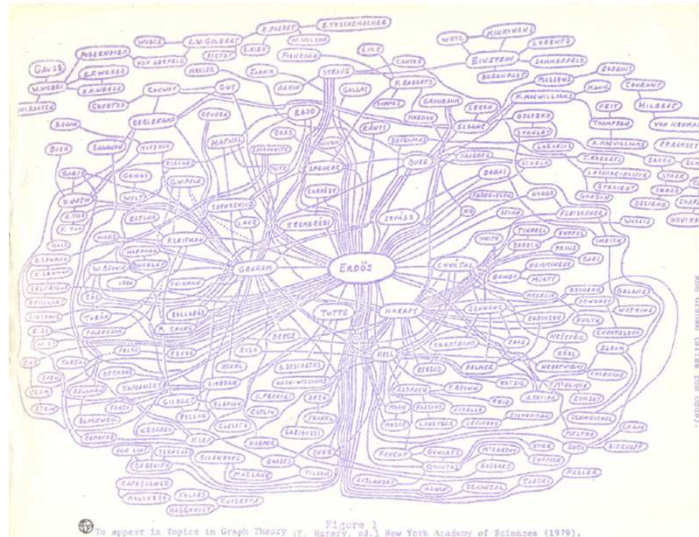


Figure 3
To appear in: Topics in Graph Theory II, Harveys, ed. 3, New York Academy of Sciences (1978).
<http://www.oakland.edu/enp/cgraph.jpg>