# Lecture 2: Network types and individual properties

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#### **Actors & relations**

- Actors (nodes, vertices)
  - People, groups, organizations, communities, nation-states
- Relations (links, ties, edges)
  - Evaluations of one person by another (friendship, liking, ...)
  - Transfers of material resources (lending, donations, ...)
  - Association or affiliation (membership, attendance, ...)
  - Behavioral interaction (communication, intercourse, ...)
  - Movement between places or statuses (migration, mobility, ...)
  - Physical connections (roads, routers, ...)
  - Formal relations (authority, supply chain, ...)
  - Biological relations (kinship, descent, ...)



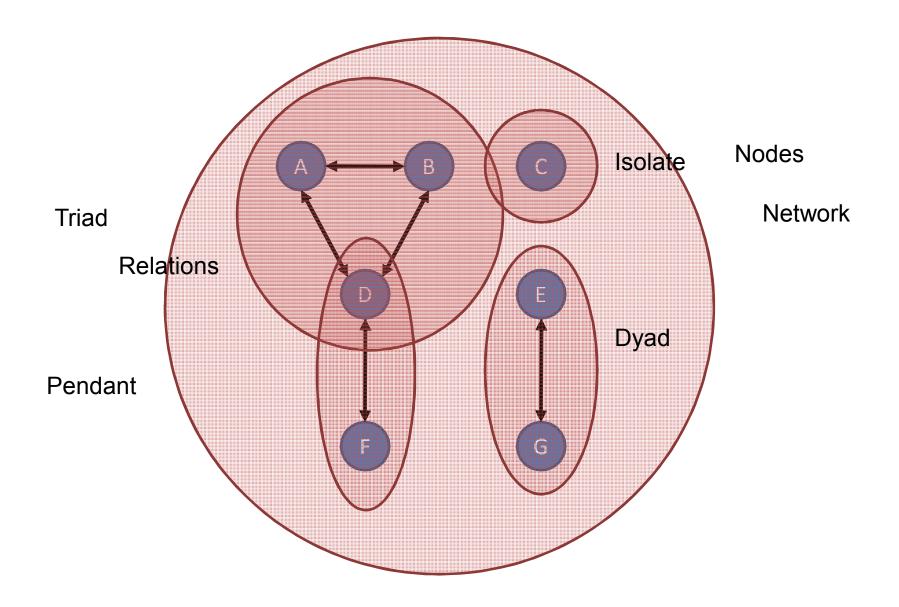


## **Groups & components**

- A network is a set of nodes and collection of links between these nodes
- Networks do not need to be completelyconnected
- Component: Connected subset of network nodes and links











## Sociomatrix

	A	В	С	D	Е	F	G
Α	-	1	0	1	0	0	0
В	1	-	0	1	0	0	0
С	0	0 Ch	nas <u>no</u> relat	ionships w	ith A <b>,®</b> ,D,E,	F O	0
D	1	1	0	-	0	1	0
Е	0	0	0	0	-	0	1
F	F(has a	relat <b>()</b> nshi	p wit <b>()</b> D	1	0	-	0
G	0	0	0	0	1	0	-



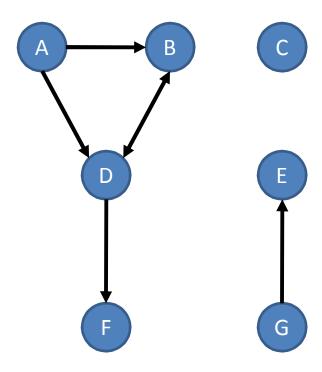


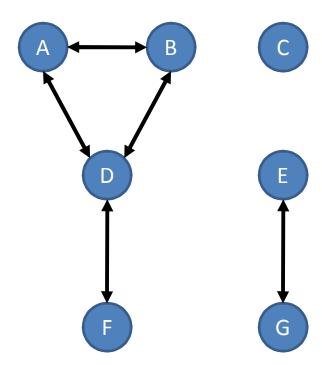
### Directed & undirected

• Communication vs. friendship networks

twitter











## Undirected sociomatrix

	A	В	С	D	Е	F	G
A	-	etric1	0	1	0	0	0
В	1 Symr	-	0	1	0	0	0
С	0	0	_	netria o	0	0	0
D	1	1	0 Sym	-	0	1	0
E	0	0	0	0	-	0	1
F	0	0	0	1	0 /	Symmetric	0
G	0	0	0	0	1	0	-





## Directed sociomatrix

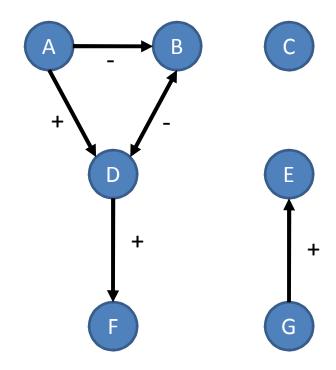
	A	В	С	D	Е	F	G
A	-	nmetric 1	0	1	0	0	0
В	Onsw	-	0	1	0	0	0
С	0	0	_	metric 0	0	0	0
D	0	1	Onushu	-	0	1	0
E	0	0	0	0	-	0	0
F	0	0	0	0	0 /	Unsymmetric	0
G	0	0	0	0	1	0	-

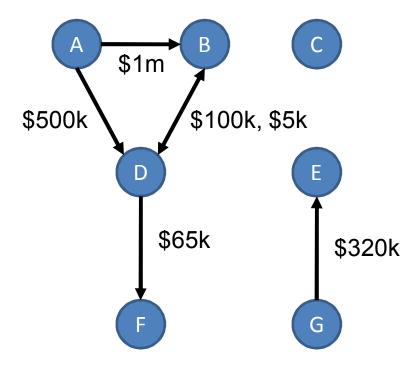




## Signed & valued

Affect in a sorority vs. campaign financing



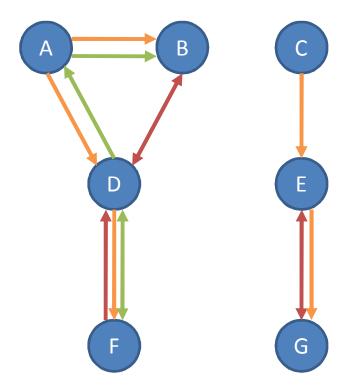






## Multi-relational

Organizations: authority, trust, & friendship

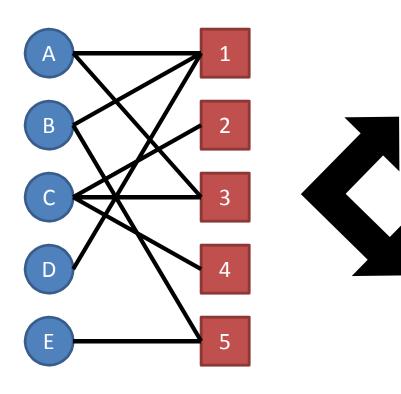


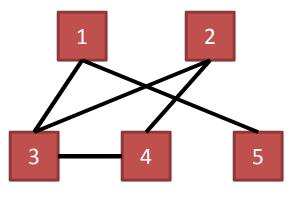


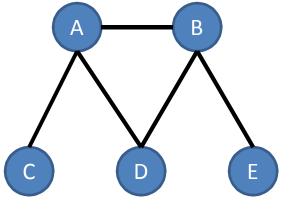


## One-mode & two-mode

- Actor-actor & actor-event
- Lobbyist & co-location networks





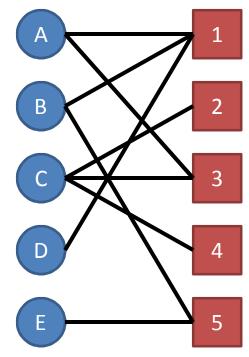






# Bipartite sociomatrix

	1	2	3	4	5	A
A	1	0	1	0	0	В
В	1	0	0	0	1	C
С	0	1	1	1	0	
D	1	0	0	0	0	D
E	0	0	0	0	1	E

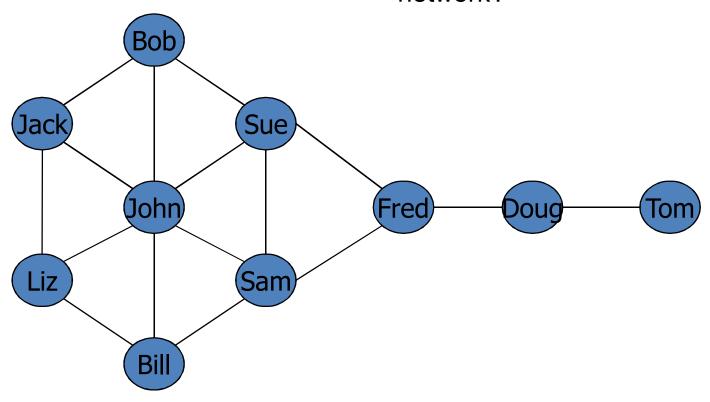






#### The Kite Network

Which actor is the *most important* in this network?







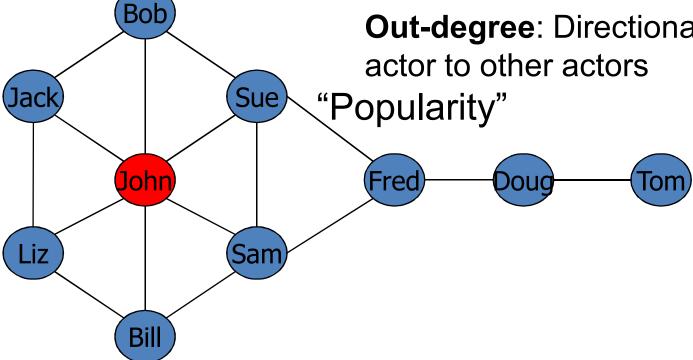
## Degree Centrality

Degree: total number of links with other actors

In-degree: Directional links to

actor from other actors

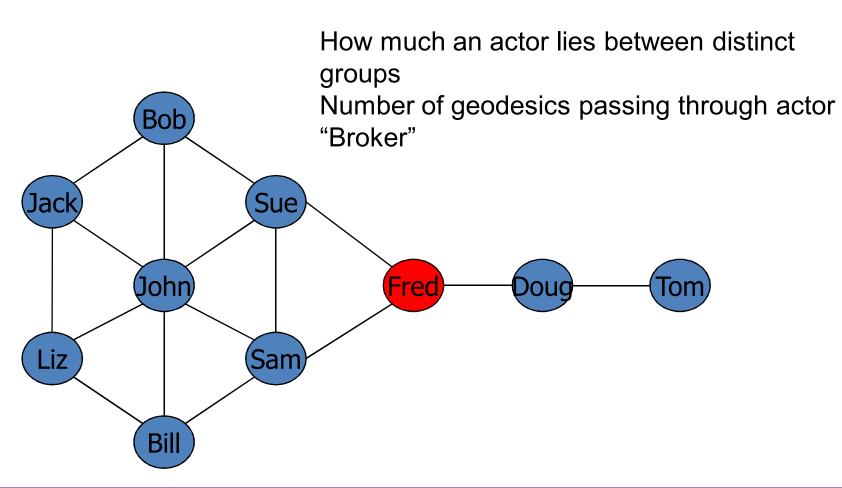
Out-degree: Directional links from







## **Betweenness Centrality**

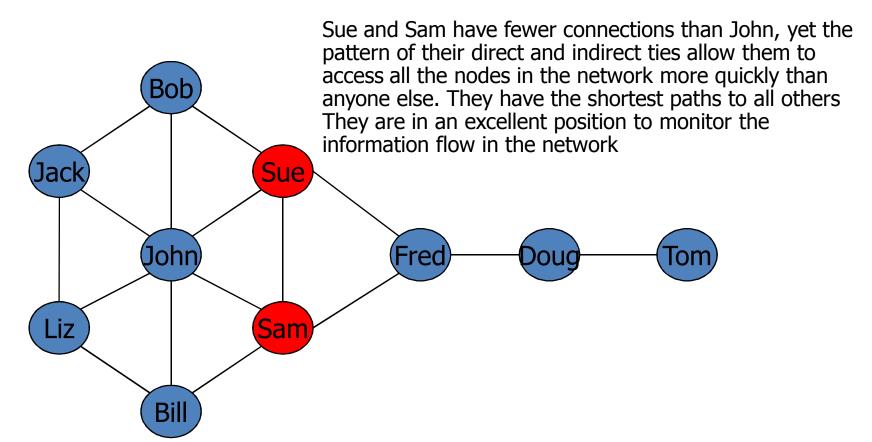






## **Closeness Centrality**

How easily one actor can reach rest of network Actor with shortest average path length "Pulse-taker"

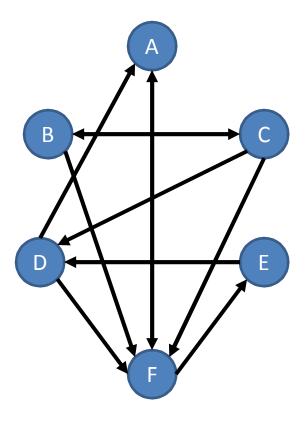






## Eigenvector centrality

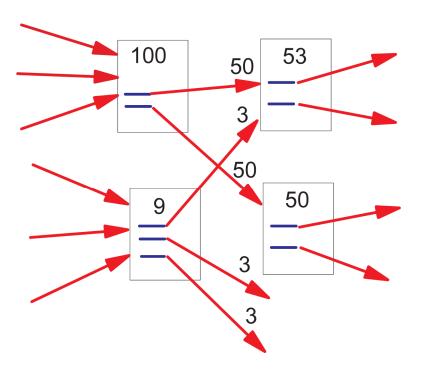
- A node's centrality is a function of its neighbors' centralities
  - Recompute each node's score as weighted sum of neighbors' centralities
- Highest between and\or degree central actor often have highest eigenvalue central actor, but not always the case with less central actors
  - Nodes B, C, E have equal in-degrees
  - Node E recommended by F, which has high in-degree
  - Nodes B & C only recommended by each other
  - E's eigenvalue > B & C's eigenvalues





## 1998 Stanford technical paper

"Unlike academic papers which are scrupulously reviewed, web pages proliferate free of quality control or publishing costs... Generally, highly linked pages are more "important" than pages with few links... If a web page has a link off the Yahoo home page, it may be just one link but it is a very important one. This page should be ranked higher than many pages with more links but from obscure places... We are able to order search results so that more important and central Web pages are given preference... [using] information external to the Web pages themselves - backlinks provide a kind of peer review."







#### The PageRank Citation Ranking: Bringing Order to the Web

January 29, 1998





Computer Networks and ISDN Systems 30 (1998) 107-117

The anatomy of a large-scale hypertextual Web search engine <sup>1</sup>



Sergey Brin<sup>2</sup>, Lawrence Page \*.2

Computer Science Department, Stanford University, Stanford, CA 94305, USA



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