

# **Network Analysis (contd ..)**

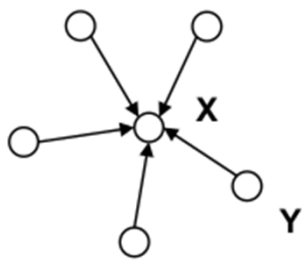
## **Centrality**

# Centrality

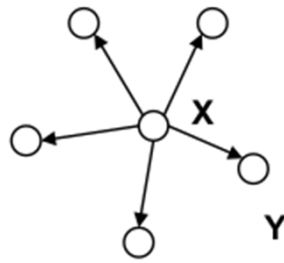
- A common goal in SNA (social network analysis) is to identify the “central” nodes of a network.
- What does “central” mean ?
  - ❖ active?
  - ❖ important?
  - ❖ non-redundant?

**Definition of ‘central’ varies by context/purpose.**

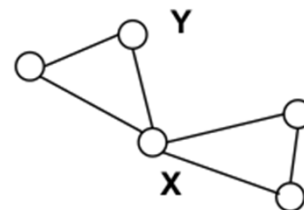
# Centrality: Who's Important Based On Their Network Position



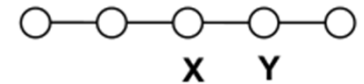
indegree



outdegree



betweenness



closeness

**In each of the above networks, X has higher centrality than Y according to a particular measure**

# Common centrality measures

- We will define and compare three centrality measures:
  - **Degree centrality (based on degree)**
  - **Betweenness centrality (based on geodesics)**
  - **Closeness centrality (based on average distances)**

# Degree Centrality

**Idea: A central actor is one with many connections.**

- Undirected degree centrality ( number of edges connecting to the node )
- Indegree centrality ( number of edges coming into the node)
- Outdegree centrality (number of edges coming out of the node )

**Degree Centrality is a best measure when number of connections is important**

# Indegree and Outdegree

## Which countries have high indegree?

- USA
- Japan
- UK

**Indicates more imports to above countries**

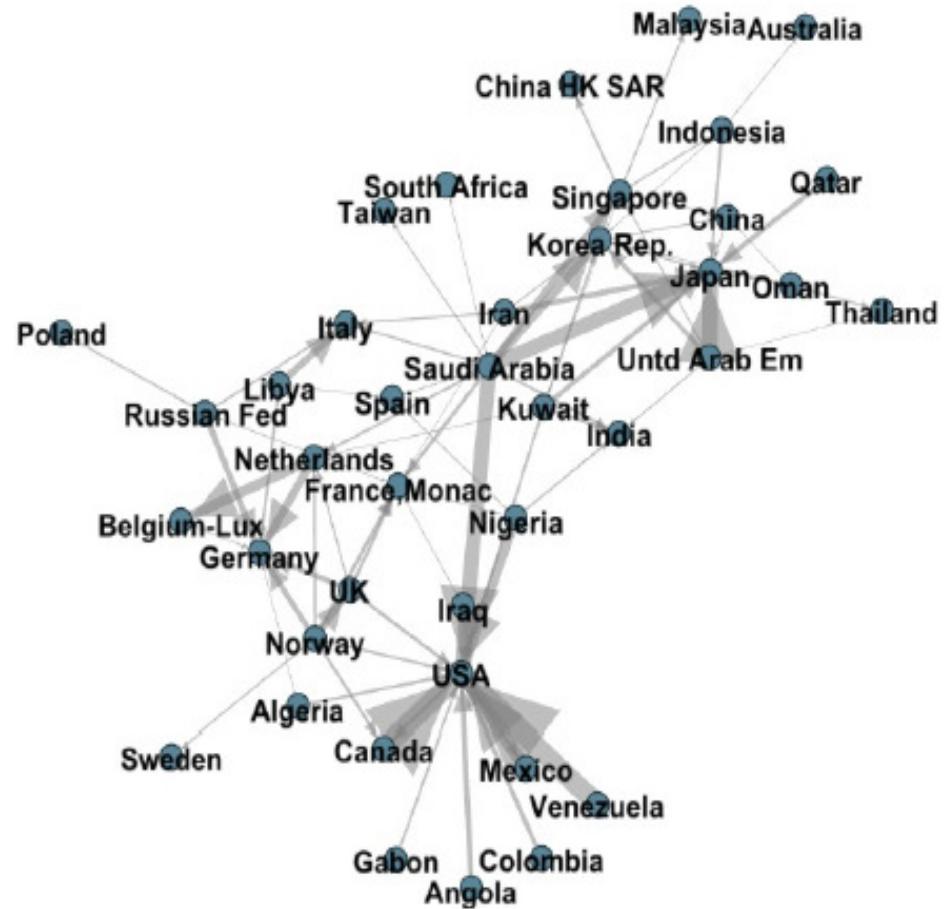
## Which country has high outdegree

- Saudi Arabia

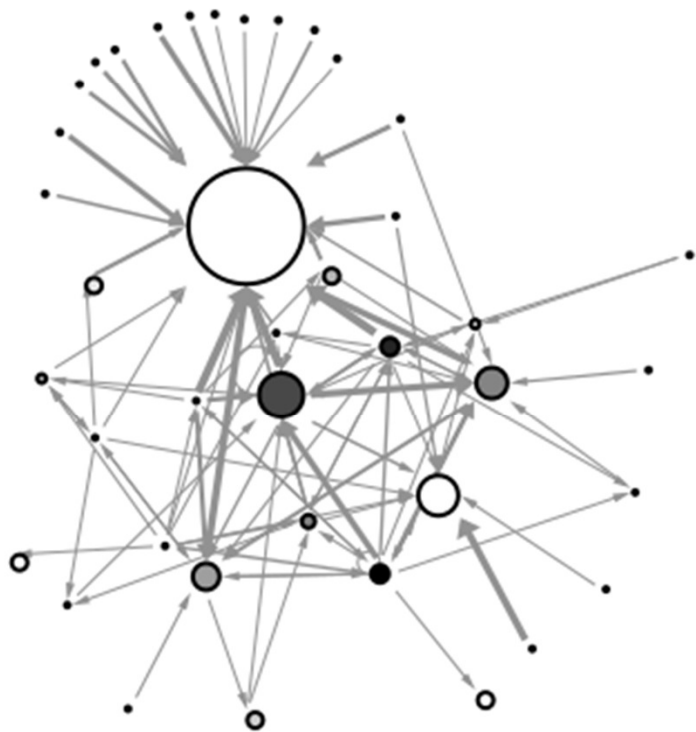
**Indicates more exports from Saudi Arabia**

## Trade in petroleum 1998

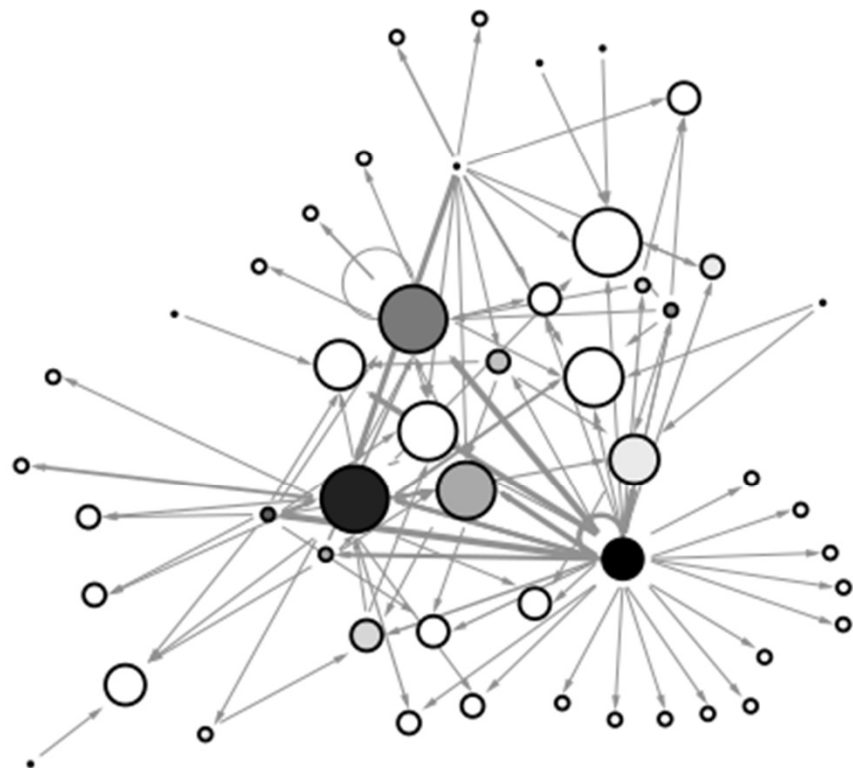
**Source :NBER---United Nations Trade Data**



## example financial trading networks



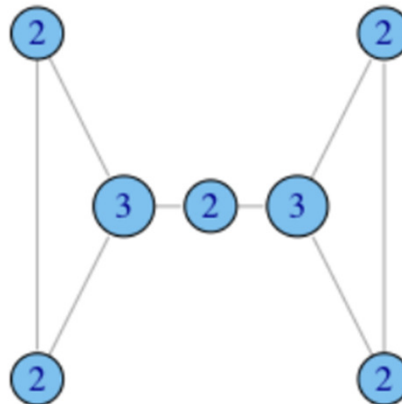
high centralization: one  
node trading with many  
others



low centralization: trades  
are more evenly distributed

# In What Contexts May Degree Be Insufficient To Describe Centrality?

- Ability to broker between groups
- Likelihood that information originating anywhere in the network reaches you...





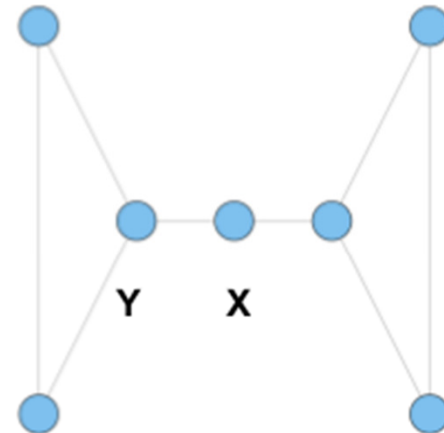
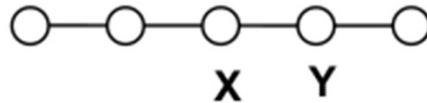
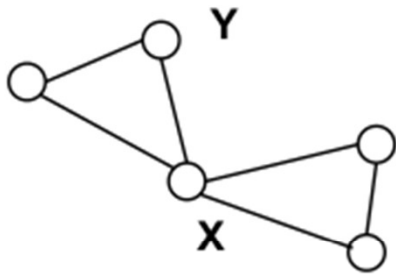
# Betweenness Centrality

- Betweenness centrality quantifies the number of times a node acts as a bridge along path between two other nodes.
- Betweenness Centrality =
- 

$$C_B(i) = \sum_{j < k} g_{jk}(i) / g_{jk}$$

- Where  $g_{jk}$  = the number of geodesics connecting  $j$  and  $k$ , and  $g_{jk}(i)$  = the number of geodesics that node  $i$  is on.

**X has higher betweenness in the following graphs**



# Closeness Centrality

What if it's not so important to have many direct friends? ( degree )

Or be “between” others (betweenness)

But one still wants to be in the “middle” of things, not too far from the center

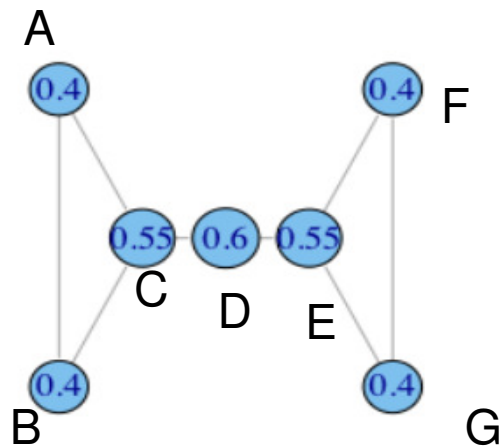
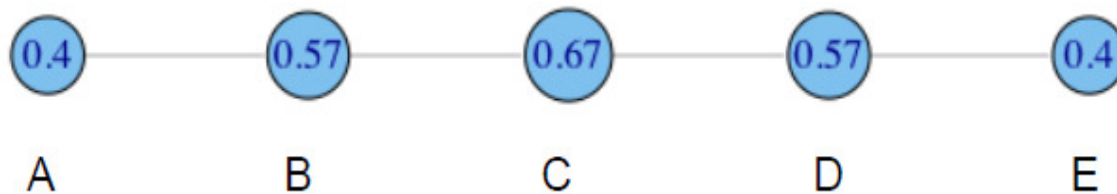
**Closeness is based on the length of the average shortest path between a vertex and all vertices in the graph**

$$C_c(i) = \left[ \sum_{j=1}^N d(i,j) \right]^{-1}$$

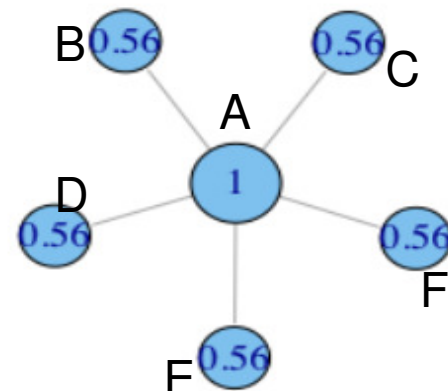
**Where  $d(i,j)$  = shortest distance from  $i$  to  $j$**

## Closeness examples

**C has higher closeness centrality and is closer to all nodes compared to others**



**D has higher closeness centrality and is closer to all nodes compared to others**



**A has higher closeness centrality and is closer to all nodes compared to others**

# Other centrality measures

There are other centrality measures :

- ❖ Eigenvector Centrality

- ❖ Katz Centrality

# References

<https://www.cl.cam.ac.uk/teaching/1213/L109/stna-lecture3.pdf>

<https://github.com/ericmjl/Network-Analysis-Made-Simple>

[http://cs.brynmawr.edu/Courses/cs380/spring2013/section02/slides/05\\_Centrality.pdf](http://cs.brynmawr.edu/Courses/cs380/spring2013/section02/slides/05_Centrality.pdf)

[http://www2.unb.ca/~ddu/6634/Lecture notes/Lecture 4 centrality measure.pdf](http://www2.unb.ca/~ddu/6634/Lecture_notes/Lecture_4_centrality_measure.pdf)

<http://cs224w.stanford.edu>

*Thank  
you*

