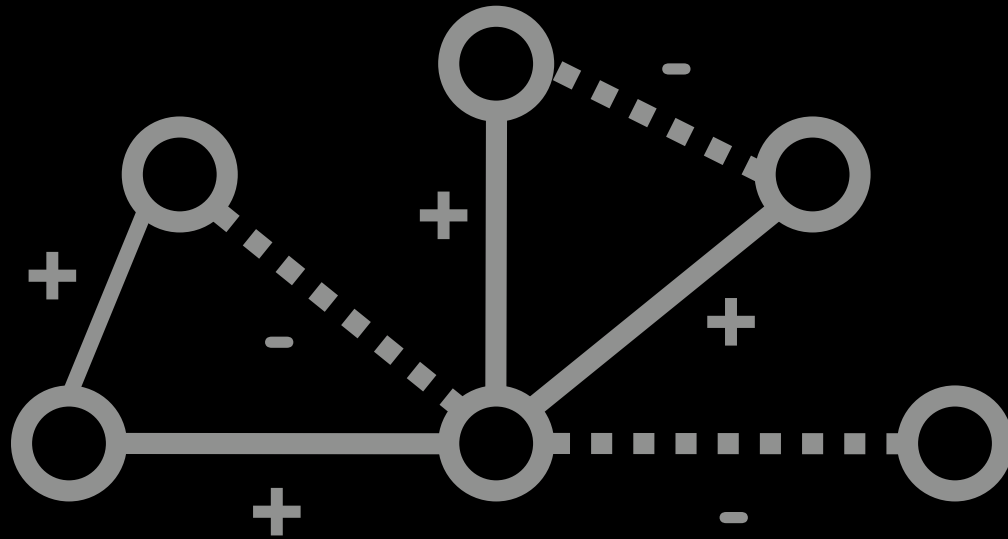


**15-251**

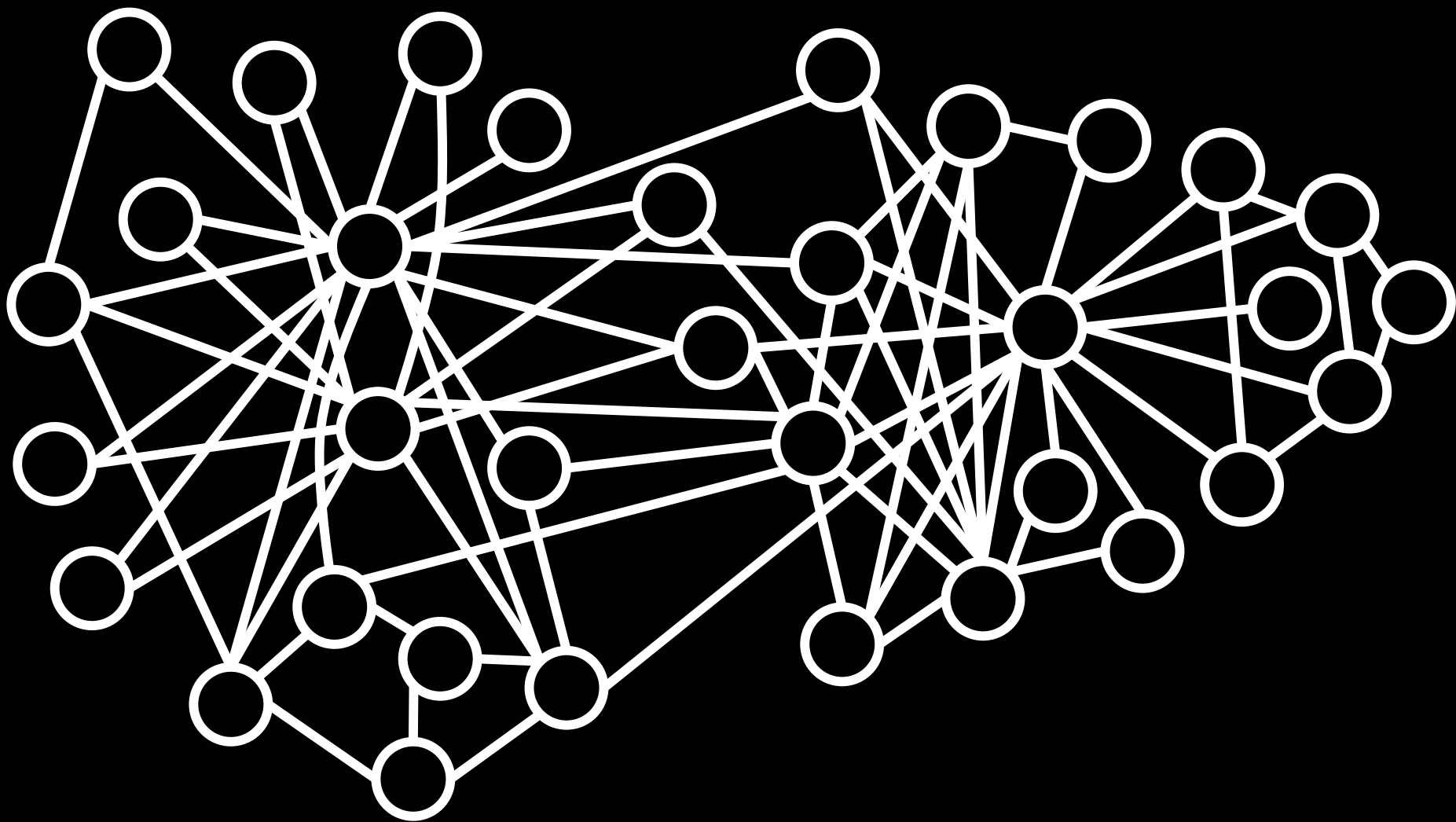
**Great Theoretical Ideas  
in Computer Science**

# Social Networks

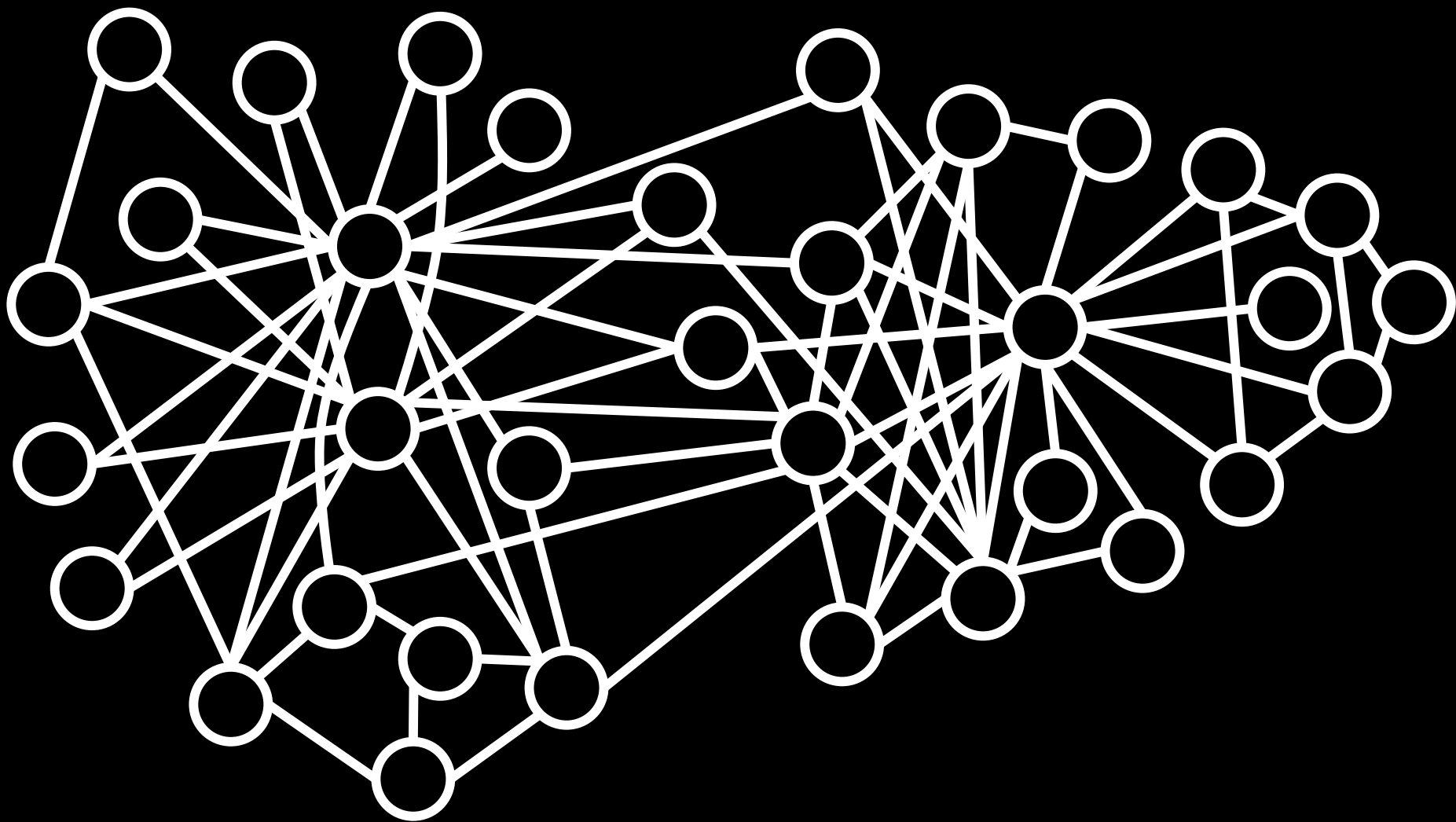


Brendan Meeder  
March 26, 2009

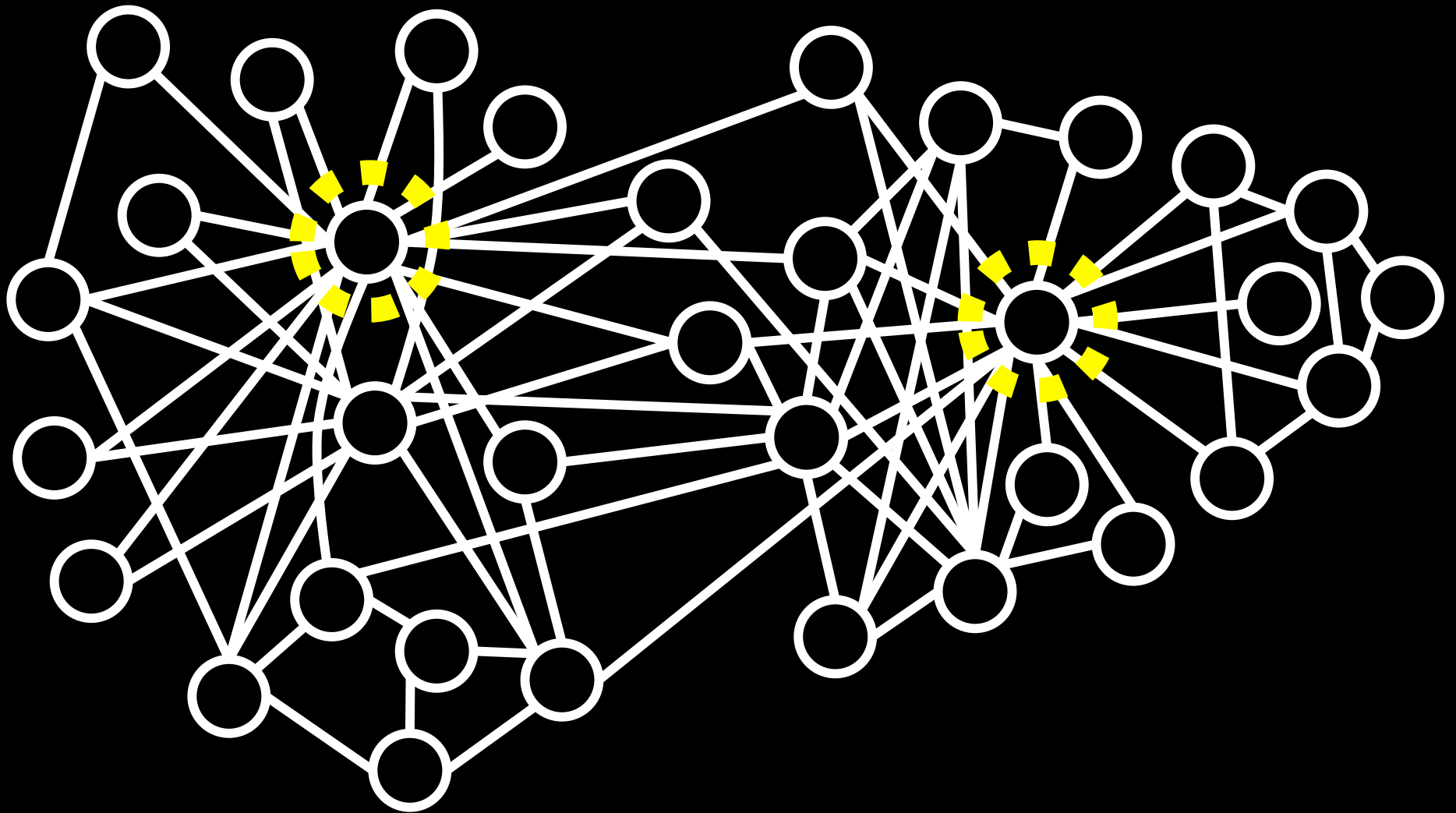
# Social Networks (1977)



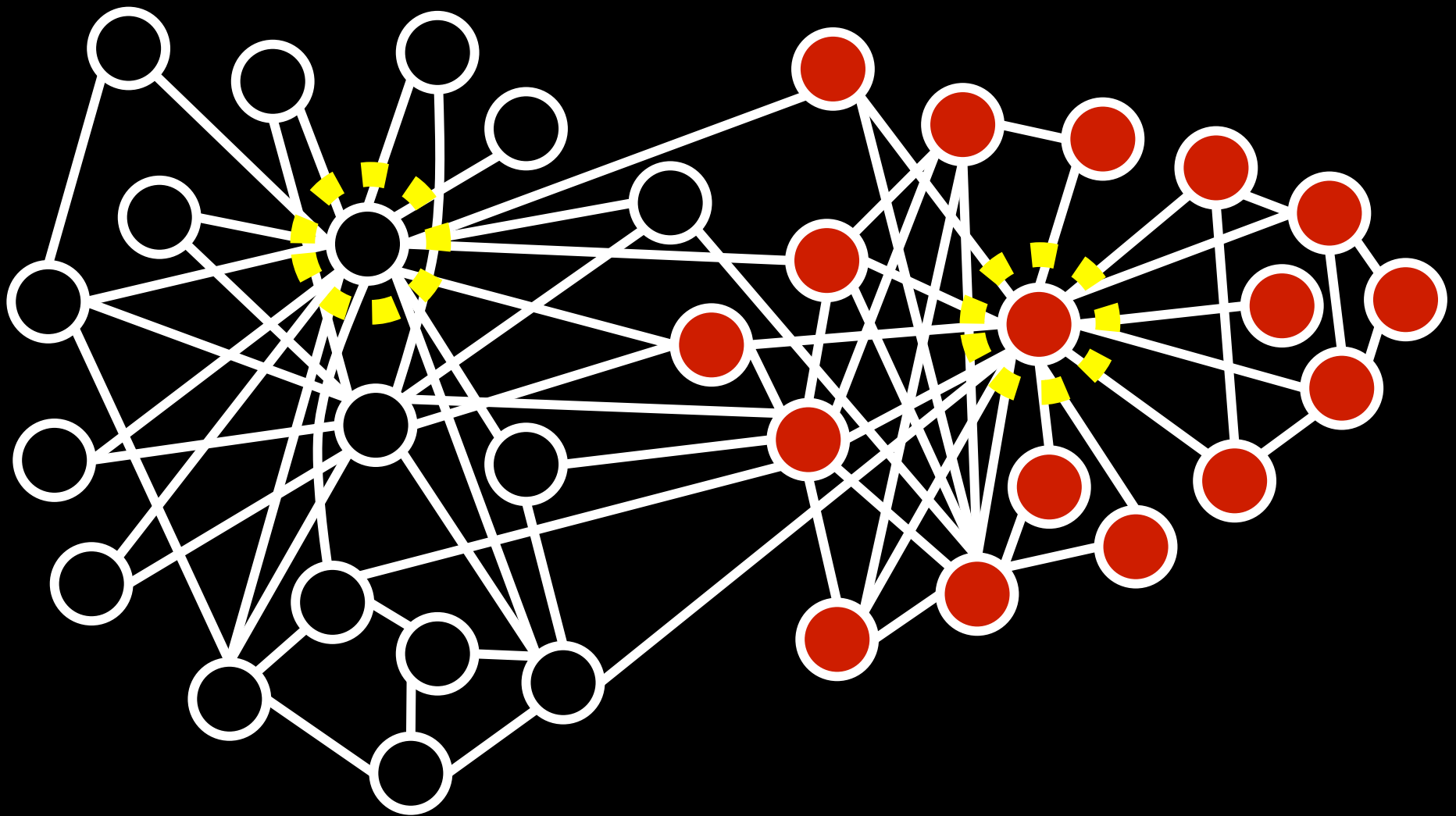
# Friendships in Karate



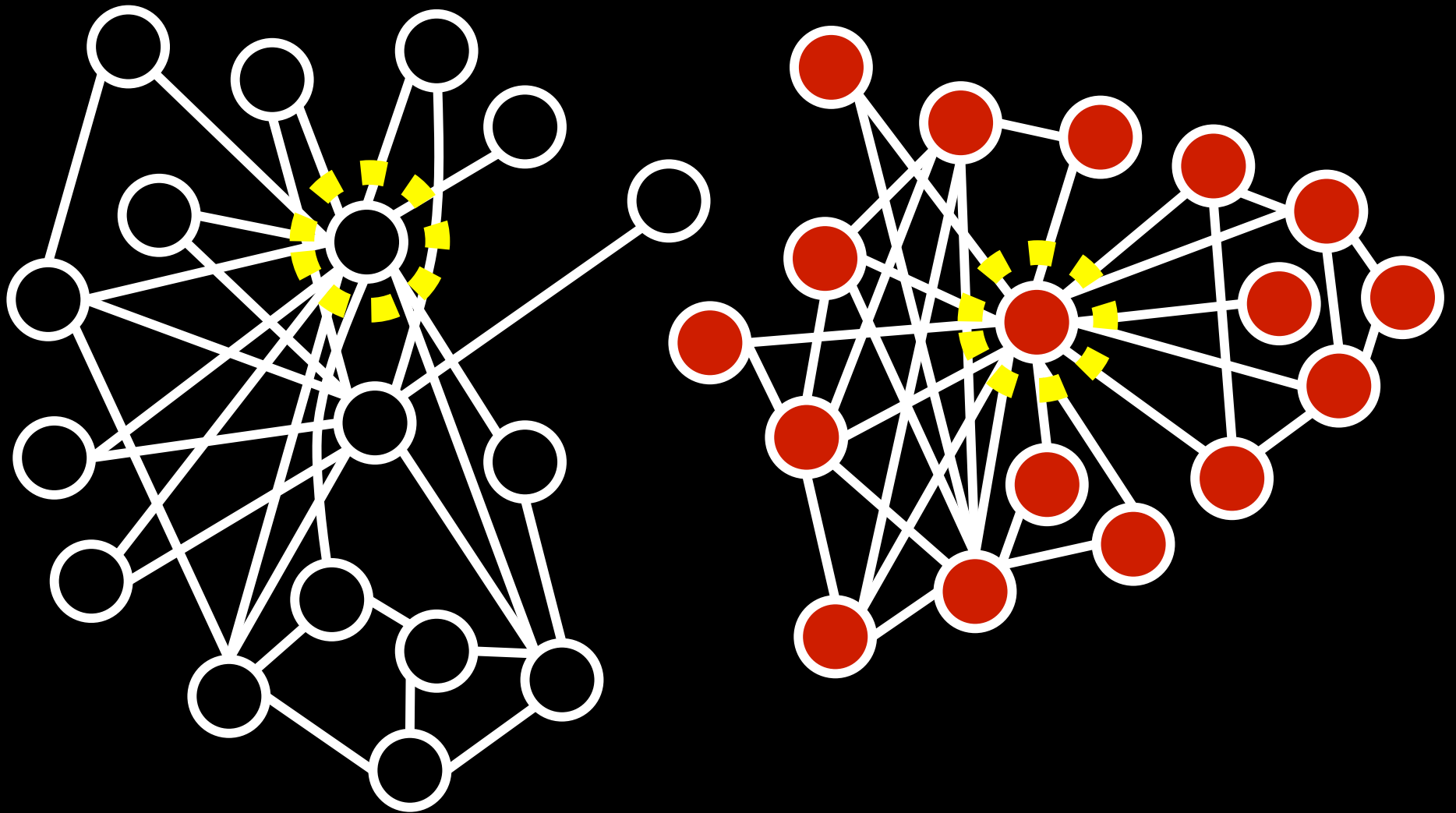
# Friendships in Karate



# Friendships in Karate



# The Breakup



# Mathematical Explanation

The split occurs along a minimum cut separating the two central figures

Individuals sided with the central figure they were closer to

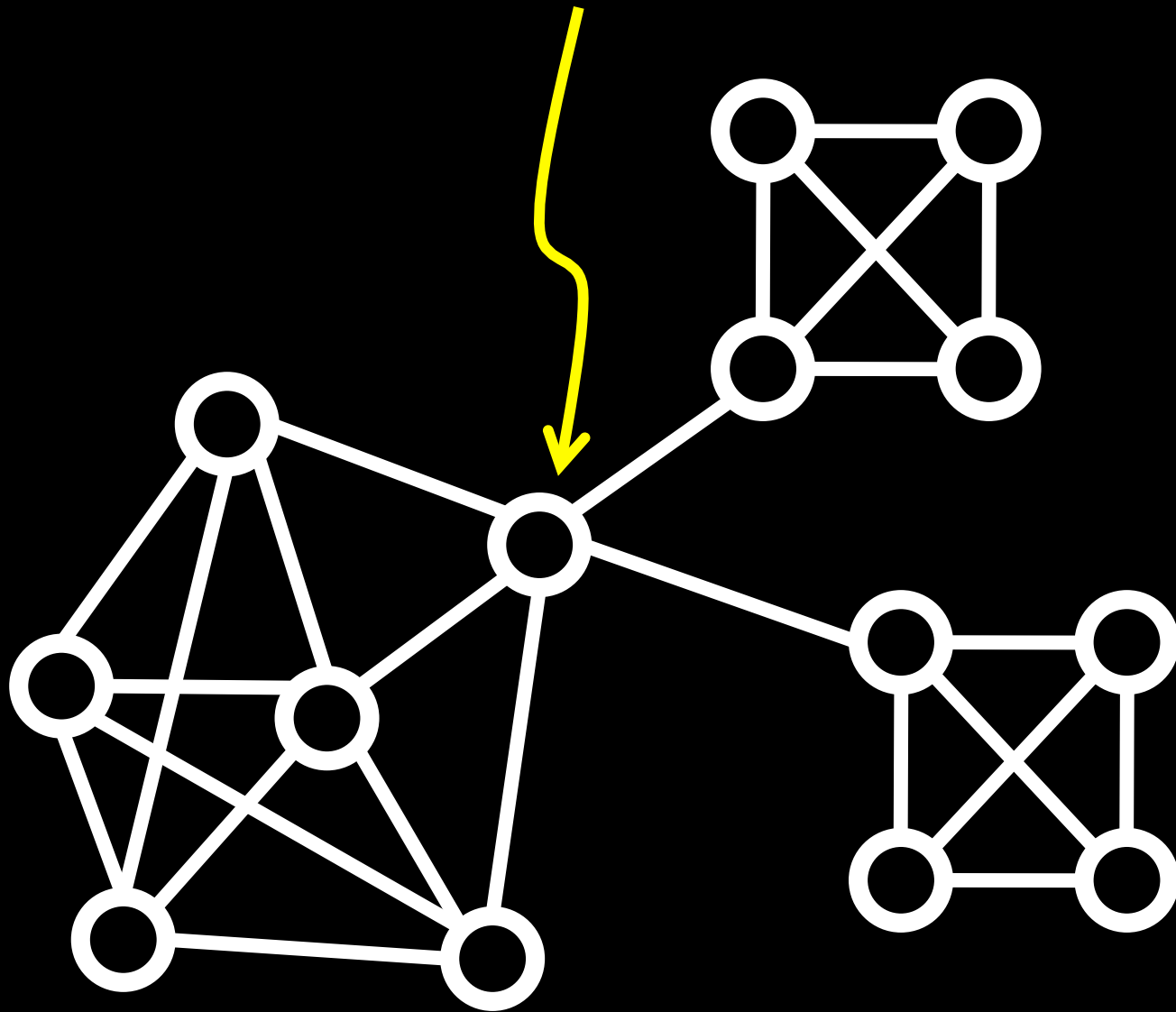


# Some Aspects of Social Networks

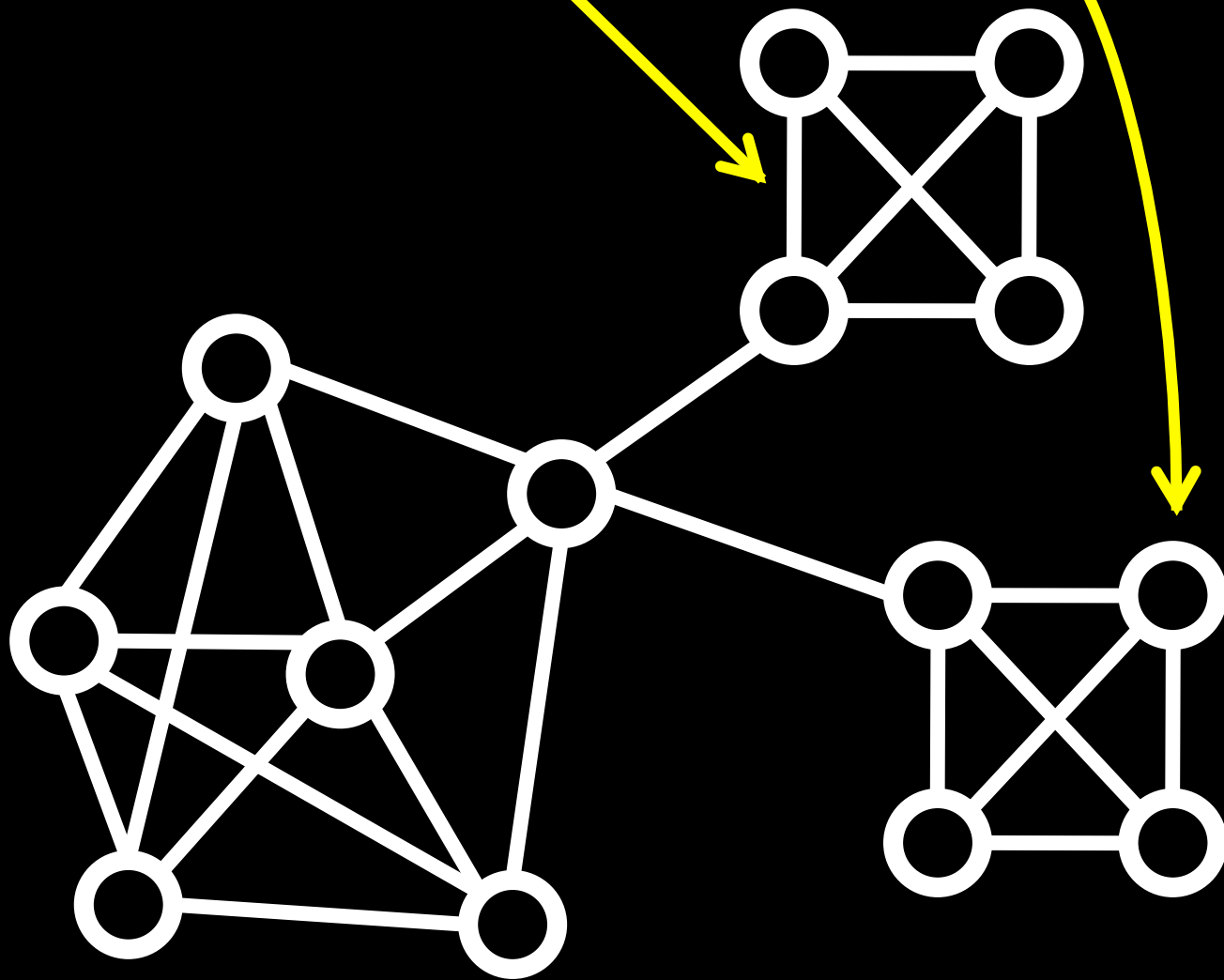
- Network structure
- Models of network structure
  - Random graphs, power laws, small-world phenomena
- Information flow in networks
  - Fads, rumors, diseases, distributed search
- The visual beauty of networks

# Network Structures

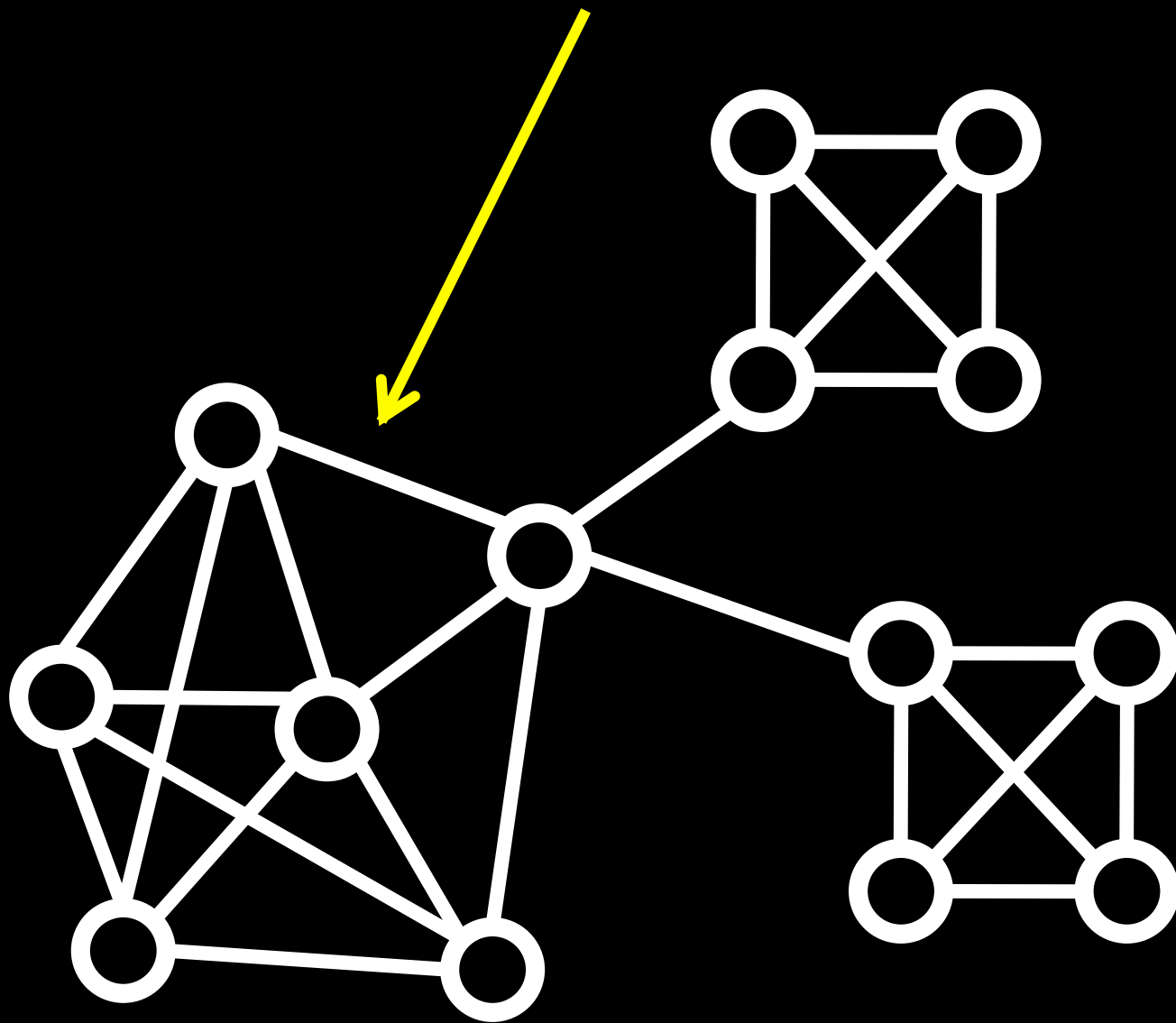
# Structural Holes



# Cliques

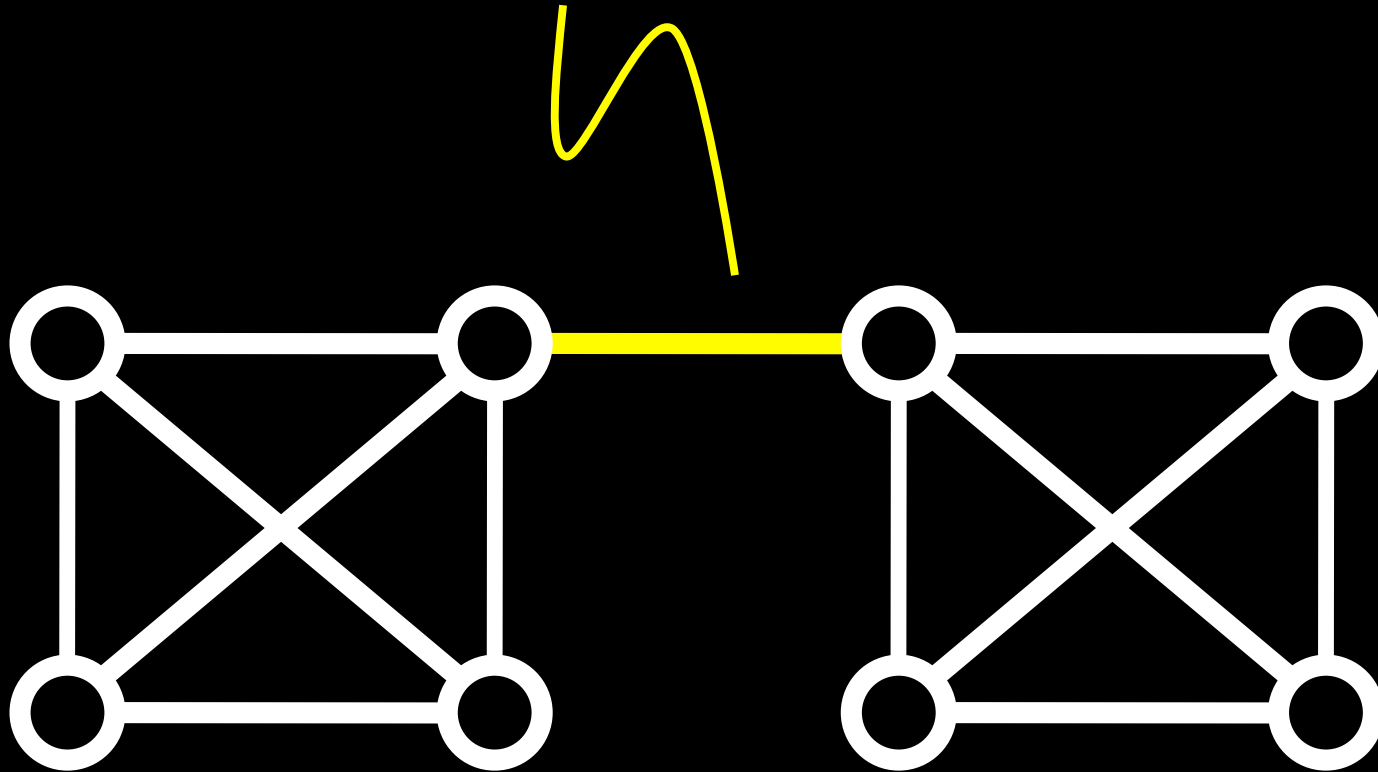


# Clusters



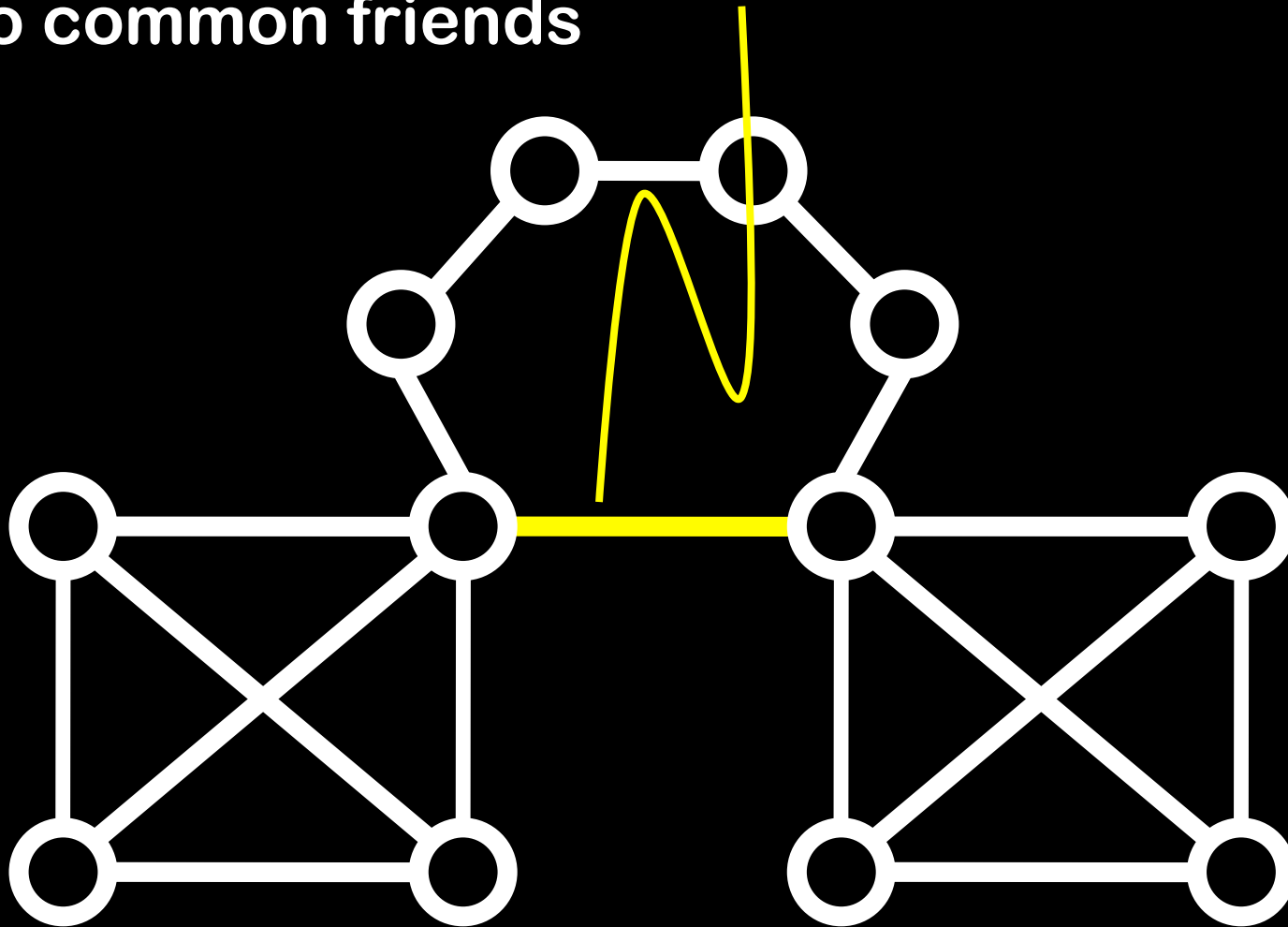
# Bridges

An edge is a **bridge** if deleting it would cause its endpoints to lie in different components

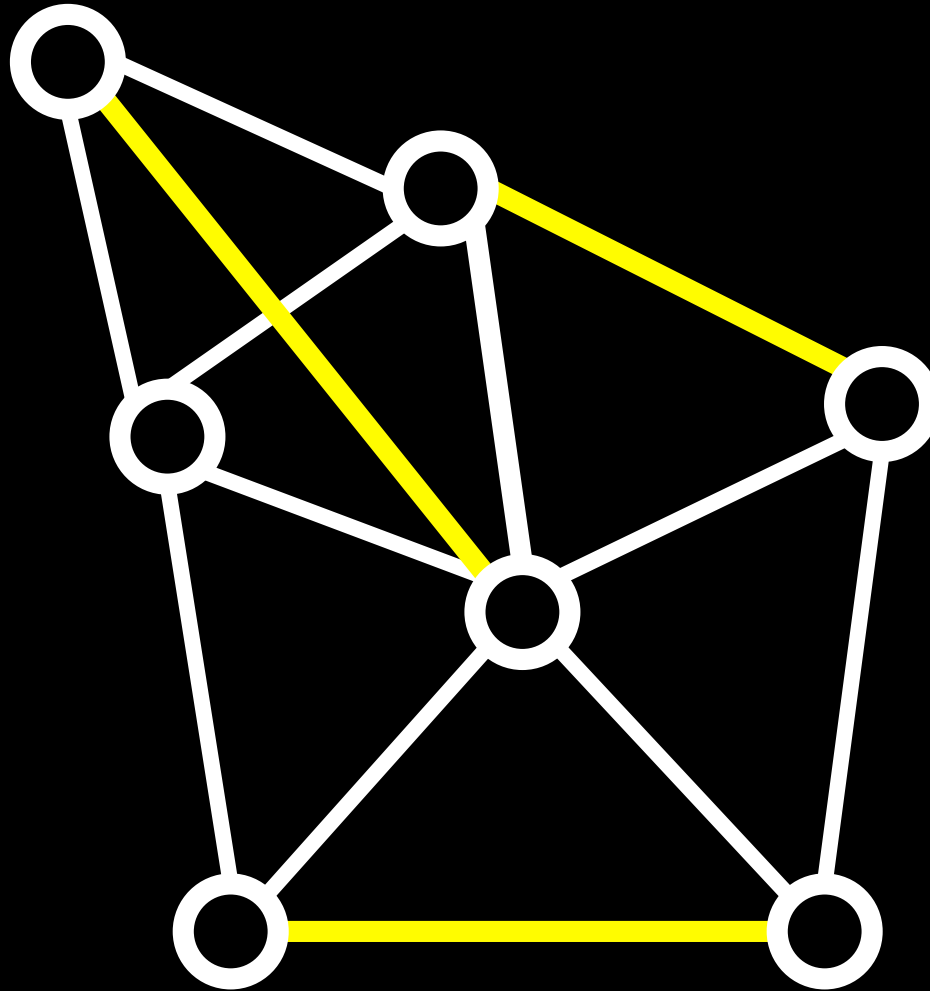


# Local Bridges

An edge is a **local bridge** if its endpoints have no common friends

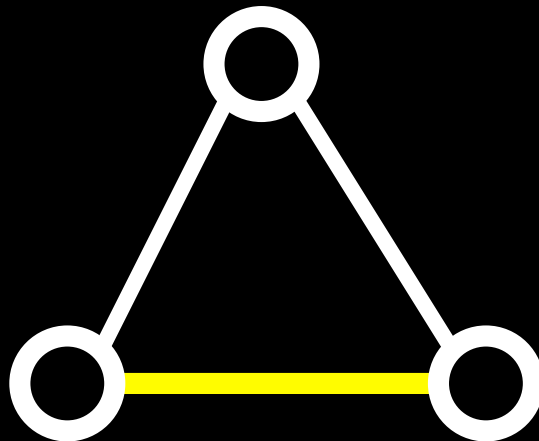


How will this network evolve?



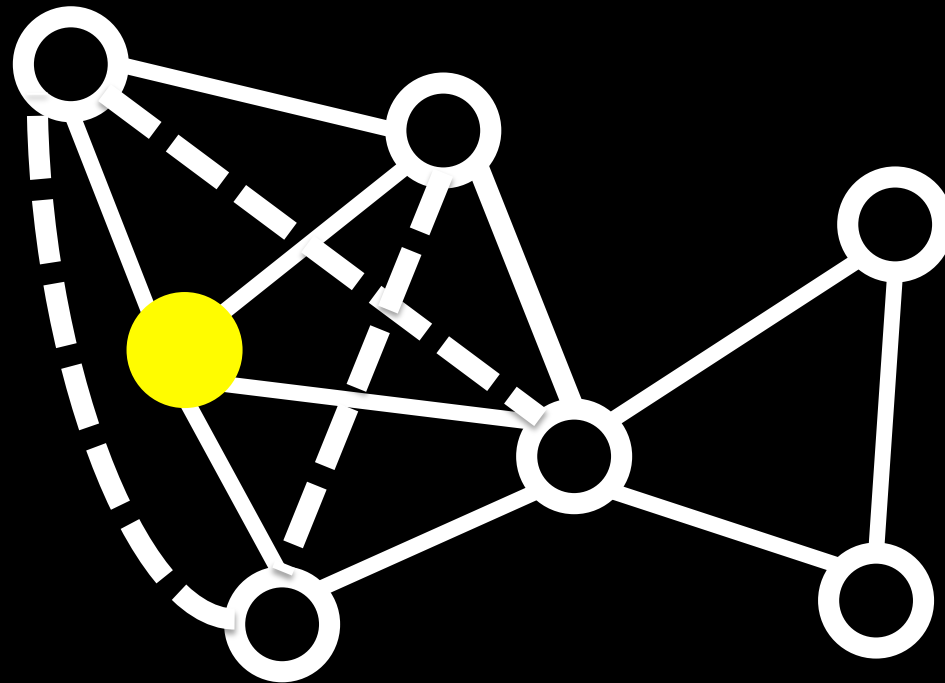


**Triadic Closure:** If two nodes have common neighbor, there is an increased likelihood that an edge between them forms



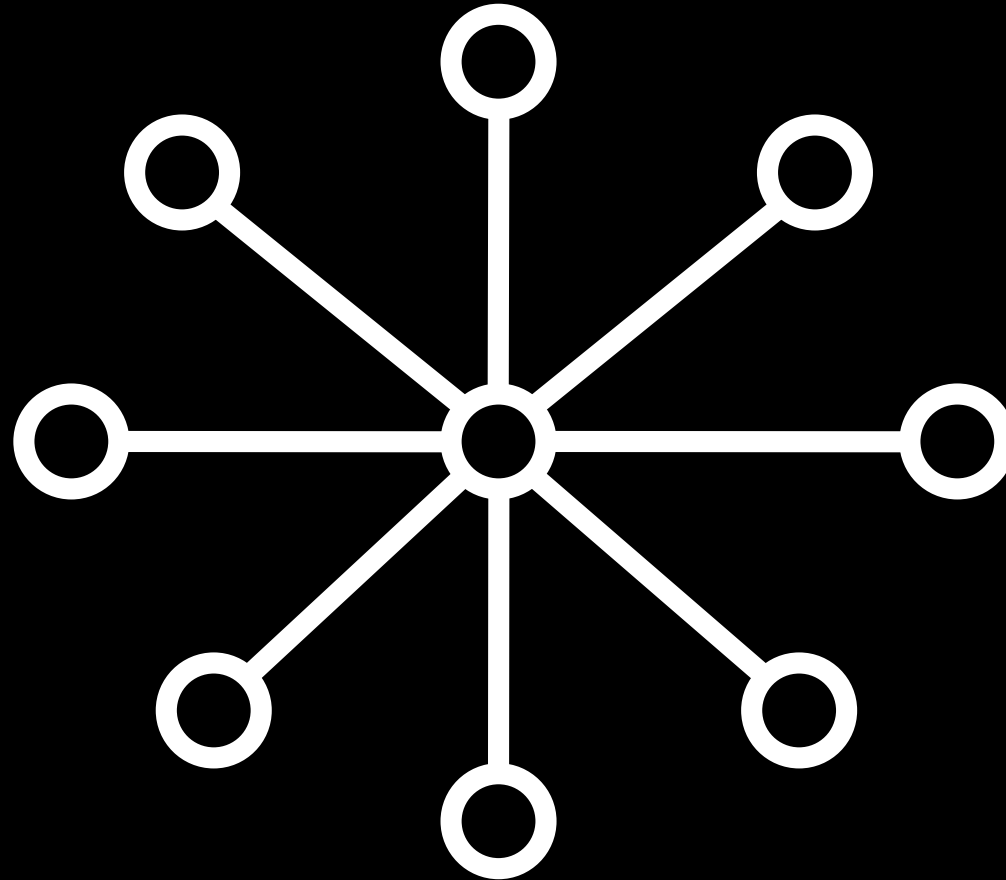
**Definition:** The clustering coefficient of a node  $v$  is the fraction of pairs of  $v$ 's friends that are connected to each other by edges

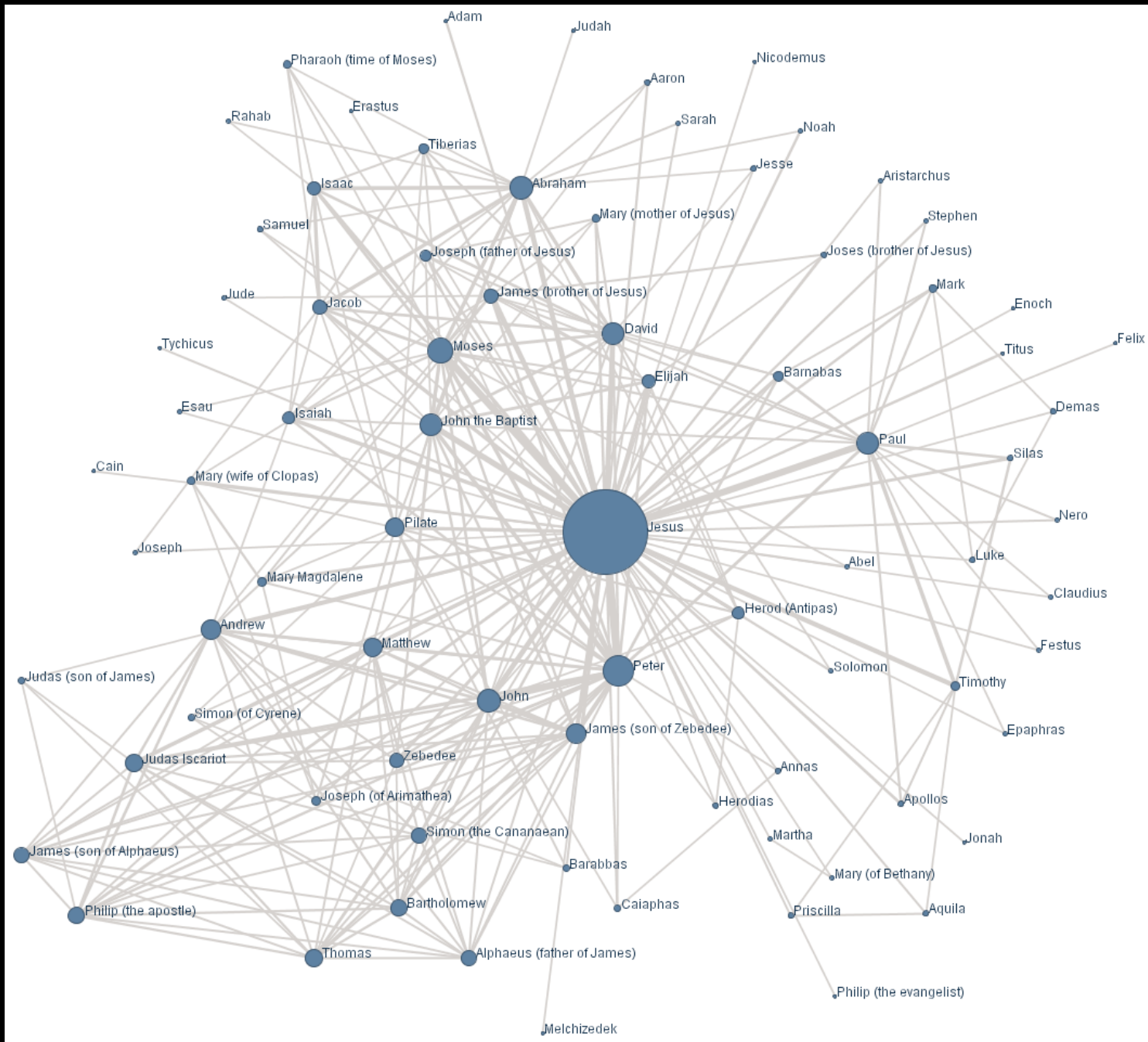
**Clustering Coefficient =  $1/2$**

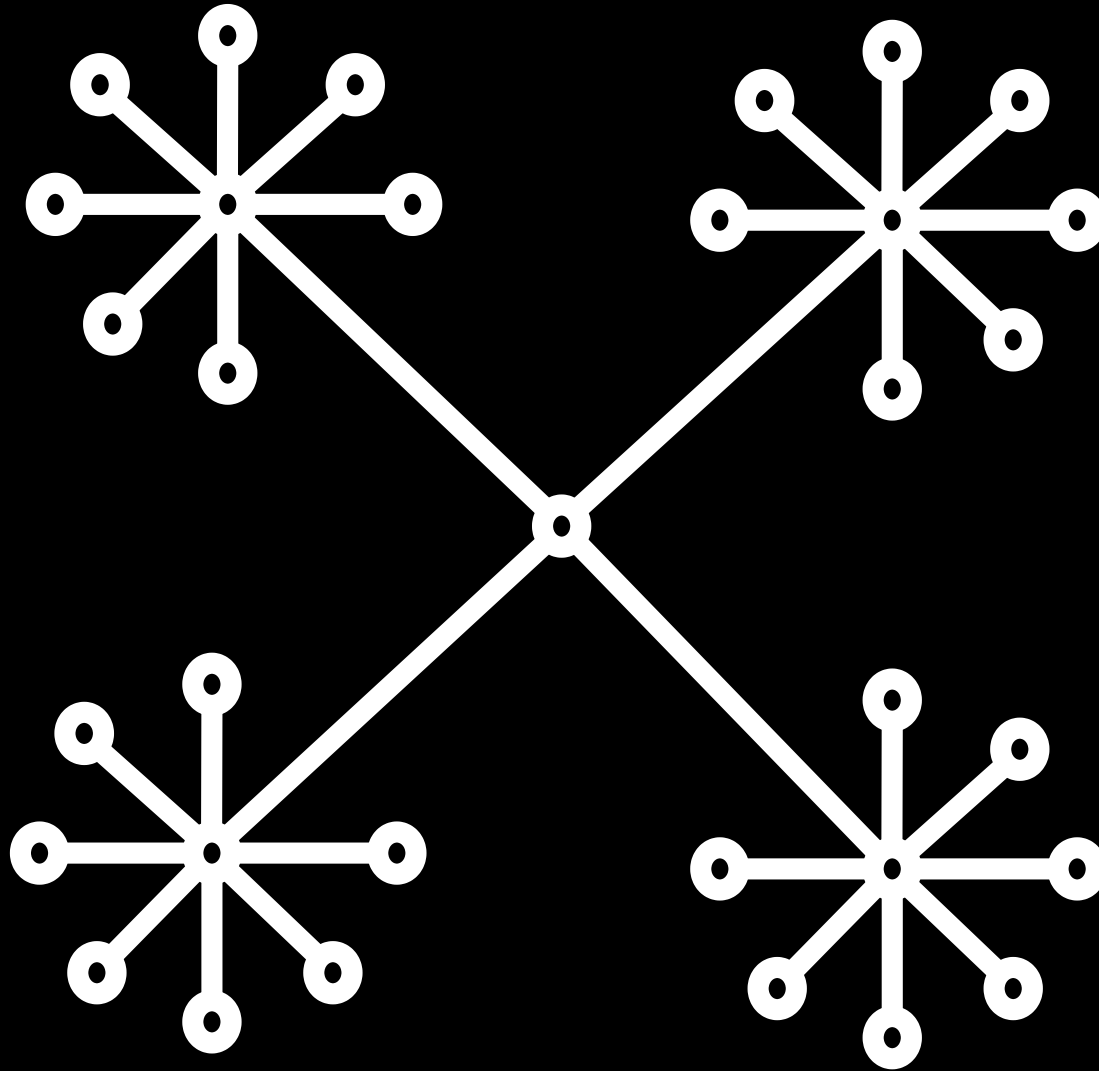


The higher the clustering coefficient of a node, the more strongly triadic closure is acting on it

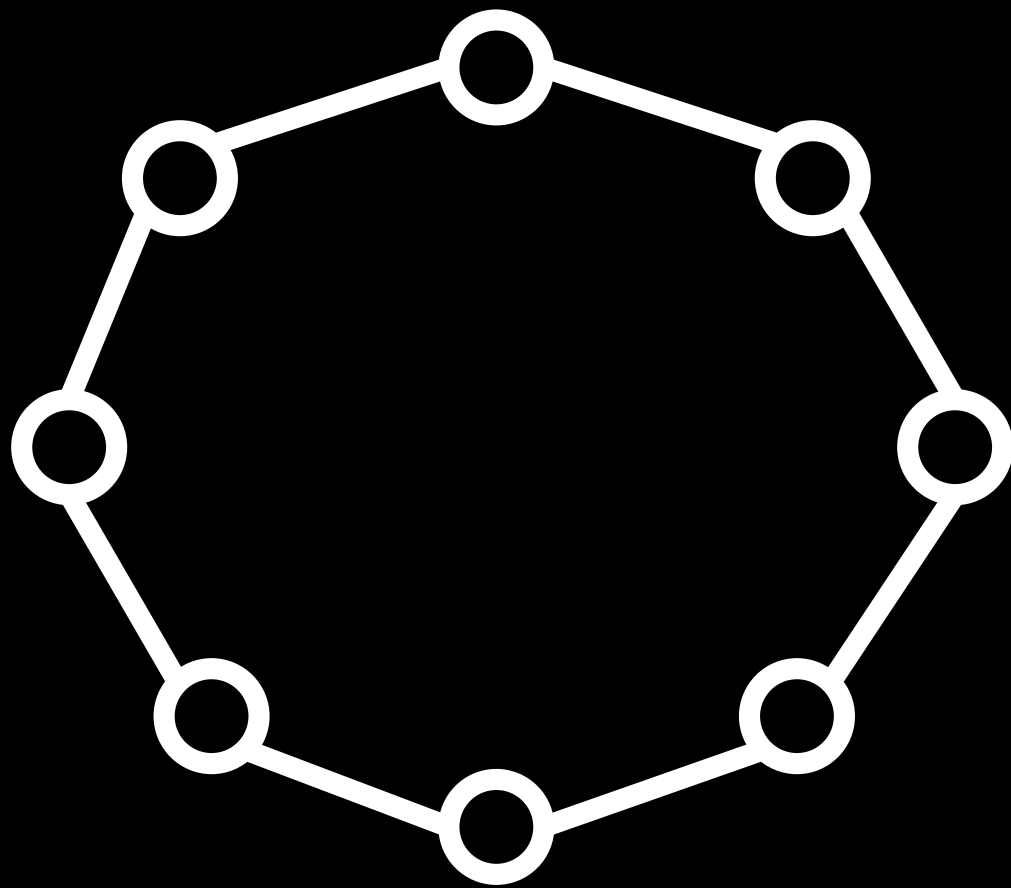
What's the "most central node"?



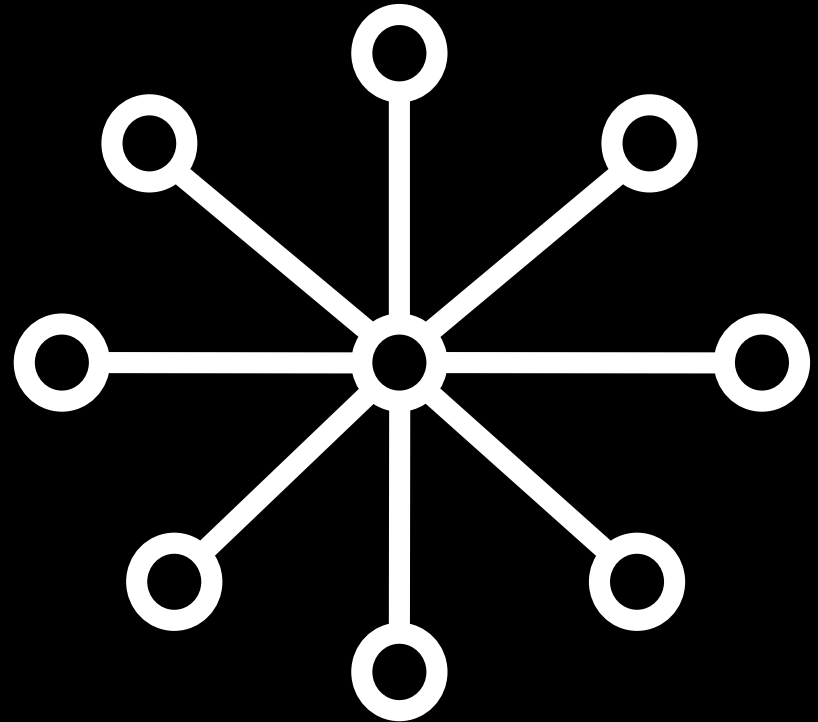
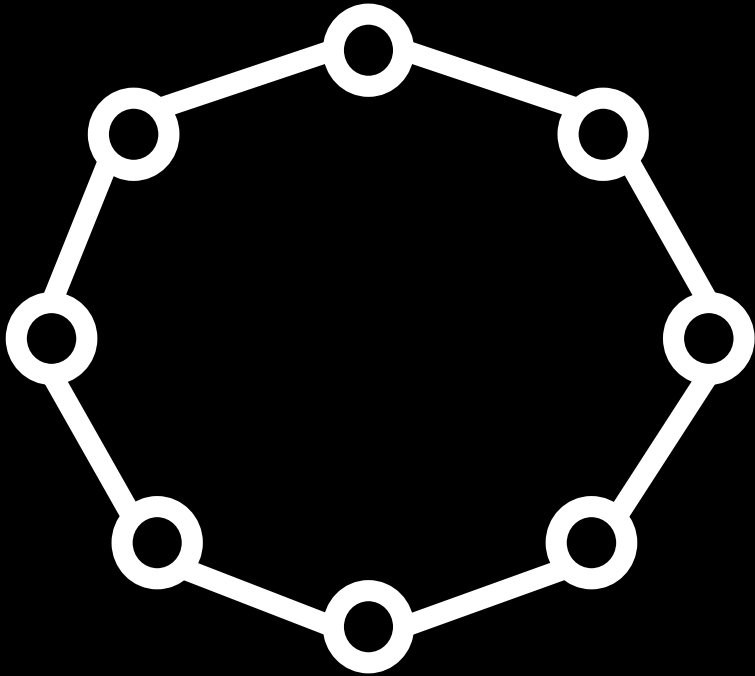








Which Graph is More  
“Centralized”?



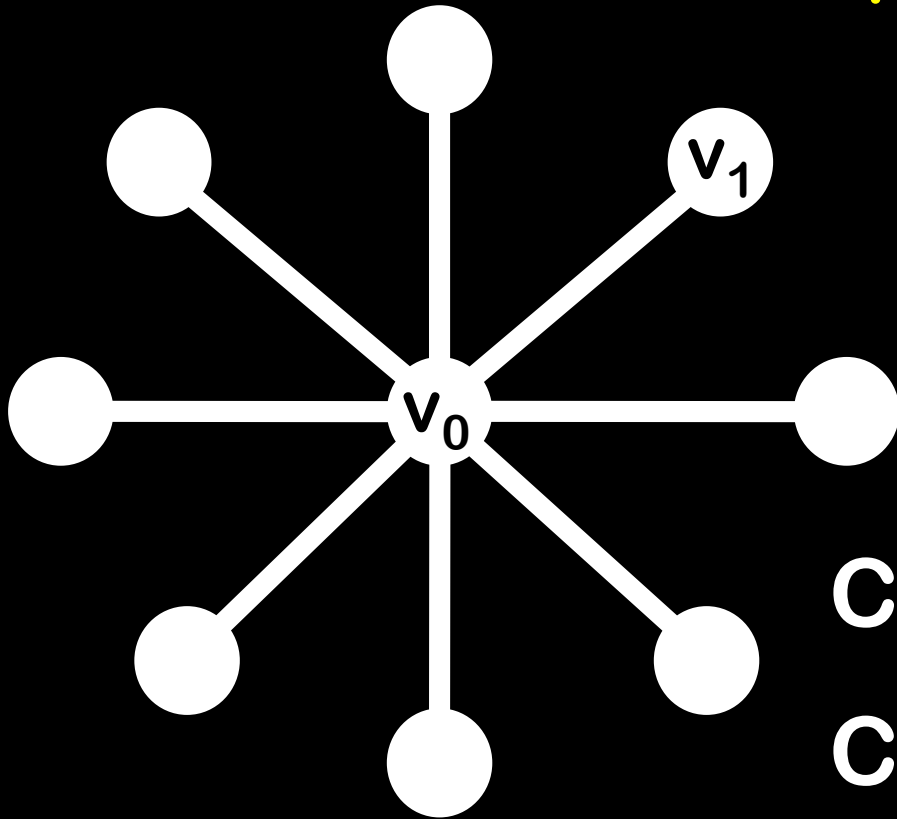


# Degree Centrality of a Node

$$C_D(v) = d(v)/(n-1)$$



Number of nodes



$$C_D(v_0) = 1$$

$$C_D(v_1) = 1/8$$

**Degree centrality is easy to  
calculate, but it's not a very  
good measure**



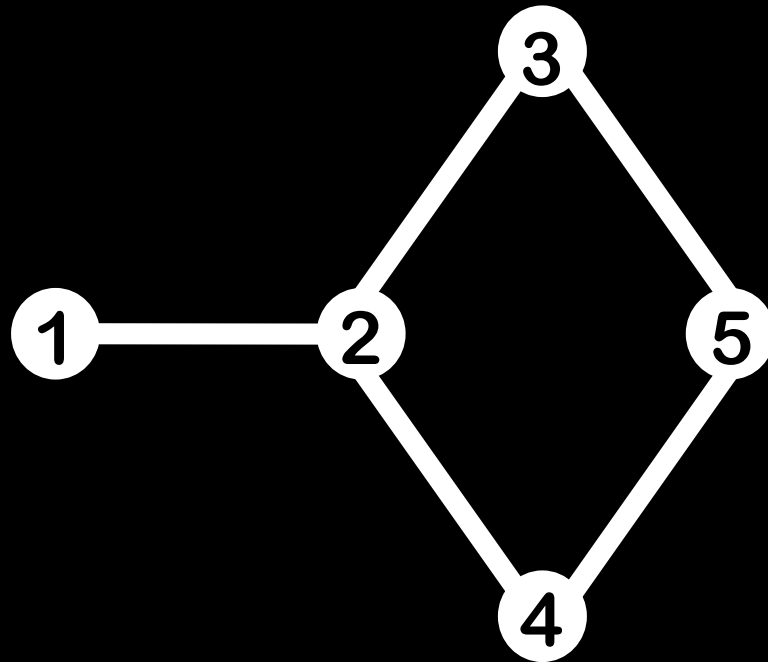
# Betweenness Centrality of a Node

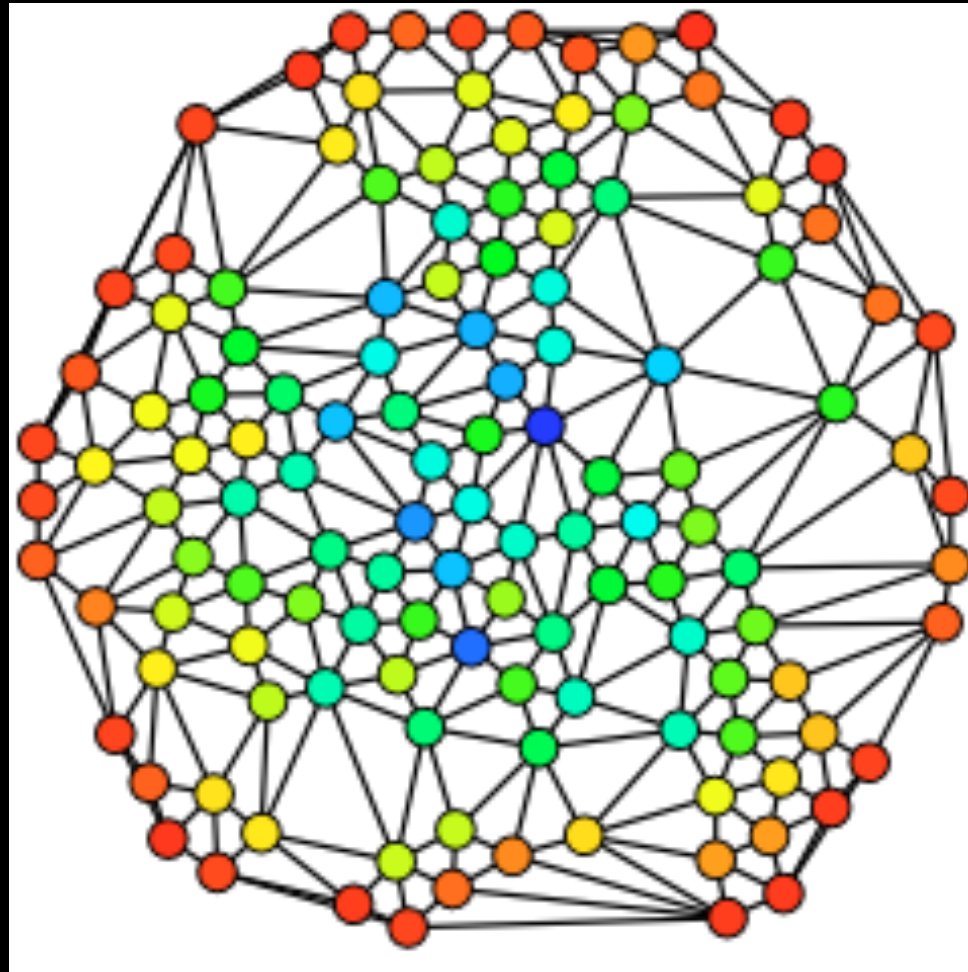
$\text{Short}_{jk}$  = Number of shortest paths from  $v_j$  to  $v_k$

$\text{Short}_{jk}(v_i)$  = Number of shortest paths from  $v_j$  to  $v_k$  that pass through  $v_i$

$$C_B(v_i) = \sum_{j < k} \text{short}_{jk}(v_i) / \text{short}_{jk}$$

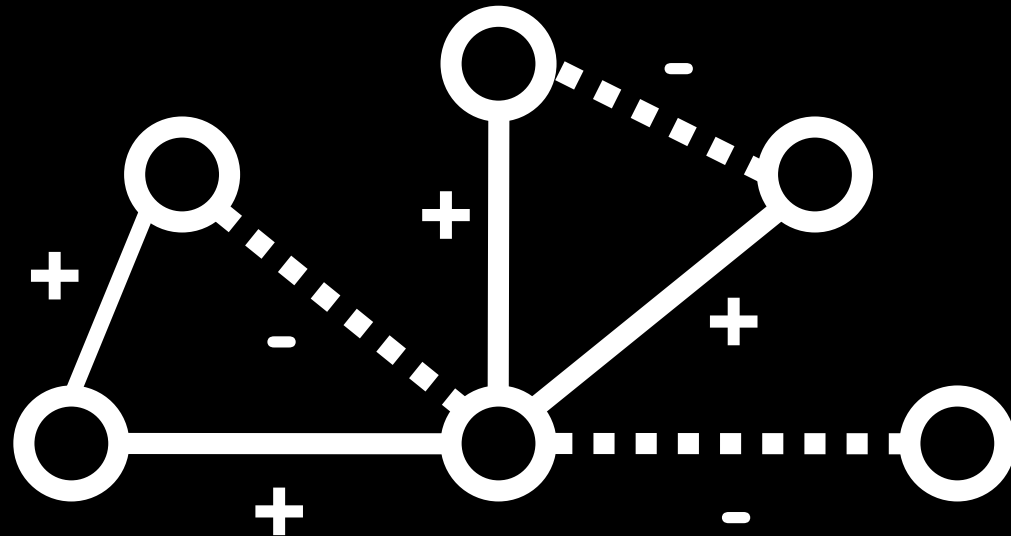
$$C_B(v_i) = \sum_{j < k} \text{short}_{jk}(v_i) / \text{short}_{jk}$$



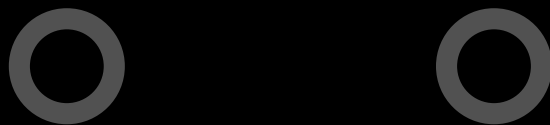
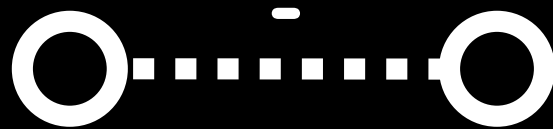
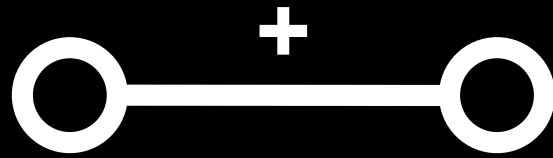


# Networks with Extra Structure

# Signed Graphs

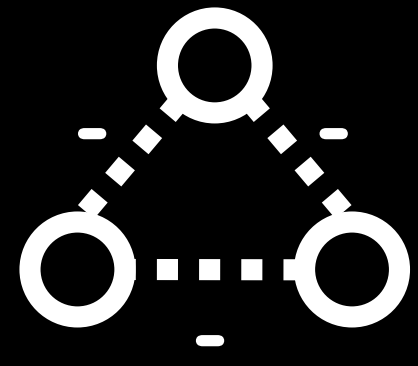
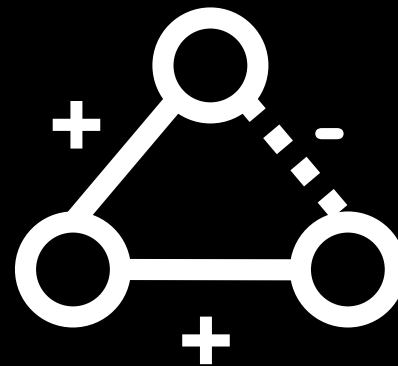
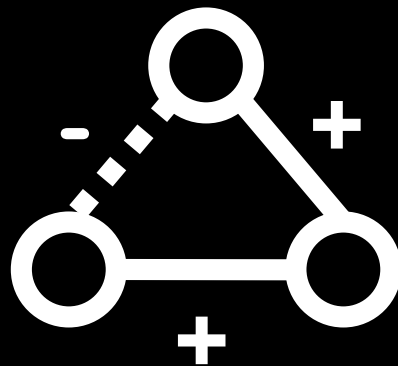
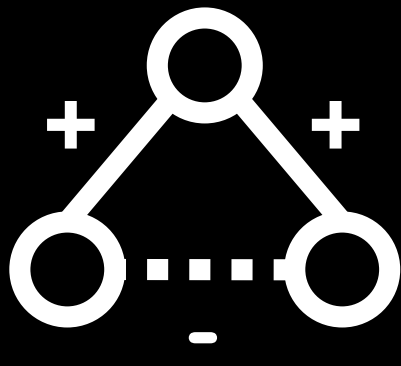
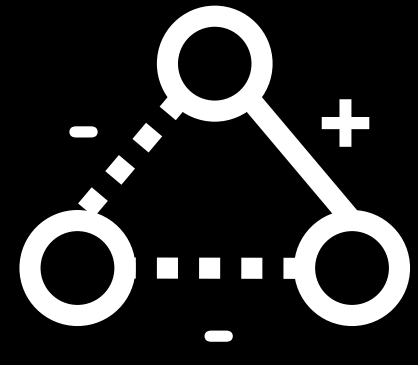
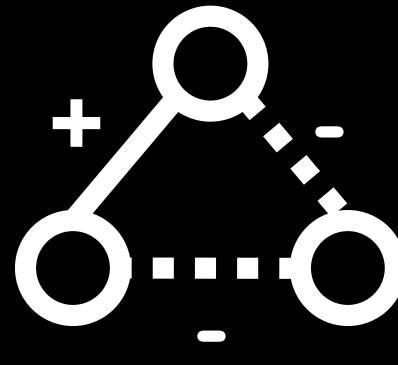
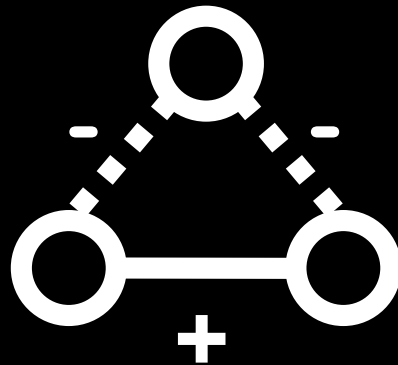
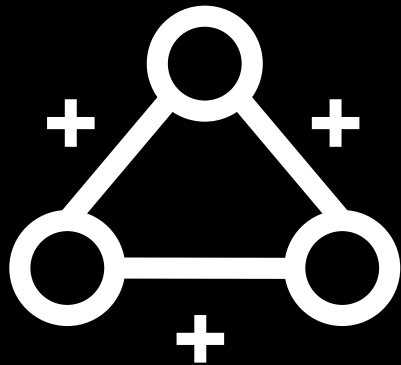


# Two-Node Signed Graphs

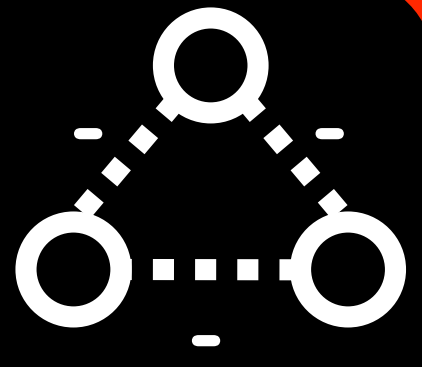
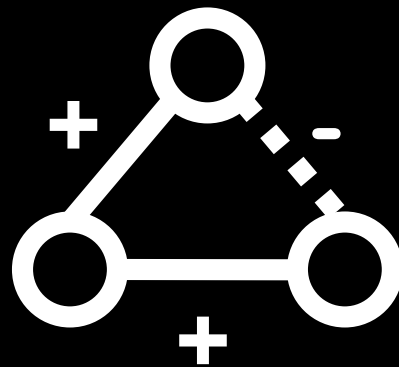
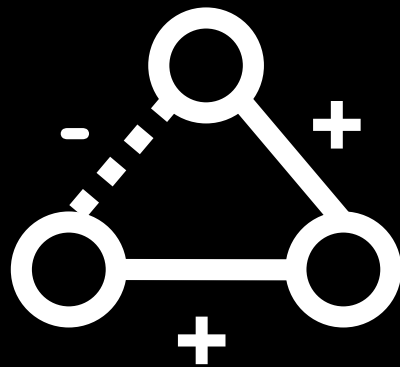
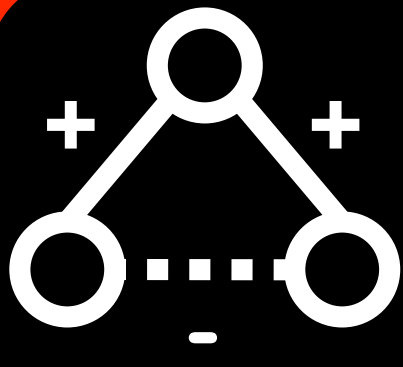
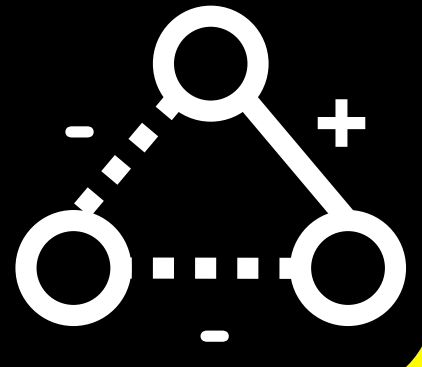
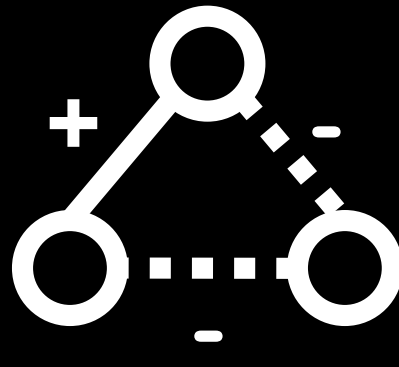
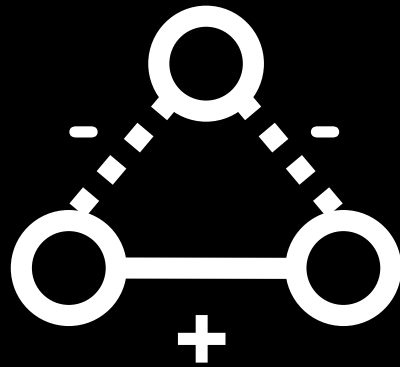
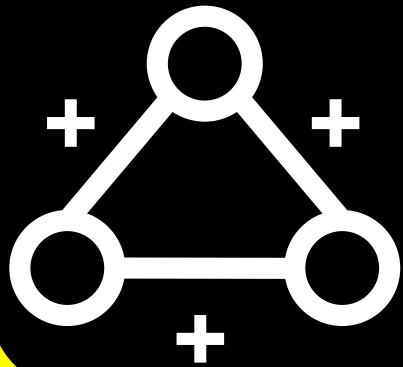




# Complete Three-Node Signed Graphs

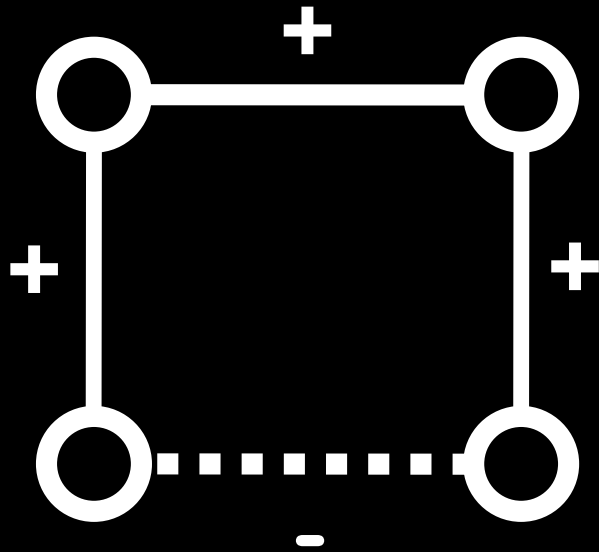


# Balanced

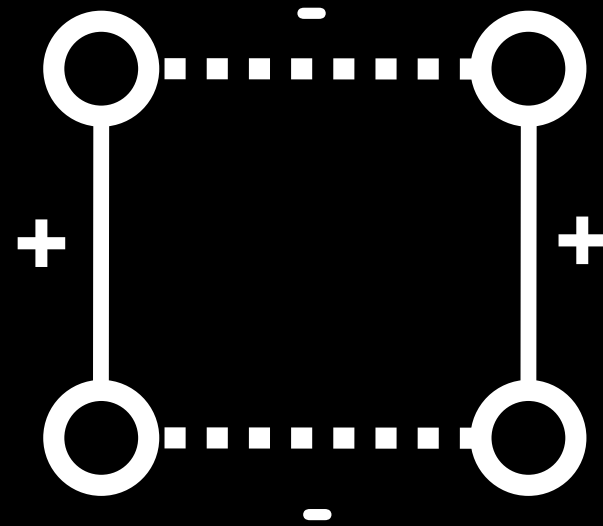


# Unbalanced

# Four Node Cycles



Unbalanced



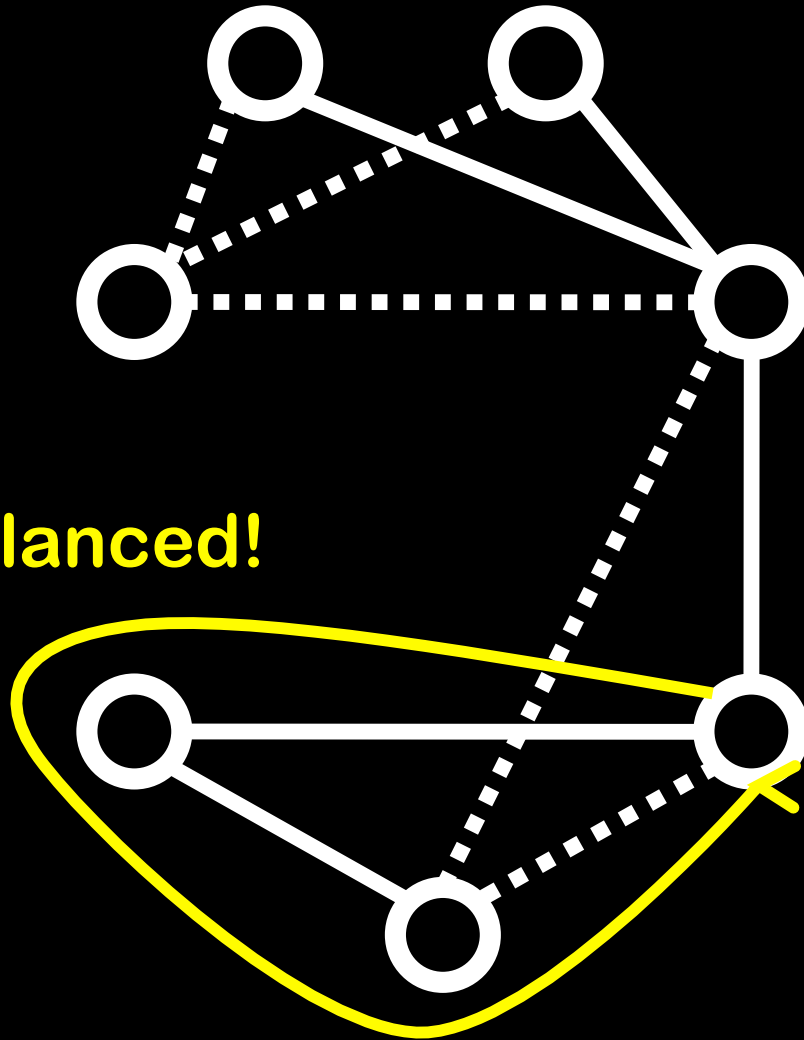
Balanced

**Definition:** A cycle is balanced if the product of its signs is positive

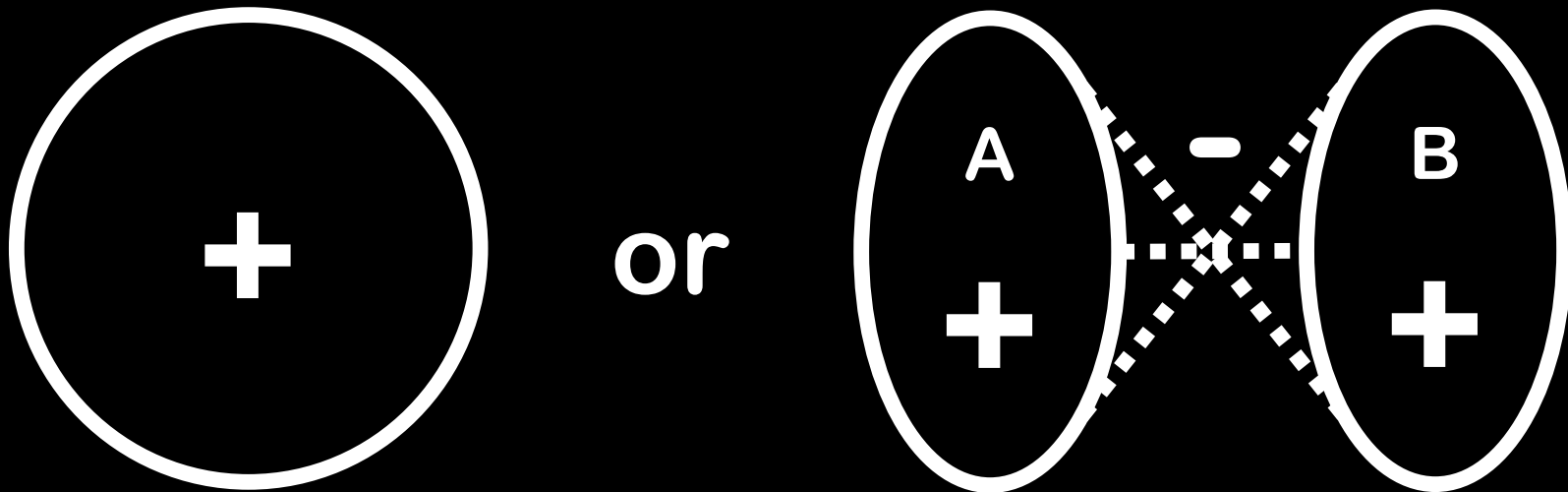
**Definition:** A graph is balanced if all its cycles are balanced

# Example

**Unbalanced!**



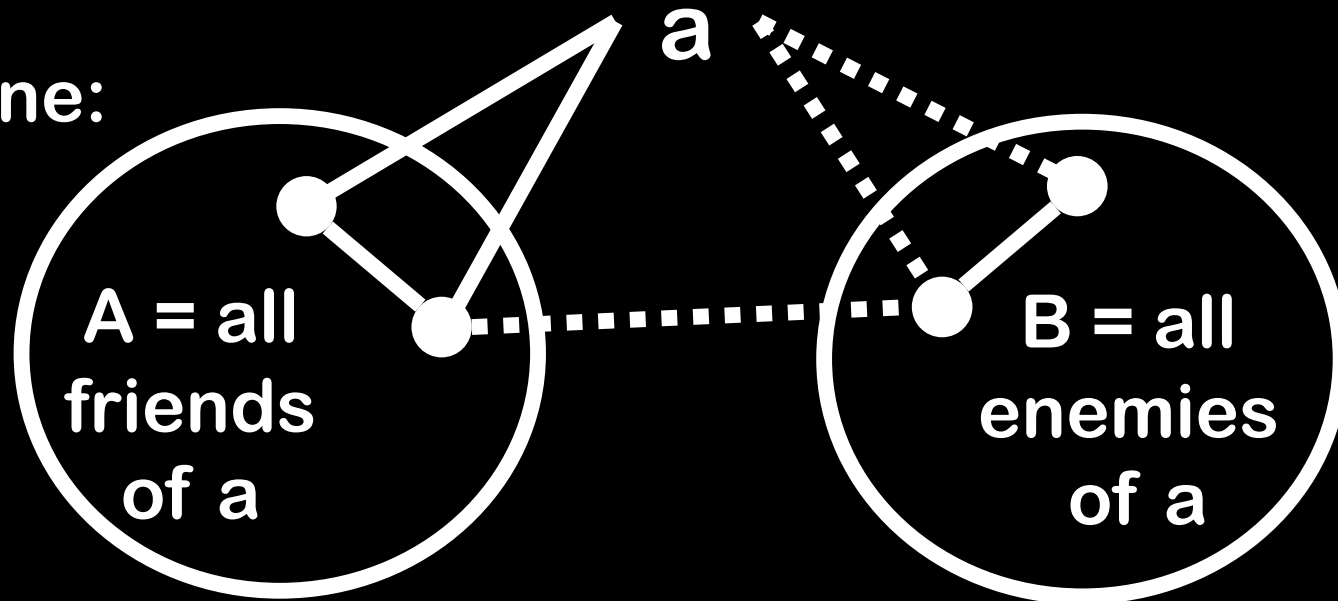
**Theorem:** If every 3-cycle in a signed complete graph is balanced, then either (1) all nodes are friends, or (2) the nodes can be divided into two groups, A and B, such that every pair of people in A like each other, every pair of people in B like each other, and everyone in A is the enemy of everyone in B.



**Proof:**

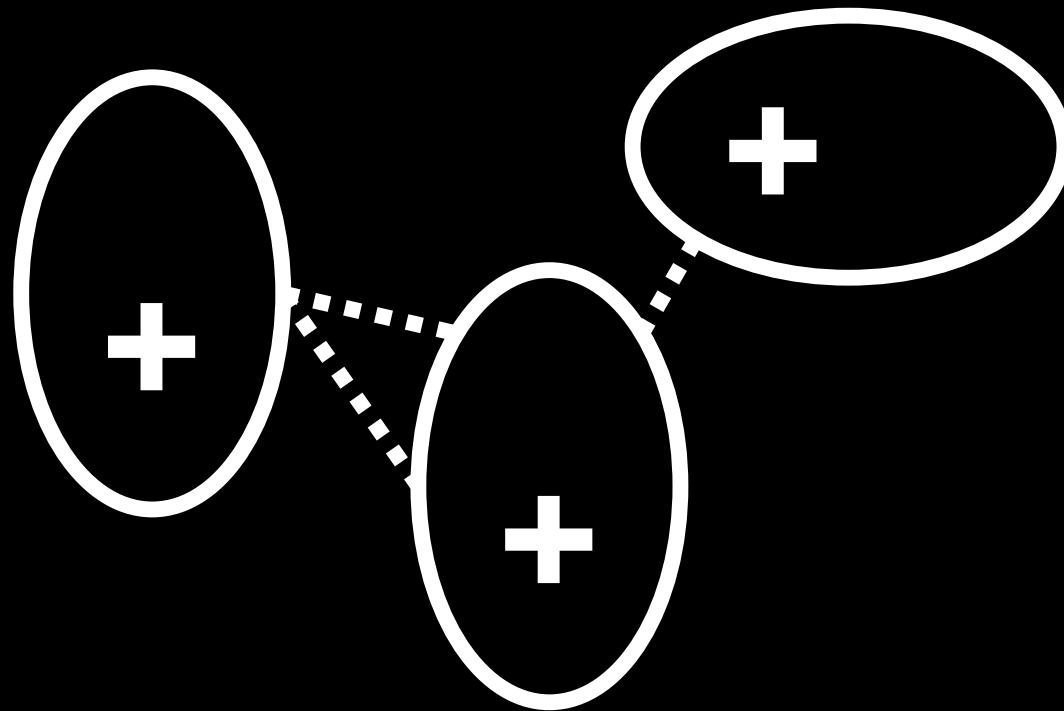
Pack any  
node:

Define:



1. Every two nodes in A are friends
2. Every two nodes in B are friends
3. Every node in A is an enemy of every node in B

**Definition:** A signed graph is clusterable if the nodes can be partitioned into a finite number of subsets such every positive edge is between nodes of the same subset, and every negative edge is between nodes of different subsets

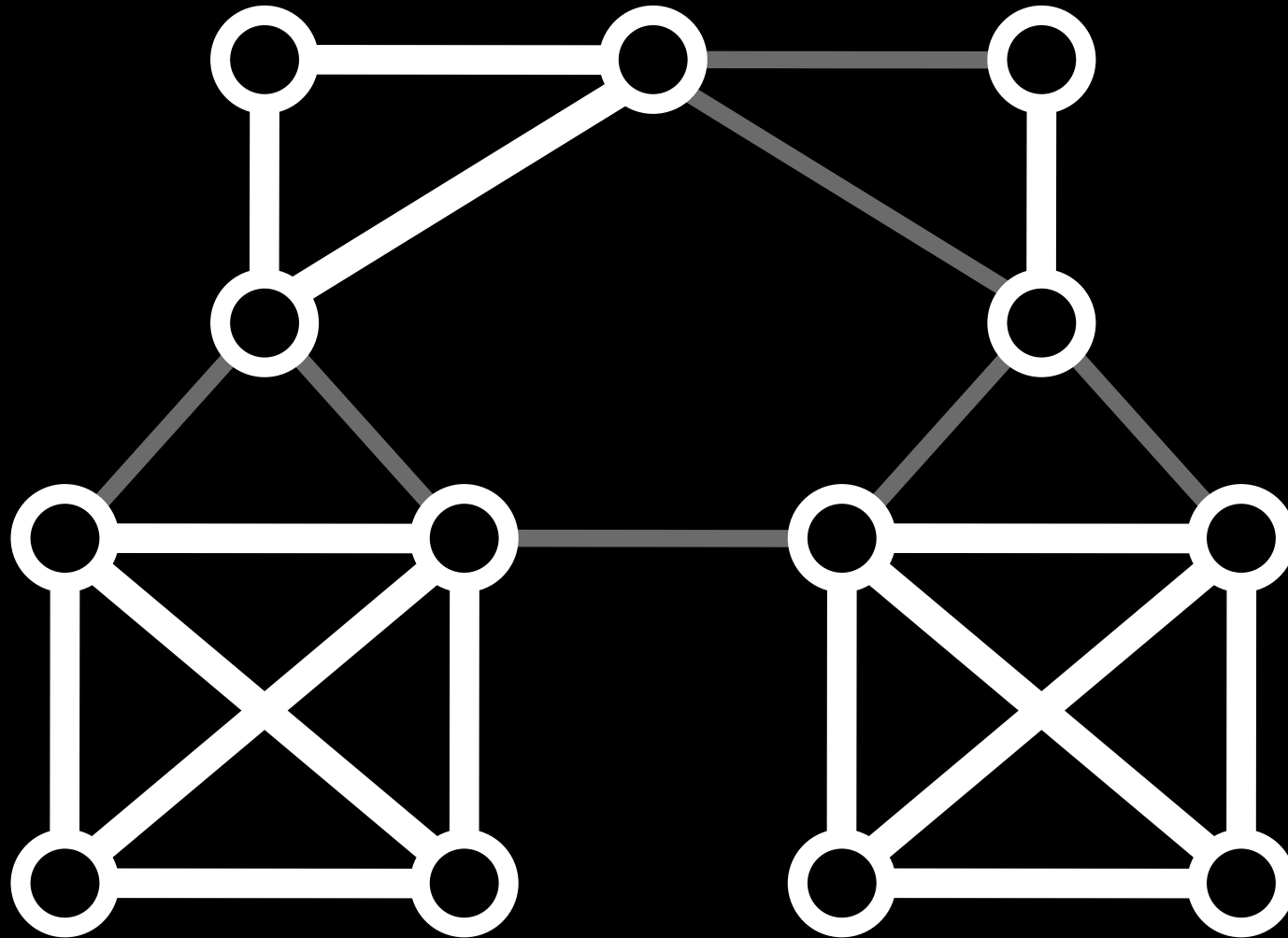




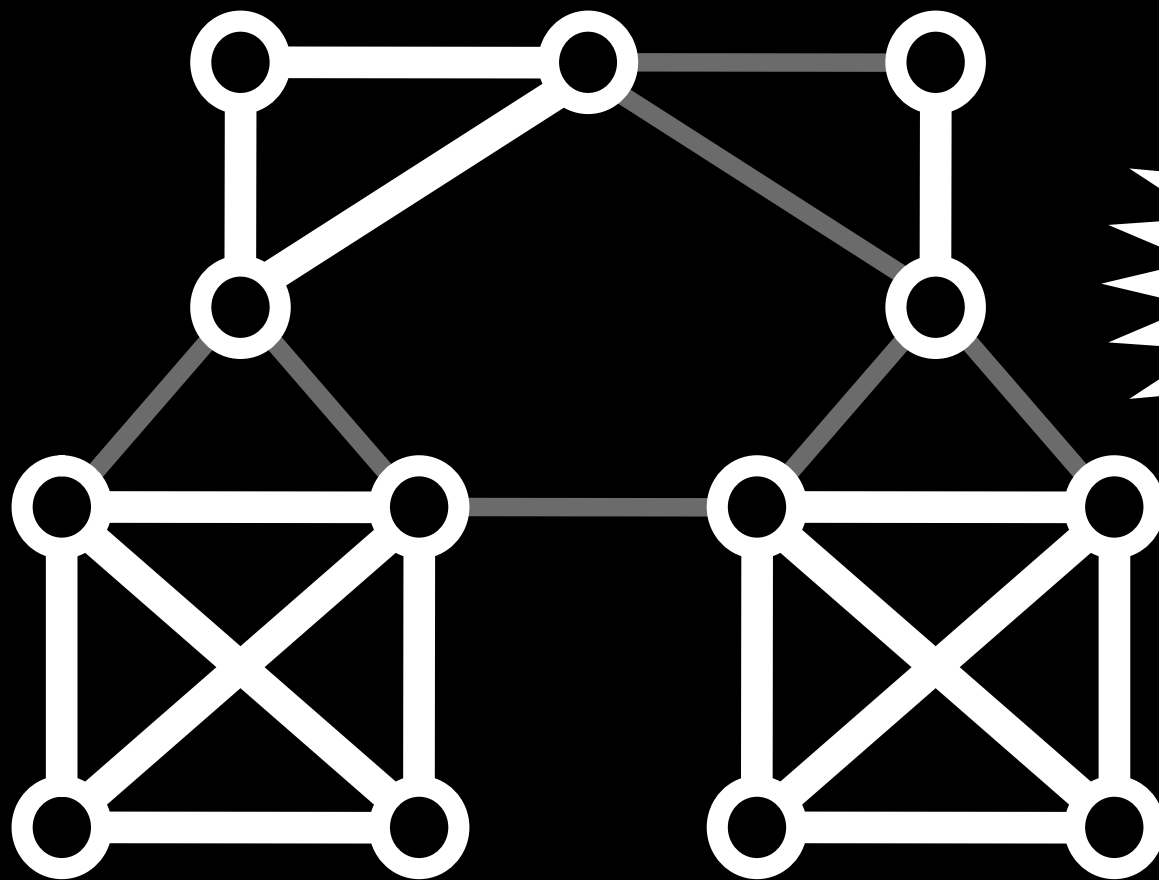
**Theorem:** A signed graph has a clustering if and only if the graph contains no cycles which have exactly one negative edge

**Where do the best job leads  
come from: your close friends  
or your acquaintances?**

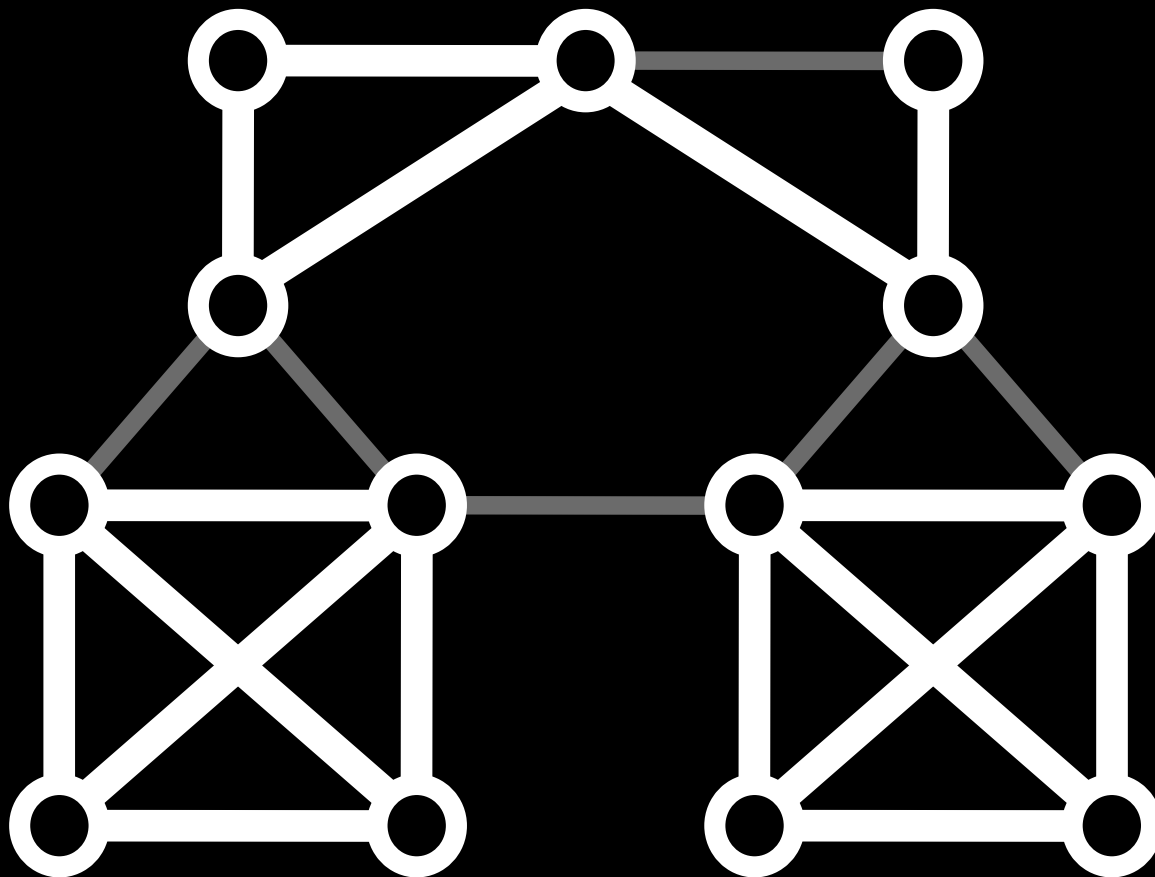
# Weak Versus Strong Ties



**Definition:** Node  $v$  satisfies the **Strong Triadic Closure** if, for any two nodes  $u$  and  $w$  to which it has strong ties, there is an edge between  $u$  and  $w$  (which can be either weak or strong)

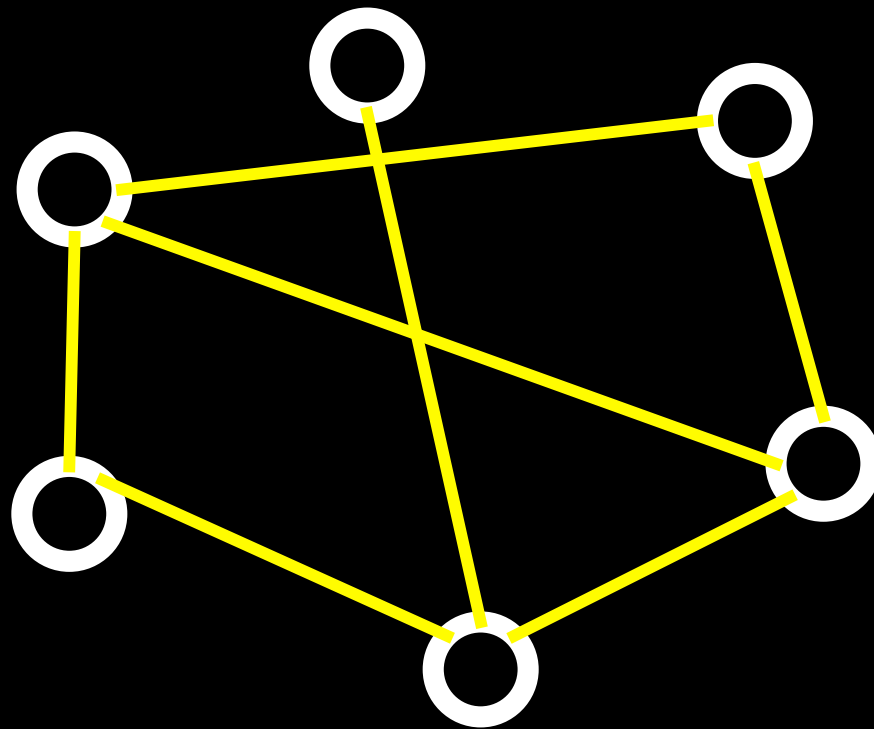


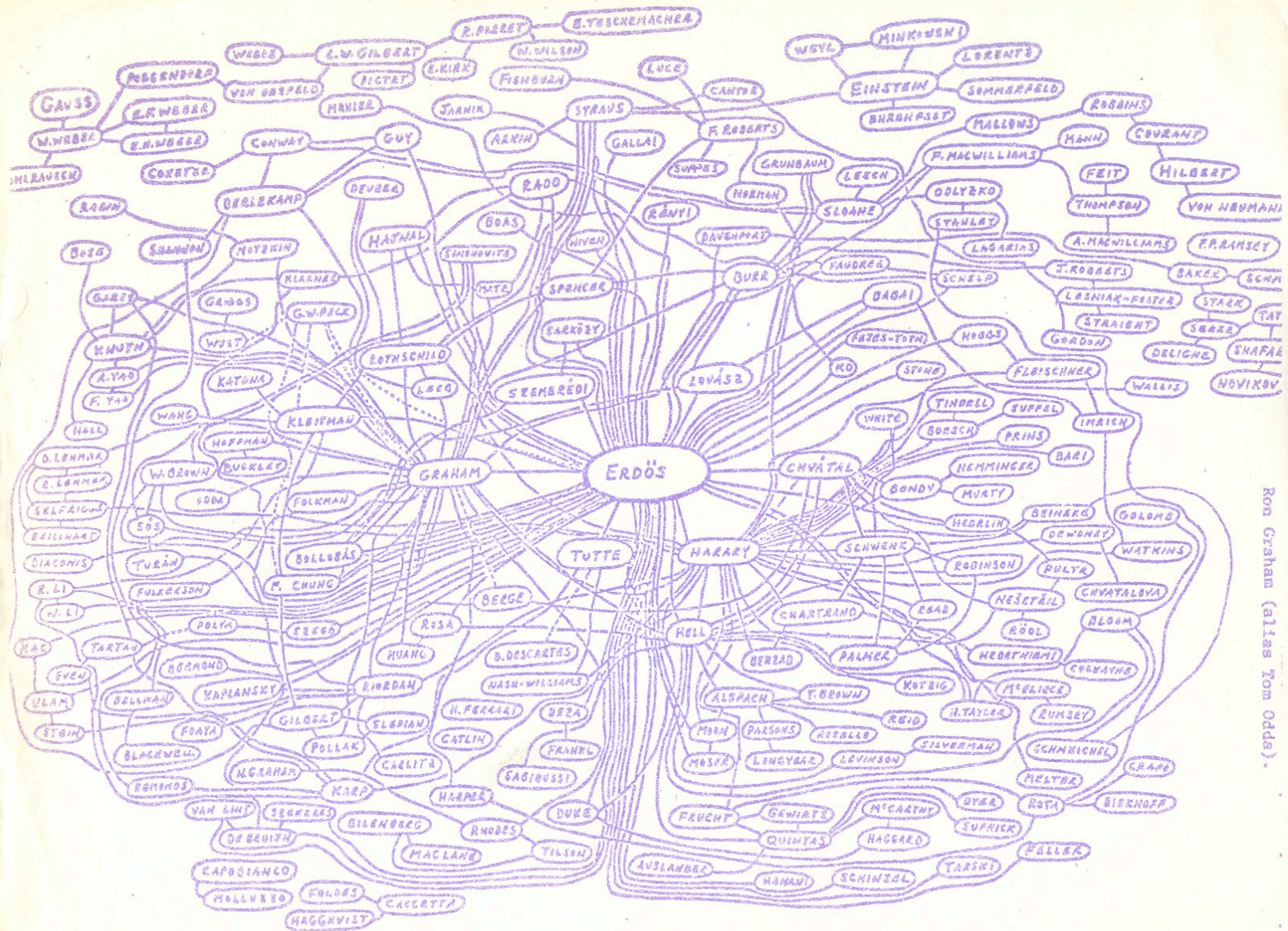
This graph  
satisfies the  
strong triadic  
closure



# Models of Network Structure

# Random Graphs





Ron Graham (Atlas Tom Odde).

Figure 1  
 To appear in Topics in Graph Theory (P. Harary, ed.) New York Academy of Sciences (1979).



# Random Graphs

- Graph with  $N$  people
- For every pair  $(i,j)$  of people in the graph, add the edge  $(i,j)$  with probability  $p$
- Called the Erdos-Renyi model  $G(n,p)$ :  $n$  vertices, each possible edge occurs with probability  $p$

# Some Properties of $G(n,p)$

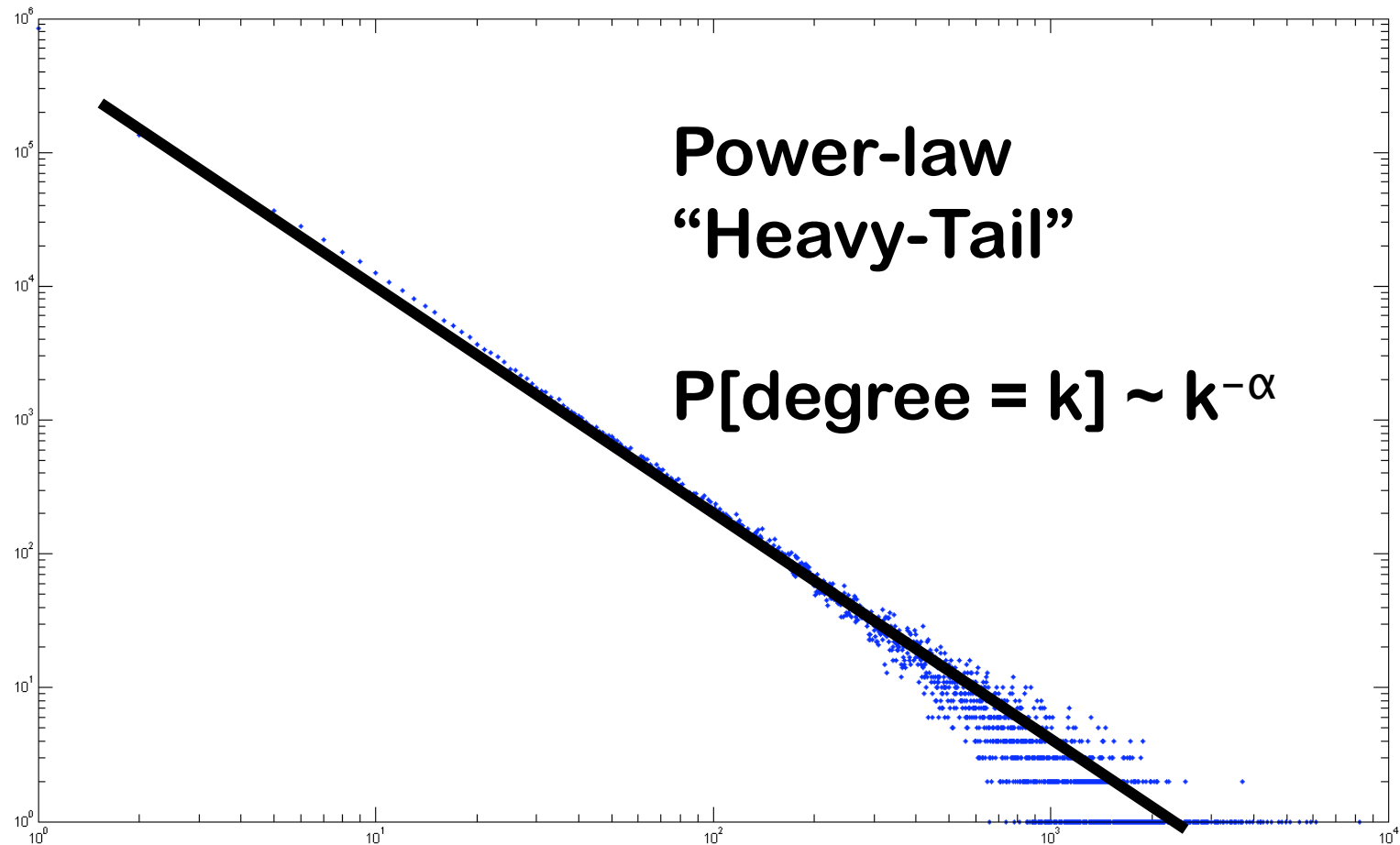
How many “clusters” (i.e. connected components with at least 5% of the population) does the global friendship graph have?

# The GIANT Component

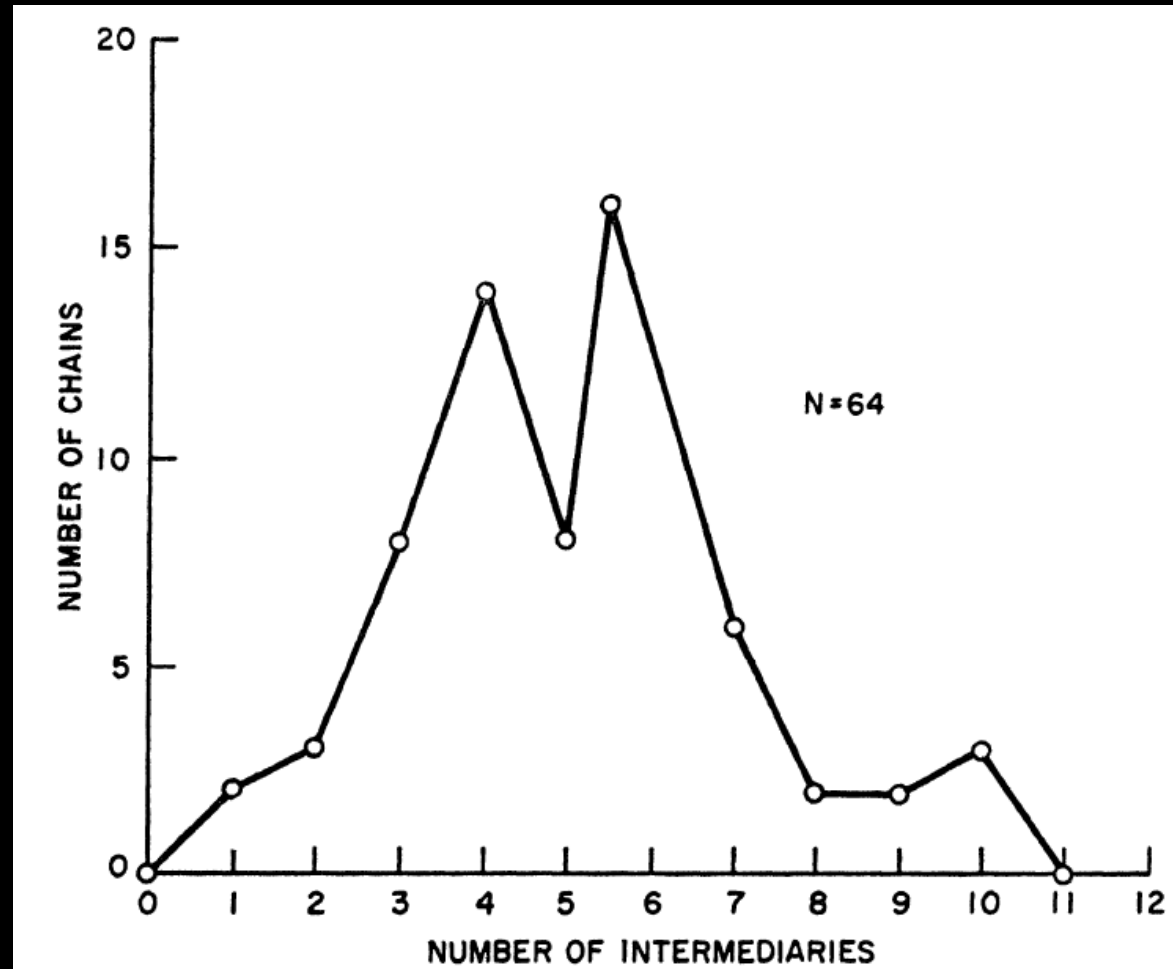
**Many (most?) real-world  
networks don't follow the  
Erdos-Renyi model!**

**Real networks are often  
“scale-free”**

# Degree Distribution in Flickr



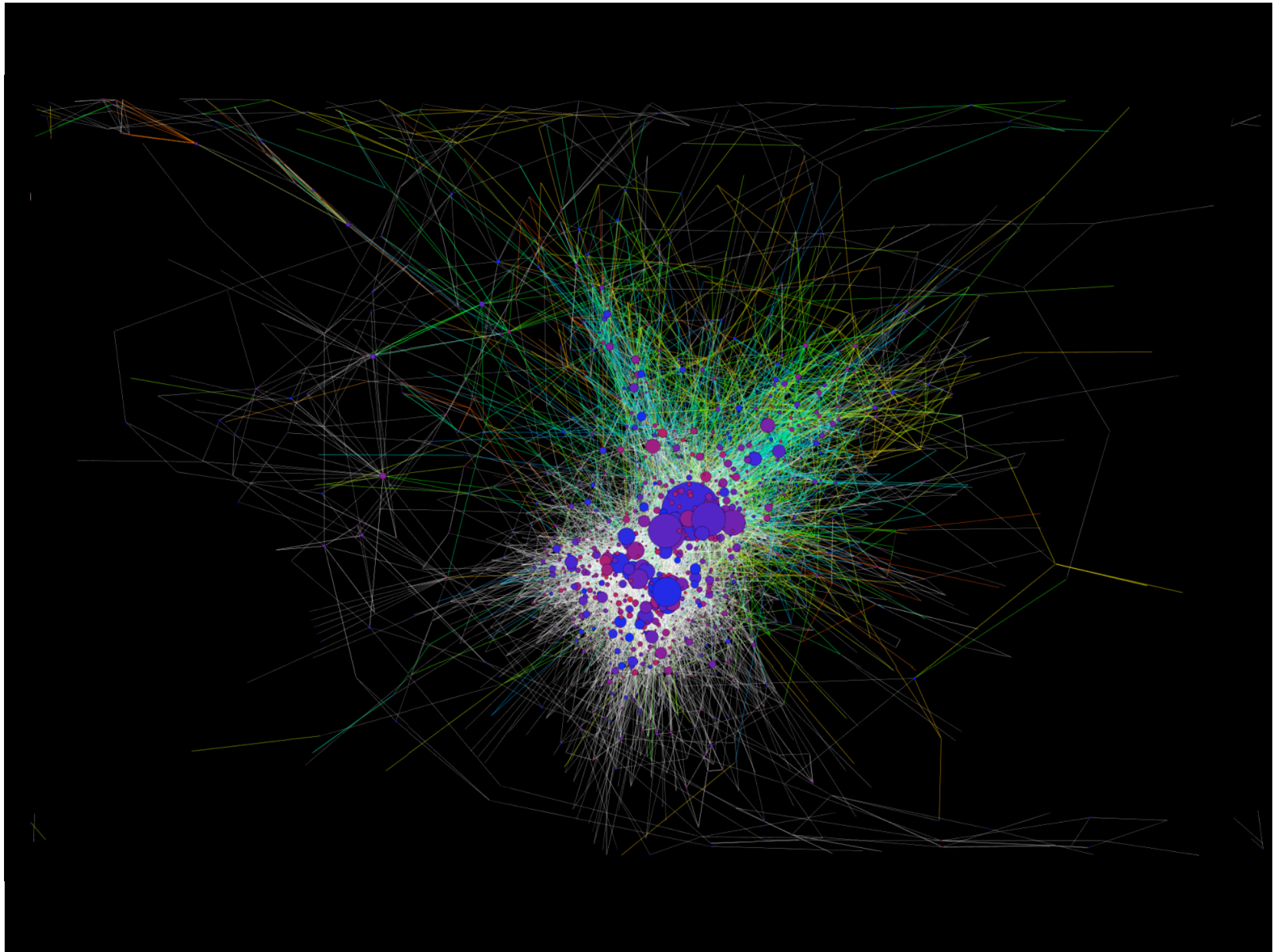
# Milgram's Small World

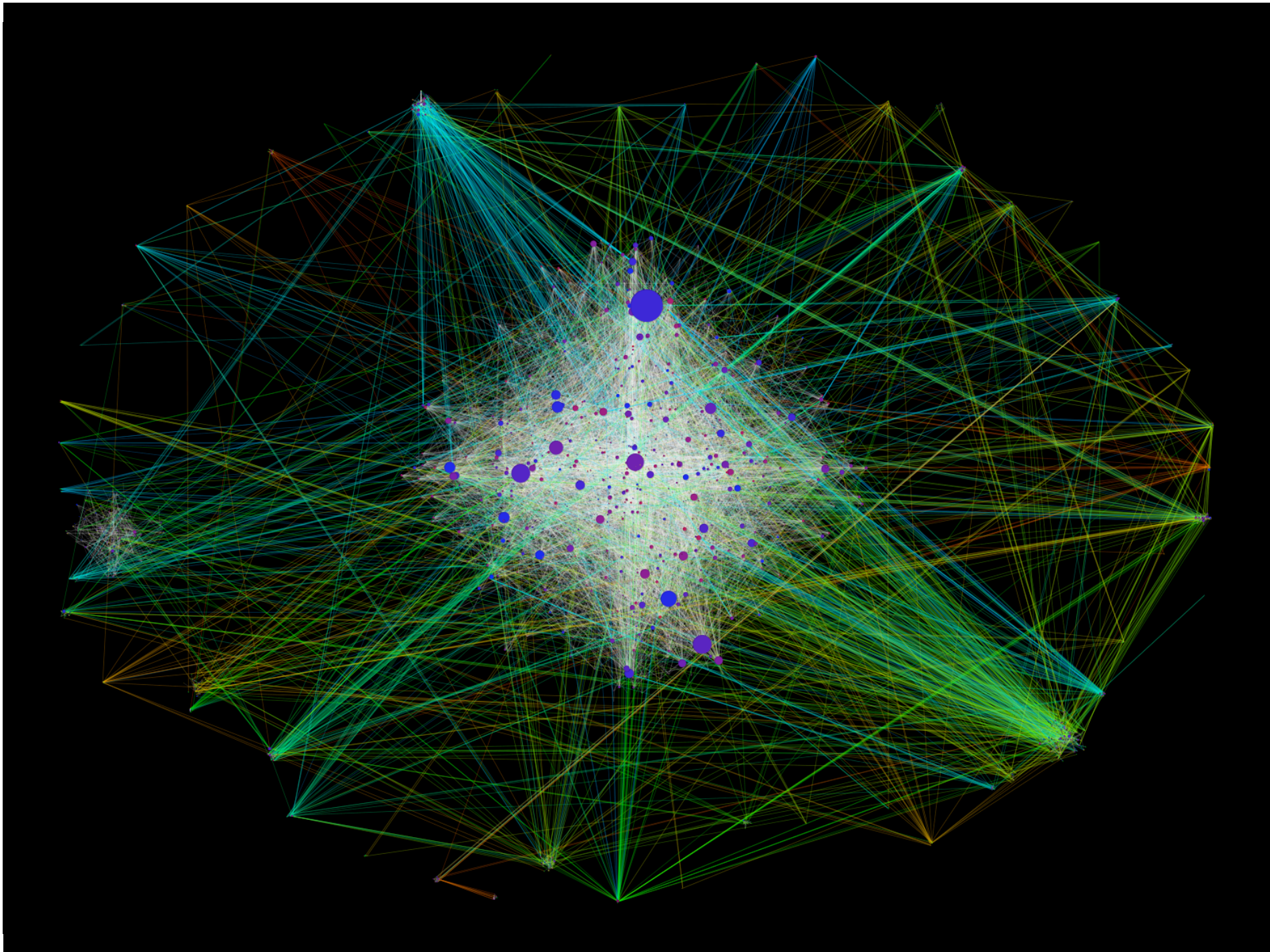


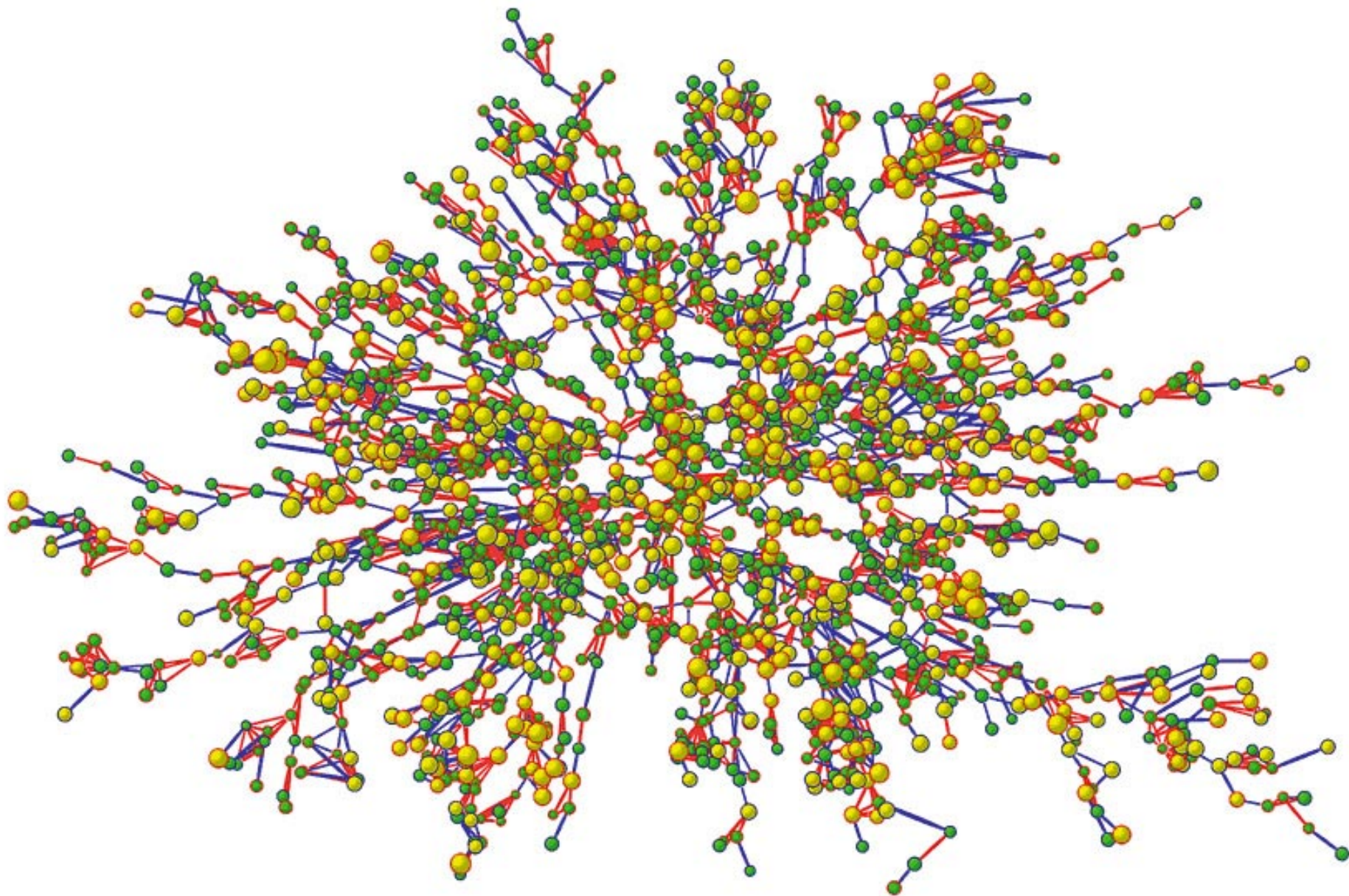
**The reason the small world phenomenon is surprising is that the human social network is highly clustered**

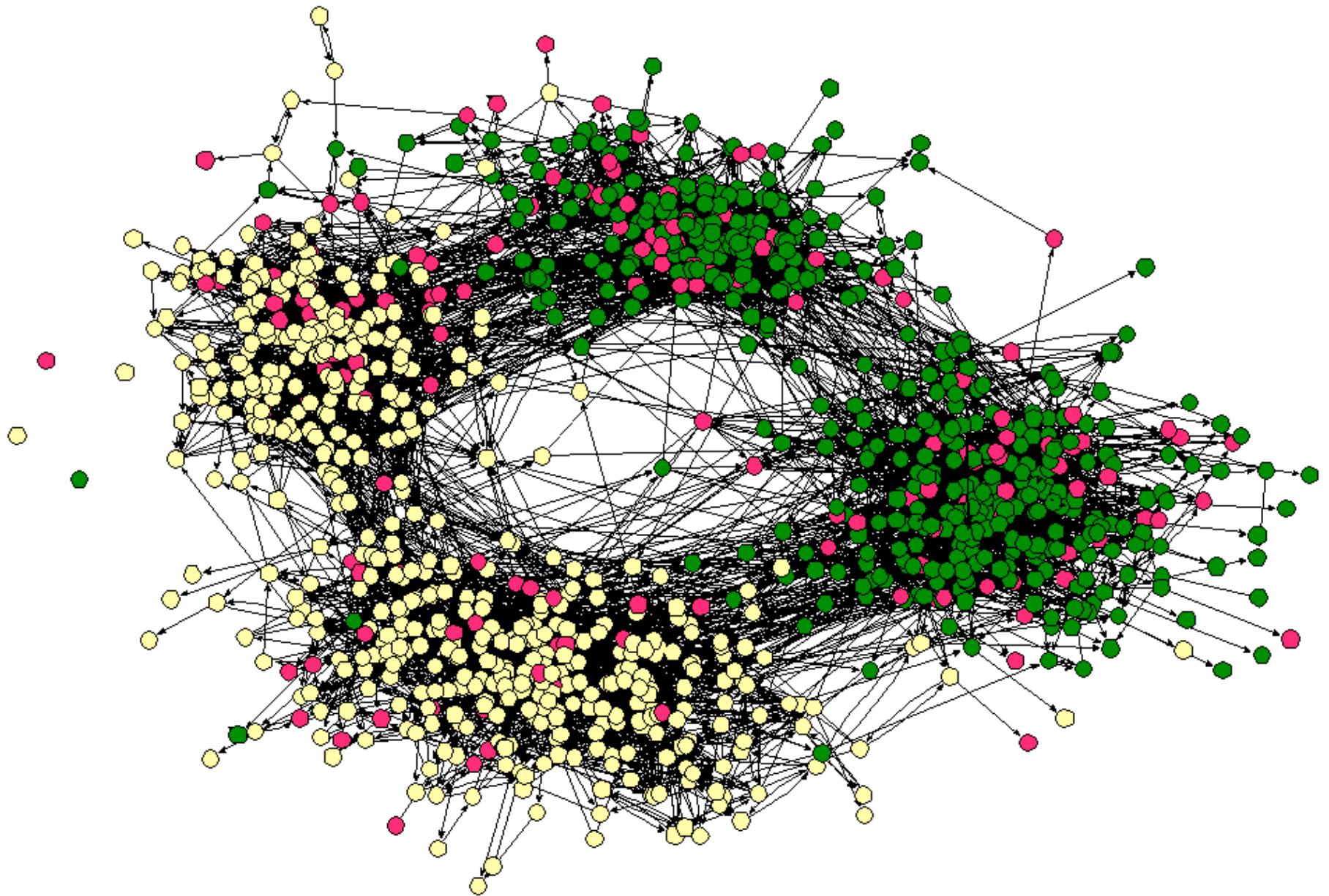
# The Beauty of Networks

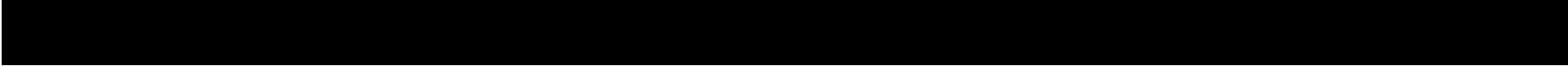
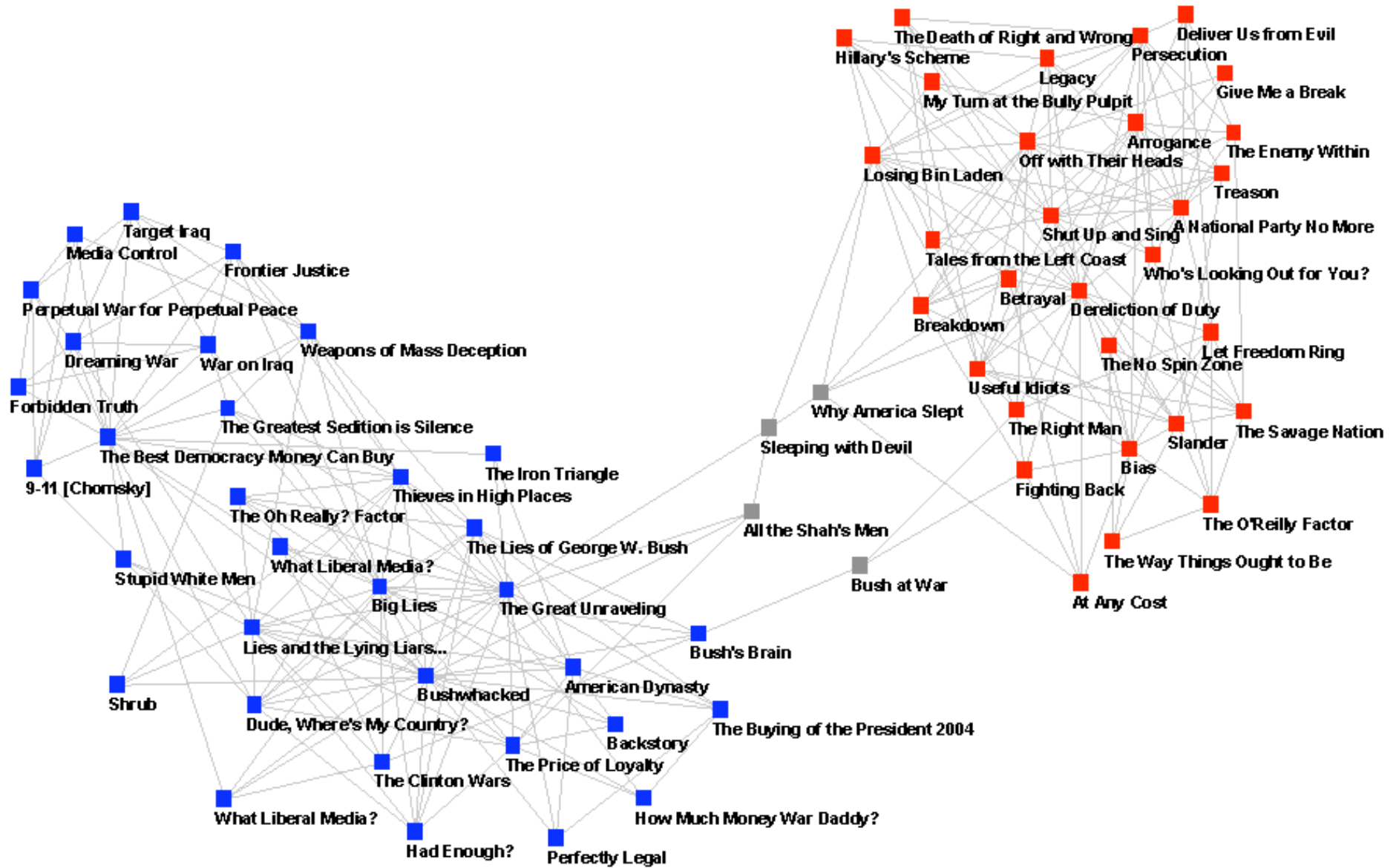
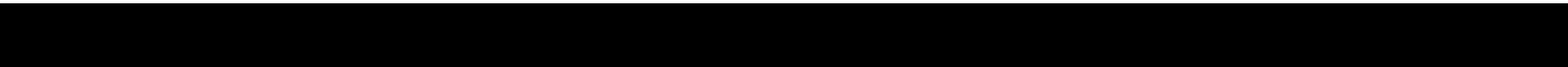


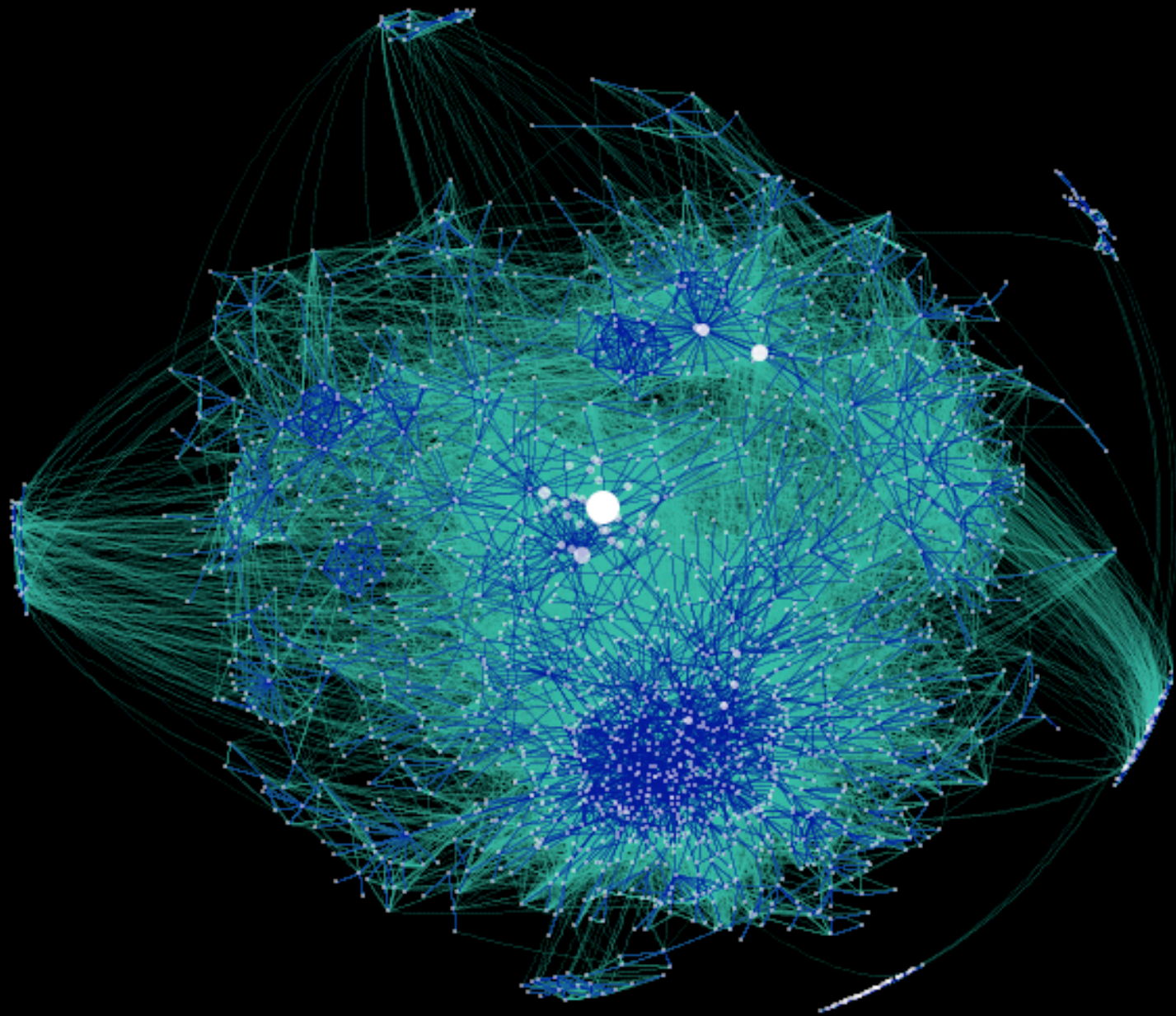


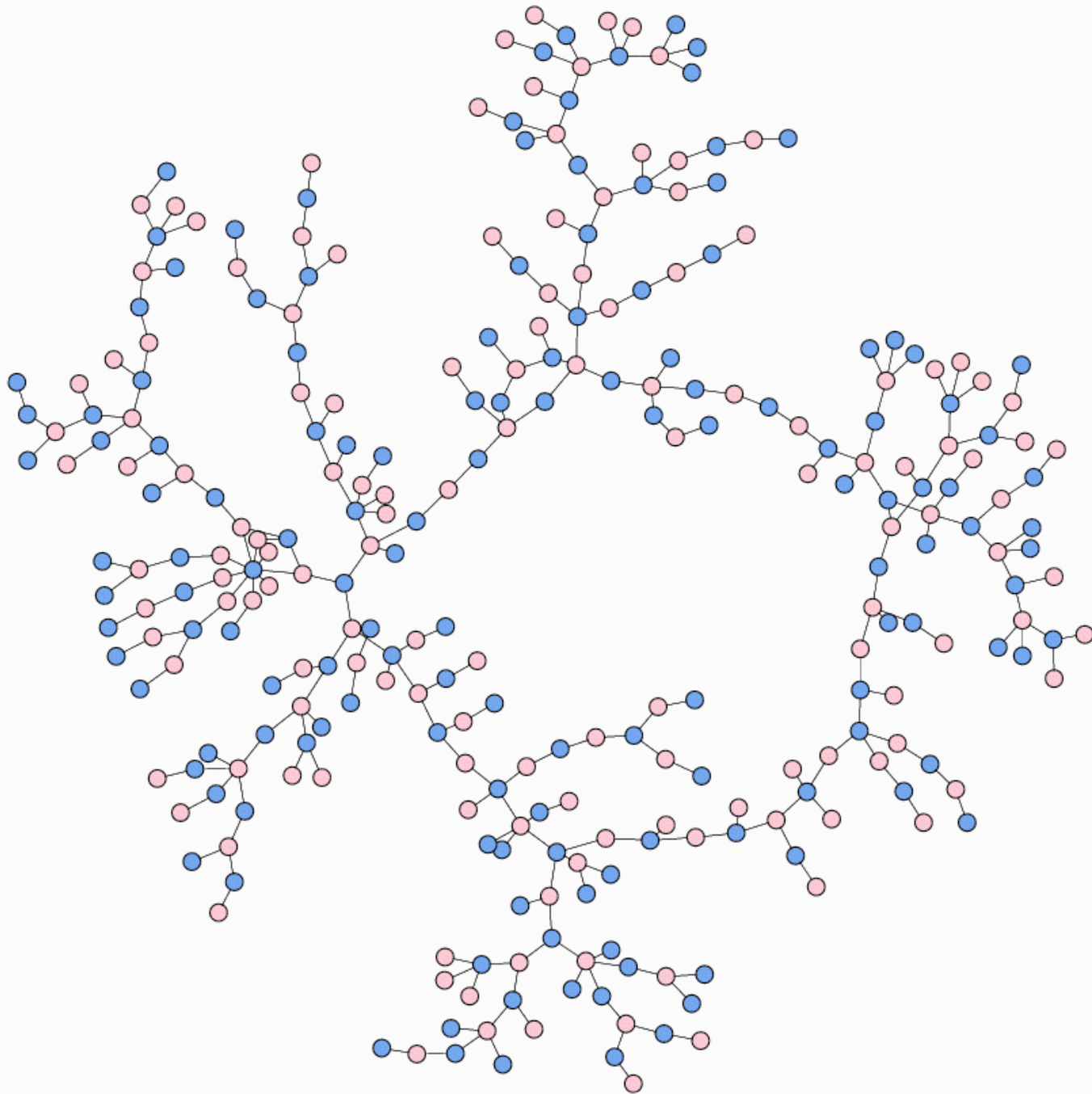


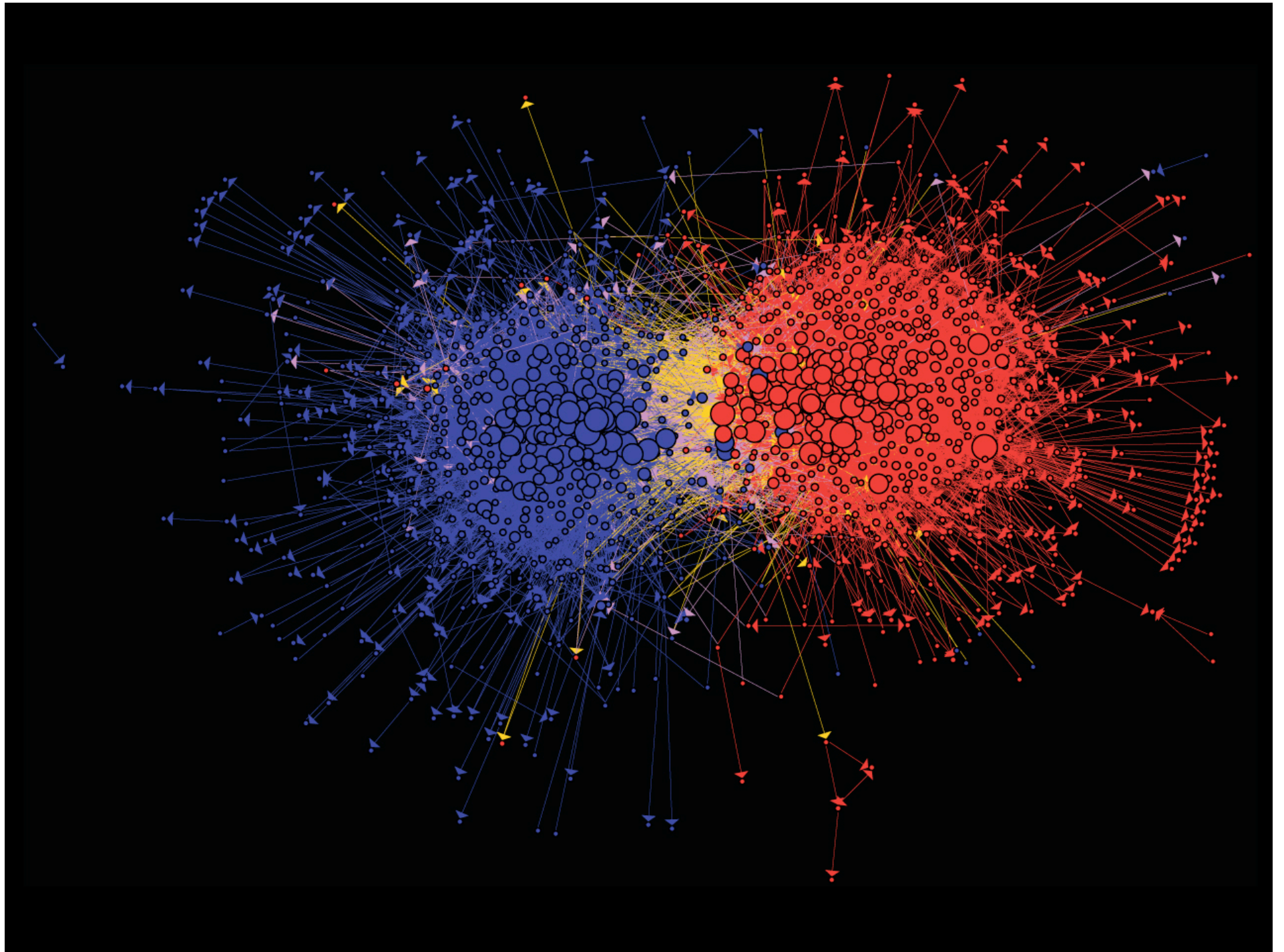




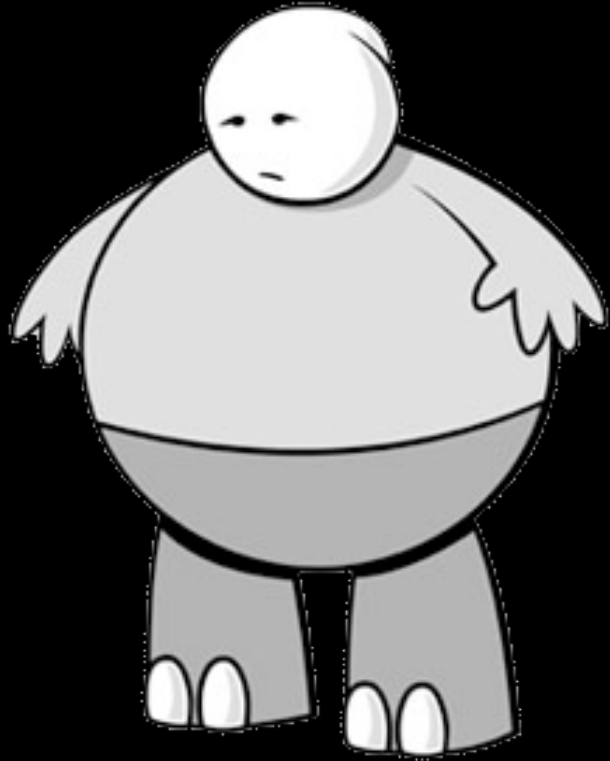












Here's What  
You Need to  
Know...

## Network Structures

- Structural holes, cliques, clusters, bridges, local bridges
- Balanced cycles and graphs
- Strong triadic closure

## Network Measures

- Degree centrality, betweenness centrality

## Graph Models

- Erdos-Renyi model
- Real-world networks have power-law degree distribution