

# A First Course in Network Science: 3.3- 3.6

---

Djura Smits, Analytics SIG, 15-02-  
2021



# Content

1. The Friendship Paradox
2. Ultra-Small Worlds
3. Robustness
4. Core decomposition

# So far...

- Degree measures number of links on a node
- Betweenness measures how often a node is traversed following shortest paths
- In large networks statistical tools are necessary to analyze global features
- Distributions of centrality measures are often heterogeneous in real networks. Degree distribution often has heavy tail
- Nodes with a large degree are called hubs

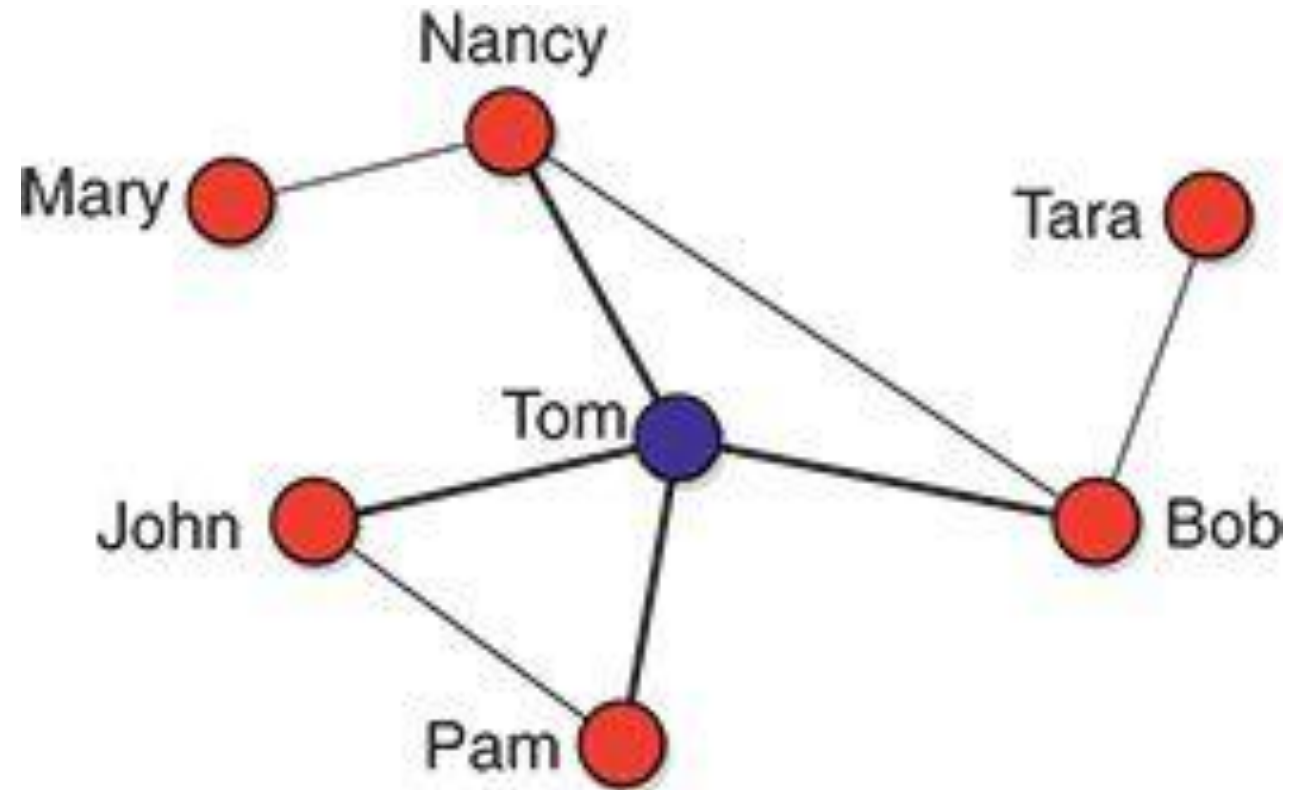
## 3.3: The Friendship Paradox

*In social networks, most people have fewer friends than their friends have, on average*



# Exercise

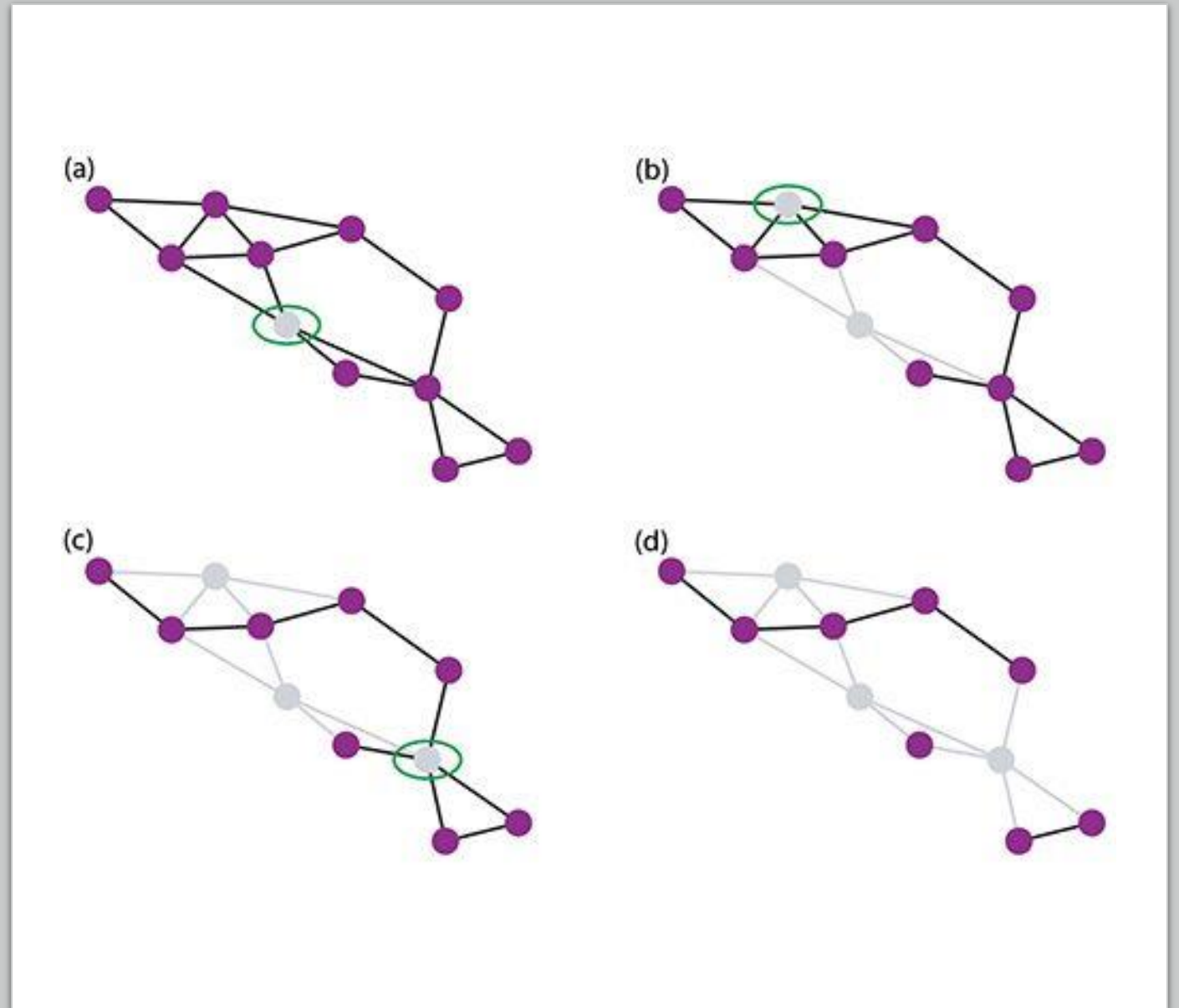
1. What is the average degree?
2. What is the average number of friends of friends?



# 3.5

## Robustness

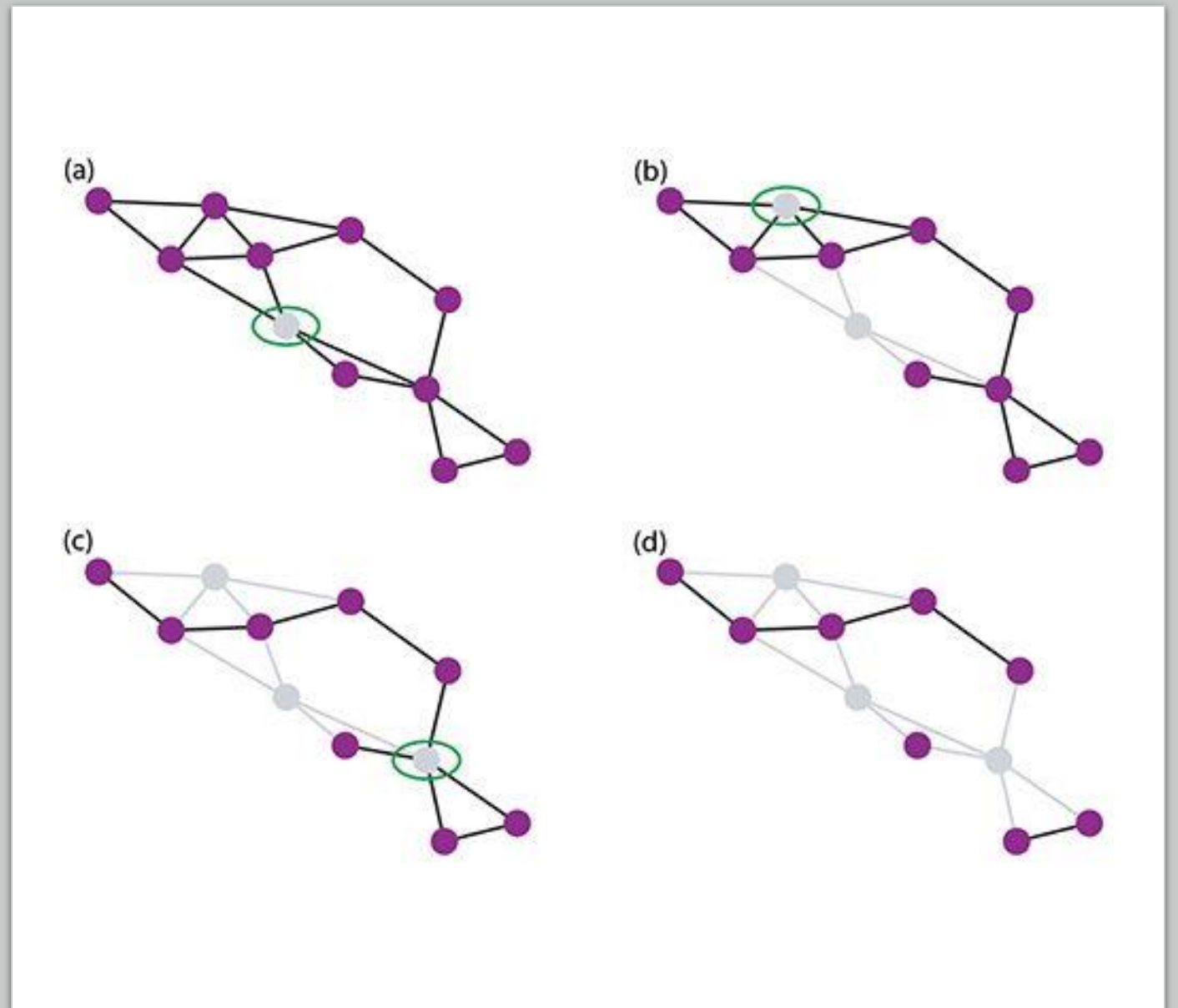
- A system is *robust* if the failure of some of its components does not affect its function
- Robustness depends on *which* components fail
- A way to define robustness:
  - How many nodes stay connected after removal of one or several nodes?
  - What is the proportion of the giant component after removal?



# 3.5

## Robustness

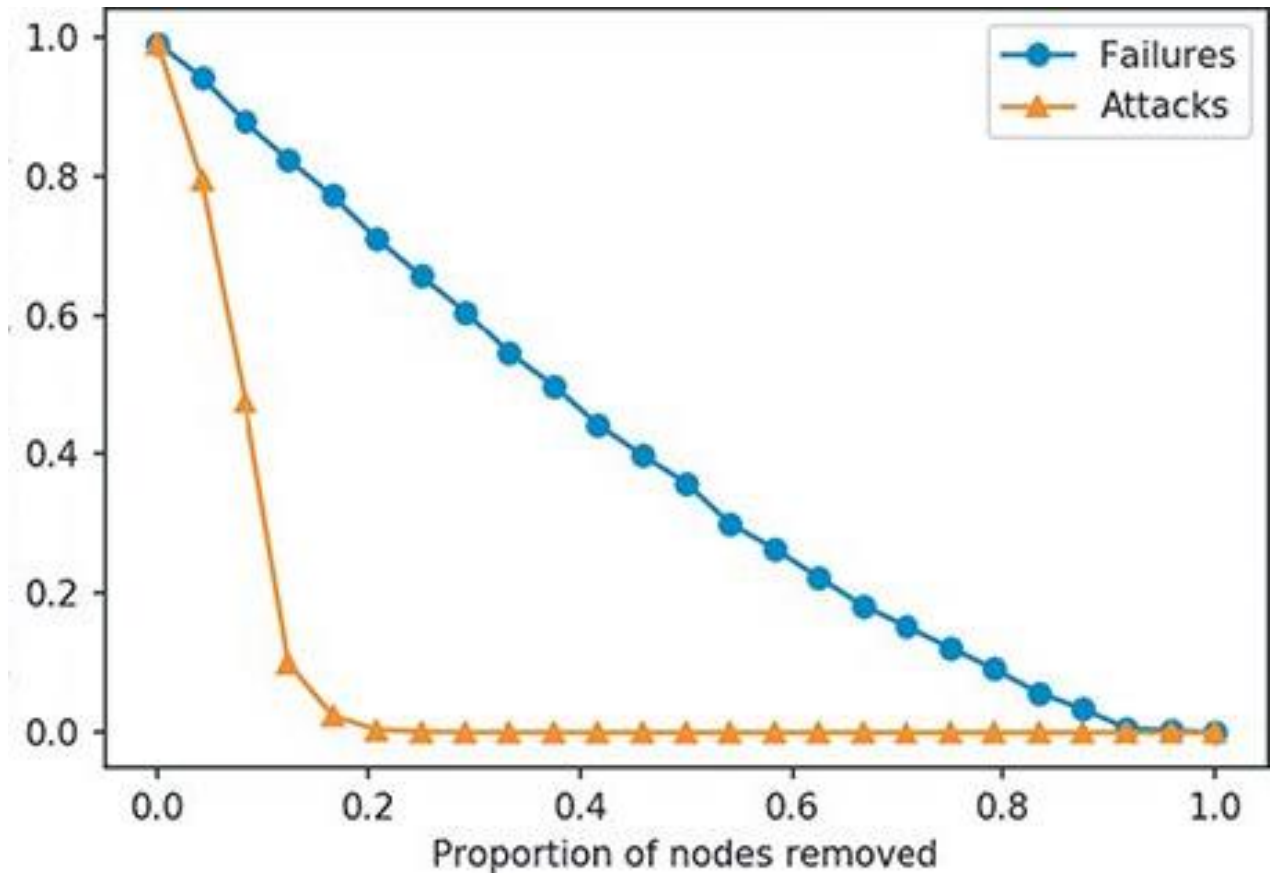
- Exercise:
- Compute proportion of nodes in giant component in a, b, c, d





# Robustness

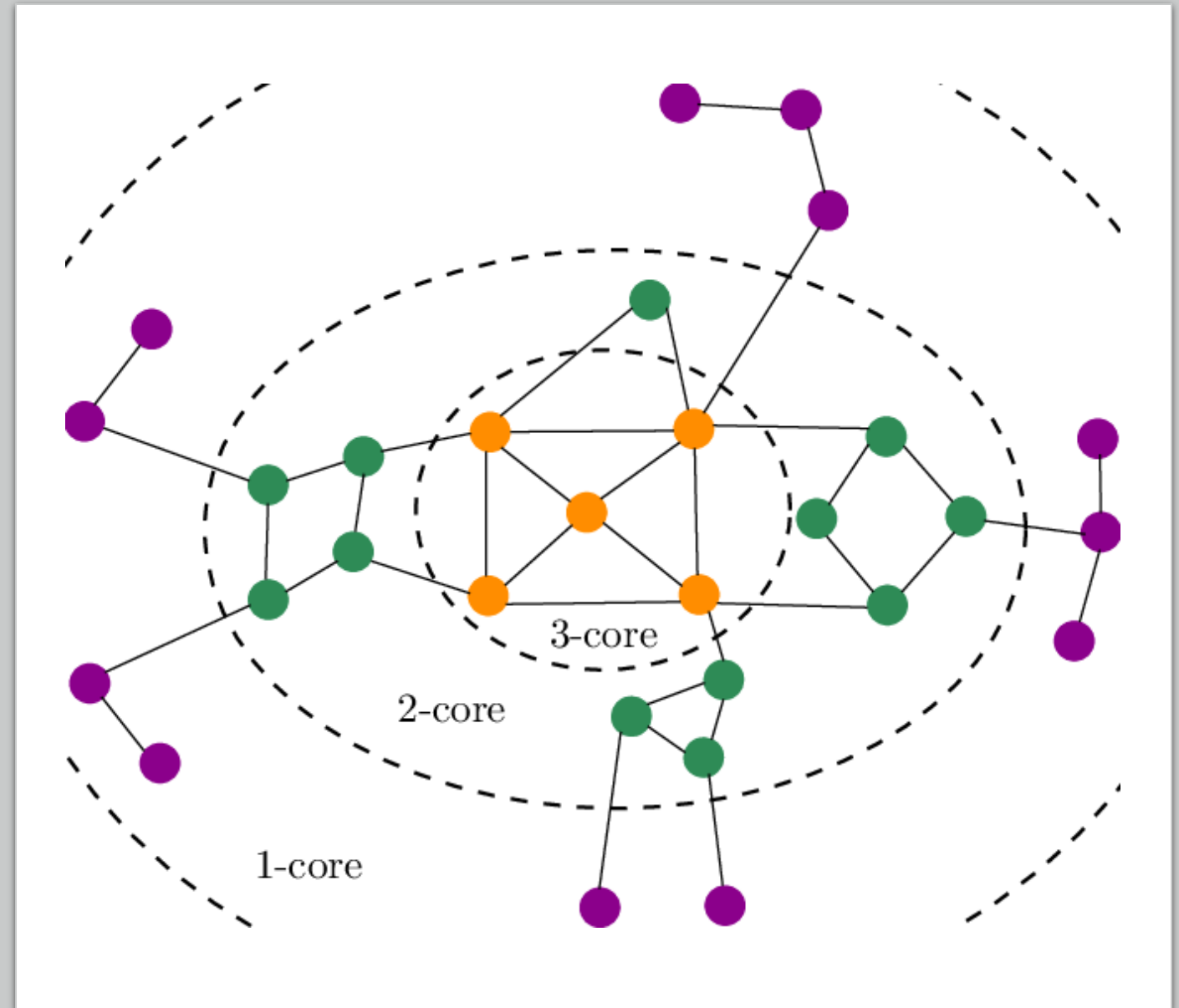
- Picture illustrates robustness of OpenFlight World network
- Failures: random nodes are removed from network
- Attacks: node removal prioritized based on degree



*Proportion of giant component in Openflight World network after random failures and targeted attacks*

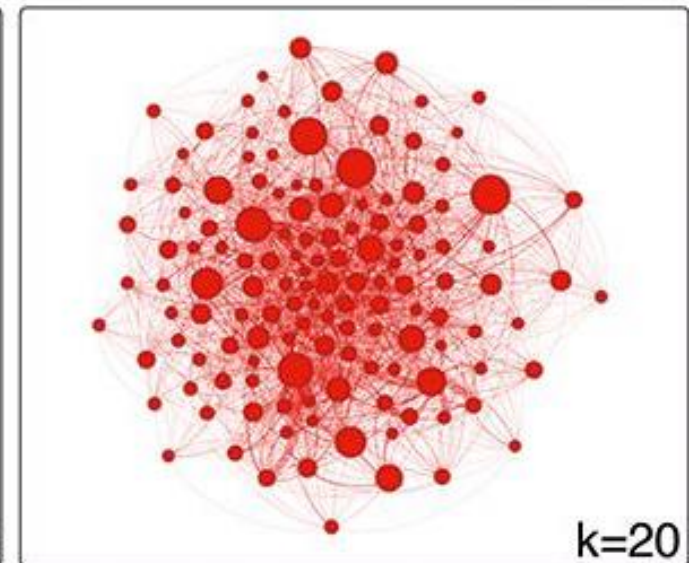
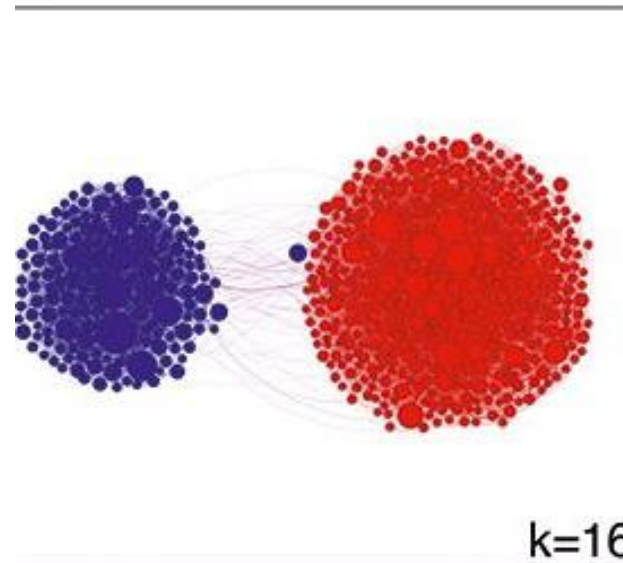
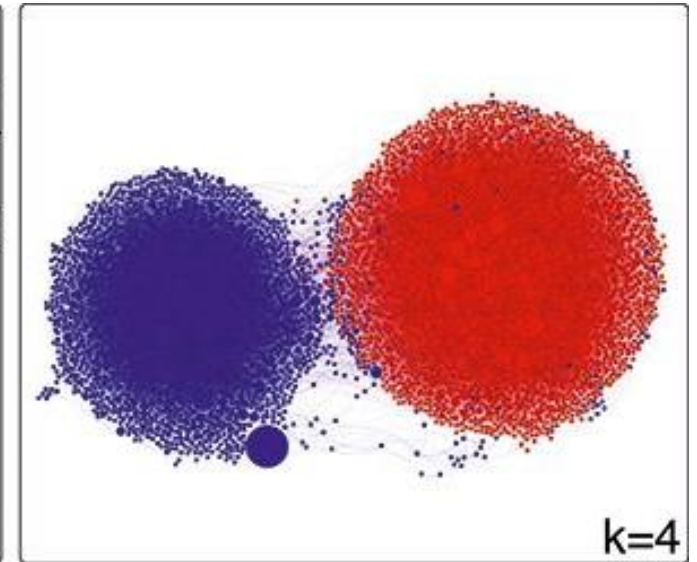
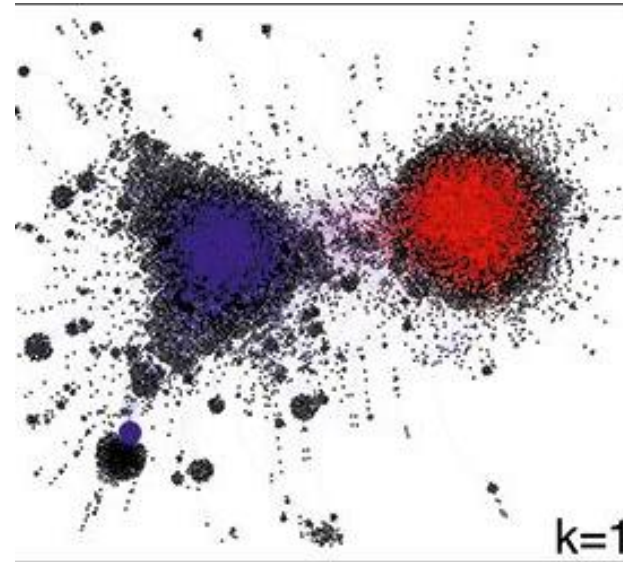
## 3.6: Core Decomposition

- Formally, the  $k$ -core decomposition algorithm starts by setting  $k=1$ . Then it proceeds iteratively. Each iteration corresponds to a value of  $k$  and consists of a few simple steps:
- 1. Recursively remove all nodes of degree  $k$ , until there are no more left.
- 2. The removed nodes make up the  $k$ -shell and the remaining nodes make up the  $(k+1)$ -core, because they all have degree  $k+1$  or larger.
- 3. If there are no nodes left in the core, terminate; else, increment  $k$  for the next iteration.



## 3.6: Core Decomposition

- Image visualizes the Twitter political retweet network
- As  $k$  increases, peripheral nodes are removed and core becomes smaller and denser
- The innermost core contains only red nodes, corresponding to conservative accounts.



# Core decomposition in networkx

```
nx.core_number(G) # return dict with core number of each node
nx.k_shell(G,k)   # subnetwork induced by nodes in k-shell
nx.k_core(G,k)    # subnetwork induced by nodes in k-core
nx.k_core(G)      # innermost (max-degree) core subnetwork
```

