

**Oct. 5**

- 1. Administrative**
- 2. Clusters of nodes in networks**
- 3. Scientific consensus**

## Lab 1 feedback

- ⋮ Today or tomorrow!

## Lab 2

- ⋮ Posted, due *Friday*

## Help sessions

- ⋮ Thursday 10:30–noon

- ⋮ One other?

# Clusters of Nodes in Networks

# Clusters

## Grouping nodes in networks

### Why?

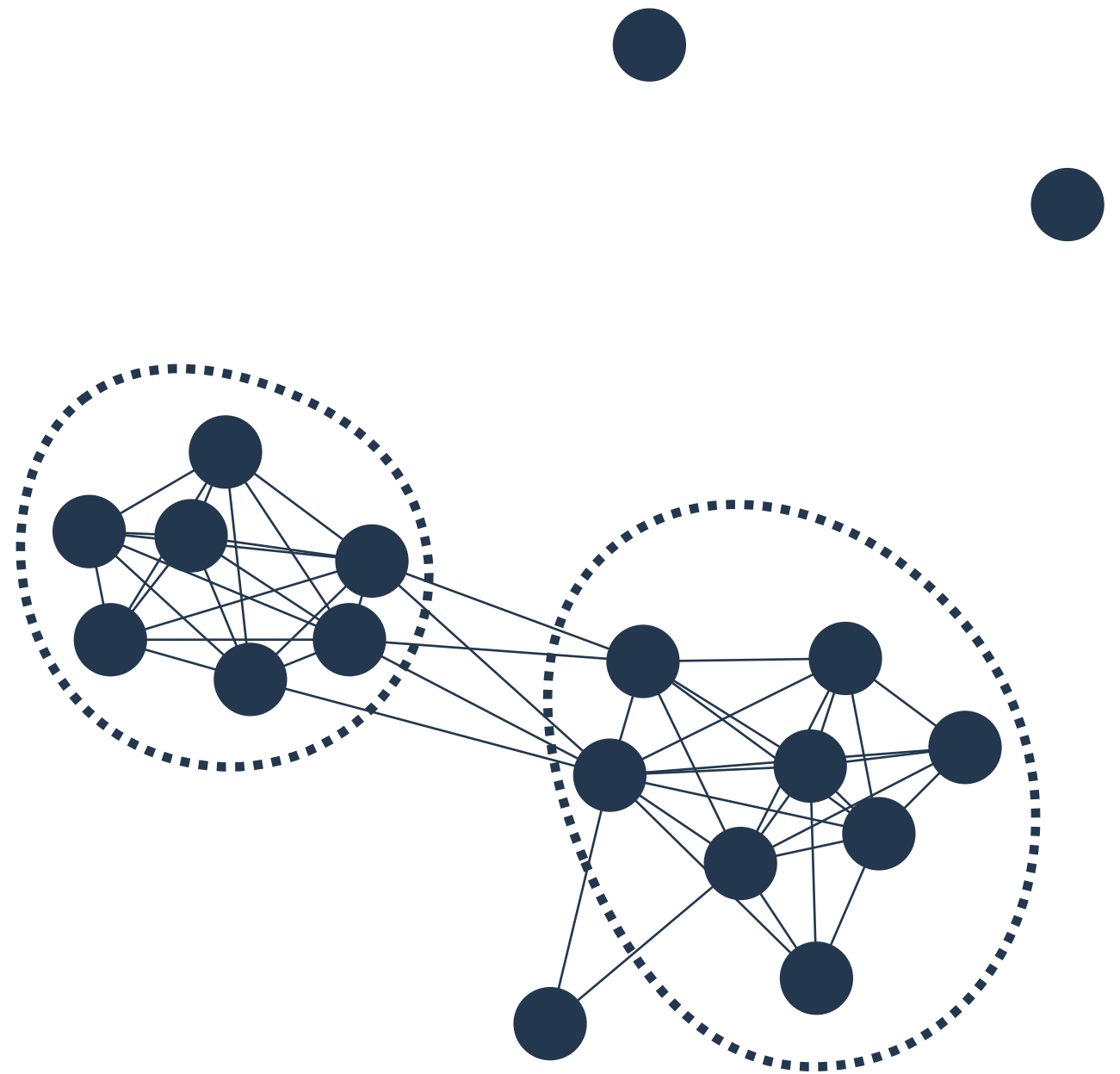
- ⋮ Groups are a basic theoretical component of social structure.
- ⋮ Cohesion, unity, identity, ...
- ⋮ Divisions, conflict, hierarchy, ...

### How?

- ⋮ Generally: clusters are groups of nodes that tend to connect more to each other than to others

### But what does that mean?

- ⋮ Embedded cliques
- ⋮ Overlapping/hierarchical groups
- ⋮ Partition of entire network



# Clusters

## Grouping nodes in networks

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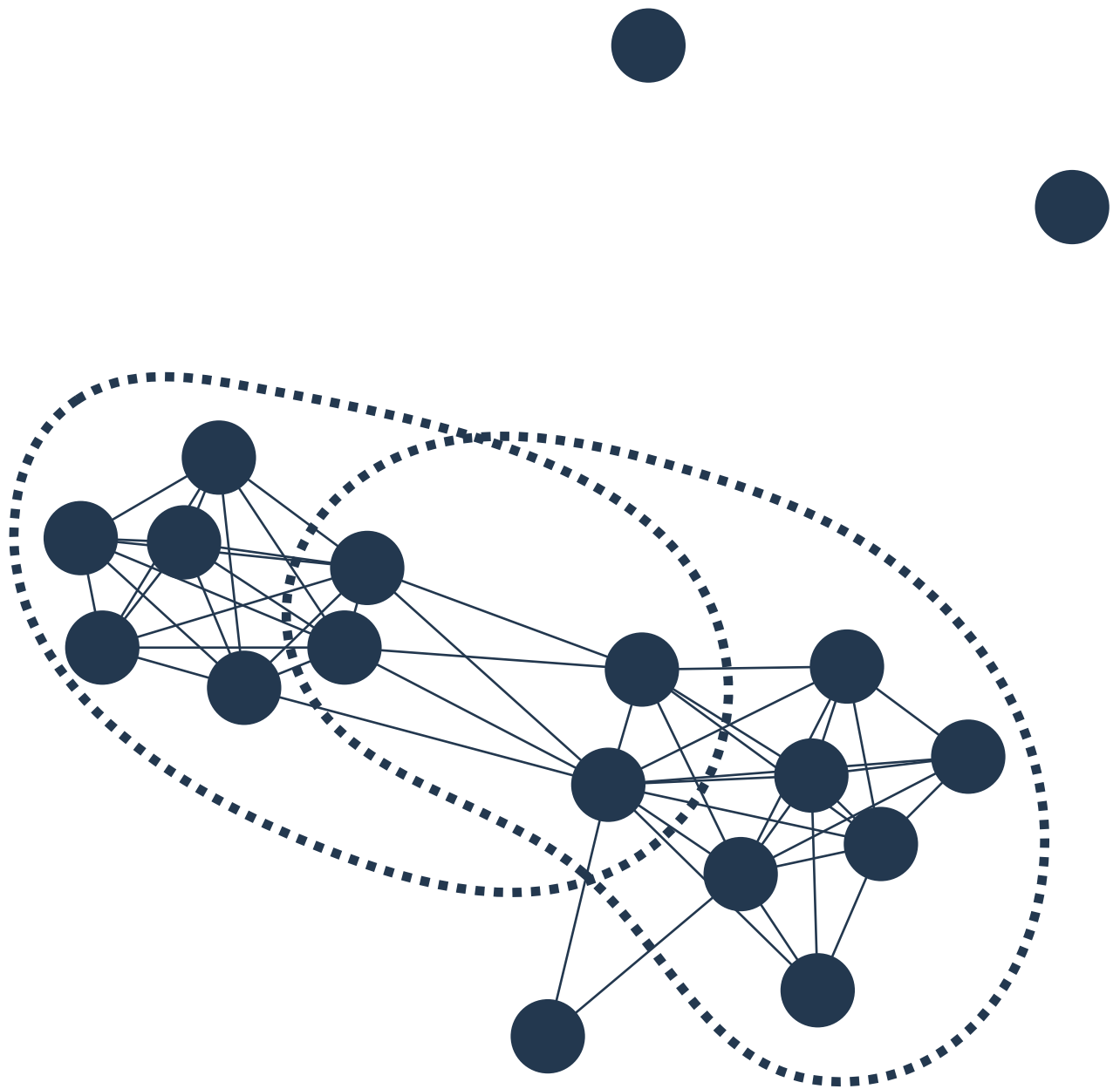
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# Clusters

## Grouping nodes in networks

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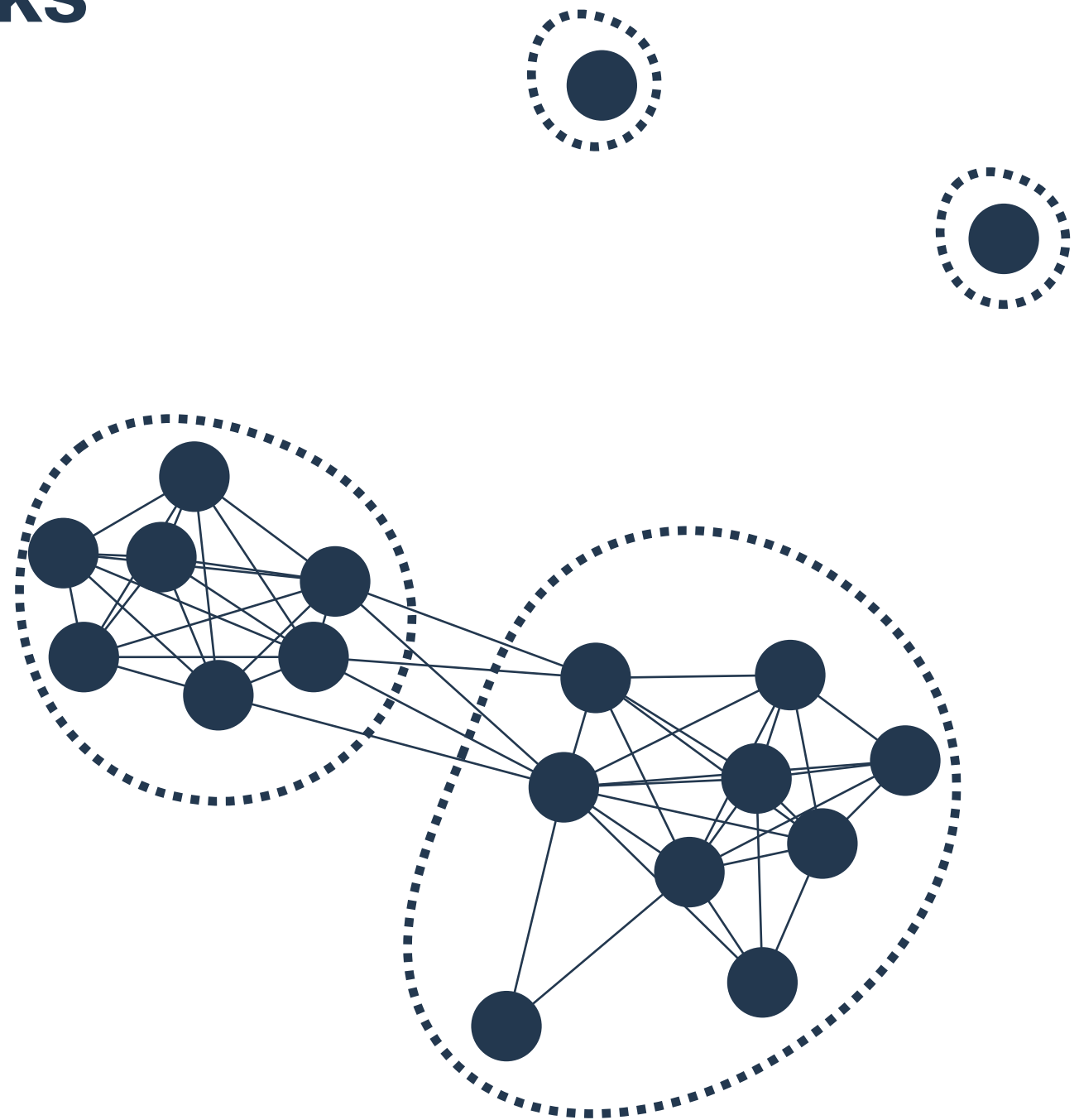
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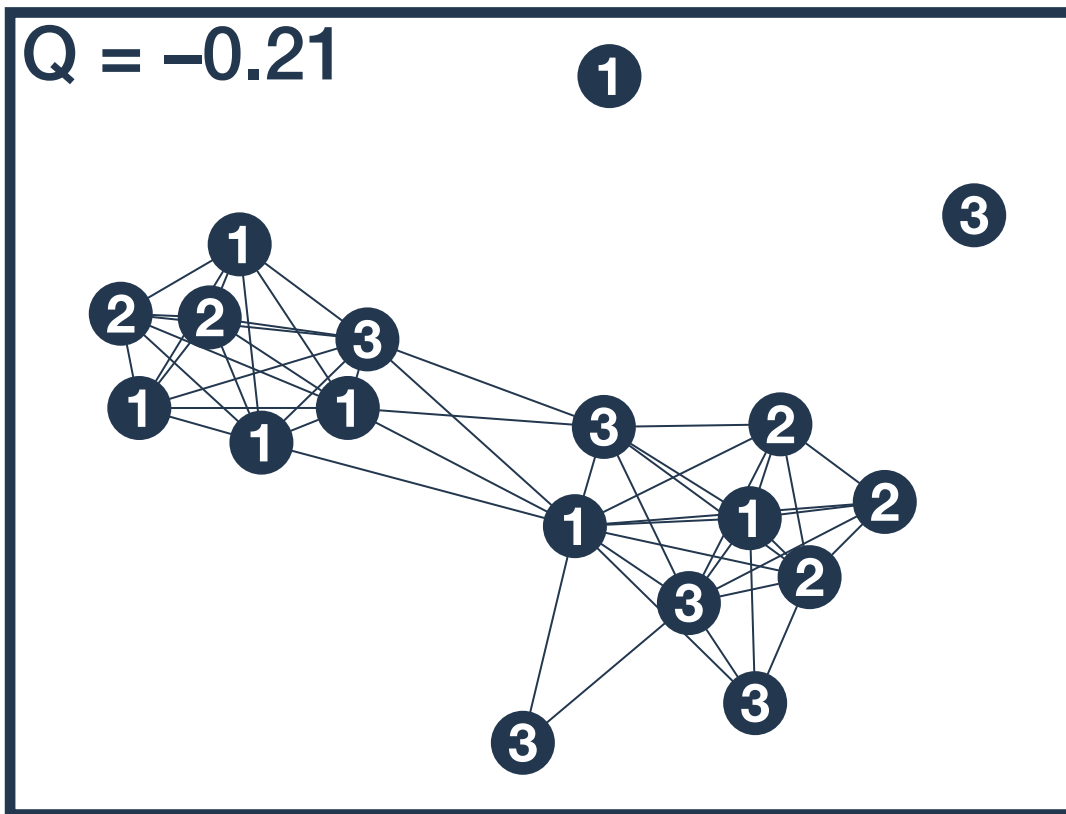
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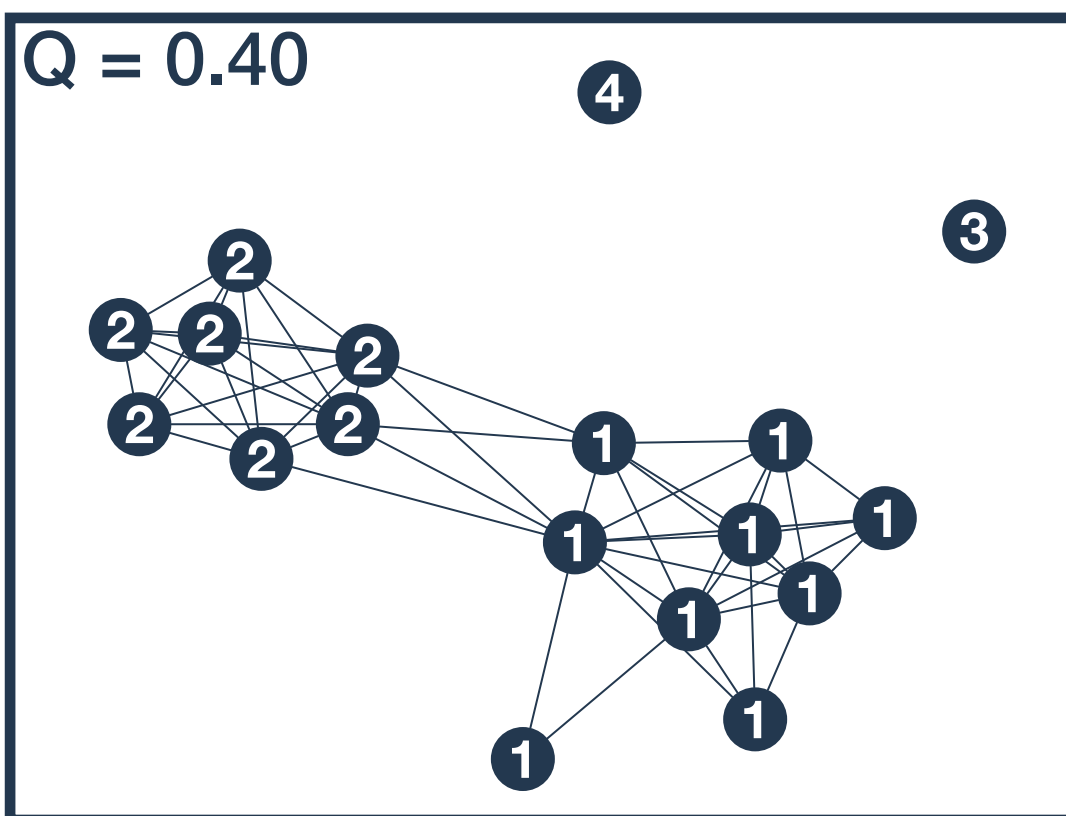


# Modularity



**Modularity (Q) measures ‘goodness’ of a partitioning**

- ∴ If you are given a particular partitioning of a network, modularity measures how much edges tend to stay within a partition.
- ∴ Ranges from  $-0.5$  (very bad fit) to  $1.0$  (very good fit)



**Modularity maximization**

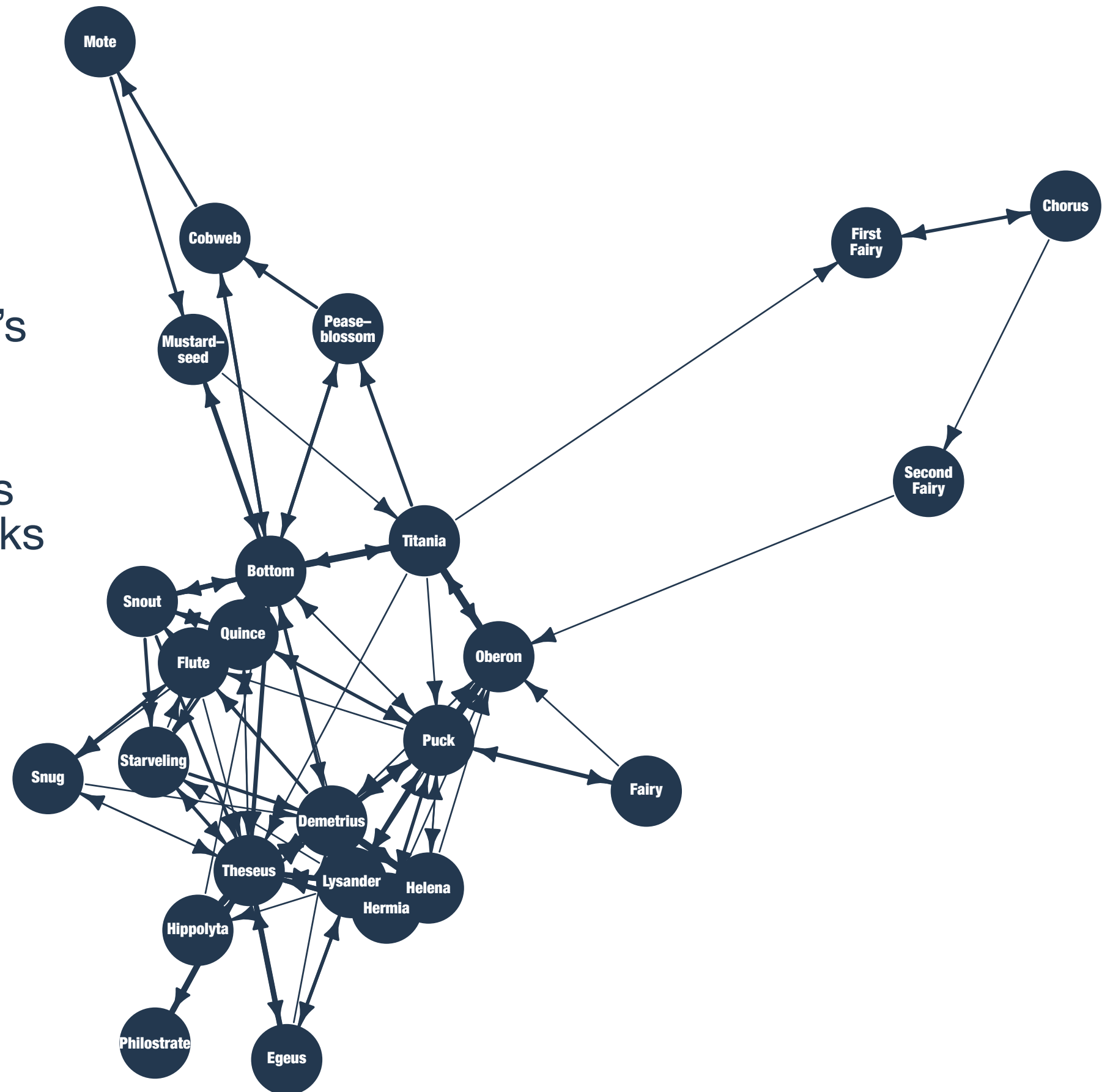
- ∴ Clustering strategy that finds the partitioning that has the highest possible modularity

# Clustering algorithms

## A Midsummer Night's Dream

### Character network

- ⋮ Directed edges indicate number of times one character's line immediately preceded another's
- ⋮ E.g. Cobweb speaks and then Mote speaks
- ⋮ Rough proxy for interaction



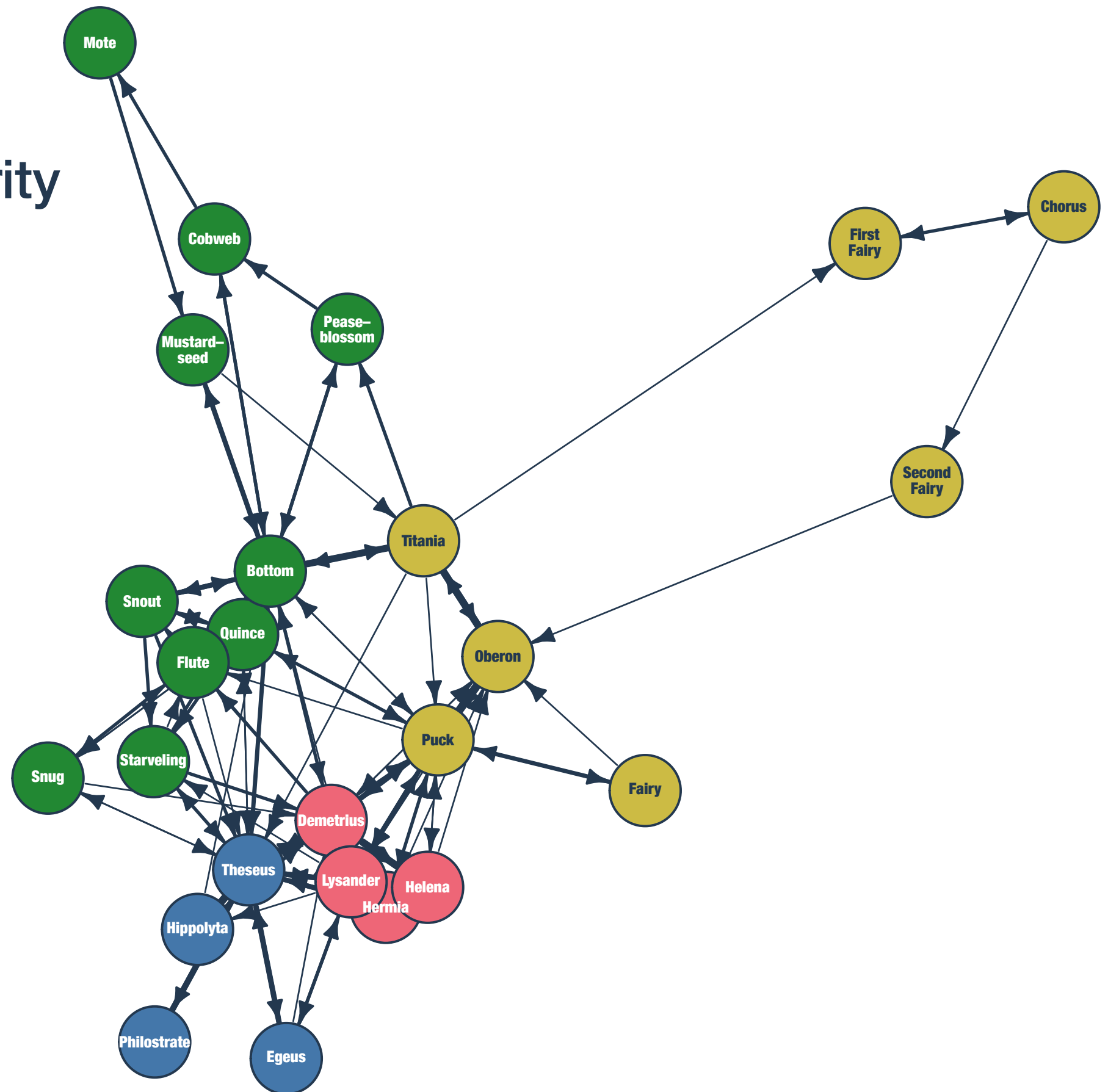


# Clustering algorithms

## A Midsummer Night's Dream

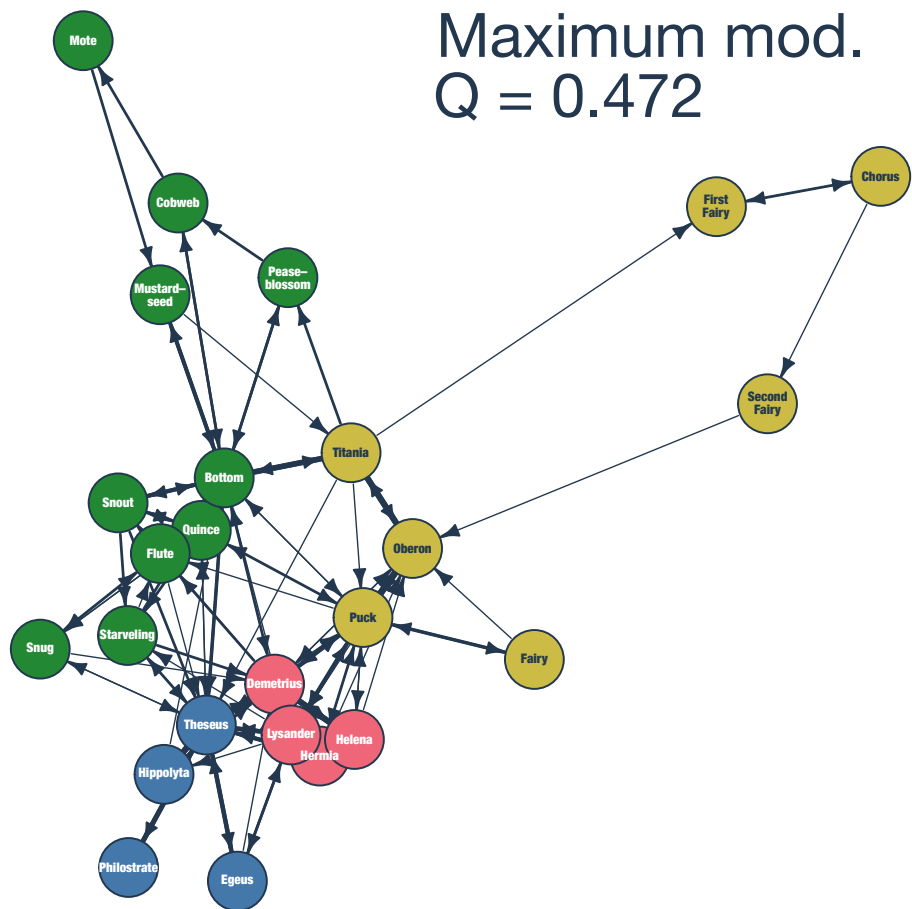
Maximum modularity clusters

$$Q = 0.472$$

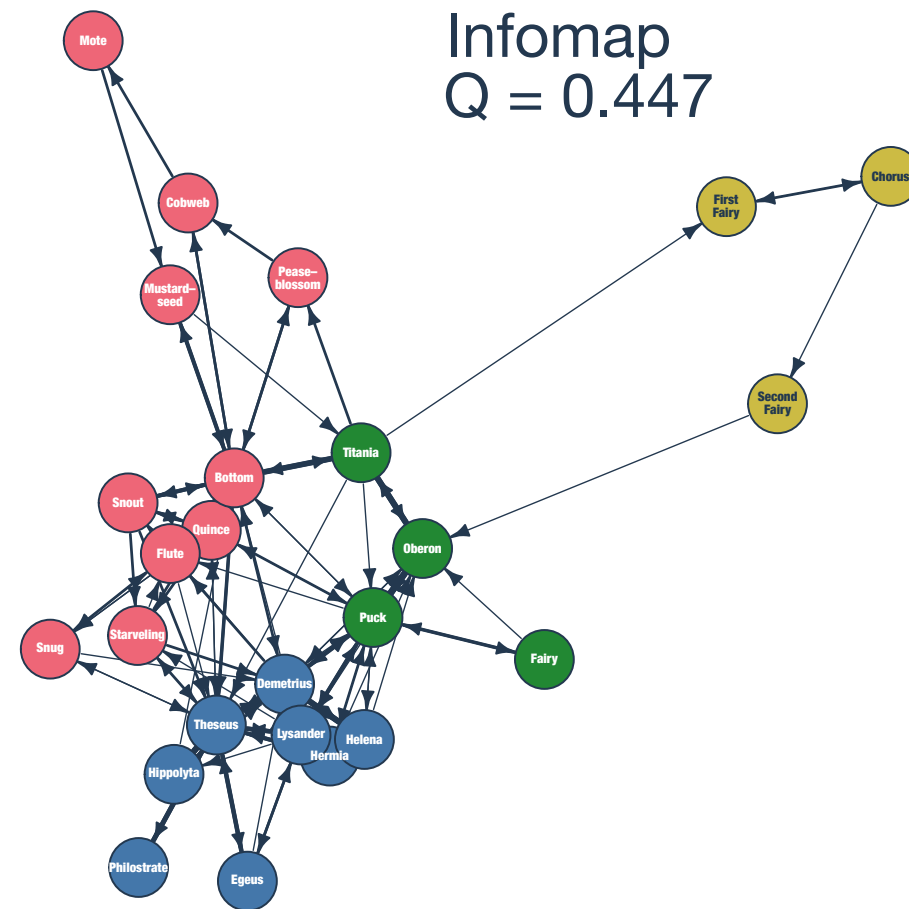


# Clustering algorithms

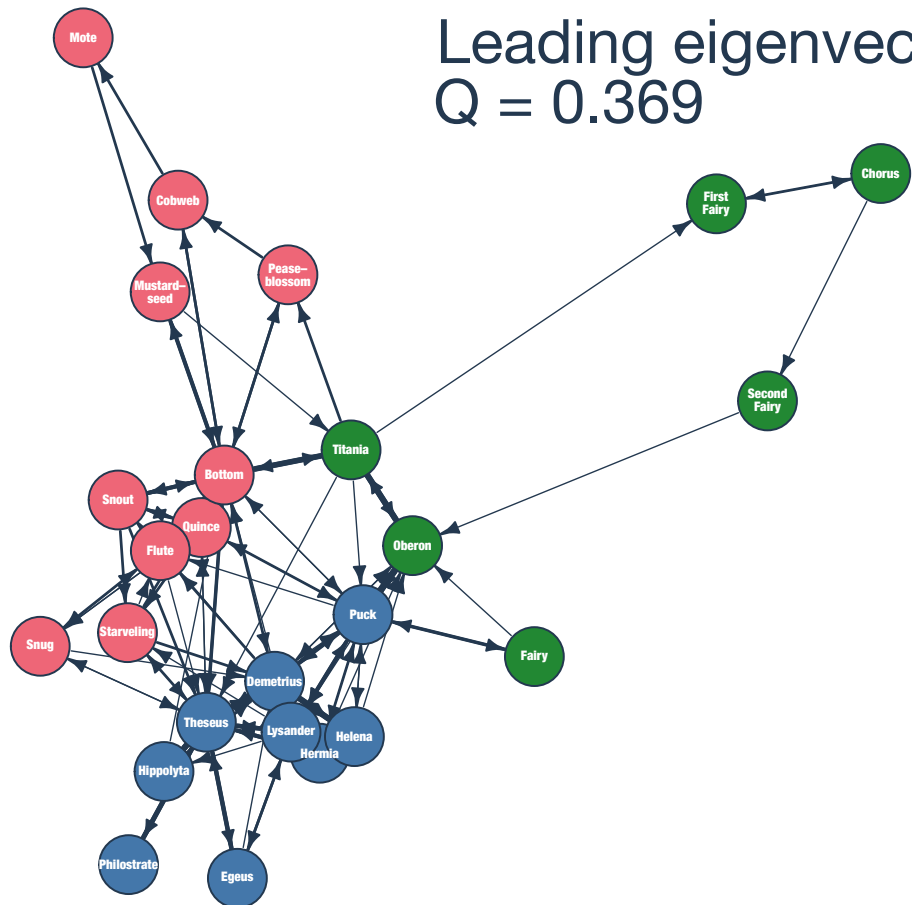
Maximum mod.  
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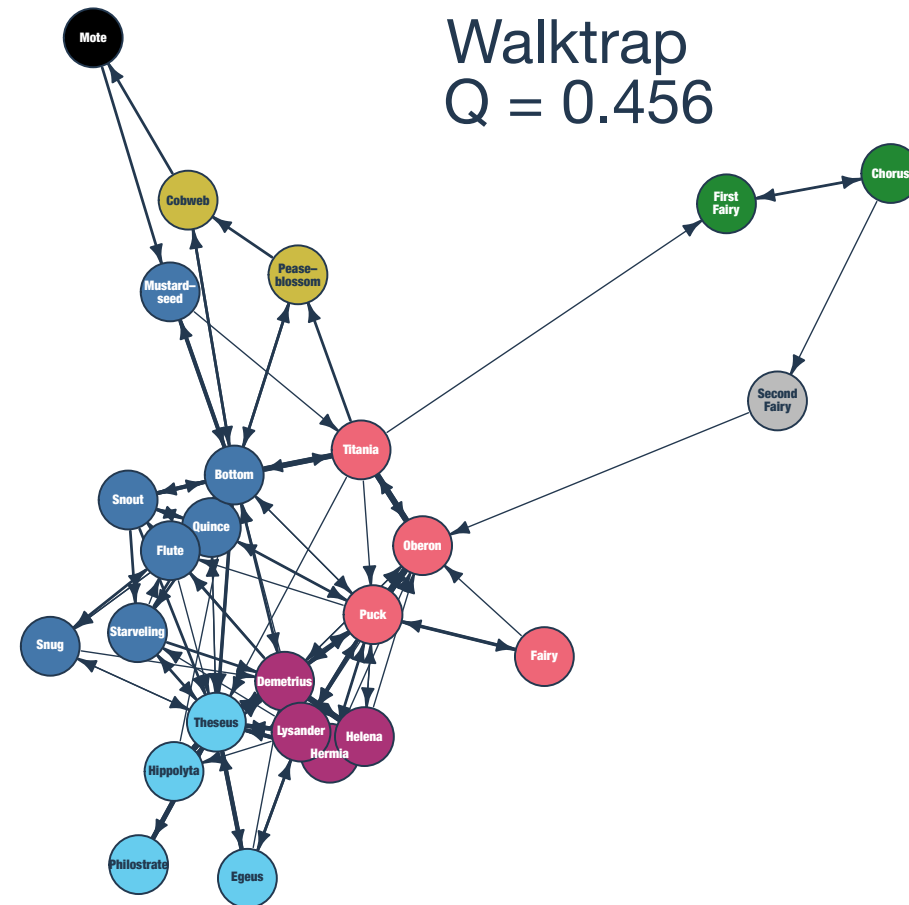
Infomap  
 $Q = 0.447$



Leading eigenvector  
 $Q = 0.369$

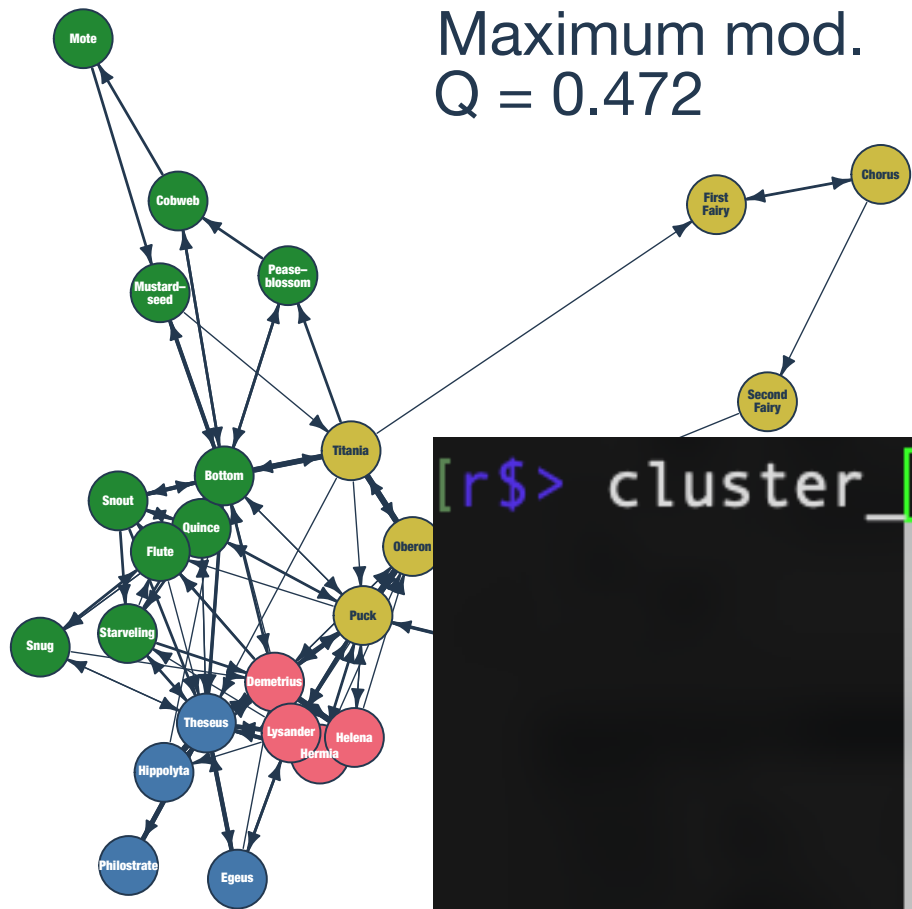


Walktrap  
 $Q = 0.456$

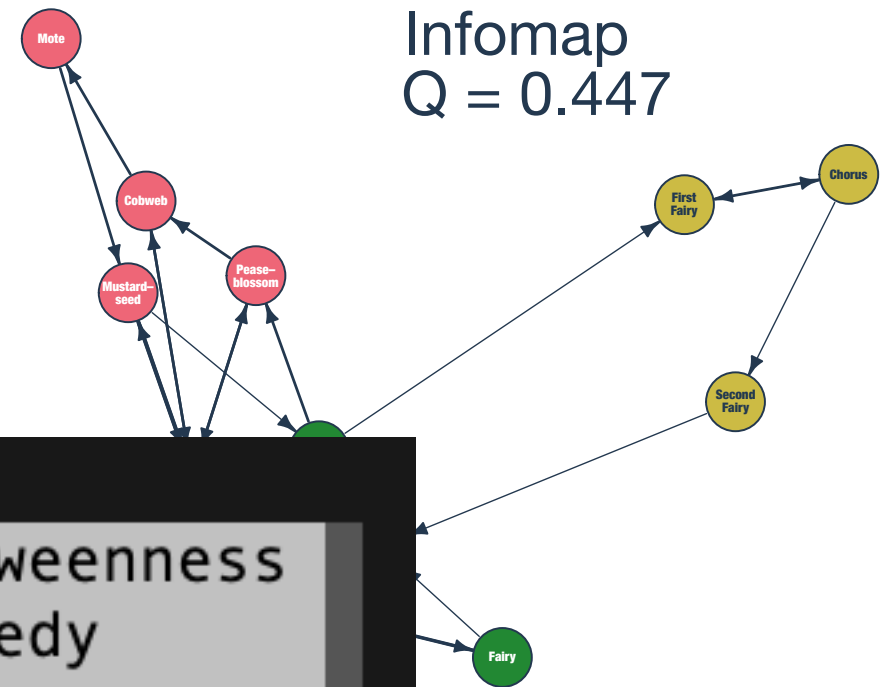


# Clustering algorithms

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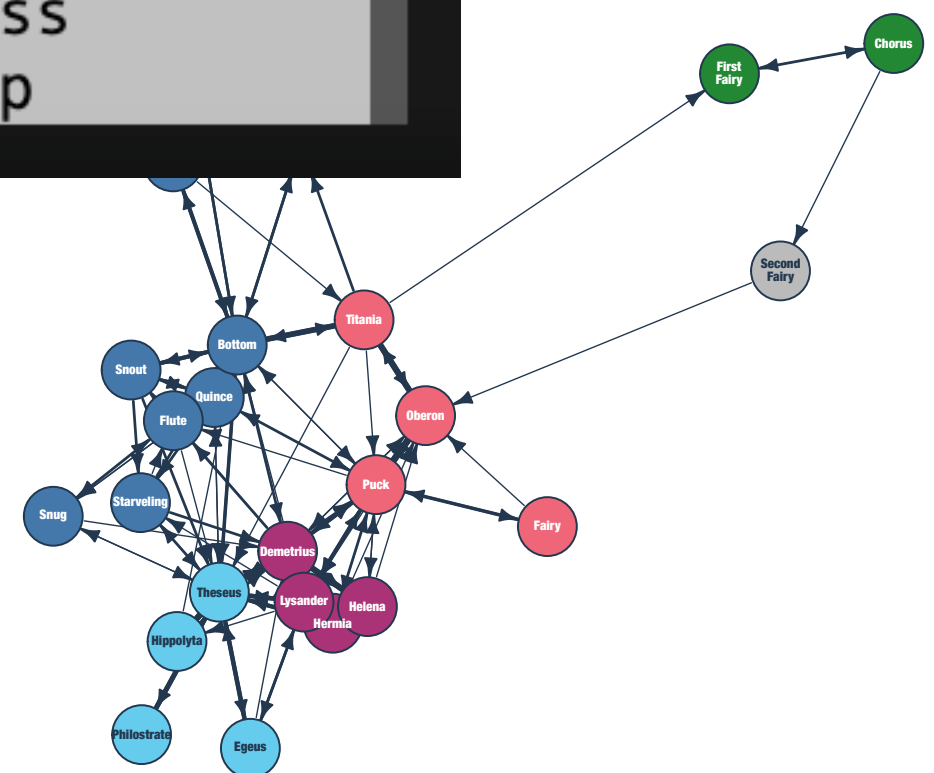
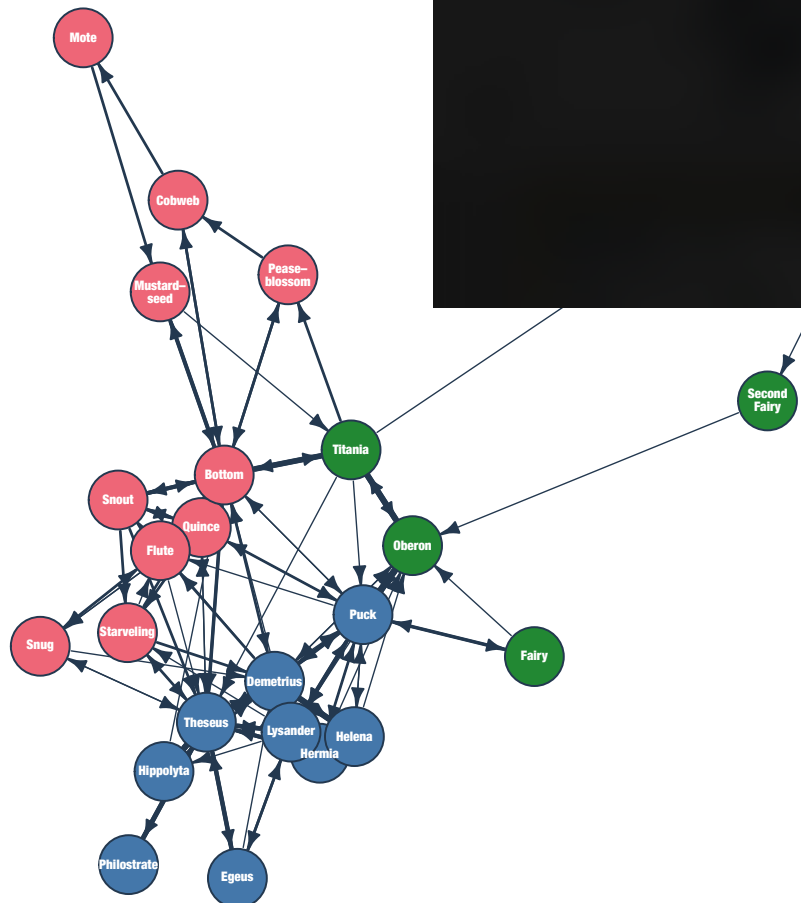


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```
[r$> cluster_
cluster_edge_betweenness
cluster_fast_greedy
cluster_infomap
cluster_label_prop
cluster_leading_eigen
cluster_louvain
cluster_optimal
cluster_springlass
cluster_walktrap
```

Walktrap  
 $Q = 0.456$



# Scientific Consensus



# Sociology of science

## The Temporal Structure of Scientific Consensus Formation

Shwed and Bearman (2010)

Deep dive into the sociology of science

### S&B:

- ∴ Scientific consensus is contingent on broader societal discourse
- ∴ Therefore there is not a uniform progression toward consensus
- ∴ S&B investigate this by using *citation networks* to measure consensus over time



# Citation networks

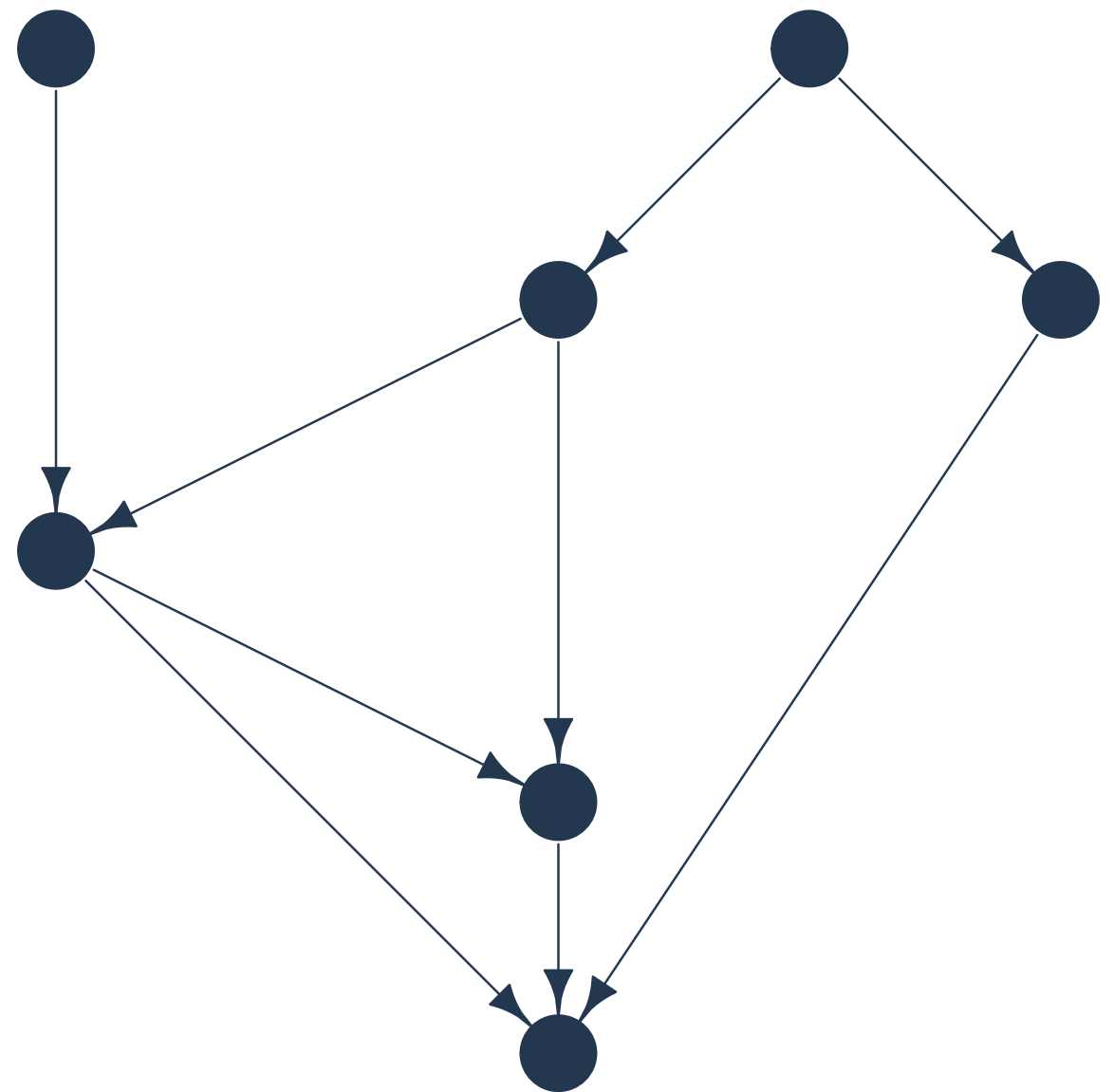
## Measuring relations between scholarly publications

### Citation network

- ∴ Vertices are publications (articles, books, conference papers, etc.)
- ∴ Directed edges represent citation
- ∴ Temporality imposes structure

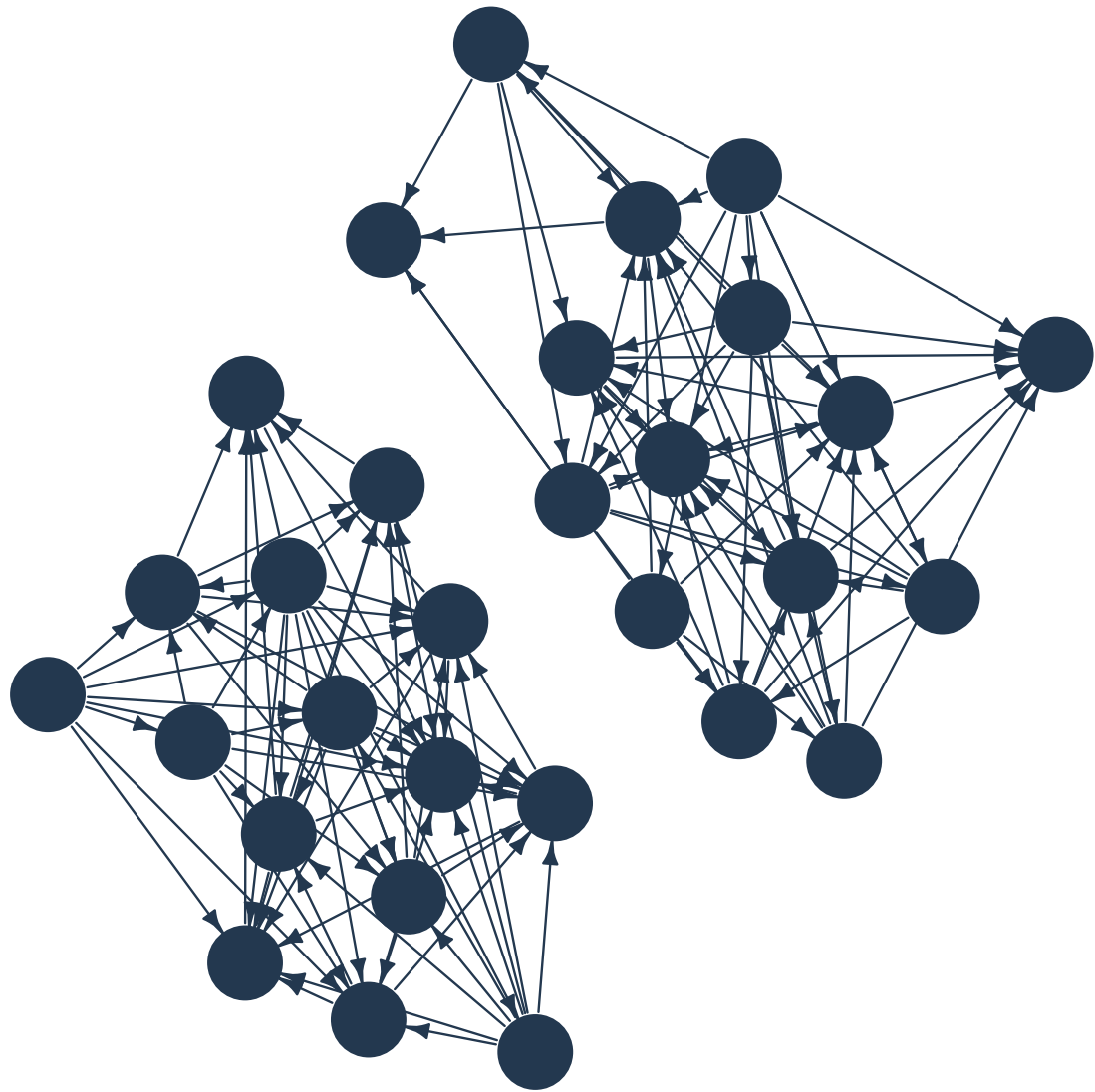
### Citations as relations

- ∴ Scientific knowledge is not purely cumulative
- ∴ Citation indicates similarity of theories, methods, assumptions, etc.

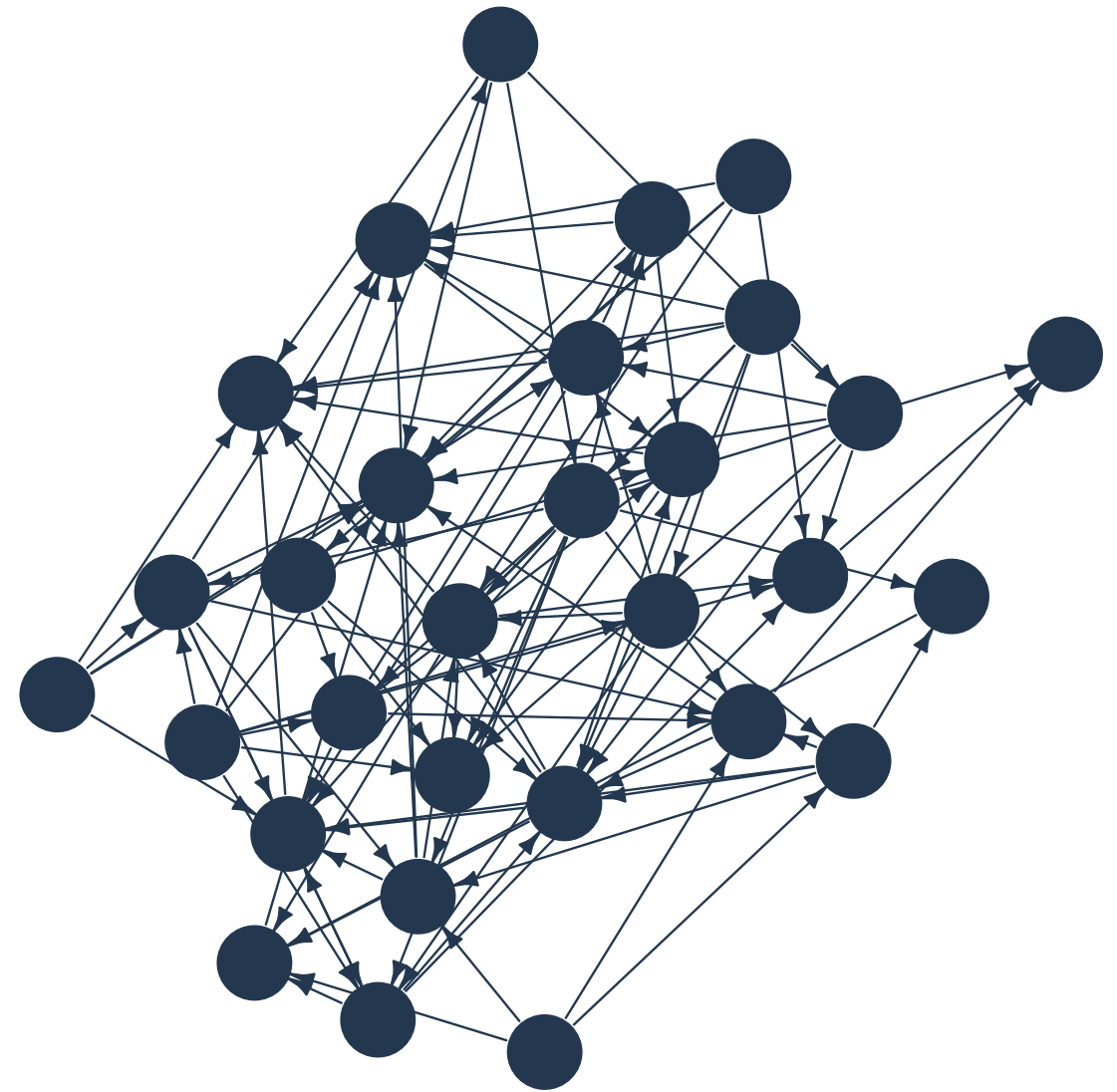


# Measuring consensus

## Two hypothetical citation networks



$Q = 0.5$   
(epistemic rivalry)



$Q = 0.05$   
(epistemic consensus)