

# CS 106B

## Lecture 21: Graphs

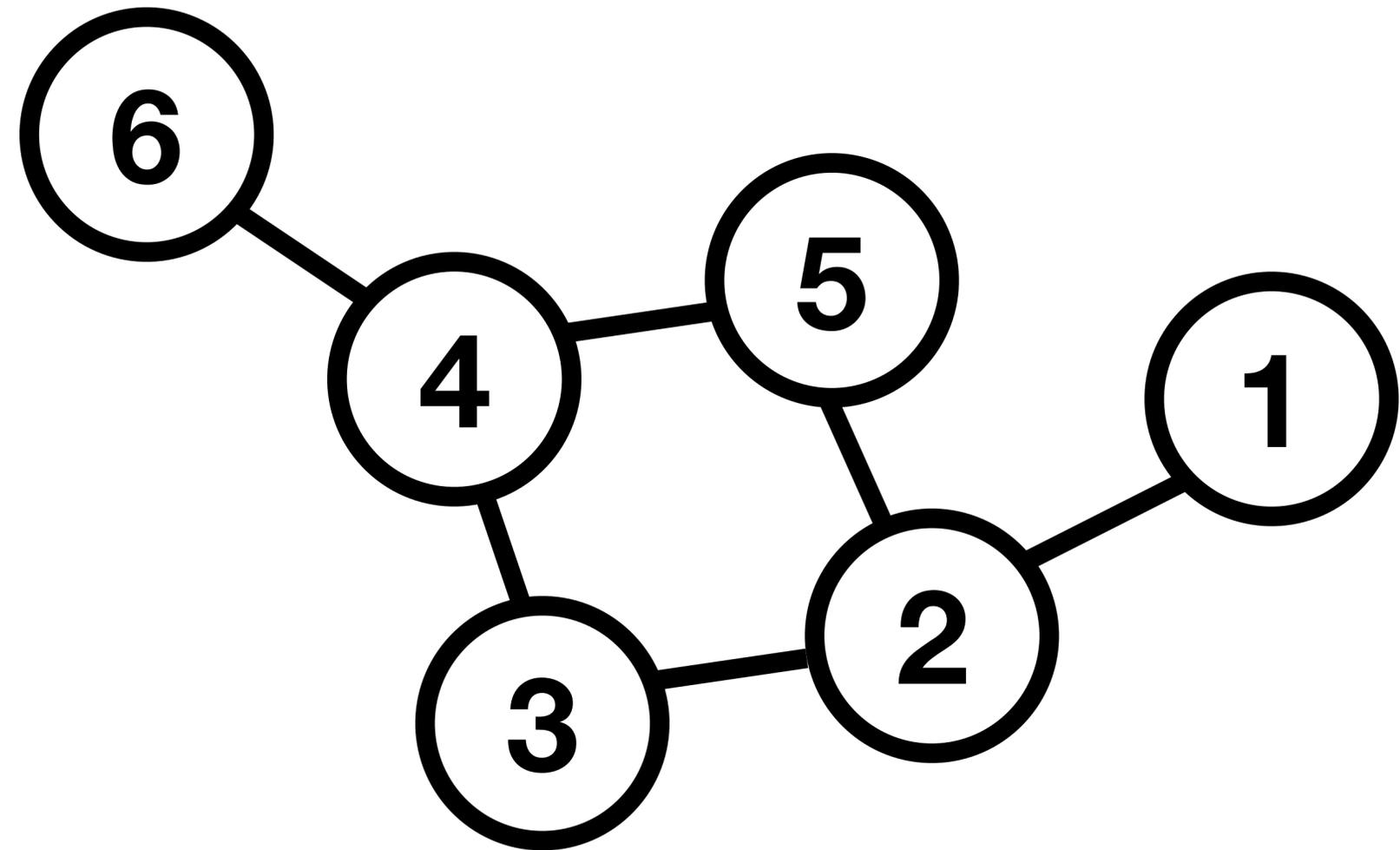
Friday, May 18, 2018

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Programming Abstractions  
Spring 2018  
Stanford University  
Computer Science Department

Lecturer: Chris Gregg

reading:  
Programming Abstractions in C++, Chapter 18



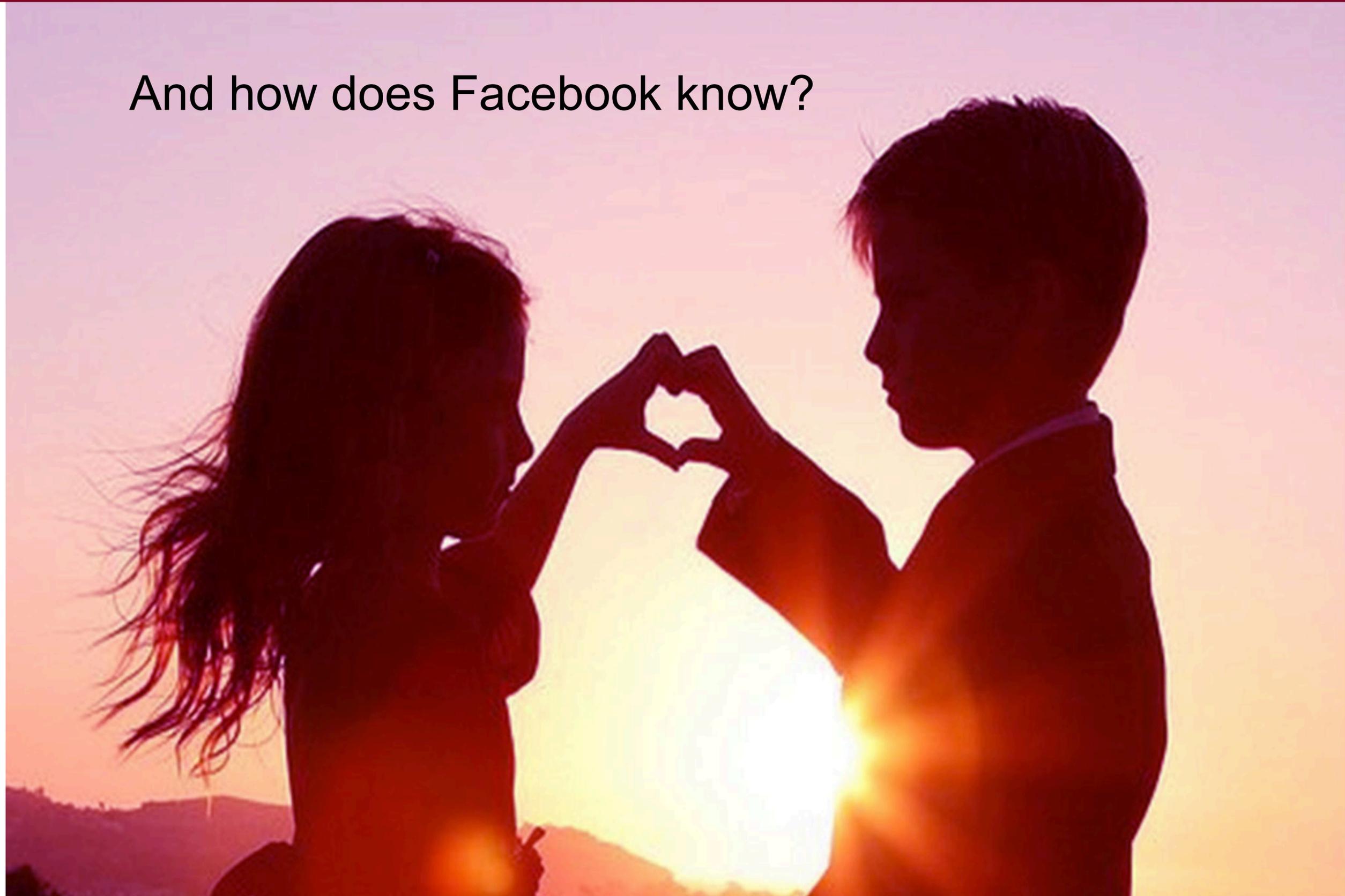
# Today's Topics

- Logistics
  - YEAH hours video: posted.
  - You must use your remaining late credits before the last assignment.
  - Today's handout: <http://web.stanford.edu/class/cs106b//lectures/22-Graphs/handout.pdf>
- Introduction to Graphs
  - The wild west of the node world
  - First Graph
  - Who is your lover?



# Intro to Graphs: Who do You Love?

And how does Facebook know?



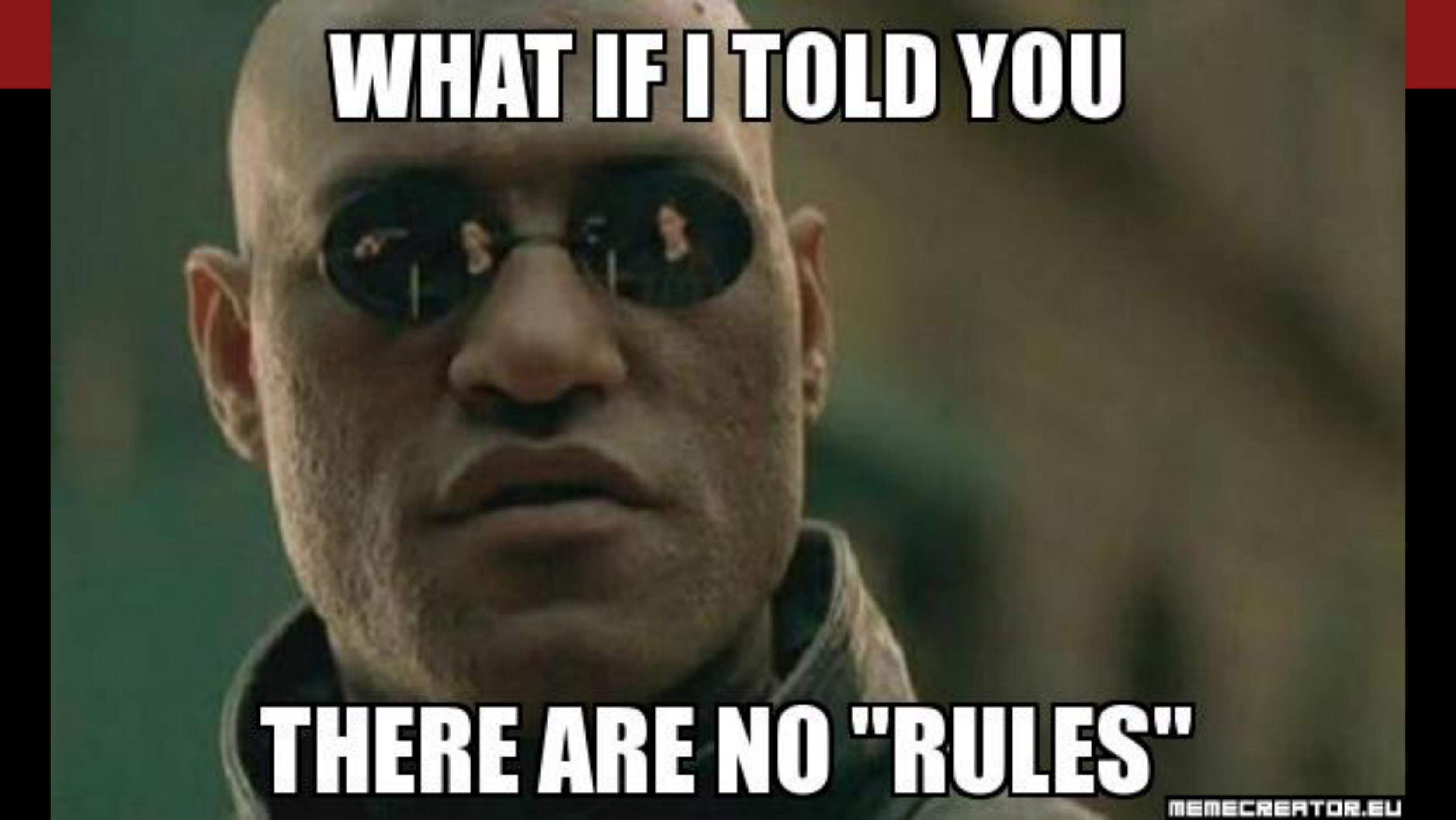
# Tree Definition



Only One Parent



No Cycles



**WHAT IF I TOLD YOU**

**THERE ARE NO "RULES"**

# Graph Definition

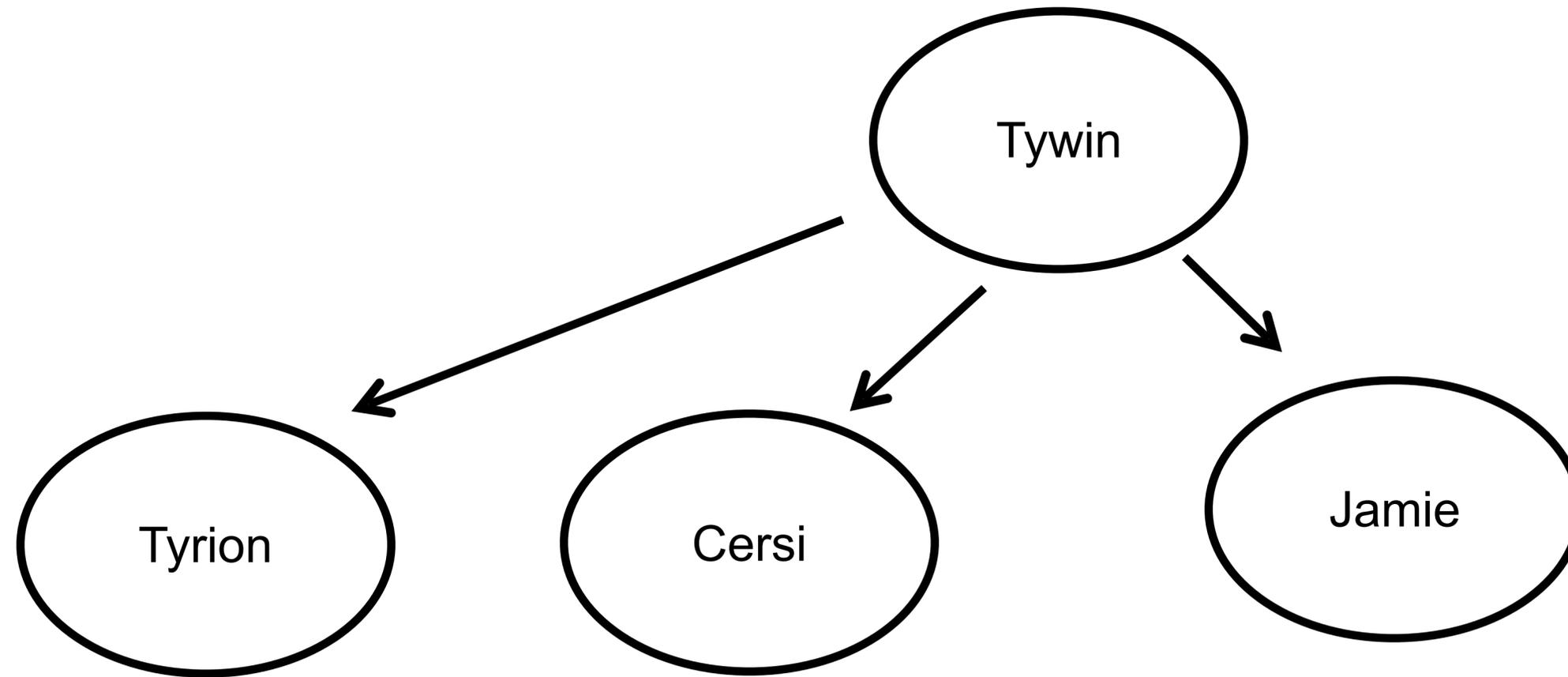
A **graph** is a mathematical structure for representing relationships using nodes and edges.

\*Just like a tree without the rules

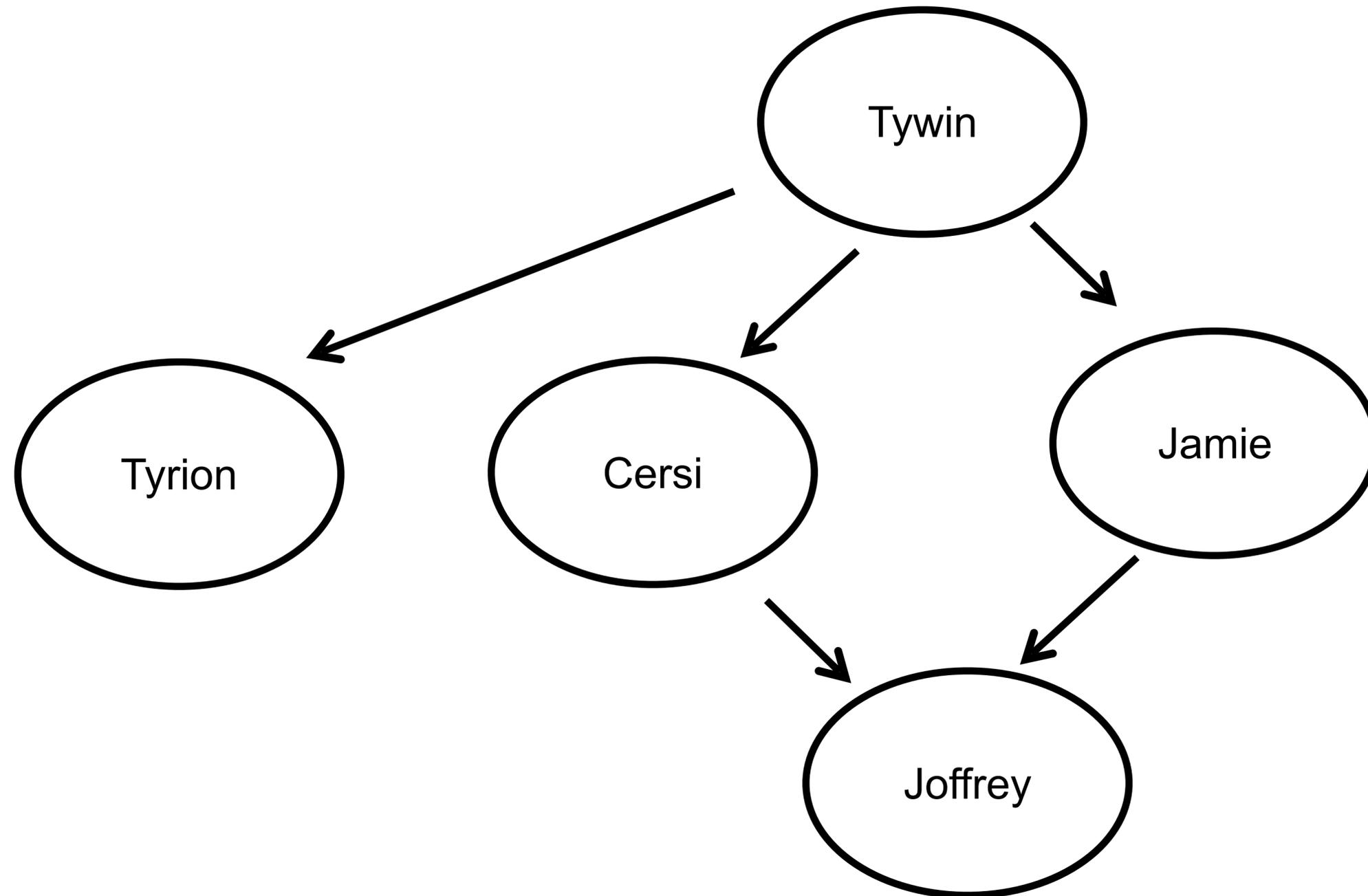


We can have a family tree?

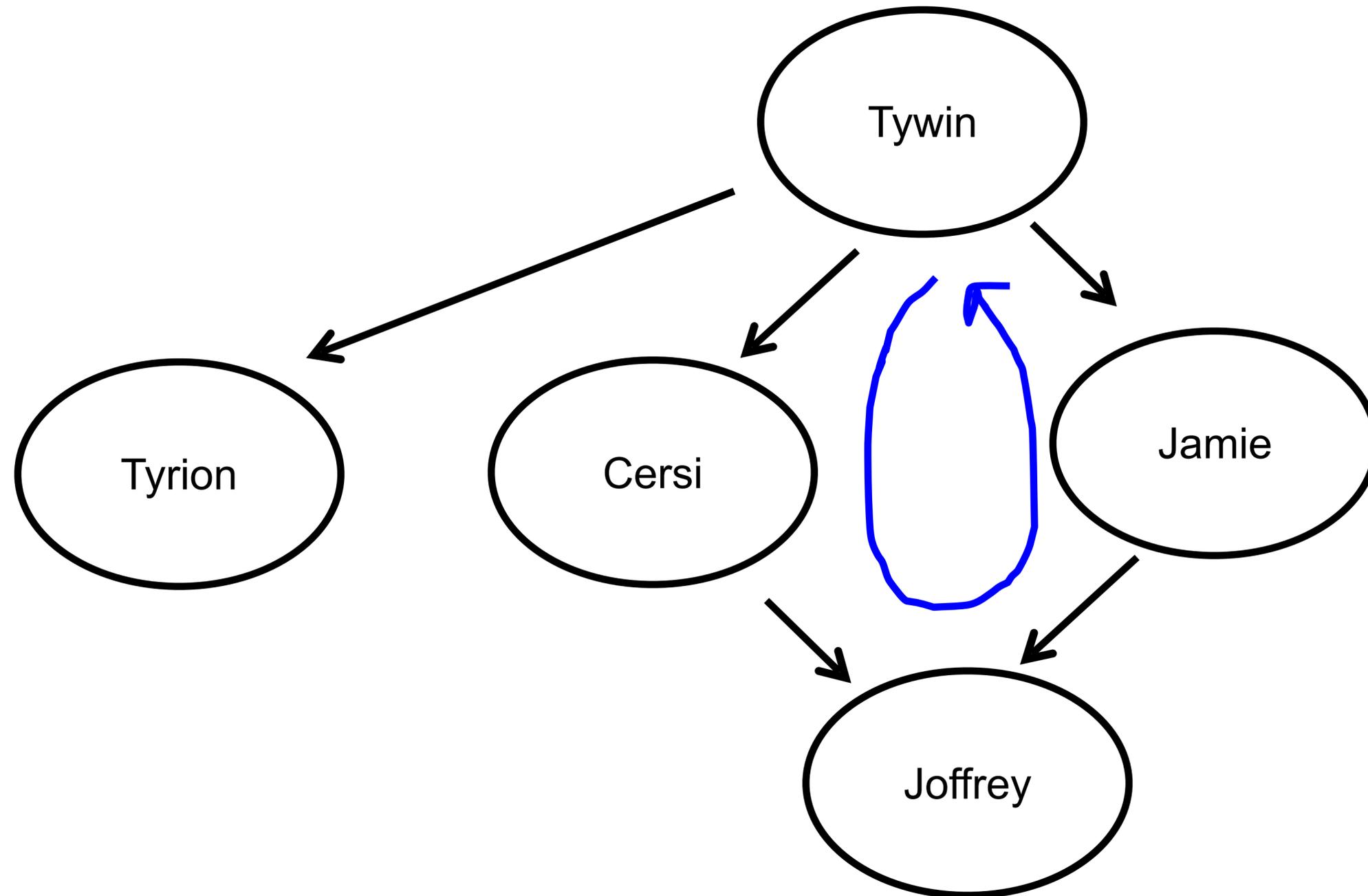
# Family Tree



# Not a Tree



# Not a Tree

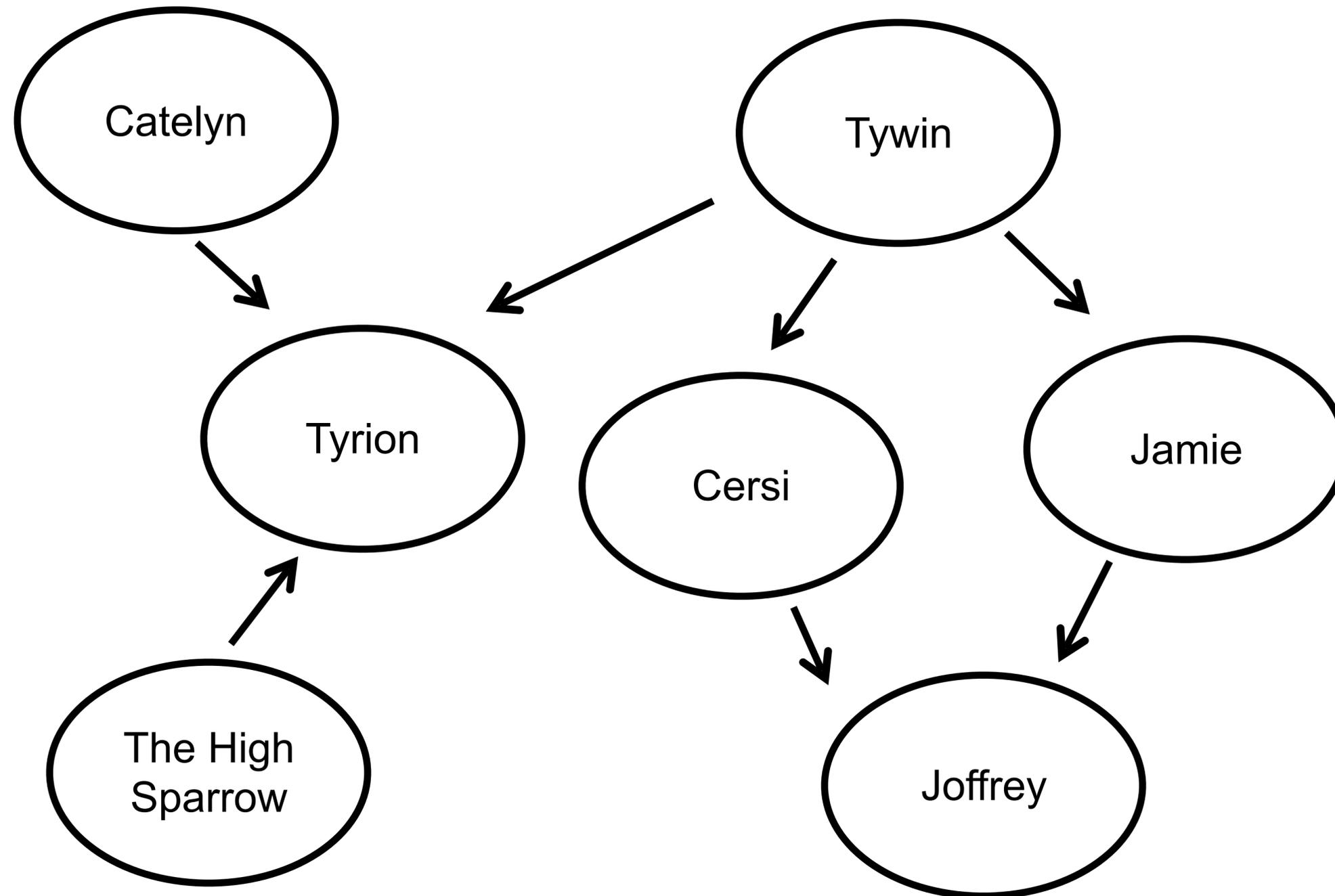




graph

We can have a family ~~tree~~?

# Graphs Don't Have Roots



# Simple Graph

```
struct Node{  
    string value;  
    Vector<Edge *> edges;  
};
```

```
struct Edge{  
    Node * start;  
    Node * end;  
};
```

```
struct Graph{  
    Set<Node *> nodes;  
    Set<Edge *> edges;  
};
```

# Simple Graph

```
struct Node{  
    string value;  
    Vector<Edge *> edges;  
};
```

```
struct Edge{  
    Node * start;  
    Node * end;  
};
```

We allow for  
more interesting  
edges

```
struct Graph{  
    Set<Node *> nodes;  
    Set<Edge *> edges;  
};
```

# Simple Graph

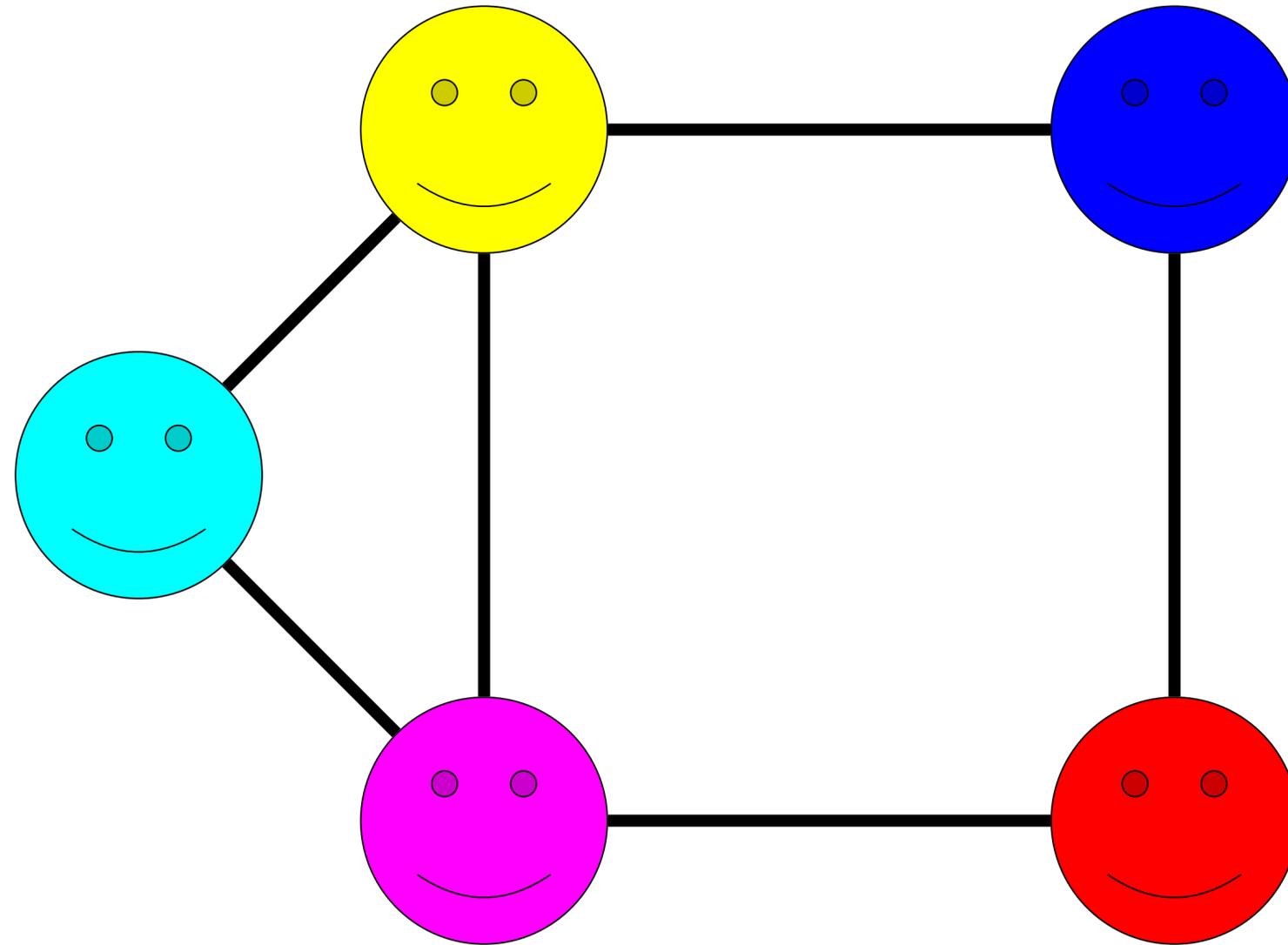
```
struct Node{  
    string value;  
    Vector<Edge *> edges;  
};
```

```
struct Edge{  
    Node * start;  
    Node * end;  
    double weight;  
};
```

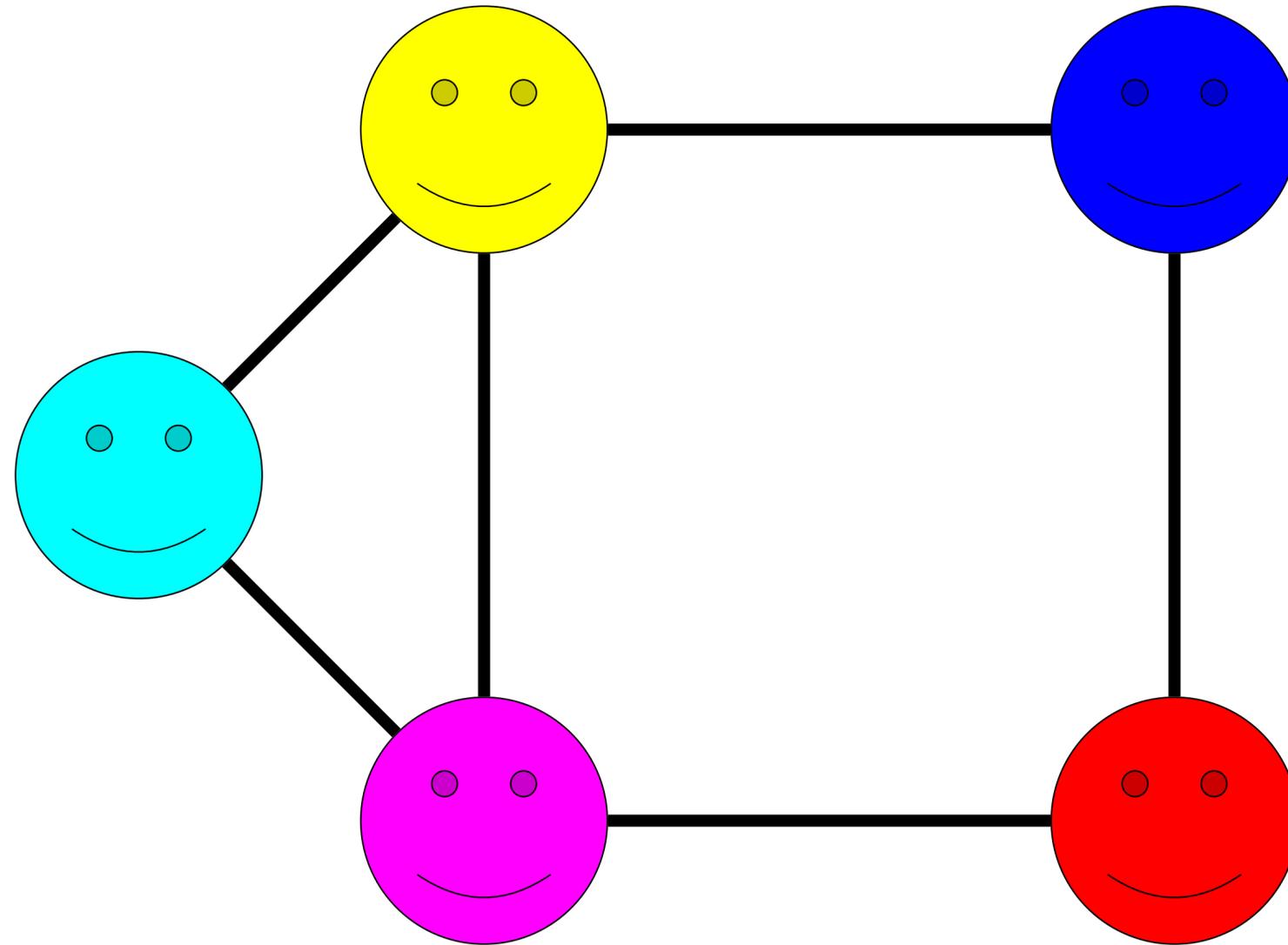
We allow for  
more interesting  
edges

```
struct Graph{  
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```

# Simple Graph

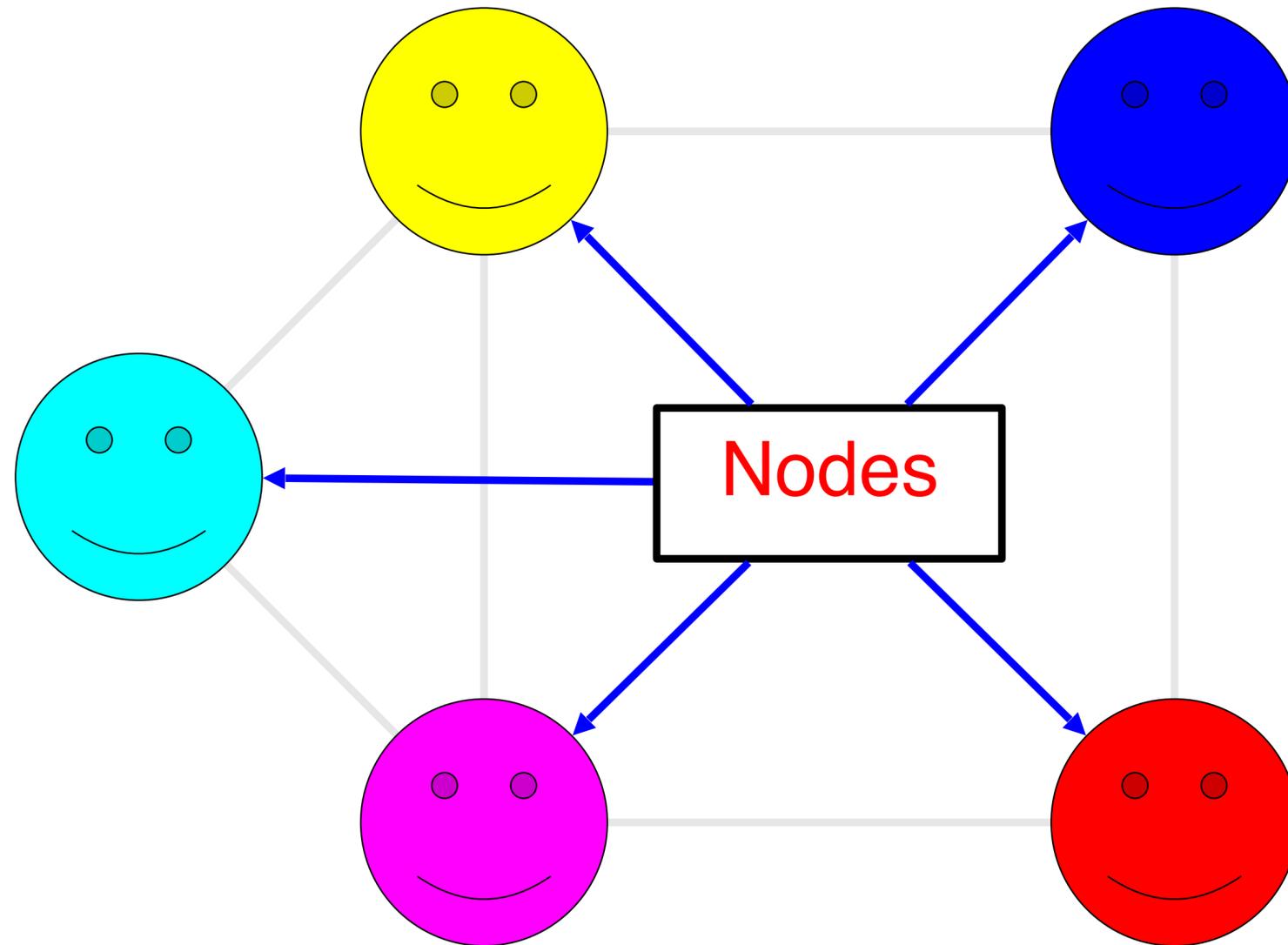


# Simple Graph



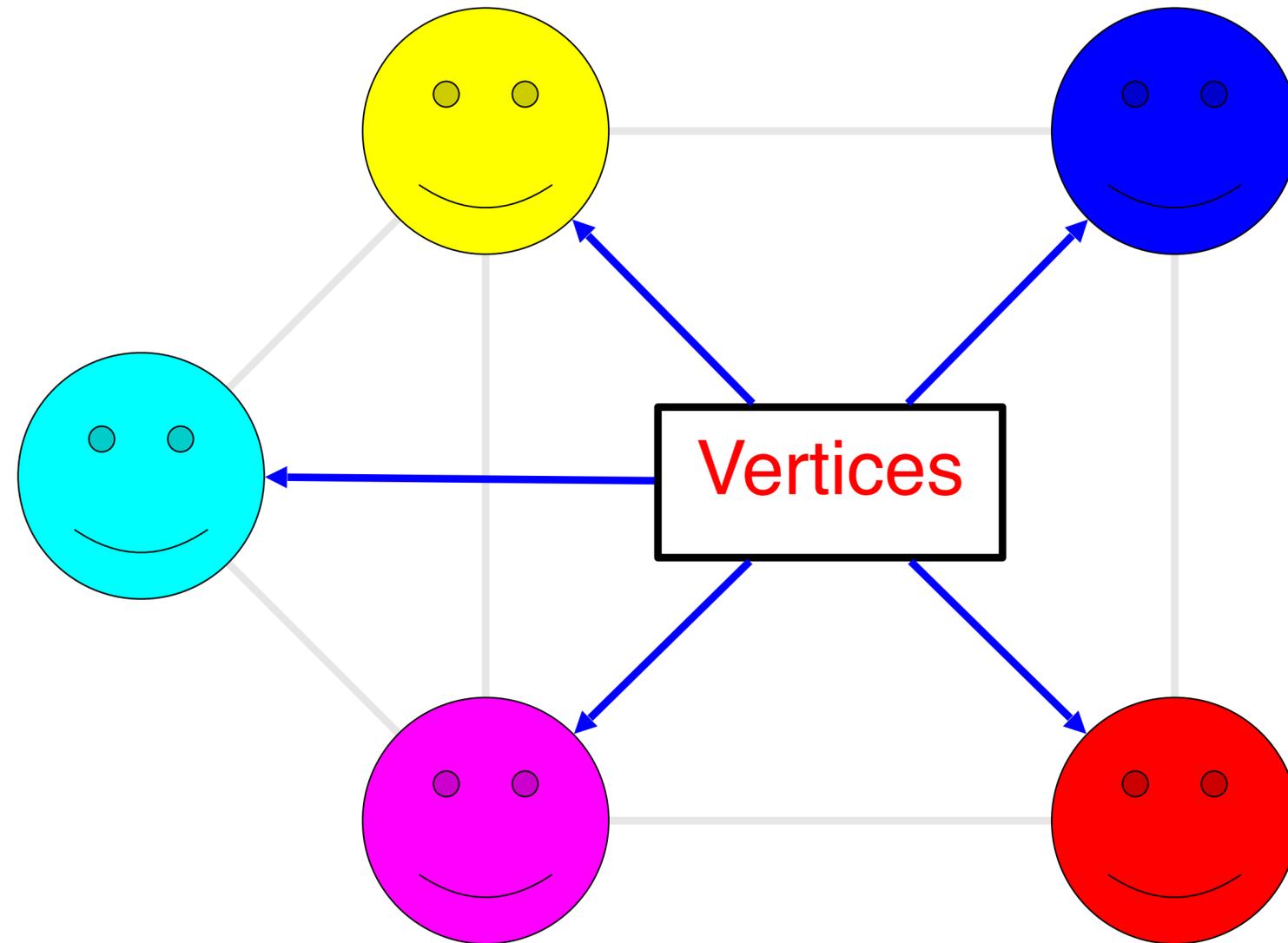
A graph consists of a set of **nodes** connected by **edges**.

# Graph Nodes



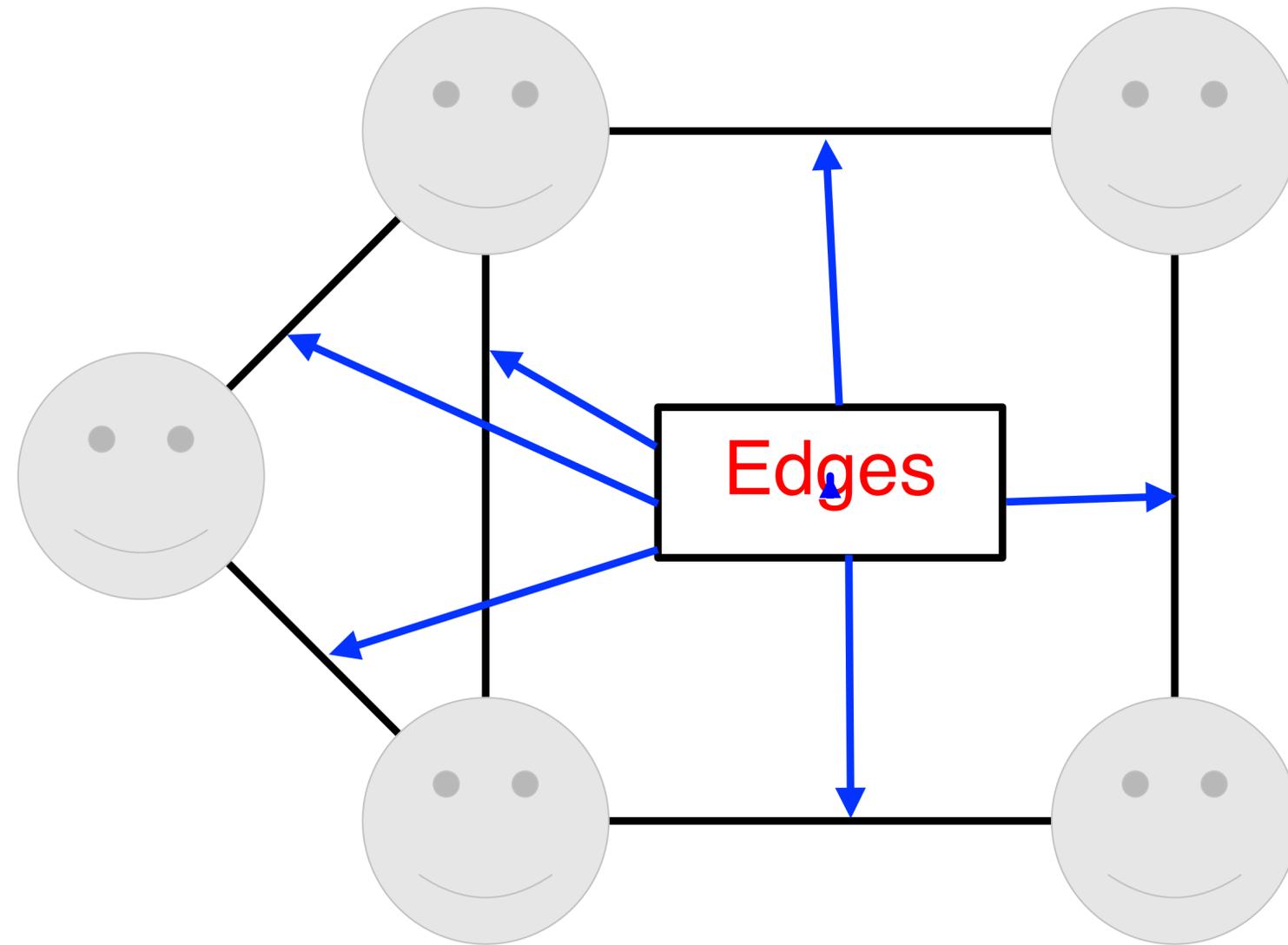
A graph consists of a set of **nodes** connected by **edges**.

# Nodes are Also Called Vertices



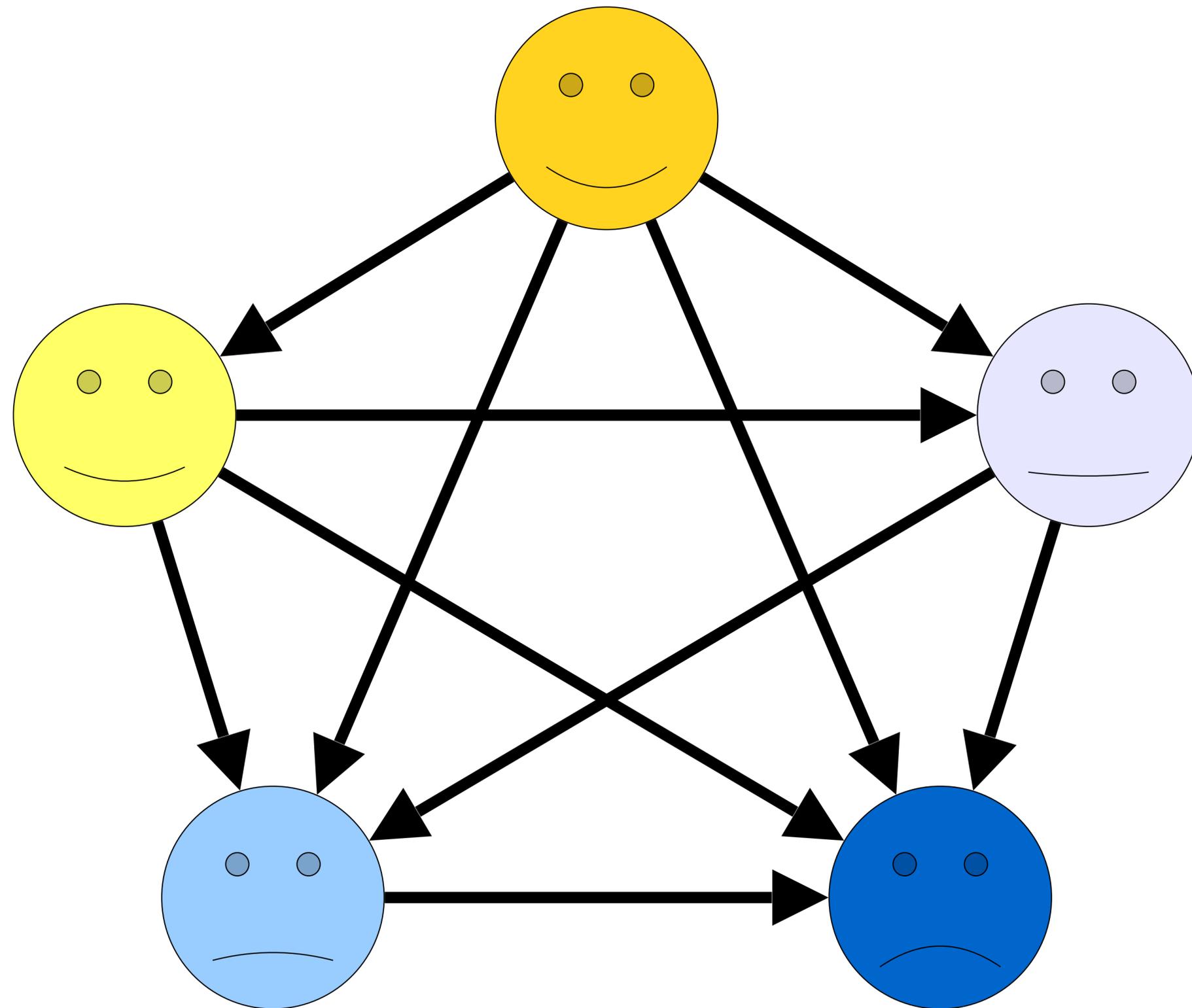
A graph consists of a set of **nodes** connected by **edges**.

# Graph Edges

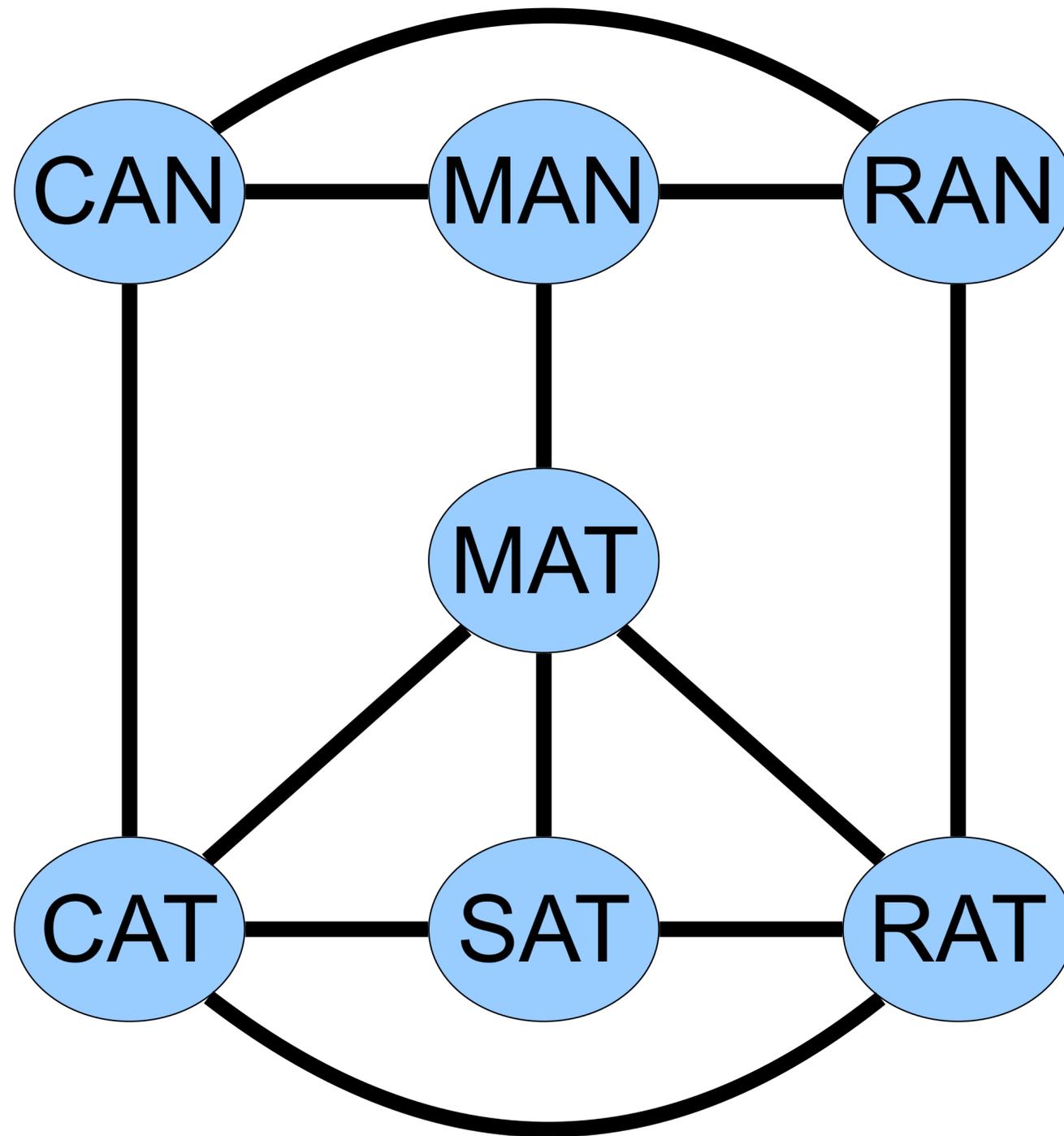


A graph consists of a set of **nodes** connected by **edges**.

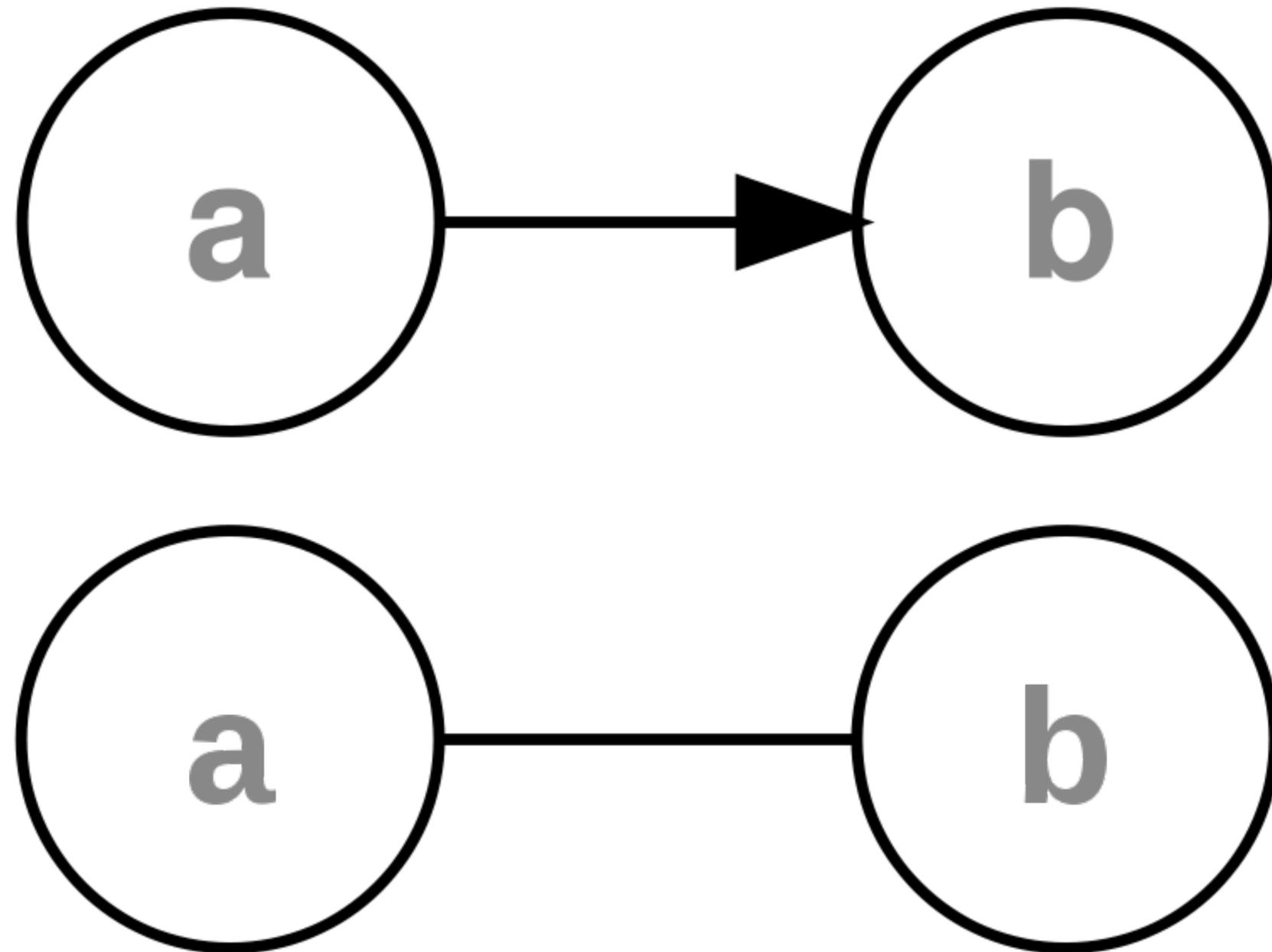
# Directed Graph



# Undirected Graph



# Directed vs Undirected

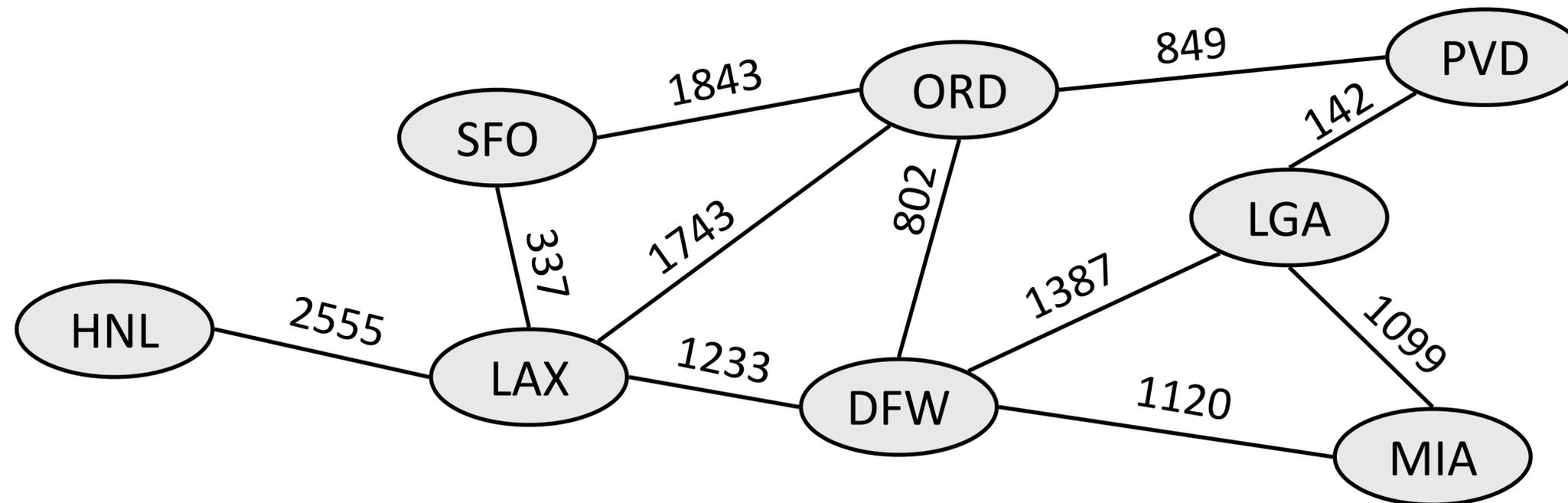


# Weighted graphs

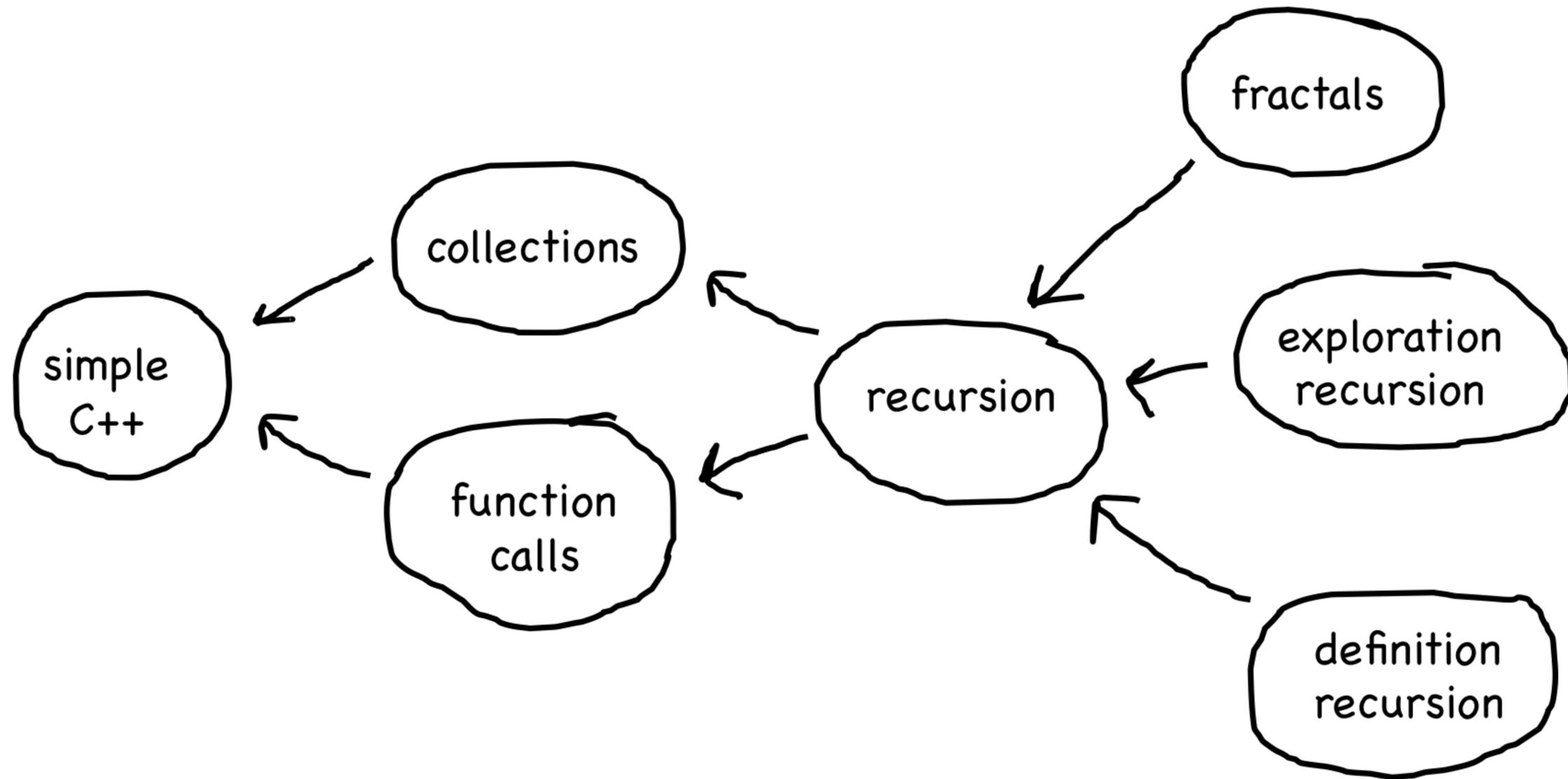


**weight:** Cost associated with a given edge.

*example:* graph of airline flights, weighted by miles between cities:



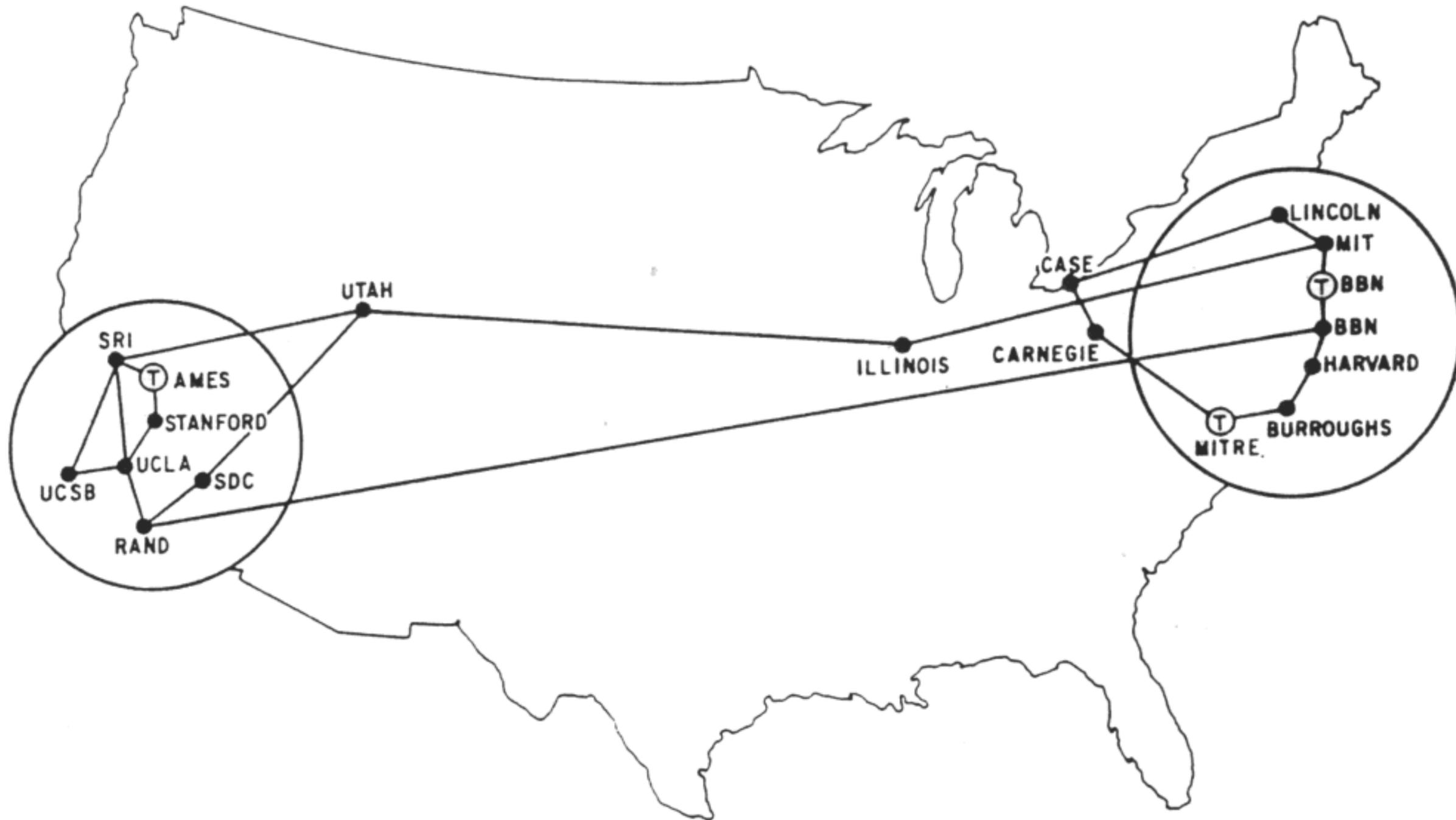
# Prerequisite Graph



# Social Network

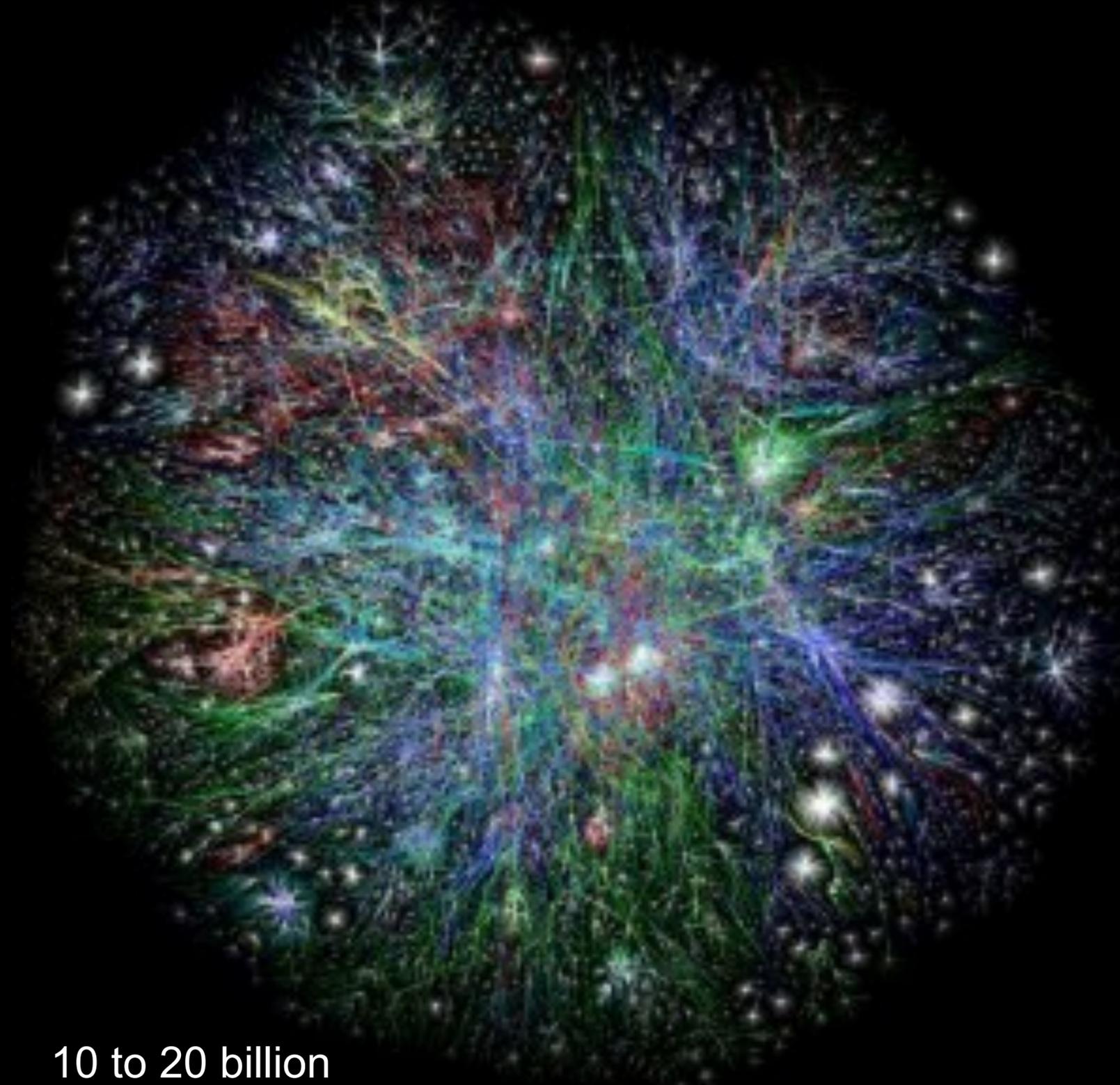


# The Internet



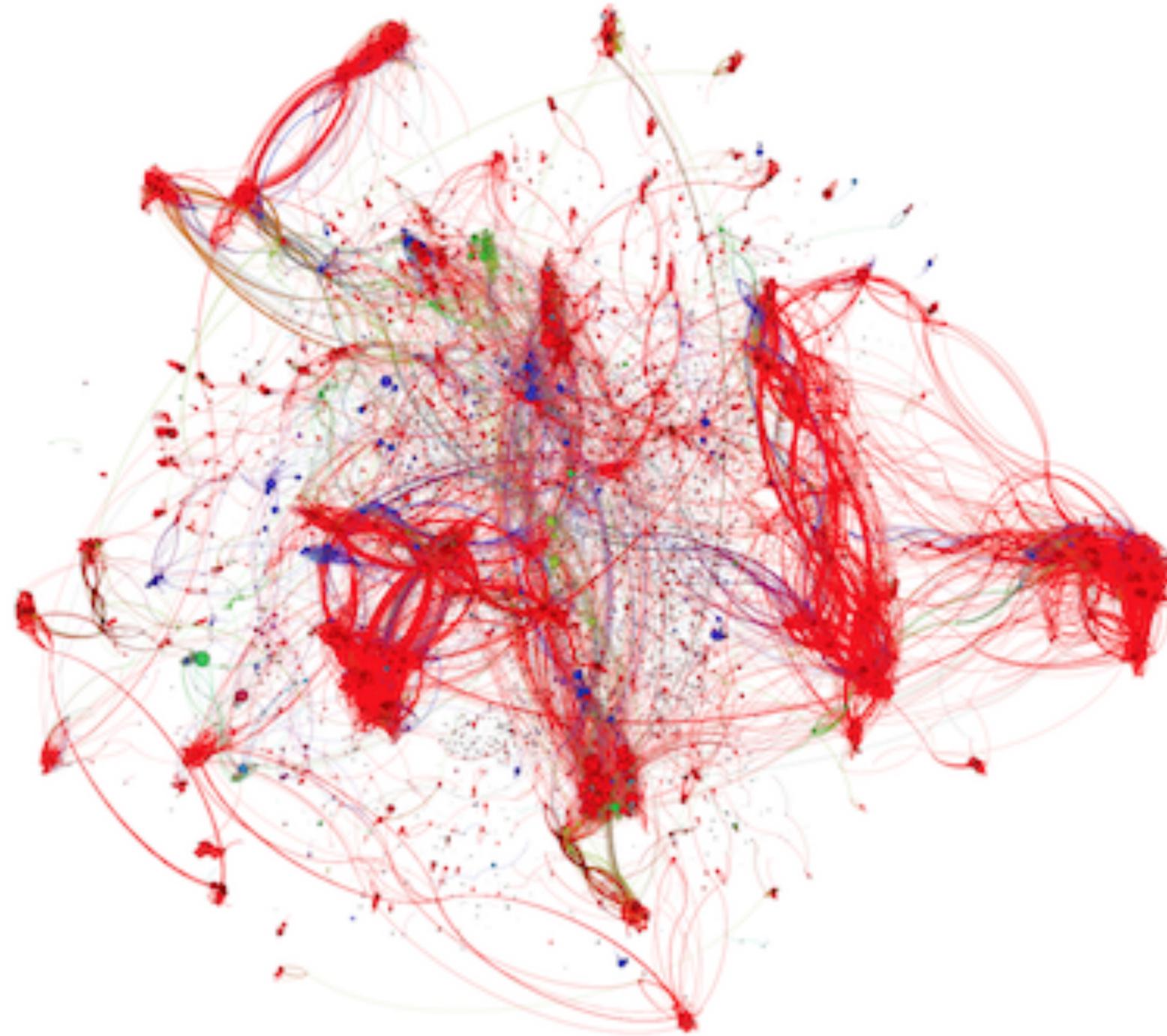
MAP 4 September 1971

# The Internet



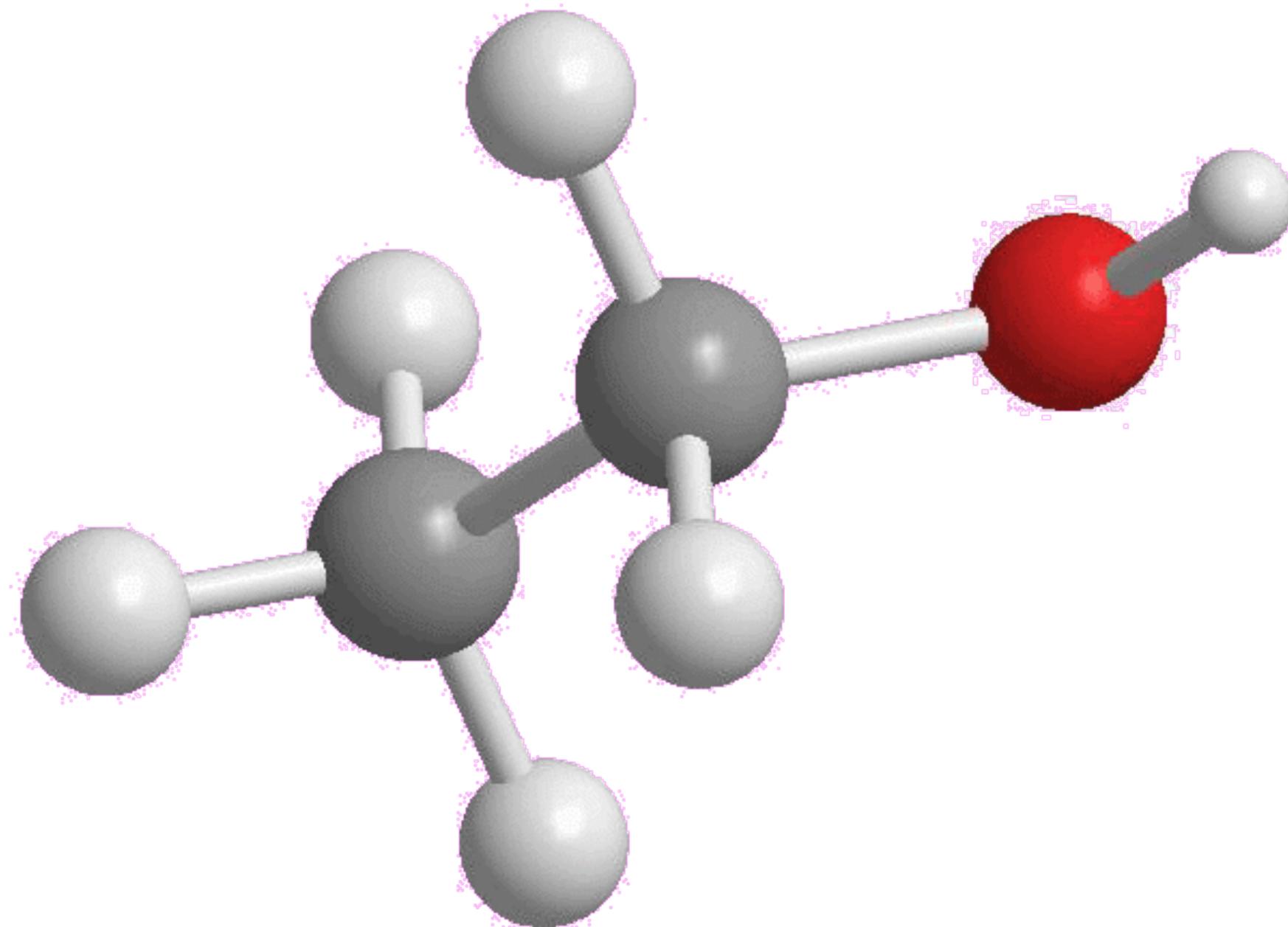
10 to 20 billion

# CS Assignments



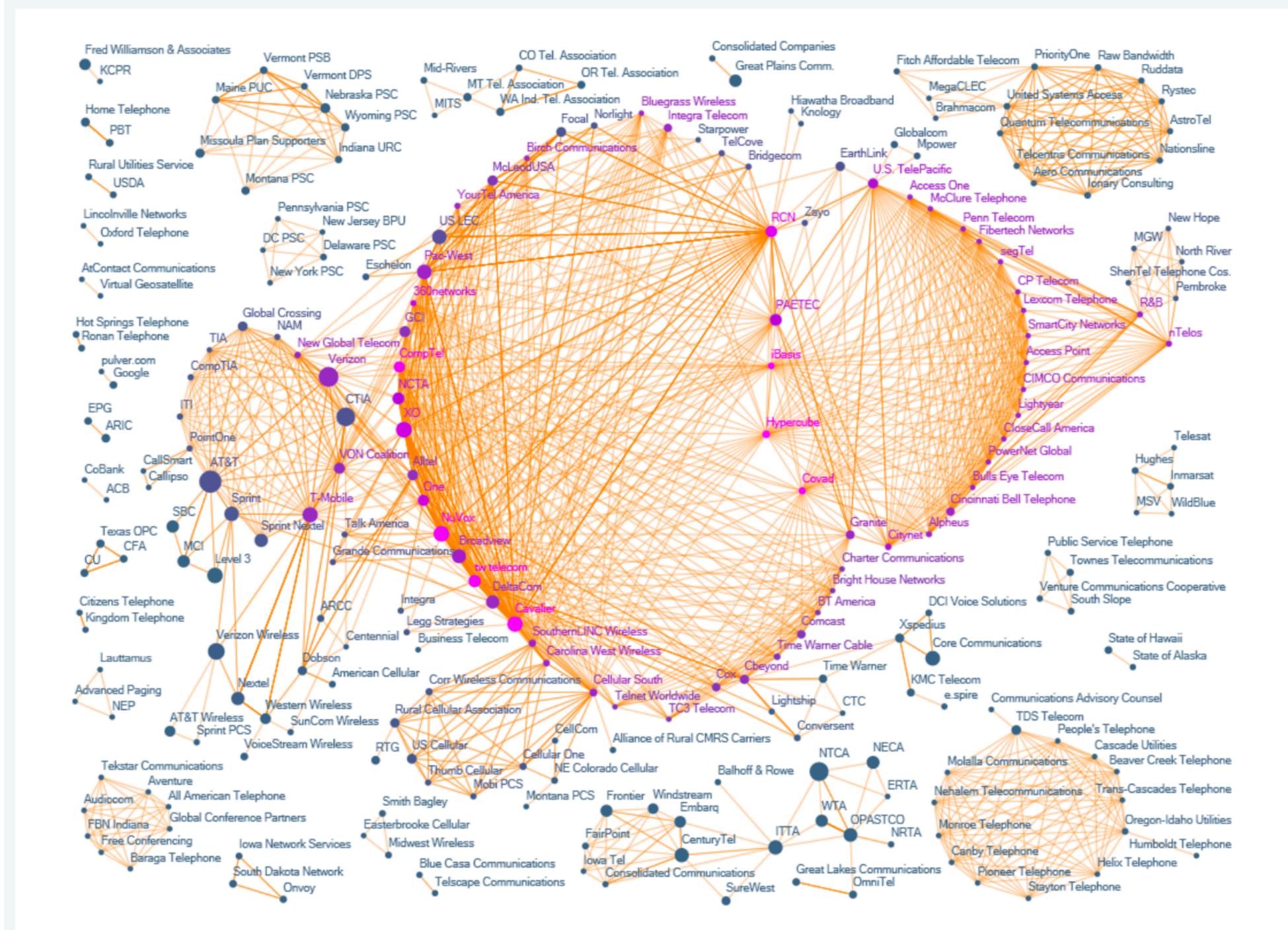
50,000 unique implementations of logistic regression in CS229

# Chemical Bonds



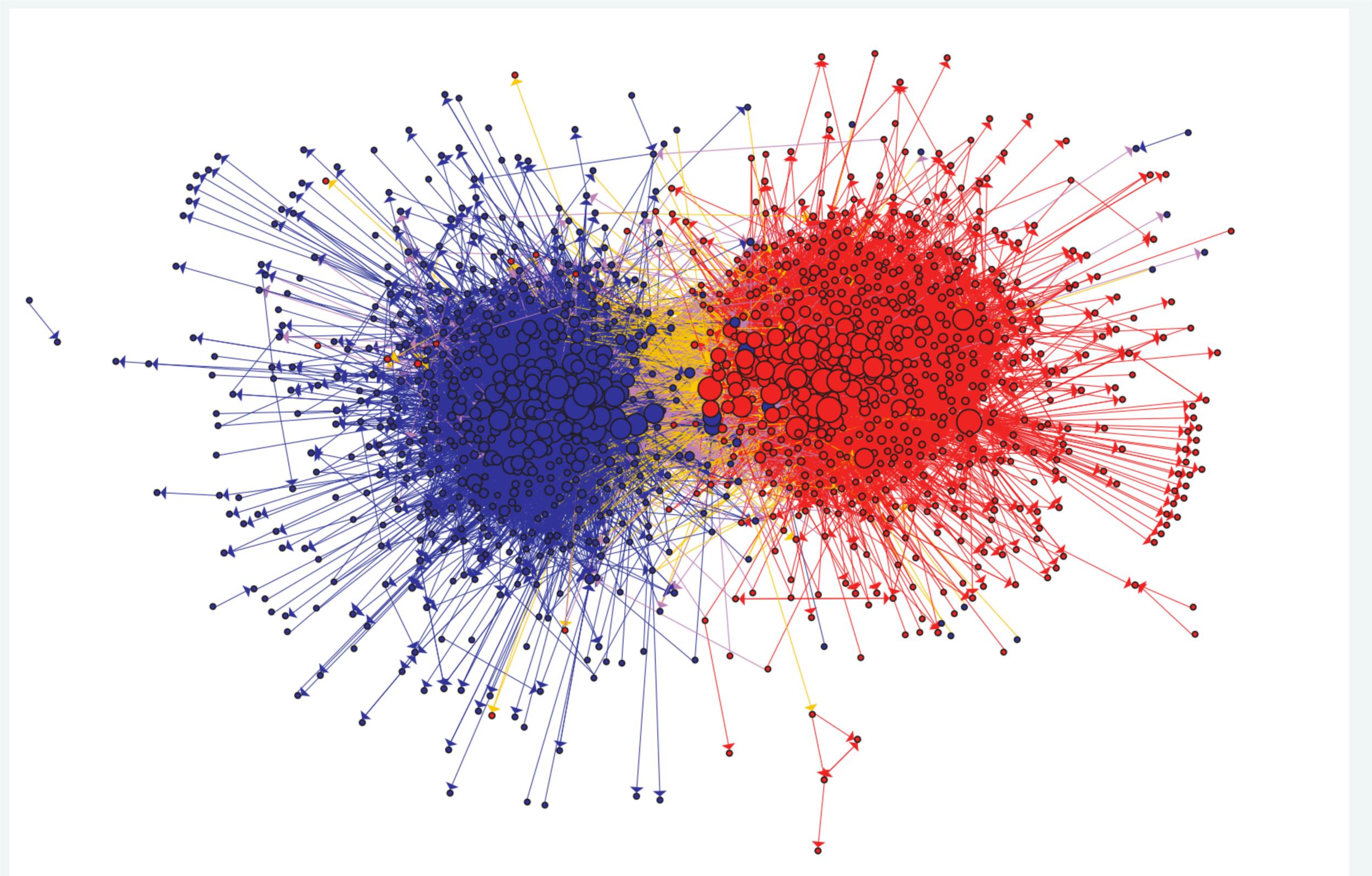


# Corruption



“The Evolution of FCC Lobbying Coalitions” by Pierre de Vries in JoSS Visualization Symposium 2010

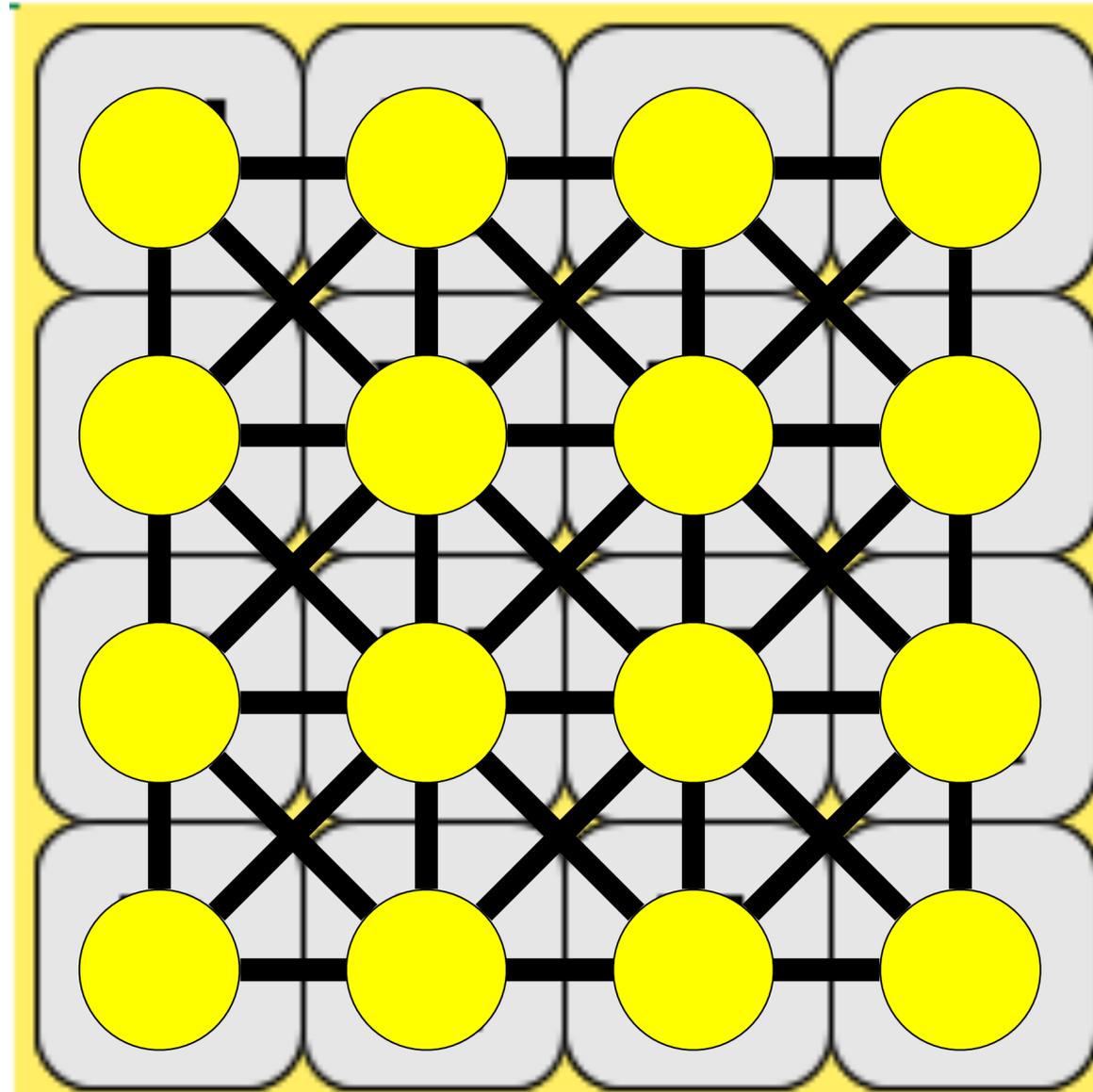
# Partisanship



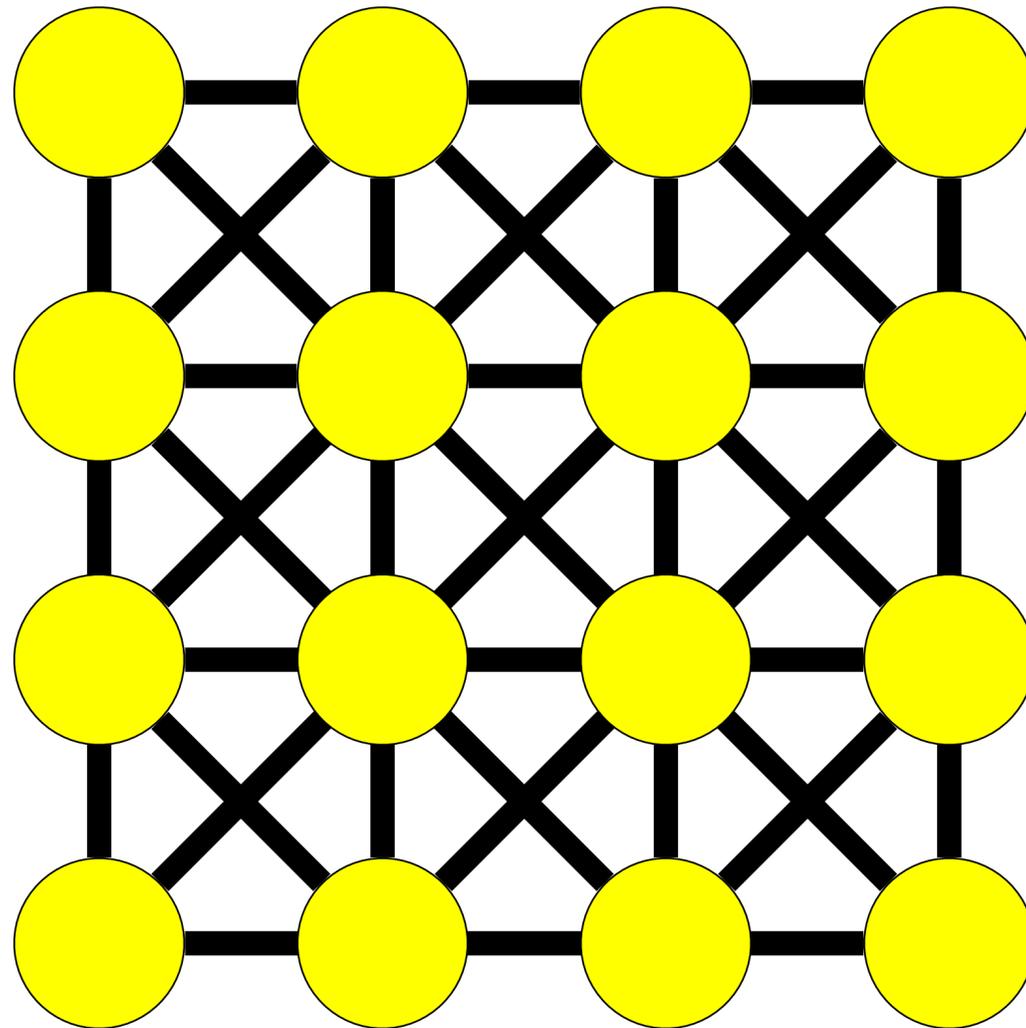
# Boggle



# Boggle



# Boggle

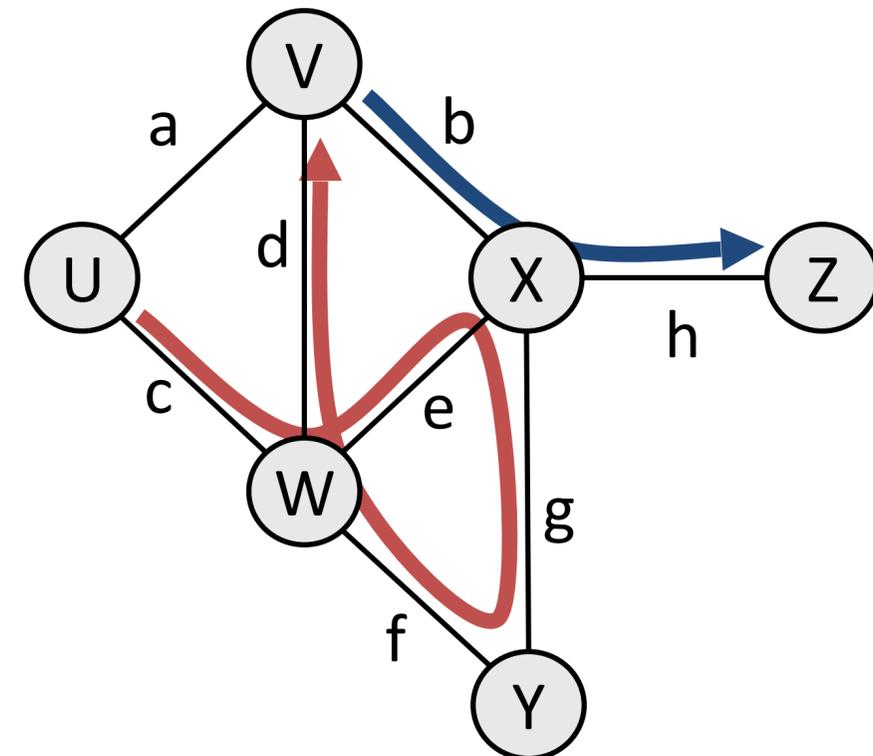


Some terms:

# Paths

- **path:** A path from vertex  $a$  to  $b$  is a sequence of edges that can be followed starting from  $a$  to reach  $b$ .
  - can be represented as vertices visited, or edges taken
  - example, one path from  $V$  to  $Z$ :  $\{b, h\}$  or  $\{V, X, Z\}$
  - What are two paths from  $U$  to  $Y$ ?

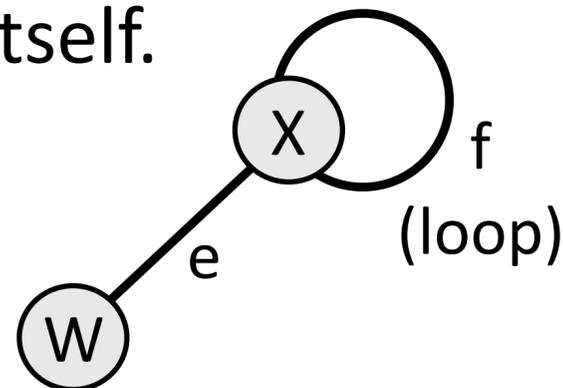
- **path length:** Number of vertices or edges contained in the path.
- **neighbor** or **adjacent:** Two vertices connected directly by an edge.
  - example:  $V$  and  $X$



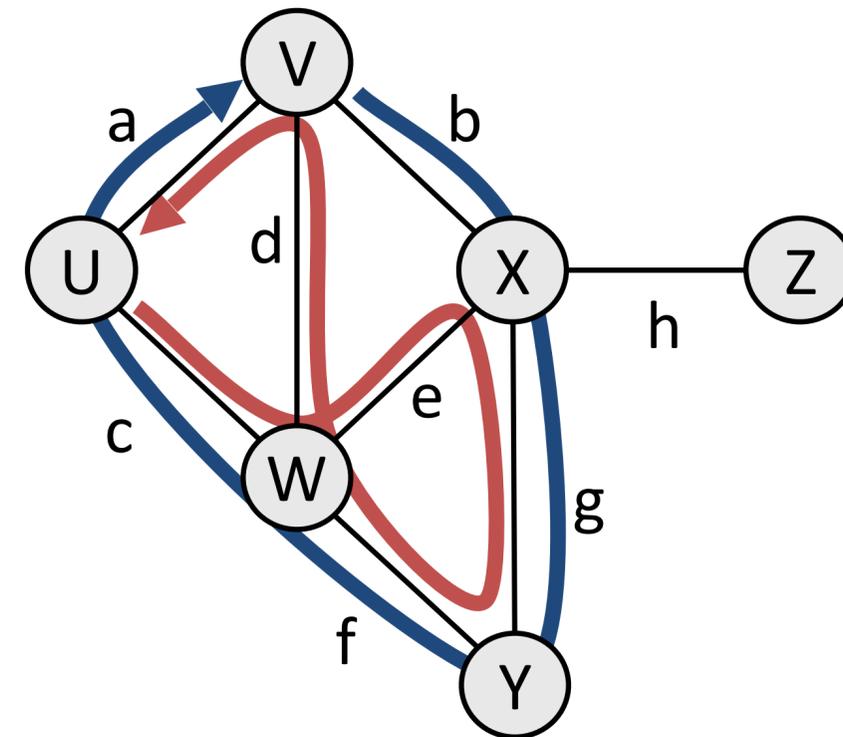
# Loops and cycles

- **cycle:** A path that begins and ends at the same node.
  - example: {b, g, f, c, a} or {V, X, Y, W, U, V}.
  - example: {c, d, a} or {U, W, V, U}.
- **acyclic graph:** One that does not contain any cycles.

- **loop:** An edge directly from a node to itself.

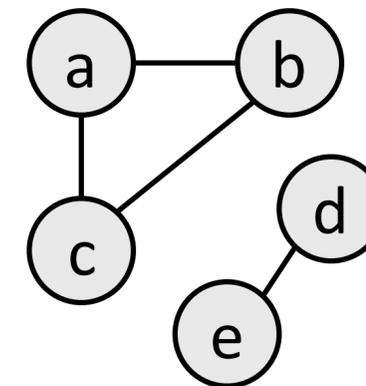
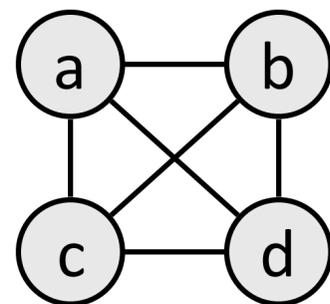
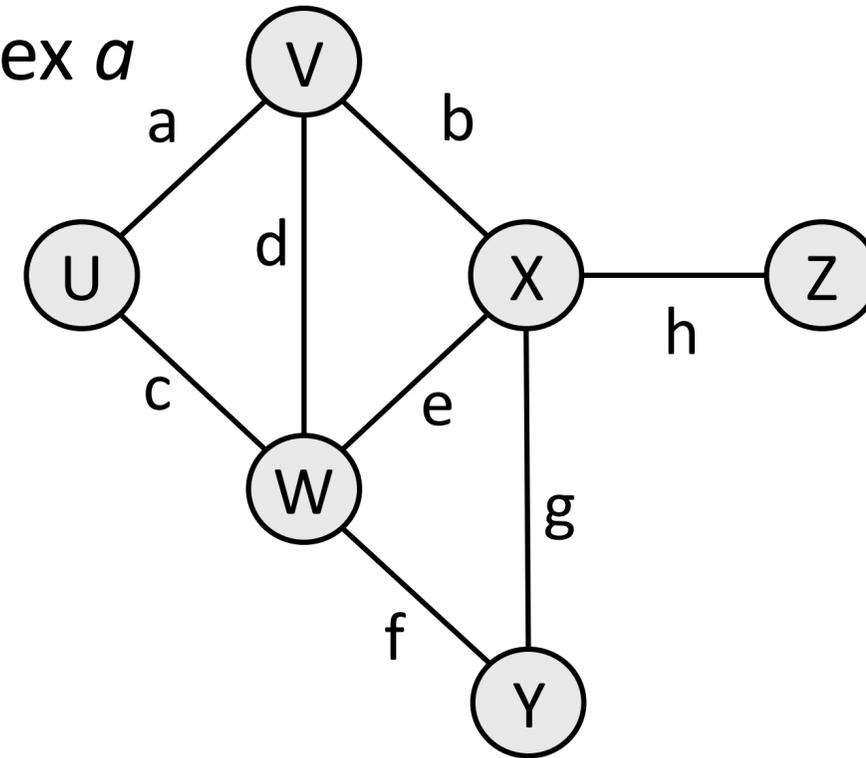


- Many graphs don't allow loops.



# Reachability, connectedness

- **reachable:** Vertex  $b$  is *reachable* from vertex  $a$  if a path exists from  $a$  to  $b$ .
- **connected:** A graph is *connected* if every vertex is reachable from every other.
- **complete:** If every vertex has a direct edge to every other.



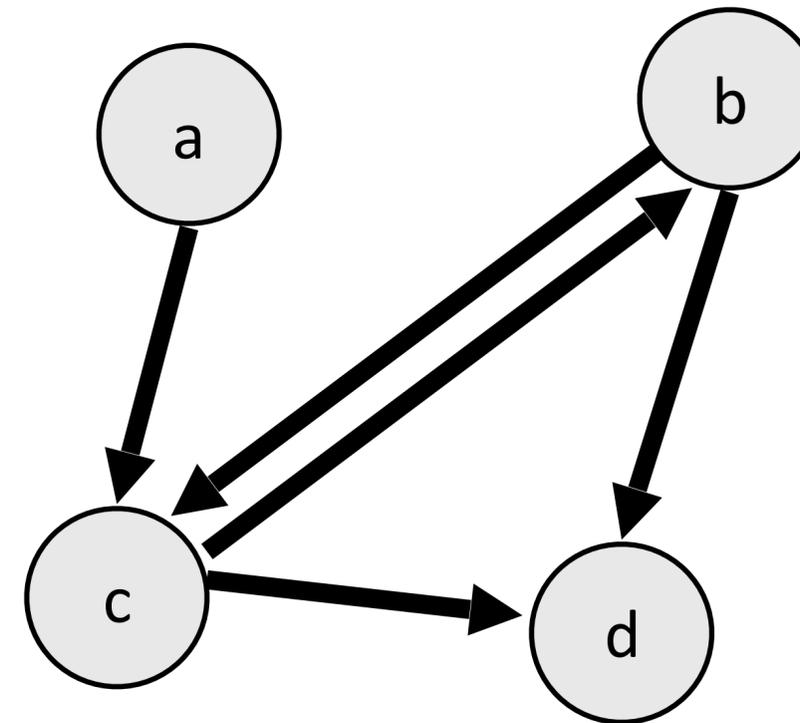
# Stanford BasicGraph

The Stanford C++ library includes a `BasicGraph` class.

- Based on an older library class named `Graph`

You can construct a graph and add vertices/edges:

```
#include "basicgraph.h"  
...  
BasicGraph graph;  
graph.addVertex("a");  
graph.addVertex("b");  
graph.addVertex("c");  
graph.addVertex("d");  
graph.addEdge("a", "c");  
graph.addEdge("b", "c");  
graph.addEdge("c", "b");  
graph.addEdge("b", "d");  
graph.addEdge("c", "d");
```



# BasicGraph members

```
#include "basicgraph.h" // a directed, weighted graph
```

<code><b>g.addEdge(v1, v2);</b></code>	adds an edge between two vertexes
<code><b>g.addVertex(name);</b></code>	adds a vertex to the graph
<code><b>g.clear();</b></code>	removes all vertexes/edges from the graph
<code><b>g.getEdgeSet()</b></code> <code><b>g.getEdgeSet(v)</b></code>	returns all edges, or all edges that start at <b>v</b> , as a Set of pointers
<code><b>g.getNeighbors(v)</b></code>	returns a set of all vertices that <b>v</b> has an edge to
<code><b>g.getVertex(name)</b></code>	returns pointer to vertex with the given name
<code><b>g.getVertexSet()</b></code>	returns a set of all vertexes
<code><b>g.isNeighbor(v1, v2)</b></code>	returns true if there is an edge from vertex <b>v1</b> to <b>v2</b>
<code><b>g.isEmpty()</b></code>	returns true if queue contains no vertexes/edges
<code><b>g.removeEdge(v1, v2);</b></code>	removes an edge from the graph
<code><b>g.removeVertex(name);</b></code>	removes a vertex from the graph
<code><b>g.size()</b></code>	returns the number of vertexes in the graph
<code><b>g.toString()</b></code>	returns a string such as "{a, b, c, a -> b}"

# BasicGraph members

```
#include "basicgraph.h" // a directed, weighted graph
```

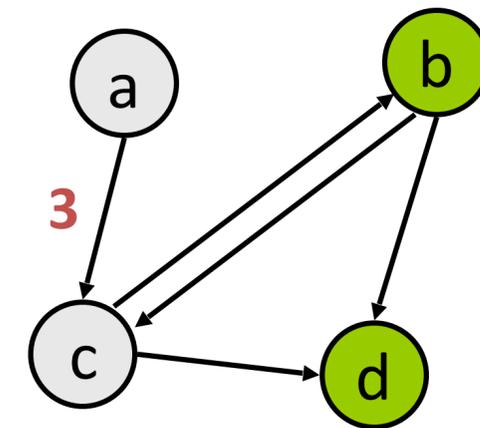
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<code>g.size()</code>	returns the number of vertexes in the graph
<code>g.toString()</code>	returns a string such as "{a, b, c, a -> b}"

# Using BasicGraph

The graph stores a struct of information about each vertex/edge:

```
struct Vertex {  
    string name;  
    Set<Edge*> edges;  
    double cost;  
    // other stuff  
};
```

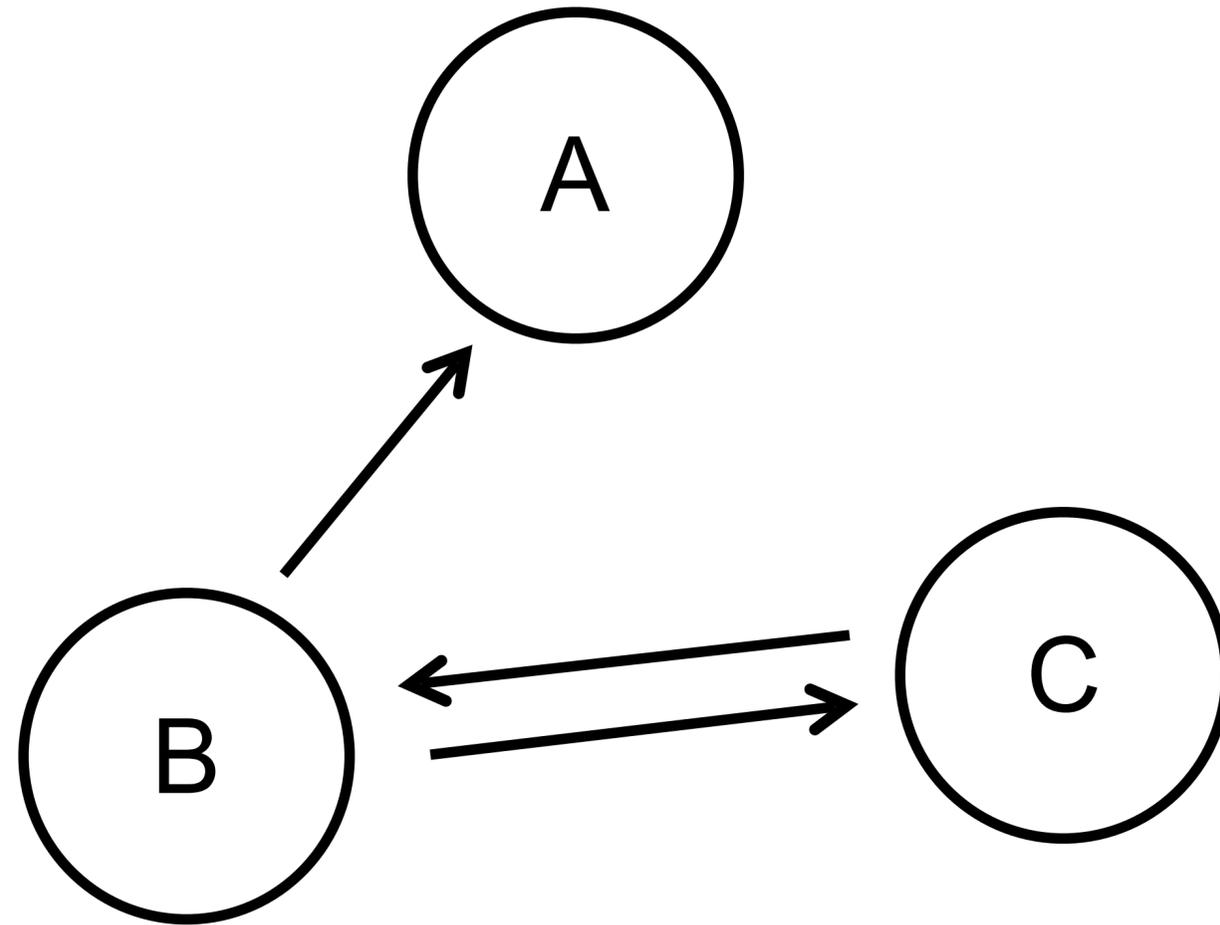
```
struct Edge {  
    Vertex* start;  
    Vertex* finish;  
    double weight;  
    // other stuff  
};
```



You can use these to help implement graph algorithms:

```
Vertex * vertC = graph.getVertex("c");  
Edge * edgeAC = graph.getEdge("a", "c");
```

# Our First Graph

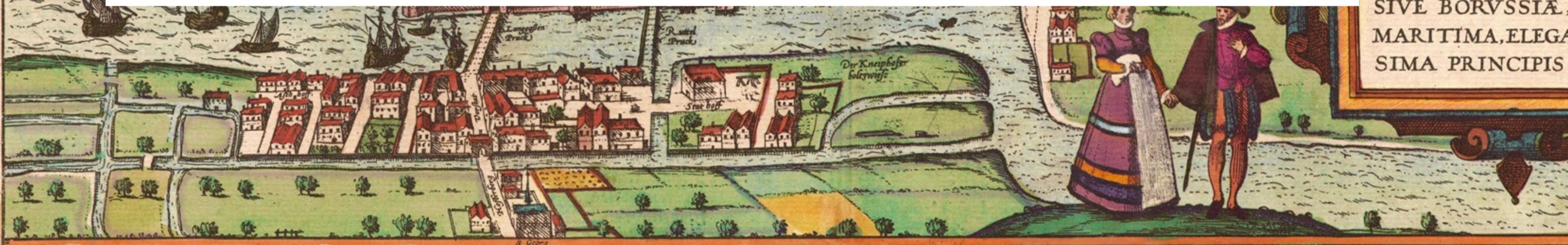
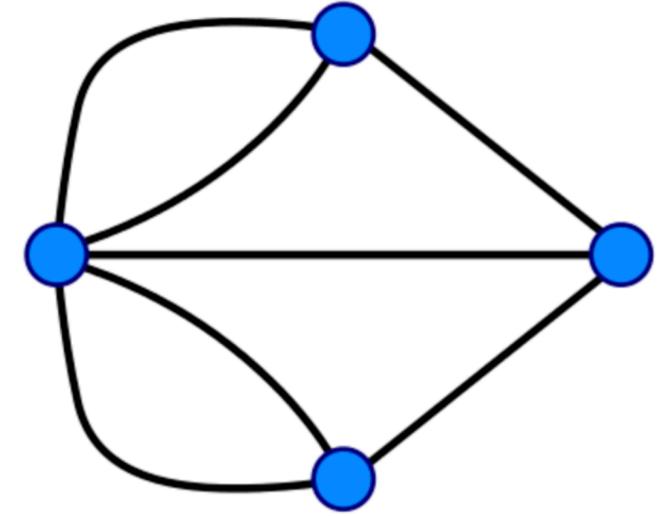
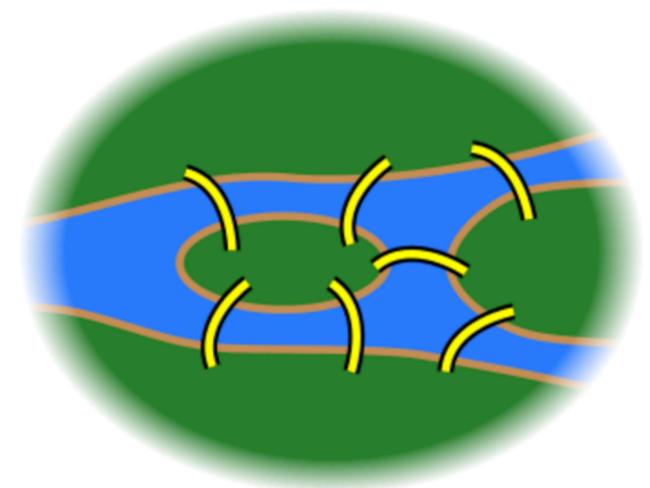
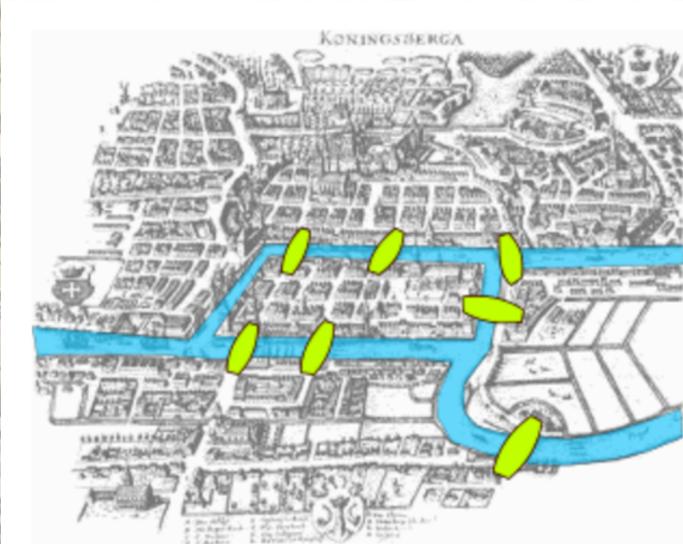


There are other representations...

... this is the one we are going to use.

# Algorithms

© Historic Cities Research Project. Courtesy of Oz

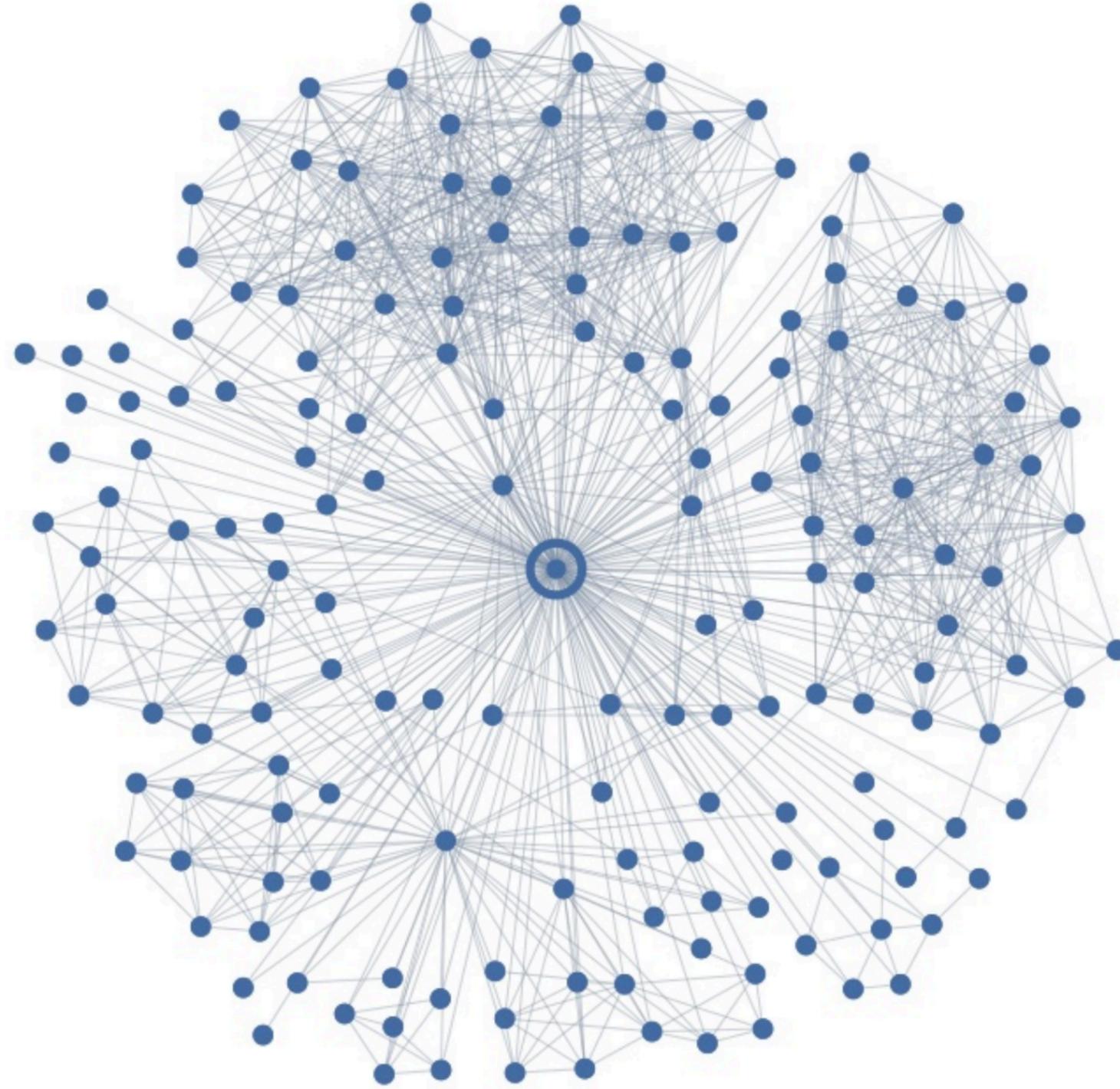


# Who Do You Love

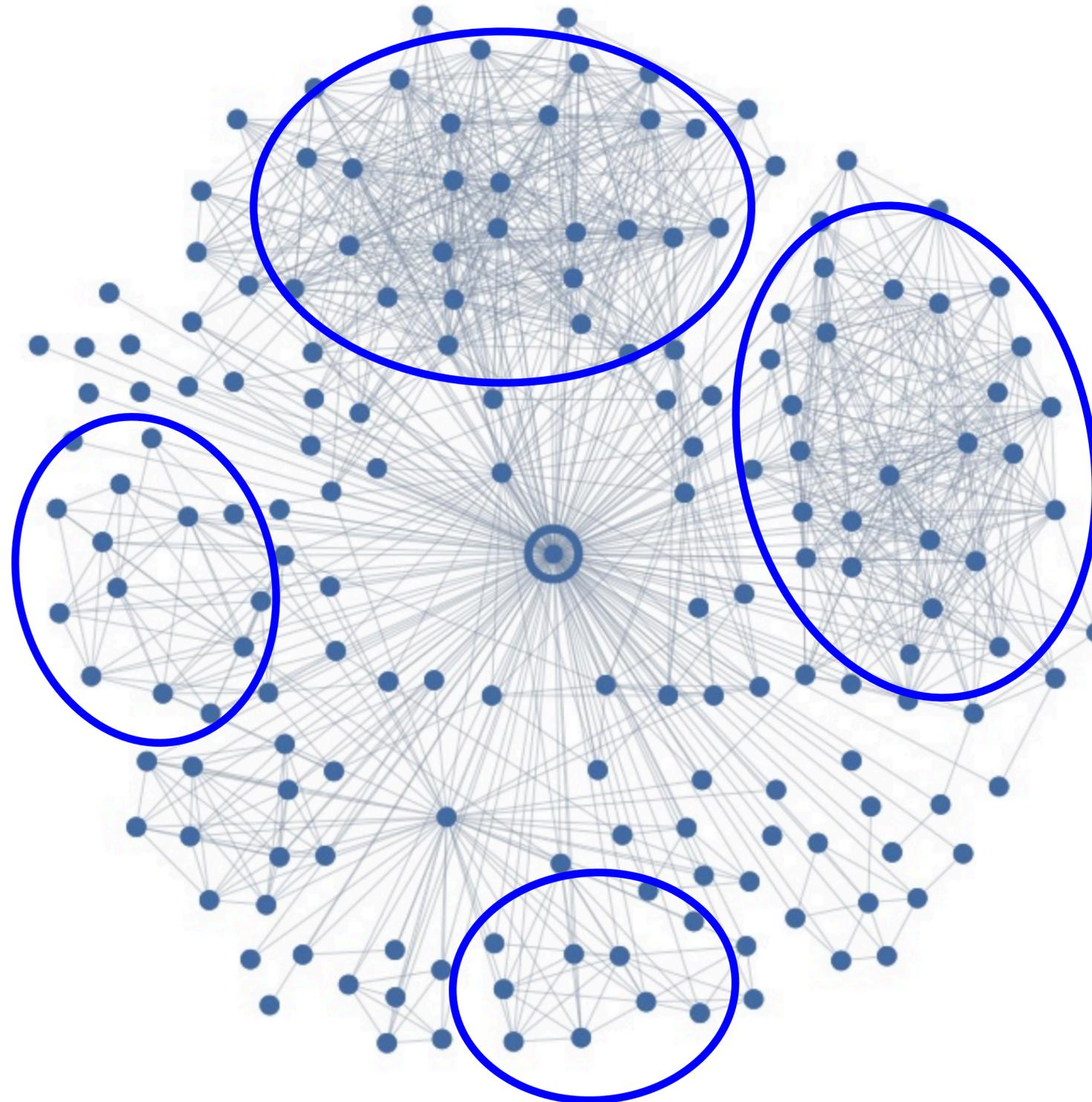
And how does Facebook know?



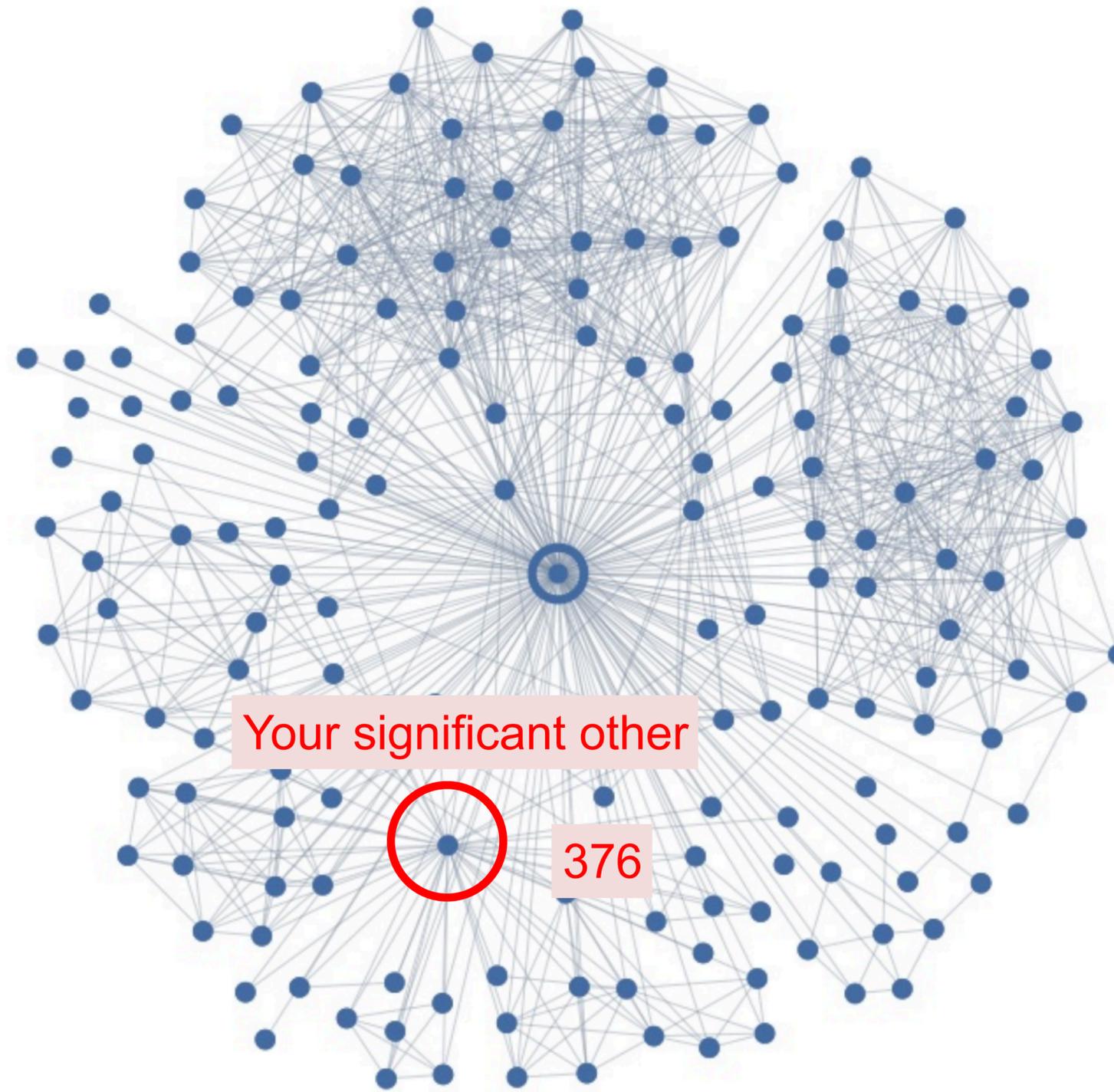
# Ego Graph



# Maybe I Love These People?



# But I Actually Love This Person



# Romance and Dispersion

## Romantic Partnerships and the Dispersion of Social Ties: A Network Analysis of Relationship Status on Facebook

Lars Backstrom  
Facebook Inc.

Jon Kleinberg  
Cornell University

### ABSTRACT

A crucial task in the analysis of on-line social-networking systems is to identify important people — those linked by strong social ties — within an individual’s network neighborhood. Here we investigate this question for a particular category of strong ties, those involving spouses or romantic partners. We organize our analysis around a basic question: given all the connections among a person’s friends, can you recognize his or her romantic partner from the network structure alone? Using data from a large sample of Facebook users, we find that this task can be accomplished with high accuracy, but doing so requires the development of a new measure of tie strength that we term ‘dispersion’ — the extent to which two people’s mutual friends are not themselves well-connected. The results offer methods for identifying types of structurally significant people in on-line applications, and suggest a potential expansion of existing theories of tie strength.

**Categories and Subject Descriptors:** H.2.8 [Database Management]: Database applications—*Data mining*

**Keywords:** Social Networks; Romantic Relationships.

they see from friends [1], and organizing their neighborhood into conceptually coherent groups [23, 25].

### Tie Strength.

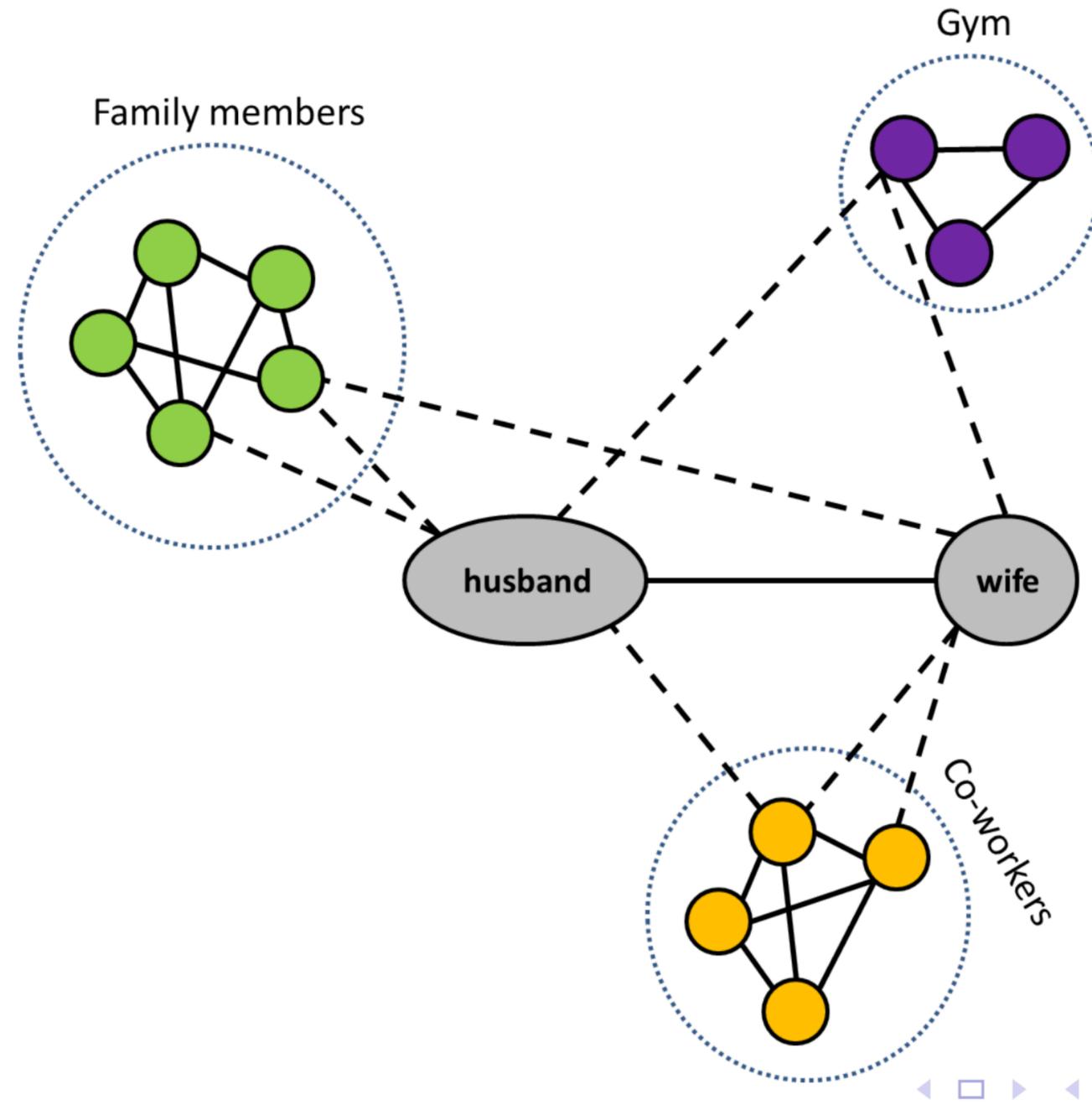
*Tie strength* forms an important dimension along which to characterize a person’s links to their network neighbors. Tie strength informally refers to the ‘closeness’ of a friendship; it captures a spectrum that ranges from strong ties with close friends to weak ties with more distant acquaintances. An active line of research reaching back to foundational work in sociology has studied the relationship between the strengths of ties and their structural role in the underlying social network [15]. Strong ties are typically ‘embedded’ in the network, surrounded by a large number of mutual friends [6, 16], and often involving large amounts of shared time together [22] and extensive interaction [17]. Weak ties, in contrast, often involve few mutual friends and can serve as ‘bridges’ to diverse parts of the network, providing access to novel information [5, 15].

A fundamental question connected to our understanding of strong ties is to identify the most important people in a person’s social network.

October 2013

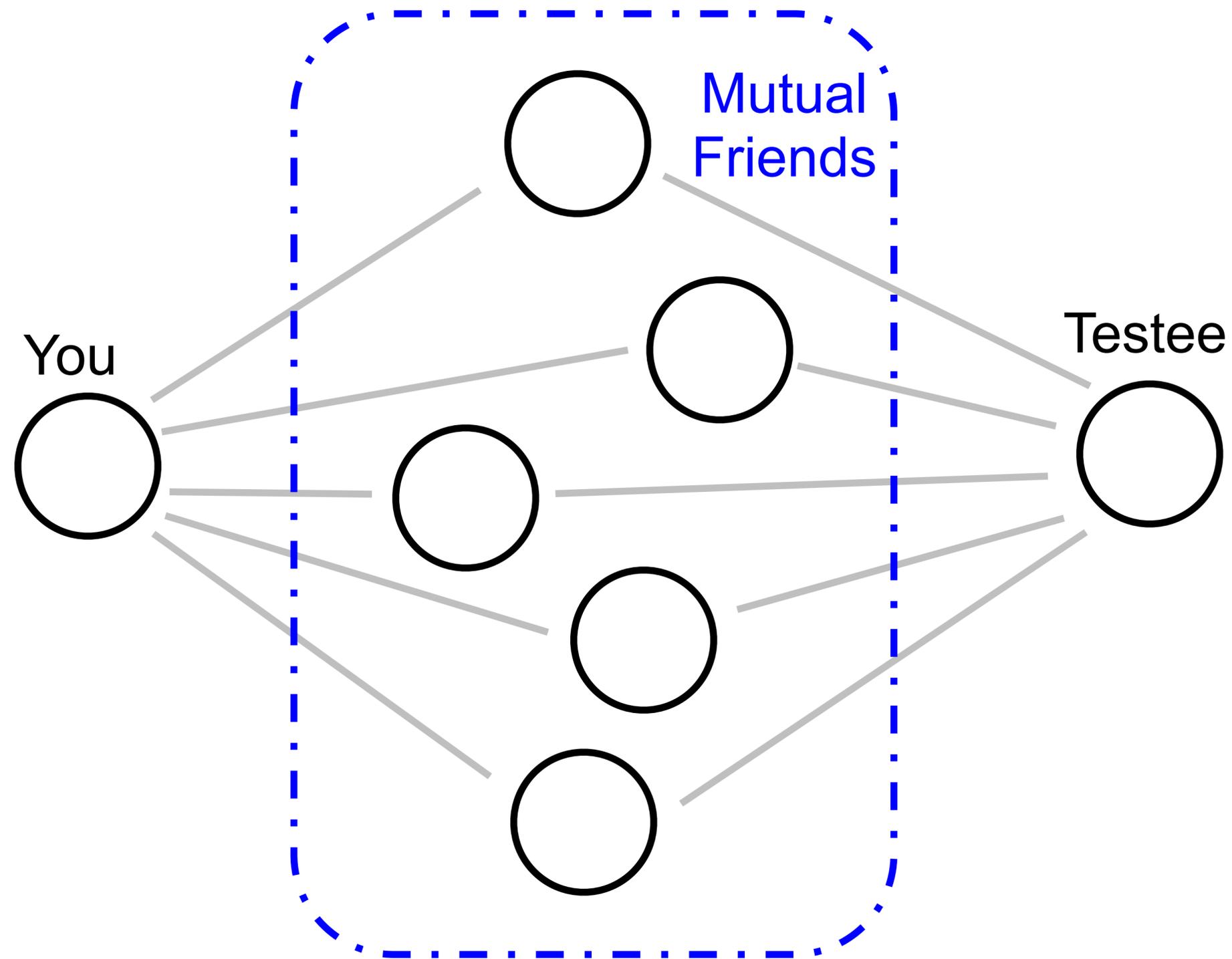
<http://arxiv.org/pdf/1310.6753v1.pdf>

# Dispersion Insight



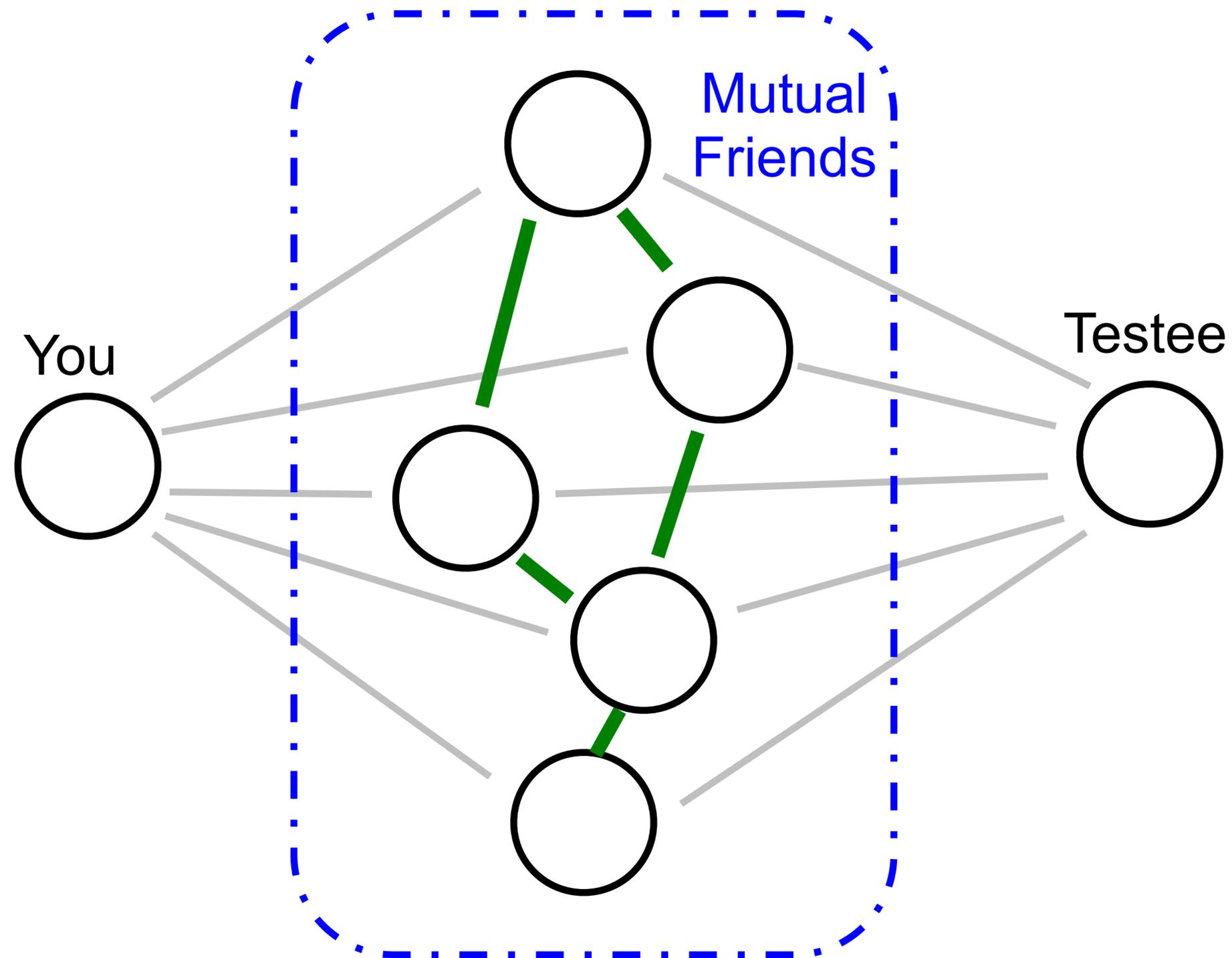
Dispersion: The extent to which two people's mutual friends are not directly connected

# Dispersion



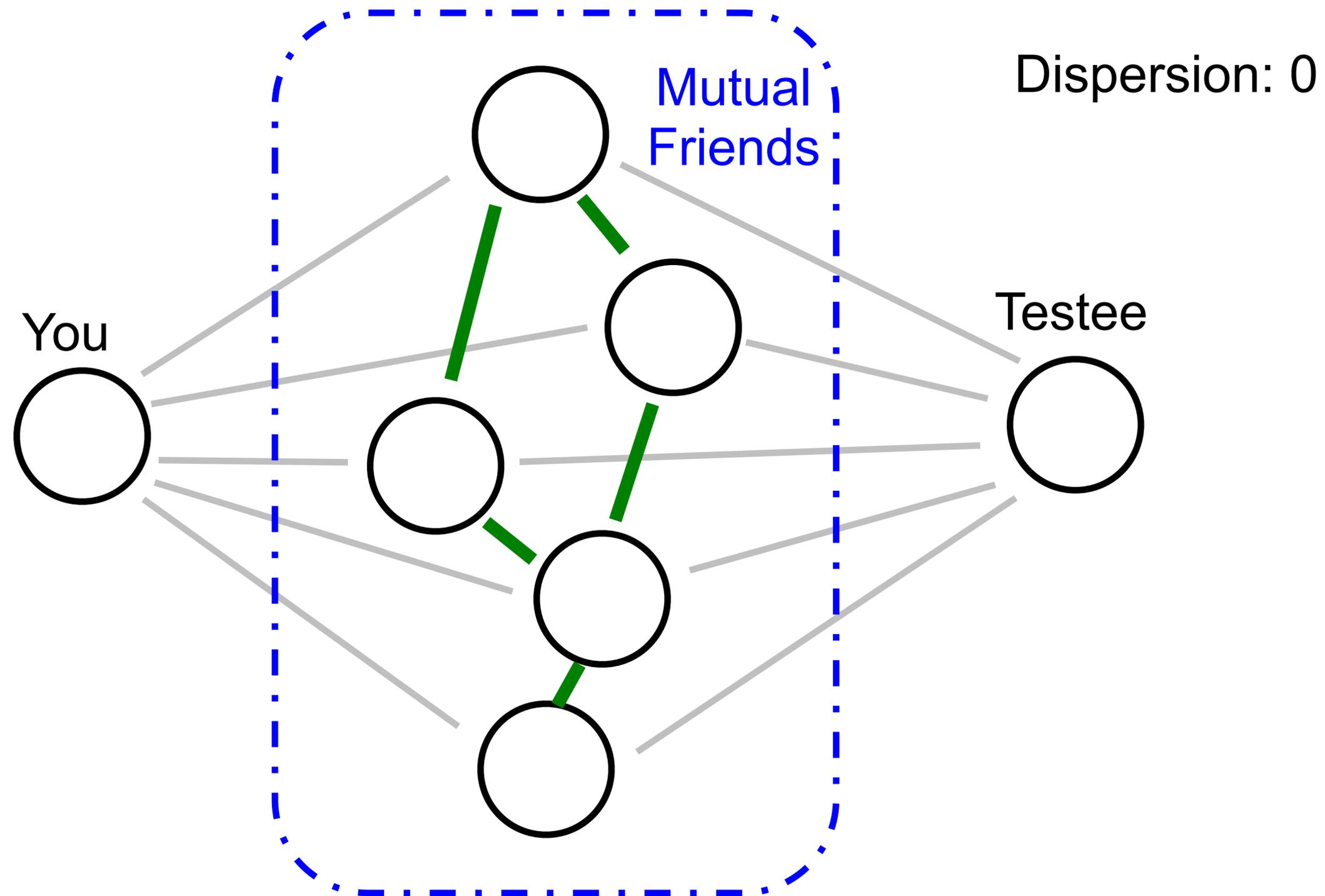
Dispersion: The extent to which two people's mutual friends are not directly connected

# Dispersion



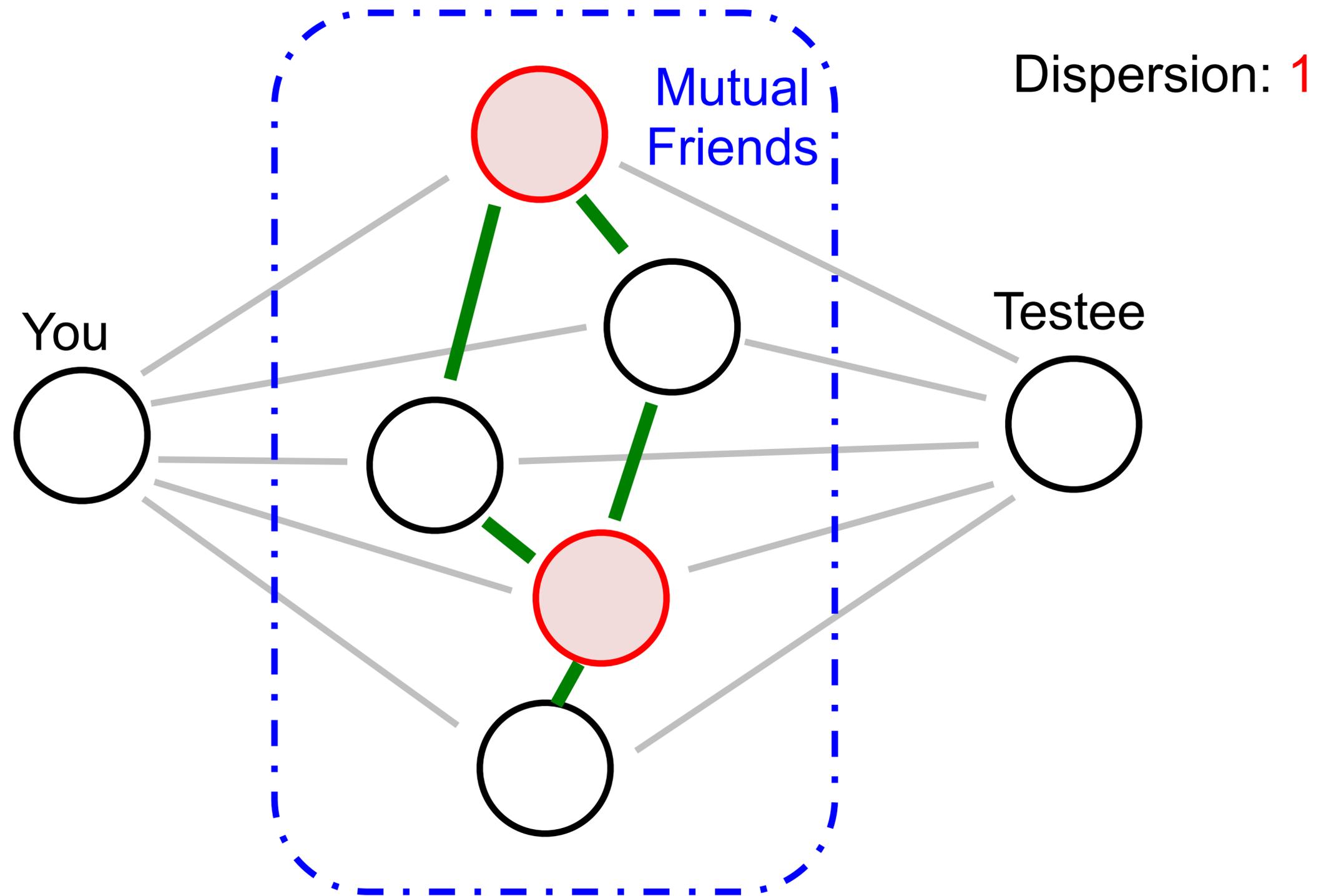
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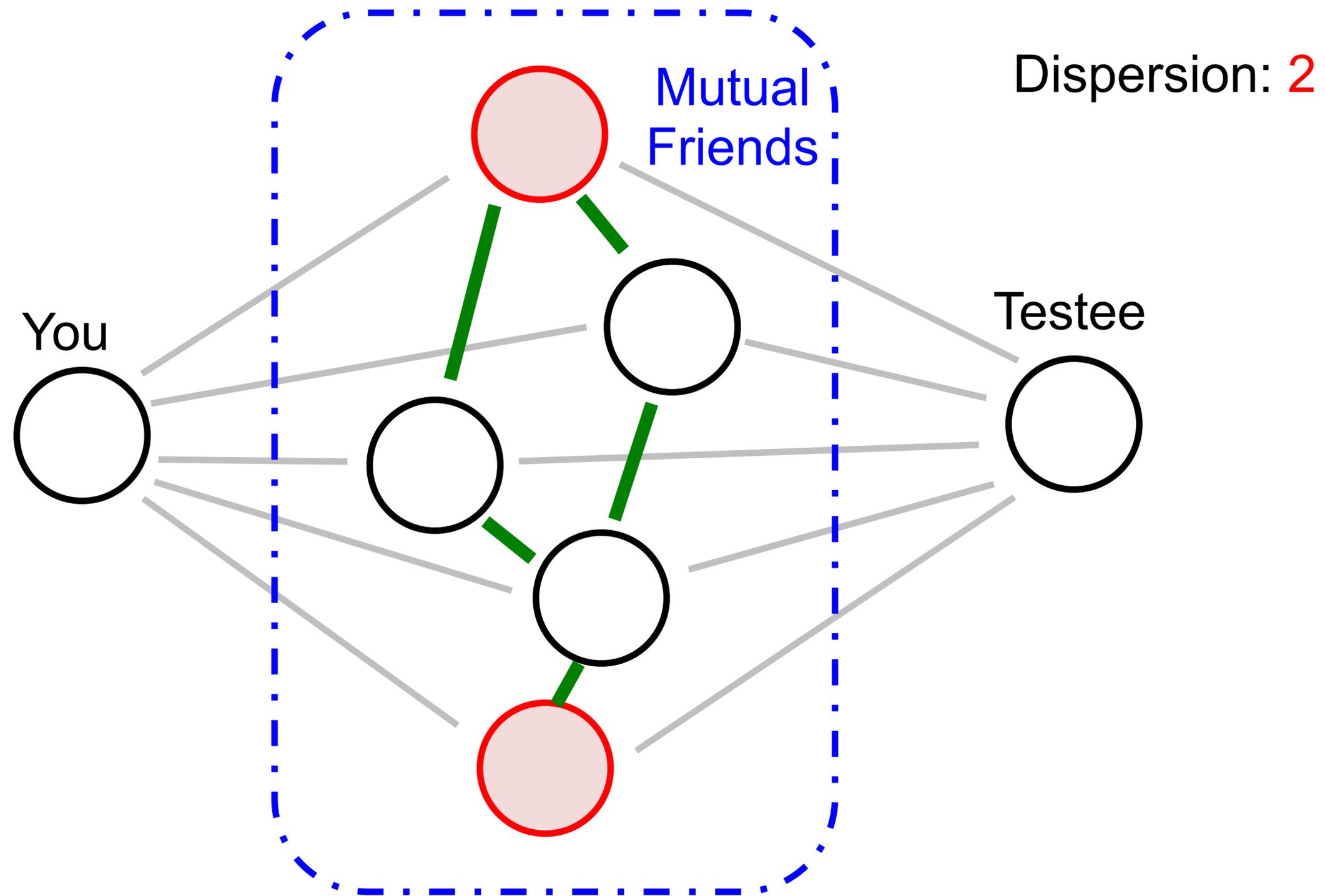
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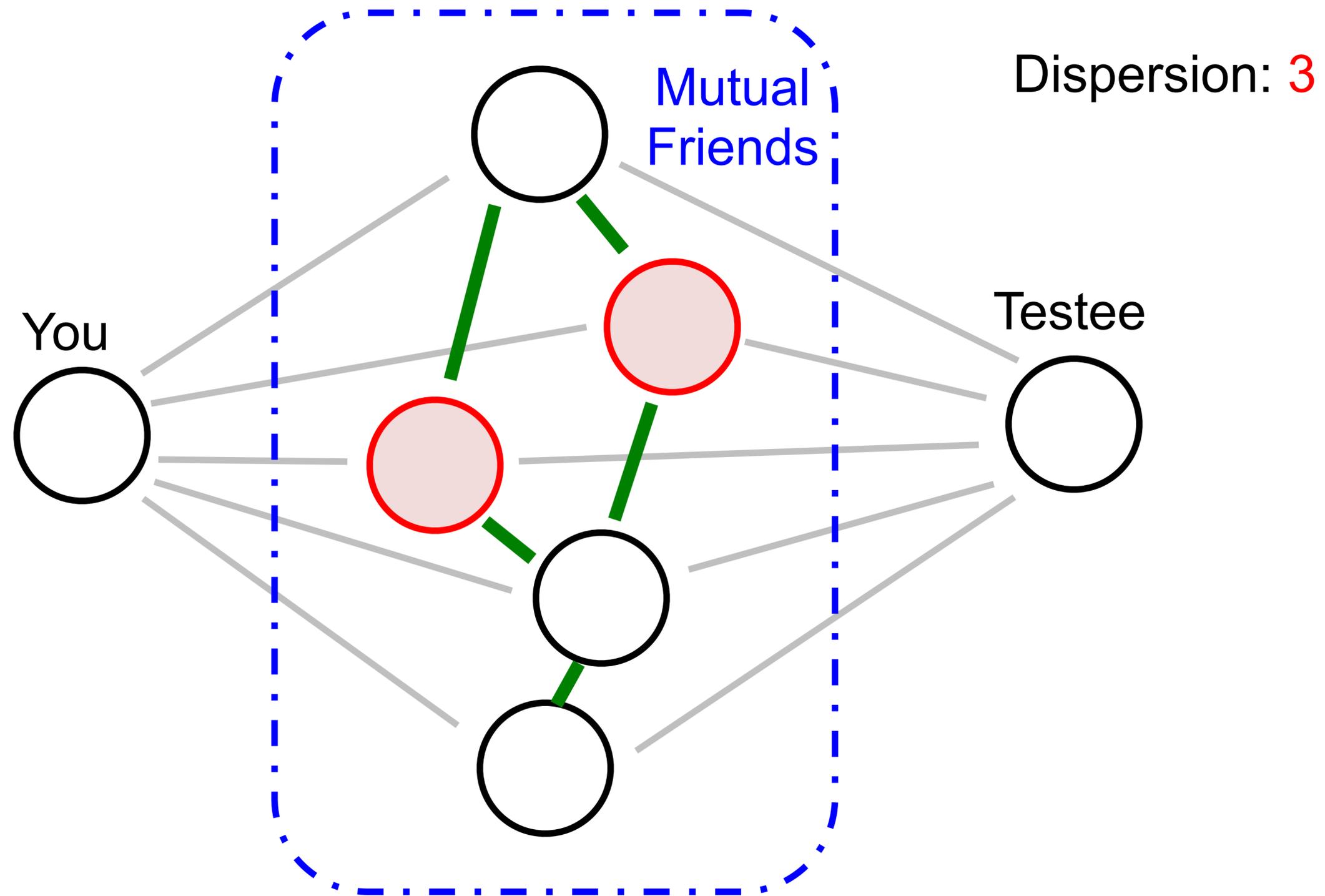
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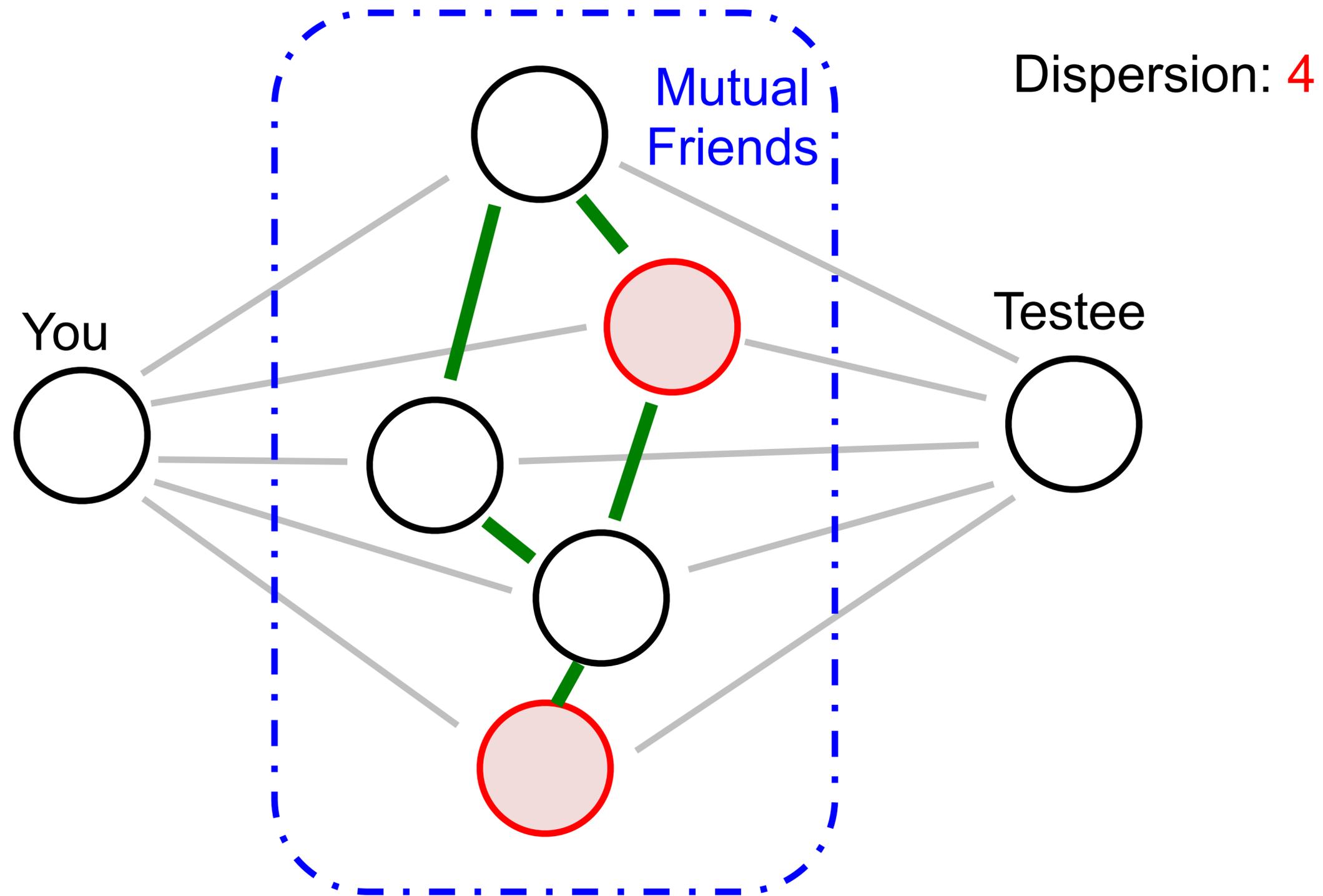
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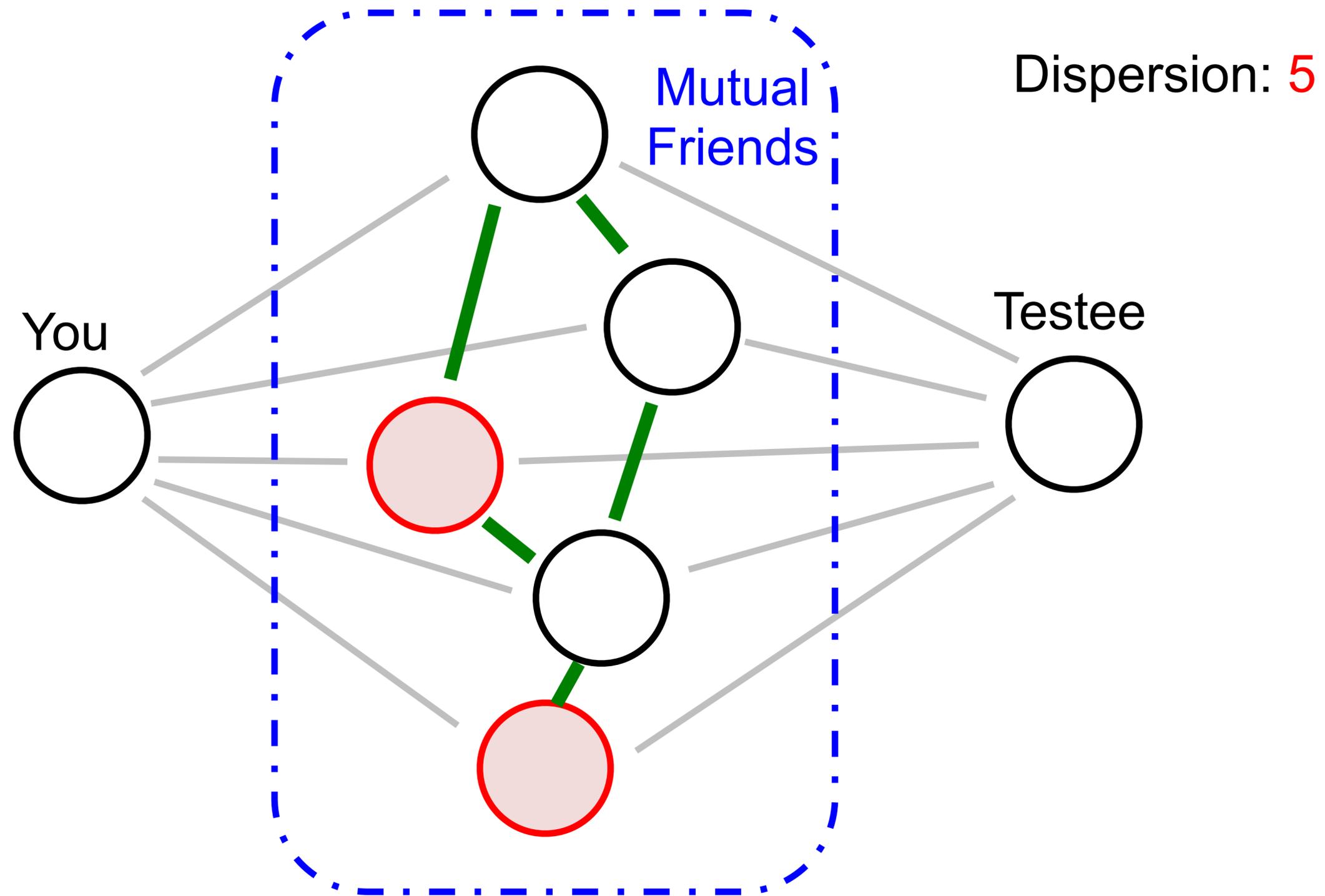
Dispersion: The extent to which two people's mutual friends are not directly connected

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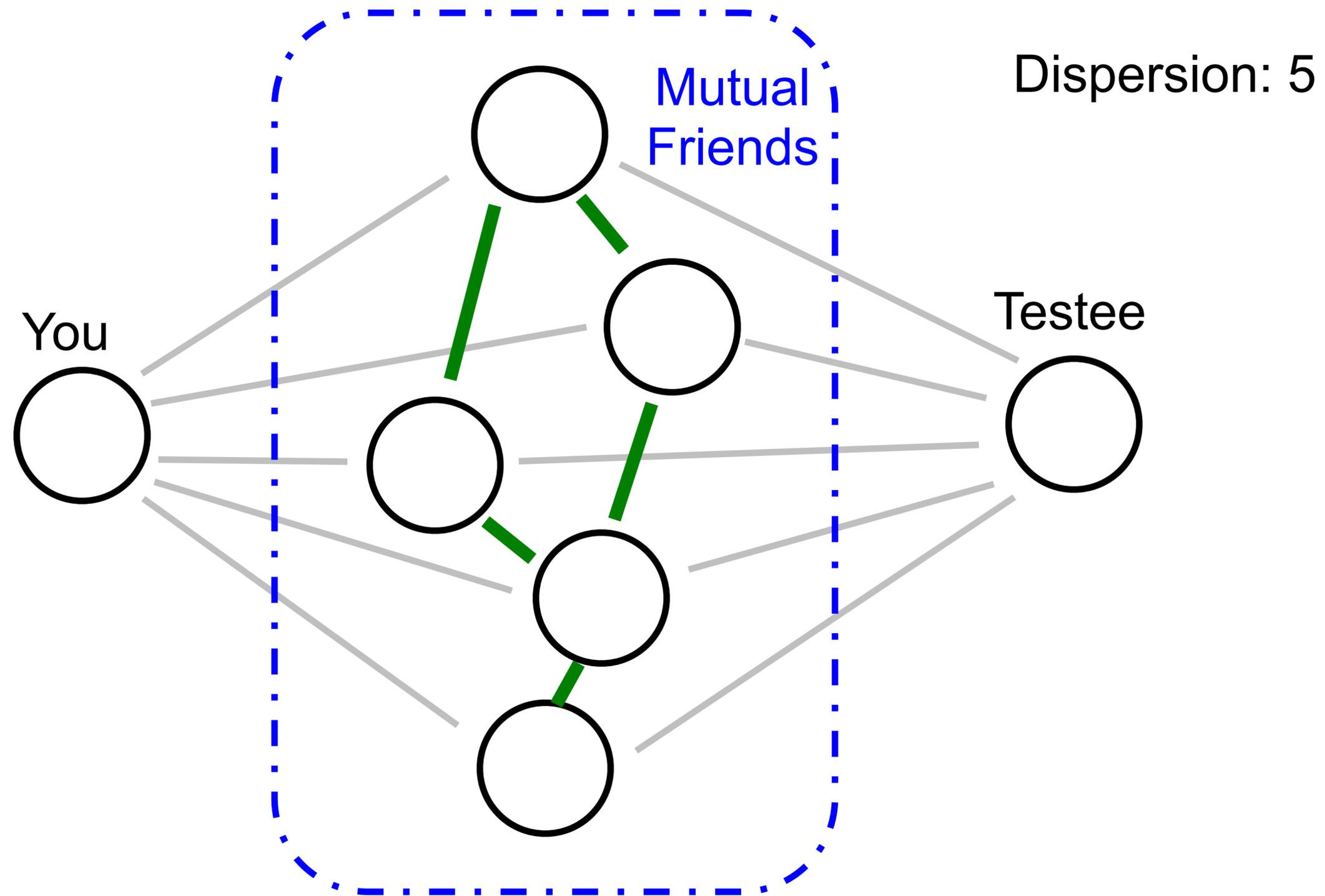
Dispersion: The extent to which two people's mutual friends are not directly connected

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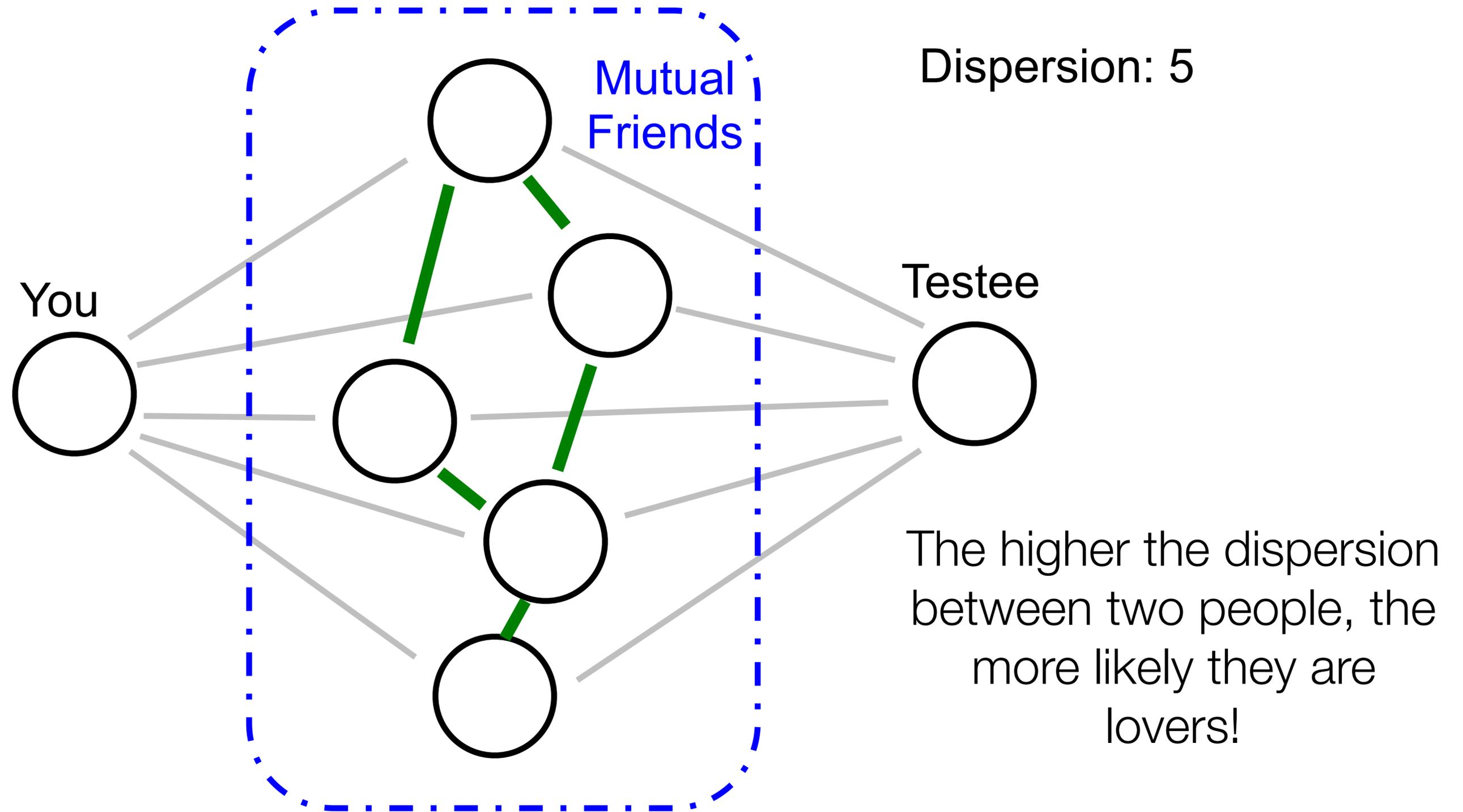
Dispersion: The extent to which two people's mutual friends are not directly connected

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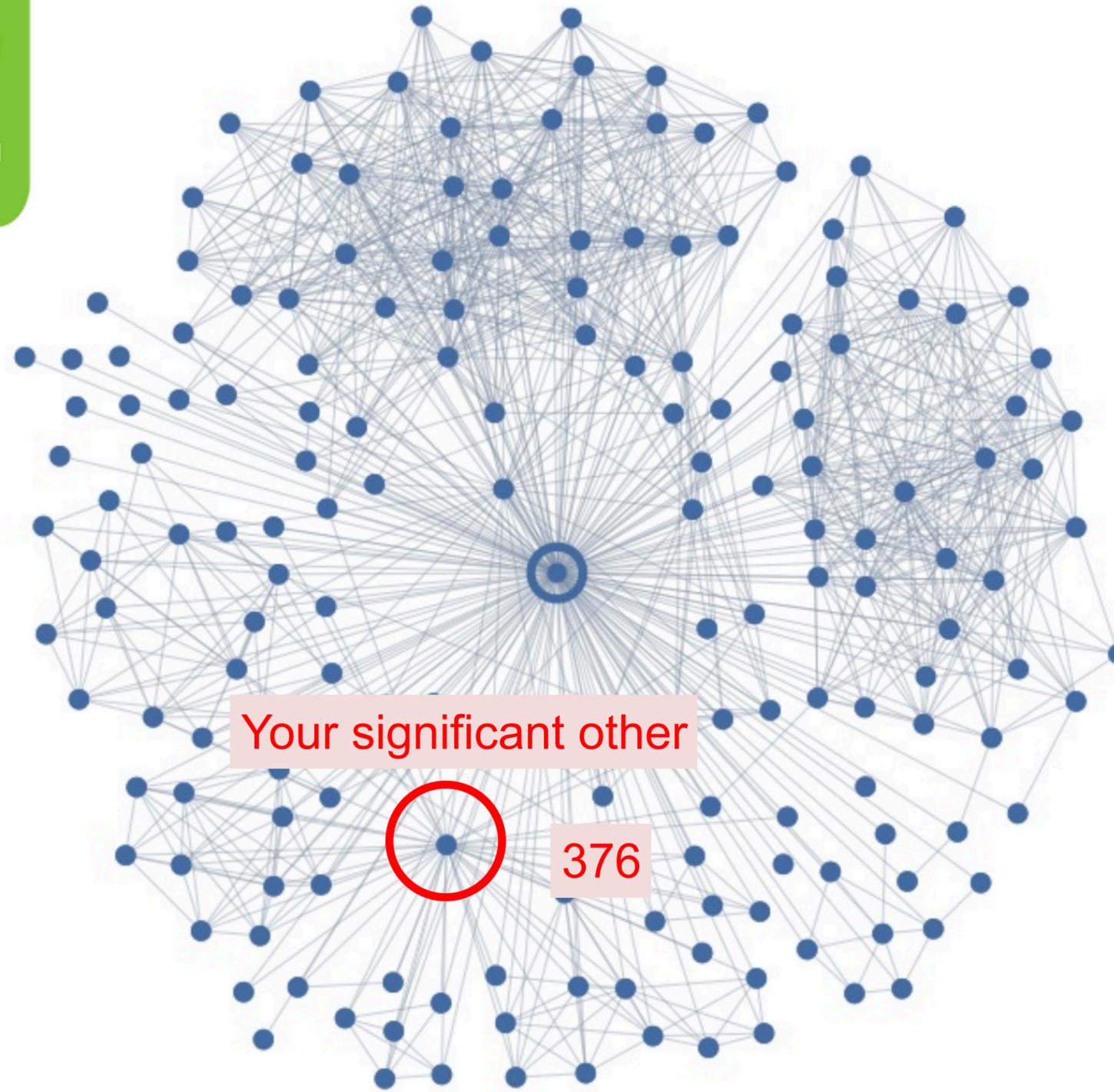
Dispersion: The extent to which two people's mutual friends are not directly connected

# Dispersion



Dispersion: The extent to which two people's mutual friends are not directly connected

# Who Do You Love?



# References and Advanced Reading

## References:

- Wikipedia on graphs: <https://en.wikipedia.org/wiki/Graph> (discrete mathematics)
- Wolfram Graph theory: <http://mathworld.wolfram.com/Graph.html>

## Advanced Reading:

- Facebook graph API: <https://developers.facebook.com/docs/graph-api>
- Different graph lecture: <https://www.youtube.com/watch?v=yIWAB6CMYiY>

# Extra Slides