



# Graph Theory and Concepts

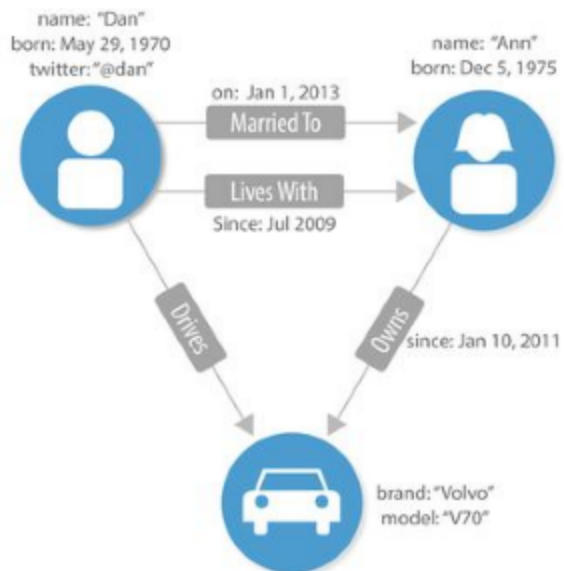
## In this lecture

- Framework and terminology for graph algorithms.
- Focus on concepts relevant for practitioners.
- Overview of graph algorithms we will cover.

# Labeled Property Graph Model

- It contains nodes and relationships.
- Nodes contain properties (key-value pairs).
- Nodes can be labeled with one or more labels.
- Relationships are named and directed, and always have a start and end node.
- Relationships can also contain properties.

# Example



## Nodes

- Can have *labels* for classification
- Labels have native indexes

## Relationships

- Relate nodes by *type* and direction

## Properties

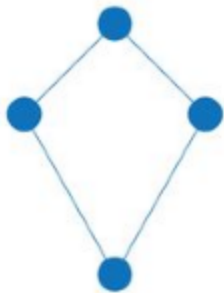
- *Attributes* of nodes and relationships
- Stored as name-value pairs
- Can have indexes and composite indexes

## Paths and subgraphs

- A **subgraph** is a graph within a larger graph. These can be useful for filters in a focused analysis.
- A **path** is a group of nodes and their connecting relationships.

# Graph types

- **Simple:** nodes only have one relationship between them.
- **Multigraph:** multiple relationships allowed.
- **Pseudo graph:** multiple relationships and loops allowed.



**Simple Graph**  
Node pairs can only have one relationship between them.



**Multigraph**  
Node pairs can have multiple relationships between them.



**Graph (also Pseudograph)**  
Node pairs can have multiple relationships between them.  
Nodes can loop back to themselves.

# Graph structure

- Random networks: unobserved in practice.
- Small-world networks: local connections with global reach.
- Scale-free networks: self-similarity structure.



**Random**  
Average distributions.  
No structure or hierarchical patterns.



**Small-World**  
High local clustering and short  
average path lengths.  
Hub-and-spoke architecture.



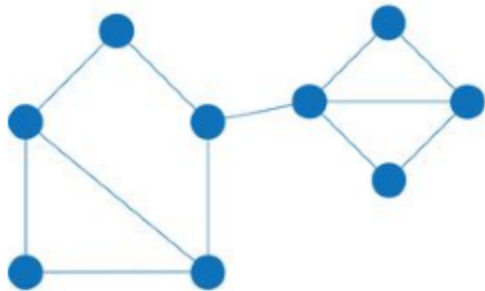
**Scale-Free**  
Hub-and-spoke architecture preserved at  
multiple scales.  
High power law distribution.



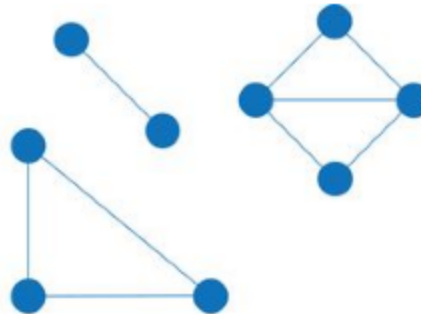
# Flavors of graphs

# Connected vs disconnected

- **Connected:** there is a path between every pair of vertices.
- Disconnected graphs may cause problems for some algorithms.



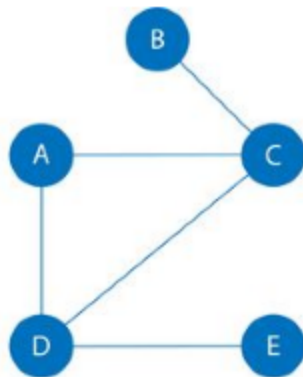
Connected Graph



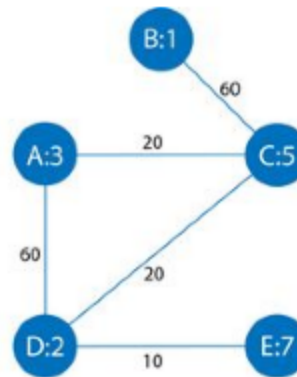
Disconnected Graph  
Includes 3 components.

# Weighted vs unweighted

- Sometimes it is useful to quantify the *strength* of a relationship with weights.
- Compare the shortest path between A and E in both cases.



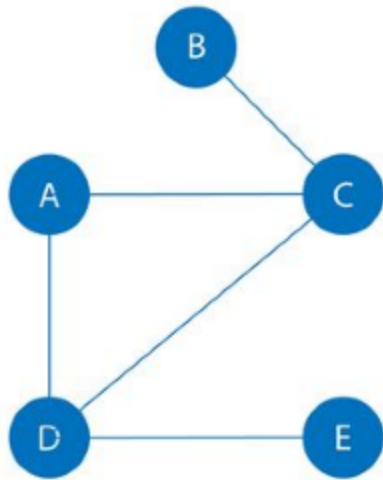
Unweighted



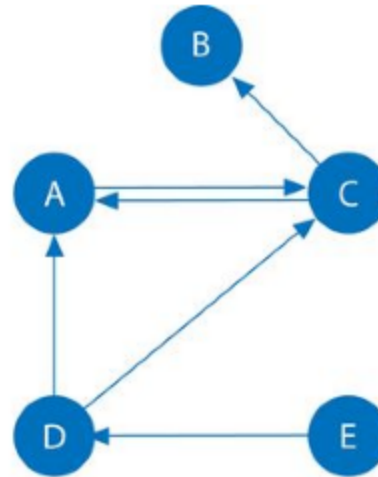
Weighted

# Undirected vs directed

- Relationships may not be symmetrical!
- For instance, one-way roads, "likes", etc.



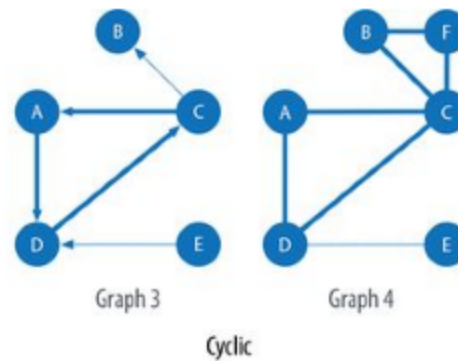
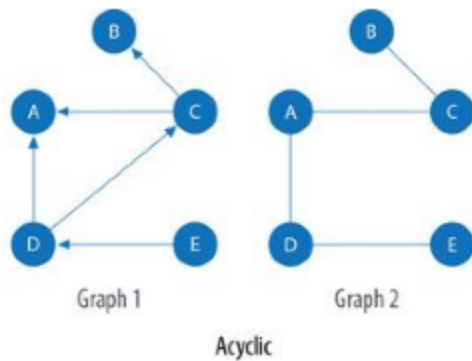
Undirected



Directed

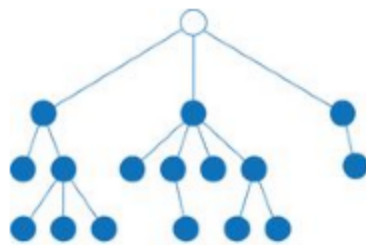
# Cyclic vs acyclic

- Cyclic graphs can occur sometimes (groups of friends).
- Acyclic graphs arise in genealogy, version histories, scheduling problems.



# Trees

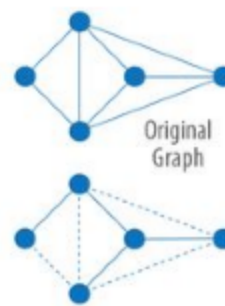
- Acyclic graph such that any two nodes are connected by exactly one path.
- Key role in network design, data structures, search optimization.



**Rooted Tree**  
Root node  
and no cycles



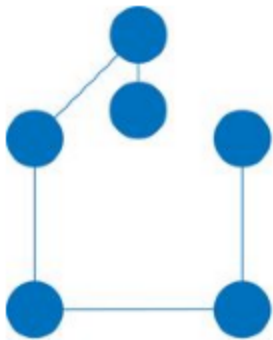
**Binary Tree**  
Up to 2 child nodes  
and no cycles



**Spanning Tree**  
Subgraph of all nodes  
but not all relationships  
and no cycles

# Sparse vs dense

- Max edges on an  $N$  vertex graph:  $E_{\max} := \frac{N(N-1)}{2}$ .
- Density:  $\frac{R}{E_{\max}} = \frac{2 \cdot R}{N(N-1)}$ .
- Extremely sparse or dense graphs can give meaningless results sometimes!



Sparse  
Density = 0.3  
 $D = \frac{2(5)}{6(6-1)}$



Dense  
Density = 0.8  
 $D = \frac{2(12)}{6(6-1)}$

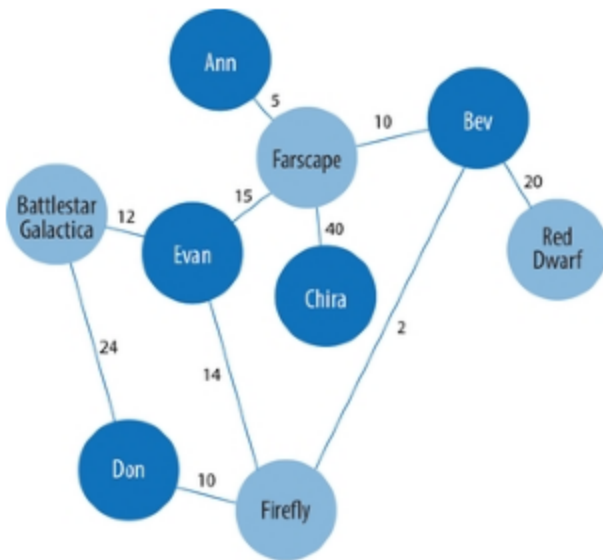


Complete (Clique)  
Density = 1.0  
 $D = \frac{2(15)}{6(6-1)}$

# Monopartite, bipartite and projections

- Many networks have multiple node and relationship types.
- If that is the case, graphs can be **bipartite** or **k-partite**, depending on the number of nodes/relationship types.
- However, graph algorithms need only one node type and one relationship type (monopartite graphs).
- Hence some preprocessing is needed, called **projection**.



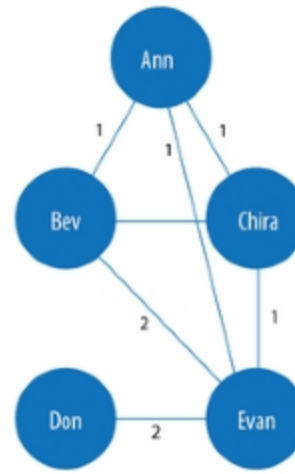


Graph 1

### Viewers and TV Shows

Bipartite Graph

Relationship weights = Number of episodes watched

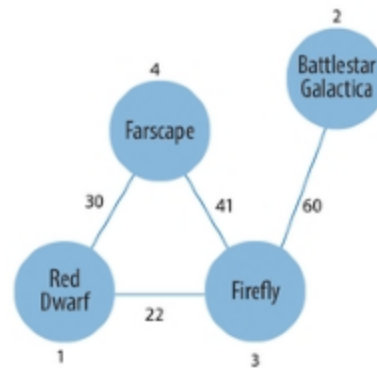


Graph 2

### Projection of Viewers

Monopartite Graph

Relationship weights = Number of shows in common



Graph 3

### Projection of TV Shows

Monopartite Graph

Node weights = Number of active viewers

Relationship weights = Combined episodes watched by viewers in common

## Types of graph algorithms

- **Pathfinding:** Finding shortest paths between graphs.
- **Centrality:** Which nodes are more important in a network?
- **Community detection:** Most real-world networks have substructures or communities of more or less independent subgraphs. For example, *echo chambers* or *filter bubble effects*.