

# CS 350 Algorithms and Complexity

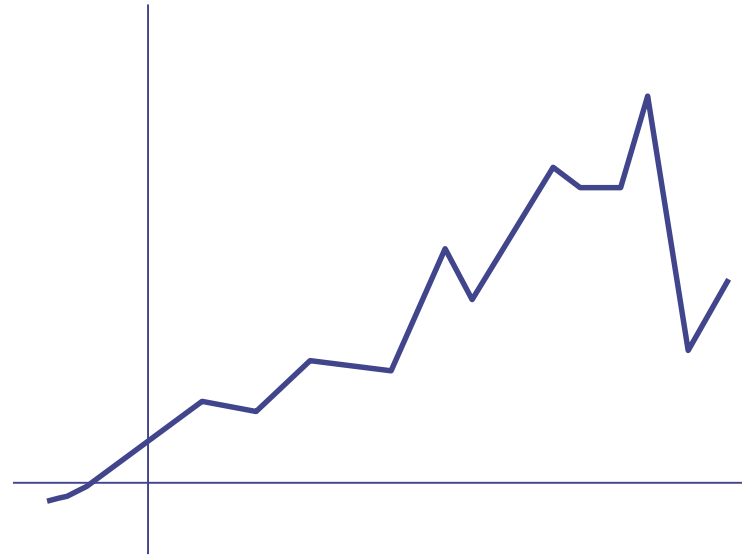
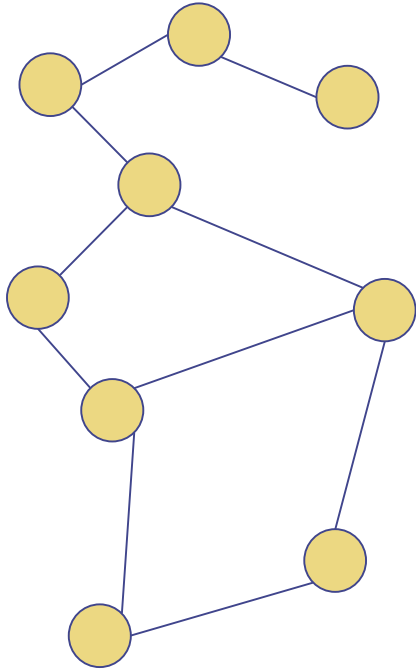
*Fall 2018*

## Lecture 7: Graphs (Introduction and Terminology)

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Department of Computer Science  
Portland State University

*(\*presentation includes some material originally created by Prof. Mark P. Jones)*

# Graphs, not Graphs!

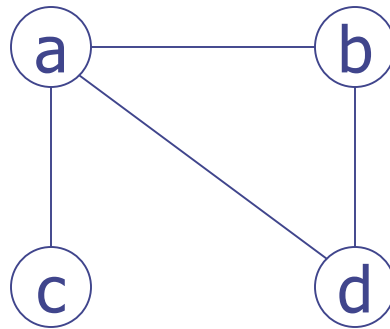


# Graphs:

◆ A graph is a pair  $(V, E)$  where

- $V$  is a set of vertices;
- $E$  is a set of edges  $\{u, v\}$ , where  $u, v$  are distinct vertices from  $V$ .

◆ For example:



◆  $G = (\{a, b, c, d\}, \{\{a, b\}, \{a, c\}, \{a, d\}, \{b, d\}\})$

◆ Examples: computer networks, street layout, etc...

# Example: of an Undirected Graph

◆ A graph is formally defined as:

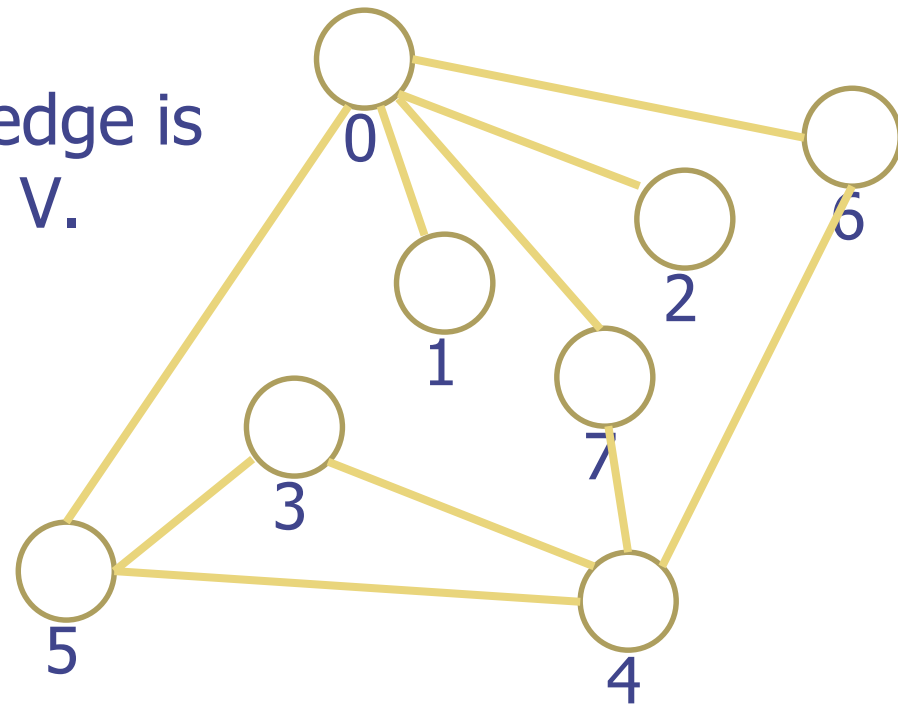
- A set  $V$  of vertices.
- A set  $E$  of edges. Each edge is a pair of two vertices in  $V$ .

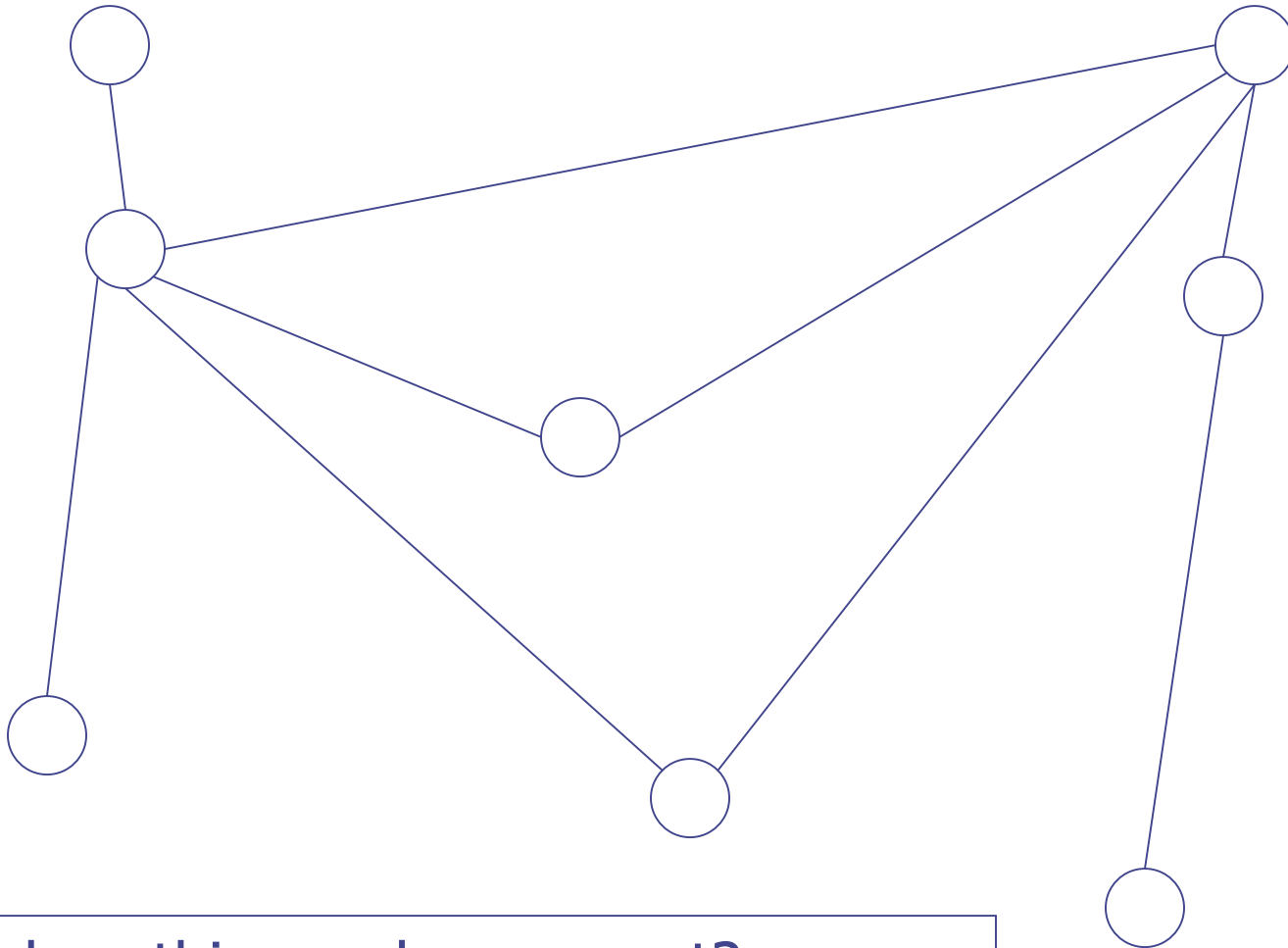
◆ What is the set of vertices on the graph shown here?

- $\{0, 1, 2, 3, 4, 5, 6, 7\}$

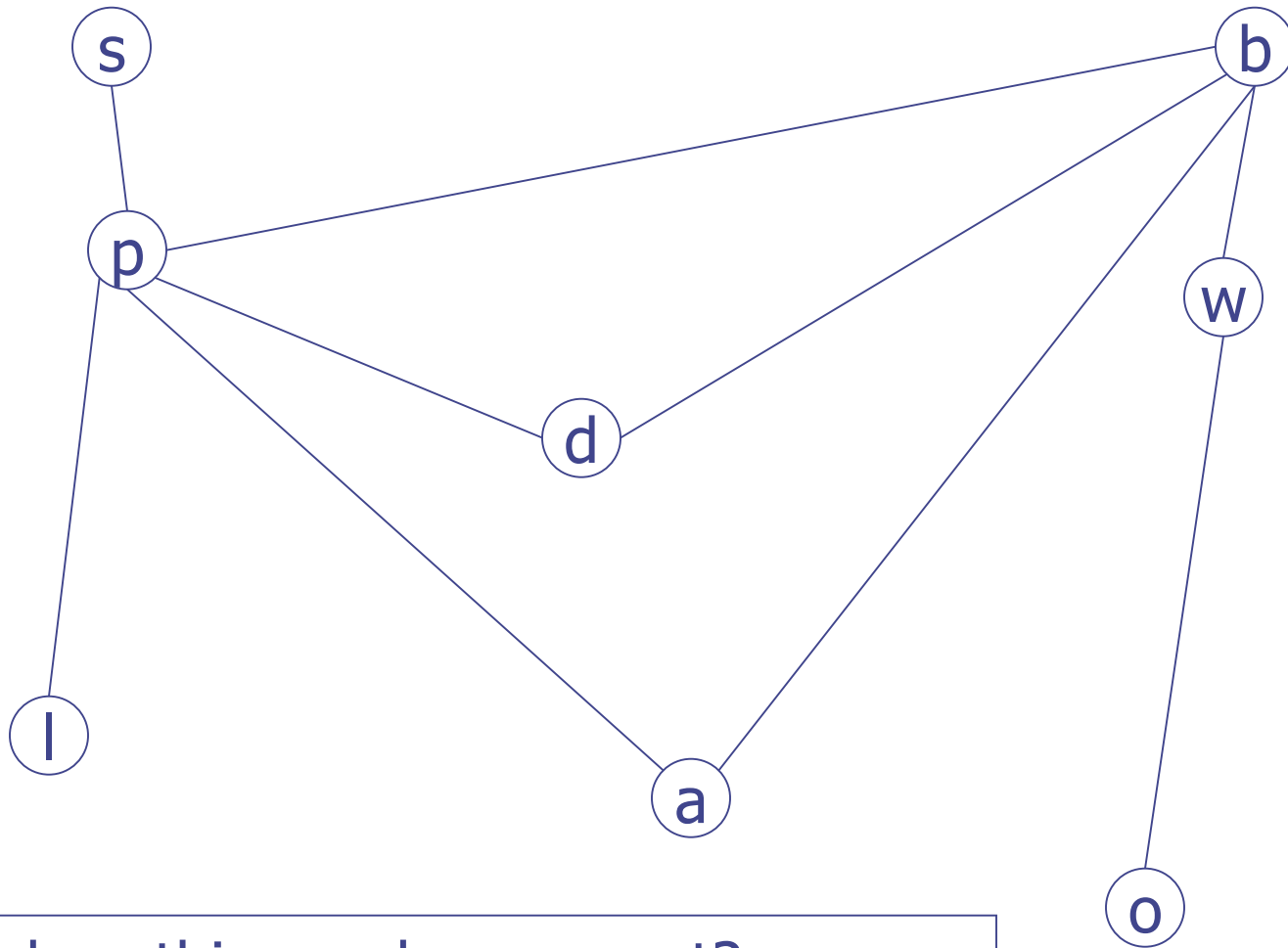
◆ What is the set of edges?

- $\{(0,1), (0,2), (0,5), (0,6), (0,7), (3,4), (3,5), (4,5), (4,6), (4,7)\}$ .

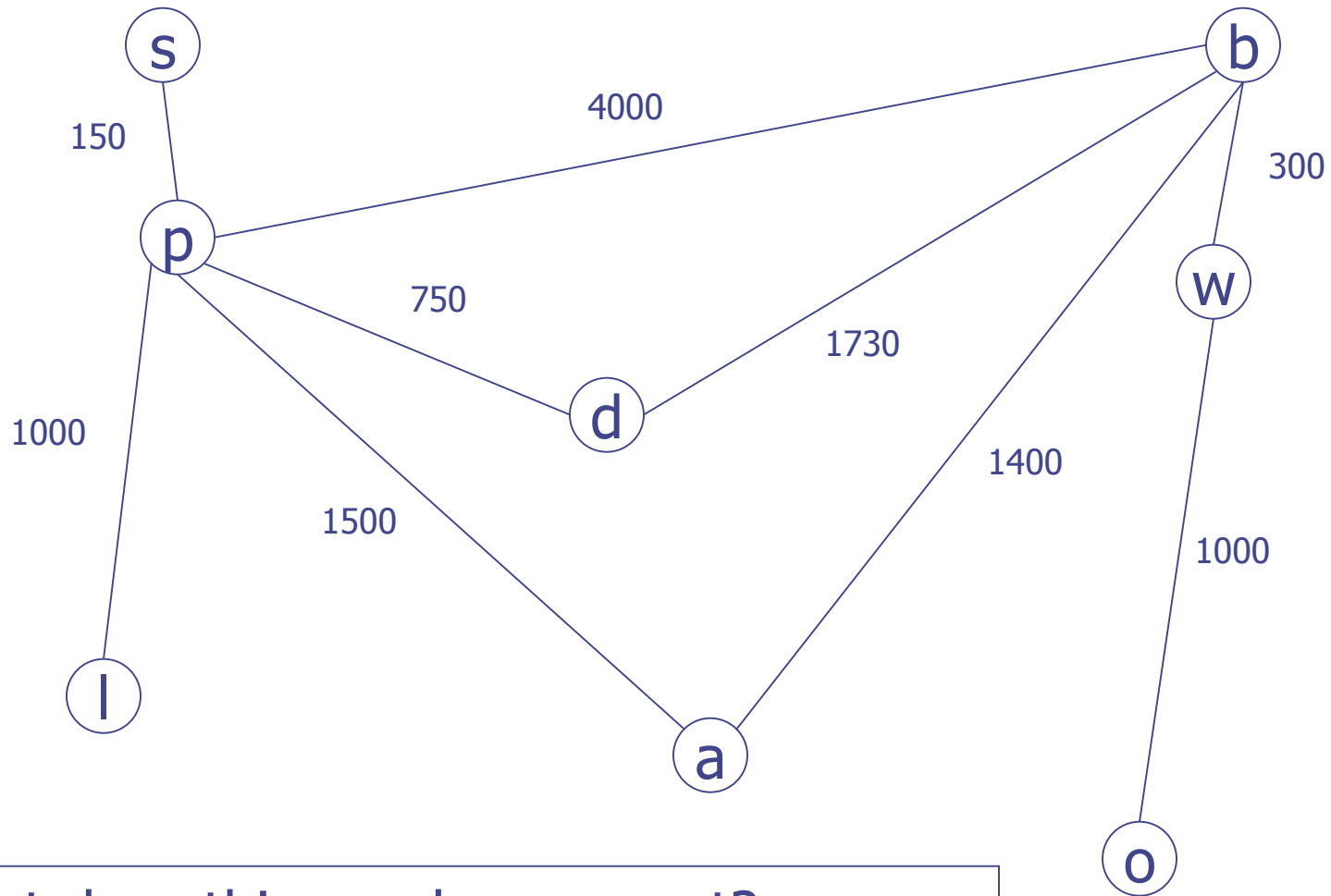




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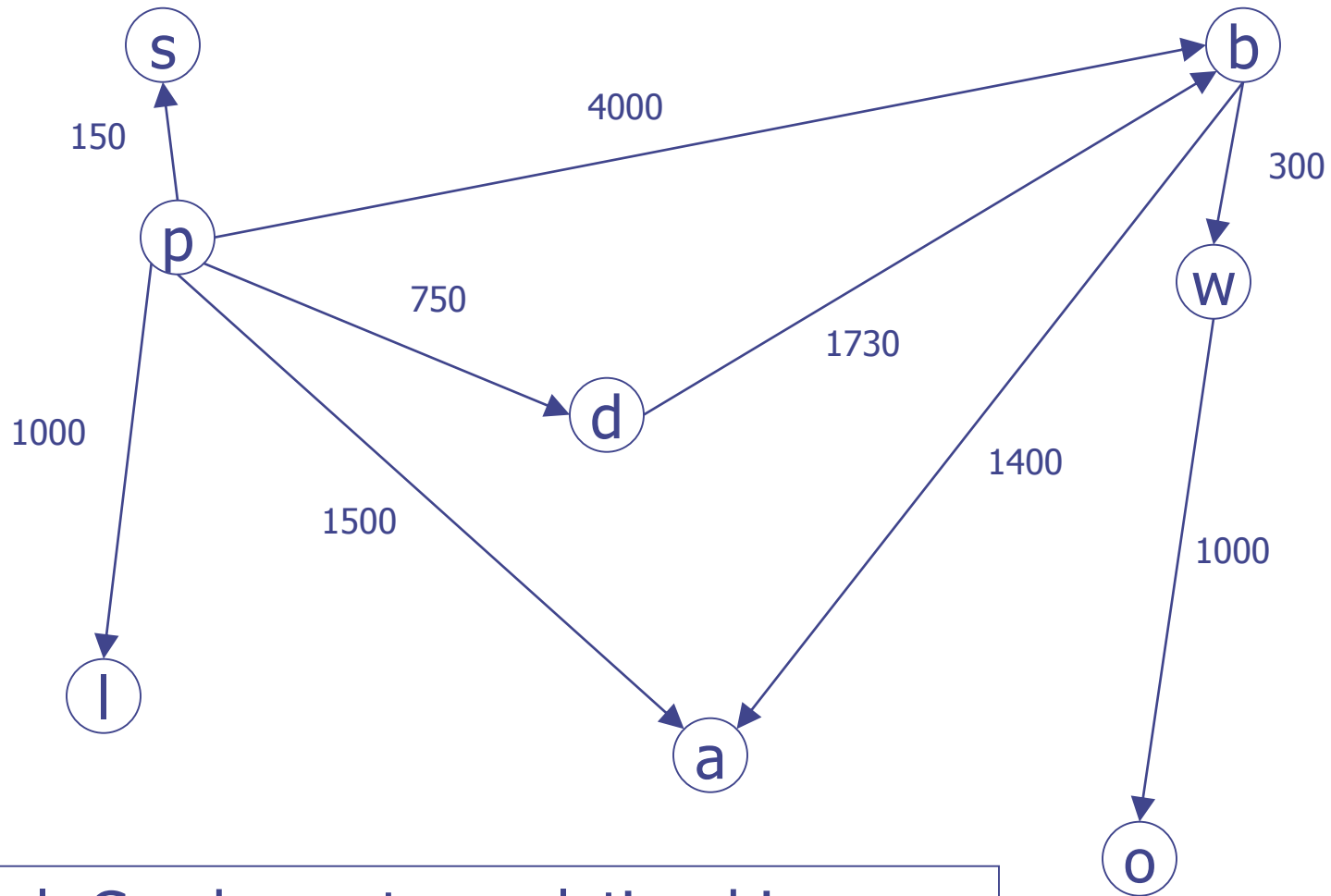


What does this graph represent?

# Directed graphs:

- ◆ A directed graph is a pair  $(V, E)$  where
  - $V$  is a set of vertices;
  - $E$  is a set of edges, each of which is an ordered pair  $(u, v)$ .
- ◆ Directed edges are the “one-way streets” of graph theory.
- ◆ Examples: Flowcharts, call graphs, dependency charts, state machines, ...



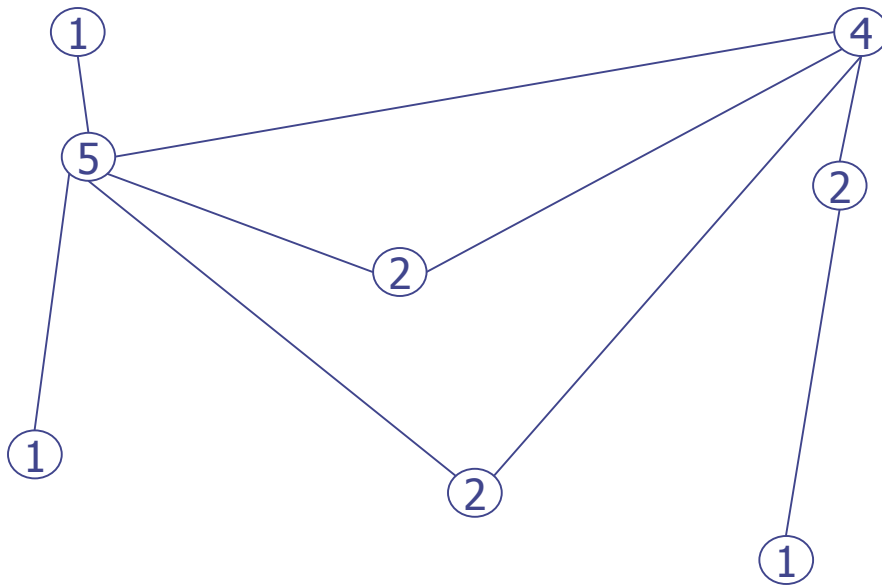


Moral: Graphs capture relationships between objects, while abstracting away from unnecessary details.

- ◆ There are a range of algorithms for manipulating graphs from a fairly general abstract point of view.
  - Is there a way to get from one vertex to another?
  - If so, what is the quickest/cheapest route?
  - Are there any alternatives?
  - Etc...
- ◆ Many of these turn out to be very useful in practical applications.
- ◆ But first we need to establish a vocabulary for talking about graphs, without restricting our attention to any *specific* application.

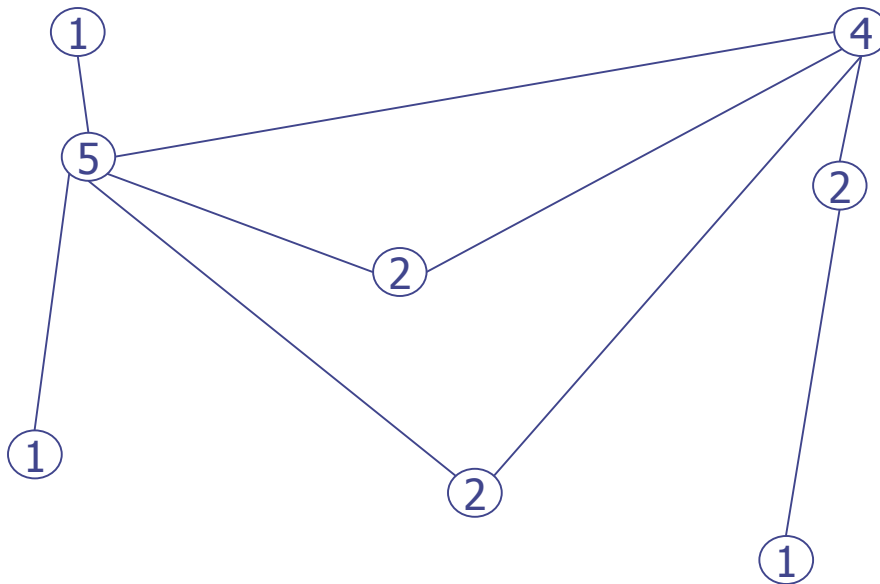
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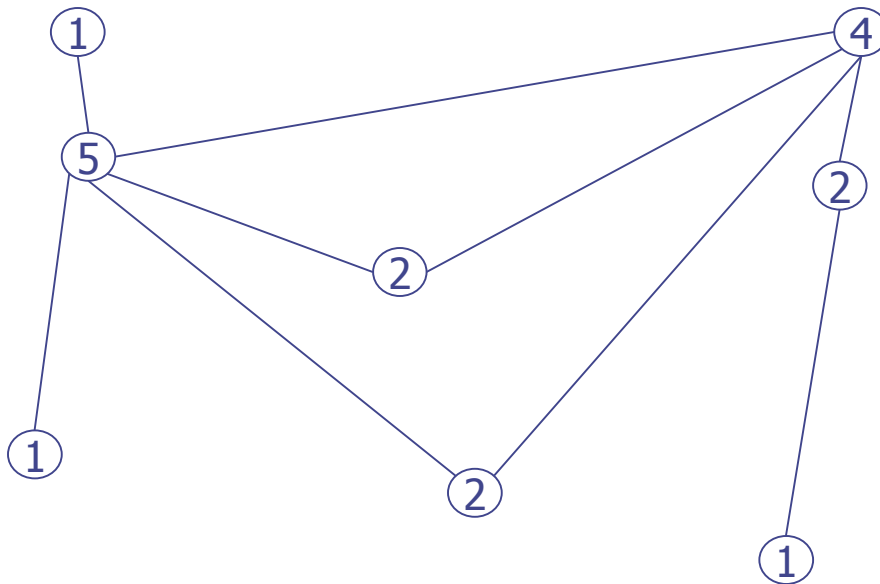
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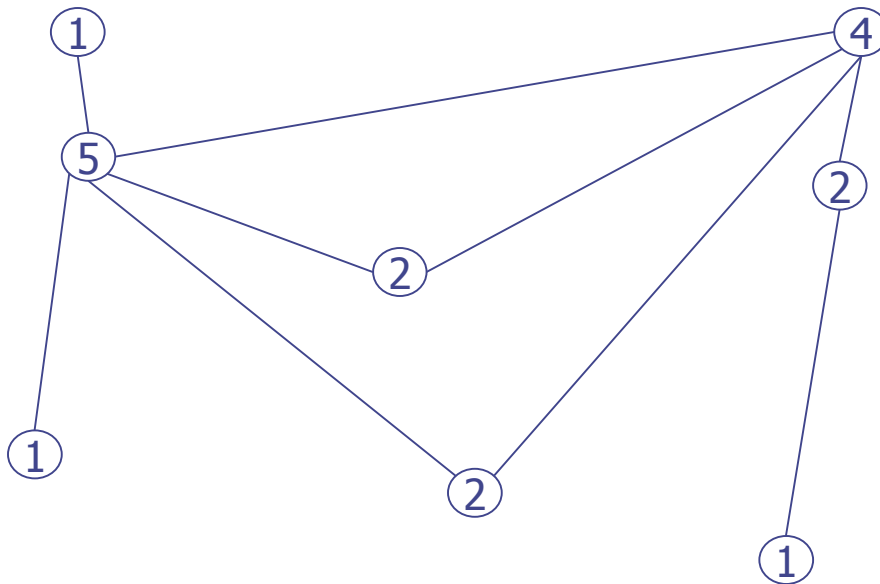


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Why?

One edge

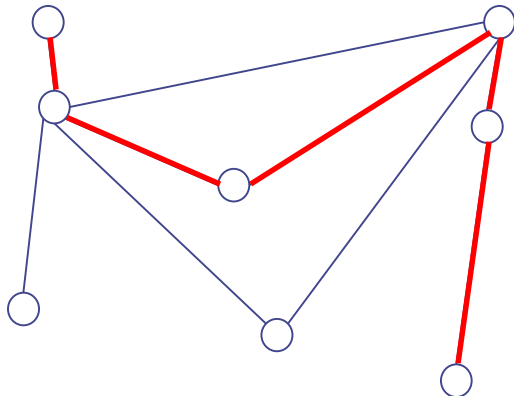


Two endpoints



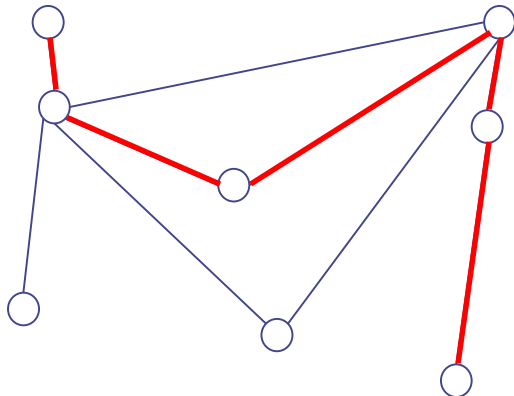
# Paths and connectedness:

- ◆ A path (of length  $k$ ) in a graph  $G=(V,E)$  is a sequence of vertices  $(v_0, v_1, \dots, v_k)$  such that each  $\{v_i, v_{i+1}\} \in E$ . (We say that  $v_k$  is *reachable* from  $v_0$ .)



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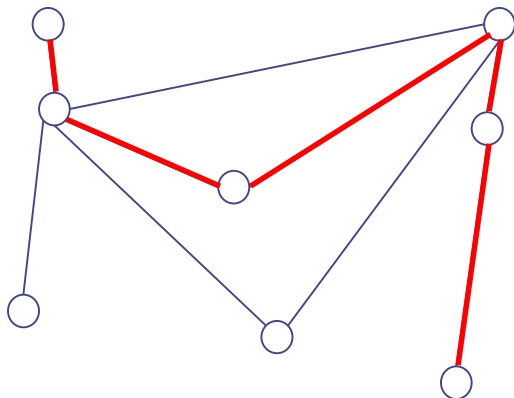
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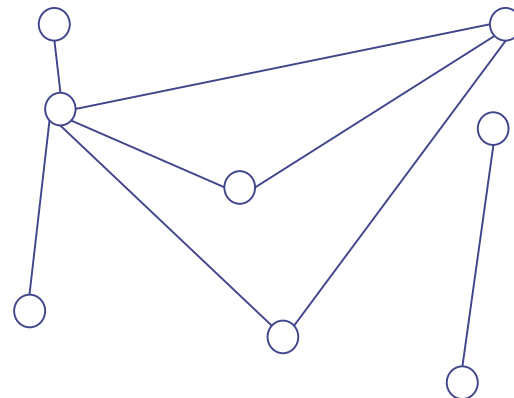
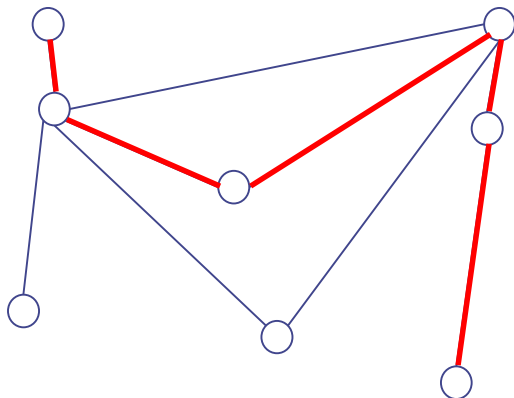
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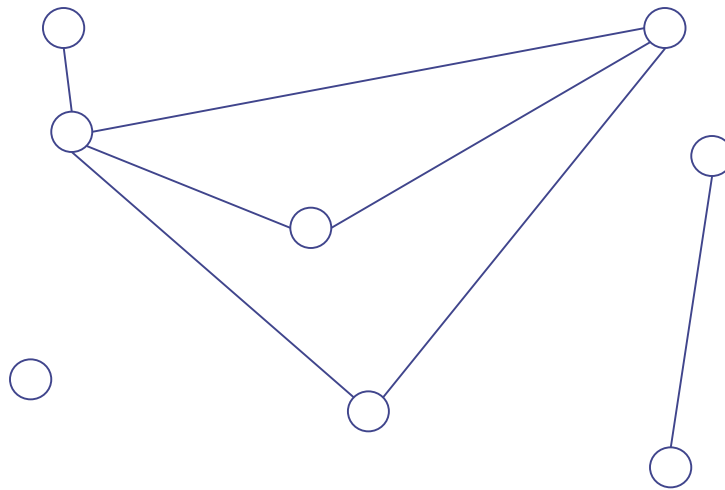
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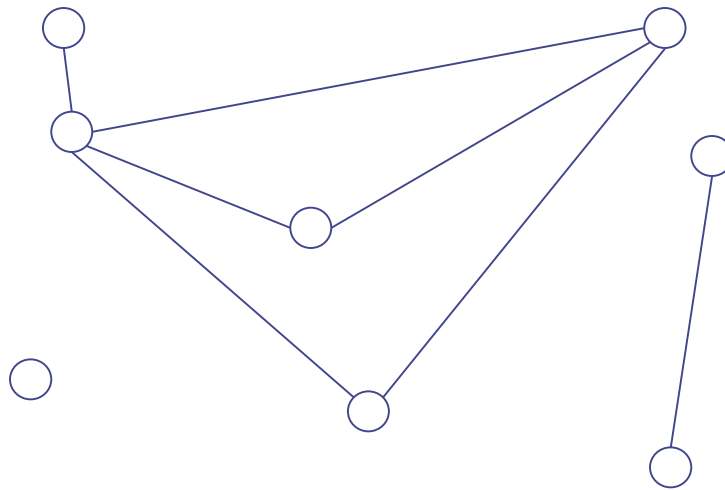
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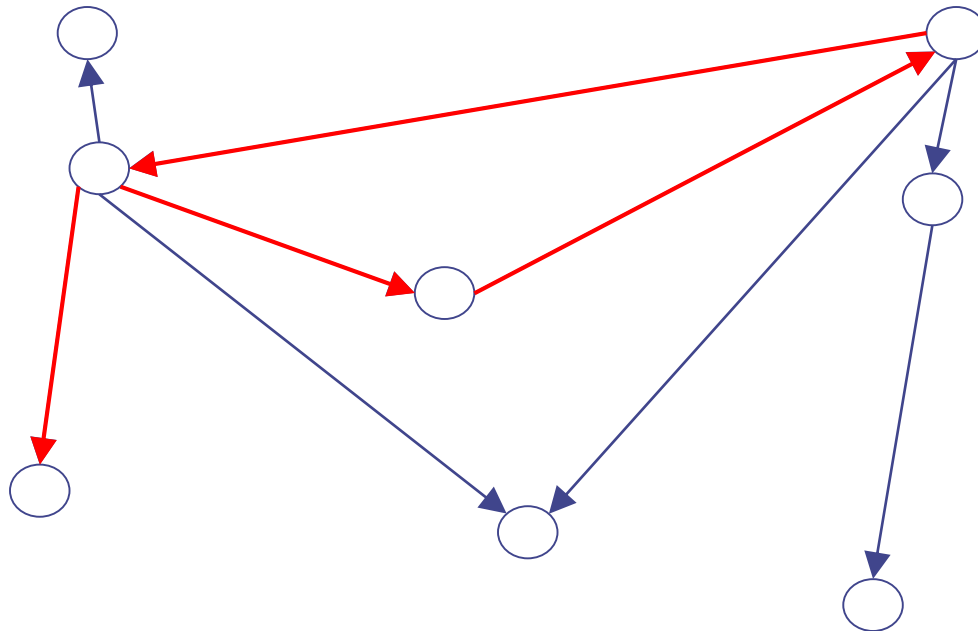
- ◆ Every graph can be viewed as a collection of connected components:



- ◆ Vertices  $u$  and  $v$  are in the same component if, and only if, there is a path from  $u$  to  $v$ .

# Paths in directed graphs:

- ◆ A path (of length  $k$ ) in a directed graph  $G=(V,E)$  is a sequence of vertices  $(v_0, v_1, \dots, v_k)$  such that each  $(v_i, v_{i+1}) \in E$ .
- ◆ Note: all edges point “forwards”



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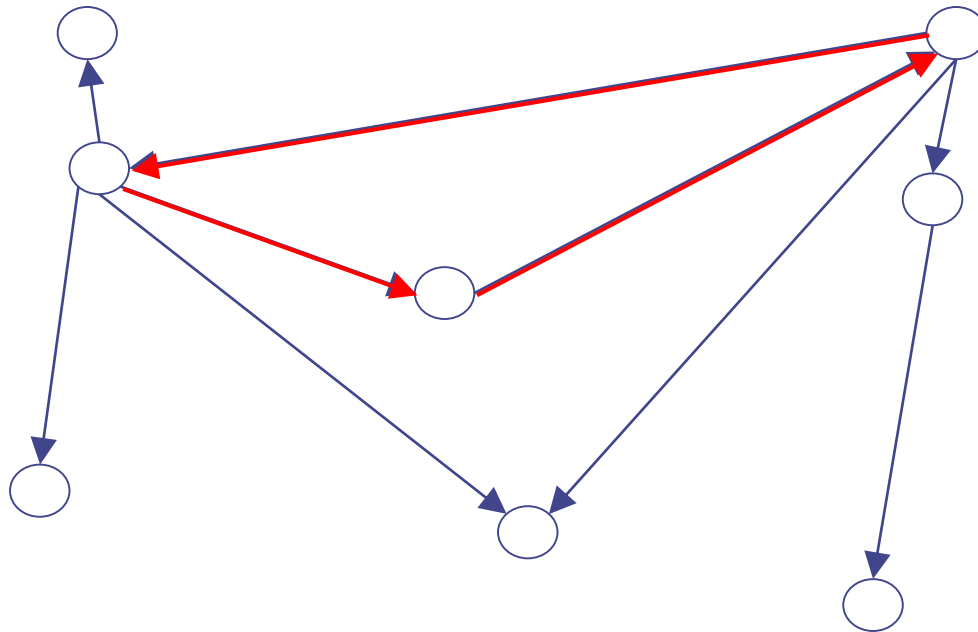


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- ◆ What about strong connectivity and undirected graphs?

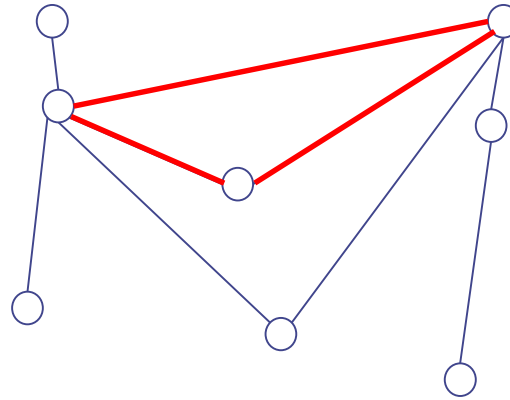
# Strongly connected components:

- ❖ We can break up a directed graph into its strongly connected components.
- ❖ Vertices  $u$  and  $v$  are in the same component if, and only if, there is a path from  $u$  to  $v$ .



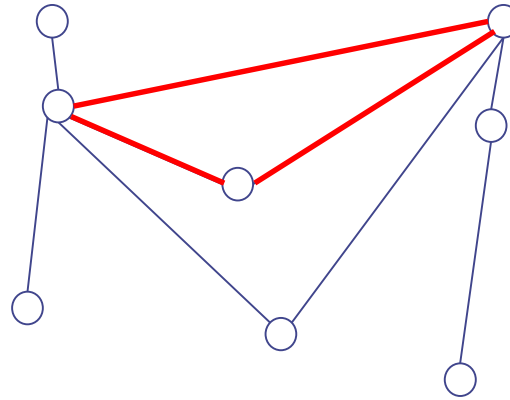
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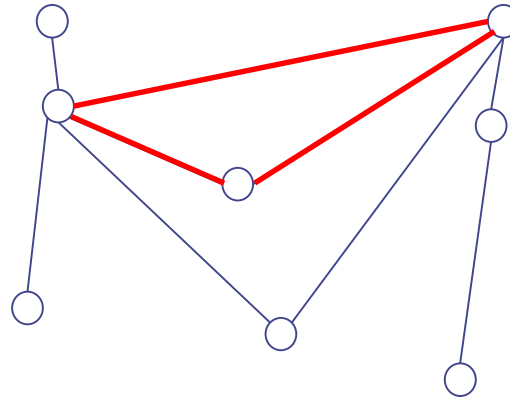
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- ◆ A cycle is simple if all of the vertices, except the first and last, are distinct.

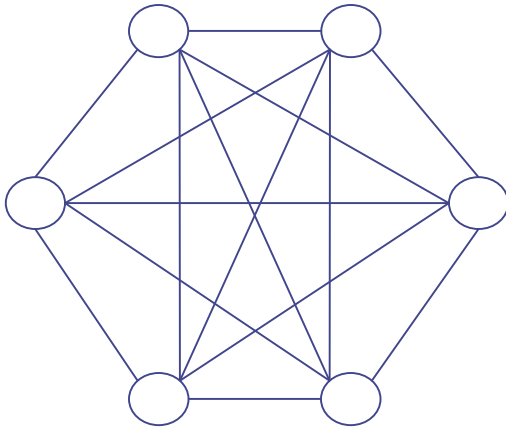
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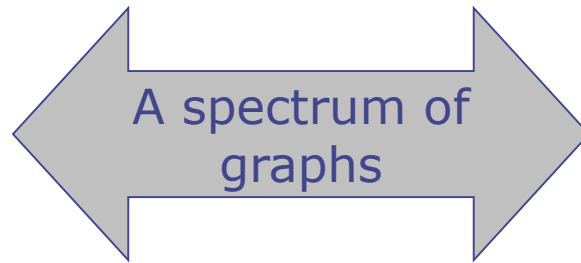


- ◆ A cycle is simple if all of the vertices, except the first and last, are distinct.
- ◆ A graph is acyclic if it does not contain cycles.

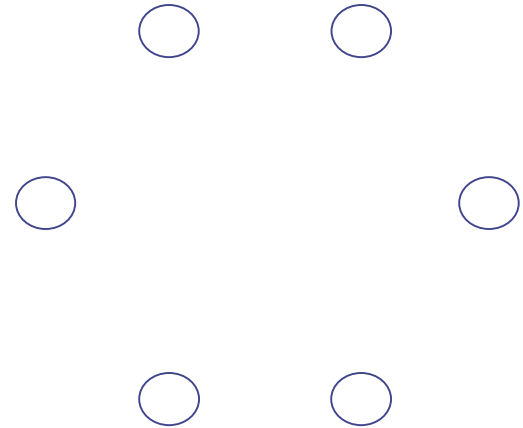
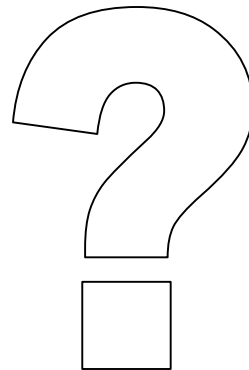
## From connected to cyclic



**A complete graph:**  
as connected and as  
cyclic as can be!



What lies  
in between



**A discrete graph:**  
as disconnected and  
as acyclic as can be!

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◆ These follow from: there is a *unique* simple path between any given pair of vertices in a tree:

- A tree is connected, so there is at least one such path.
- If there are two different paths from some  $u$  to  $v$ , then we can join them together to make a cycle; but this is impossible because trees are acyclic.

# Trees and Graphs

## ◆ Are trees graphs?

- Always?
- Sometimes?
- Never?

## ◆ Are graphs trees?

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# Trees and Graphs

- ◆ All trees are graphs.
- ◆ Some graphs are trees, some graphs are not trees.
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- ◆ What makes a graph a tree?

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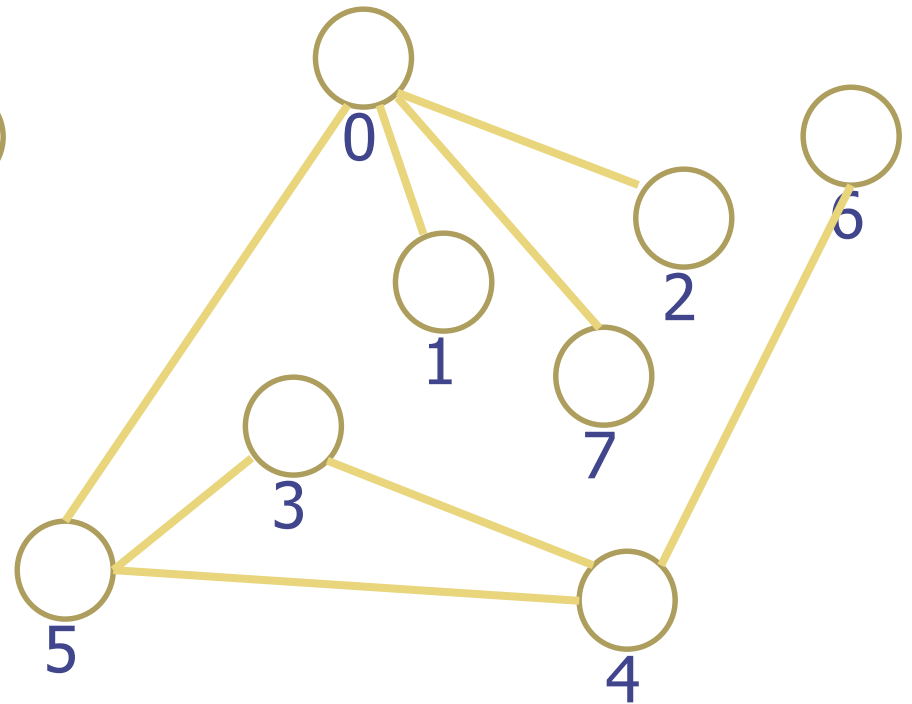
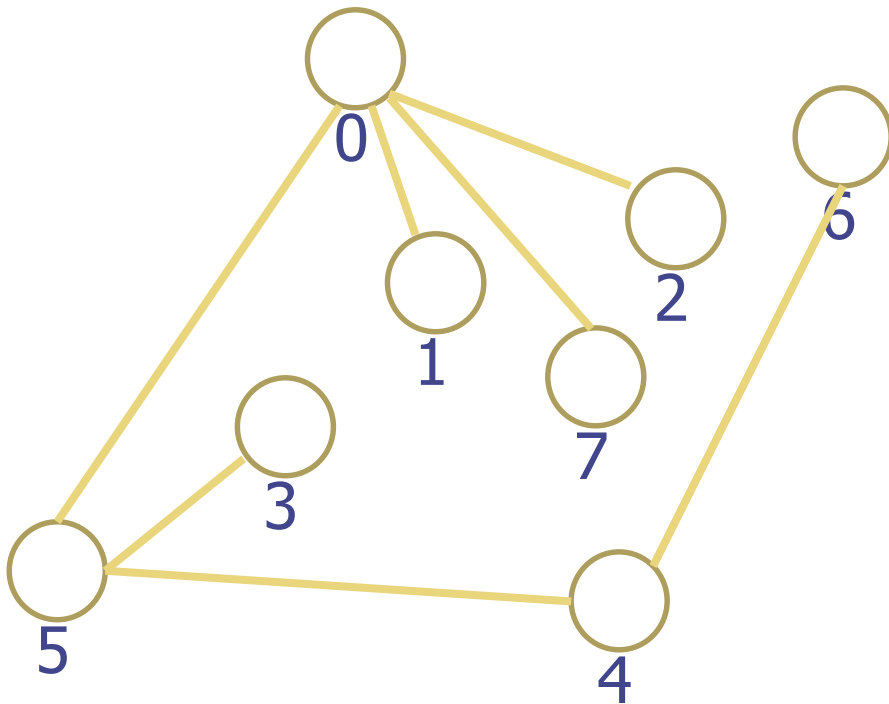
# Trees and Graphs

- ◆ A tree is a graph such that any two nodes (vertices) are connected by precisely one path.
  - If you can find two nodes that are **not** connected by any path, then the graph is not a tree.
  - If you can find two nodes that are connected to each other by more than one path, then the graph is **not** a tree.



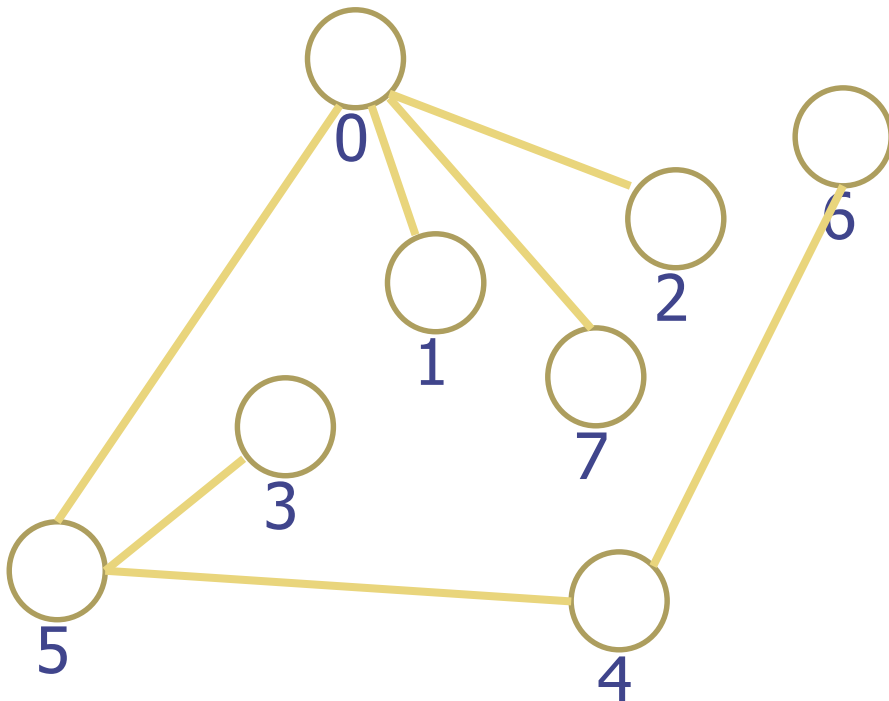
# Example

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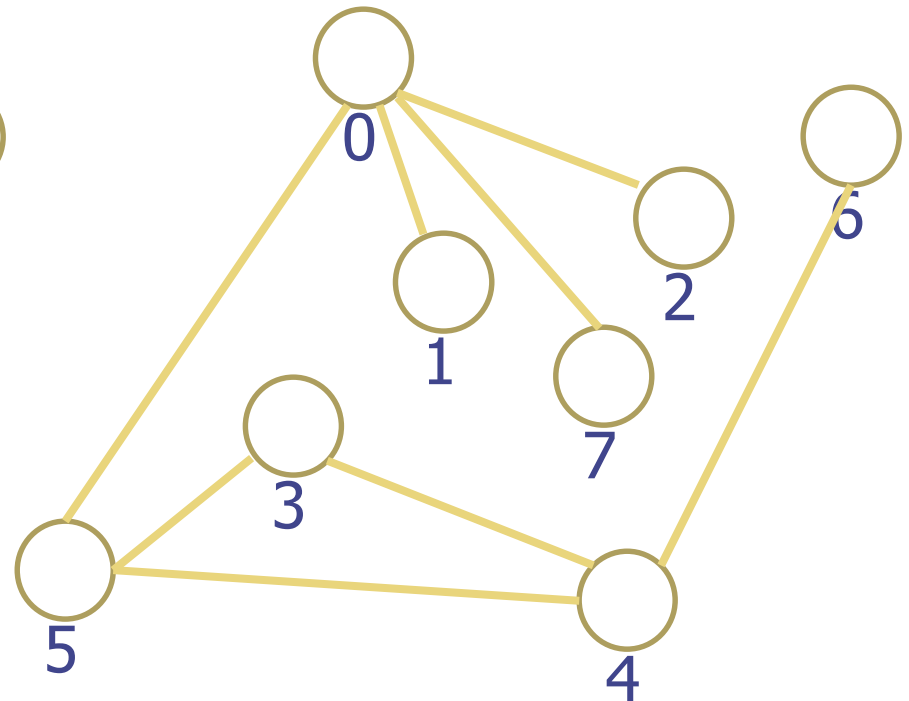


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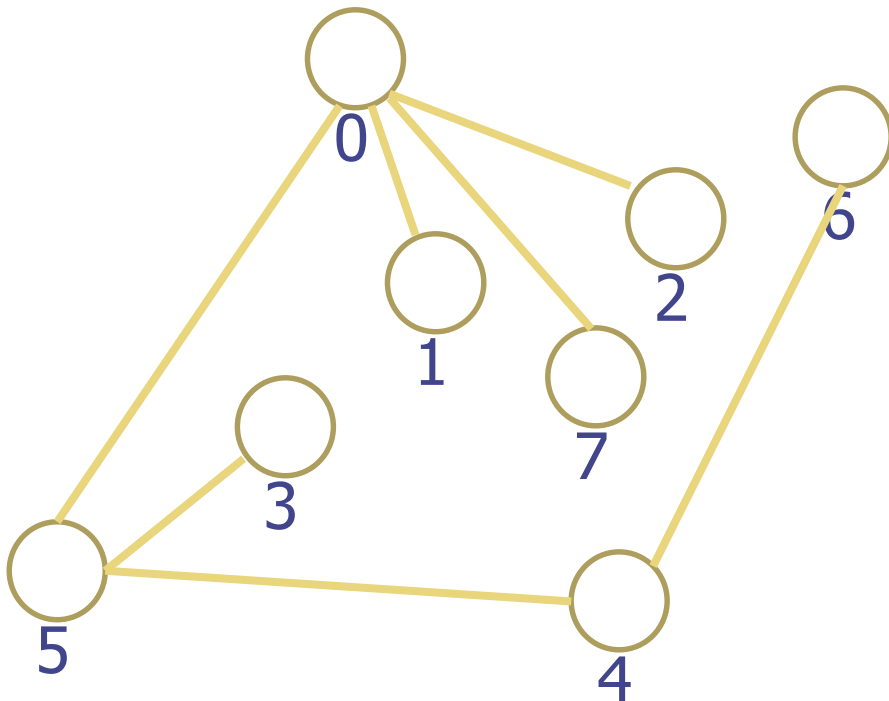


Yes, this is a tree. Any two vertices are connected by exactly one path.

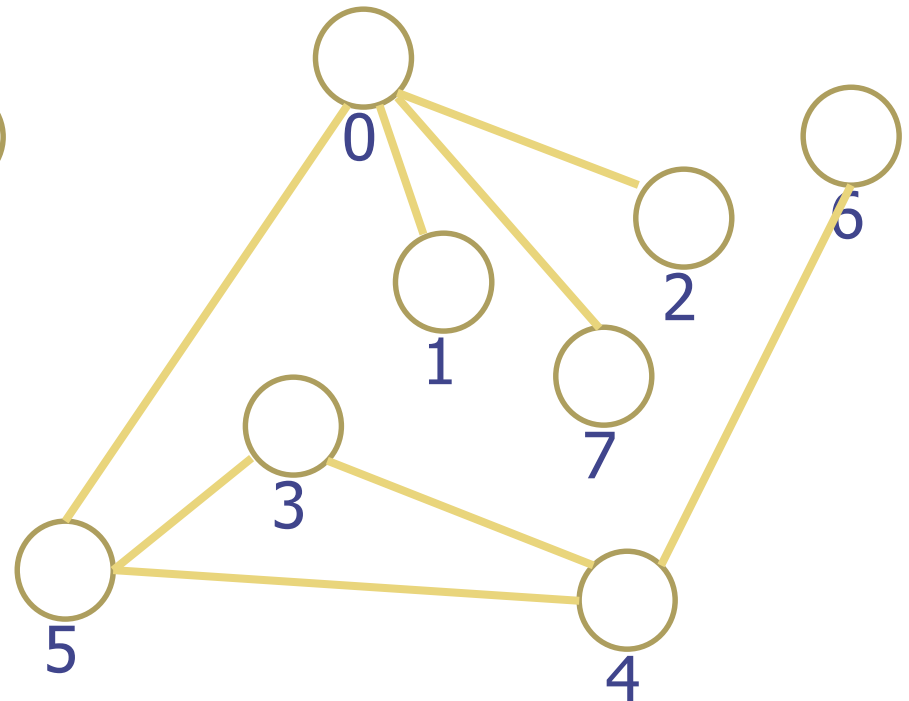


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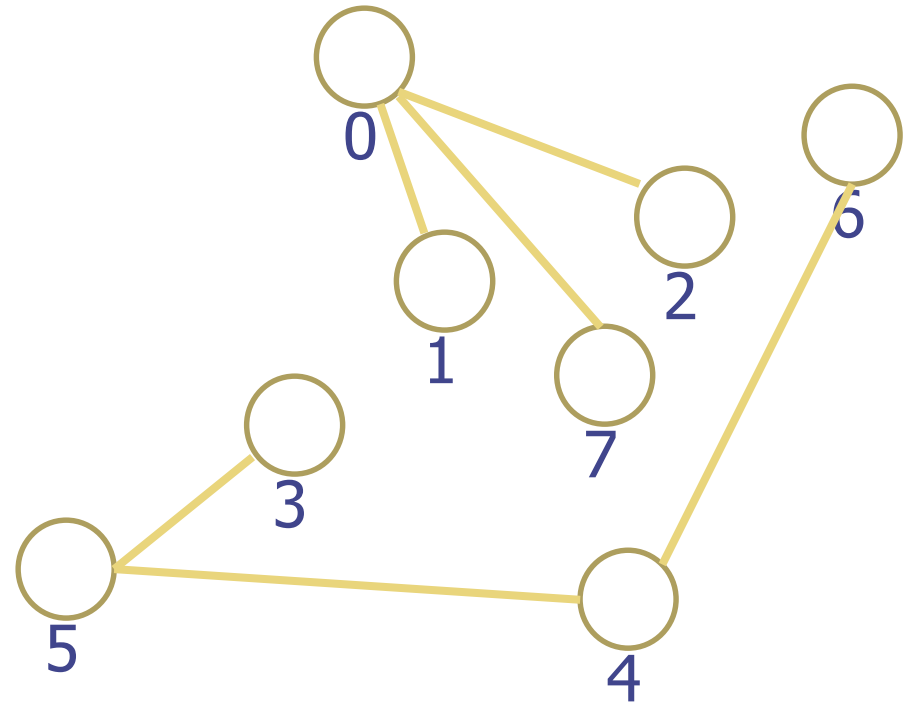
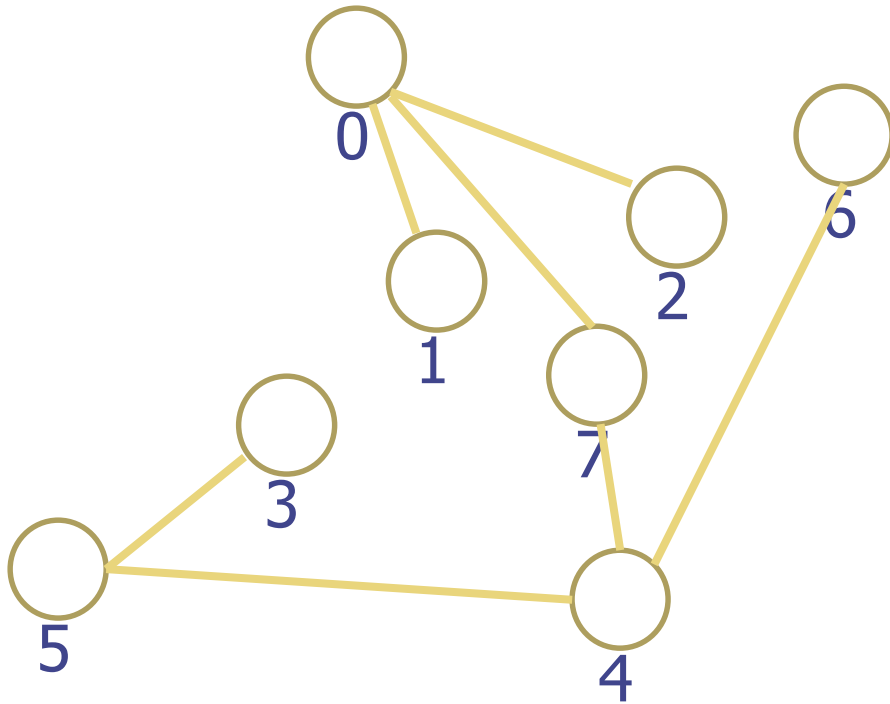
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No, this is not a tree. For example, there are two paths connecting node 5 to node 4.

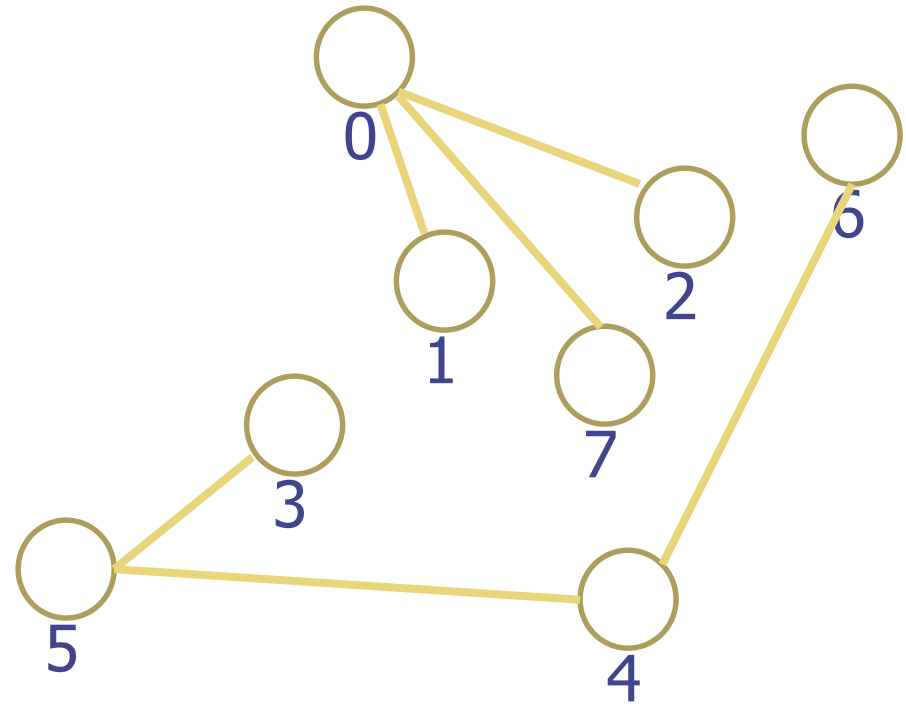
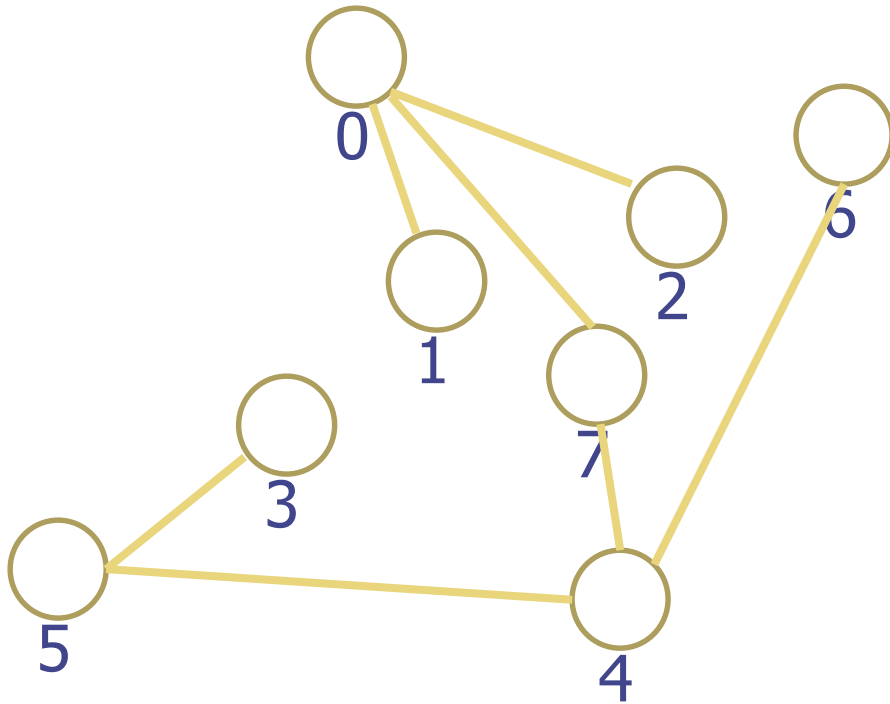
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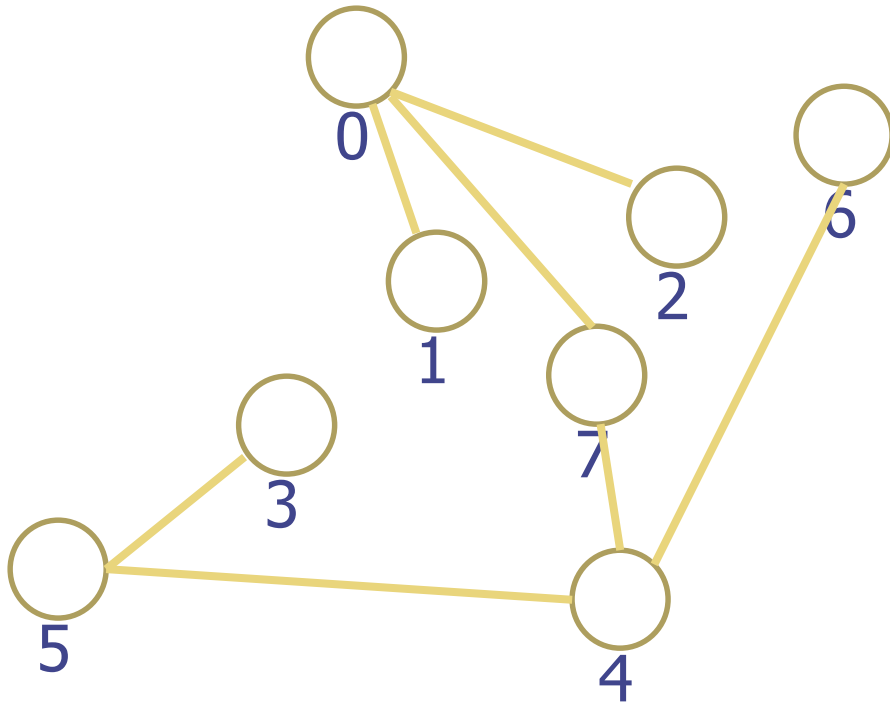
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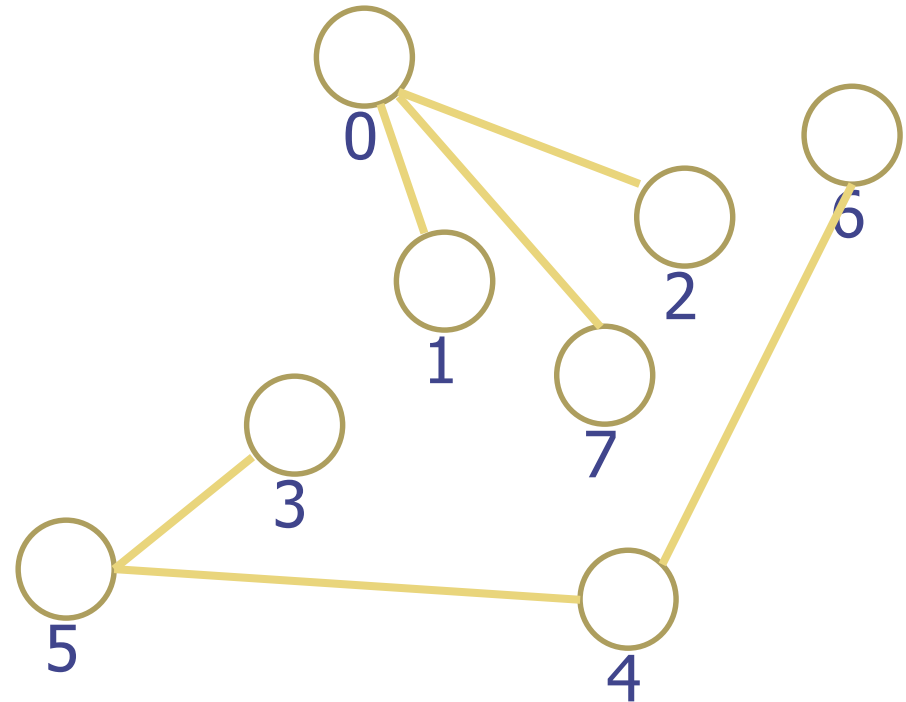
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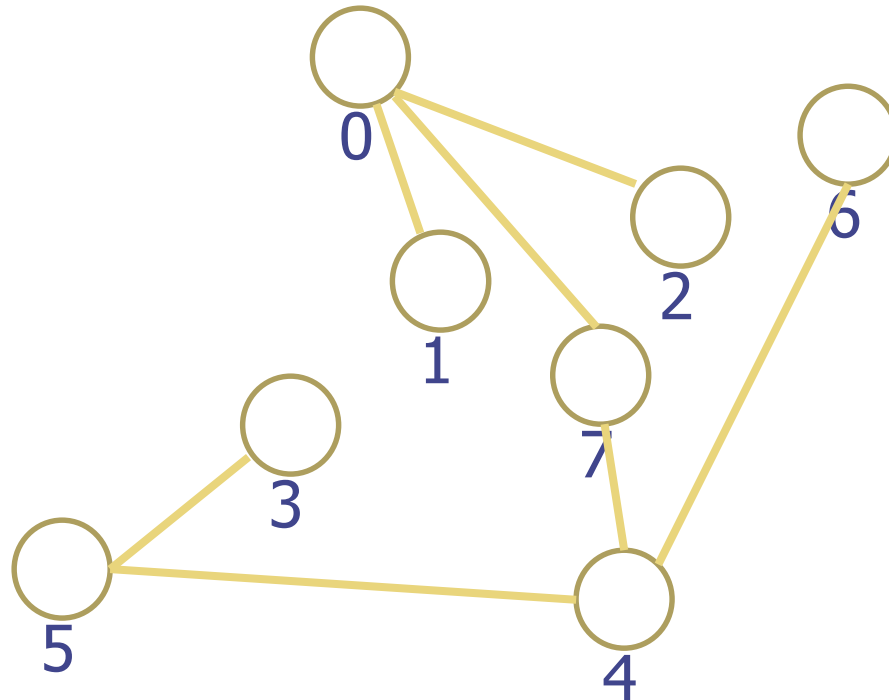
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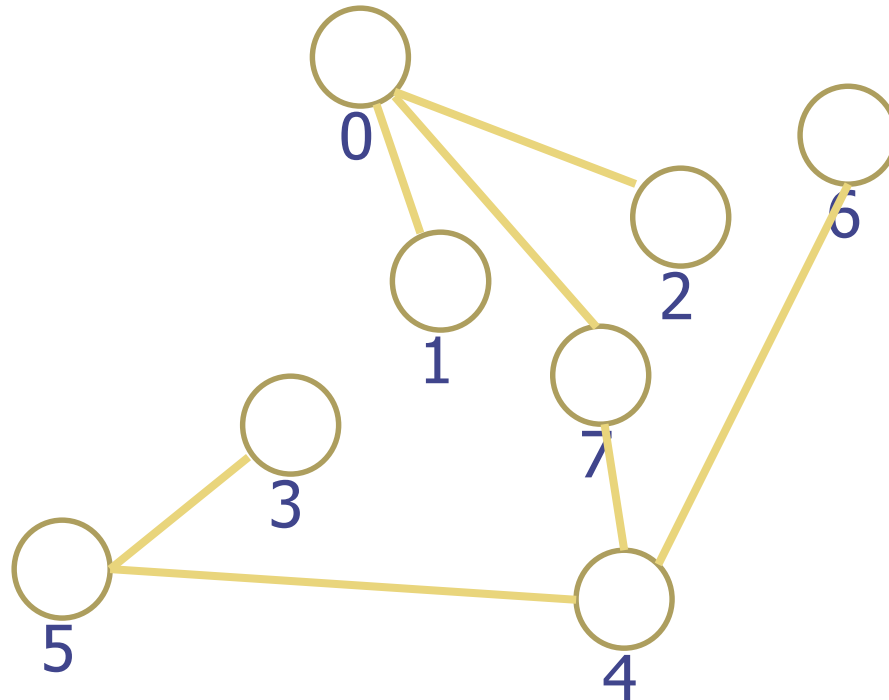
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- ◆ Given a tree, ANY node can be the root.





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- ◆ If a graph is acyclic, then all of its connected components will be trees.
- ◆ For this reason, acyclic graphs are sometimes described as forests.

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- ◆ A commonly used data structure:
- ◆ DAG = directed, acyclic graph.
- ◆ Like a tree, except that:
  - There can be multiple connected components, and multiple “entry points” to each;
  - subtrees can be shared.

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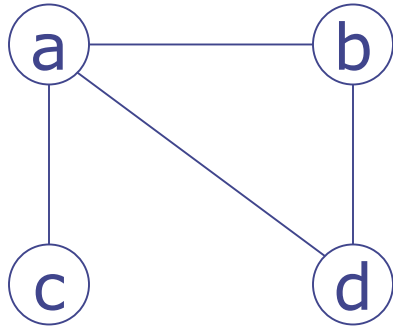


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- ◆ **Adjacency list:** for each vertex  $v$ , we store a linked list of the vertices  $u$  that it connects to by a single edge.
- ◆ Choosing between these can have an impact on the complexity of some graph algorithms.

# Adjacency matrix representation:

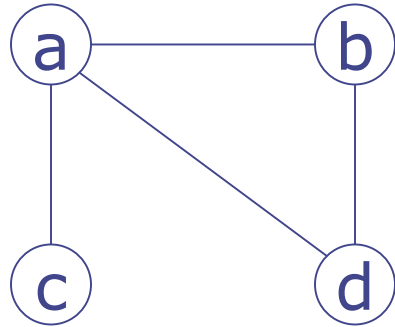
◆ A simple example:



$$\begin{pmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \\ 1 & 1 & 0 & 0 \end{pmatrix}$$

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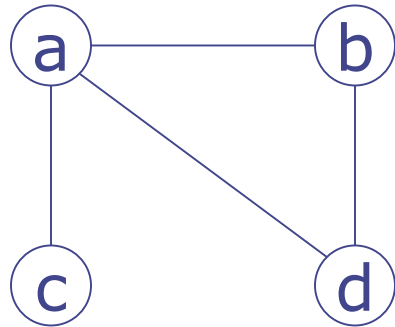


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◆ Uses  $\Theta(|V|^2)$  space, much of which will be wasted if the graph is sparse (i.e., relatively few edges).

# Adjacency matrix representation:

◆ A simple example:

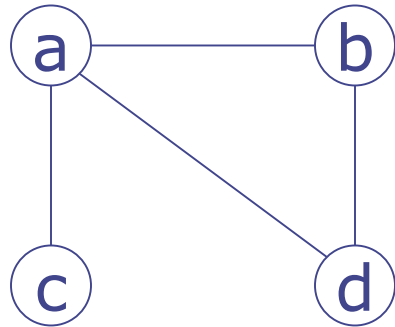


$$\begin{pmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \\ 1 & 1 & 0 & 0 \end{pmatrix}$$

- ◆ Uses  $\Theta(|V|^2)$  space, much of which will be wasted if the graph is sparse (i.e., relatively few edges).
- ◆ Easily adapted to store information about each edge in the entries of the matrix.

# Adjacency matrix representation:

◆ A simple example:

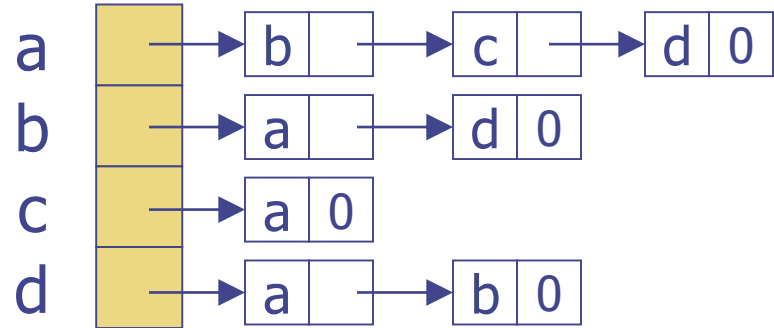
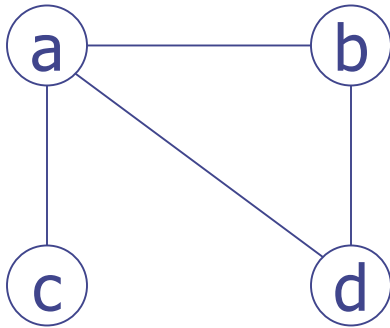


$$\begin{pmatrix} 0 & 1 & 1 & 1 \\ 1 & 0 & 0 & 1 \\ 1 & 0 & 0 & 0 \\ 1 & 1 & 0 & 0 \end{pmatrix}$$

- ◆ Uses  $\Theta(|V|^2)$  space, much of which will be wasted if the graph is sparse (i.e., relatively few edges).
- ◆ Easily adapted to store information about each edge in the entries of the matrix.
- ◆ Alternatively, if all we need is 0/1, then a single bit will do! (But we still need  $|V|^2$  of them ...)

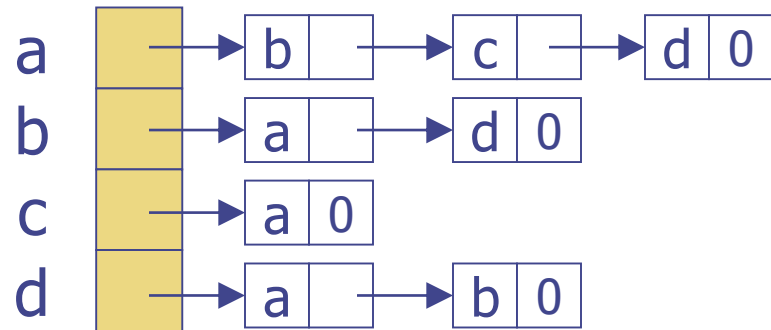
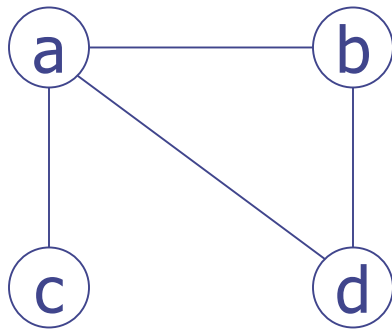
# Adjacency list representation

◆ A simple example:



# Adjacency list representation

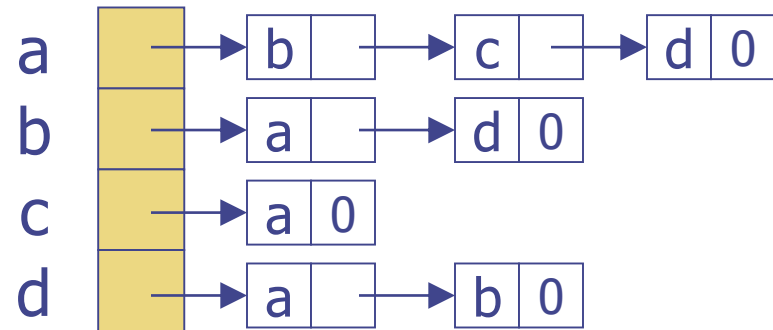
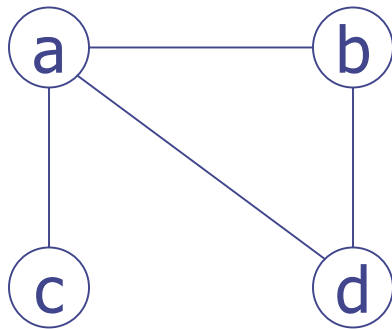
◆ A simple example:



◆ Uses  $\Theta(|V| + |E|)$  space, good for sparse graphs, more expensive for dense case (i.e., many edges).

# Adjacency list representation

◆ A simple example:

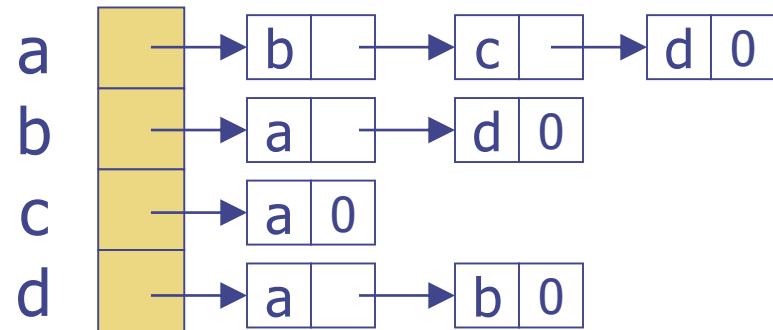
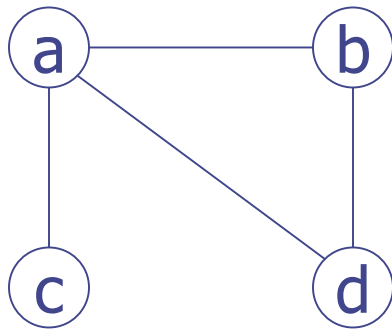


- ◆ Uses  $\Theta(|V| + |E|)$  space, good for sparse graphs, more expensive for dense case (i.e., many edges).
- ◆ Easily adapted to store information about each edge in each part of the linked lists.



# Adjacency list representation

◆ A simple example:



- ◆ Uses  $\Theta(|V| + |E|)$  space, good for sparse graphs, more expensive for dense case (i.e., many edges).
- ◆ Easily adapted to store information about each edge in each part of the linked lists.
- ◆ Testing to see if there is an edge  $(u,v)$  is not  $\Theta(1)$ ; we must search the adjacency list of  $u$  for  $v$ .