

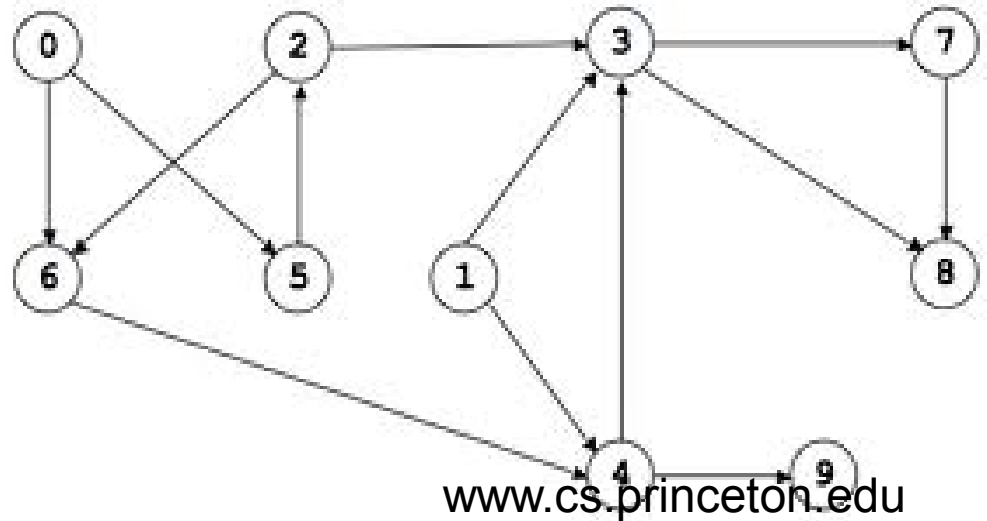
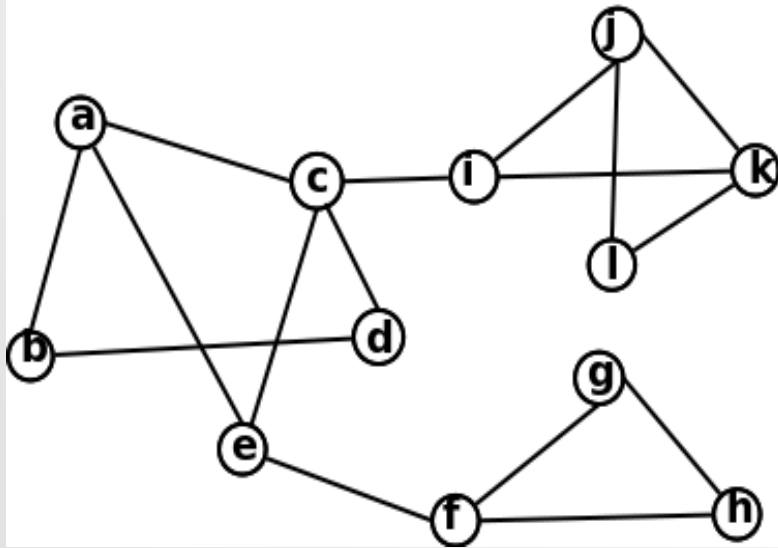
# CSE 230: Data Structures

## Lecture 10: Graphs

Dr. Vidhya Balasubramanian

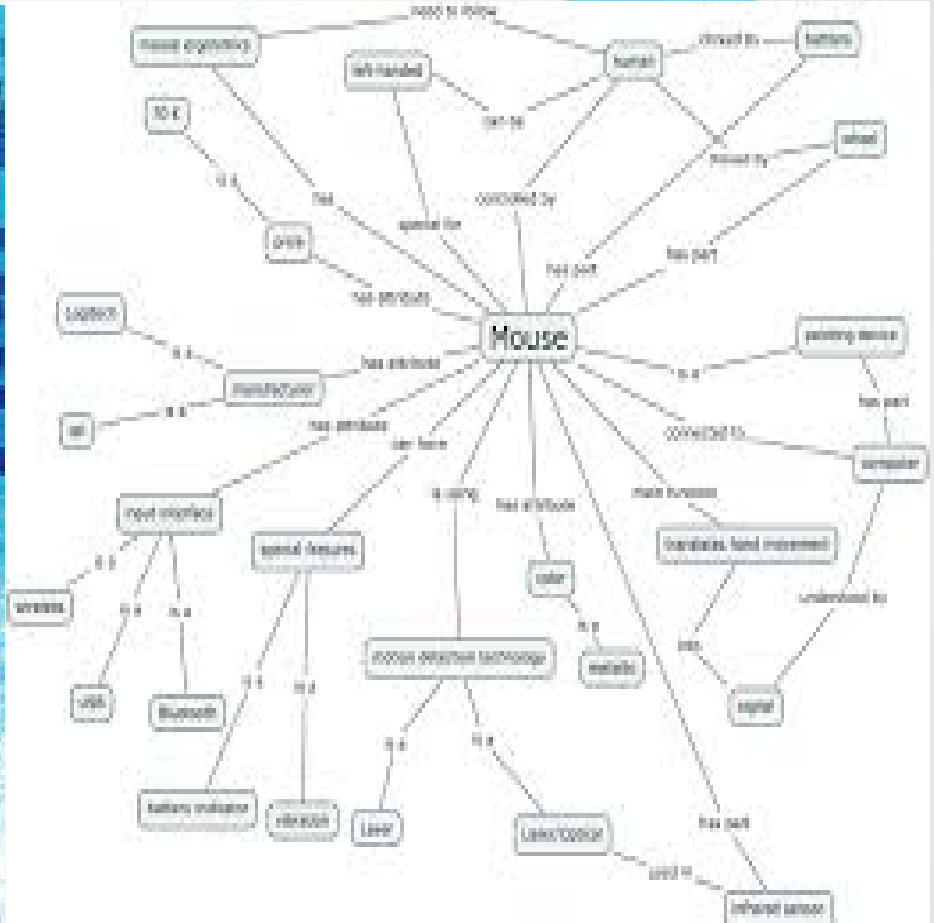
# Graphs

- A graph  $G = (V, E)$  is a set of vertices  $V$ , and a collection of edges  $E$  which is a subset of  $V \times V$
- A way of representing connections between pairs of objects from some set  $V$ 
  - Edges can be either directed or undirected



[www.cs.princeton.edu](http://www.cs.princeton.edu)

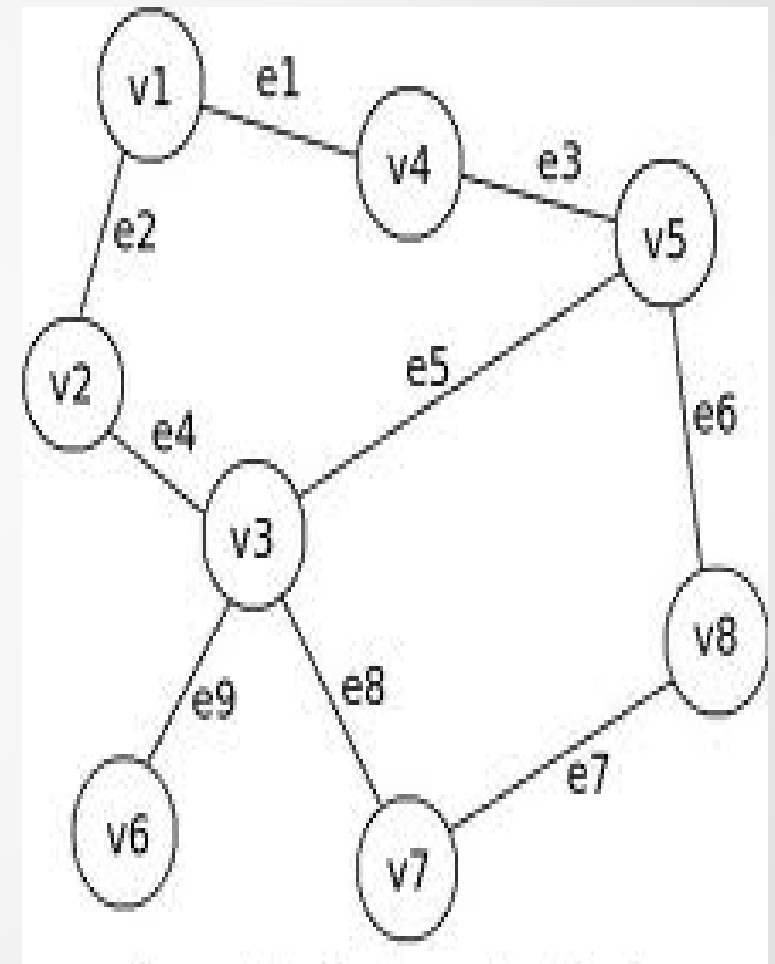
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<http://t1065550.files.wordpress.com/2012/02/mouse.jpg>

# Definitions

- End vertices are end points of edges
  - v1 and v2 end vertices of e2
- Edges incident on a vertex
  - e9 incident on v6
- Adjacent vertices (end pts of an edge)
  - v1, v2 adjacent
- Degree of vertex is number of edges incident on it
- Parallel edges connect same set of vertices
- Self loop, edge connecting same vertex



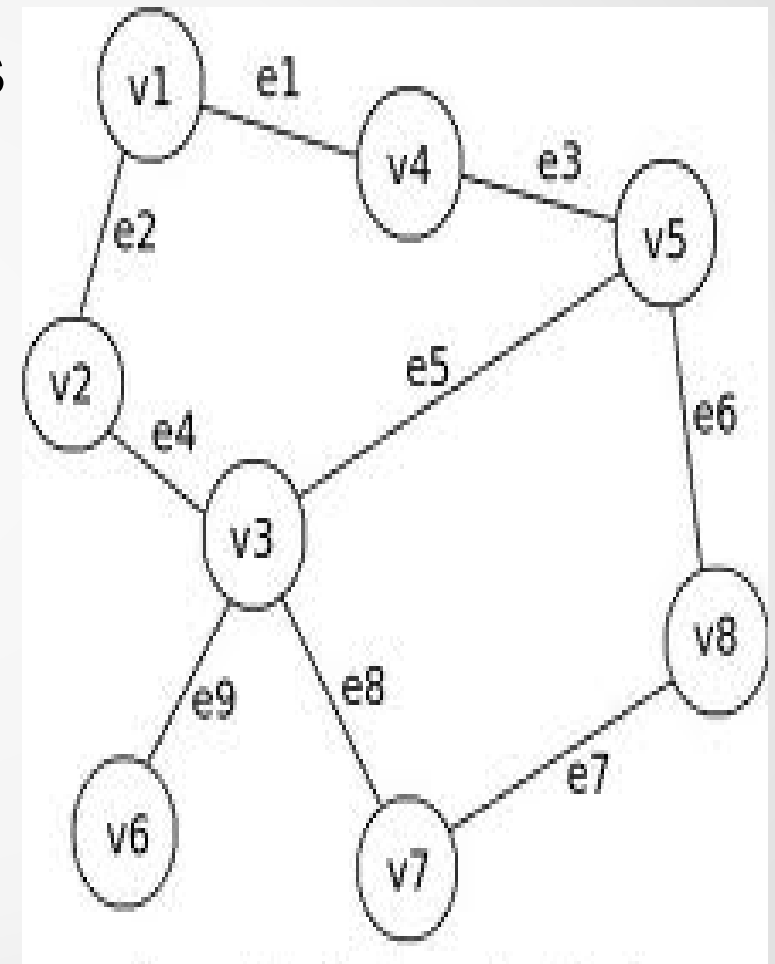
# Definitions

- Path

- Sequence of alternating vertices and edges
- Eg:  $P1=(v1,v2,v3,v6)$
- Simple path
  - Vertices and edges are distinct
    - e.g  $P1$
  - $v1,v2,v3,v7,v3,v6$ , not simple

- Cycle

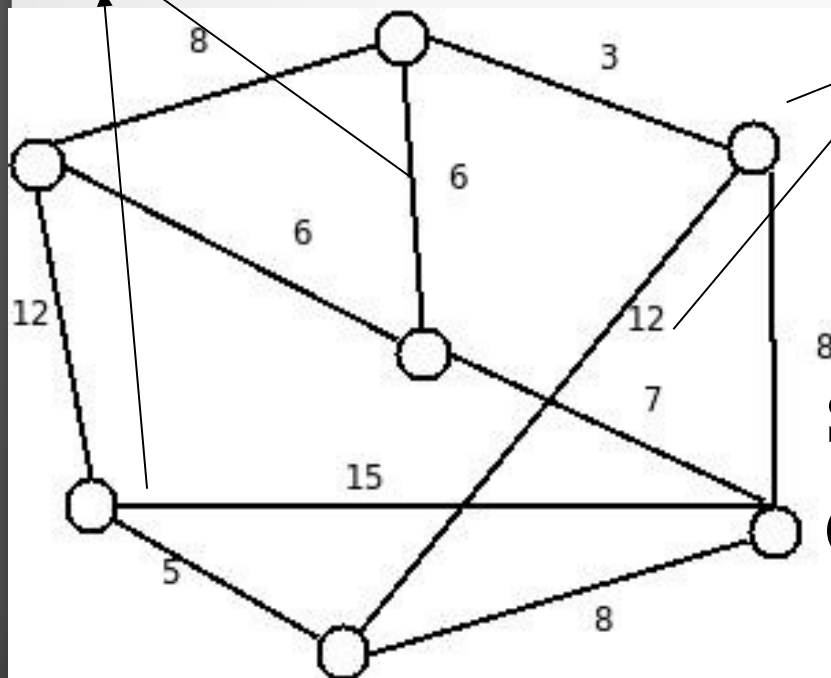
- Path that ends at start node
- $v2,v1,v4,v5,v3,v2$



# Definitions

- Independent edges: don't have common vertices
- Complete graph: Every node adjacent to each other
- Simple Graph: Has no loops or parallel edges

Independent edges



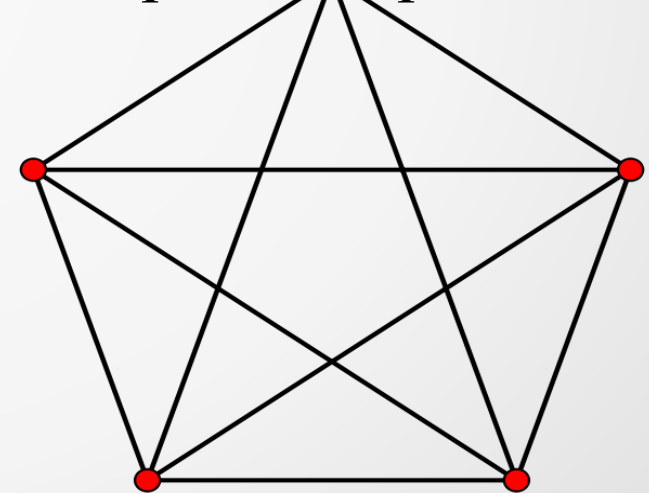
adjacent

Simple Graph

(no loops, parallel edges)

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Complete Graph

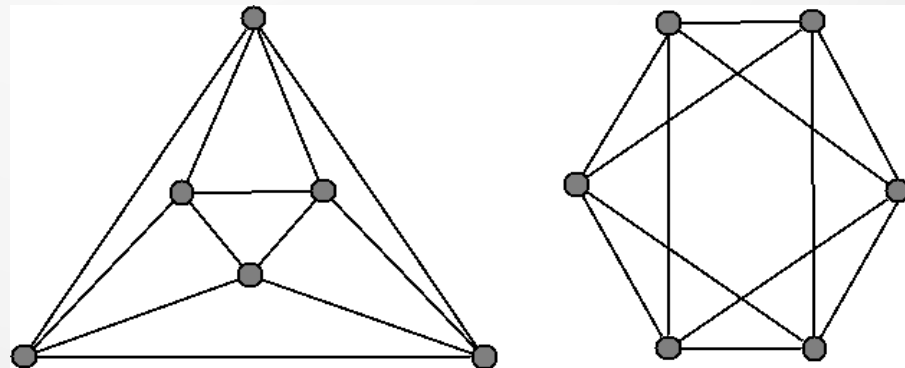


# Definitions contd

- Degree: Number of edges incident at a vertex
  - Min degree of  $G \rightarrow \delta(G) = \min \{d(v) \mid v \in V\}$
- Total degree of  $G$  is  $2m$  (number of edges)
- Number of vertices of odd degree is always even in a graph
- In an undirected simple graph
  - $m \leq n(n-1)/2$ , where  $n$  is number of vertices
- Proof: each vertex has degree at most  $(n-1)$

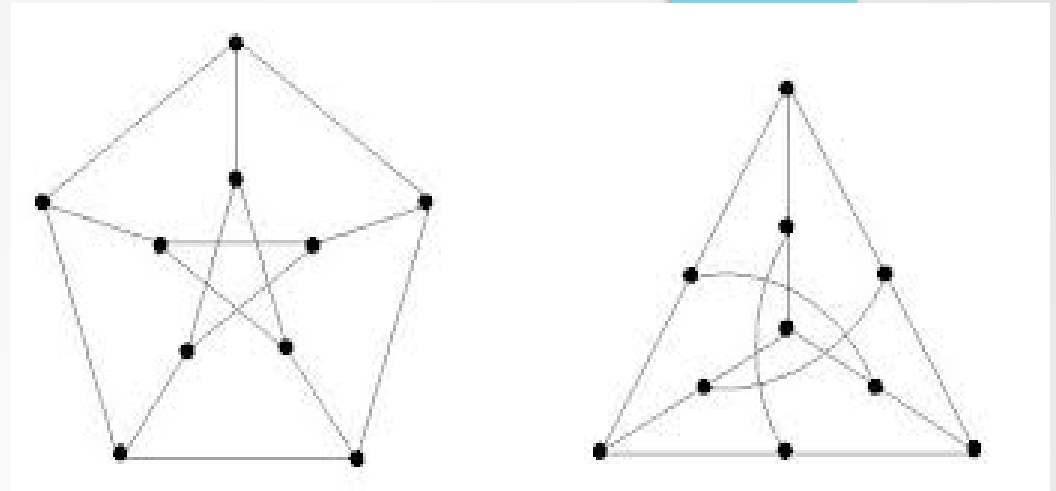
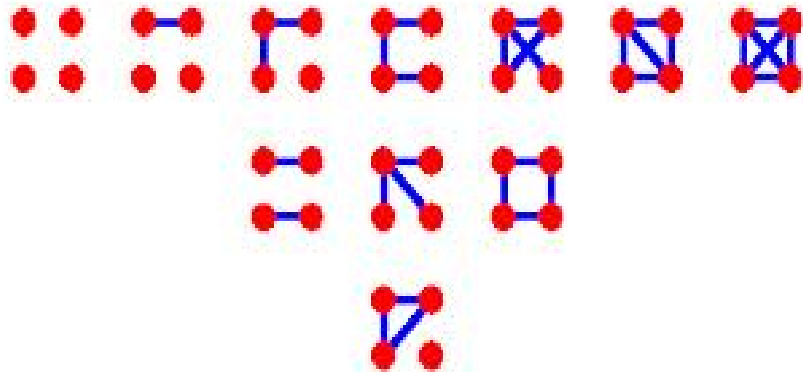
# Definitions contd

- Planar Graphs: Graph whose edges intersect only at their end
- Graph Isomorphism
  - Two graphs  $G$  and  $H$  are isomorphic if
    - They have same number of vertices
    - A pair of nodes are adjacent in  $G$  iff a corresponding pair exists in  $H$



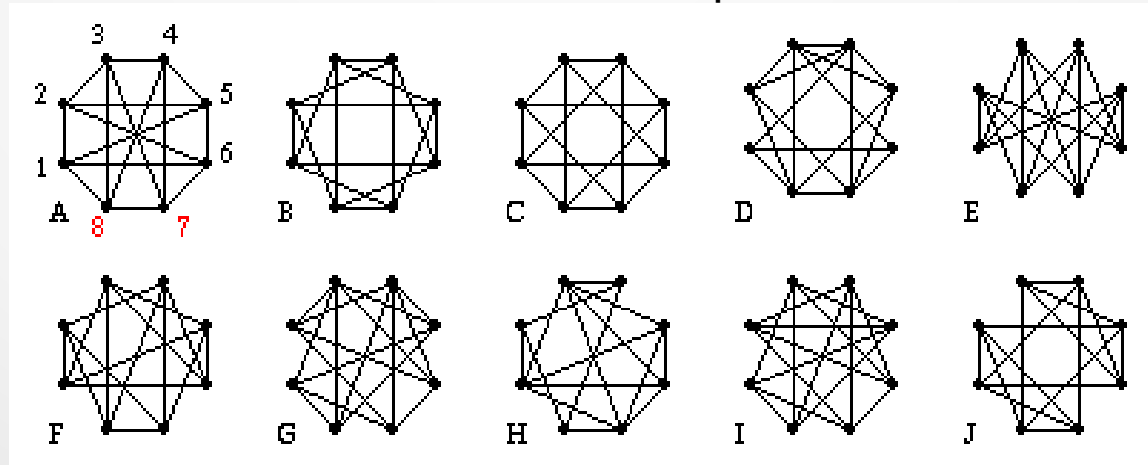


# Example: Isomorphism



<http://upload.wikimedia.org/>

<http://www.sonoma.edu/>



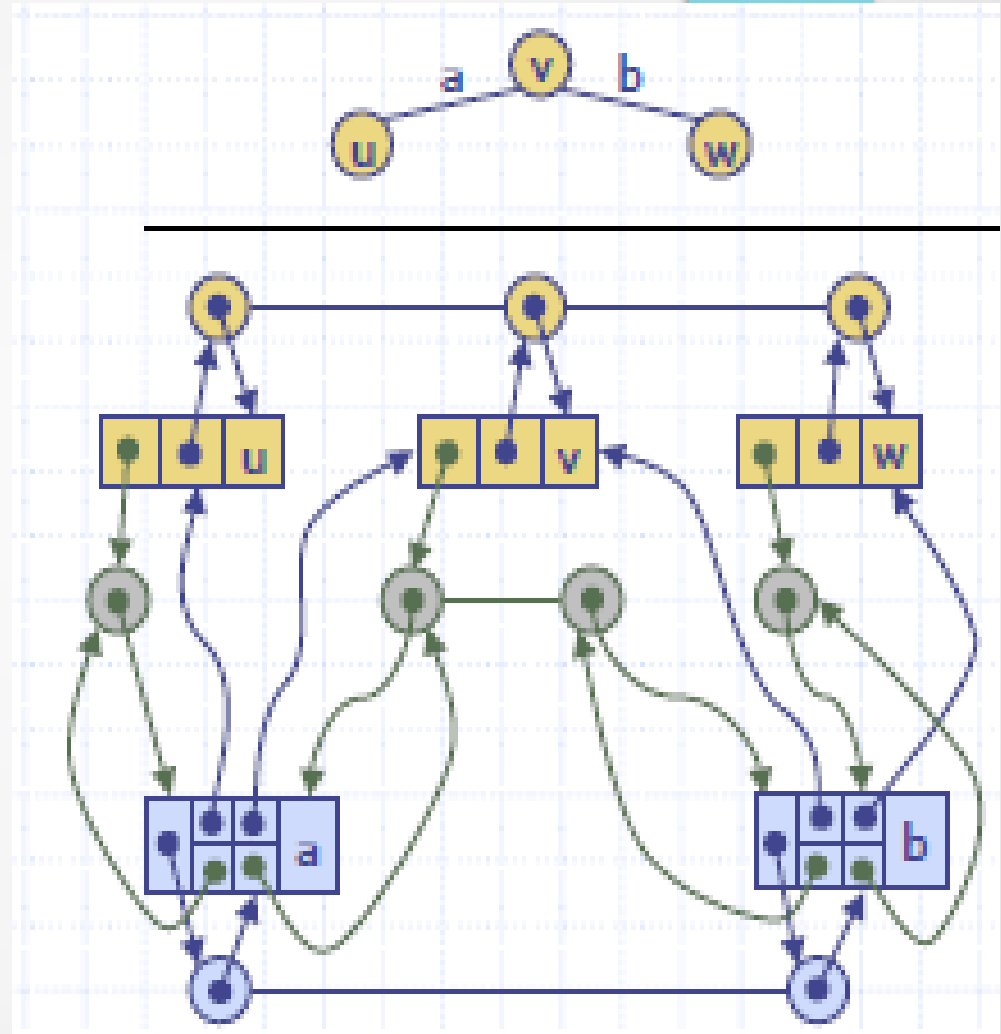
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# Graph ADT

- Accessor methods
  - isVertex()
  - incidentEdges(v)
  - endVertices(e)
  - isDirected(e)
  - origin(e)
  - destination(e)
  - opposite(v, e)
  - areAdjacent(v, w)
- Update methods
  - insertVertex(x)
  - insertEdge(v, w, x)
  - insertDirectedEdge(v, w, x)
  - removeVertex(v)
  - removeEdge(e)
- Generic methods
  - numVertices()
  - numEdges()
  - vertices()
  - edges()

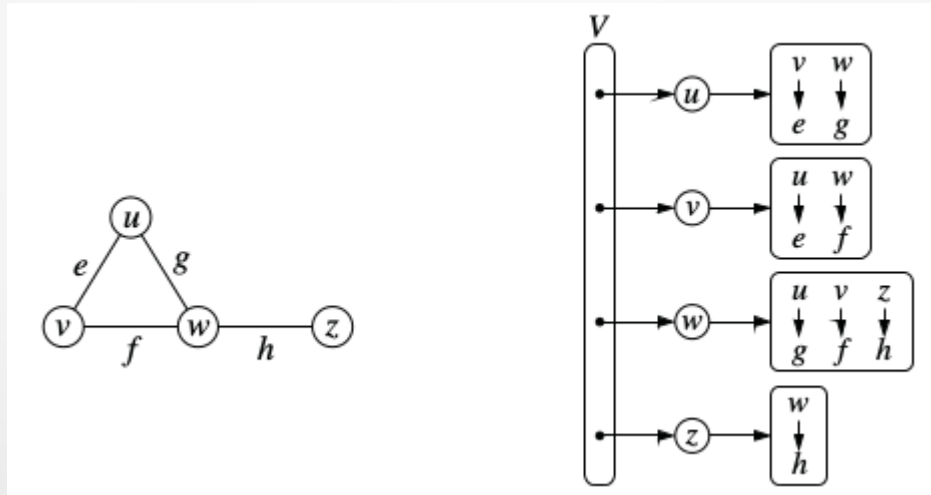
# Graph Representations

- Adjacency list
  - Each vertex has incidence container
    - List of vertices incident on  $v$
  - Edge list
- Augmented edge objects
  - references to associated positions in incidence sequences of end vertices



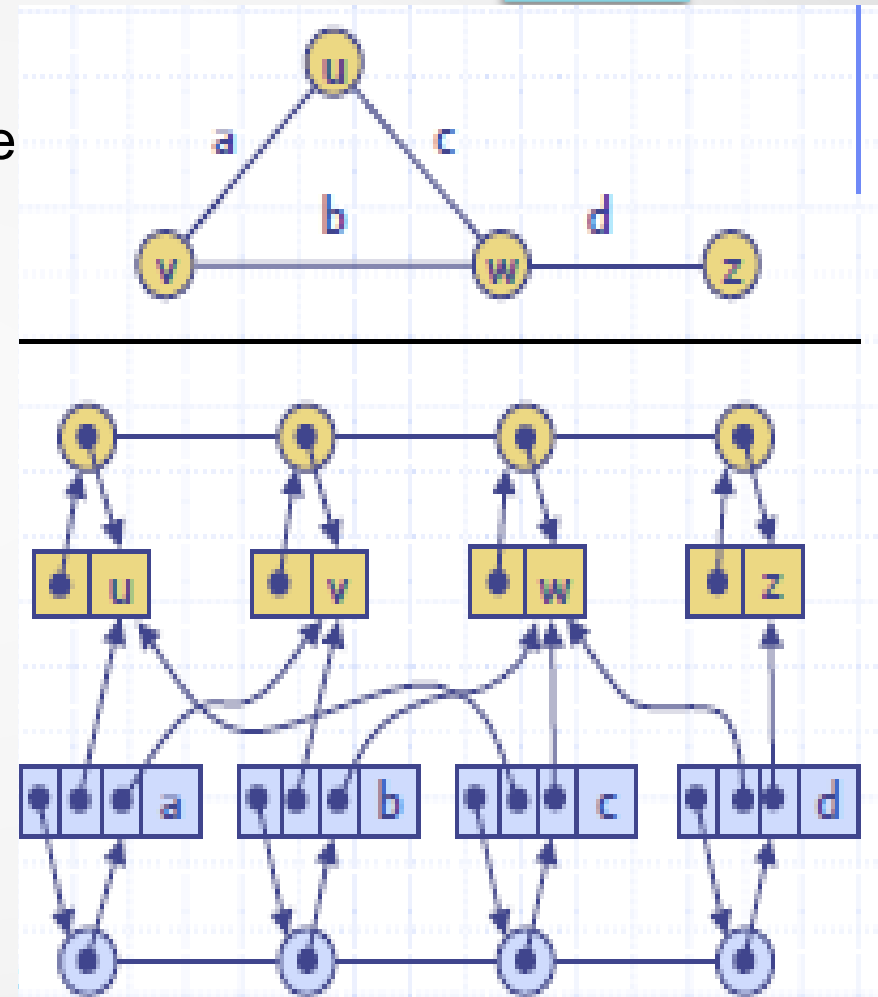
# Adjacency Map

- Similar to adjacency list
  - secondary container of all edges incident to a vertex is organized as a map, rather than as a list
  - adjacent vertex serves as a key to the edge
- Allows for fast access to a particular neighbor



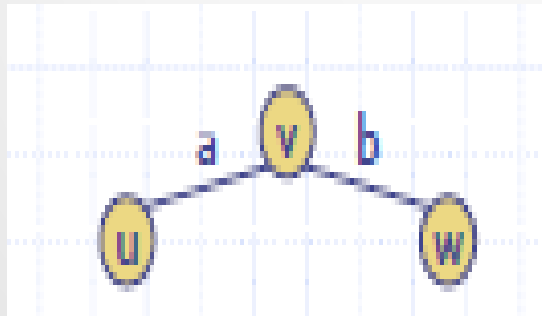
# Edge List Representation

- Vertex object
  - Element
  - reference to position in vertex sequence
- Edge object
  - element
  - origin vertex
  - destination vertex
  - reference to position in edge sequence
- Vertex sequence
  - Sequence of vertices in  $G$
- Edge sequence
  - Sequence of edge objects



# Adjacency Matrix

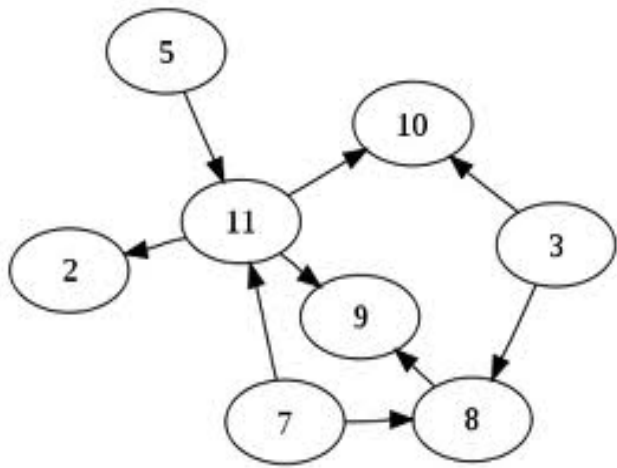
- Edge list
- 2D-array adjacency array  $A$  where
  - $A[i,j]$  is 1 if there is an edge between vertices  $i$  and  $j$
  - $A[i,j] = 0$ , if there is no edge incident on  $i$  and  $j$



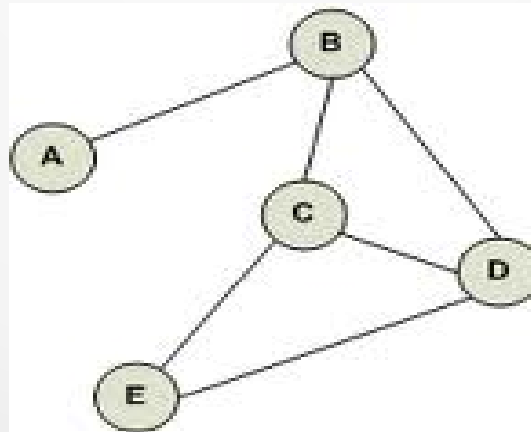
	<b>u</b>	<b>v</b>	<b>w</b>
<b>u</b>	<b>0</b>	<b>1</b>	<b>0</b>
<b>v</b>	<b>1</b>	<b>0</b>	<b>1</b>
<b>w</b>	<b>0</b>	<b>1</b>	<b>0</b>

# Exercises

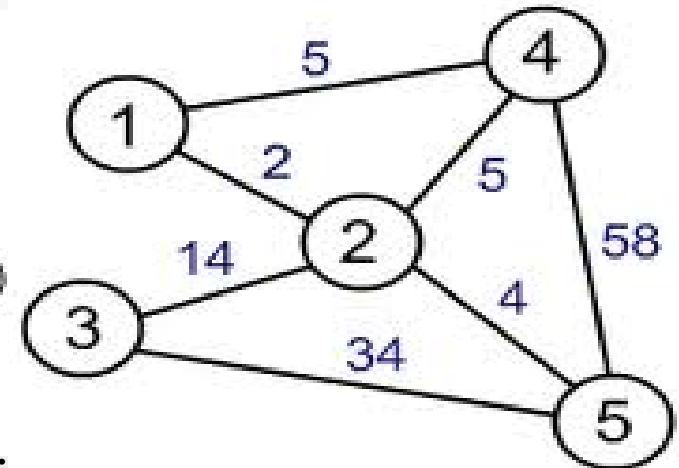
- Represent the following graphs using the three representations
- Suppose we represent a graph  $G$  with  $n$  vertices and  $m$  edges with edge list structure. Why does the function `insertVertex()` function take  $O(1)$  time, while `removeVertex()` function runs in  $O(n)$  time



CSE 201: Data Structures and Algorithms



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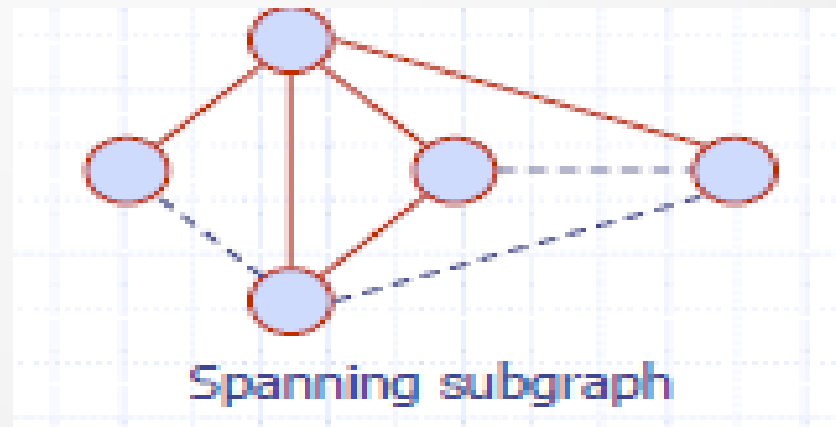
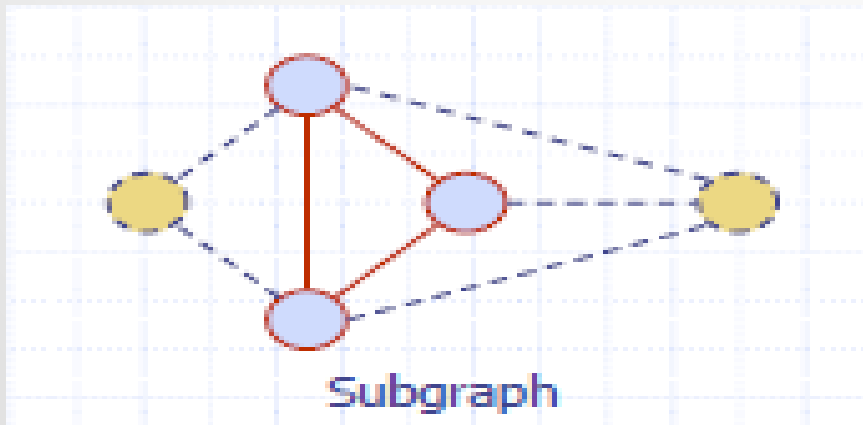
# Exercises

- Would you use the adjacency list structure or the adjacency matrix structure for the following cases? Justify.
  - The graph has 10,000 vertices and 20,000 edges and it is important to use as little space as possible
  - The graph has 10,000 vertices and 20,000,000 edges and it is important to use as little space as possible
  - You need to answer the query `areAdjacent(v,w)` as fast as possible, no matter how much space you use



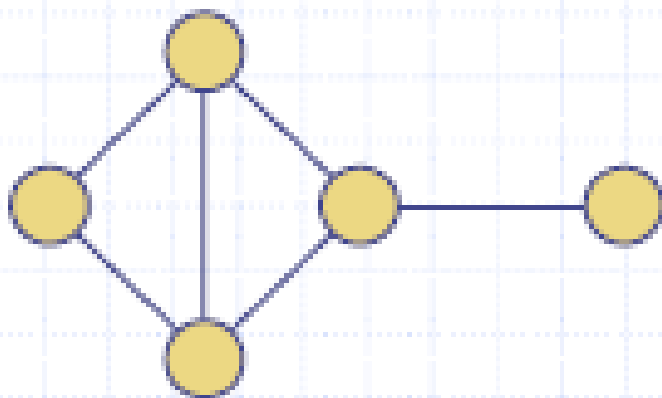
# Subgraphs

- A subgraph  $S$  of a graph  $G$  is a graph such that
  - The vertices of  $S$  are a subset of the vertices of  $G$
  - The edges of  $S$  are a subset of the edges of  $G$
- A spanning subgraph of  $G$ 
  - is a subgraph that contains all the vertices of  $G$

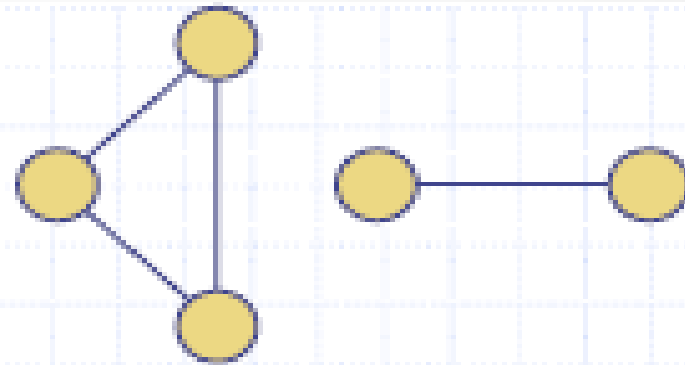


# Connectivity

- A graph is connected if there is a path between every pair of vertices
- Connected component of  $G$ 
  - Maximally connected subgraph of  $G$



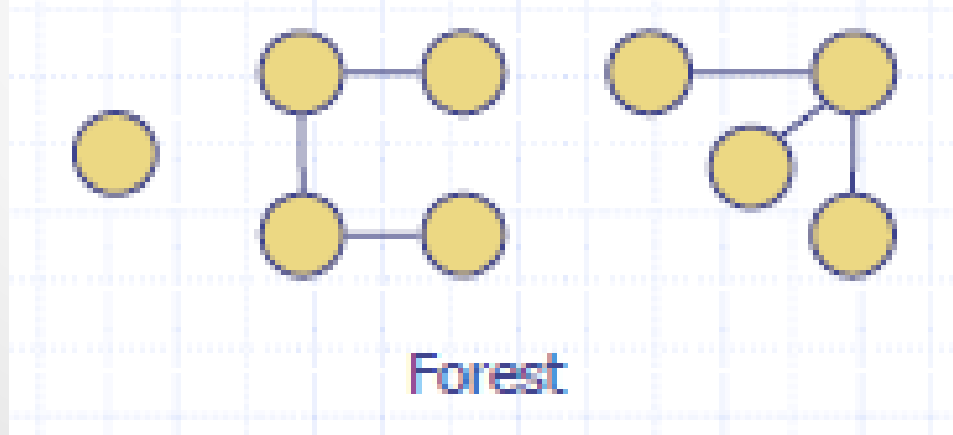
Connected graph



Non connected graph with two connected components

# Trees and Forests

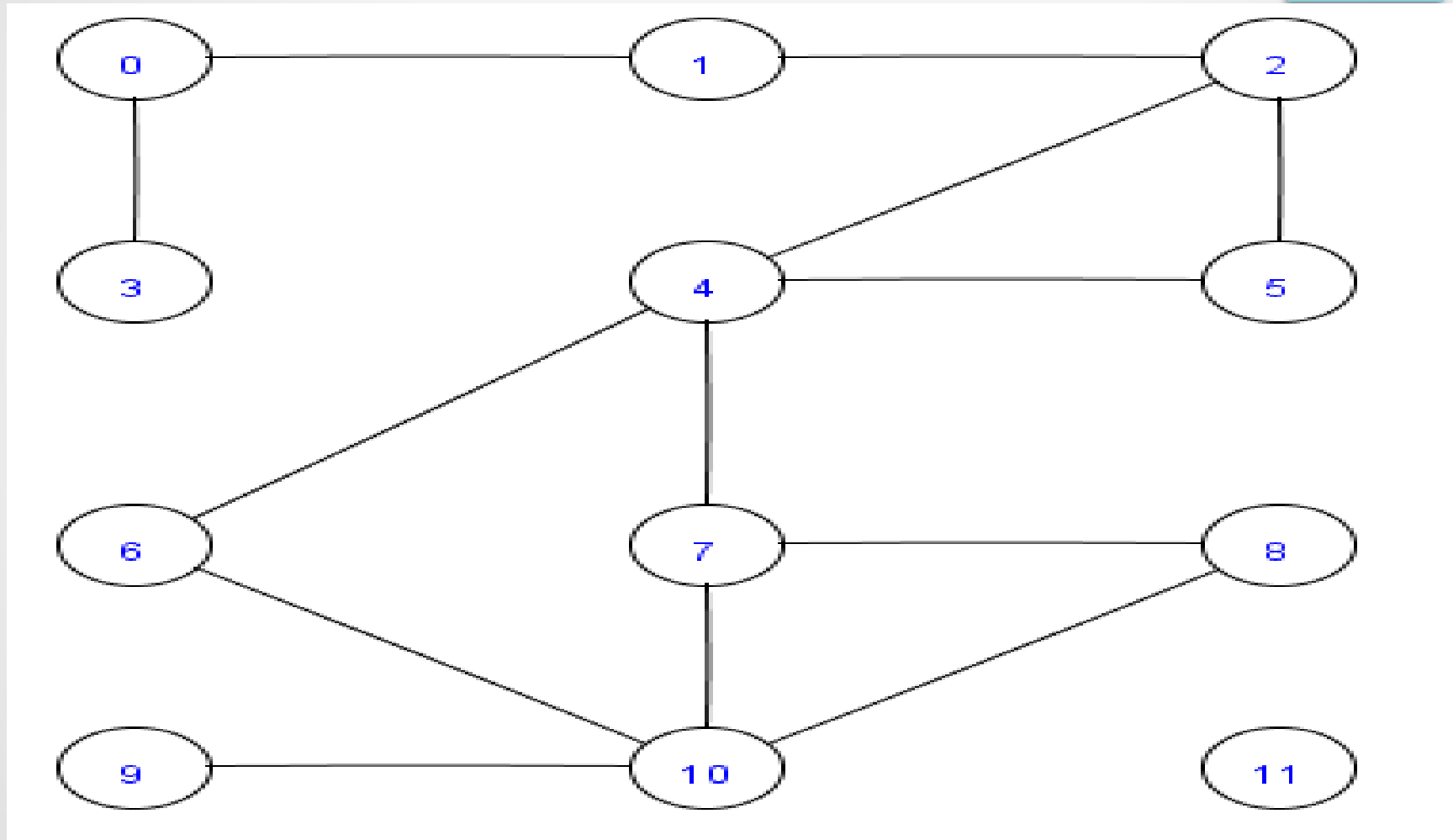
- A tree is an undirected graph such that
  - T is connected
  - T has no cycles
  - Need not be rooted
- Forest is an undirected graph without cycles
  - Connected component of a forest are trees



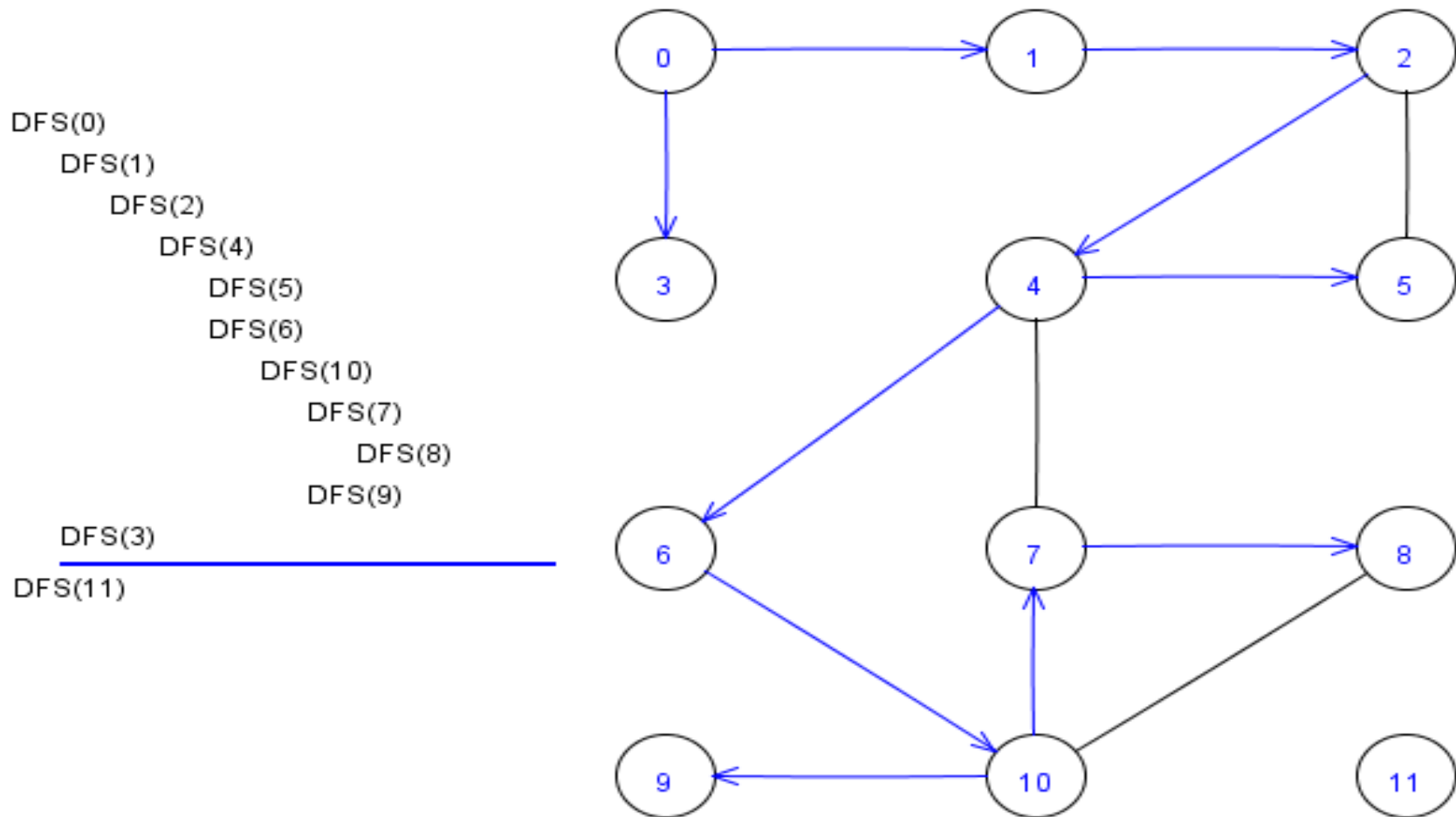
# Graph Traversal

- Depth first search
  - Recursive –  $O(m+n)$  algorithm
  - Start with some node  $v$ 
    - Of all neighbors of  $v$ , goto next  $w$  which is unexplored do DFS( $w$ )
    - If  $w$  explored, then mark edge as back edge
- Similar to a Maze traversal
  - Mark each intersection, corner and dead end (vertex) visited
  - Mark each corridor (edge ) traversed
  - Keep track of the path back to the entrance (start vertex) by means of a rope (recursion)

# DFS Example



# DFS Example Contd



# DFS

- **Algorithm DFS( $G, v$ )**  
**for** all edges  $e$  in  $G$  **do**  
    **if**  $e$  is unexplored **then**  
         $w \leftarrow G.opposite(v, e)$   
        **if**  $w$  is unexplored **then**  
            label  $e$  as a discovery edge  
            DFS( $G, w$ )  
        **else**  
            Label  $e$  as back edge

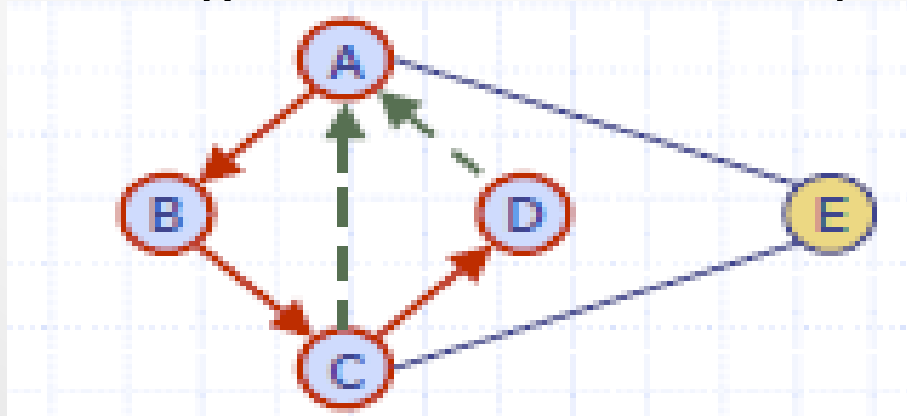
# DFS Properties

- $\text{DFS}(G, v)$  visits all the vertices and edges in the connected component of  $v$
- The discovery edges labeled by  $\text{DFS}(G, v)$  form a spanning tree of the connected component of  $v$ 
  - Spanning tree is a tree which contains
    - All the nodes in the connected component
    - Subset of edges connecting all the nodes in the component such that no cycles are formed



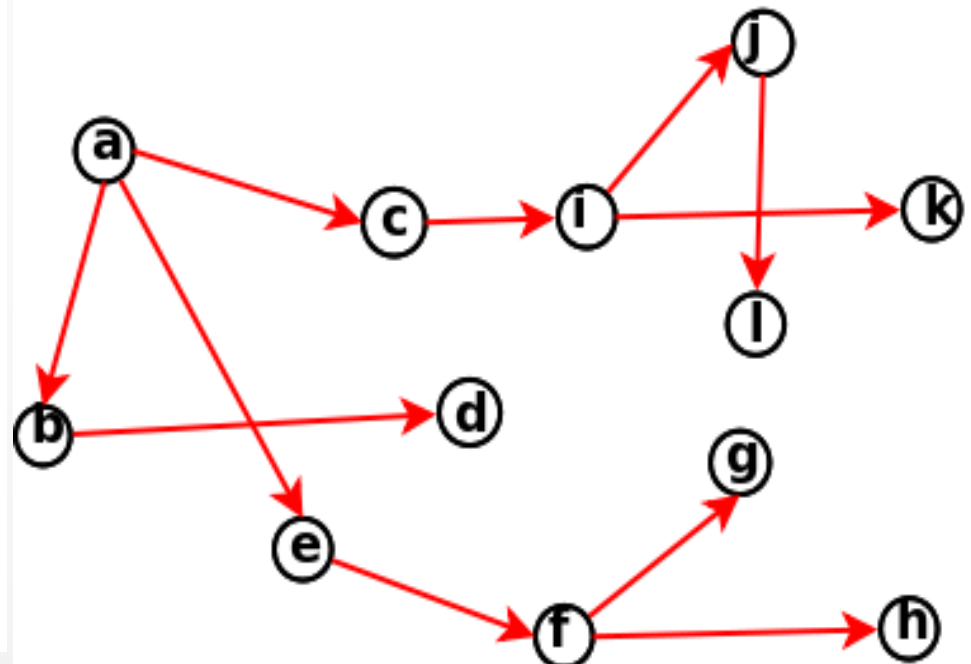
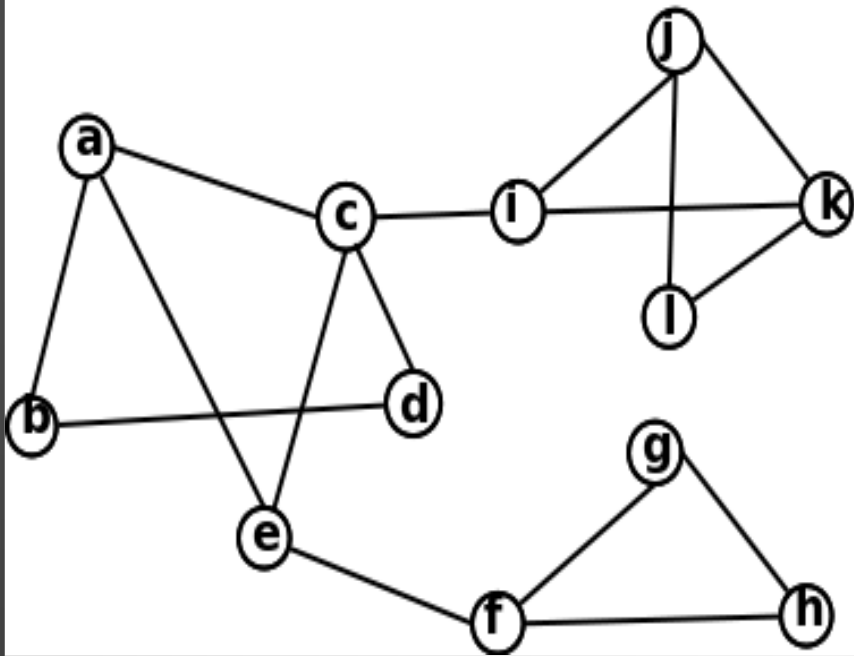
# DFS Applications

- Path finding
  - Can be used to find path between two vertices
- Cycle Finding
  - Usually a cycle is a sequence of forward edges with one backward edge
    - Backward edge indicates an already visited node



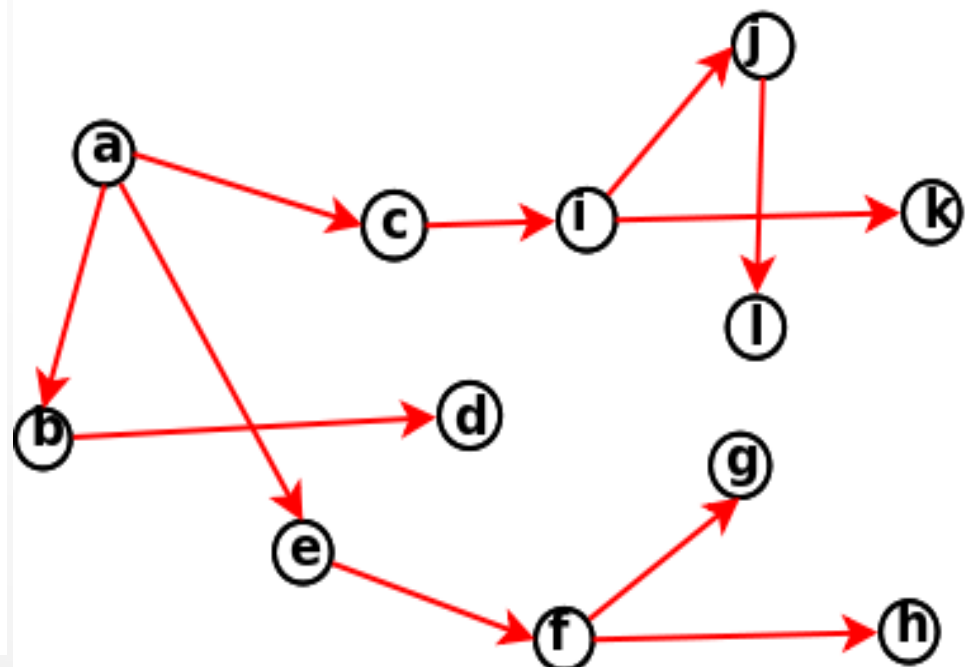
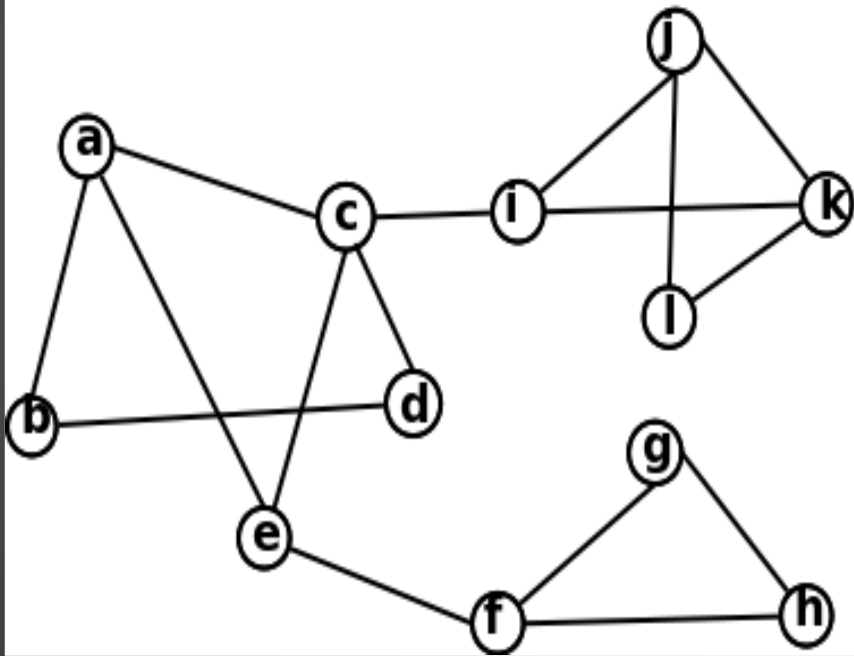
# Breadth First Traversal

- Discovery in levels, marks new nodes in levels
- $O(m+n)$



# Breadth First Traversal

- Discovery in levels, marks new nodes in levels
  - Cross edges connect to already discovered nodes
- $O(m+n)$



# BFS

- Algorithm BFS( $v$ )

initialize container  $L_0$  to contain vertex  $v$  and  $i$  to 0

while  $L_i$  is not empty do

    for each vertex  $v$  in  $L_i$  do

        for each edge  $e$  incident on  $v$

            if  $e$  is unexplored

                let  $w$  be the other endpoint of  $e$

                If  $w$  is unexplored

                    label  $e$  as a discovery edge and insert  $w$  into  $L_{i+1}$

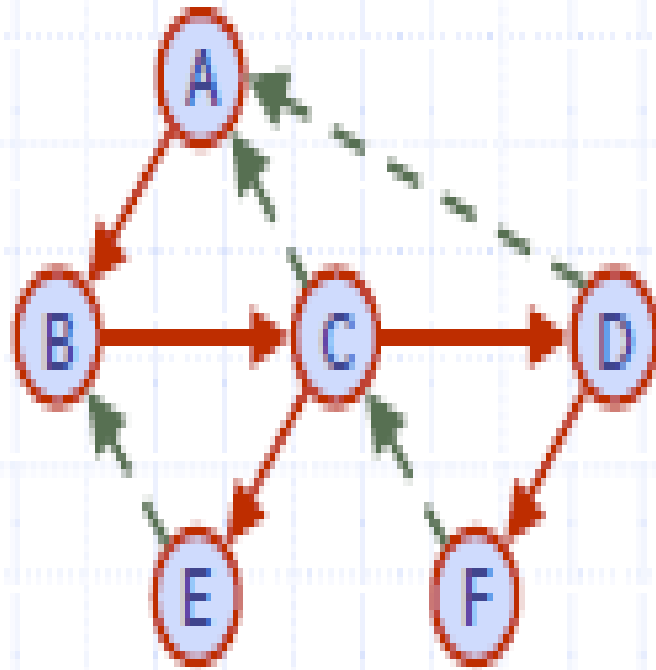
                else label  $e$  as cross edge

$i \leftarrow i+1$

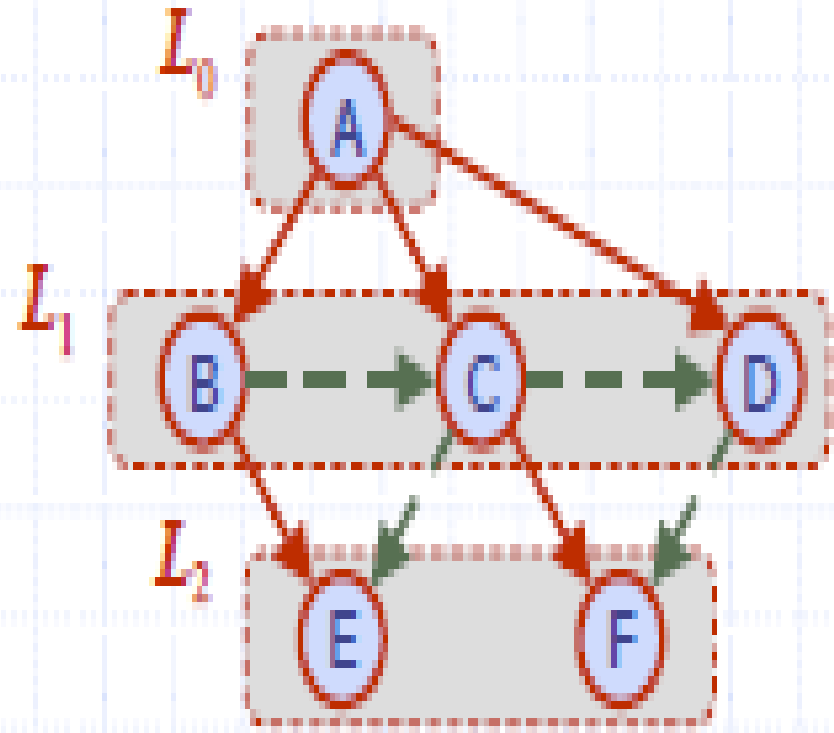
# Applications of BFS

- Find and report a path with the minimum number of edges between two given vertices
- Find a simple cycle, if there is one

# BFS vs DFS



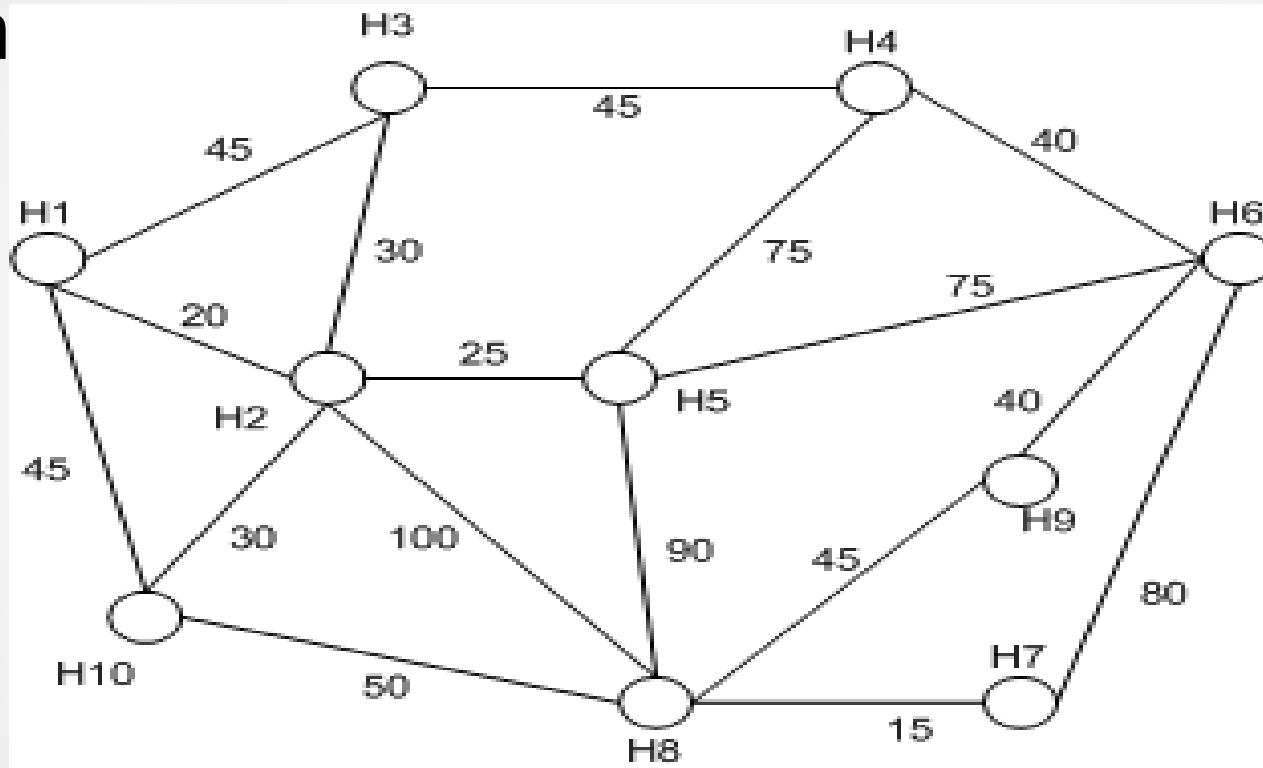
DFS



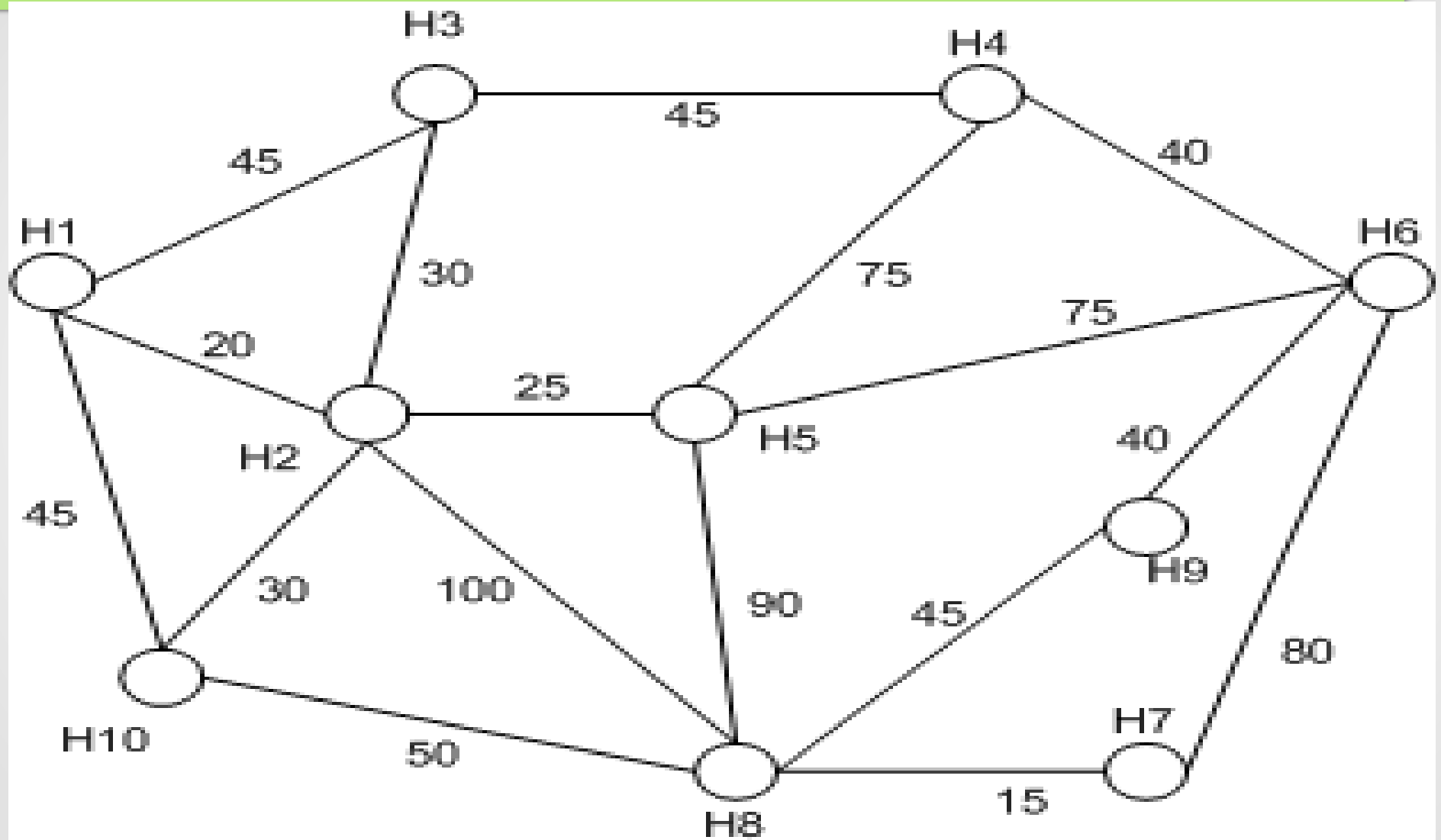
BFS

# Exercises

- Do the BFS and DFS traversal over the following graph

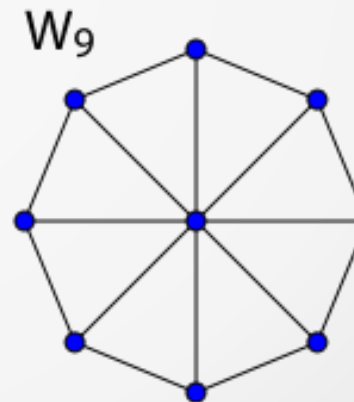
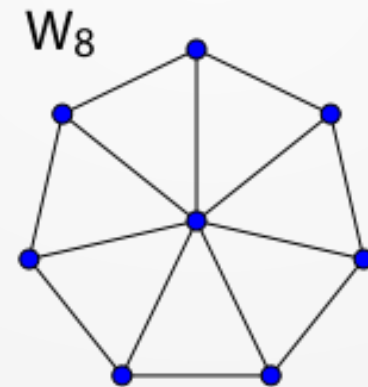
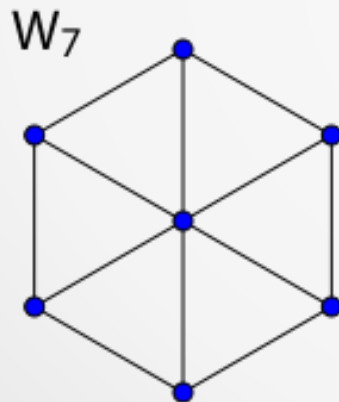
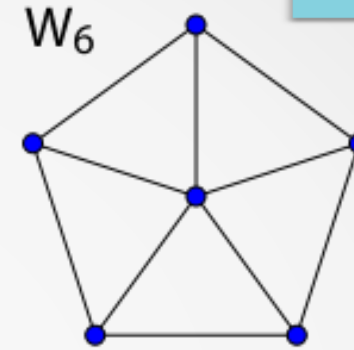
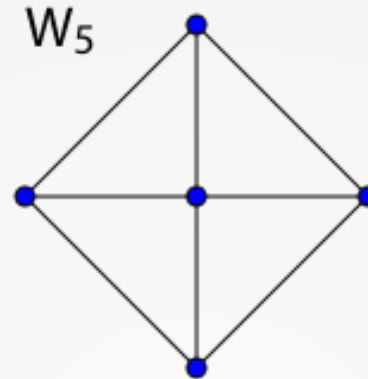
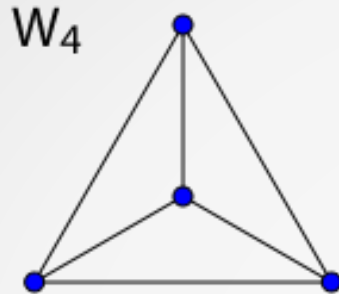


- Illustrate all possible structures of traversal trees generated on a wheel graph  $W_n$





# Exercise

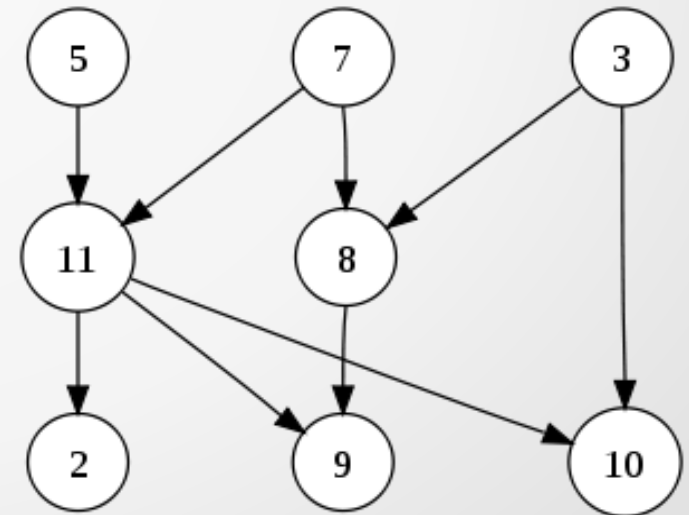


# Exercise

- How are the DFS and BFS modified for a directed graph?
- Write an algorithm to find the longest path in a DAG, where the length of the path is measured by the number of edges that it contains.

# Digraphs

- A directed graph or digraph is a pair  $G = (V, E)$  of
  - a set  $V$ , whose elements are called vertices or nodes
  - a set  $A$  of ordered pairs of vertices, called arcs, directed edges, or arrows
- A directed acyclic graph (DAG) is a directed graph with no directed cycles



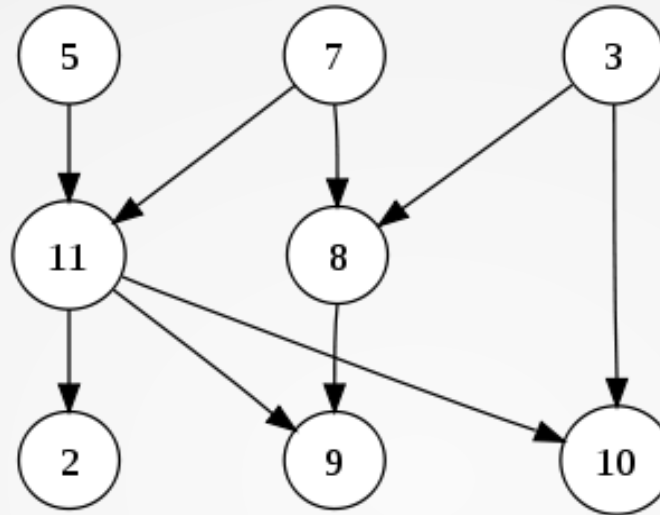
# Digraph Applications

- Used to model several kinds of structures in maths or science
- Scheduling
  - Edge  $(a, b)$  indicates task  $a$  must be completed before  $b$
- Topological Ordering
- Data Processing Networks
  - data enters a processing element through its incoming edges and leaves the element through its outgoing edges
  - Bayesian Networks
  - Compilers
  - Circuit Design

# Topological Ordering

- A DAG is a digraph that has no directed cycles and a topological ordering of a digraph is a numbering  $v_1, \dots, v_n$  of the vertices such that
  - for every edge  $(v_i, v_j)$ , we have  $i < j$
- Example
  - In task scheduling, a topological ordering is a task sequence that satisfies the precedence constraints
- Theorem
  - A digraph admits a topological ordering if and only if it is a DAG

# Example

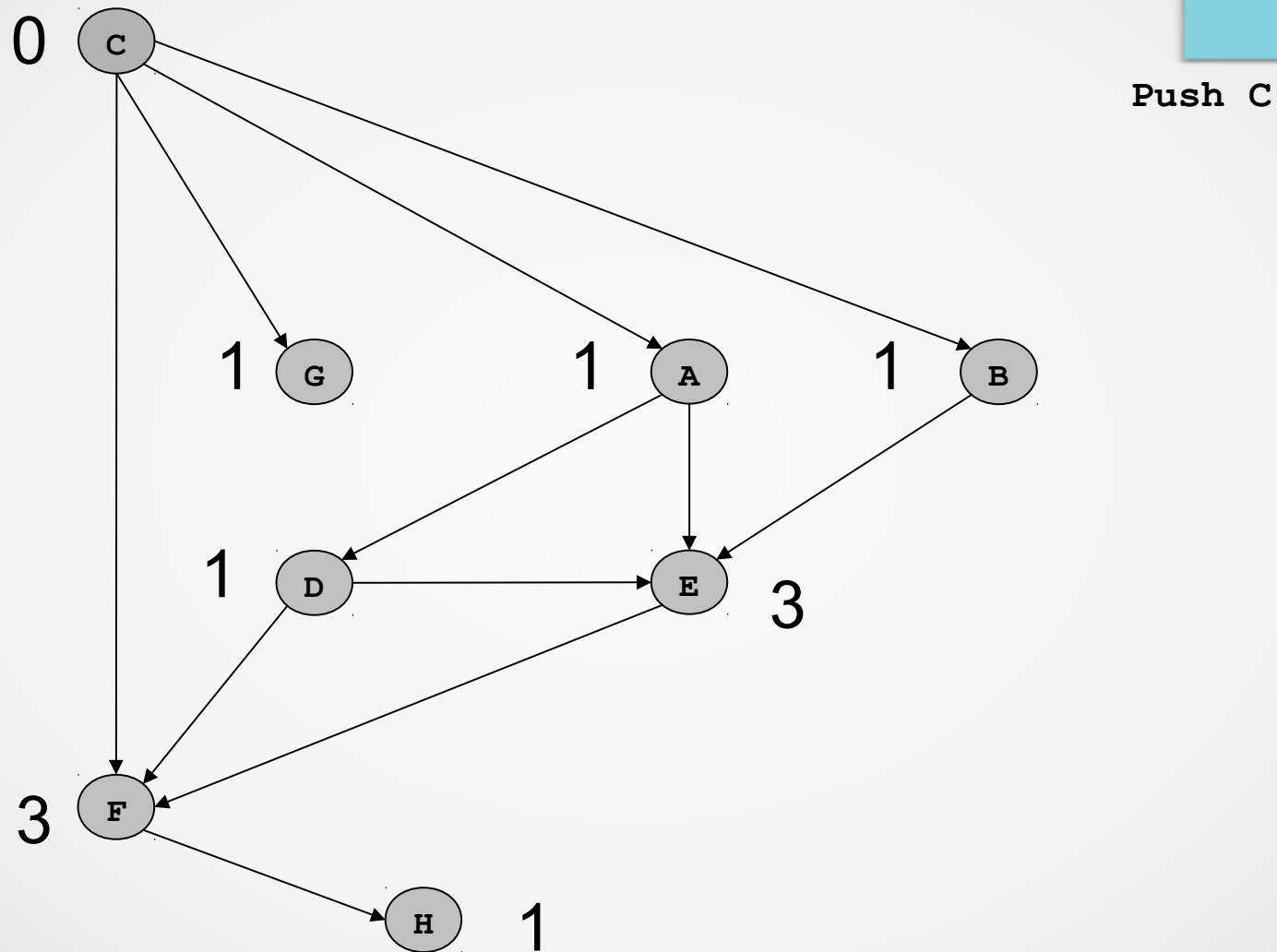


- For the above graph these are some valid topological ordering
  - 5, 7, 3, 11, 8, 2, 9, 10
  - 3, 5, 7, 8, 11, 10, 9, 2

# Topological Sorting Algorithm

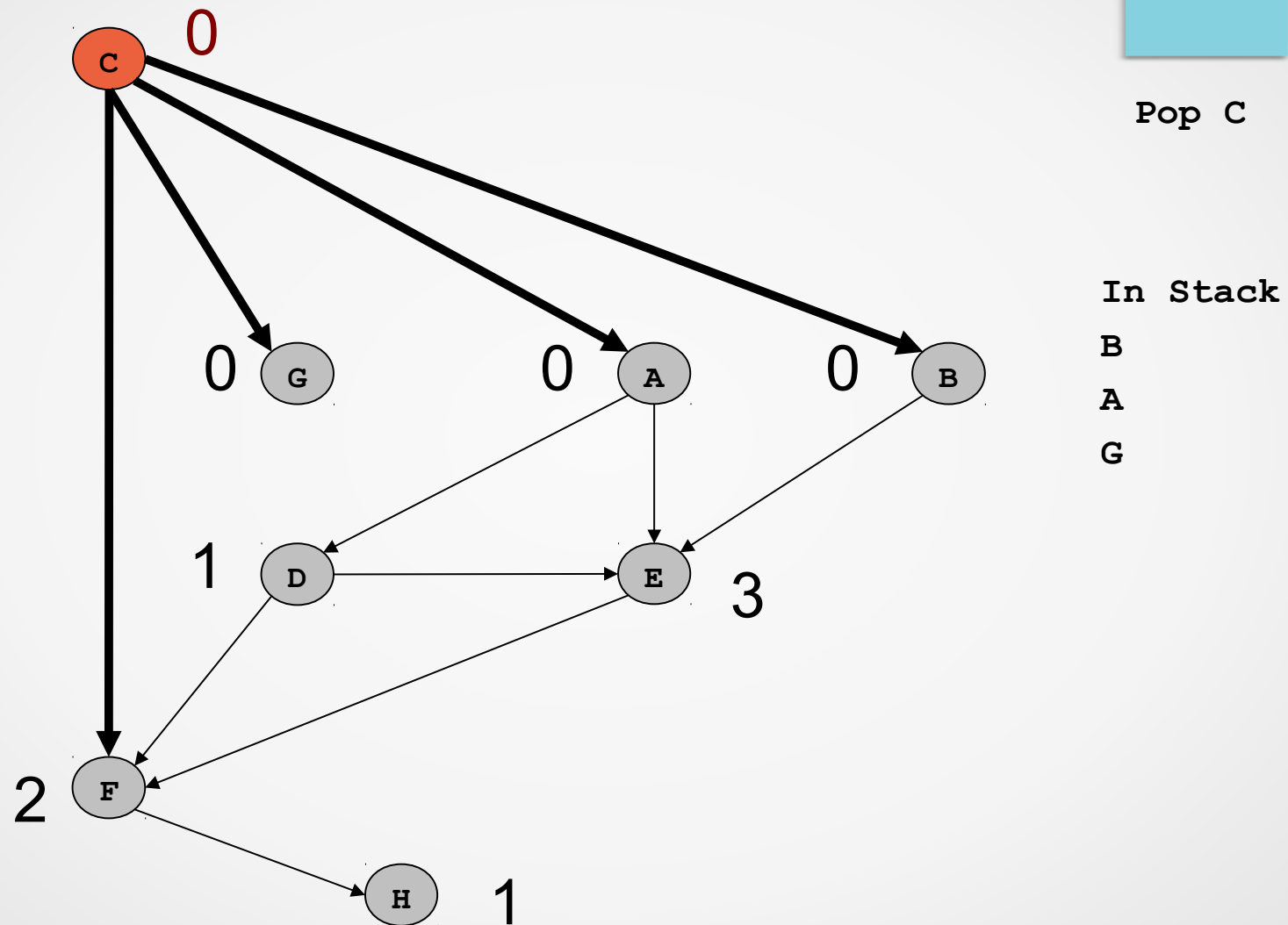
- Let  $S$  be an empty stack
- For each vertex  $u$  of  $G$ , set  $\text{incounter}(u)$  as the  $\text{indegree}(u)$ 
  - If  $\text{incounter}(u) = 0$ , push it in the stack
- Set  $i$  as 1
- If  $S$  is empty it has a directed cycle
- Pop the  $i$ th vertex  $u_i$  from the stack and increment  $i$ 
  - For each neighbor  $v$  of  $u_i$ , decrement  $\text{incounter}(v)$  by 1
  - If  $\text{incounter}(v) = 0$ , push it in stack
  - Do this while stack has elements in it

# Example

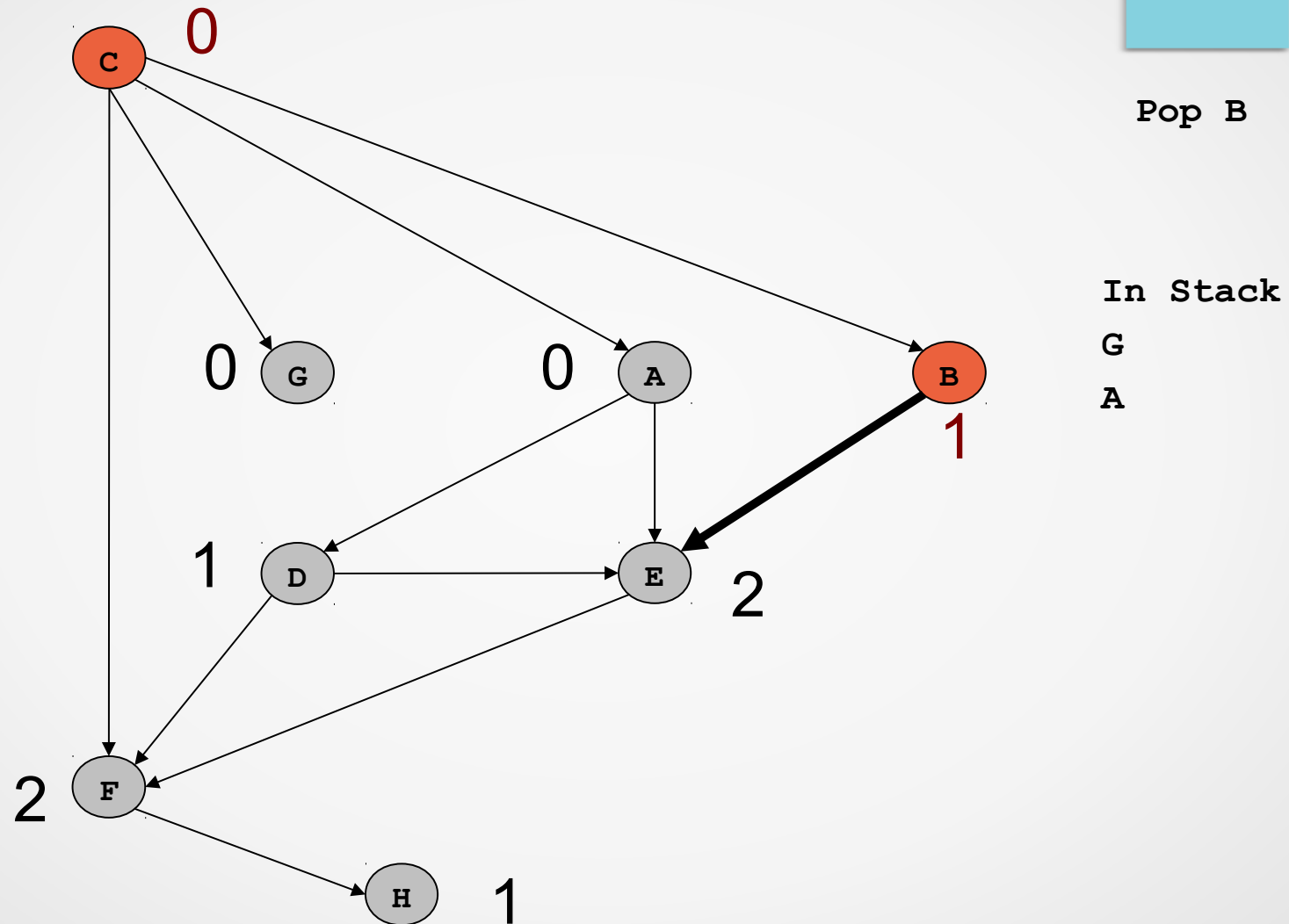




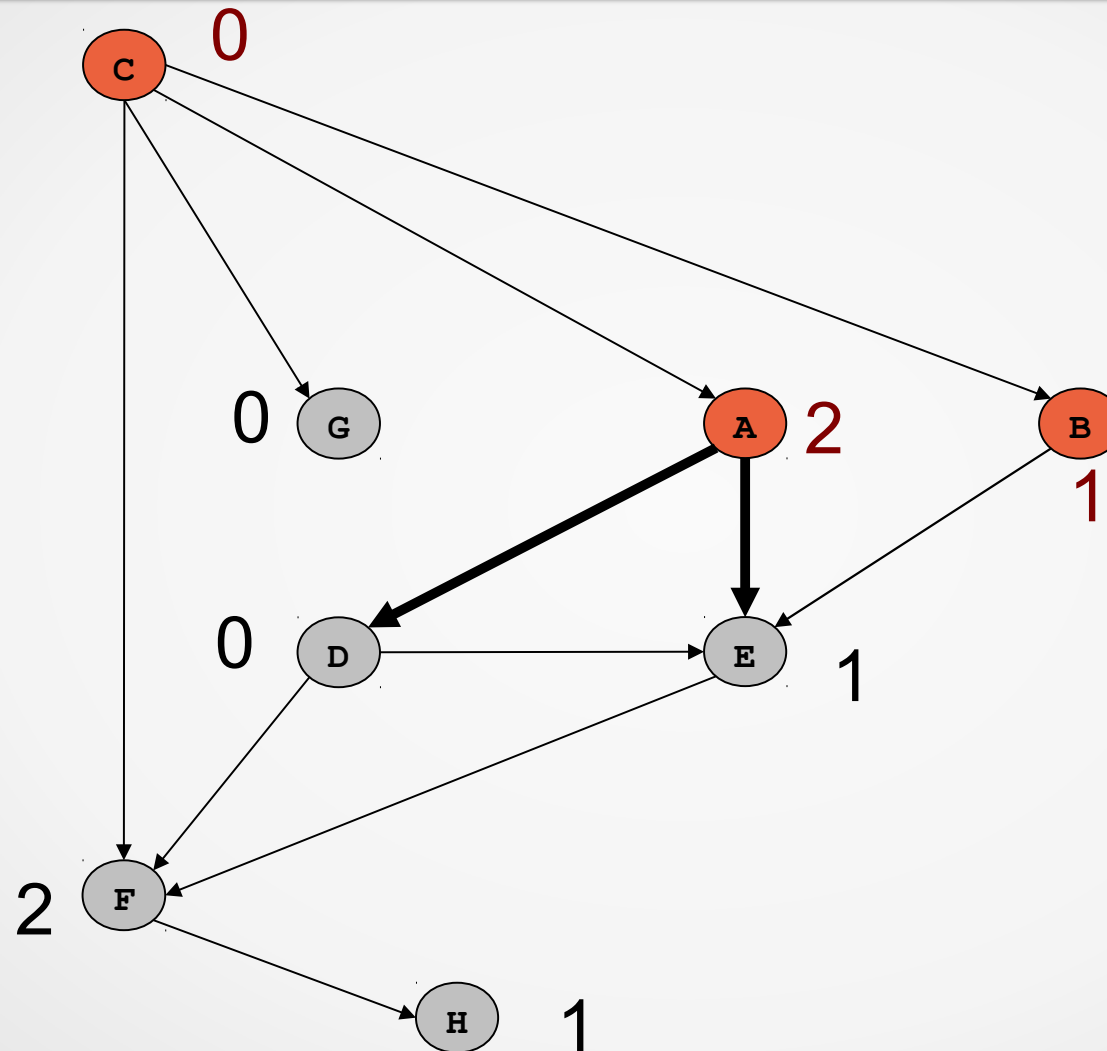
# Example



# Example



# Example

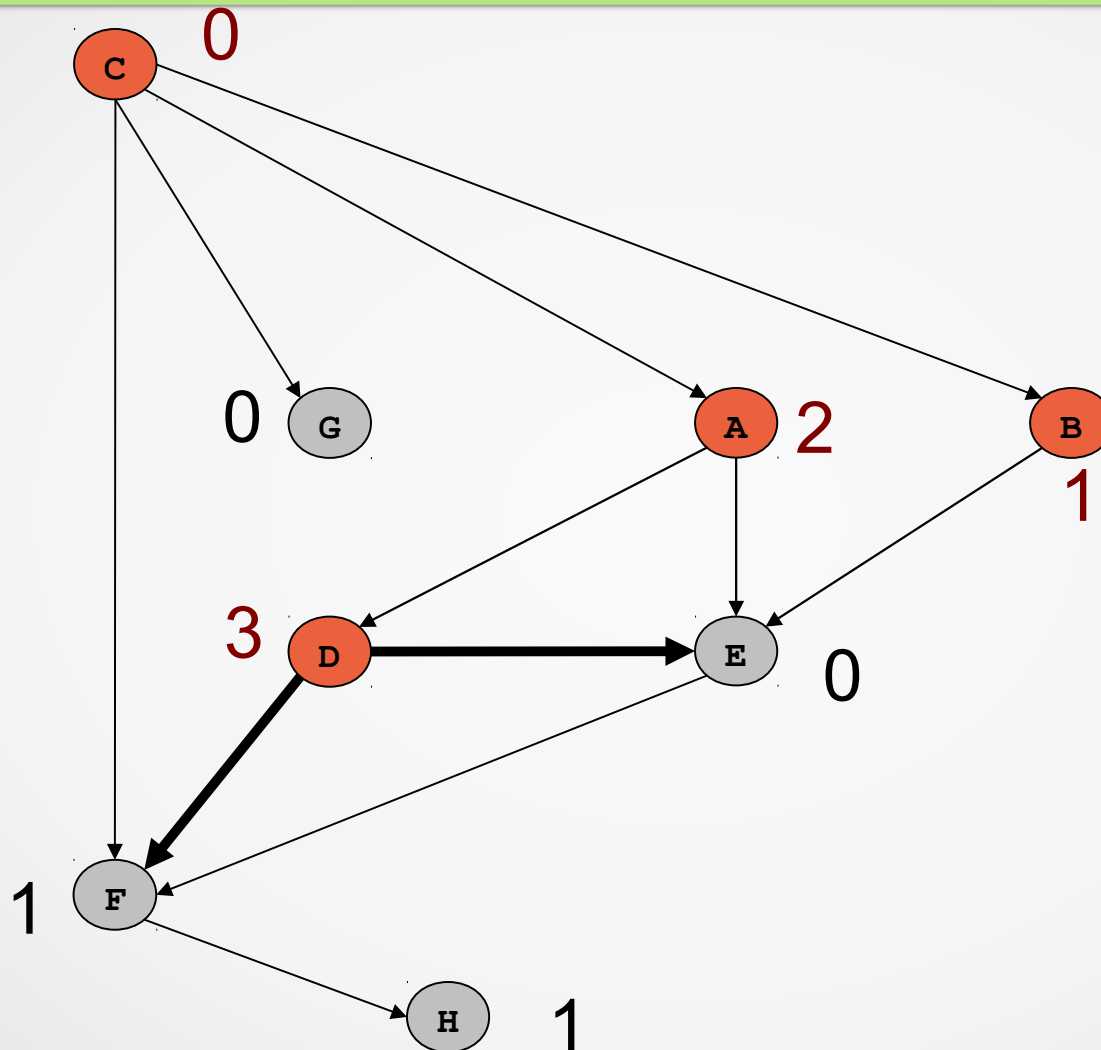


Pop A

Push D

In Stack  
D  
G

# Example



Pop D

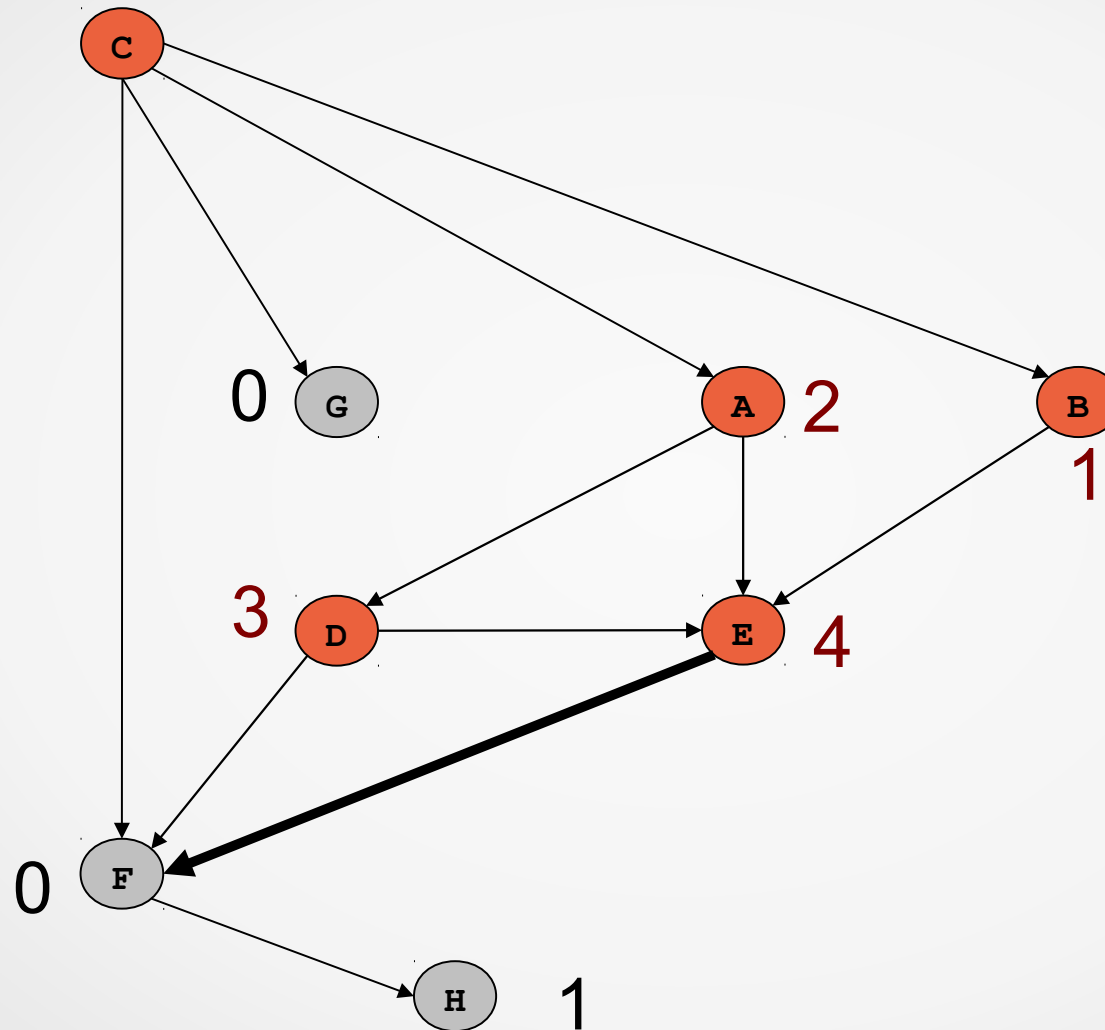
Push E

In Stack

E

G

# Example



Pop E

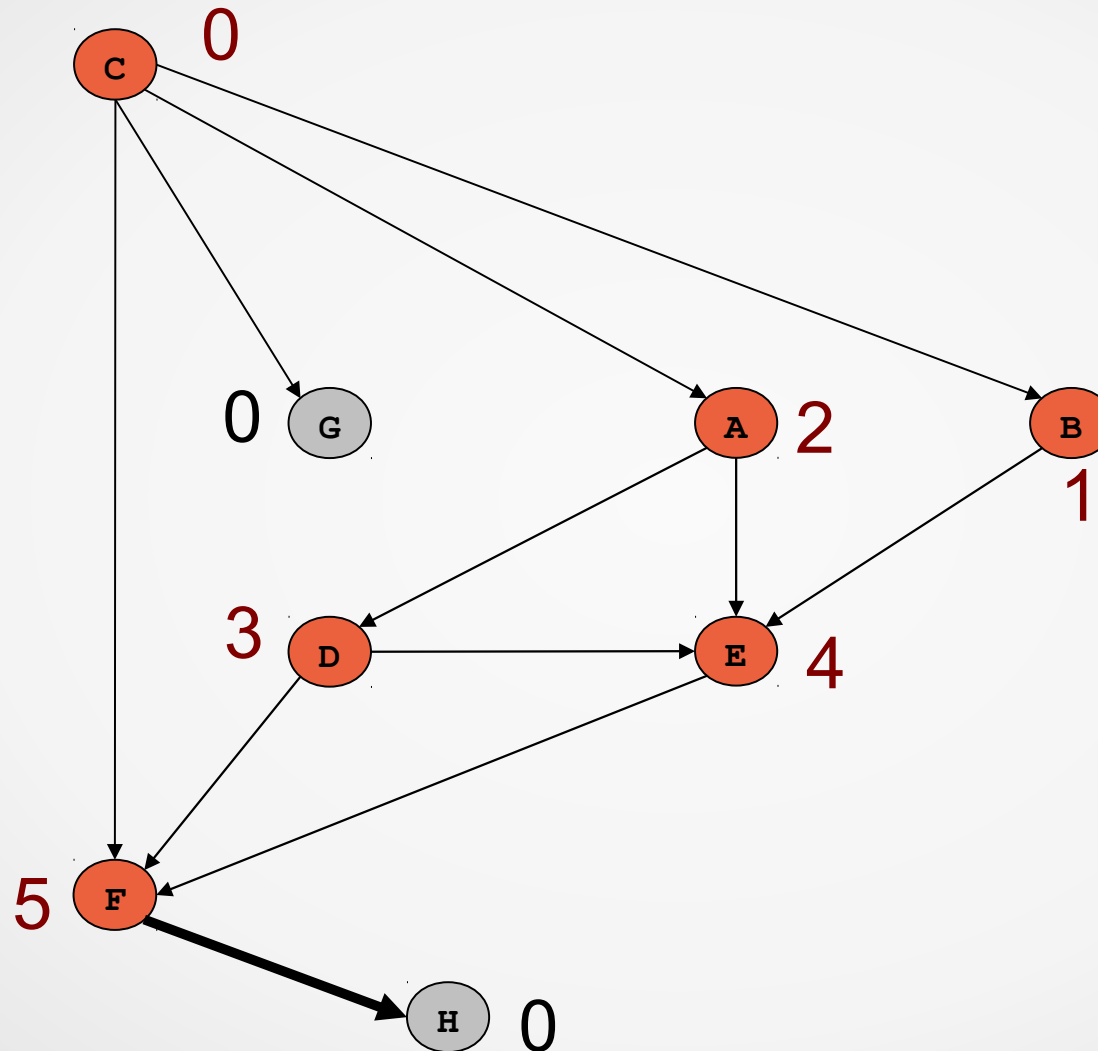
Push F

In Stack

F

G

# Example



Pop F

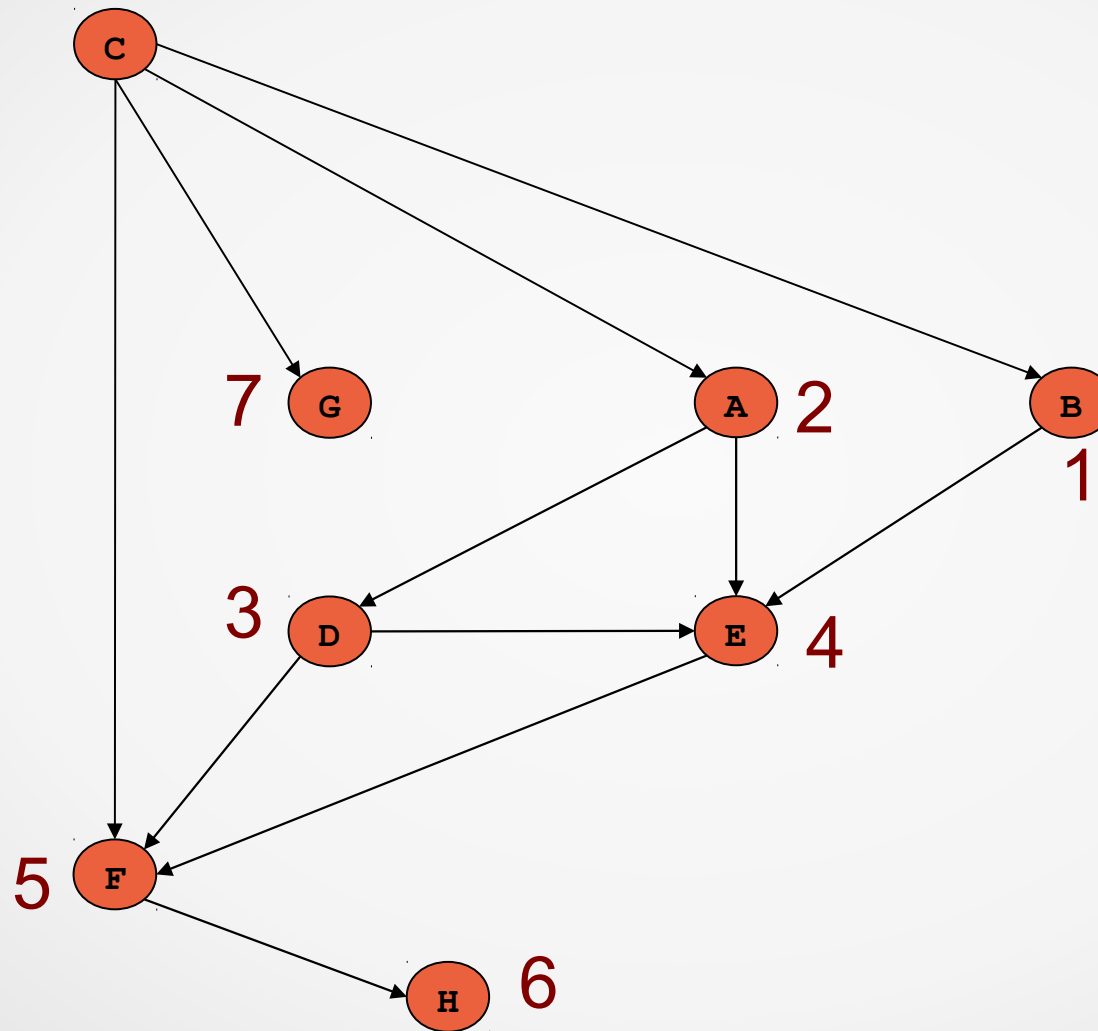
Push H

In Stack

H

G

# Example



Pop H

Pop G

# Analysis

- Runs in  $O(n+m)$  time –  $n$  vertices and  $m$  edges
  - Initial computation of indegree  $O(n+m)$
- Uses  $O(n)$  auxiliary space (stack)
- If some vertices are not numbered then there is a cycle
  - Any vertex on a directed cycle will not be visited
  - A vertex visited only when incounter is 0
  - Implies all its previous predecessors were previously visited



# Exercise

- A student entering the computer science department wants to plan his course schedule to take the following courses: The course prerequisites are:
  - CS105 – none
  - CS106 – CS105
  - CS122 – none
  - CS201 – CS105
  - CS202 – CS106, CS201
  - CS326 – CS122, CS202
  - CS327 - CS106
  - CS141 – CS122, CS106
  - CS169 – CS202
- Find a sequence of courses that allows Bob to satisfy all the prerequisites

# Exercise

- The root of a DAG is a vertex  $R$  such that every vertex of the DAG can be reached by a directed path from  $R$ . Write an algorithm that takes a directed graph as input and determines the root (if there is one) for the graph. The running time of your algorithm should be  $(|V| + |E|)$ .