

# Graphs

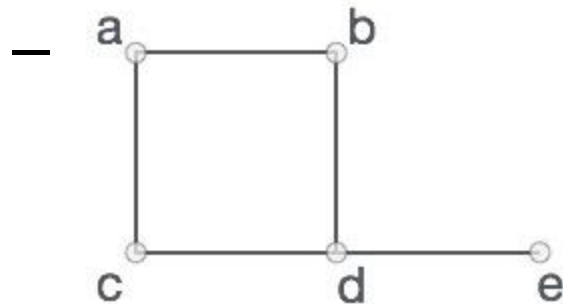
# Graphs

- Non-linear data structures
  - Trees
  - Graphs
- Tree
  - There is a hierarchical relationship between parent and children.
  - Tree is a special case of graph.
- Graphs
  - No hierarchical relationship.

# What is a graph?

- **Definition:**

- A data structure that consists of a set of **nodes** (**vertices**) and a set of **edges** that relate the nodes to each other.
- The set of edges describes relationships among the vertices .



In the graph,

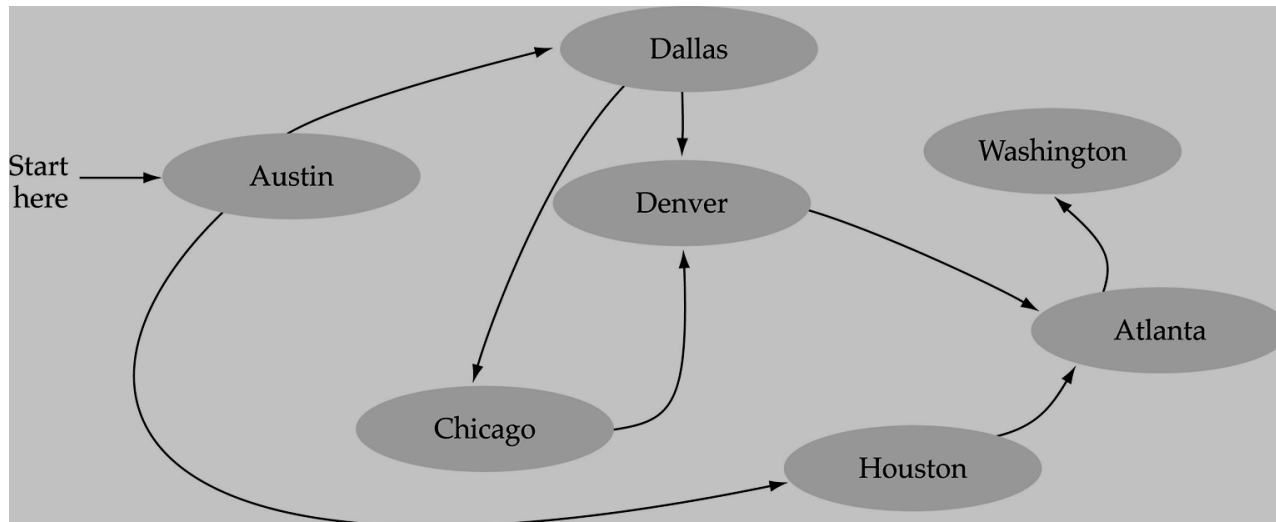
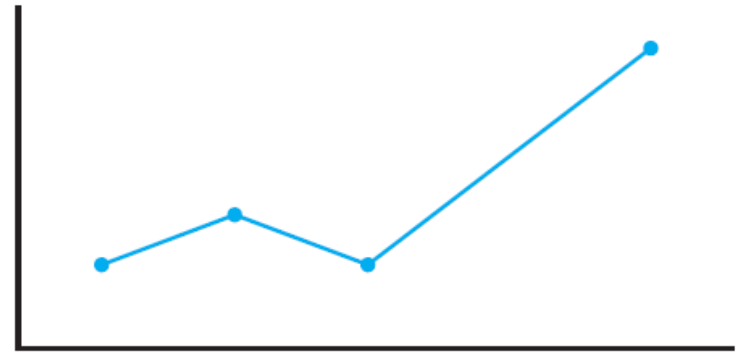
$$V = \{a, b, c, d, e\}$$

$$E = \{ab, ac, bd, cd, de\}$$

# What is a graph?

*Graphs* consist of

- points called *vertices*
- lines called *edges*
- Edges connect *two* vertices.
- Edges only intersect at vertices.
- Edges joining a vertex to itself are called *loops*

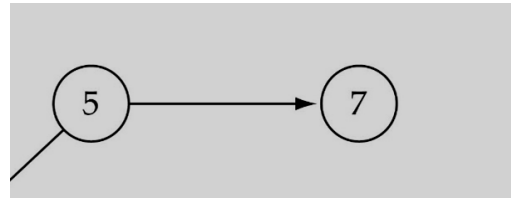


# Formal definition of graph

- A graph  $G$  consists of two things:
  1. A set  $V$ , called set of all vertices (or nodes or elements)
  2. A set  $E$ , called set of all edges such that each edge  $e$  in  $E$  is identified with a unique pair  $(u,v)$  of nodes in  $V$ , denoted by  $e=(u,v)$
- A graph can be represented as  $G=(V,E)$

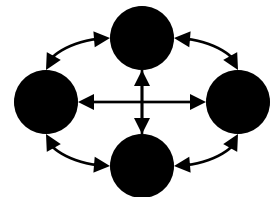
# Graph terminology

- **Adjacent nodes**: two nodes are adjacent if they are connected by an edge



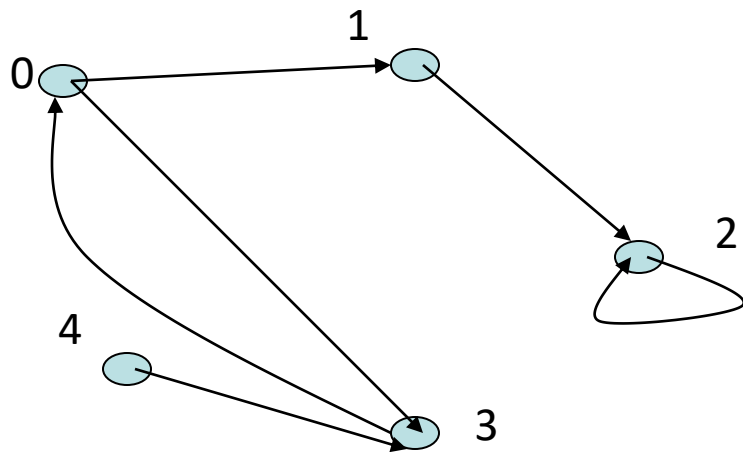
5 is adjacent to 7

- **Path**: a sequence of vertices that connect two nodes in a graph.
- **Degree** of a node  $x$ ,  $\text{deg}(x)$  is the no. of edges containing  $x$ .
- **Complete graph**: a graph in which every vertex is directly connected to every other vertex



# Examples of Graphs

- $V = \{0, 1, 2, 3, 4\}$
- $E = \{(0, 1), (1, 2), (0, 3), (3, 0), (2, 2), (4, 3)\}$



When  $(x, y)$  is an edge,  
we say that  $x$  is *adjacent to*  $y$ , and  $y$  is  
*adjacent from*  $x$ .

0 is adjacent to 1.

1 is not adjacent to 0.

2 is adjacent from 1.

# Graph terminology

- Connected graph: a graph is said to be connected, if there is a path from every node to every other node
- The size of a graph is the number of *nodes* in it
- The empty graph has size zero (no nodes)
- Cycle: a path that begins and ends at same vertex
- A directed graph is one in which the edges have a direction
- If a graph does not have any cycle, then it is acyclic graph
- An undirected graph is one in which the edges do not have a direction



- An *undirected graph* is **connected** if there is a path from every node to every other node
- A *directed graph* is **strongly connected** if there is a path from every node to every other node
- A directed graph is **weakly connected** if the underlying undirected graph is connected
- Node  $X$  is **reachable** from node  $Y$  if there is a path from  $Y$  to  $X$
- A **weighted graph** is a graph in which each edge is assigned a weight.

# Terminology



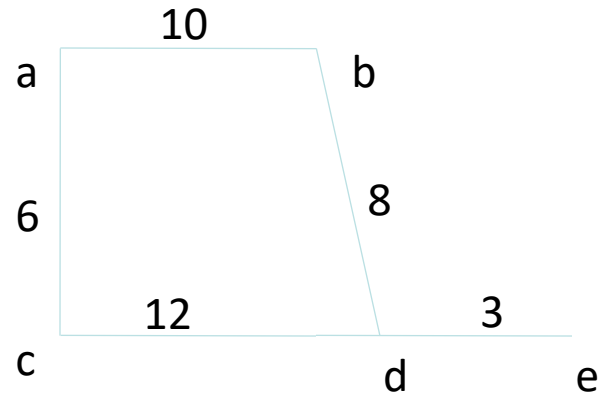
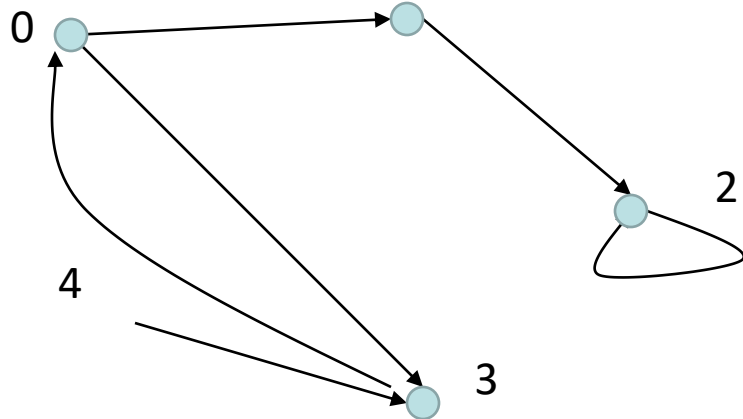
(a)



(b)



(c)



Graphs that are (a) connected (b) disconnected (c) complete (d) directed (e) weighted graph

# Graph representations

- **Sequential representation**
  - Using adjacency matrix
- **Linked list representation**
  - Using adjacency list
- **Set representation**
  - Using edge list

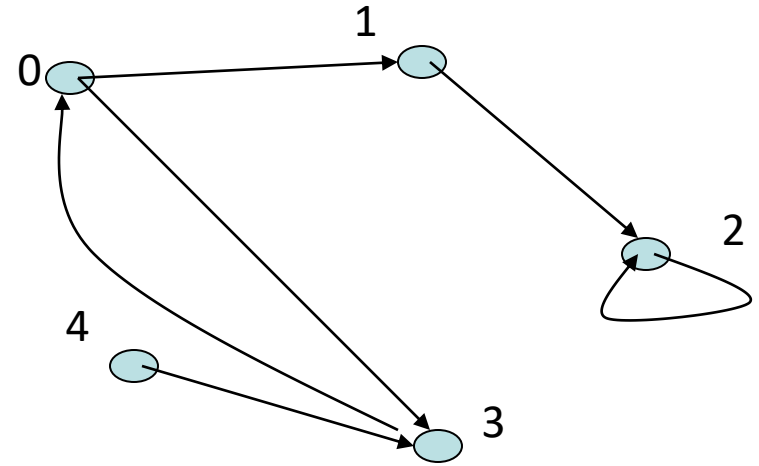
# Sequential representation

## Adjacency matrix:

- Suppose **G is a directed graph** with  $n$  nodes
- In this representation, each graph of  $n$  nodes is represented by an  $n \times n$  matrix  $A$ , that is, a two-dimensional array  $A$
- $A[i][j] = 1$  if  $(i,j)$  is an edge
- $A[i][j] = 0$  if  $(i,j)$  is not an edge
- i.e  $A_{ij} = 1$ , if there is an edge from  $v_i$  to  $v_j$   
= 0, otherwise

# Example of Adjacency Matrix

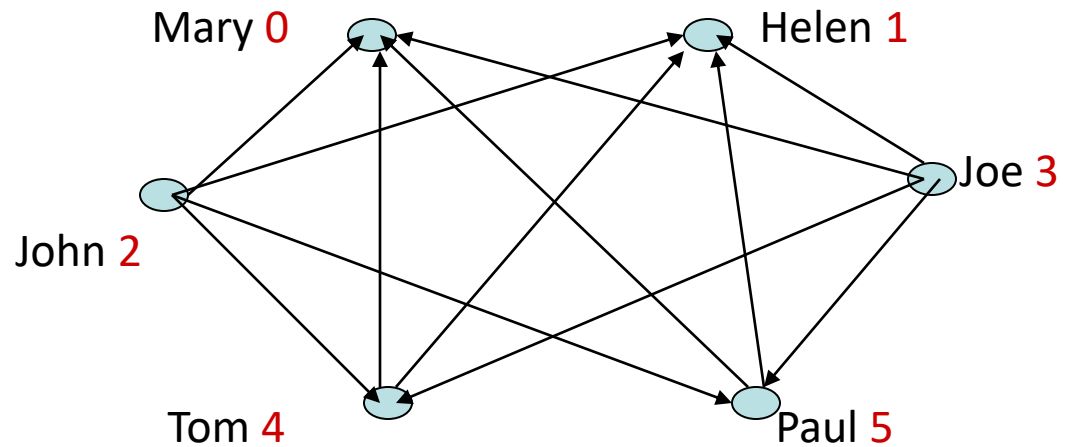
$$A = \begin{matrix} & \begin{matrix} 0 & 1 & 2 & 3 & 4 \end{matrix} \\ \begin{matrix} 0 \\ 1 \\ 2 \\ 3 \\ 4 \end{matrix} & \begin{bmatrix} 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \end{bmatrix} \end{matrix}$$



# Another Example of Adj. Matrix

0 1 2 3 4 5

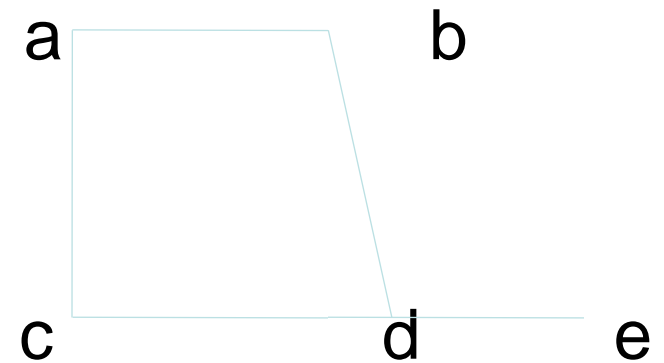
$$A = \begin{bmatrix} 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 \\ 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 1 & 0 & 0 & 1 & 1 \\ 1 & 1 & 0 & 0 & 0 & 0 \\ 1 & 1 & 0 & 0 & 0 & 0 \end{bmatrix}$$



# Adjacency matrix

- Suppose **G is an undirected** graph.
- Then the adjacency matrix  $A$  of  $G$  will be a symmetric matrix.
- i.e  $a_{ij}=a_{ji}$  for every  $i$  and  $j$

$$A = \begin{matrix} & \begin{matrix} a & b & c & d & e \end{matrix} \\ \begin{matrix} a \\ b \\ c \\ d \\ e \end{matrix} & \begin{bmatrix} 0 & 1 & 1 & 0 & 0 \\ 1 & 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 1 & 0 & 1 \\ 0 & 0 & 0 & 1 & 0 \end{bmatrix} \end{matrix}$$



# Exercise

- Consider a directed graph with nodes a, b, c & d. The adjacency matrix of A of G is as follows. Draw G.

$$A = \begin{matrix} a \\ b \\ c \\ d \end{matrix} \begin{bmatrix} 0 & 0 & 0 & 1 \\ 1 & 0 & 1 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \end{bmatrix}$$



# Pros and Cons of Adjacency Matrices

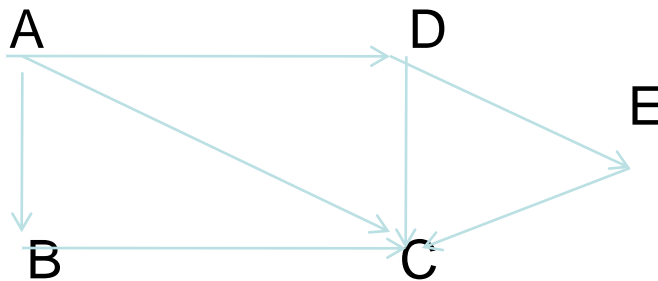
- Pros:
  - Simple to implement
  - Easy and fast to tell if a pair (i,j) is an edge: simply check if  $A[i][j]$  is 1 or 0
  - Easy to **implement dense matrix.**
- Cons:
  - No matter how few edges the graph has, the matrix takes  **$O(V^2)$**  in memory
  - Memory wastage in case of sparse matrix.
  - Difficult to insert and delete nodes in G

# Linked list representation

- **Using adjacency list.**
  - List of adjacent nodes.
  - Adjacent nodes are also called **successor or neighbors**
  - It is **the space saving way** of graph representation.

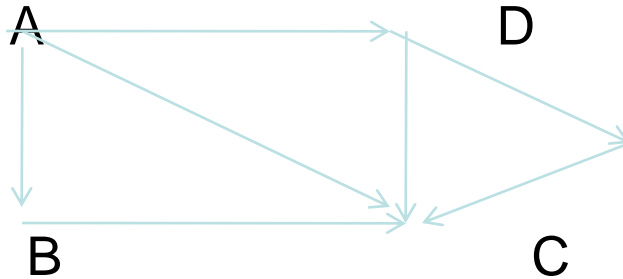
# Adjacency Lists Representation

- A graph of  $n$  nodes is represented by a one-dimensional array  $L$  of linked lists, where
  - $L[i]$  is the linked list containing all the nodes adjacent from node  $i$ .
  - The nodes in the list  $L[i]$  are in no particular order

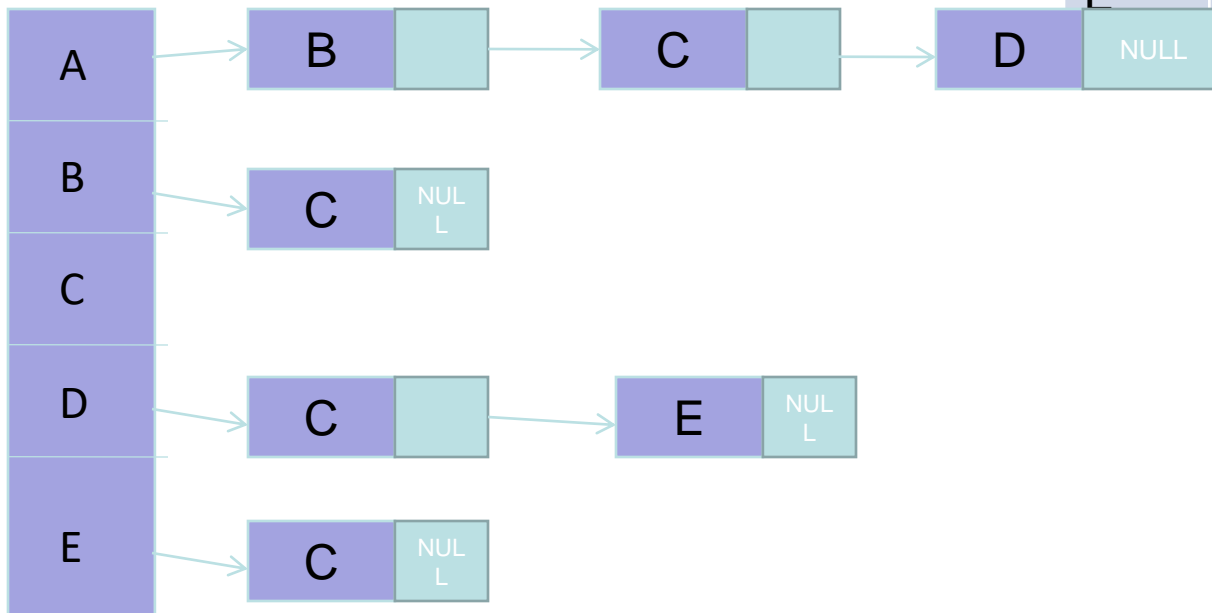


| Node | Adjacency List |
|------|----------------|
| A    | B, C, D        |
| B    | C              |
| C    |                |
| D    | C, E           |
| E    | C              |

# Adjacency Lists Representation



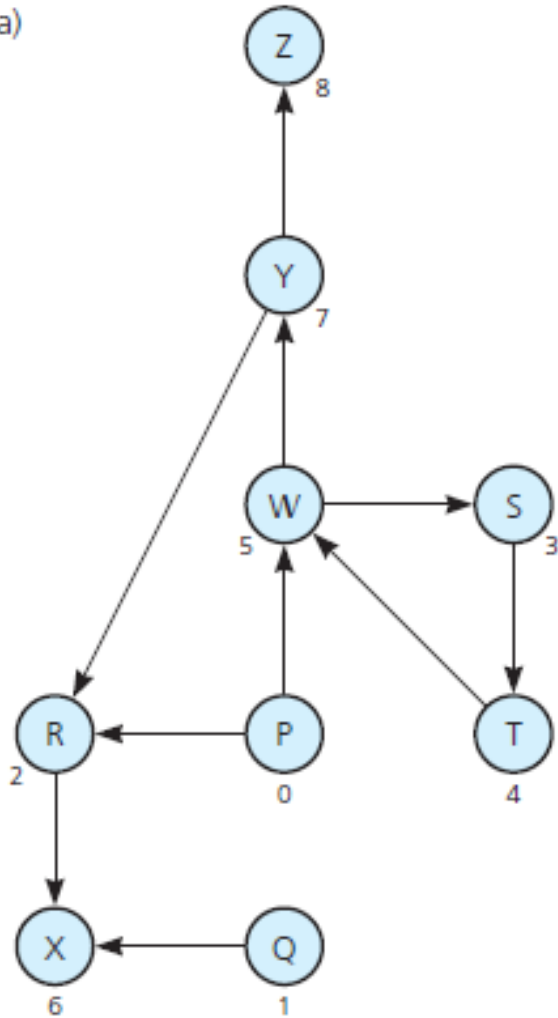
| Node | Adjacency List |
|------|----------------|
| A    | B, C, D        |
| B    | C              |
| C    |                |
| D    | C, E           |
| E    | C              |



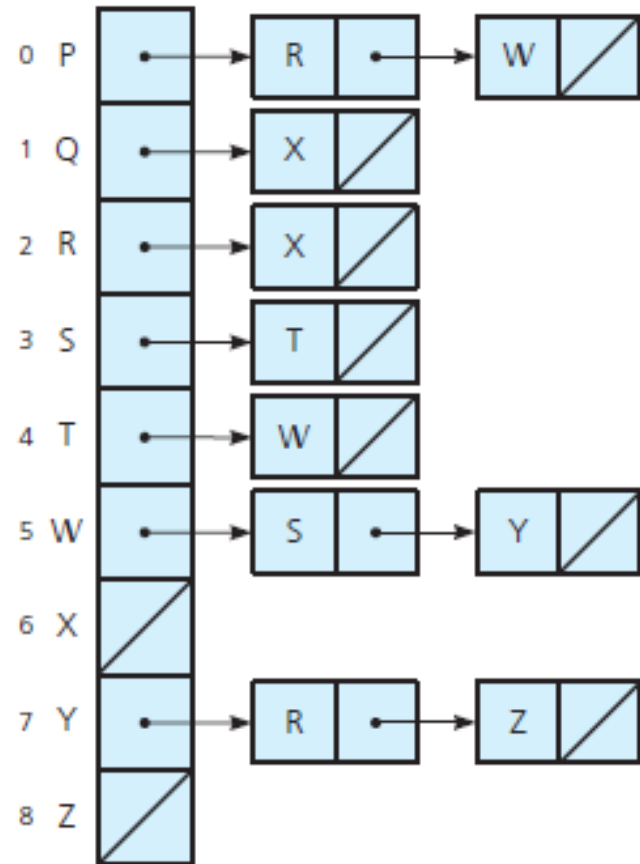
# Adjacency Lists example

Eg2

(a)

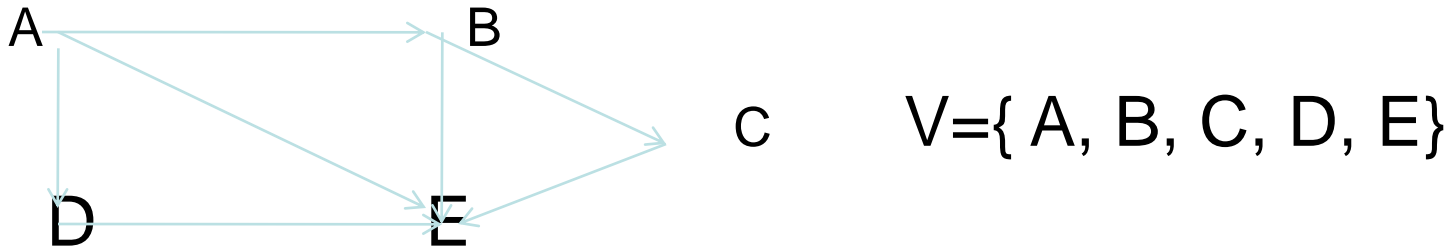


(b)



# Set Representation

- Using edge list.
- Straight forward method of representing graph.
- Two sets are maintained
  1.  $V$ , the set of vertices
  2.  $E$ , the set of edges- which is the subset of  $V \times V$  in sorted form.

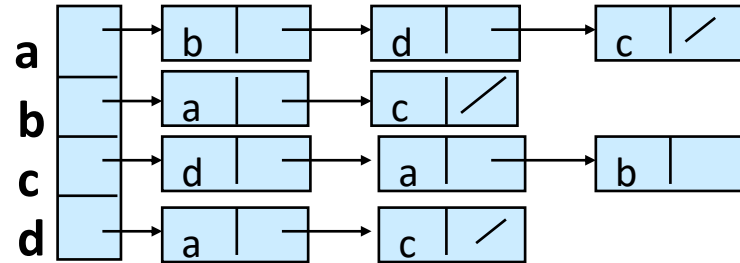
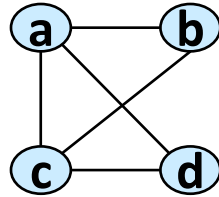


$$E = \{(A, B), (A, D), (A, E), (B, C), (B, E), (D, E), (C, E)\}$$

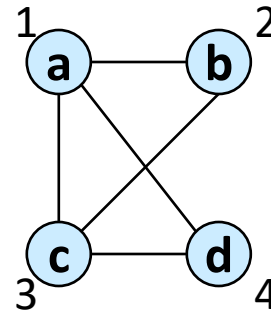
# So, Representation of Graphs..

- Three standard ways.

– Adjacency Lists.



– Adjacency Matrix.



|   | 1 | 2 | 3 | 4 |
|---|---|---|---|---|
| 1 | 0 | 1 | 1 | 1 |
| 2 | 1 | 0 | 1 | 0 |
| 3 | 1 | 1 | 0 | 1 |
| 4 | 1 | 0 | 1 | 0 |

– Edge list.

$$V = \{ a, b, c, d \}$$

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

# Graph traversals

- Problem: find a path between two nodes of the graph (e.g., Austin and Washington)
- Methods:
  1. **Depth-First-Search (DFS)** – use Stack for implementation
  2. **Breadth-First-Search (BFS)** – use Queue for implementation



# Breadth First Search

Using QUEUE

# Graph traversals

- During the execution of DFS or BFS, each node  $N$  of  $G$  will be in one of three states, called **status** of  $N$ :
  - STATUS =1 (**Ready state**) – The initial state of the node  $N$ .
  - STATUS =2 (**Waiting state**) – The node is on stack/queue. Waiting to be processed.
  - STATUS =3 (**Processed state**) – The node  $N$  has been processed.

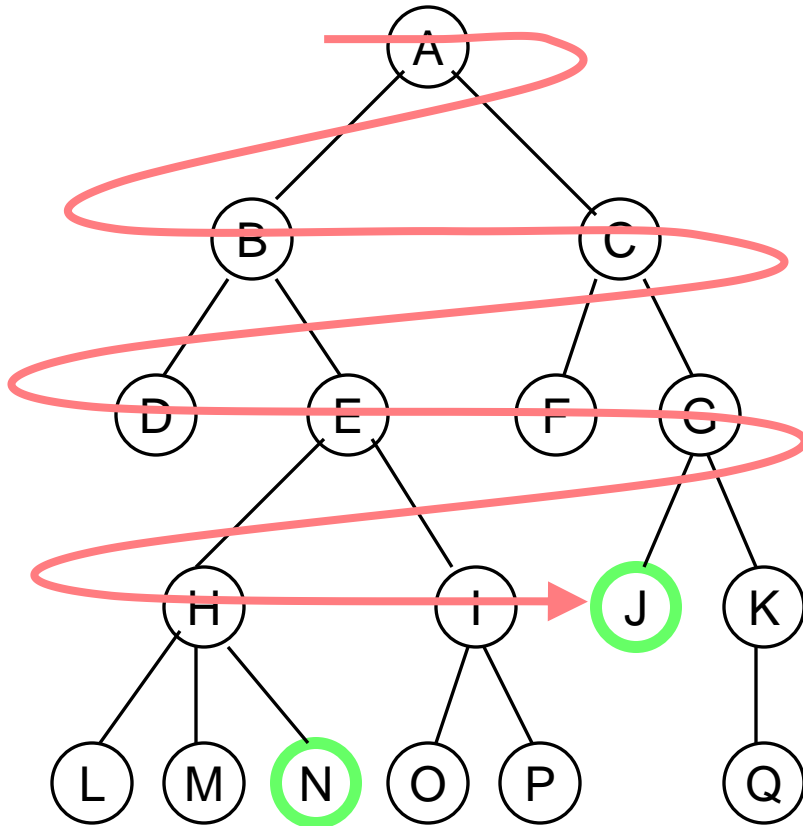
# Breadth-First-Search (BFS)

- What is the idea behind BFS?
  - Look at all possible paths at the same depth before you go at a deeper level
  - Back up *as far as possible* when you reach a "dead end" (i.e., next vertex has been "marked" or there is no next vertex)
  - Its like ripples in the pond.
- BFS can be implemented efficiently using a *queue*

# BFS- rules

- **Rule 1** – Visit adjacent unvisited vertex. Mark it visited. Display it. Insert it in a queue.
- **Rule 2** – If no adjacent vertex found, remove the first vertex from queue.
- **Rule 3** – Repeat Rule 1 and Rule 2 until queue is empty.

# Breadth-first searching

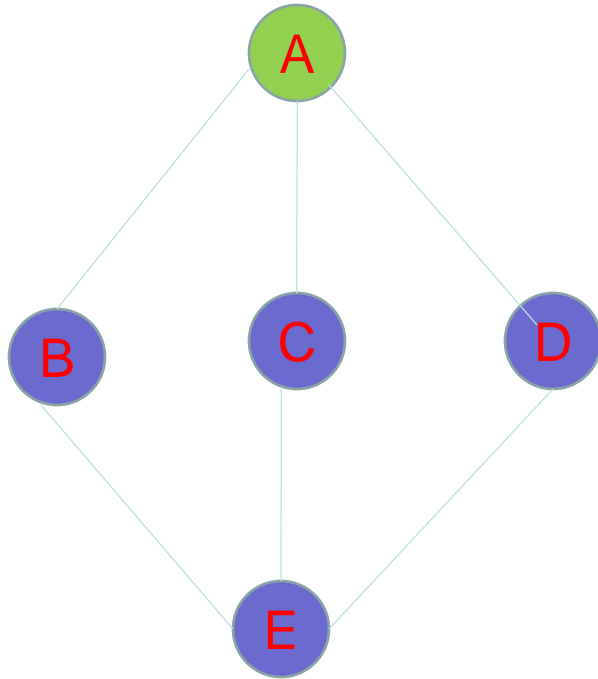


- A breadth-first search (BFS) explores nodes nearest the root before exploring nodes further away
- For example, after searching **A**, then **B**, then **C**, the search proceeds with **D**, **E**, **F**, **G**
- Node are explored in the order **A B C D E F G H I J K L M N O P Q**
- **J** will be found before **N**

# BFS algorithm

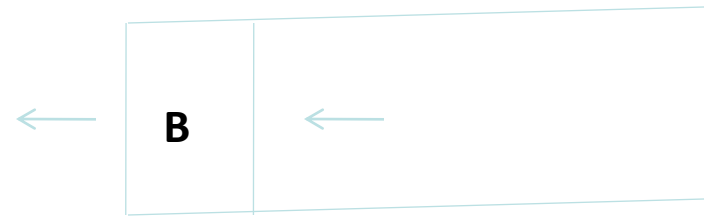
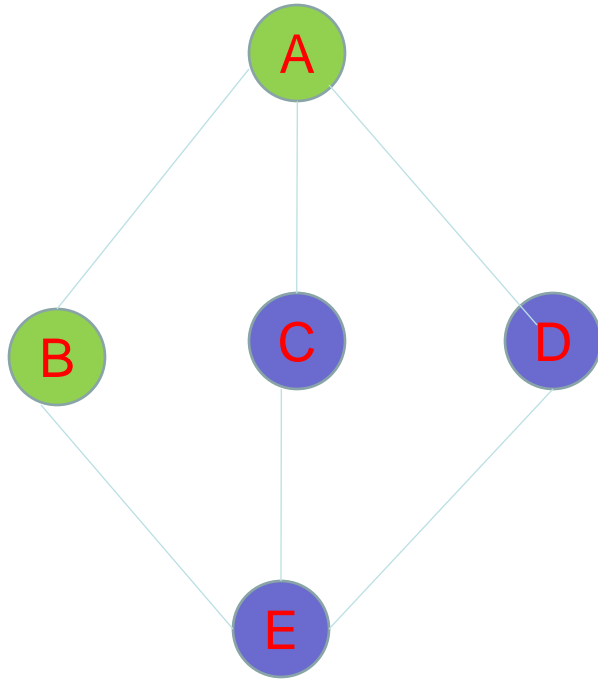
1. Put the starting node in a Queue named OPENQ
2. Repeat until Queue is empty:
3.     Dequeue a node
4.     Process it
5.     Add it's children to queue

# BFS example



- Initially all nodes are in ready state
- Let the starting node be A. Insert in Q
- **Node visited: A**

# BFS example

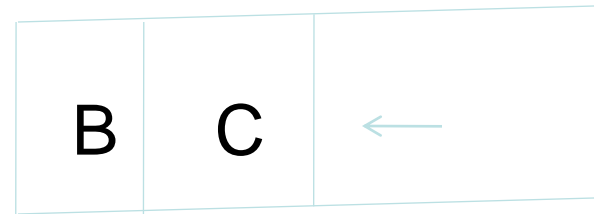
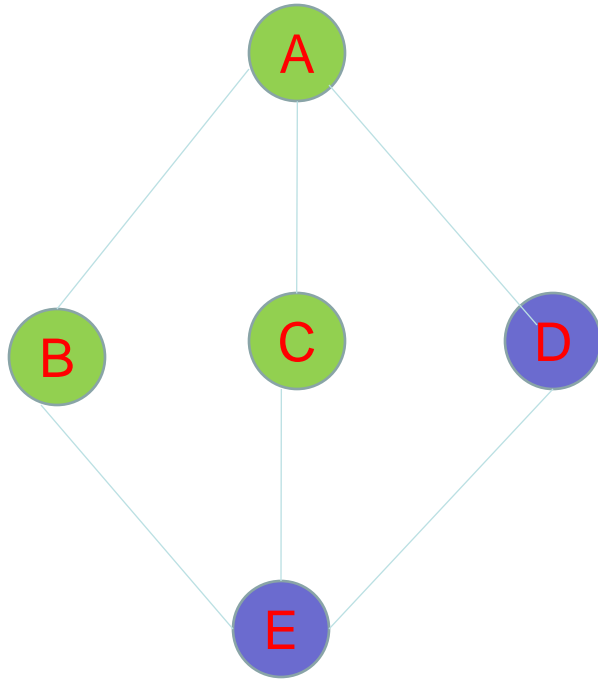


1. Dequeue A
2. Insert the adjacent unvisited vertex of A in queue

**Node visited: A B**



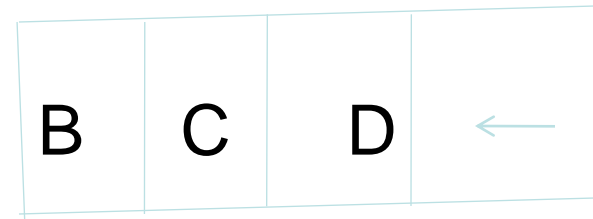
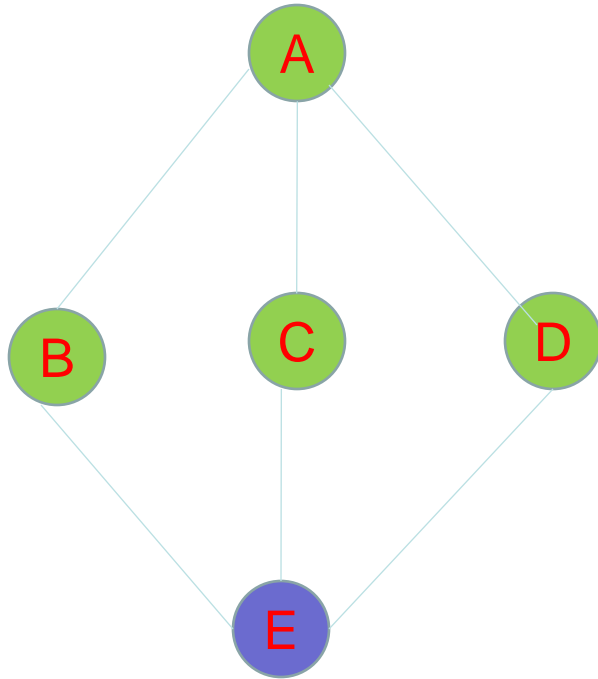
# BFS example



1. Insert the adjacent unvisited vertex of A in queue: C

**Node visited: A B C**

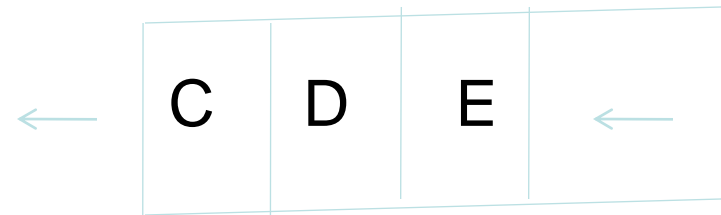
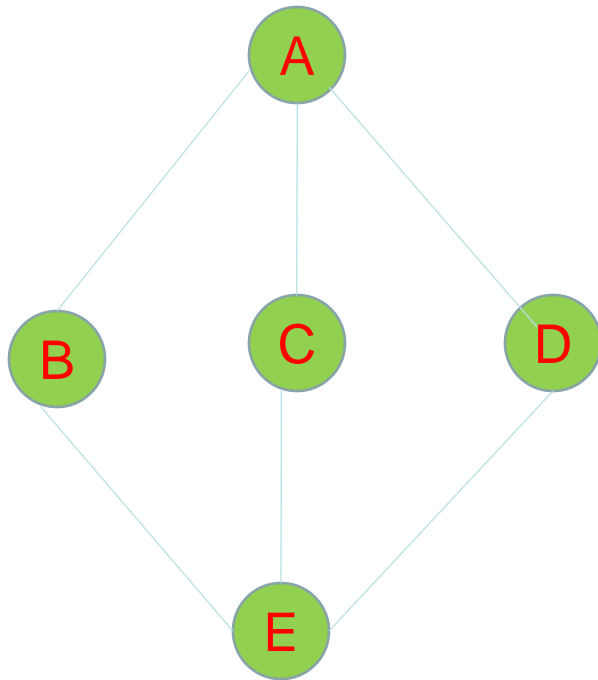
# BFS example



1. Insert the next adjacent unvisited vertex of A in queue

**Node visited: A B C D**

# BFS example

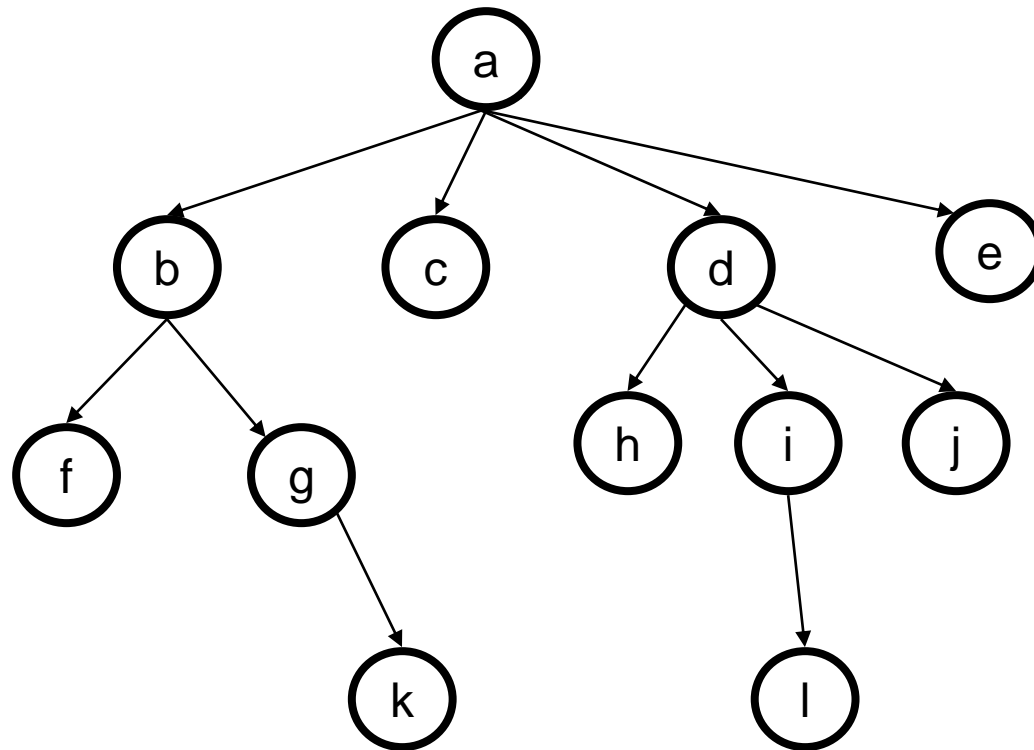


1. Now no unvisited adjacent vertex for A.
2. So dequeue: Remove B and insert its adjacent vertex in queue : E
3. Display E

**Node visited: A B C D E**

# QUEUE: Example 2

a  
bcde  
cdefg  
defg  
efghij  
fghij  
ghij  
hijk  
ijk  
jkl  
kl  
l



Result: a b c d e f g h l j k l

# Depth First Search

Using STACK

- **Depth First Search algorithm(DFS)** traverses a graph in a **depthward motion** and uses a **stack** to remember to get the next vertex to start a search when a dead end occurs in any iteration.

# Depth-First-Search (DFS)

- What is the idea behind DFS?
  - Travel as far as you can down a path.
  - Nodes are visited **deeply** on the left-most branches **before** any nodes are visited on the right-most branches
  - Back up *as little as possible* when you reach a "dead end" (i.e., next vertex has been "marked" or there is no next vertex)
  - It is similar to the **inorder** traversal of a tree.
- DFS can be implemented efficiently using a ***stack***

# DFS- rules

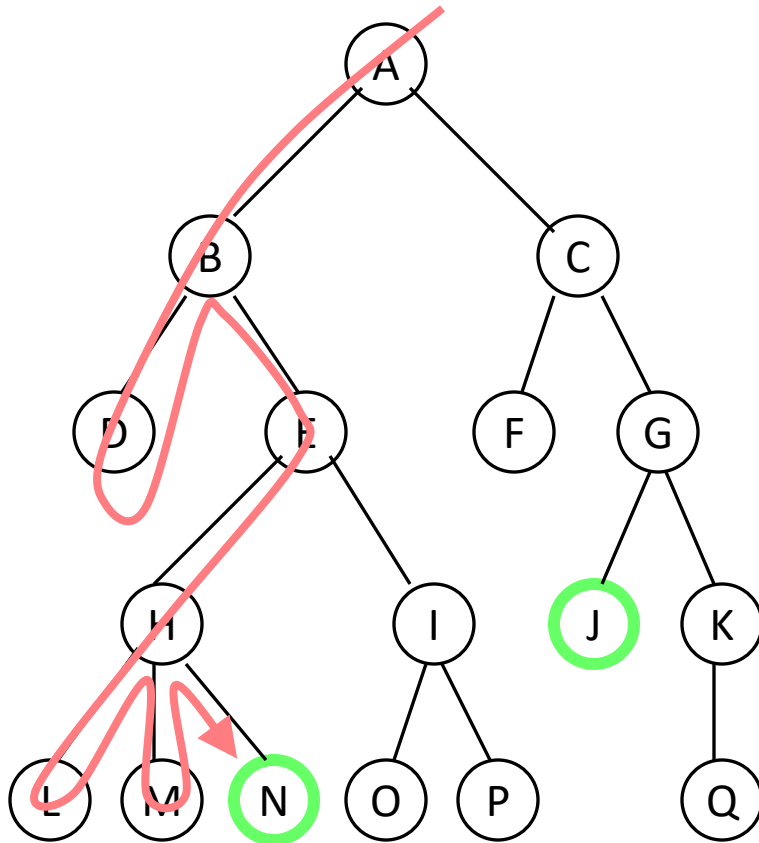
- ▣ **Rule 1** – Visit adjacent unvisited vertex. Mark it visited. Display it. Push it in a stack.
- ▣ **Rule 2** – If no adjacent vertex found, pop up a vertex from stack. (It will pop up all the vertices from the stack which do not have adjacent vertices.)
- ▣ **Rule 3** – Repeat Rule 1 and Rule 2 until stack is empty.



# DFS Algorithm

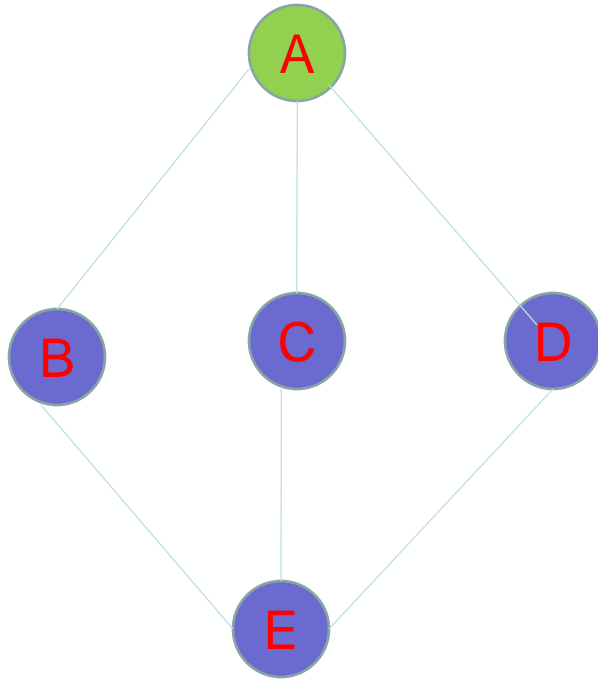
1. Push the starting vertex into the stack OPEN
2. While OPEN is not empty do
3.     POP a vertex  $v$
4.     If  $v$  is not in VISIT
5.     Visit the vertex  $v$
6.     Store  $v$  in VISIT
7.     Push all the adjacent vertices of  $v$  onto  
OPEN

# Depth-first searching



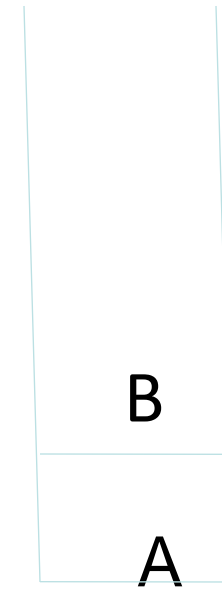
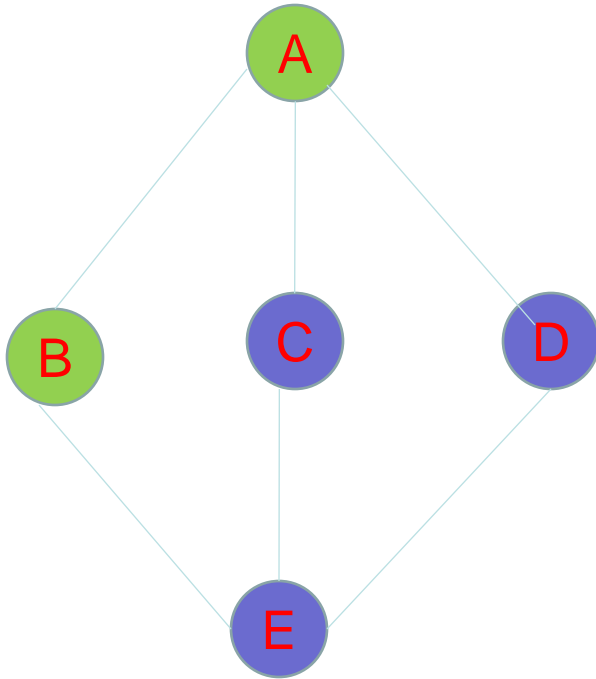
- A depth-first search (DFS) explores a path all the way to a leaf before backtracking and exploring another path
- For example, after searching A, then B, then D, the search backtracks and tries another path from B
- Node are explored in the order **A B D E H L M N I O P C F G J K Q**
- **N** will be found before **J**

# DFS example



- 
- Initially all nodes are in ready state
- Let the starting node be A. Push it on to stack & display it
- **Output: A**

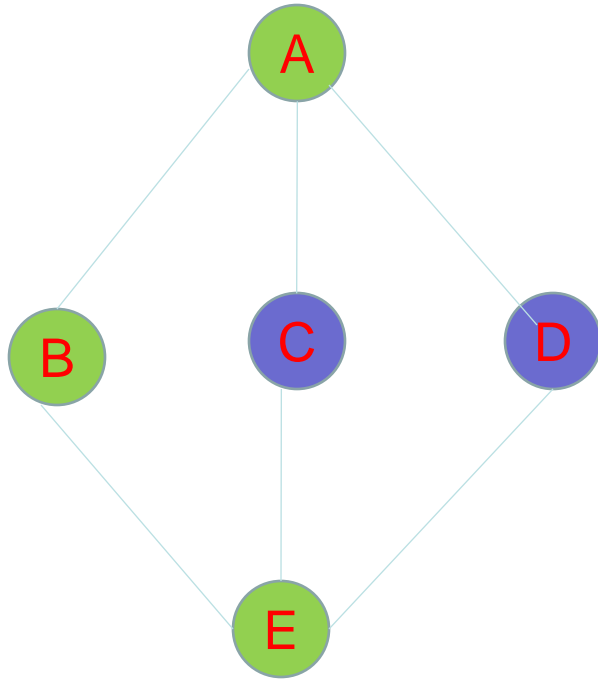
# DFS example



1. Push the adjacent unvisited vertex B onto stack and print it

**Output: A B**

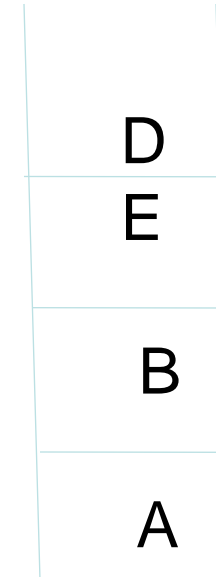
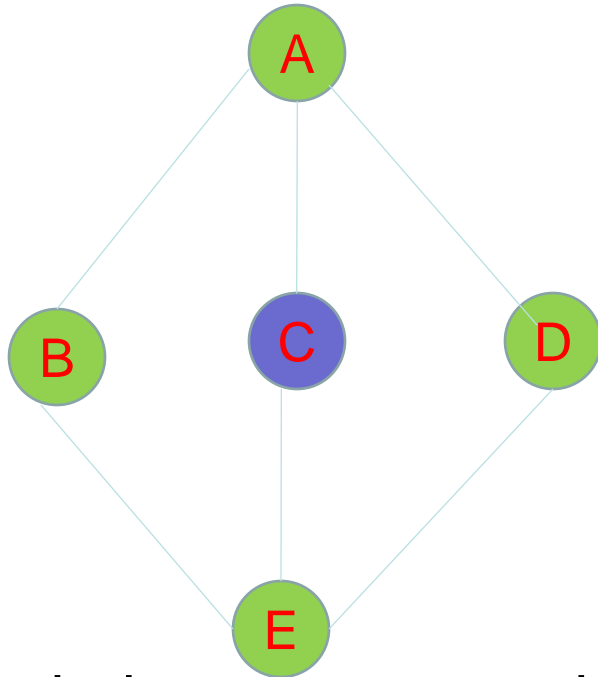
# DFS example



1. Push the adjacent unvisited vertex E onto stack and print it

**Output: A B E**

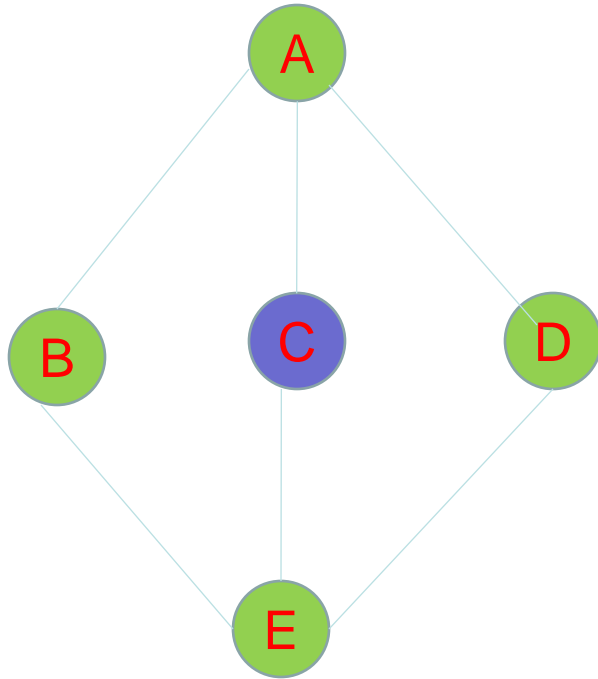
# DFS example



- 1. Push the adjacent unvisited vertex D onto stack and print it

**Output: A B E D**

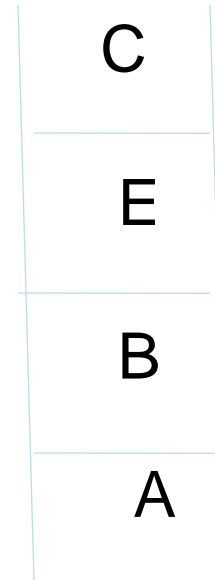
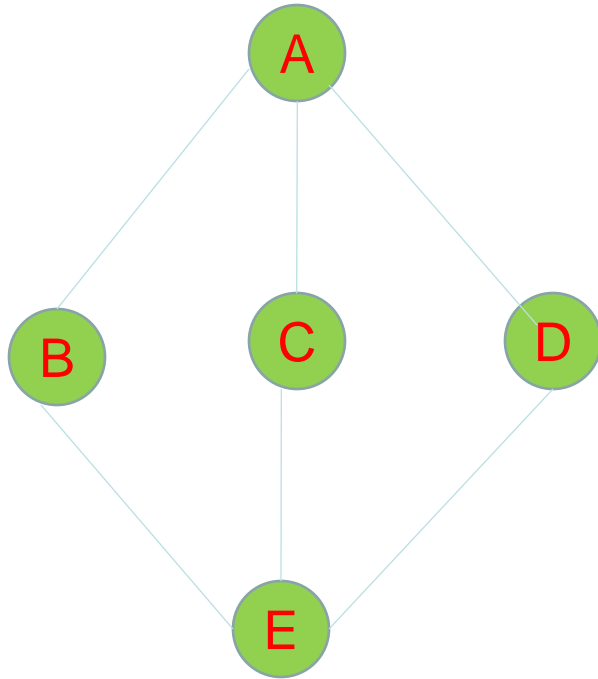
# DFS example



1. Now no adjacent unvisited neighbor for D
2. Pop it and find the unvisited adjacent vertex of stack top

**Output: A B E D**

# DFS example

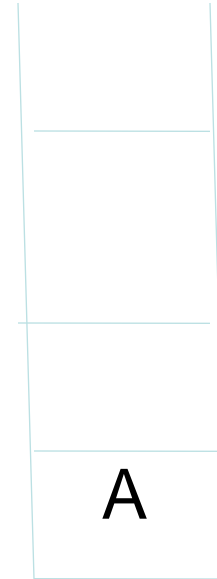
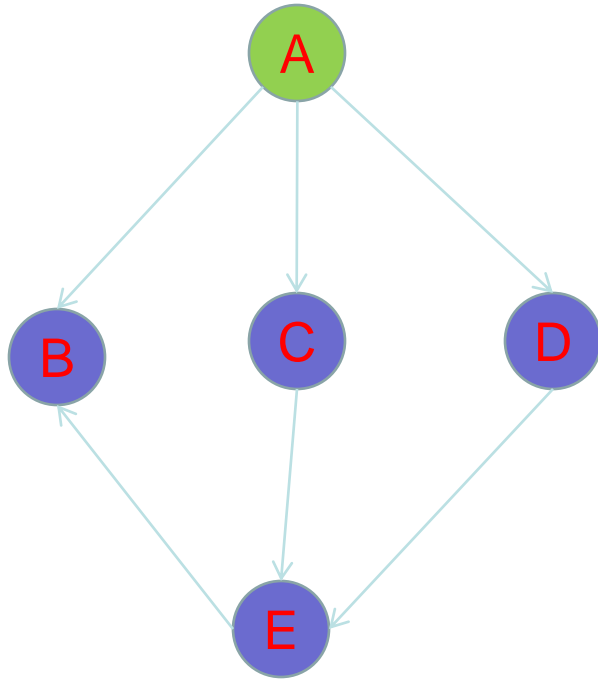


1. Push C on stack and print it
2. Now no unvisited vertex!!

**Output: A B E D C**



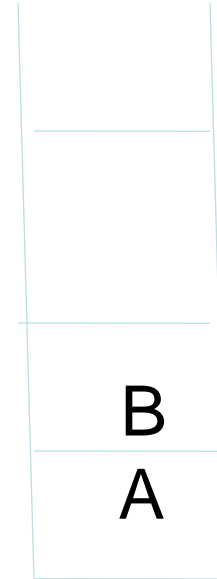
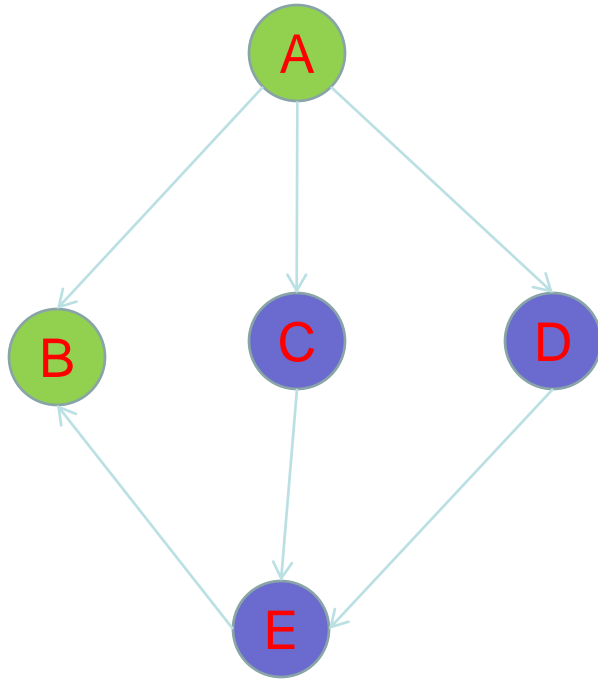
# DFS example:2



1. Push A onto stack

**Output: A**

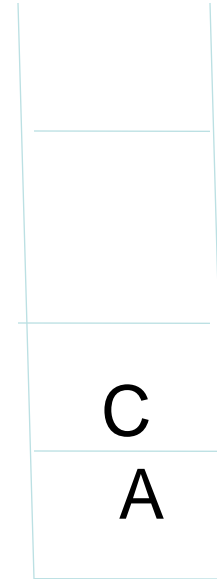
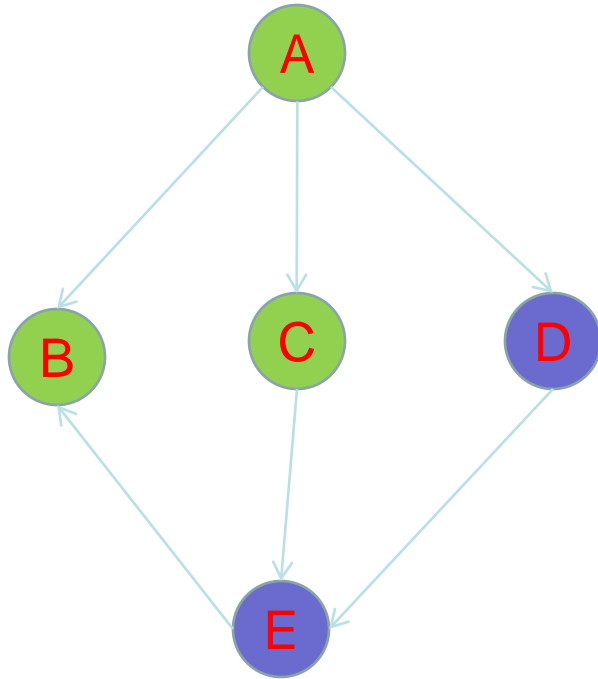
# DFS example:2



1. Push one of the unvisited adjacent vertex B on to stack

**Output: A B**

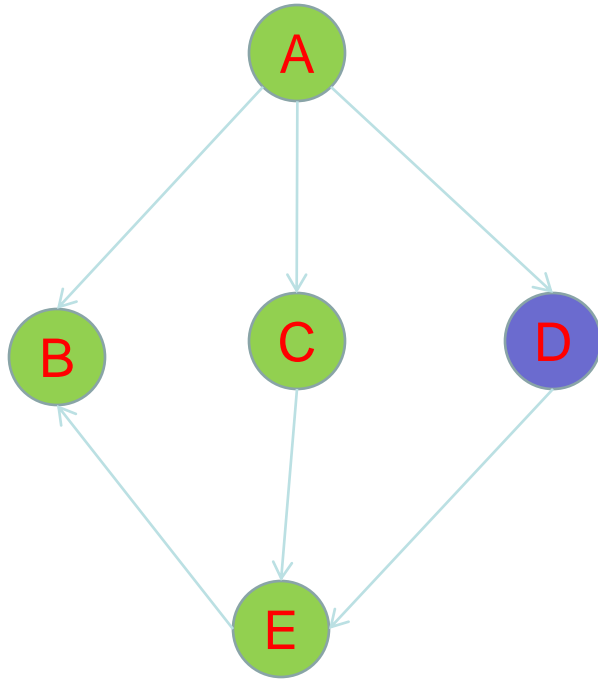
# DFS example:2



1. Now no adjacent neighbor for B.
2. So pop B and push another adjacent vertex of A onto stack

**Output: A B C**

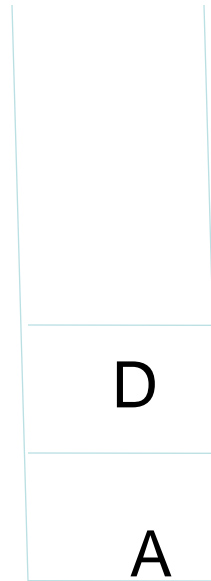
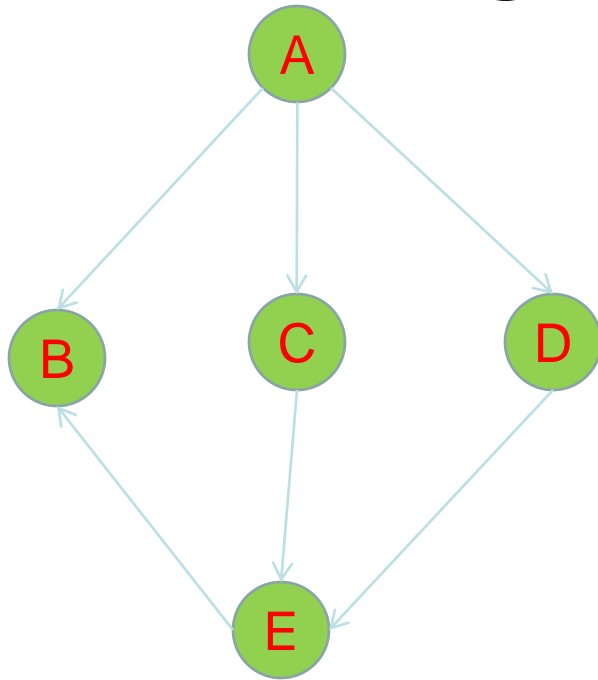
# DFS example:2



1. Push E on stack

**Output: A B C E**

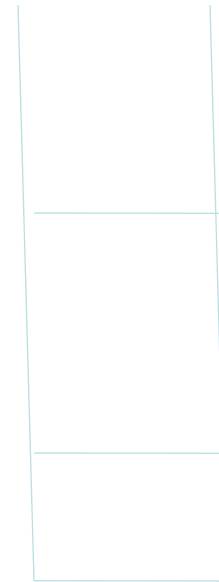
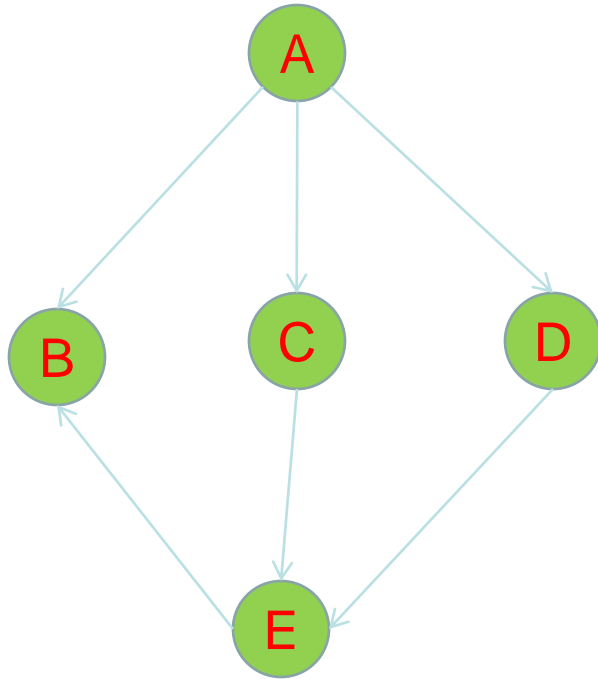
# DFS example:2



1. No unvisited vertex for E.
2. pop E
3. No unvisited adjacent vertex for C also. So pop C
4. Push the unvisited vertex D on to stack and print it

**Output: A B C E D**

# DFS example:2



1. Now no unvisited vertex

**Output: A B C E D**