

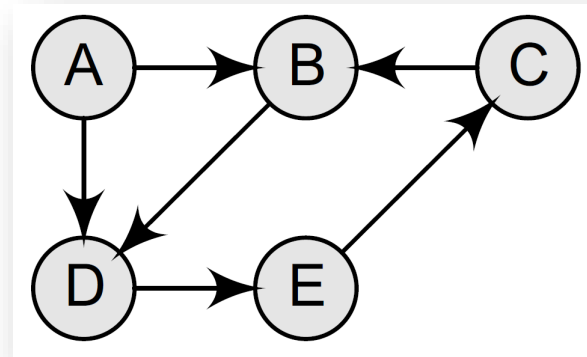
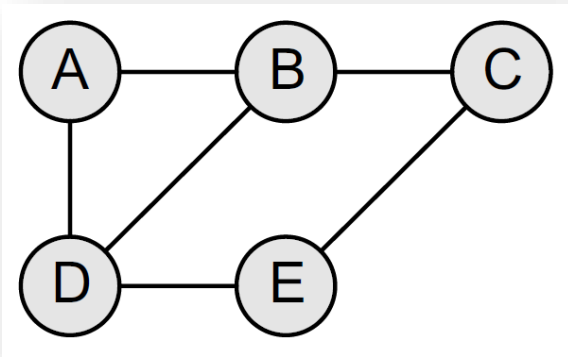
# Advanced Graphs

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# Review

- A graph  $G$  is defined as an ordered set  $(V, E)$ , where  $V(G)$  represents the set of vertices and  $E(G)$  represents the edges
  - For a given undirected graph with  $V(G) = \{A, B, C, D, E\}$  and  $E(G) = \{(A, B), (B, C), (A, D), (B, D), (D, E), (C, E)\}$ 
    - Five vertices or nodes and six edges in the graph

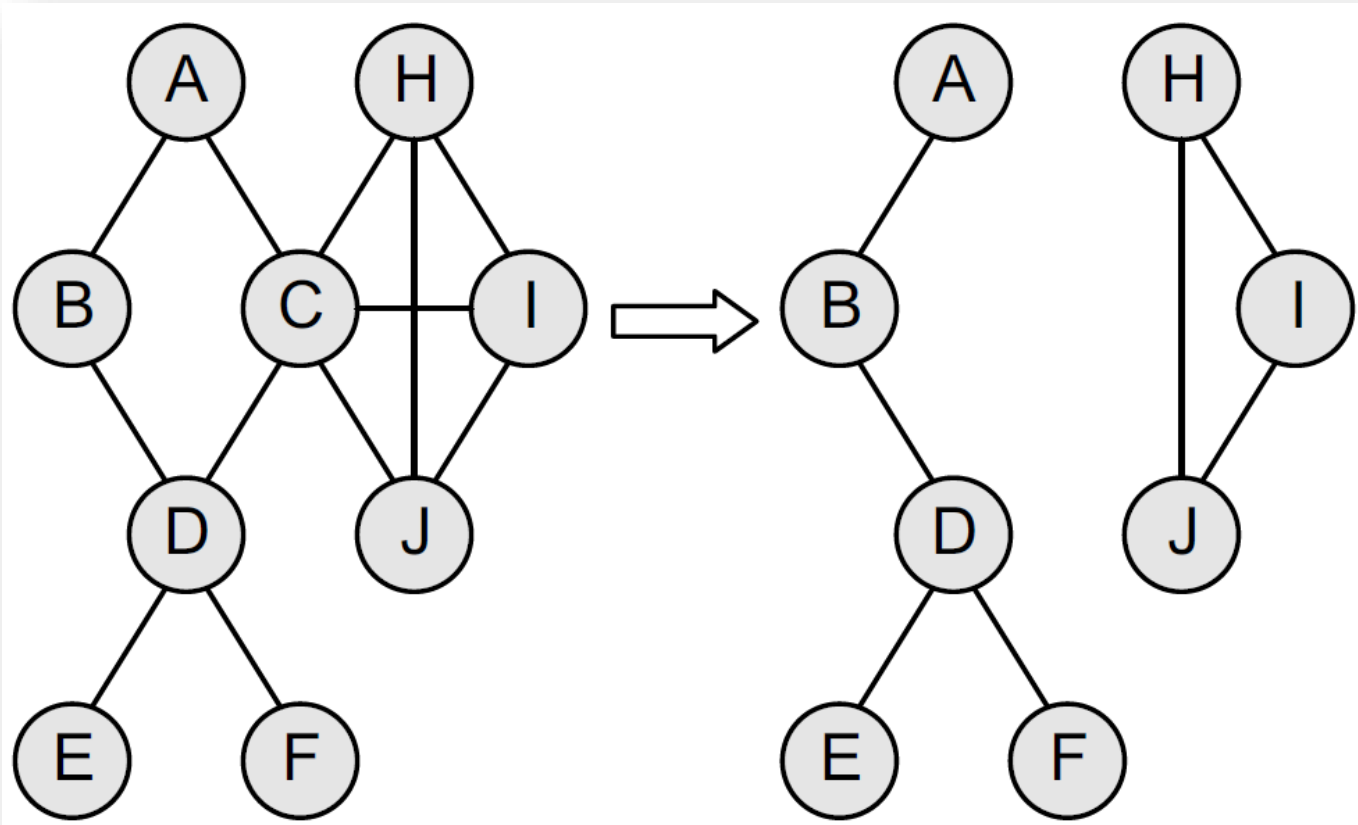


- For a given directed graph, the edge  $(A, B)$  is said to initiate from node  $A$  (also known as initial node) and terminate at node  $B$  (terminal node)

# Bi-connected Components.

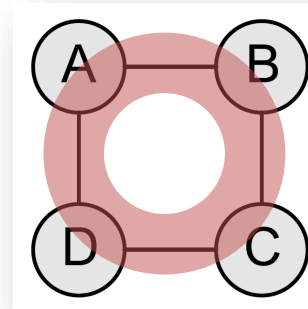
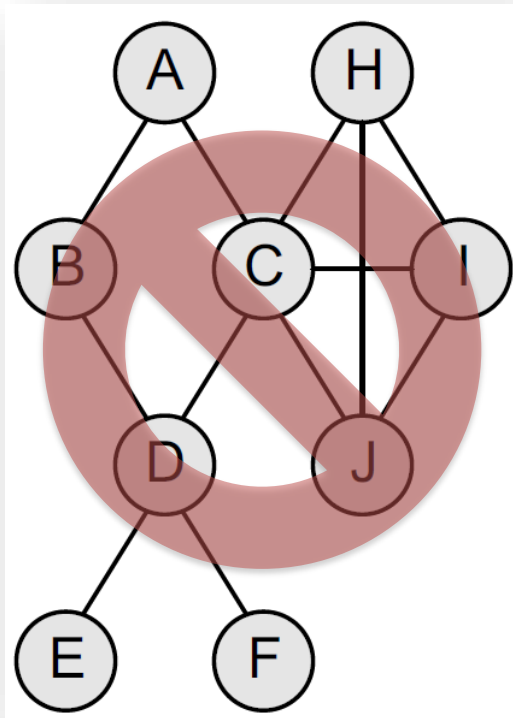
- **Articulation Point**

- A vertex  $v$  of  $G$  is called an articulation point, if removing  $v$  along with the edges incident on  $v$ , results in a graph that has at least two connected components



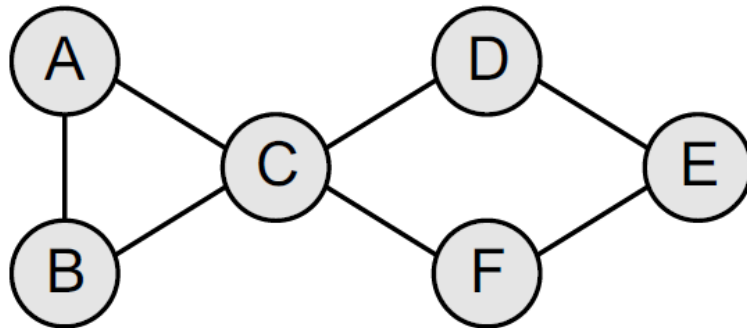
# Bi-connected Components..

- A **bi-connected graph** is defined as a connected graph that has no articulation vertices
  - In other words, a bi-connected graph is connected and non-separable in the sense that even if we remove any vertex from the graph, the resultant graph is still connected

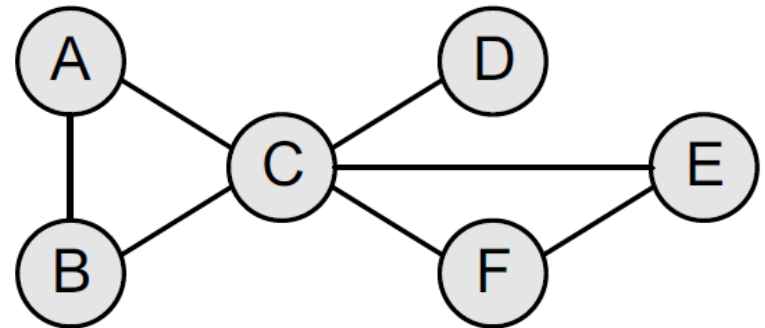


# Bridge

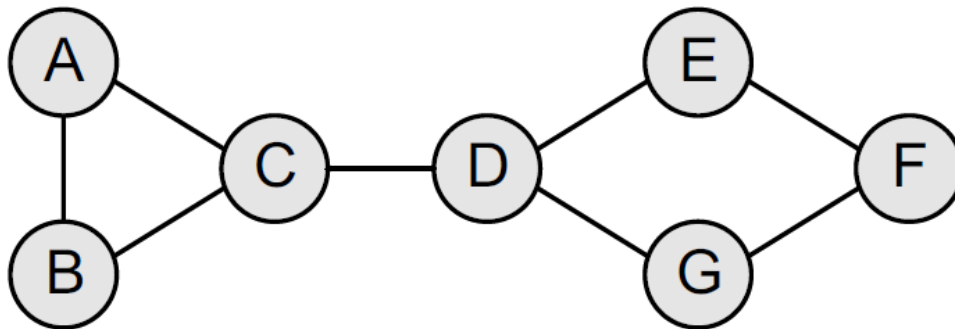
- An edge in a graph is called a **bridge** if removing that edge results in a disconnected graph



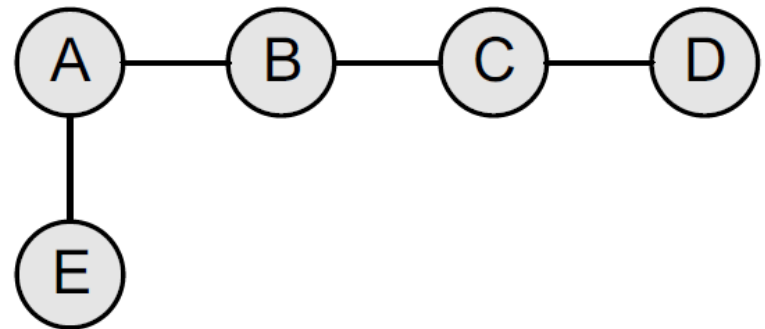
(There are no bridges)



(CD is a bridge)



(CD is a bridge)



(All edges are bridges)

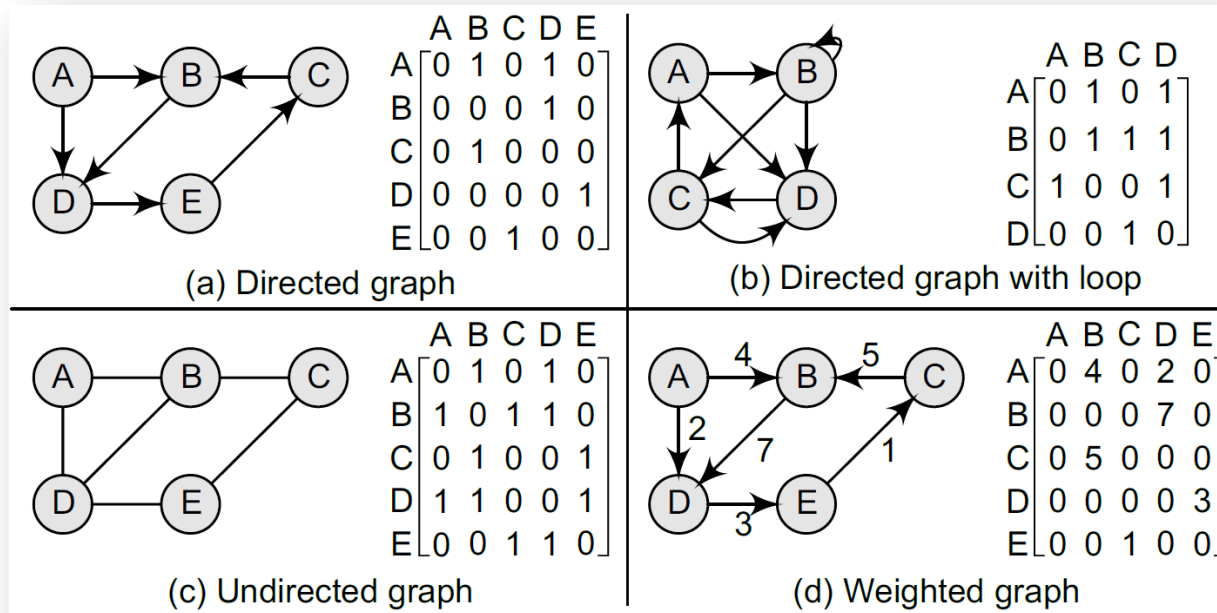
# Representation of Graphs

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- There are three common ways of storing graphs in the computer's memory
  - **Sequential representation** by using an adjacency matrix
  - **Linked representation** by using an adjacency list that stores the neighbors of a node using a linked list
  - **Adjacency multi-list** which is an extension of linked representation

# Sequential Representation.

- For any graph  $G$  having  $n$  nodes, the adjacency matrix will have the dimension of  $n \times n$ 
  - The rows and columns are labelled by graph vertices
  - An entry  $a_{ij}$  in the adjacency matrix will contain 1, if vertices  $v_i$  and  $v_j$  are adjacent to each other; otherwise,  $a_{ij}$  will set to 0
    - Since an adjacency matrix contains only 0s and 1s, it is called a **bit matrix** or a **Boolean matrix**



# Sequential Representation..

- From the original adjacency matrix, denoted by  $A^1$ 
  - An entry 1 in the  $i^{th}$  row and  $j^{th}$  column means that there exists a path of length 1 from  $v_i$  to  $v_j$

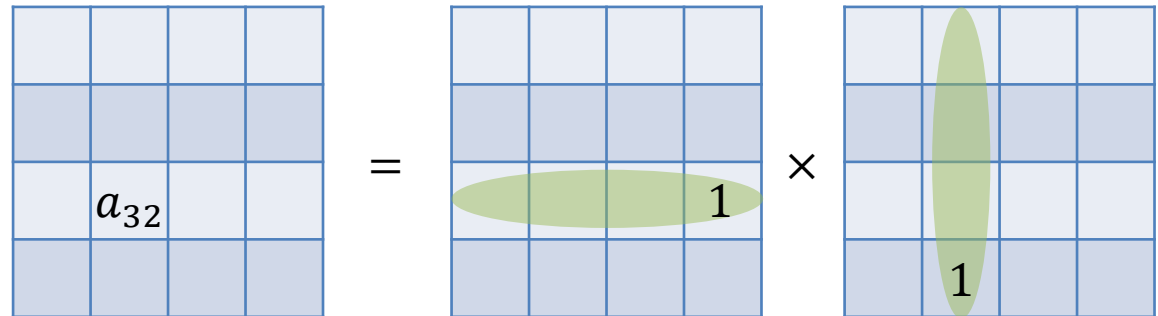
- Let's consider  $A^2$

- $A^2 = A^1 \times A^1$

- $a_{ij}^2 = \sum a_{ik} a_{kj}$

- If  $a_{ij}^2 \geq 1$ ,  $\exists k$  such that  $a_{ik} = 1 \wedge a_{kj} = 1$

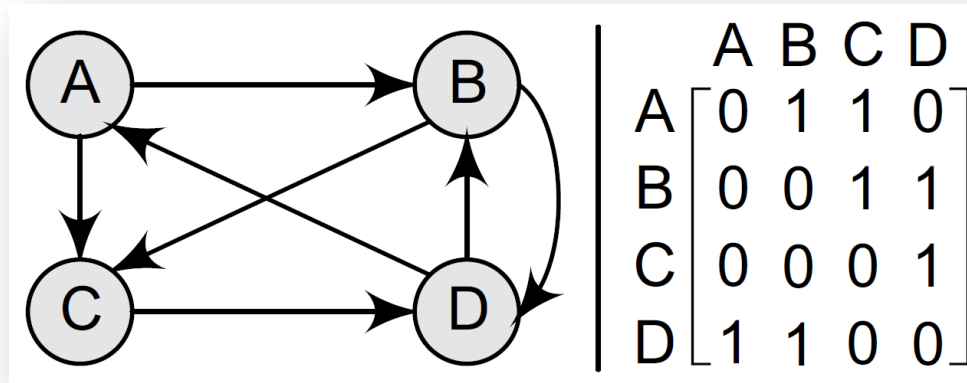
- That is, if there is an edge  $(v_i, v_k)$  and  $(v_k, v_j)$ , then there is a path from  $v_i$  to  $v_j$  of length 2



- Similarly, every entry in the  $i^{th}$  row and  $j^{th}$  column of  $A^n$  gives the number of paths of length  $n$  from node  $v_i$  to  $v_j$

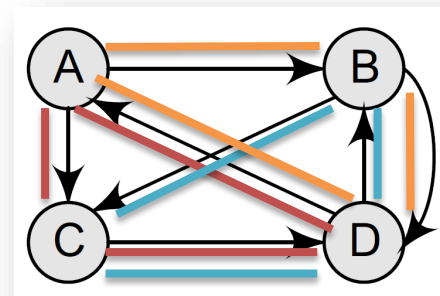


# Sequential Representation...

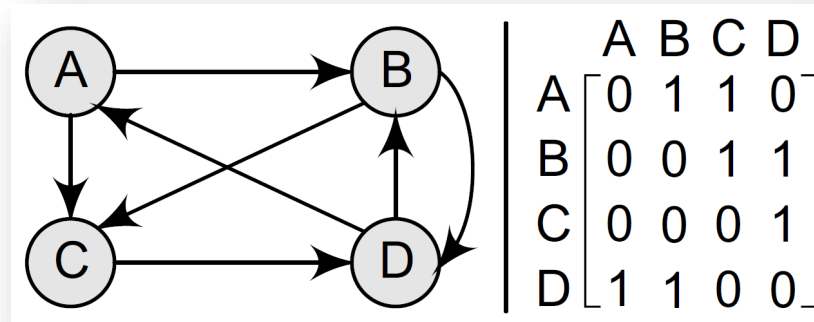


$$- A^2 = A^1 \times A^1 = \begin{bmatrix} 0012 \\ 1101 \\ 1100 \\ 0121 \end{bmatrix}$$

$$- A^3 = A^2 \times A^1 = \begin{bmatrix} 2201 \\ 1221 \\ 0121 \\ 1113 \end{bmatrix}$$



# Sequential Representation....



- We can further define a matrix  $B^n = A^1 + \dots + A^n$

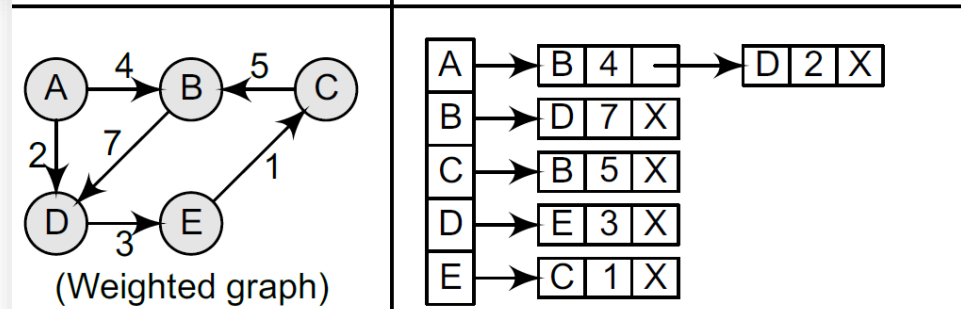
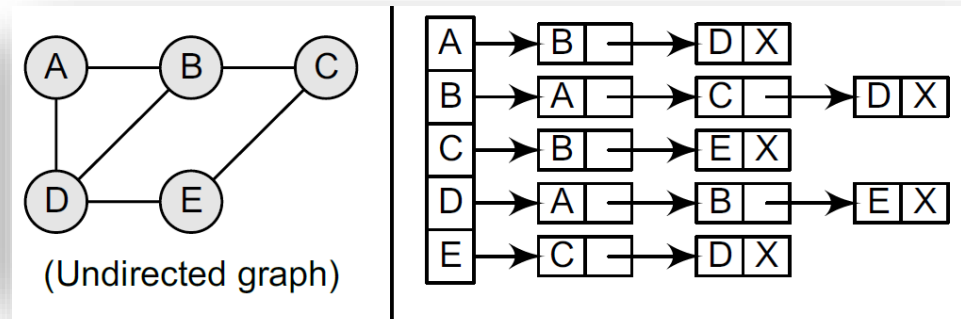
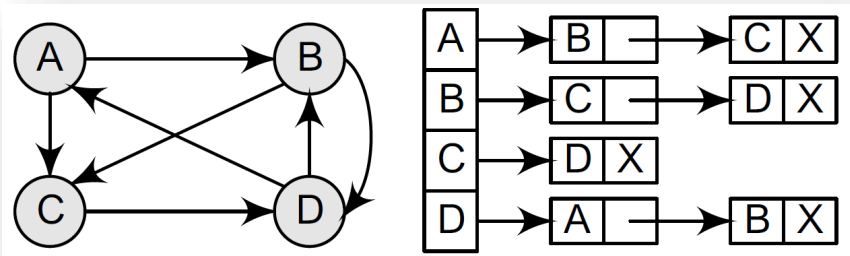
$$\bullet B^3 = A^1 + A^2 + A^3 = \begin{bmatrix} 0 & 1 & 1 & 0 \\ 0 & 0 & 1 & 1 \\ 0 & 0 & 0 & 1 \\ 1 & 1 & 0 & 0 \end{bmatrix} + \begin{bmatrix} 0 & 0 & 1 & 2 \\ 1 & 1 & 0 & 1 \\ 1 & 1 & 0 & 0 \\ 0 & 1 & 2 & 1 \end{bmatrix} + \begin{bmatrix} 2 & 2 & 0 & 1 \\ 1 & 2 & 2 & 1 \\ 0 & 1 & 2 & 1 \\ 1 & 1 & 1 & 3 \end{bmatrix} = \begin{bmatrix} 2 & 3 & 2 & 3 \\ 2 & 3 & 3 & 3 \\ 1 & 2 & 2 & 2 \\ 2 & 3 & 3 & 4 \end{bmatrix}$$

- A path matrix  $P$  can be obtained by setting an entry  $p_{ij} = 1$ , if  $b_{ij}$  is non-zero and  $p_{ij} = 0$ , if otherwise

$$\bullet P = \begin{bmatrix} 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \\ 1 & 1 & 1 & 1 \end{bmatrix}$$

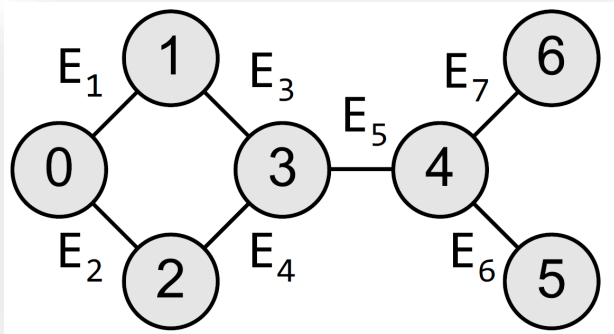
# Linked Representation

- An adjacency list is another way in which graphs can be represented in the computer's memory
  - It is often used for storing graphs that have a small-to-moderate number of edges
    - That is, an adjacency list is preferred for representing **sparse graphs** in the computer's memory; otherwise, an adjacency matrix is a good choice



# Adjacency Multi-list.

- Graphs can also be represented using multi-lists which can be said to be modified version of adjacency lists
  - Adjacency multi-list is an **edge-based** rather than a **vertex-based** representation of graphs



Edge 1

	0	1	Edge 2	Edge 3
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Edge 2

	0	2	NULL	Edge 4
--	---	---	------	--------

Edge 3

	1	3	NULL	Edge 4
--	---	---	------	--------

Edge 4

	2	3	NULL	Edge 5
--	---	---	------	--------

Edge 5

	3	4	NULL	Edge 6
--	---	---	------	--------

Edge 6

	4	5	Edge 7	NULL
--	---	---	--------	------

Edge 7

	4	6	NULL	NULL
--	---	---	------	------

# Adjacency Multi-list..

Edge 1		0	1	Edge 2	Edge 3
Edge 2		0	2	NULL	Edge 4
Edge 3		1	3	NULL	Edge 4
Edge 4		2	3	NULL	Edge 5
Edge 5		3	4	NULL	Edge 6
Edge 6		4	5	Edge 7	NULL
Edge 7		4	6	NULL	NULL

VERTEX	LIST OF EDGES
0	Edge 1, Edge 2
1	Edge 1, Edge 3
2	Edge 2, Edge 4
3	Edge 3, Edge 4, Edge 5
4	Edge 5, Edge 6, Edge 7
5	Edge 6
6	Edge 7

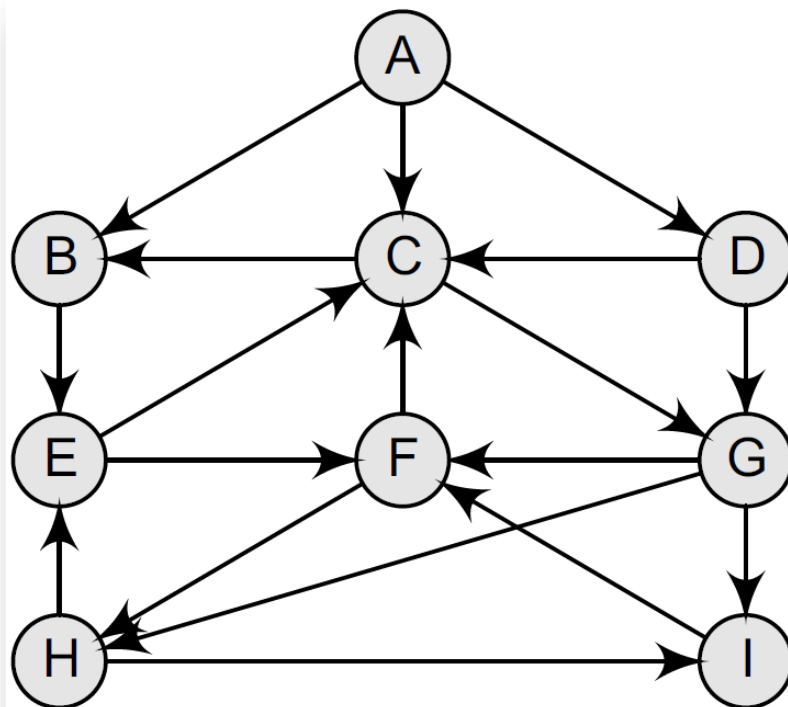
# Traversal Algorithms

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- By traversing a graph, we mean the method of examining the nodes and edges of the graph
  - Breadth-first search
    - BFS uses a **queue** as an auxiliary data structure to store nodes for further processing
  - Depth-first search
    - DFS uses a **stack** to store nodes for further processing

# Breadth-first Search.

- Breadth-first search (BFS) is a graph search algorithm that begins at the root node and explores all the neighboring nodes
  - Given a directed graph, please find a minimum path from *A* to *I* by using BFS



## Adjacency lists

A: B, C, D

B: E

C: B, G

D: C, G

E: C, F

F: C, H

G: F, H, I

H: E, I

I: F

# Breadth-first Search..

- **QUEUE** is used to hold the nodes that have to be processed, **ORIG** is used to keep track of the origin of each edge

– Step 1:

QUEUE =	A
ORIG =	\0

– Step 2:

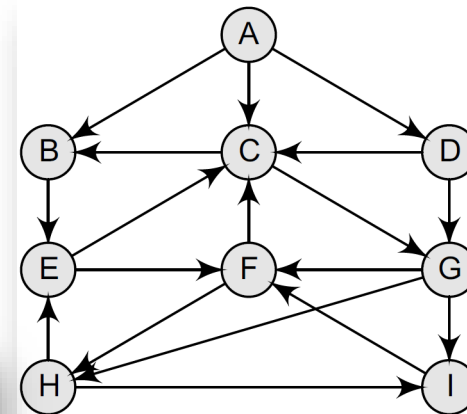
QUEUE =	A	B	C	D
ORIG =	\0	A	A	A

– Step 3:

QUEUE =	A	B	C	D	E
ORIG =	\0	A	A	A	B

– Step 4:

QUEUE =	A	B	C	D	E	G
ORIG =	\0	A	A	A	B	C



## Adjacency lists

A: B, C, D  
 B: E  
 C: B, G  
 D: C, G  
 E: C, F  
 F: C, H  
 G: F, H, I  
 H: E, I  
 I: F



# Breadth-first Search...

– Step 5:

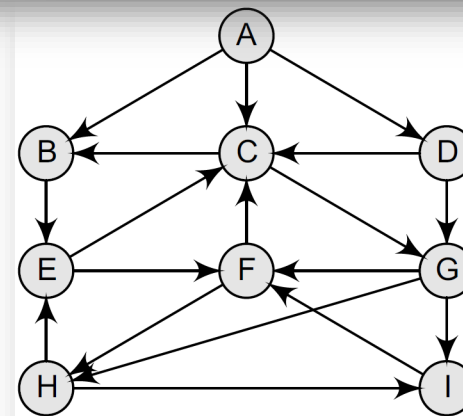
QUEUE =	A	B	C	D	E	G
ORIG =	\0	A	A	A	B	C

– Step 6:

QUEUE =	A	B	C	D	E	G	F
ORIG =	\0	A	A	A	B	C	E

– Step 7:

QUEUE =	A	B	C	D	E	G	F	H	I
ORIG =	\0	A	A	A	B	C	E	G	G



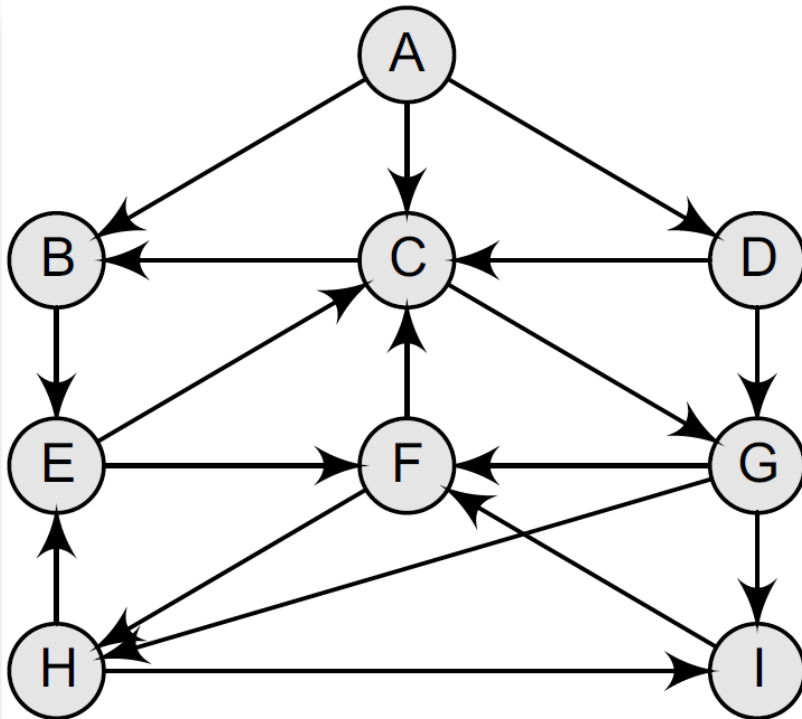
## Adjacency lists

A: B, C, D  
B: E  
C: B, G  
D: C, G  
E: C, F  
F: C, H  
G: F, H, I  
H: E, I  
I: F

# Breadth-first Search....

- Final, by referring to ORIG, the minimum path is  $A \rightarrow C \rightarrow G \rightarrow I$

QUEUE =	A	B	C	D	E	G	F	H	I
ORIG =	\0	A	A	A	B	C	E	G	G



## Adjacency lists

A: B, C, D

B: E

C: B, G

D: C, G

E: C, F

F: C, H

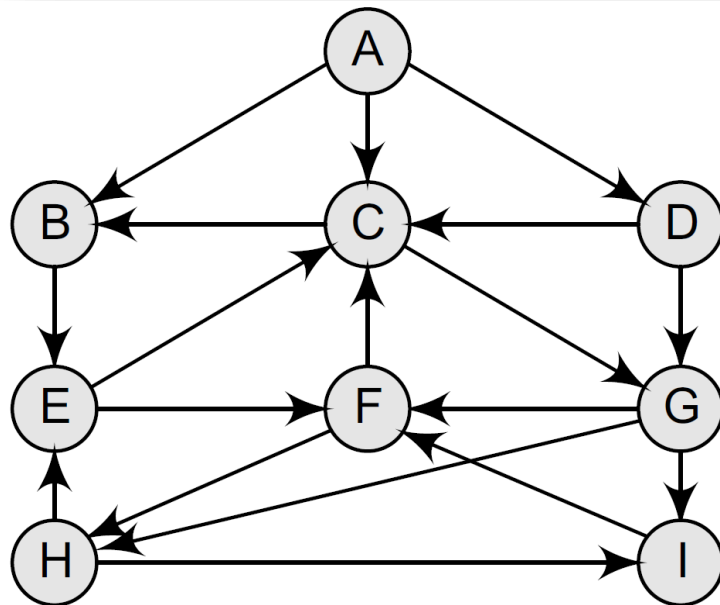
G: F, H, I

H: E, I

I: F

# Depth-first Search.

- The depth-first search algorithm progresses by expanding the starting node of  $G$  and then going deeper and deeper until the goal node is found, or until a node that has no children is encountered
  - Given a graph  $G$  and its adjacency list, please print all the nodes that can be reached from the node  $H$  (including  $H$  itself) by leveraging DFS



## Adjacency lists

A: B, C, D

B: E

C: B, G

D: C, G

E: C, F

F: C, H

G: F, H, I

H: E, I

I: F

# Depth-first Search..

- Step 1: Push  $H$  onto the stack

STACK: H

- Step 2:

- Pop and print the top element of the stack (i.e.,  $H$ )
- Push all the neighbors of  $H$  onto the stack

PRINT: H

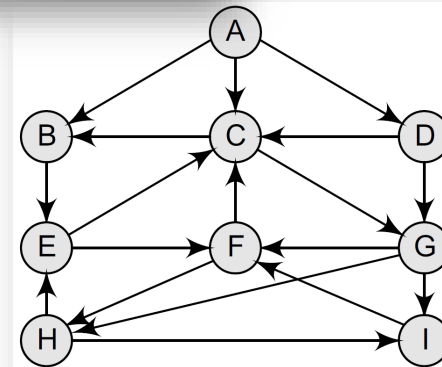
STACK: E, I

- Step 3:

- Pop and print the top element of the stack (i.e.,  $I$ )
- Push all the neighbors of  $I$  onto the stack

PRINT: I

STACK: E, F



## Adjacency lists

A: B, C, D  
B: E  
C: B, G  
D: C, G  
E: C, F  
F: C, H  
G: F, H, I  
H: E, I  
I: F

# Depth-first Search...

– Step 4:

- Pop and print the top element of the stack (i.e.,  $F$ )
- Push all the neighbors of  $F$  onto the stack

PRINT: F

STACK: E, C

– Step 5:

- Pop and print the top element of the stack (i.e.,  $C$ )
- Push all the neighbors of  $C$  onto the stack

PRINT: C

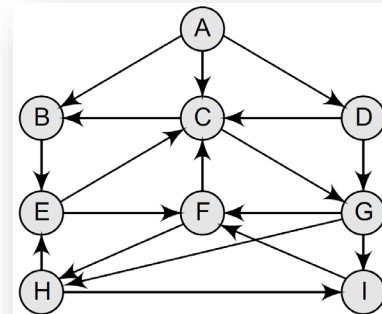
STACK: E, B, G

– Step 6:

- Pop and print the top element of the stack (i.e.,  $G$ )
- Push all the neighbors of  $G$  onto the stack

PRINT: G

STACK: E, B



**Adjacency lists**

A: B, C, D  
B: E  
C: B, G  
D: C, G  
E: C, F  
F: C, H  
G: F, H, I  
H: E, I  
I: F

# Depth-first Search....

– Step 7:

- Pop and print the top element of the stack (i.e.,  $B$ )
- Push all the neighbors of  $B$  onto the stack

PRINT: B

STACK: E

– Step 8:

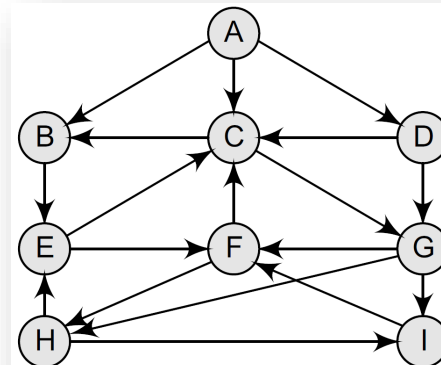
- Pop and print the top element of the stack (i.e.,  $E$ )
- Push all the neighbors of  $E$  onto the stack

PRINT: E

STACK:

- Since the stack is empty, the depth-first search of  $G$  starting at node  $H$  is complete and the nodes which were printed are

H, I, F, C, G, B, E



## Adjacency lists

A: B, C, D

B: E

C: B, G

D: C, G

E: C, F

F: C, H

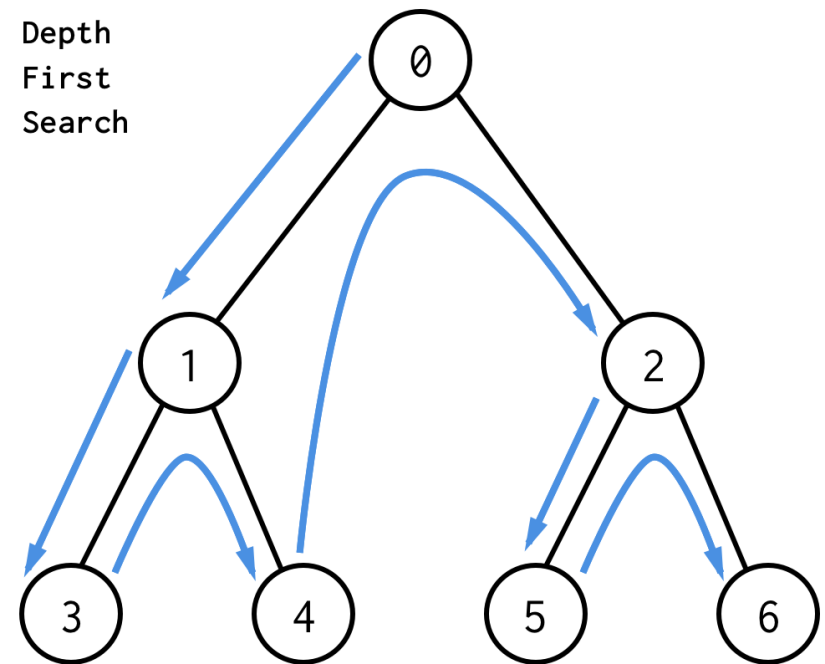
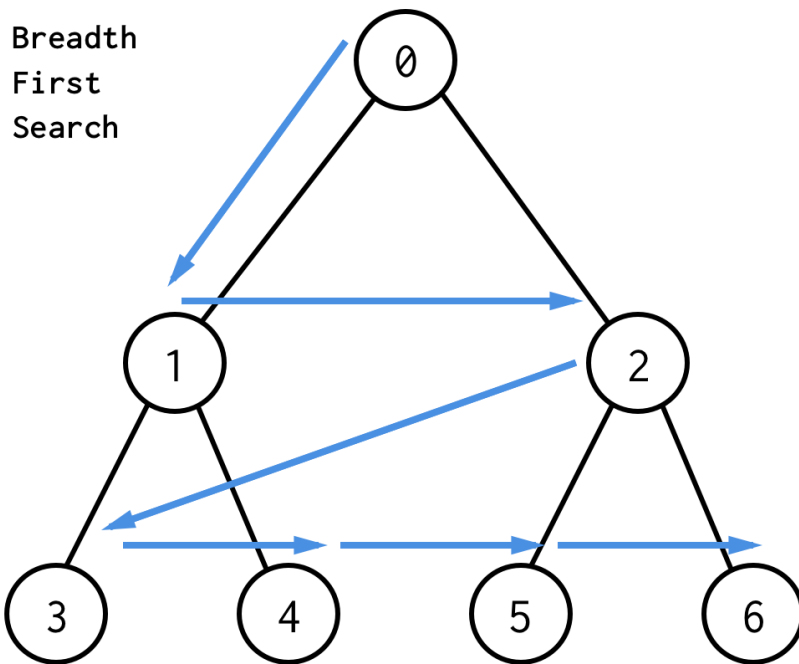
G: F, H, I

H: E, I

I: F

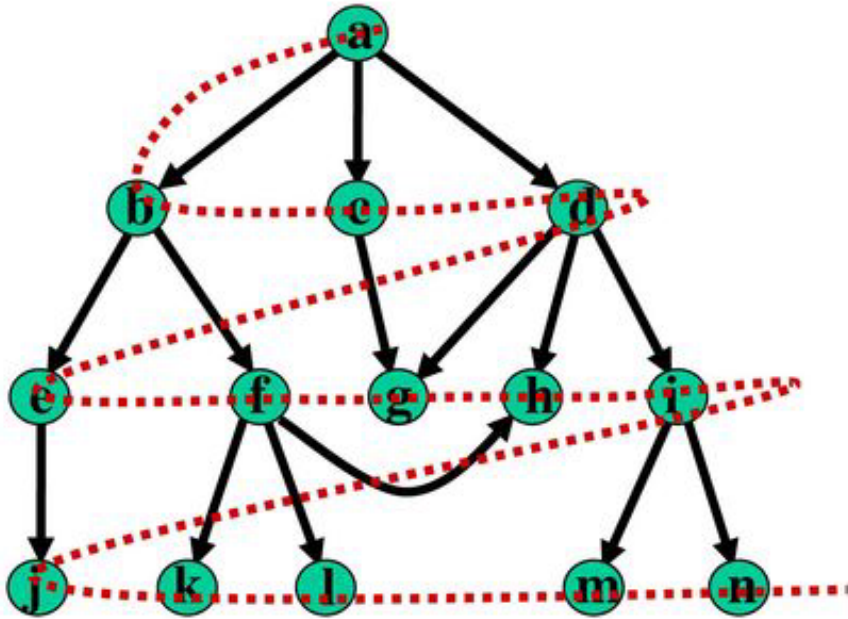
# BFS & DFS.

- <https://www.quora.com/What-are-the-differences-between-DFS-and-BFS>



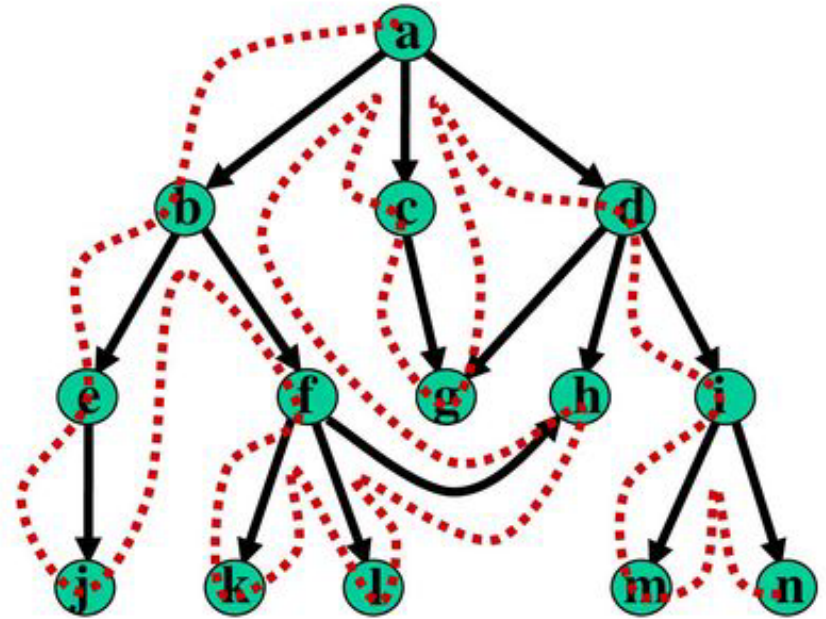
# BFS & DFS..

- <https://slideplayer.com/slide/12046827/>



BFS

a,b,c,d,e,f,g,h,i,j,k,l,m,n



DFS

a,b,e,j,f,k,l,h,c,g,d,i,m,n



# Questions?

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