Graphs

dont be scared it only contains dfs,bfs

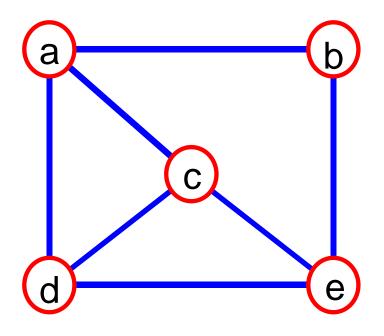
What is a Graph?

A graph G = (V,E) is composed of:

V: a finite, nonempty set of vertices

E: set of edges connecting the vertices in V

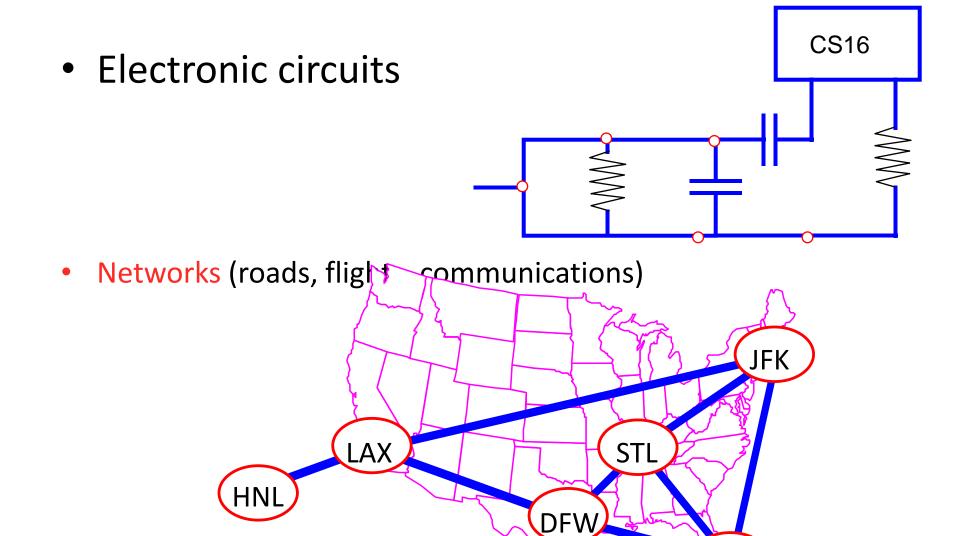
- An edge e = (u,v) is a pair of vertices
- Example:



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

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

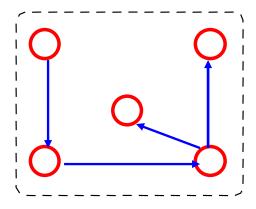
Applications



FTL

Directed Graph

A graph where edges are directed



Directed vs. Undirected Graph

- An undirected graph is one in which the pair of vertices in an edge is unordered,
 (v₀, v₁) = (v₁,v₀)
- A directed graph is one in which each edge is a directed pair of vertices, <v₀, v₁>!= <v₁,v₀>

tail head

Terminology: Adjacent and Incident

- If (v₀, v₁) is an edge in an undirected graph,
 - − v₀ and v₁ are adjacent
 - The edge (v_0, v_1) is incident on vertices v_0 and v_1
- If (v₀, v₁) is an edge in a directed graph
 - $-v_0$ is adjacent to v_1 , and v_1 is adjacent from v_0
 - The edge (v_0, v_1) is incident on v_0 and v_1

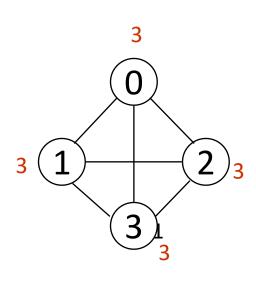
Terminology: Degree of a Vertex

- The degree of a vertex is the number of edges incident to that vertex
- For directed graph,
 - the in-degree of a vertex v is the number of edges that have v as the head
 - the out-degree of a vertex *v* is the number of edges that have *v* as the tail
 - if d_i is the degree of a vertex i in a graph G with n vertices and e edges, the number of edges is

$$e = (\sum_{i=0}^{n-1} d_i)/2$$

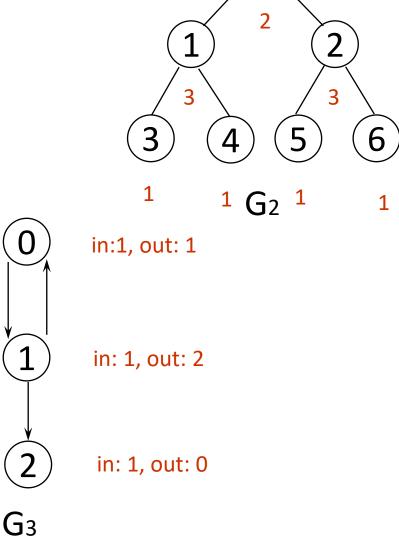
Why? Since adjacent vertices each count the adjoining edge, it will be counted twice

Examples



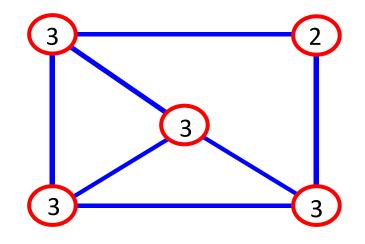
directed graph

in-degree out-degree

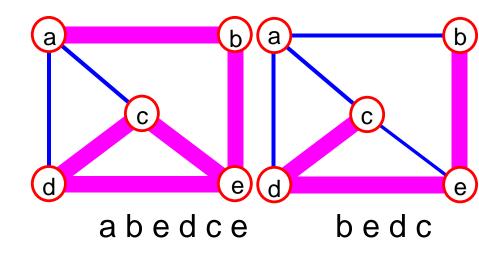


Terminology: Path

path: sequence of vertices
 v₁,v₂,...v_k such that
 consecutive vertices v_i and v_{i+1}
 are adjacent.

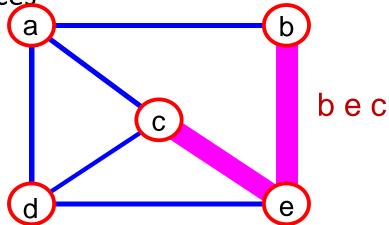


Nota PATH acbe



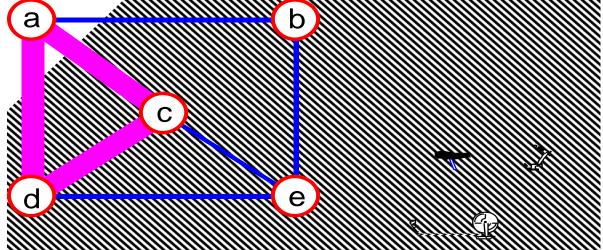
More Terminology

simple path: no repeated vertices



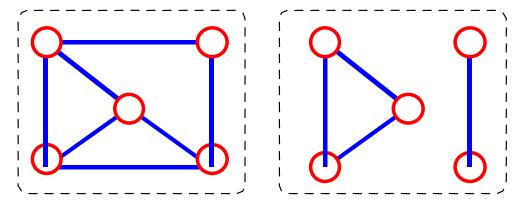
• cycle: simple path, except that the last vertex is the same as the

first vertex



Even More Terminology

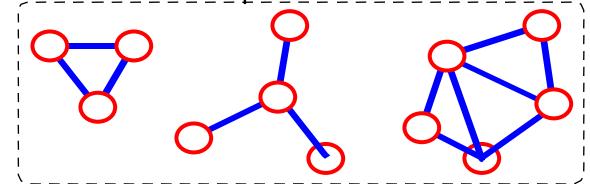
• Connected graph: any two vertices are connected by some path



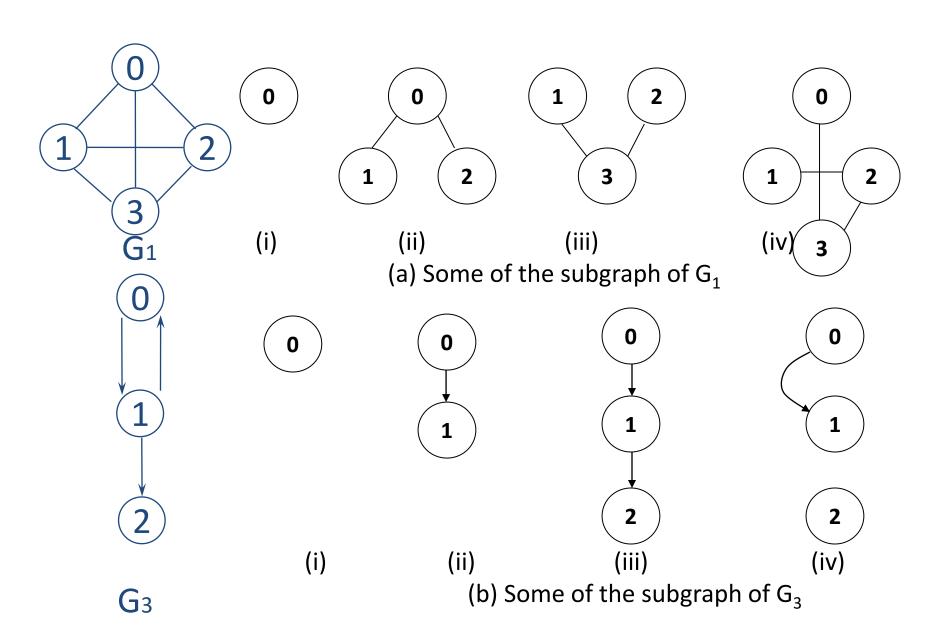
connected

not connected

- Subgraph: subset of vertices and edges forming a graph
- Connected component: maximal connected subgraph. E.g., the graph below has 3 connected components.

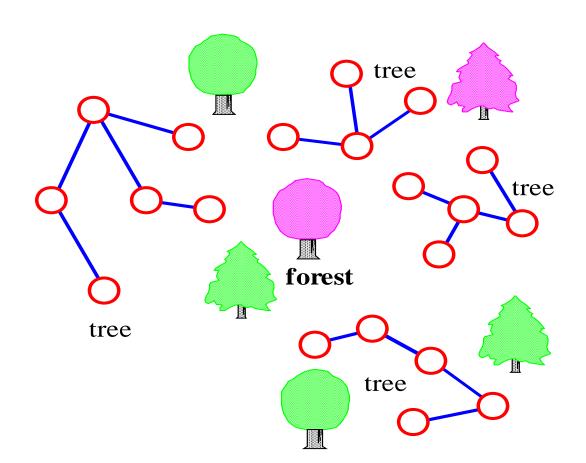


Subgraphs Examples



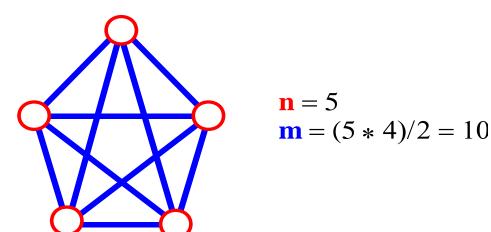
More...

- tree connected graph without cycles
- forest collection of trees



Connectivity

- Let n = #vertices, and m = #edges
- A complete graph: one in which all pairs of vertices are adjacent
- How many total edges in a complete graph?
 - Each of the n vertices is incident to n-1 edges, however, we would have counted each edge twice! Therefore, intuitively, m = n(n -1)/2.
- Therefore, if a graph is not complete, m < n(n -1)/2



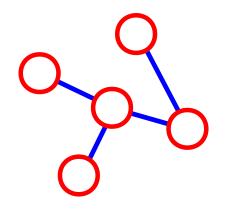
More Connectivity

n = #vertices

m = #edges

• For a tree **m** = **n** - 1

If m < n - 1, G is not connected



$$\mathbf{n} = 5$$

$$\mathbf{m} = 4$$

$$\mathbf{n} = 5$$

$$\mathbf{m} = 3$$

ADT for Graph

objects: a nonempty set of vertices and a set of undirected edges, where each edge is a pair of vertices

functions: for all $graph \in Graph$, v, v₁ and v₂ $\in Vertices$

Graph Create()::=return an empty graph

Graph InsertVertex(graph, v)::= return a graph with v inserted. v has no incident edge.

Graph InsertEdge(graph, v_1,v_2)::= return a graph with new edge between v_1 and v_2

Graph DeleteVertex(graph, v)::= return a graph in which v and all edges incident to it are removed

Graph DeleteEdge(graph, v1, v2)::=return a graph in which the edge (v1, v2) is removed

Boolean IsEmpty(graph)::= if (graph==empty graph) return TRUE else return FALSE

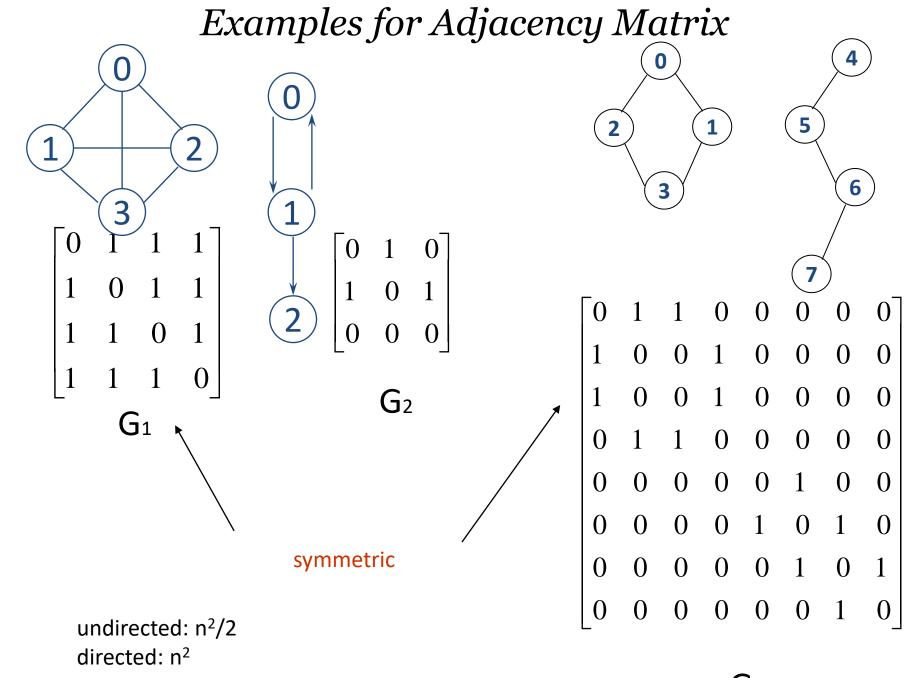
List Adjacent(graph,v)::= return a list of all vertices that are adjacent to v

Graph Representations

- Adjacency Matrix
- Adjacency Lists

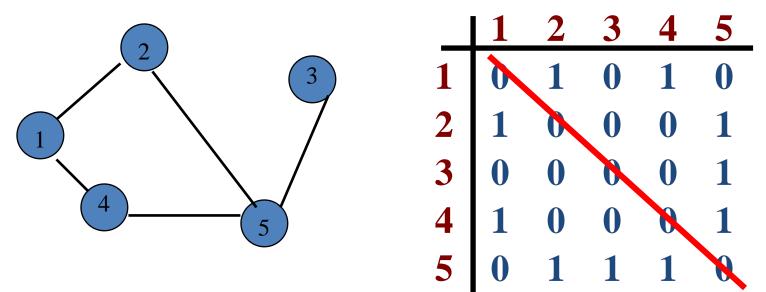
Data Structures for Graphs An Adjacency Matrix

- Let G=(V,E) be a graph with n vertices.
- The adjacency matrix of G is a two-dimensional n by n array, say adj_mat
- If the edge (v_i, v_i) is in E(G), adj_mat[i][j]=1
- If there is no such edge in E(G), adj_mat[i][j]=0



 G_4

Adjacency Matrix Properties



- Diagonal entries are zero
- The adjacency matrix of an undirected graph is symmetric; the adjacency matrix for a digraph need not be symmetric

Adjacency Matrix

- The degree of a vertex i is $\sum_{j=0}^{n-1} A[i][j]$
- For a digraph (= directed graph), the row sum is the out_degree, while the column sum is the in_degree of a vertex i

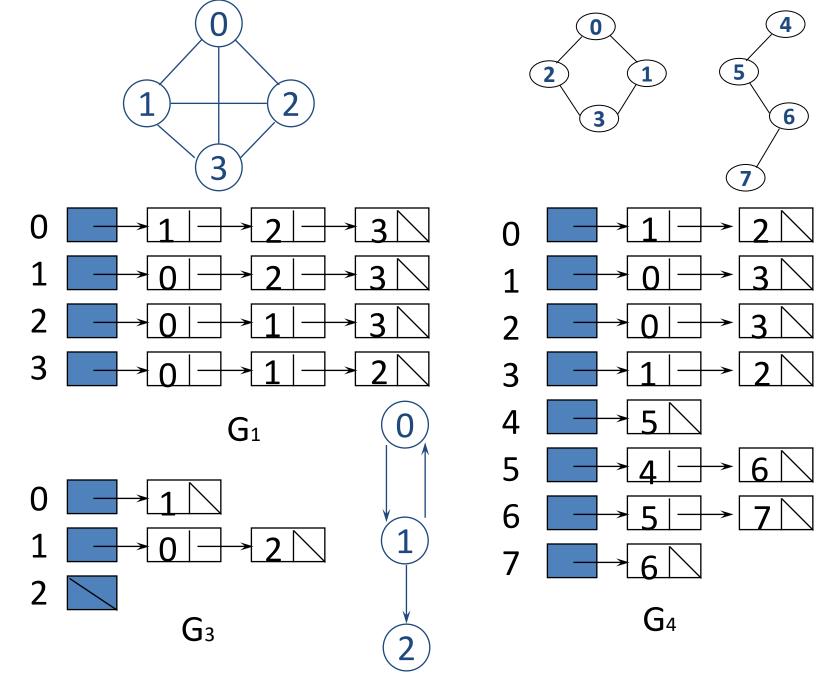
$$ind(v_i) = \sum_{j=0}^{n-1} A[j][i]$$
 $outd(v_i) = \sum_{j=0}^{n-1} A[i][j]$

Adjacency Matrix

- n² bits of space
- All algos will require at least O(n²) time to find edges in G as n²-n entries of the matrix have to be examined (diagonal entries are zero)
- For an undirected graph, may store only lower or upper triangle (exclude diagonal)
 - -(n-1)n/2 bits
- O(n) time to find vertex degree and/or vertices adjacent to a given vertex
- Sparse graphs: problem
 - Speed up is possible through the use of linked lists in which only the edges that are in G are represented

Data Structures for Graphs An Adjacency List

- A list of pointers, one for each node of the graph
- These pointers are the start of a linked list of nodes that can be reached by one edge of the graph
- For a weighted graph, this list would also include the weight for each edge



An undirected graph with n vertices and e edges ==> n head nodes and 2e list nodes

Adjacency Lists (data structures)

Each row in adjacency matrix is represented as an adjacency list.

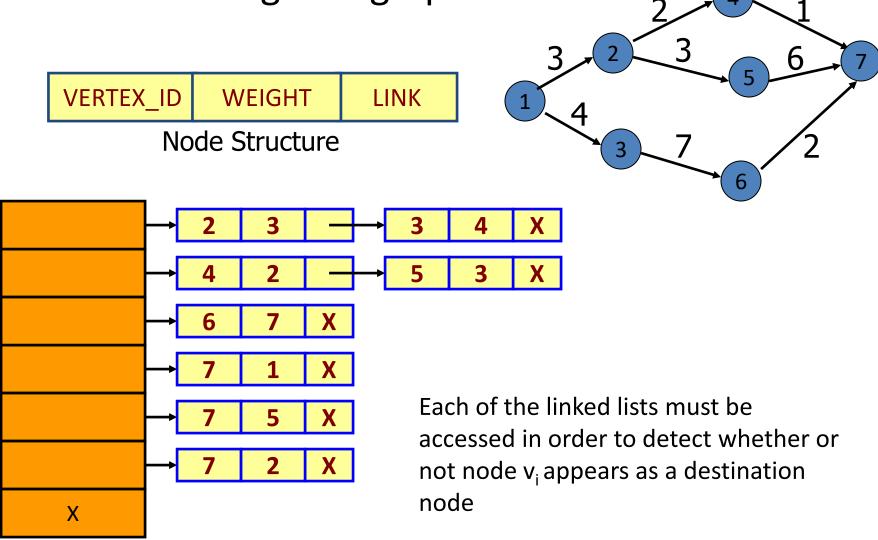
```
#define MAX_VERTICES 50

typedef struct node {
    int vertex_id;
        Node Structure
        struct node *link;
};

typedef struct node *node_pointer;
node_pointer graph[MAX_VERTICES];
```

Adjacency Lists

Consider a weighted graph



Some Operations

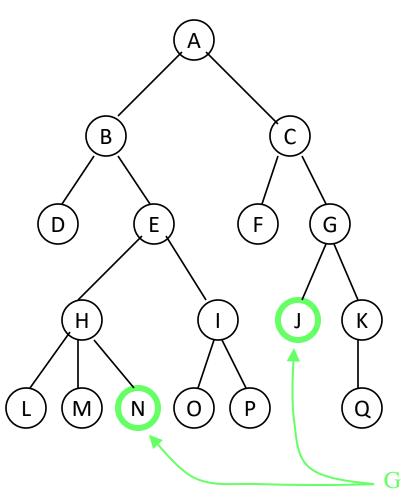
- degree of a vertex in an undirected graph
 - # of nodes in its adjacency list
- # of edges in a graph
 - determined in O(v+e)
- out-degree of a vertex in a directed graph
 - # of nodes in its adjacency list
- in-degree of a vertex in a directed graph
 - traverse the whole data structure

Graph Traversals

We want to travel to every node in the graph.

- Traversals guarantee that we will get to each node exactly once.
- This can be used if we want to search for information held in the nodes or if we want to distribute information to each node.

Tree searches



- A tree search starts at the root and explores nodes from there, looking for a goal node (a node that satisfies certain conditions, depending on the problem)
- For some problems, any goal node is acceptable (N or J); for other problems, you want a minimum-depth goal node, that is, a goal node nearest the root (only J)

Goal nodes

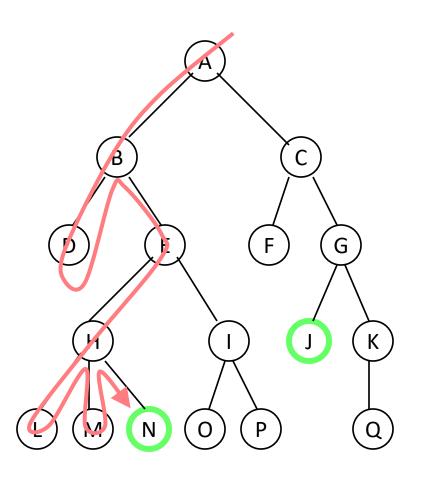
Graph Traversal

- Problem: Search for a certain node or traverse all nodes in the graph
- Depth First Search (DFS)
 - Once a possible path is found, continue the search until the end of the path
- Breadth First Search (BFS)
 - Start several paths at a time, and advance in each one step at a time

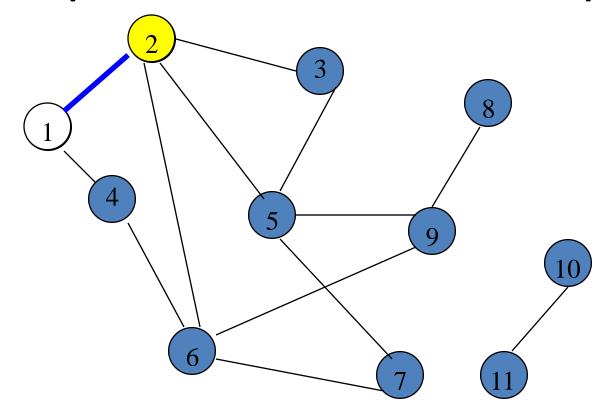
Depth-First Traversal

- We follow a path through the graph until we reach a dead end.
- We then back up until we reach a node with an edge to an unvisited node
- We take this edge and again follow it until we reach a dead end
- This process continues until we back up to the starting node and it has no edges to unvisited nodes

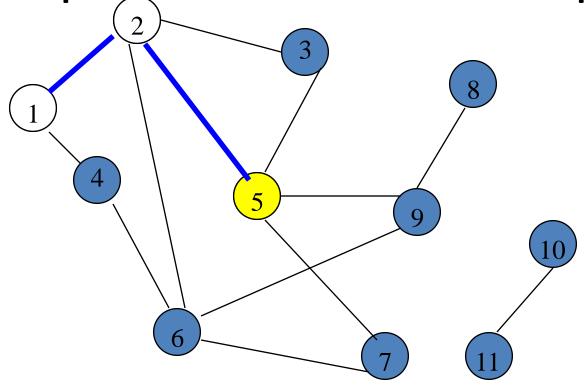
Depth-first searching in a Tree



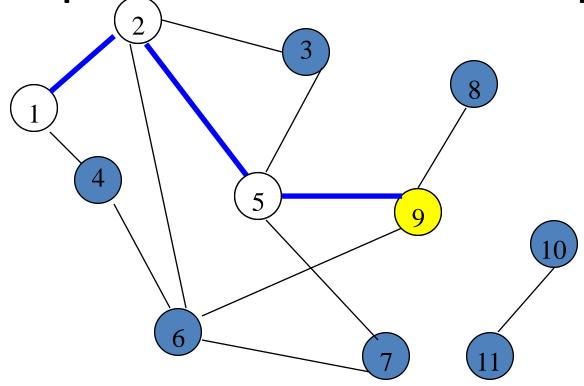
- A depth-first search (DFS)
 explores a path all the way to
 a leaf before backtracking and
 exploring another path
- For example, after searching A, then B, then D, the search backtracks and tries another path from B
- Node are explored in the order A B D E H L M N I O P C F G J K Q
- N will be found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



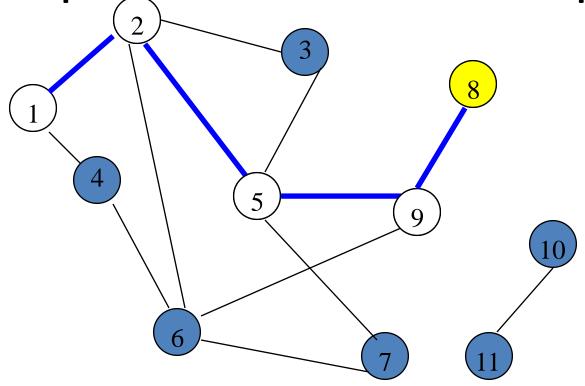
- Start search at vertex 1
- Label vertex 1 and do a depth first search from either 2 or 4
- Suppose that vertex 2 is selected



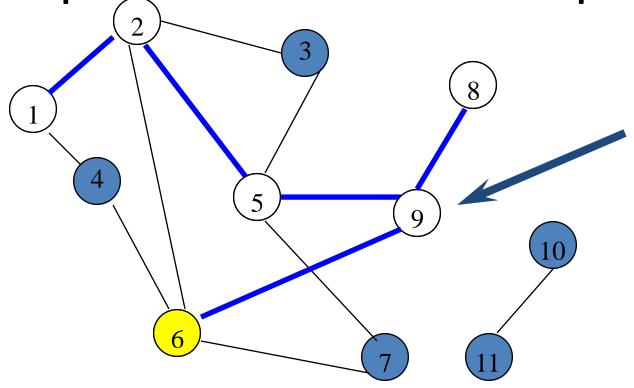
- Label vertex 2 and do a depth first search from either 3, 5, or 6
- Suppose that vertex 5 is selected



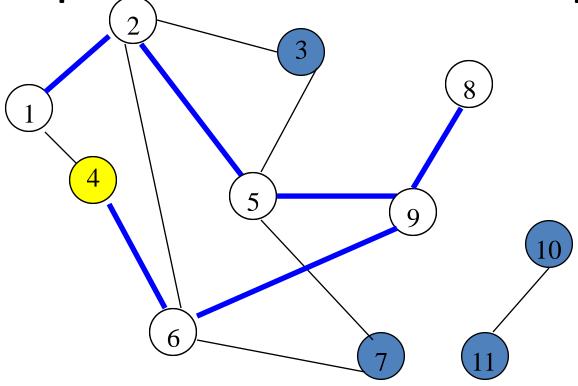
- Label vertex 5 and do a depth first search from either 3, 7, or 9
- Suppose that vertex 9 is selected



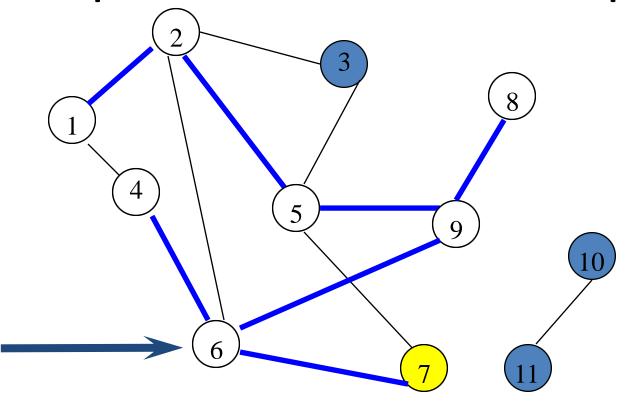
- Label vertex 9 and do a depth first search from either 6 or 8
- Suppose that vertex 8 is selected



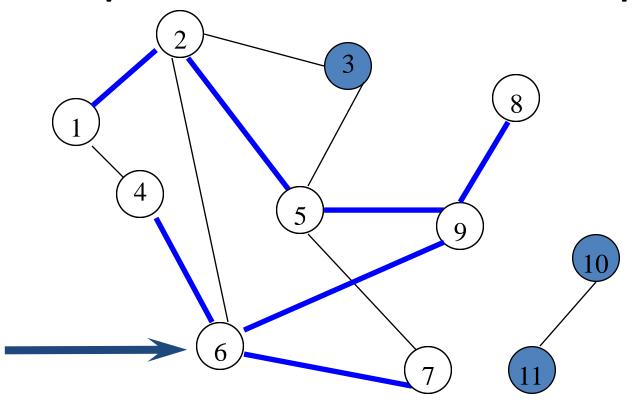
- Label vertex 8 and return to vertex 9
- From vertex 9 do a dfs(6)



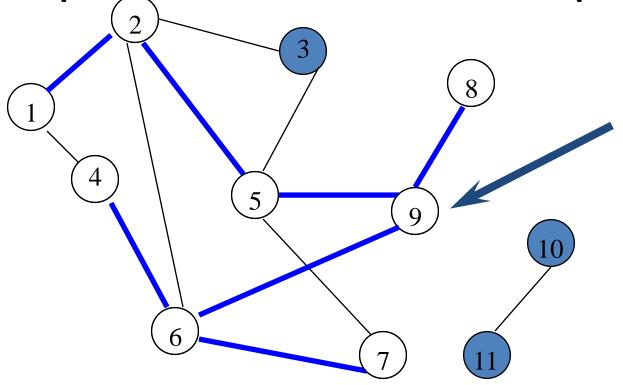
- Label vertex 6 and do a depth first search from either 4 or 7
- Suppose that vertex 4 is selected



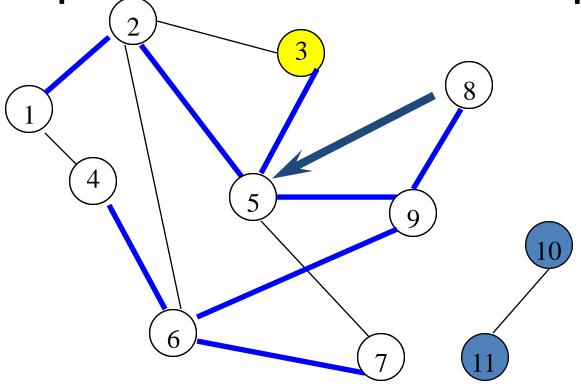
- Label vertex 4 and return to 6
- From vertex 6 do a dfs(7)



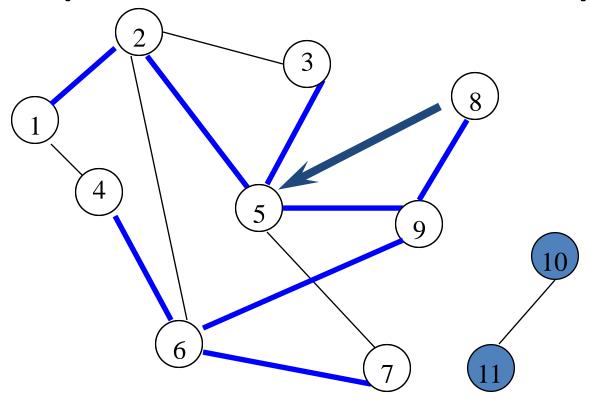
- Label vertex 7 and return to 6
- Return to 9



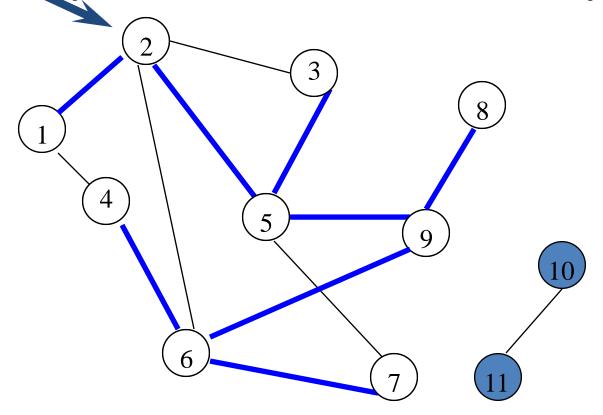
Return to 5



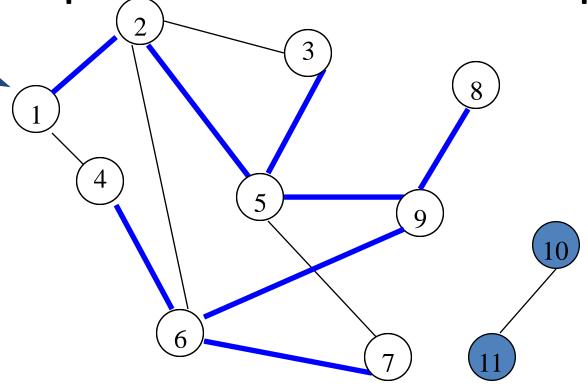
Do a dfs(3)



- Label 3 and return to 5
- Return to 2



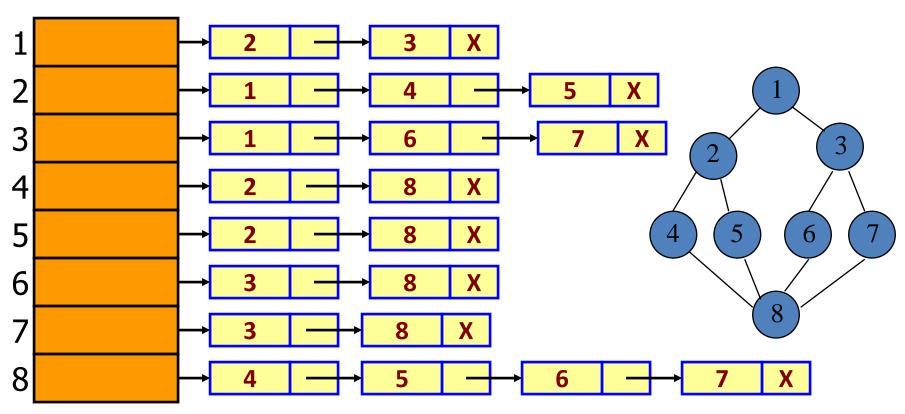
• Return to 1



Return to invoking method

Traversal: Another Example

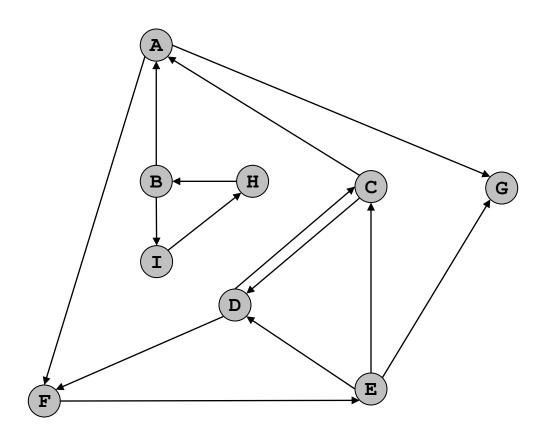
DFS (start vertex 1): 1, 2, 4, 8, 5, 6, 3, 7



A Graph and its Adjacency List Representation

DFS (Pseudo Code)

```
DFS(input: Graph G) {
   Stack S; Integer x, t;
  while (G has an unvisited node x){
        visit(x); push(x,S);
        while (S is not empty){
                t := peek(S);
                if (t has an unvisited neighbor y){
                         visit(y); push(y,S); }
                else
                         pop(S);
                                 //Recursive algorithm
                                 DFS(v: vertex in G){
                                   Mark v as visited
                                   for (each unvisited vertex u adjacent to v)
                                         DFS(u)
```



Adjacency Lists

A: FG

B: A I

C: A D

D: C F

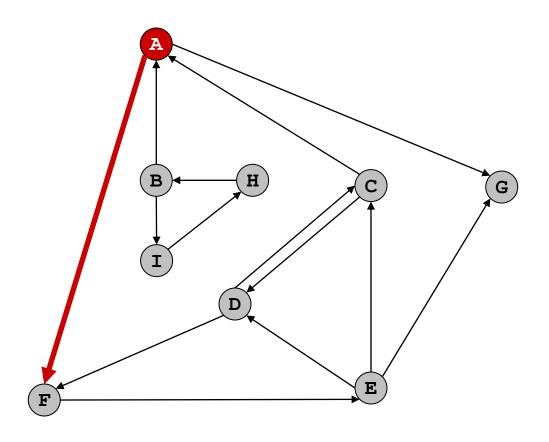
E: C D G

F: E

G:

H: B

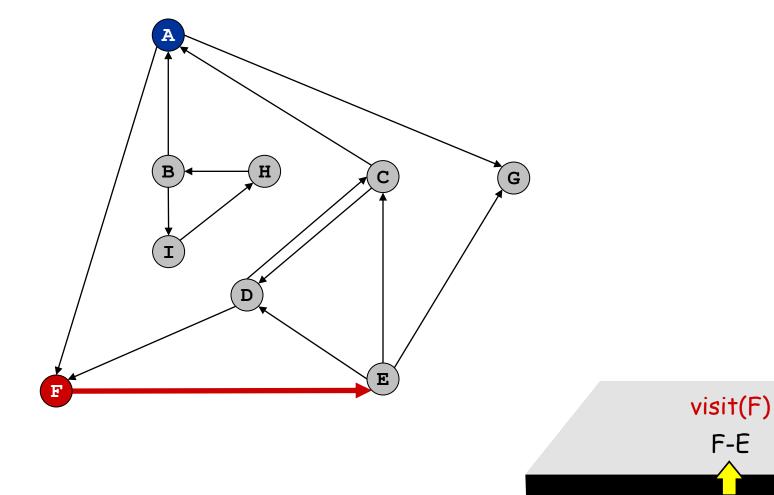
I: H

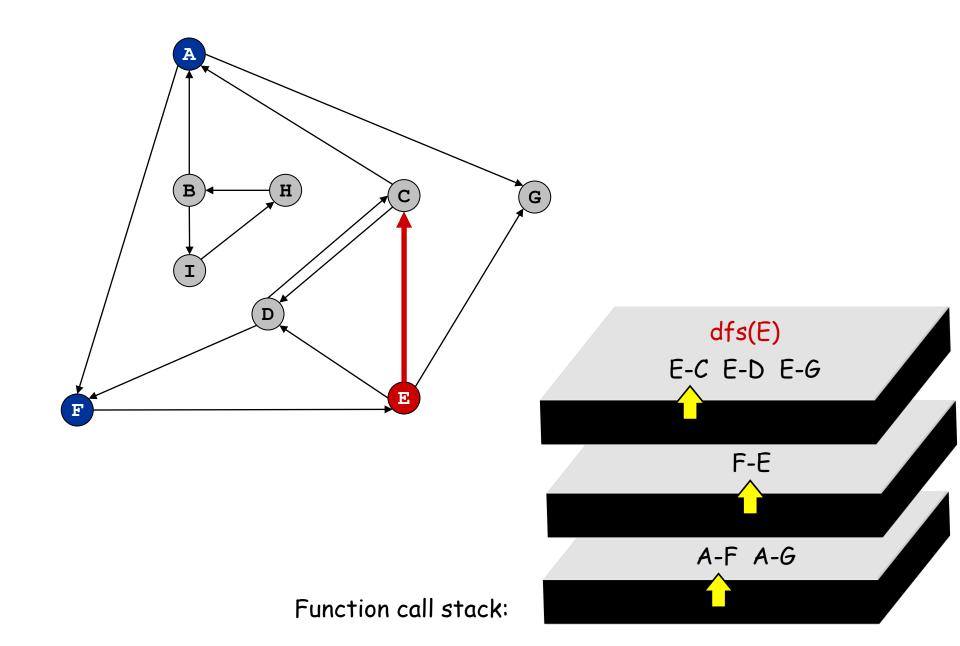


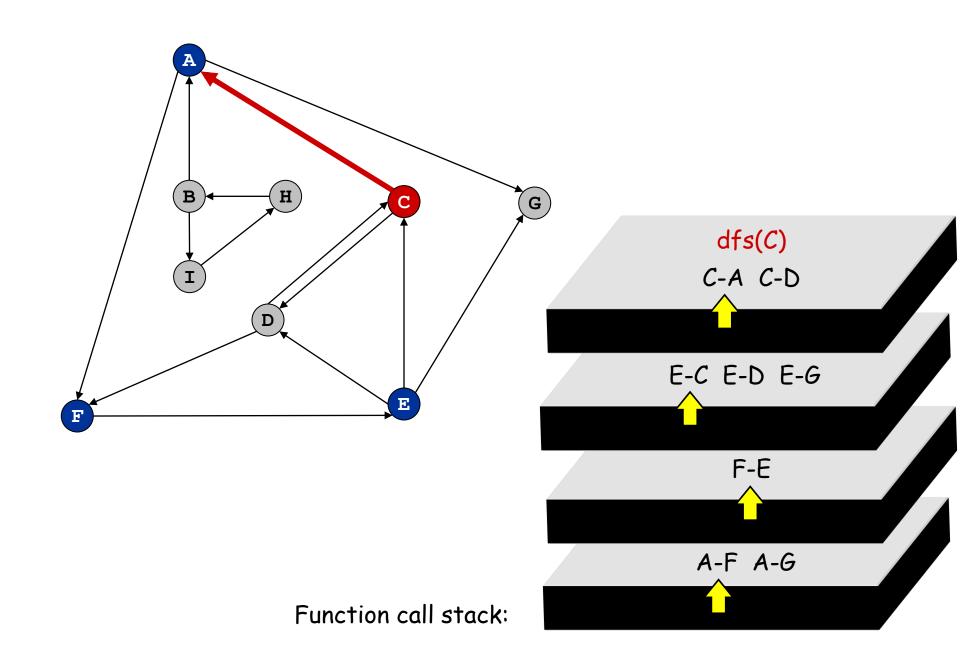


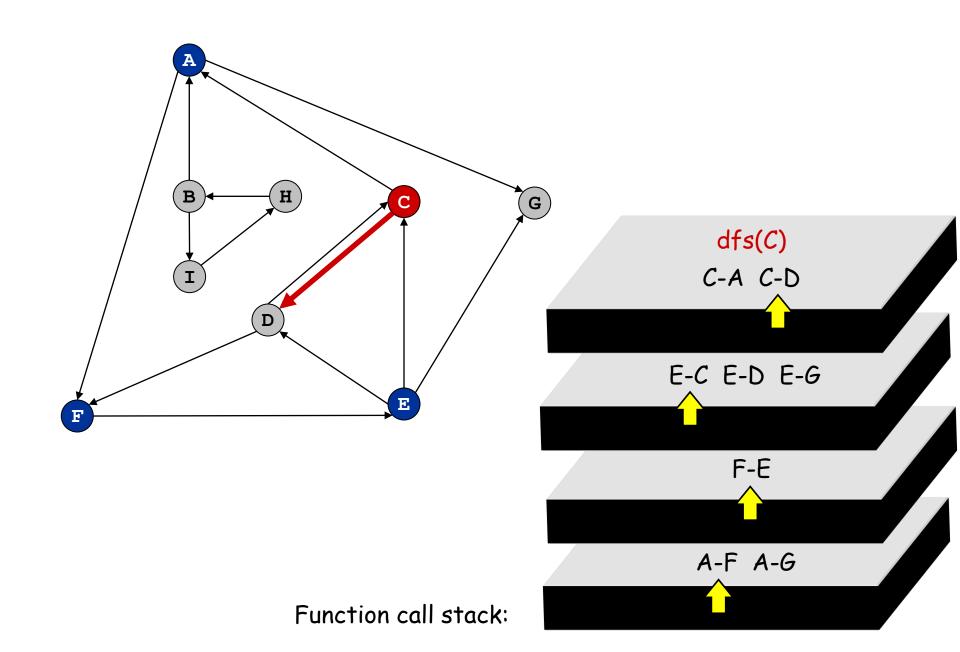
F-E

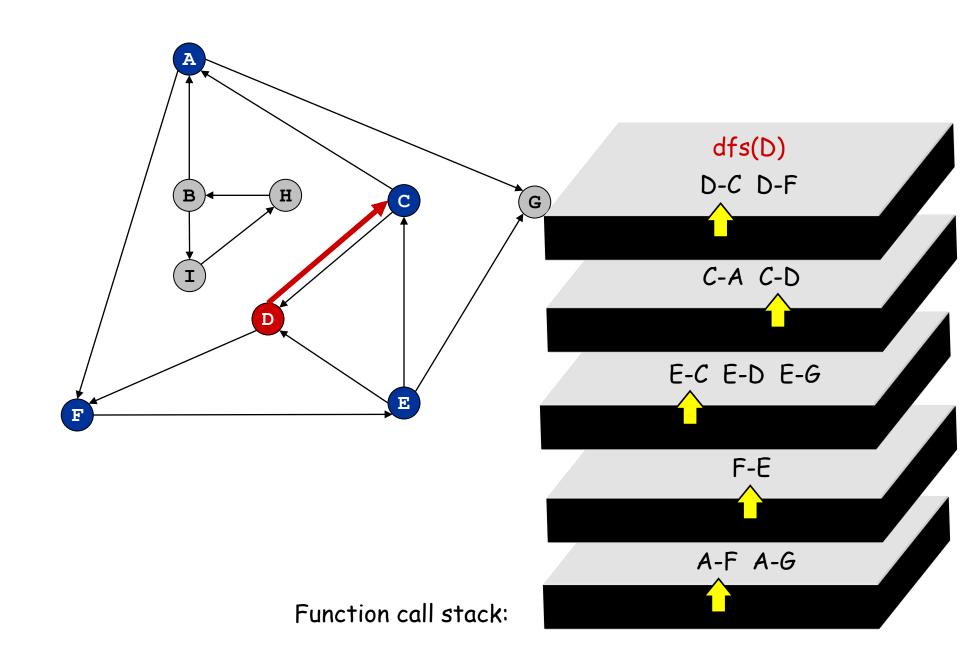
A-F A-G

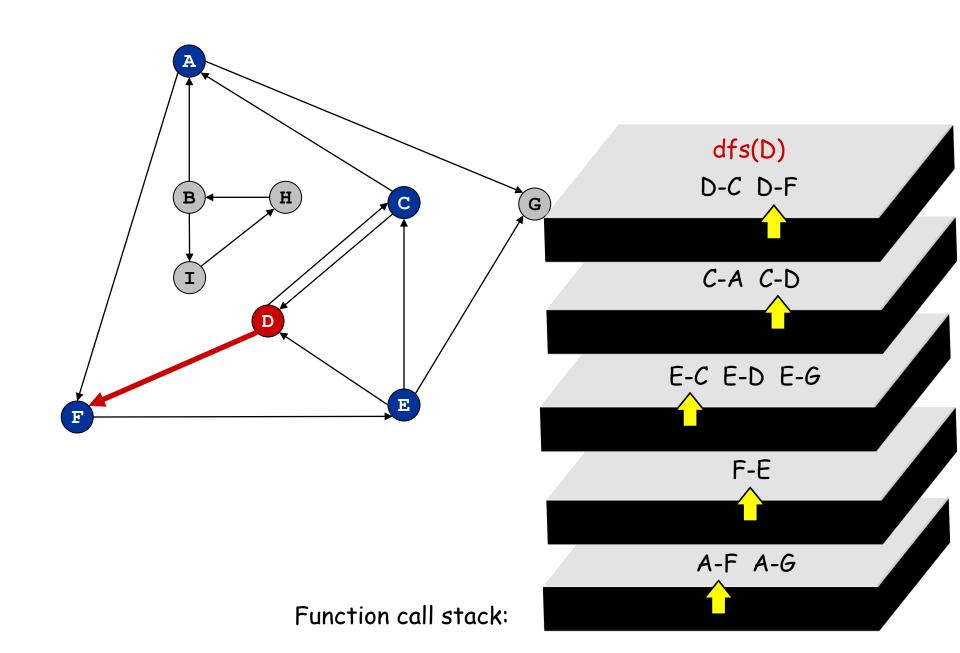


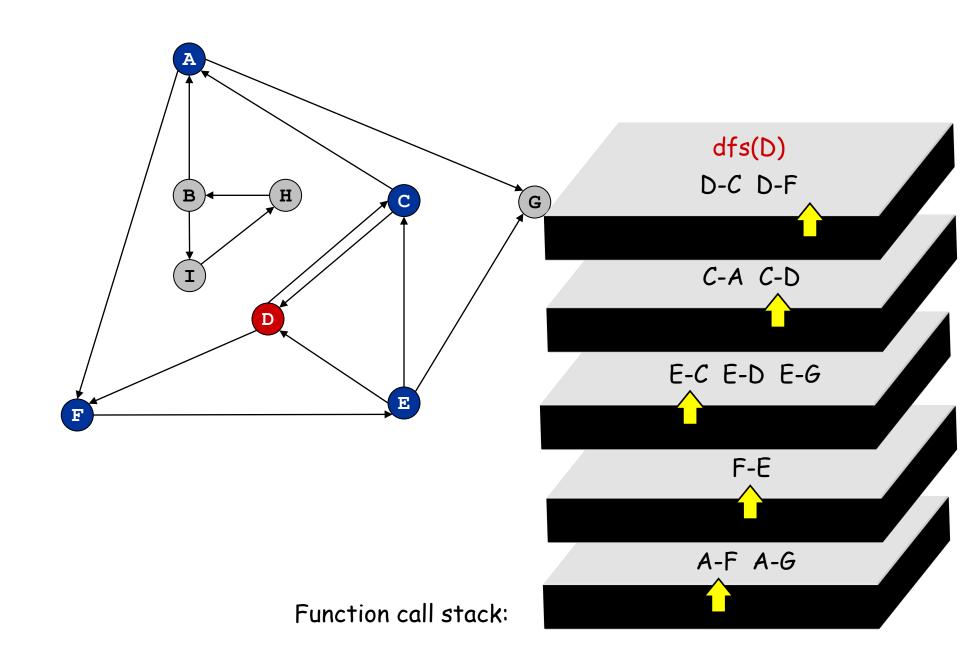


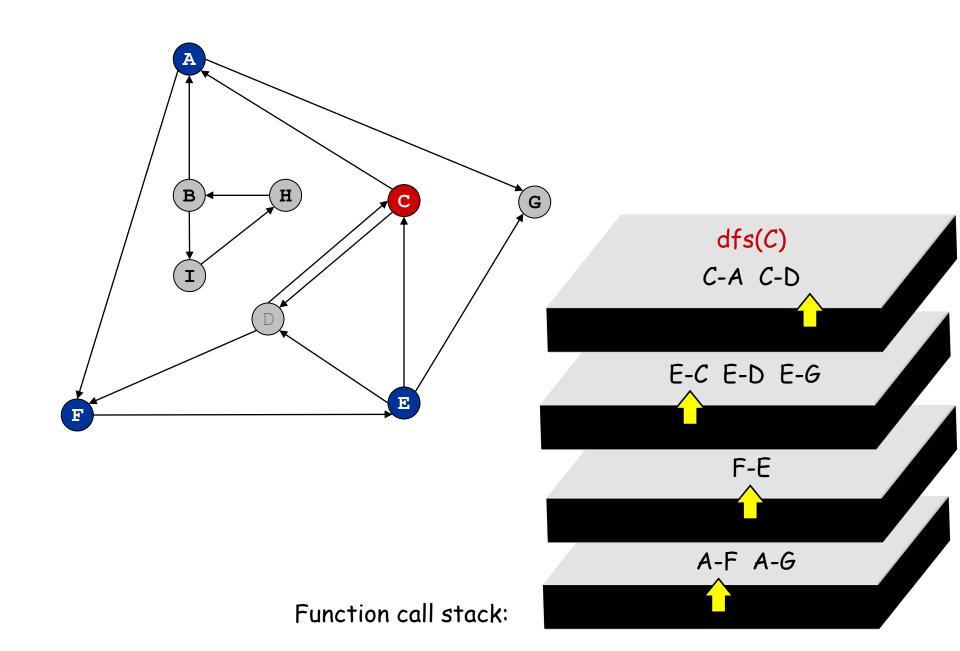


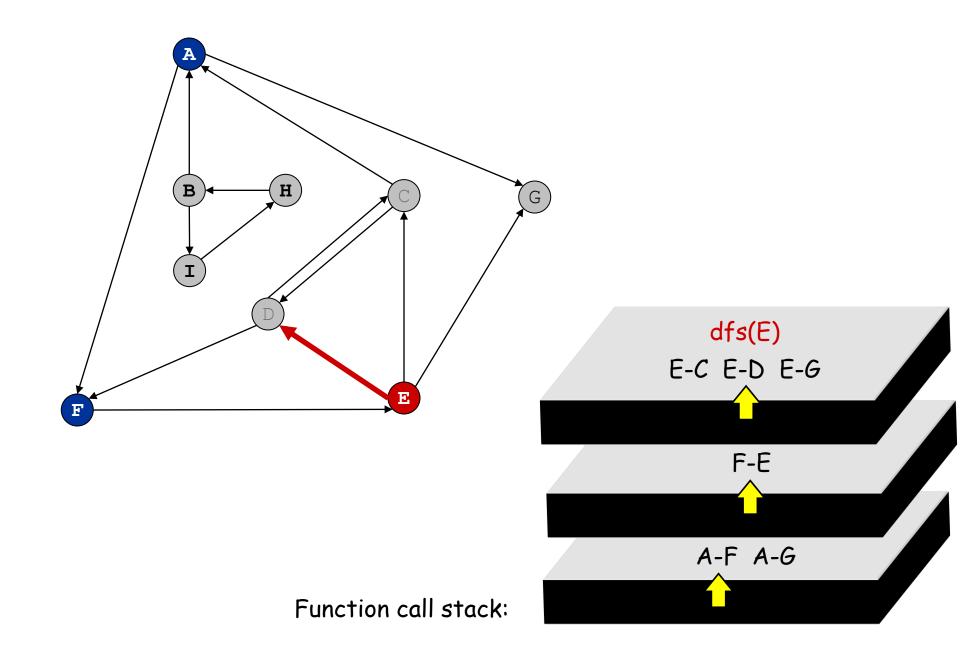


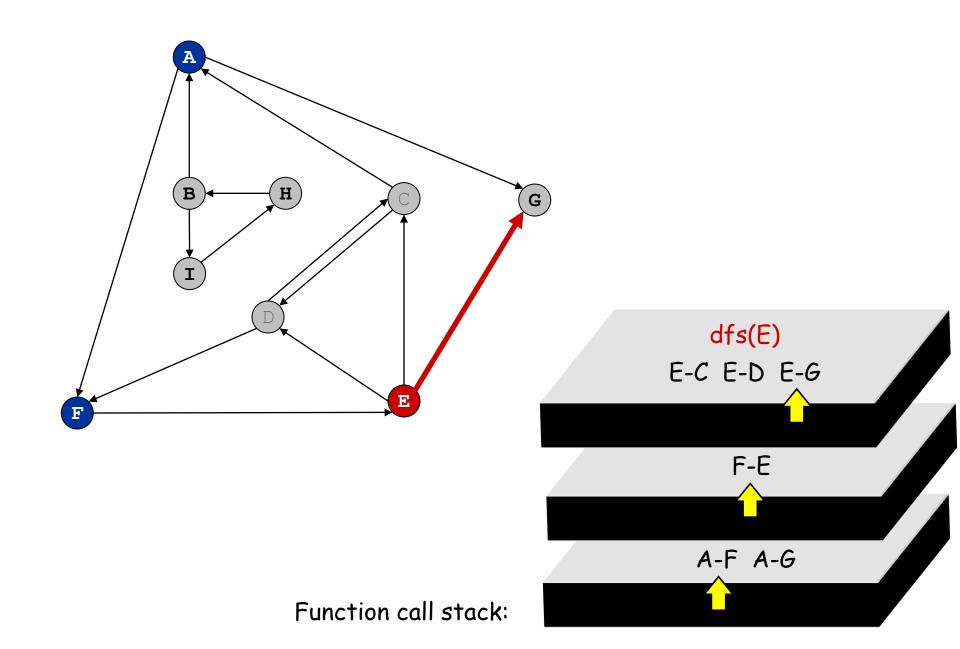


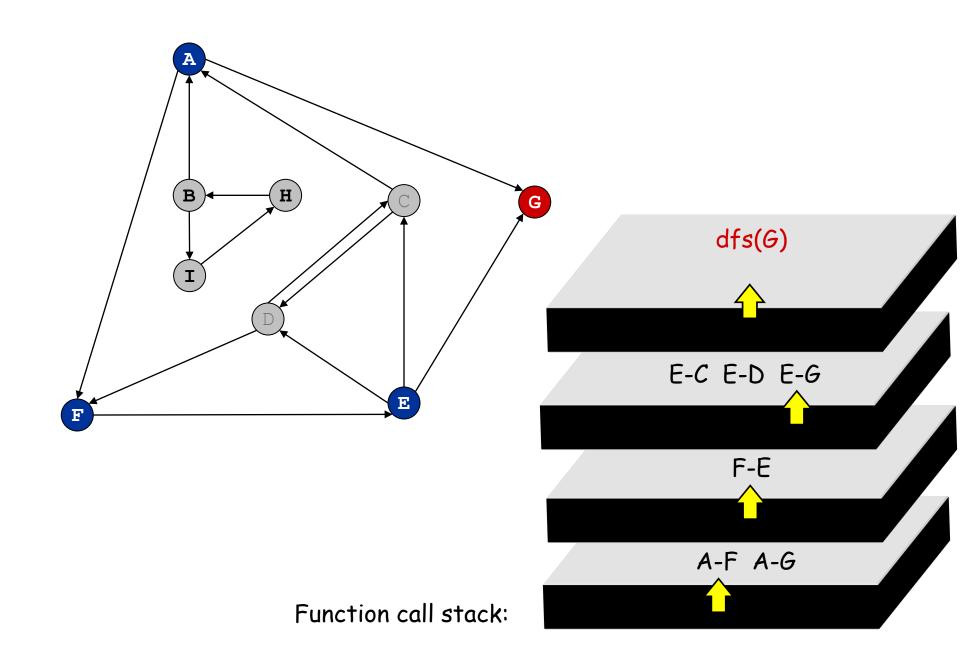


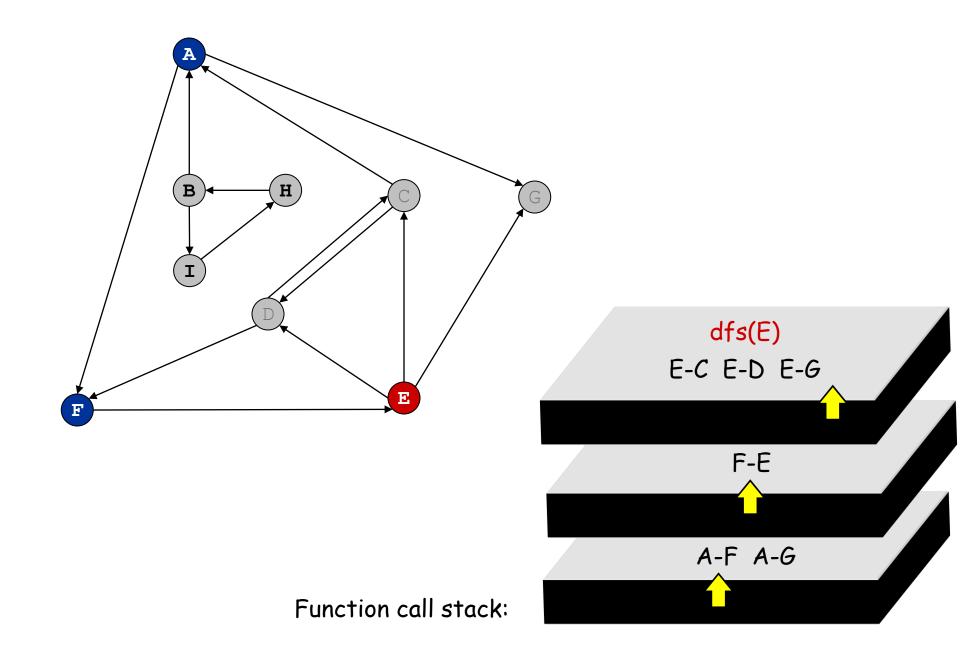


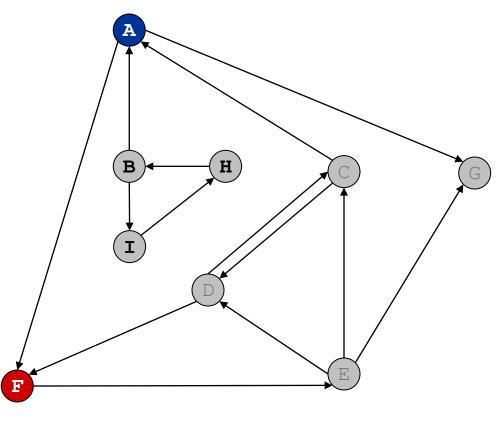


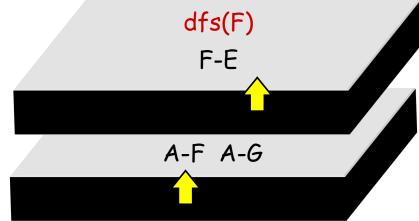


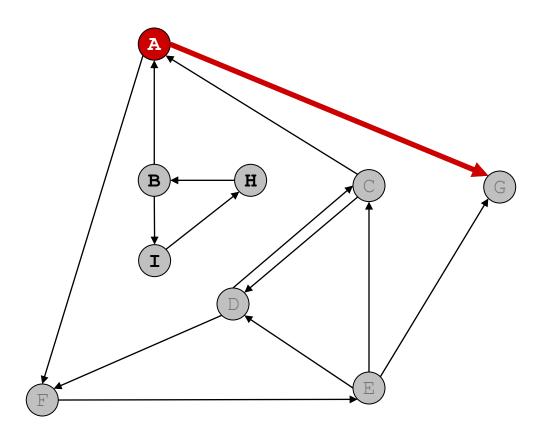


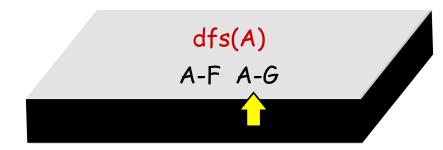


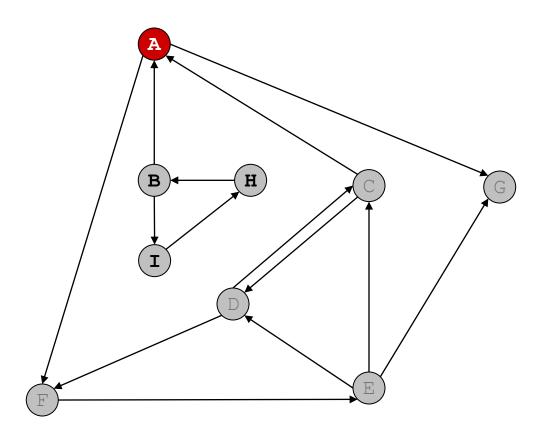




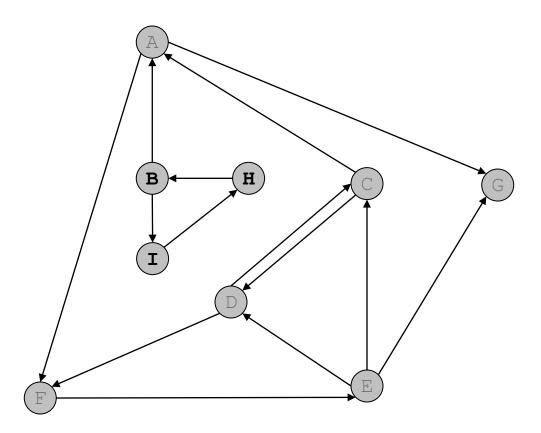








dfs(A)
A-F A-G



Nodes reachable from A: A, C, D, E, F, G

Breadth-First Traversal

 From the starting node, we follow all paths of length one

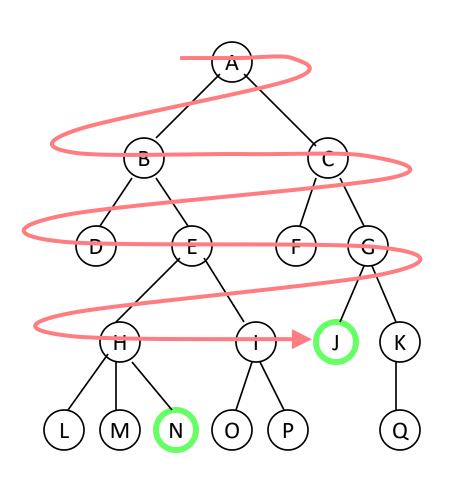
 Then we follow paths of length two that go to unvisited nodes

 We continue increasing the length of the paths until there are no unvisited nodes along any of the paths

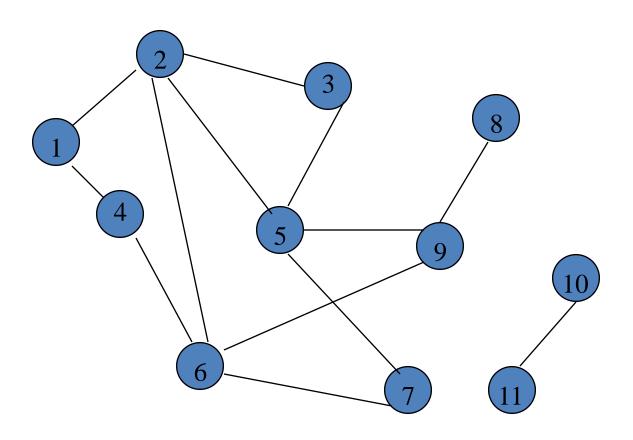
Breadth-First Search

- Visit start vertex and put into a FIFO queue
- Repeatedly remove a vertex from the queue, visit its unvisited adjacent vertices, put newly visited vertices into the queue

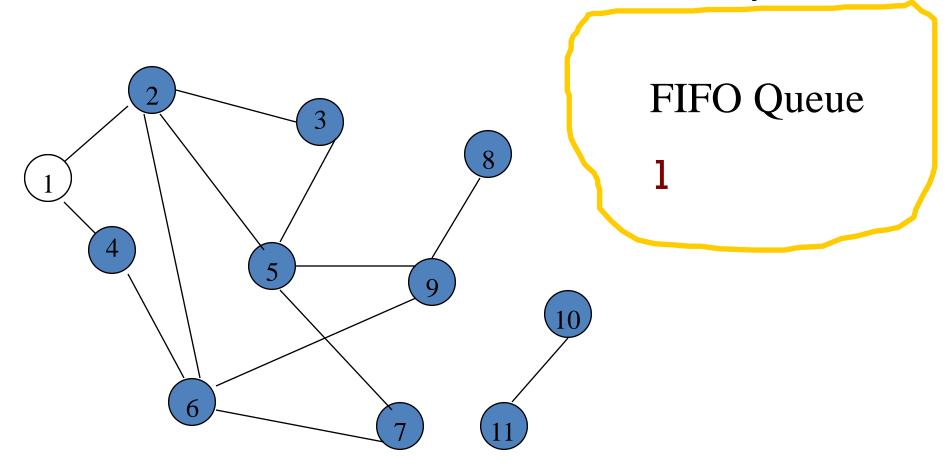
Breadth-first searching in a Tree



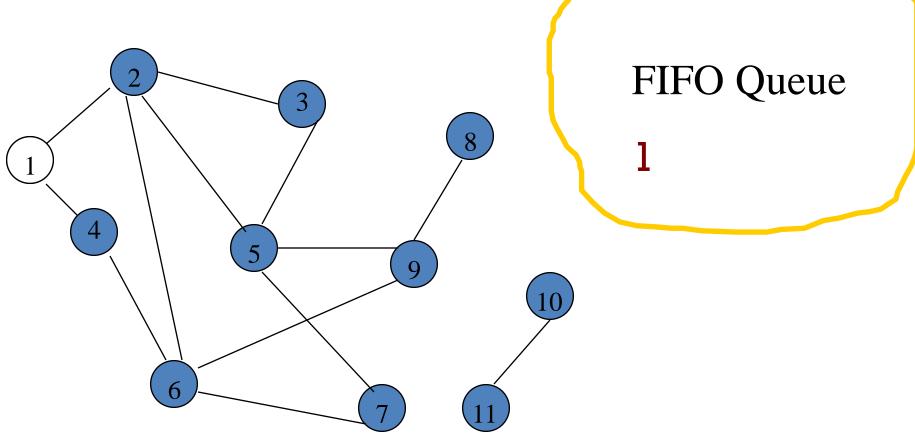
- A breadth-first search (BFS)
 explores nodes nearest the
 root before exploring nodes
 further away
- For example, after searching
 A, then B, then C, the search
 proceeds with D, E, F, G
- Node are explored in the order A B C D E F G H I J K L M N O P Q
- J will be found before N



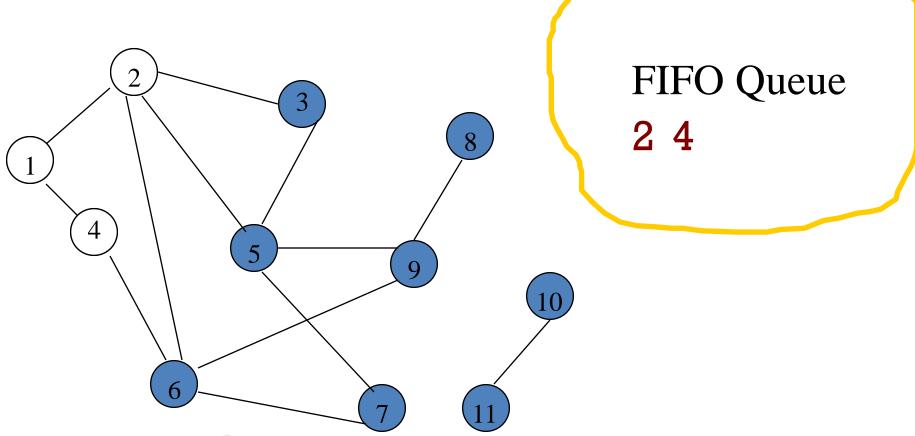
Start search at vertex 1



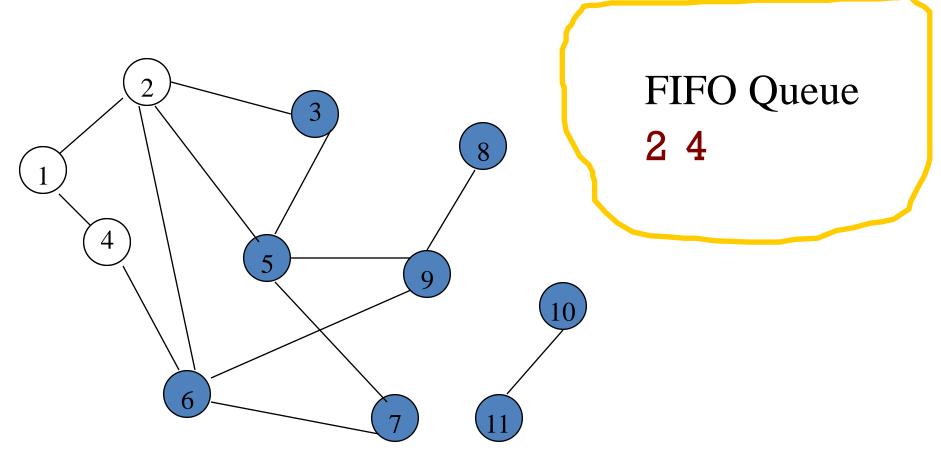
Visit/mark/label start vertex and put in a FIFO queue



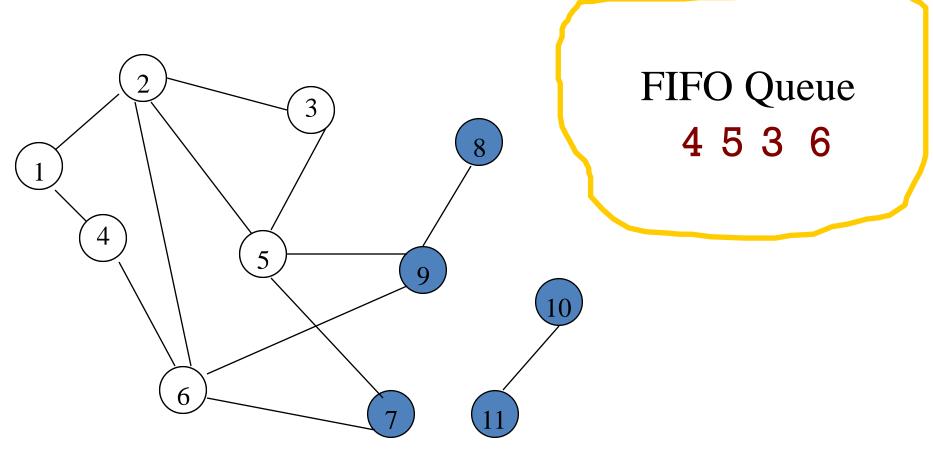
- Remove 1 from Q
- Visit adjacent unvisited vertices & put them in Q



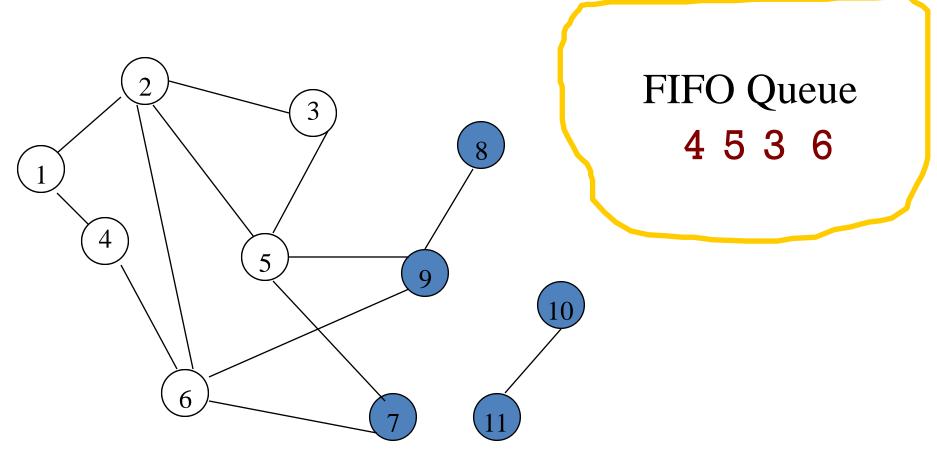
- Remove 1 from Q
- Visit adjacent unvisited vertices & put them in Q



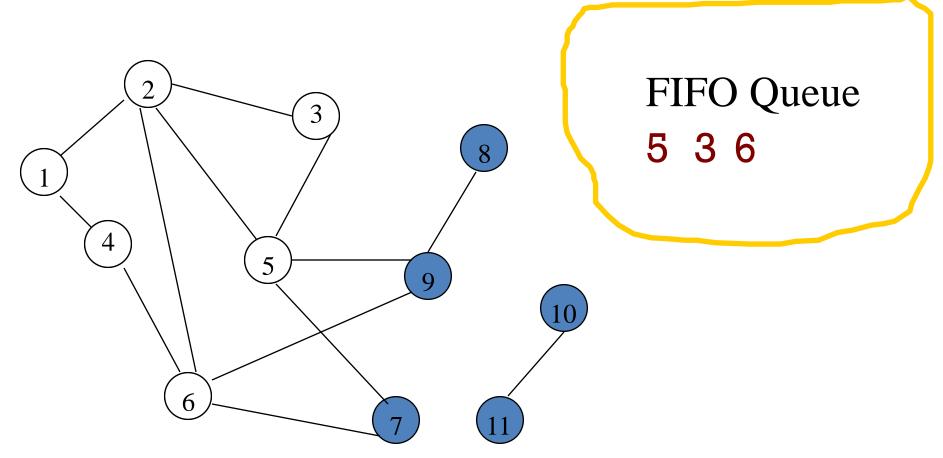
- Remove 2 from Q
- Visit adjacent unvisited vertices & put them in Q



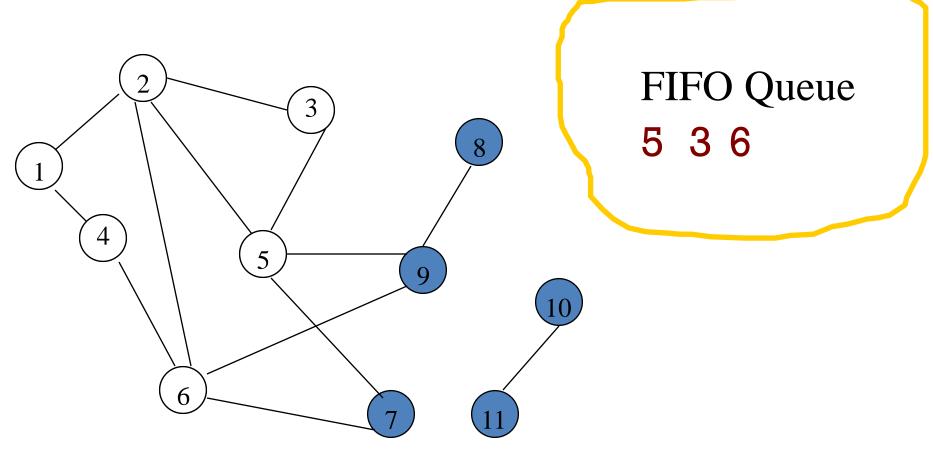
- Remove 2 from Q
- Visit adjacent unvisited vertices & put them in Q



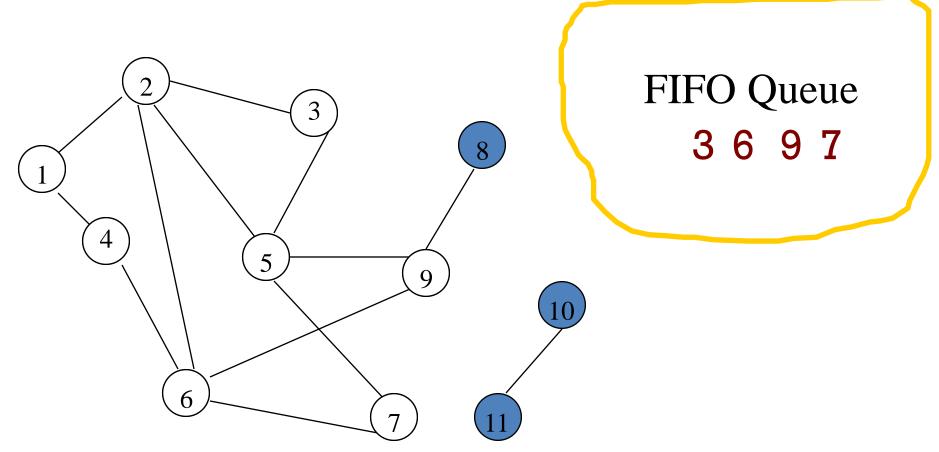
- Remove 4 from Q
- Visit adjacent unvisited vertices & put them in Q



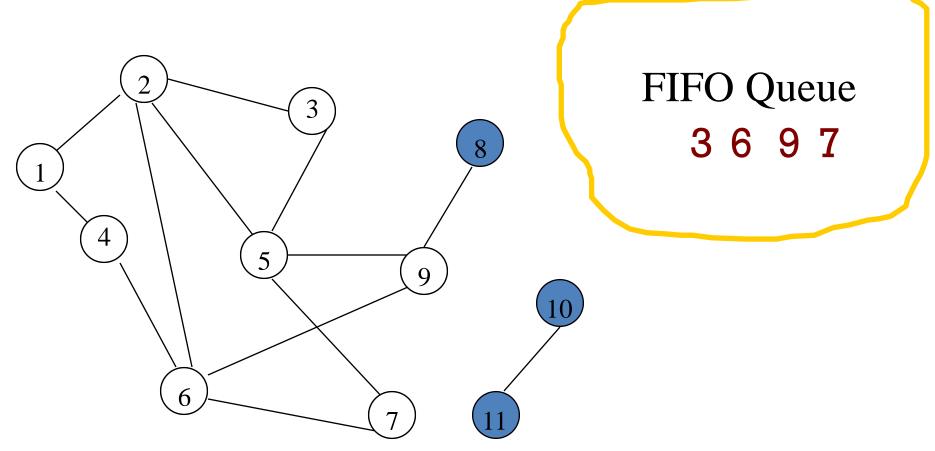
- Remove 4 from Q
- Visit adjacent unvisited vertices & put them in Q



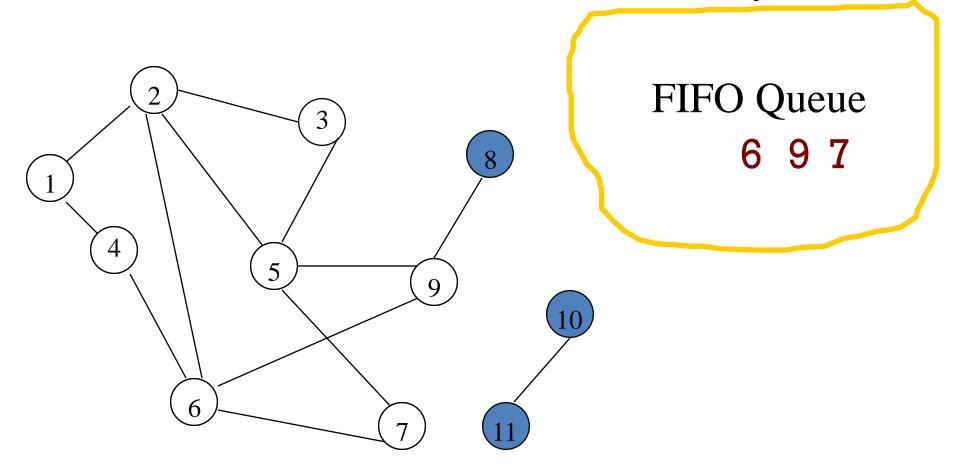
- Remove 5 from Q
- Visit adjacent unvisited vertices & put them in Q



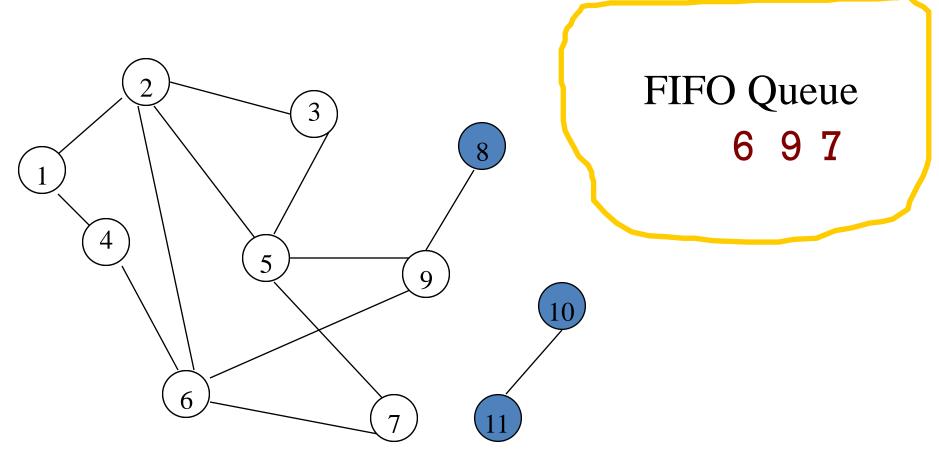
- Remove 5 from Q
- Visit adjacent unvisited vertices & put them in Q



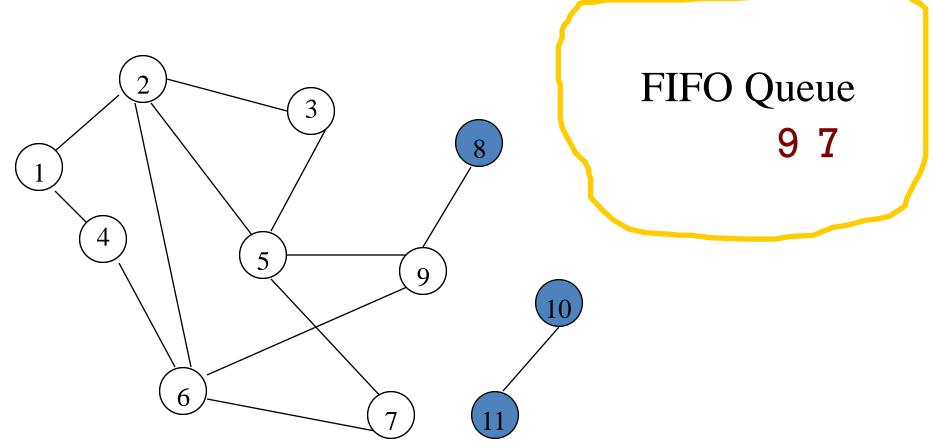
- Remove 3 from Q
- Visit adjacent unvisited vertices & put them in Q



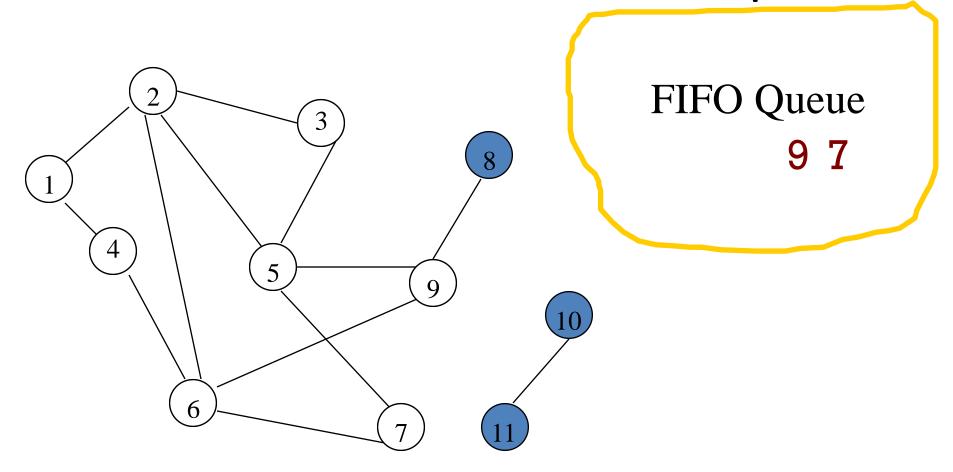
- Remove 3 from Q
- Visit adjacent unvisited vertices & put them in Q



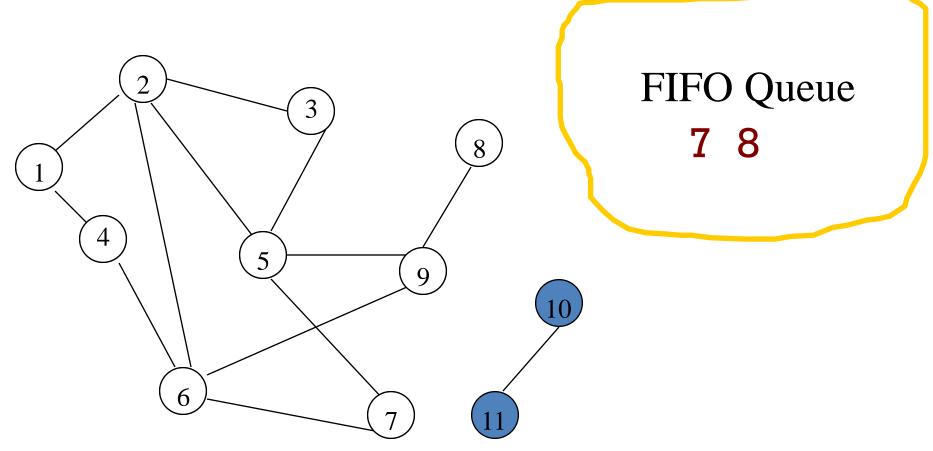
- Remove 6 from Q
- Visit adjacent unvisited vertices & put them in Q



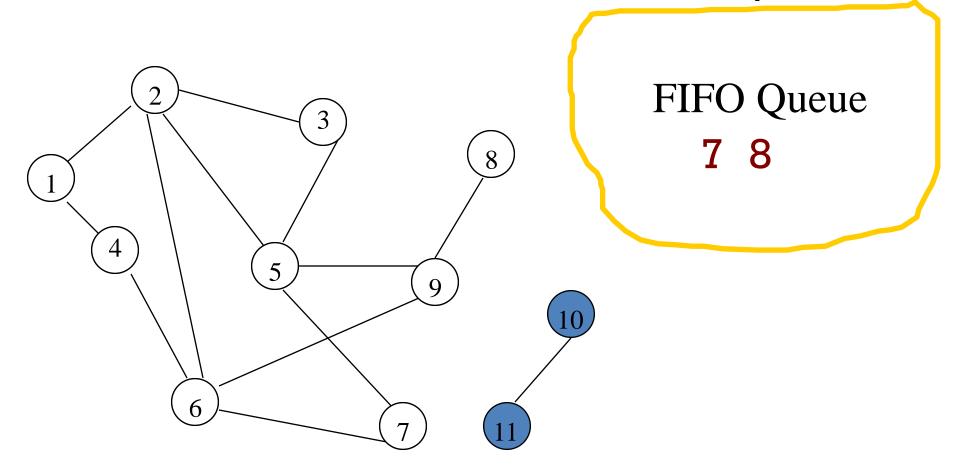
- Remove 6 from Q
- Visit adjacent unvisited vertices & put them in Q



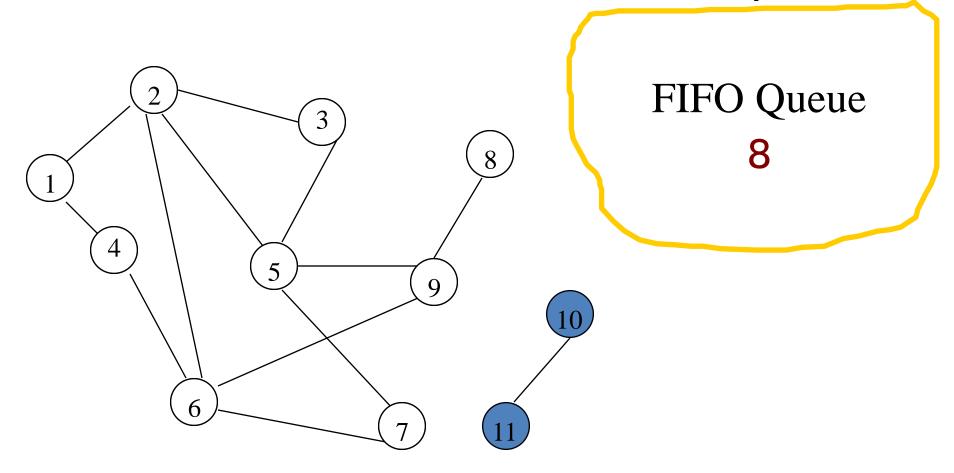
- Remove 9 from Q
- Visit adjacent unvisited vertices & put them in Q



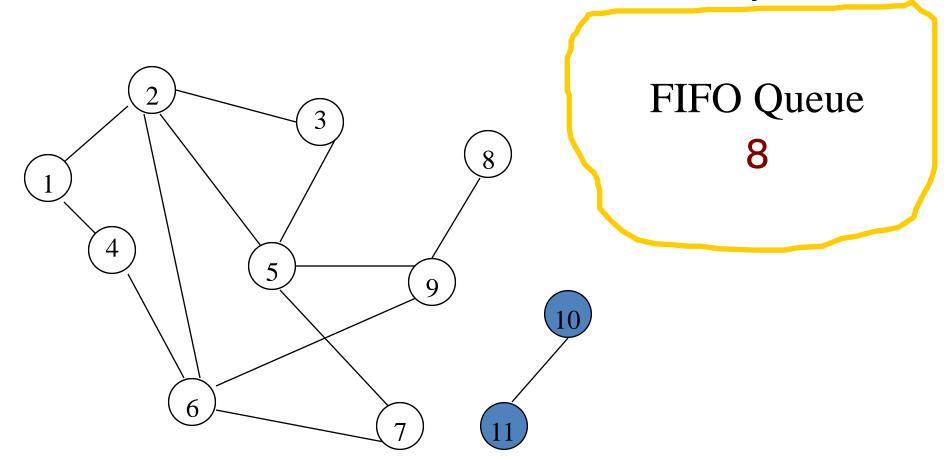
- Remove 9 from Q
- Visit adjacent unvisited vertices & put them in Q



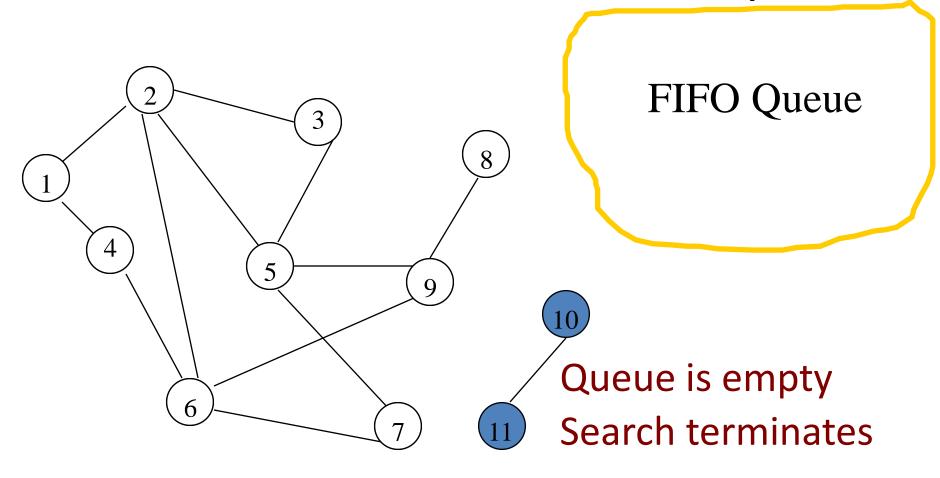
- Remove 7 from Q
- Visit adjacent unvisited vertices & put them in Q



- Remove 7 from Q
- Visit adjacent unvisited vertices & put them in Q

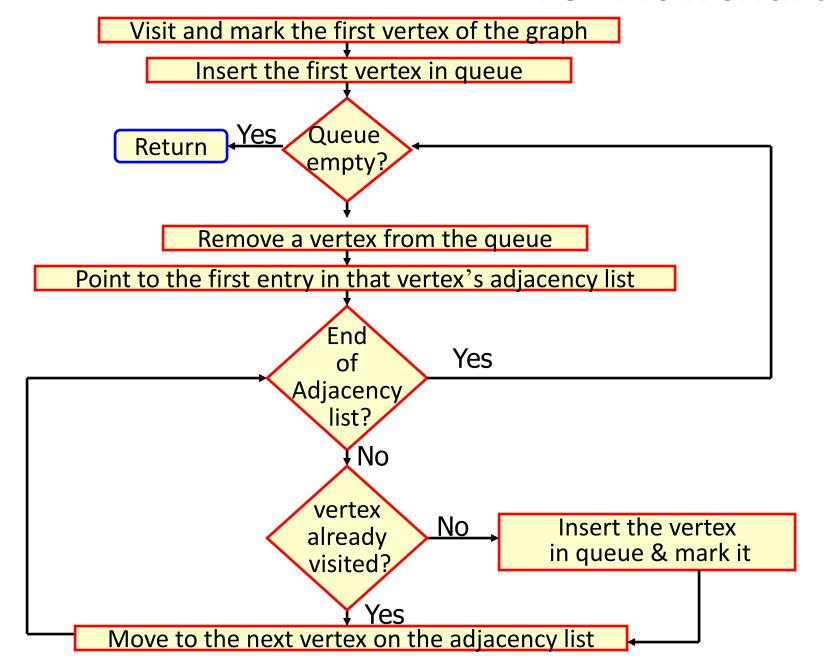


- Remove 8 from Q
- Visit adjacent unvisited vertices & put them in Q



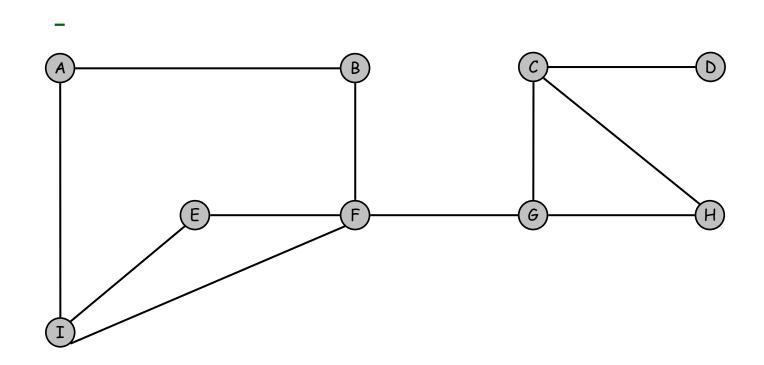
■ All vertices reachable from the start vertex (including the start vertex) are visited

BFS- Flowchart



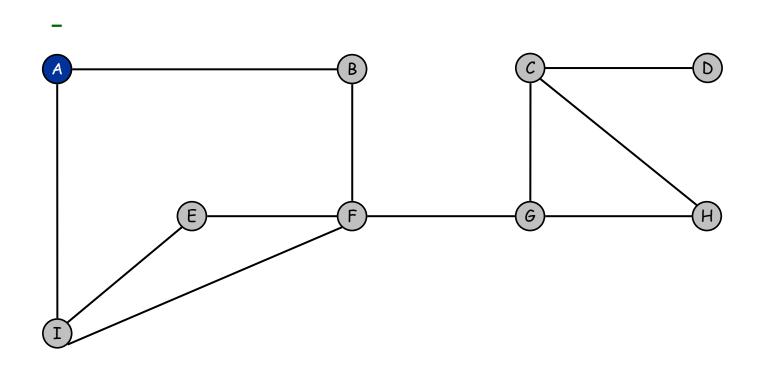
BFS (Pseudo Code)

```
BFS(input: graph G) {
  Queue Q; Integer x, z, y;
  while (G has an unvisited node x) {
       visit(x); Enqueue(x,Q);
       while (Q is not empty){
               z := Dequeue(Q);
               for all (unvisited neighbor y of z){
                      visit(y); Enqueue(y,Q);
```



front

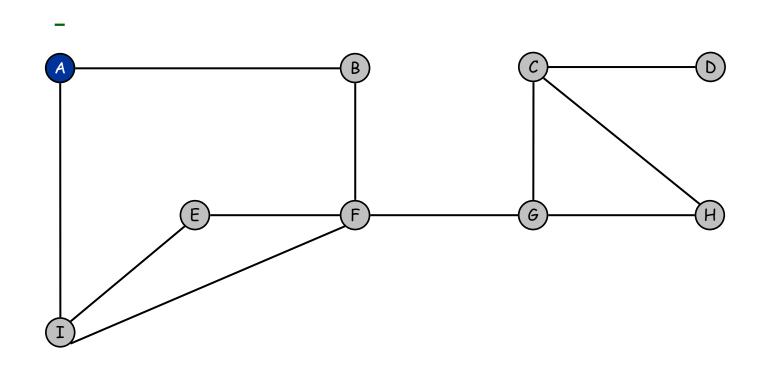
FIFO Queue



enqueue source node

front

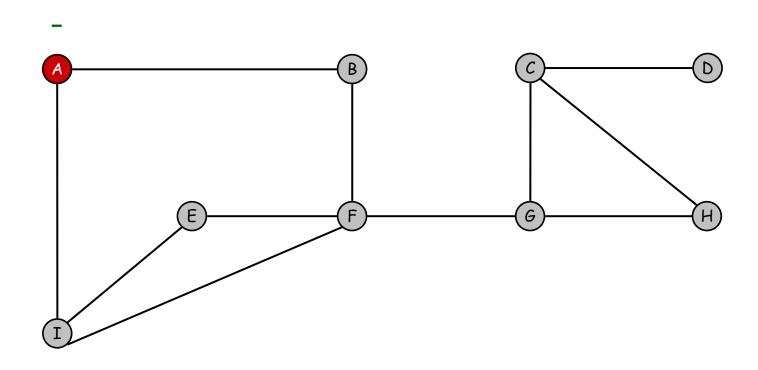
A



dequeue next vertex

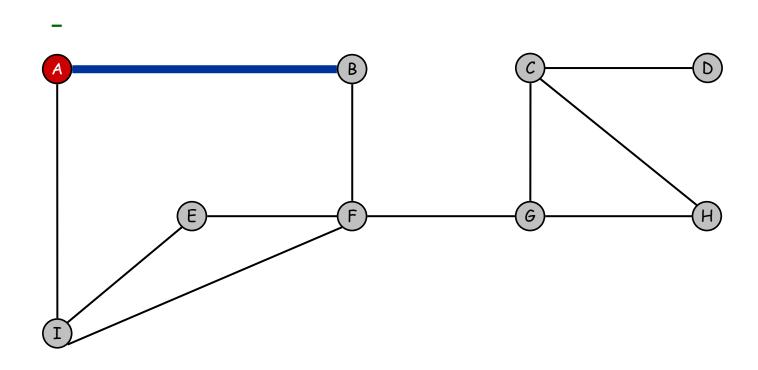
front

A



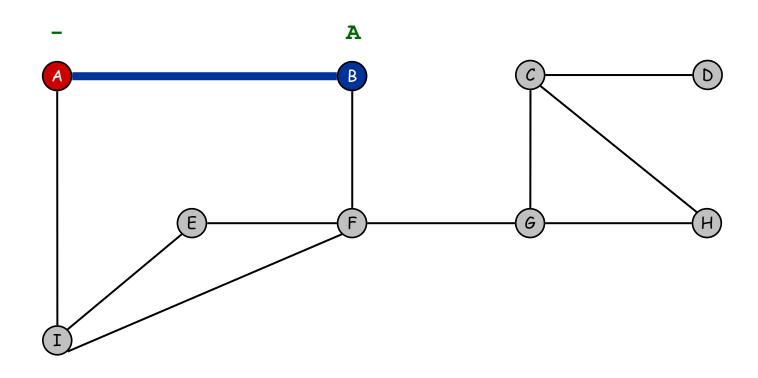
visit neighbors of A

front



visit neighbors of A

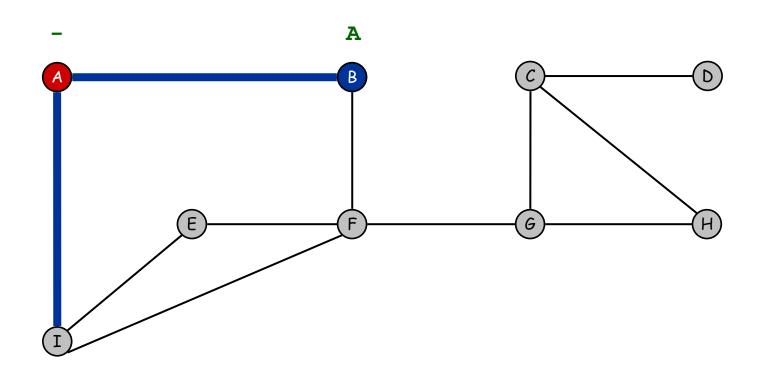
front



B discovered

front

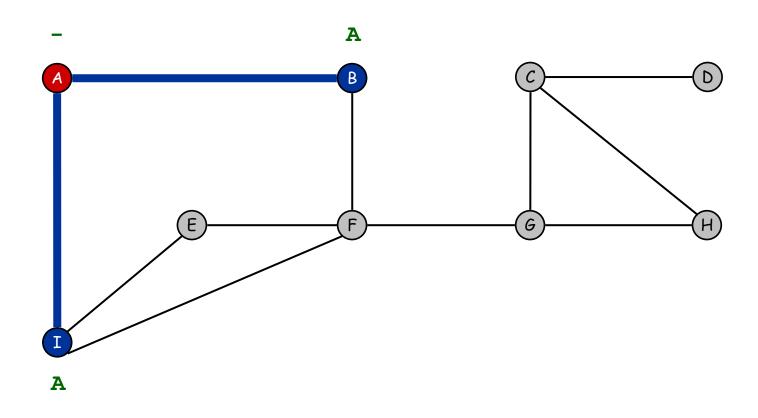
В



visit neighbors of A

front

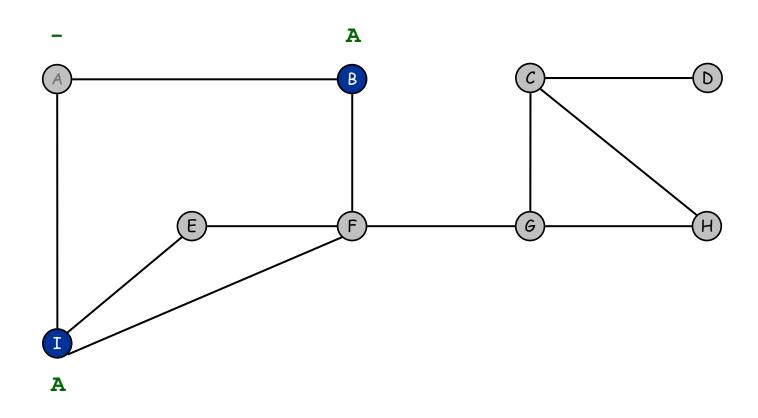
В



I discovered

front

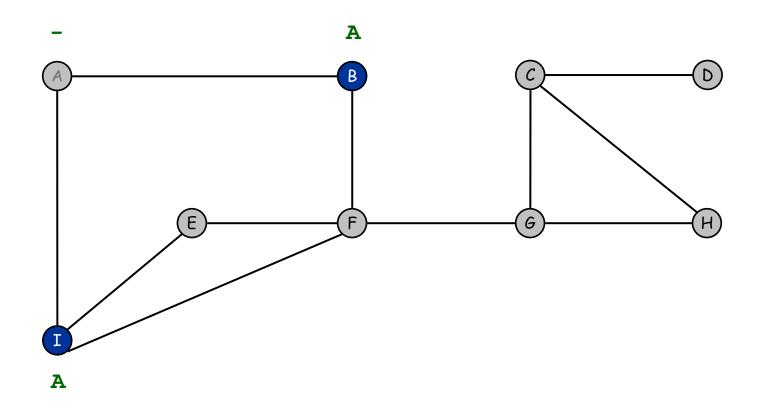
BI



finished with A

front

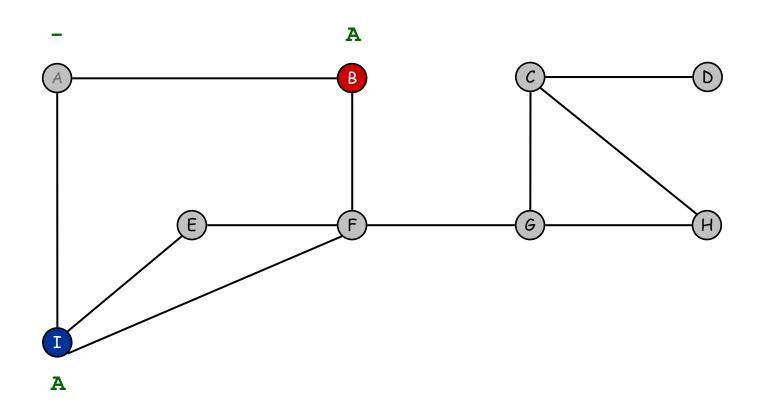
BI



dequeue next vertex

front

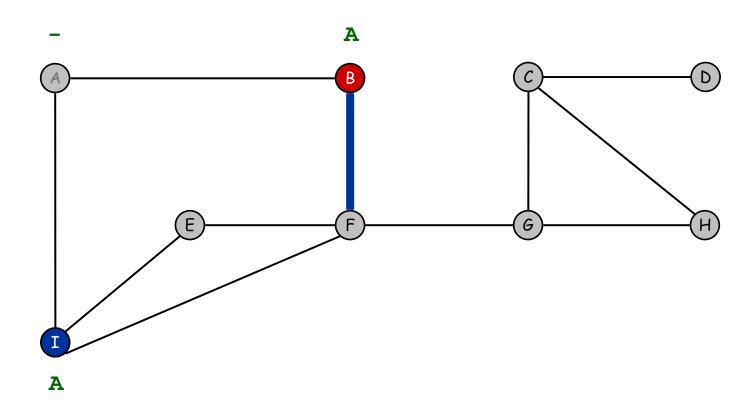
BI



visit neighbors of B

front

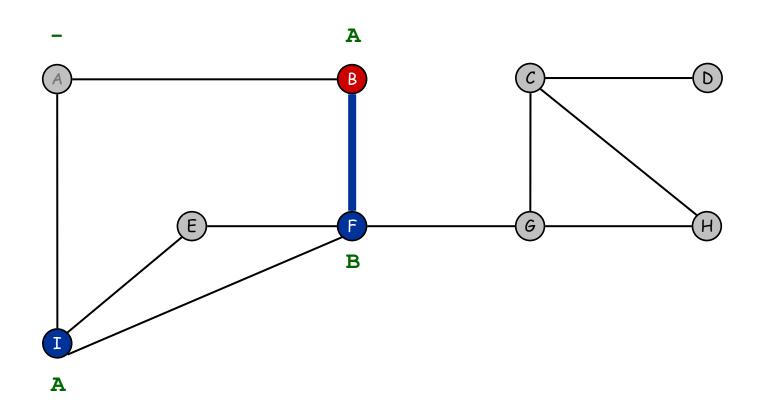
I



visit neighbors of B

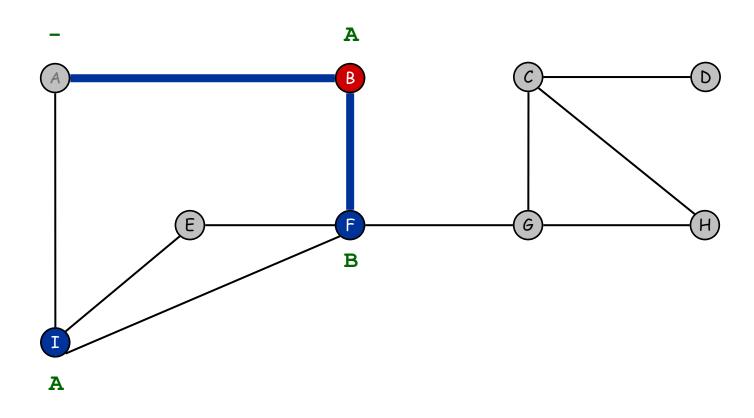
front

I



F discovered I F

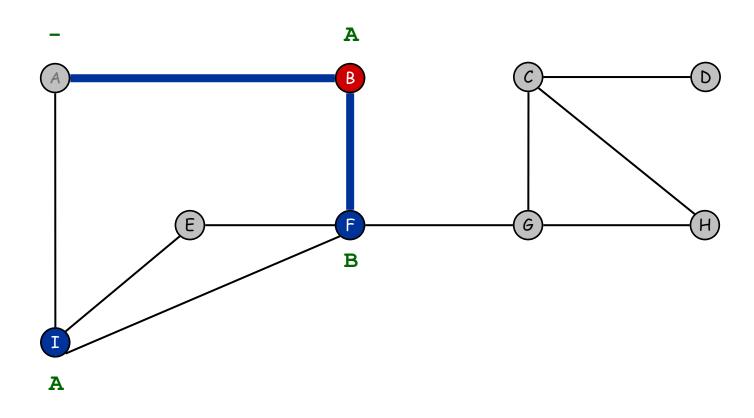
FIFO Queue



visit neighbors of B

front

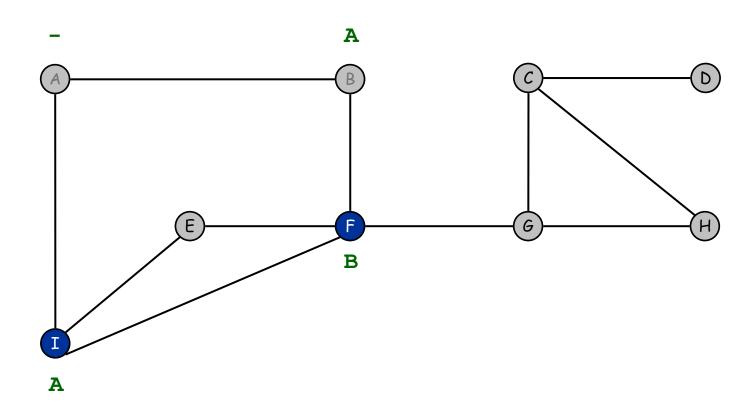
I F



A already discovered

front

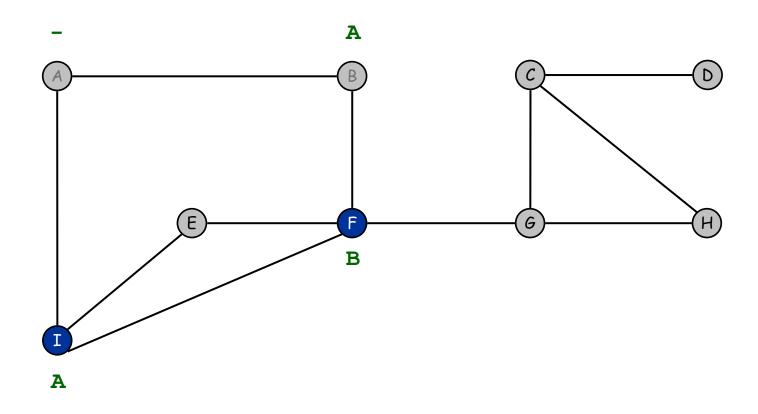
[F



finished with B

front

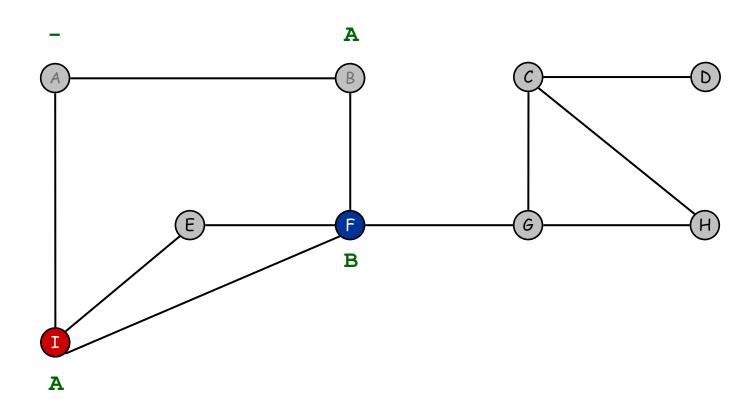
[F



dequeue next vertex

front

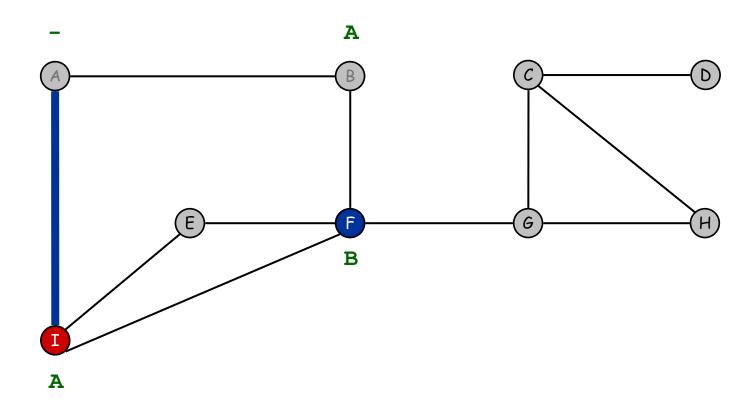
I F



visit neighbors of I

front

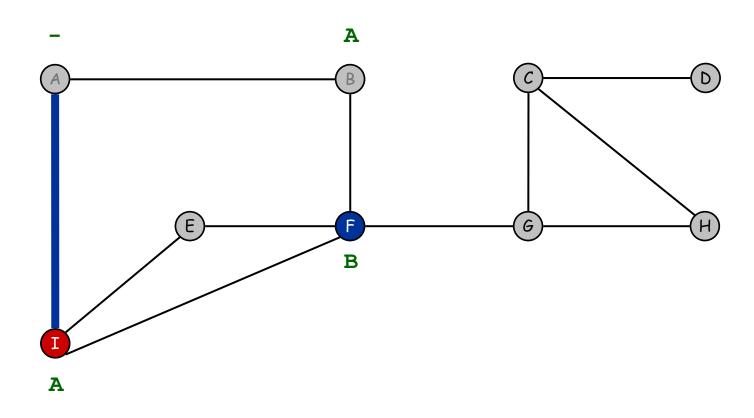
F



visit neighbors of I

front

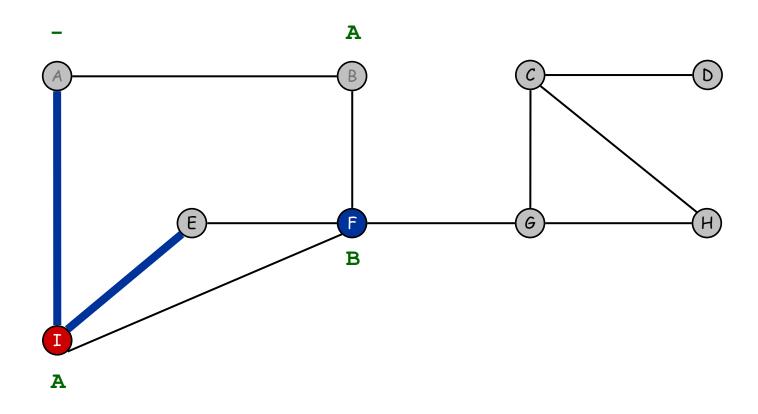
F



A already discovered

front

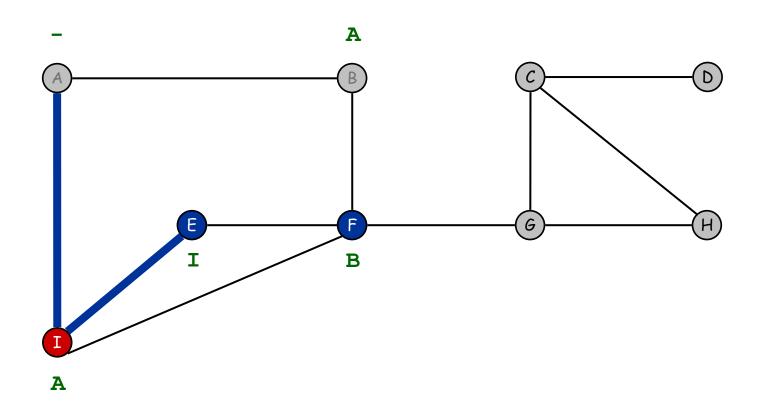
F



visit neighbors of I

front

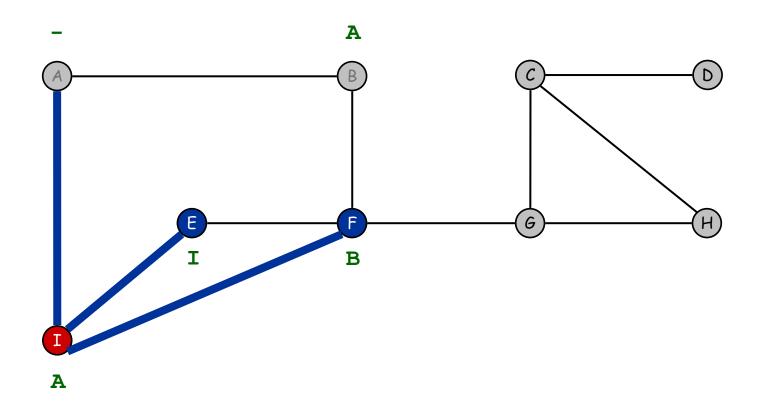
F



E discovered

front

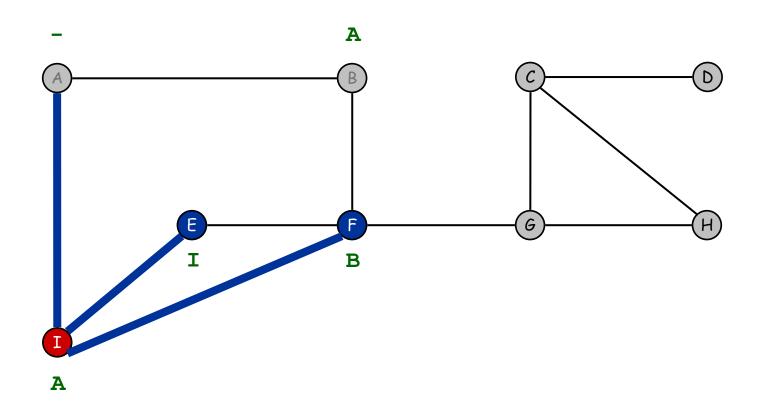
F E



visit neighbors of I

front

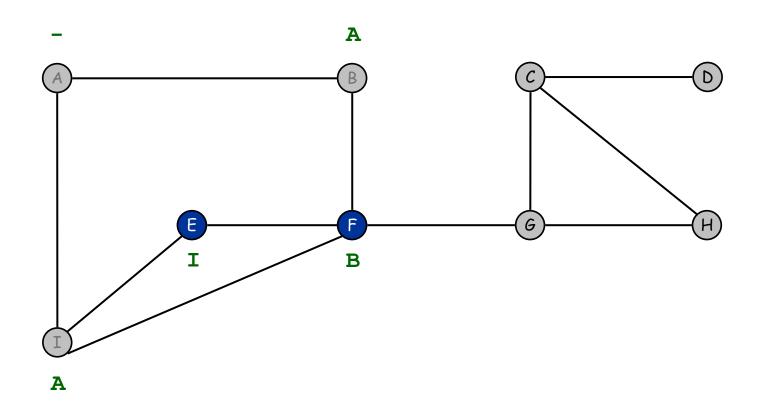
F E



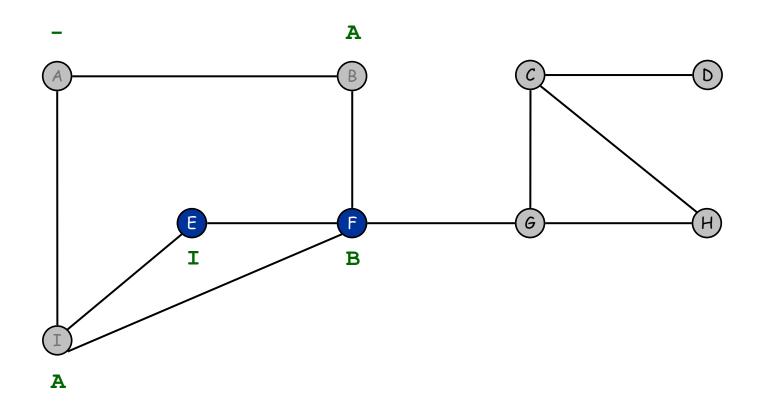
F already discovered

front

F E



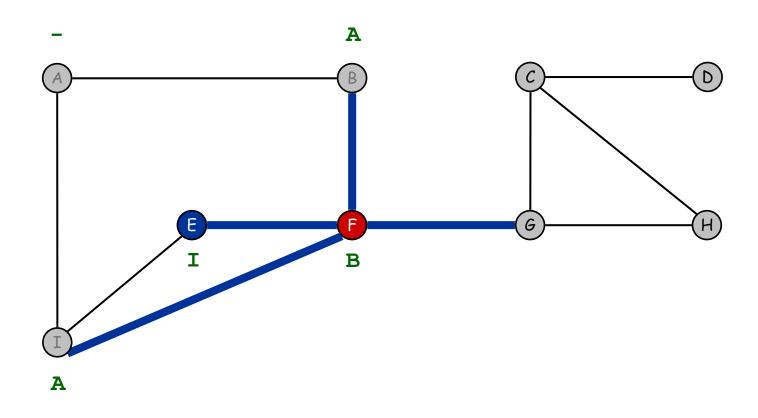
I finished front **F E**



dequeue next vertex

front

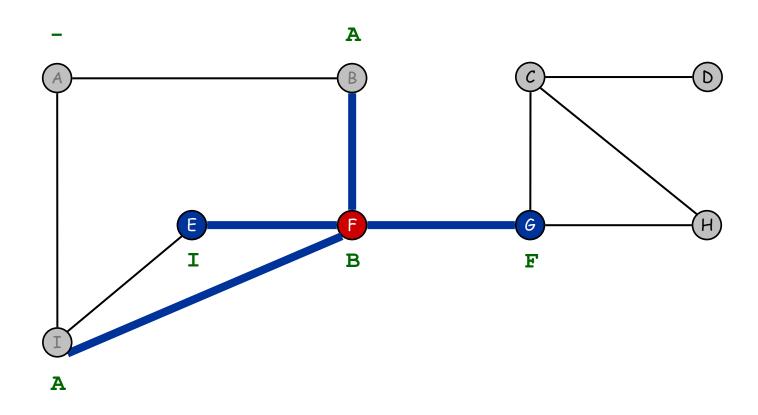
F E



visit neighbors of F

front

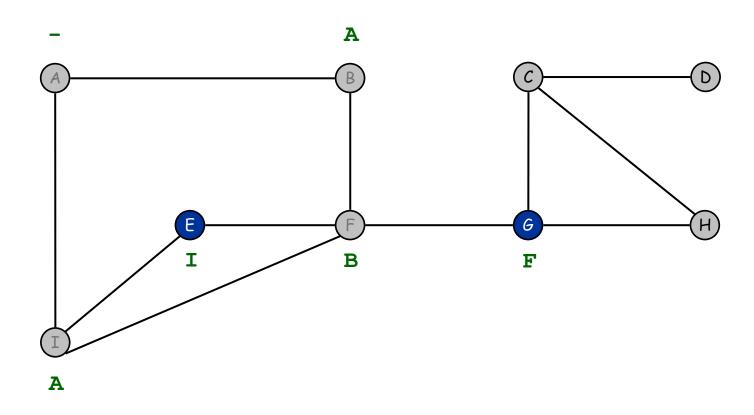
E



G discovered

front

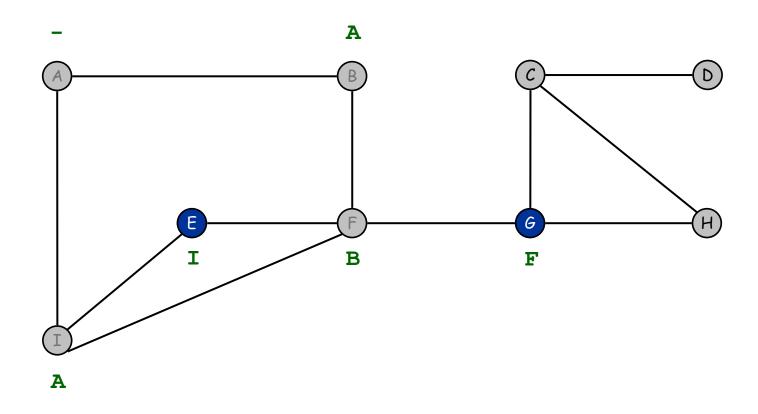
E G



F finished

front

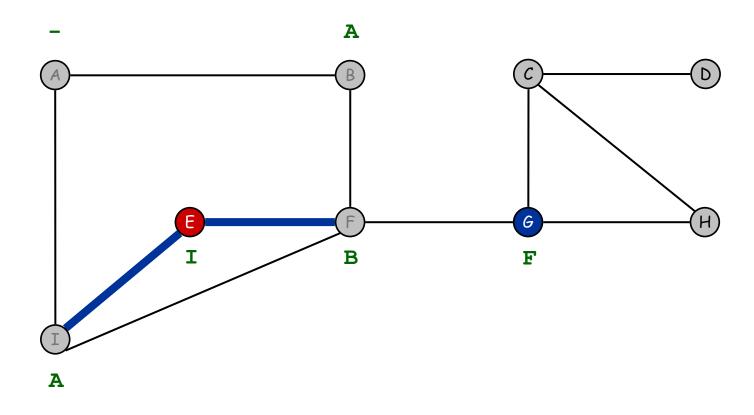
E G



dequeue next vertex

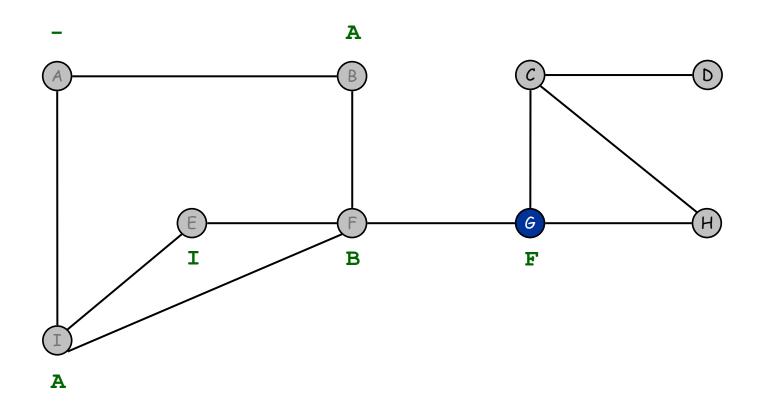
front

E G

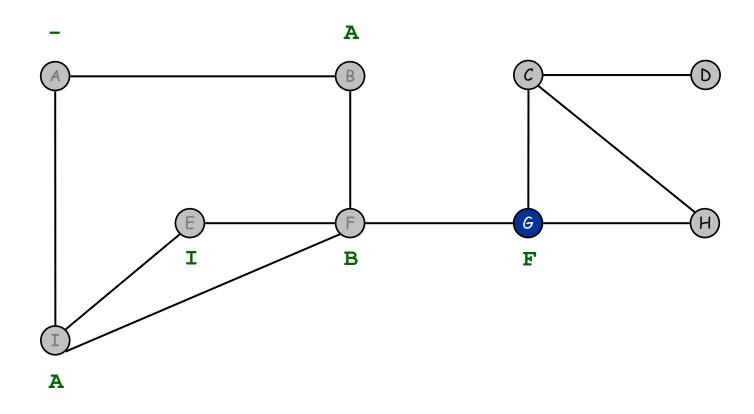


visit neighbors of E front **G**

FIFO Queue



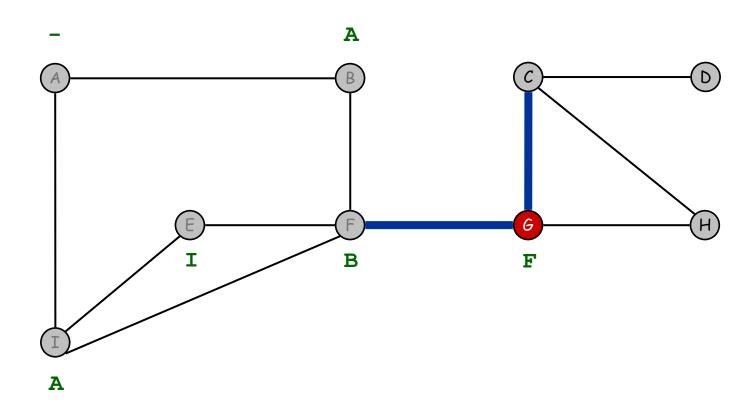
E finished G



dequeue next vertex

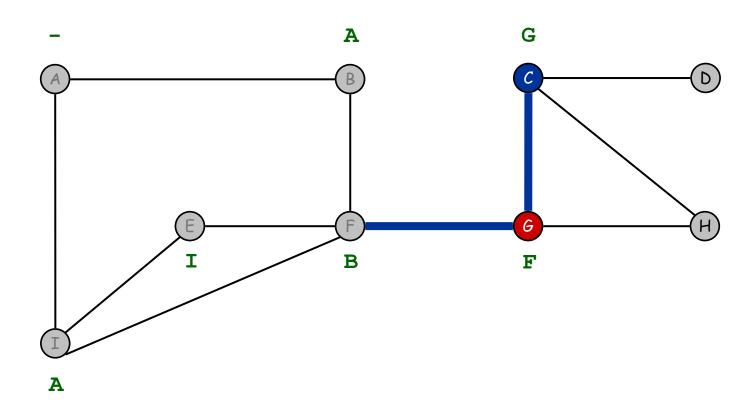
front

G

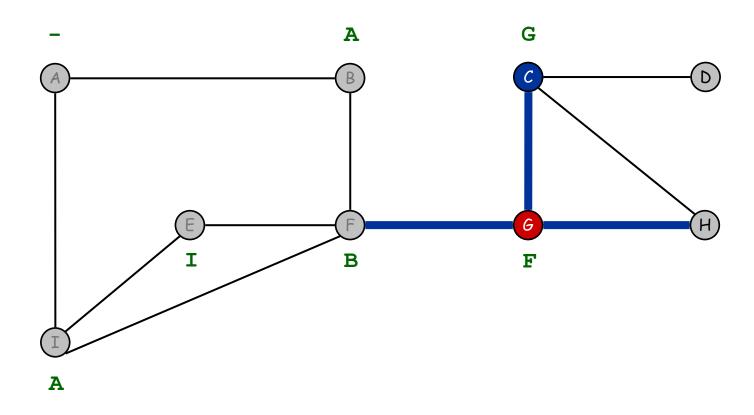


visit neighbors of G

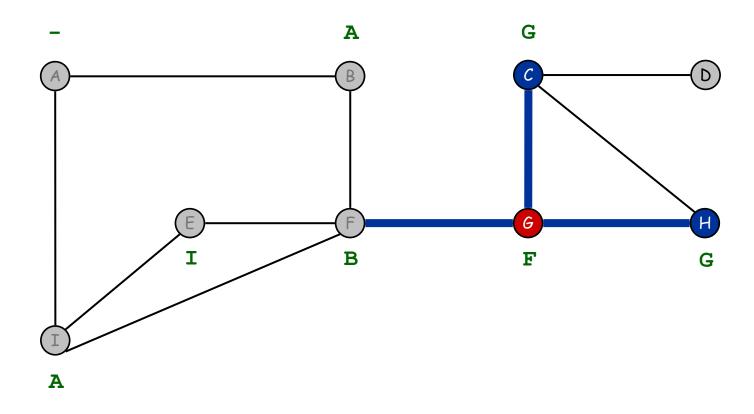
front



C discovered C

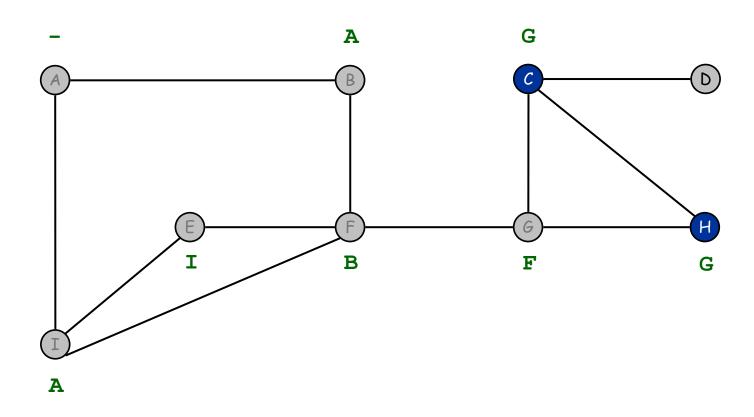


visit neighbors of G front C



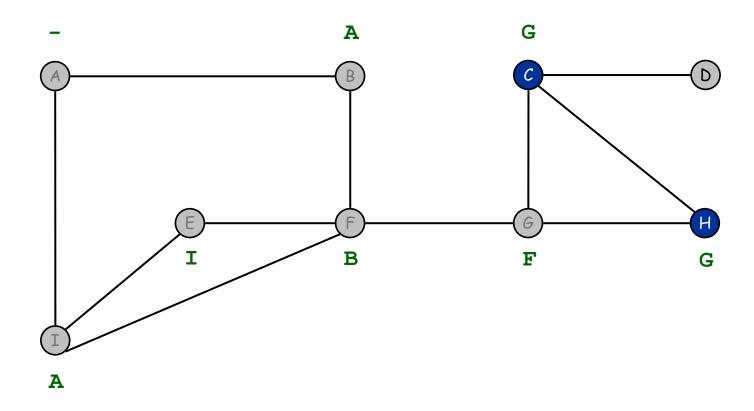
H discovered C H

FIFO Queue



G finished C H

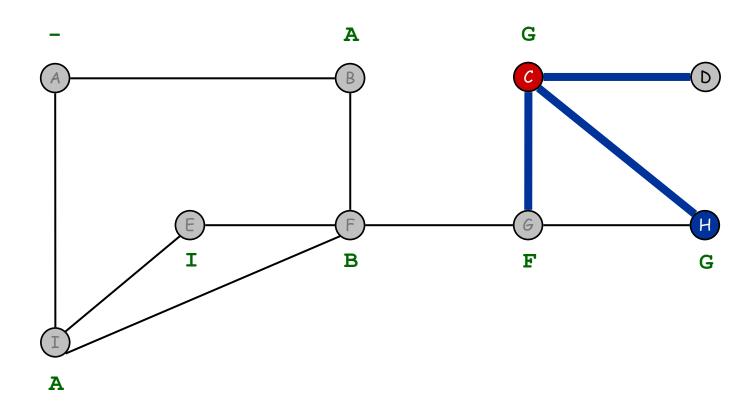
FIFO Queue



dequeue next vertex

front

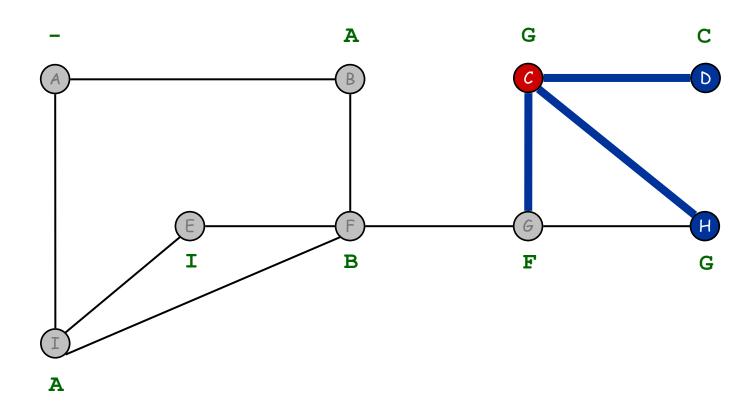
C H



visit neighbors of C

front

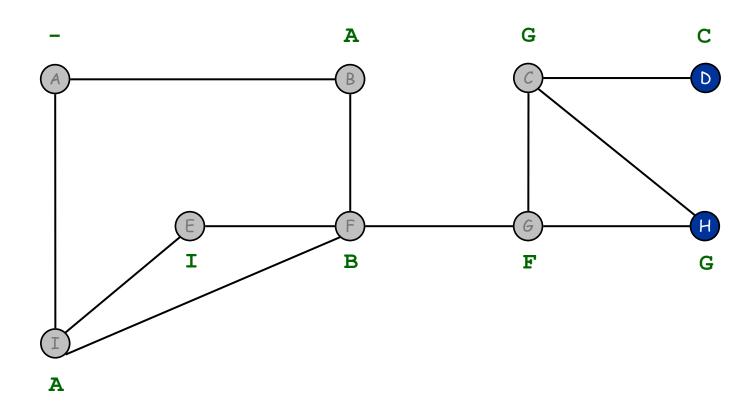
Н



D discovered

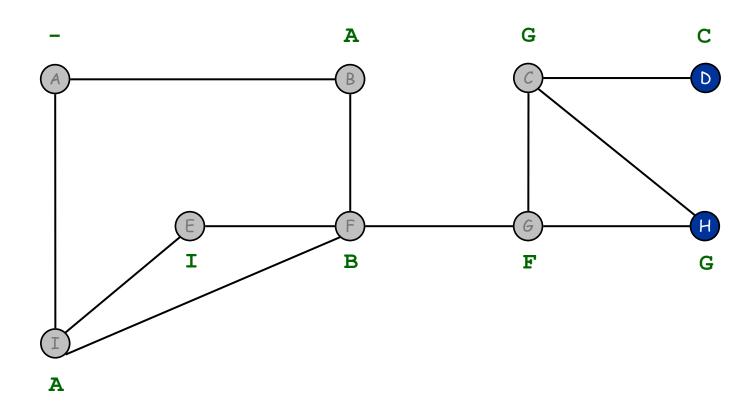
front

H D



C finished H D

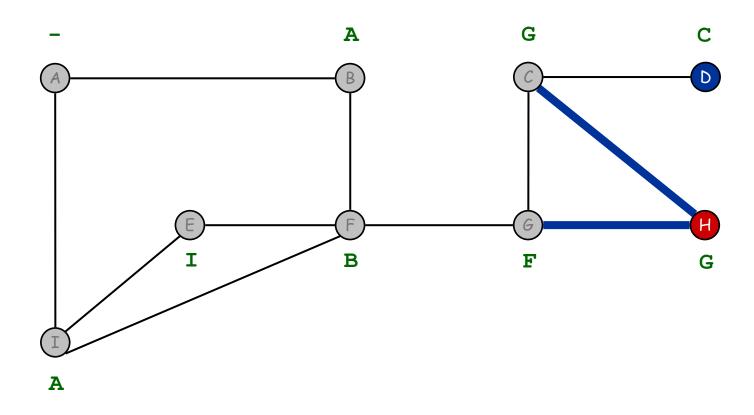
FIFO Queue



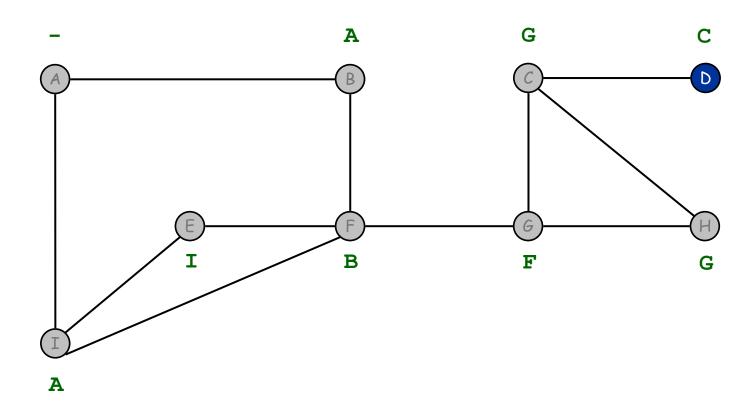
get next vertex

front

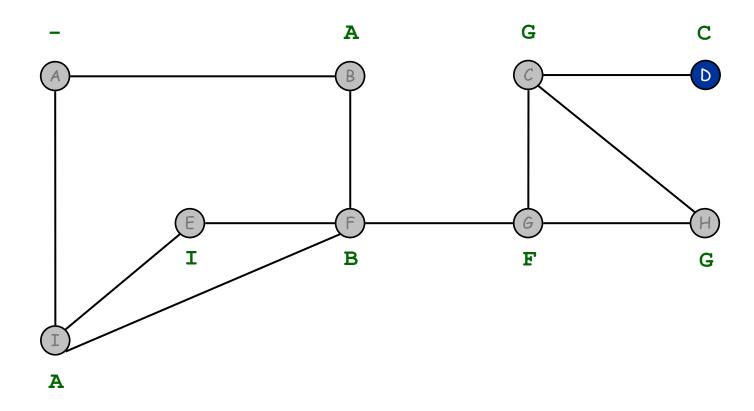
H D



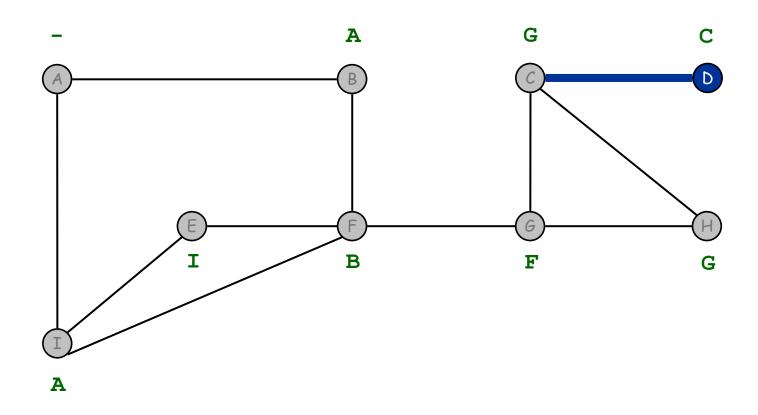
visit neighbors of H front D



finished H front D

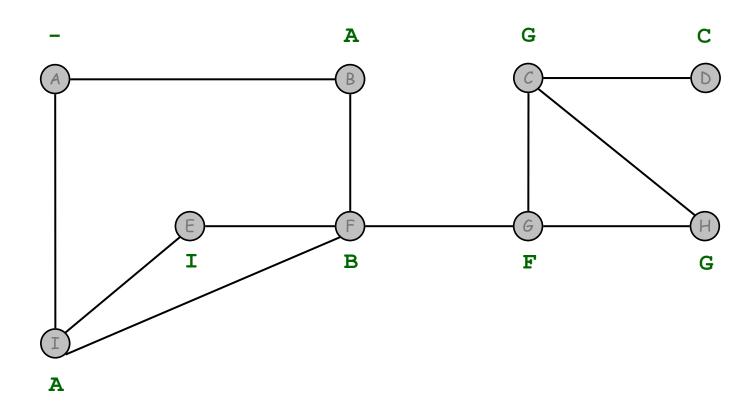


dequeue next vertex front D



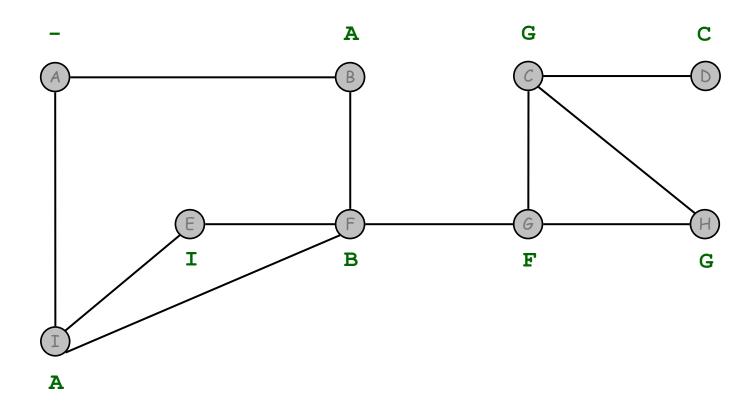
visit neighbors of D

front



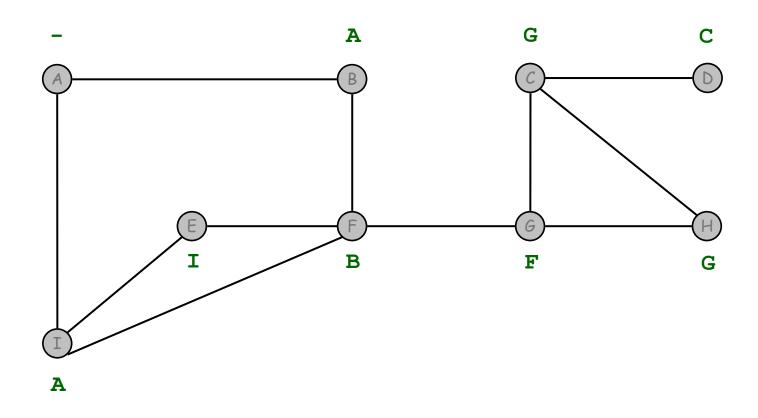
D finished

front



dequeue next vertex

front



STOP front

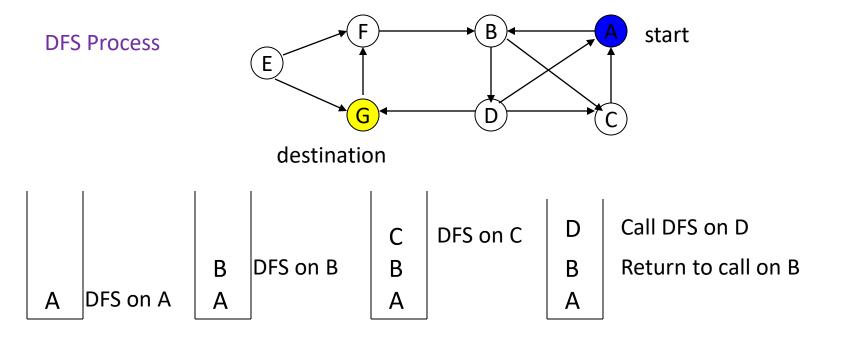
Time Complexity

- Each visited vertex is put on (and so removed from) the queue exactly once
- When a vertex is removed from the queue, we examine its adjacent vertices
 - O(|V|) if adjacency matrix used
 - O(vertex degree) if adjacency lists used
- Total time
 - -O(|E|+|V|), where E is number of vertices in the component that is searched (adjacency matrix)= $O(|V|^2)$
 - O(|V| + sum of component vertex degrees) (adj. lists)
 - = O(|V| + number of edges in component)=O(|V|+|E|)

Applications: Finding a Path

- Find path from source vertex s to destination vertex d
- Use graph search starting at s and terminating as soon as we reach d
 - Need to remember edges traversed
- Use depth first search?
- Use breath first search?

DFS vs. BFS



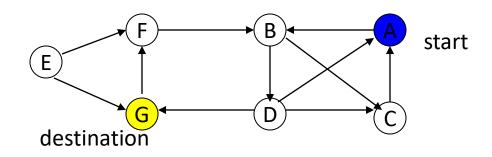
G D B Call DFS on G found destination - done!

Path is implicitly stored in DFS recursion

Path is: A, B, D, G

DFS vs. BFS





rear	Tront		
	Α		
Initial call to BFS on A Add A to queue			
rear	front		
	G		
Dequeue D			
	Add G		

rear	front	rear		front
	В		D	С
•	eue A Add B	Dequ Ad	ieue ld C,	
	destination		tely	

rear	front
	D
Dequeue C Nothing to add	

Path From Vertex s To Vertex d

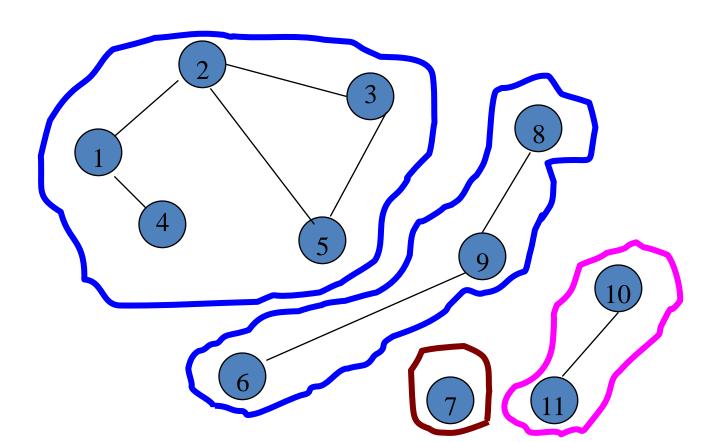
- Time
 - $-O(|V|^2)$ when adjacency matrix used
 - -O(|V|+|E|) when adjacency lists used (|E| is number of edges)

Is The Graph Connected?

- Start a breadth-first search at any vertex of the graph
- Graph is connected iff all n vertices get visited
- Time
 - O($|V|^2$) when adjacency matrix used
 - O(|V|+|E|) when adjacency lists used (|E| is number of edges)

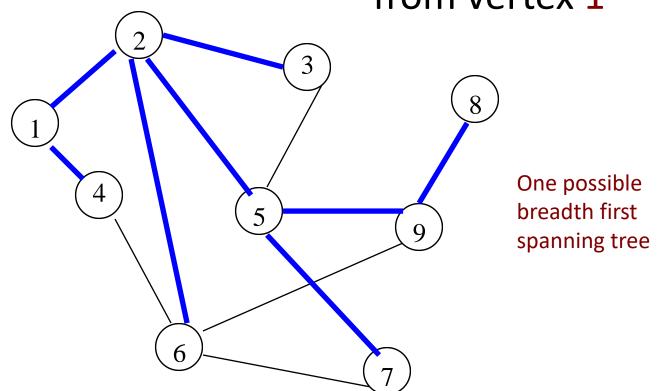
Connected Components

- Start a BFS at any as yet unvisited vertex of the graph
- Newly visited vertices (plus edges between them) define a component
- Repeat until all vertices are visited



Breadth First Spanning Tree Breadth-first search

Breadth-first search from vertex 1



- Keep track of edges used to reach new vertices
- These edges form a spanning tree if the graph is connected

Spanning Tree

- Start a breadth-first search at any vertex of the graph
- If graph is connected, the n-1 edges used to get to unvisited vertices define a spanning tree (breadth-first spanning tree)
- Time
 - $-O(n^2)$ when adjacency matrix used
 - O(n+e) when adjacency lists used (e is number of edges)