

Graphs

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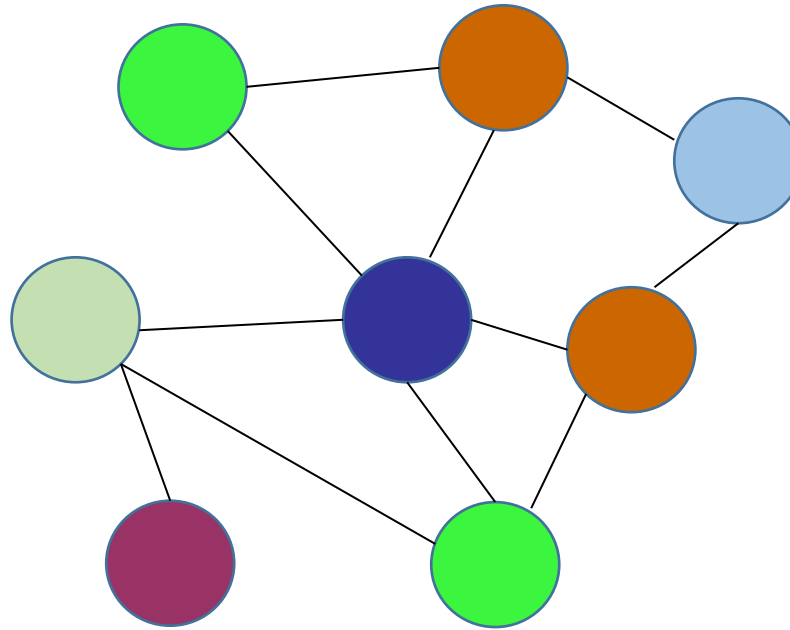
- Non linear Data structures
- Represent many to many relationship among elements, adjacency relation
- Each element has many successors and predecessors

Graphs

- $G = (V, E)$
- V is the vertex set.
- Vertices are also called nodes and points.
- E is the edge set.
- Each edge connects two different vertices.
- Edges are also called arcs and lines.



Graph – Adjacency representation



Orientation of edges

- Directed edge has an orientation (u,v)



- Undirected edge has no orientation (u,v) .



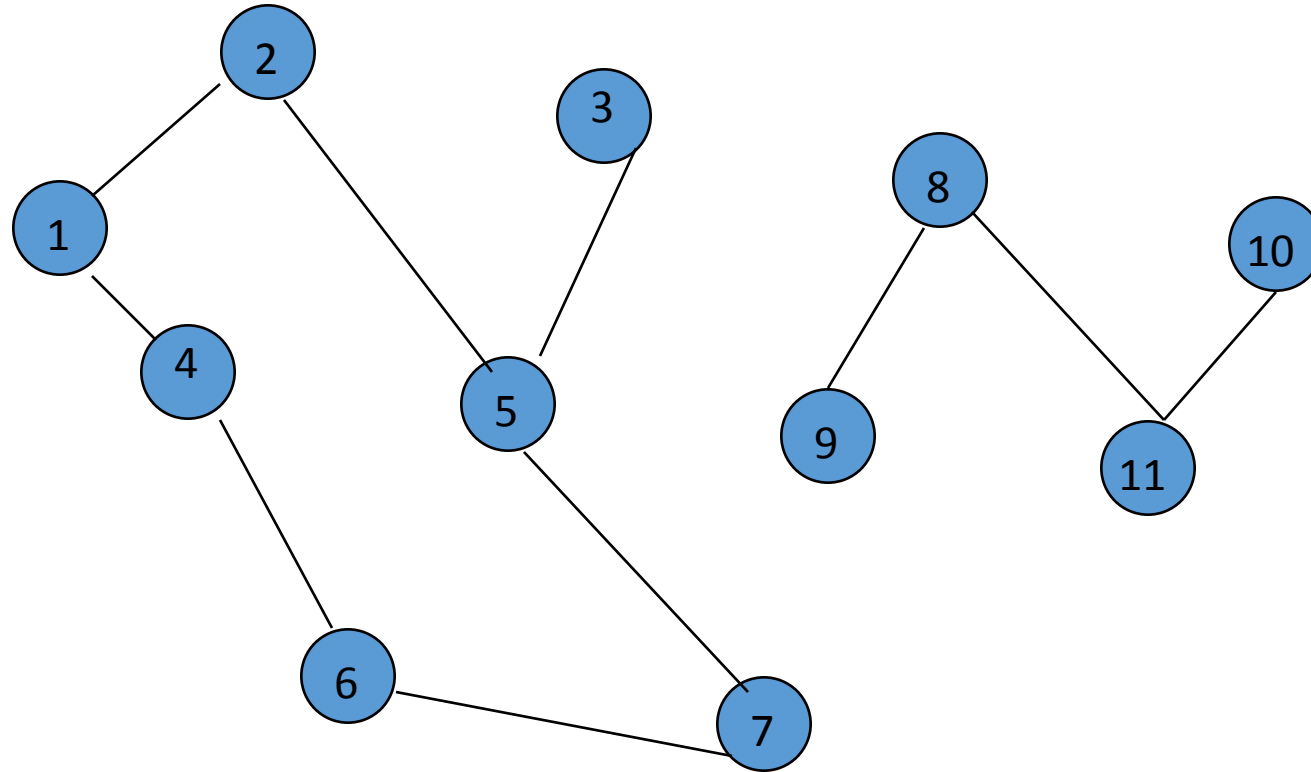
Types

- Directed Graph
- Undirected Graph
- Weighted Graph

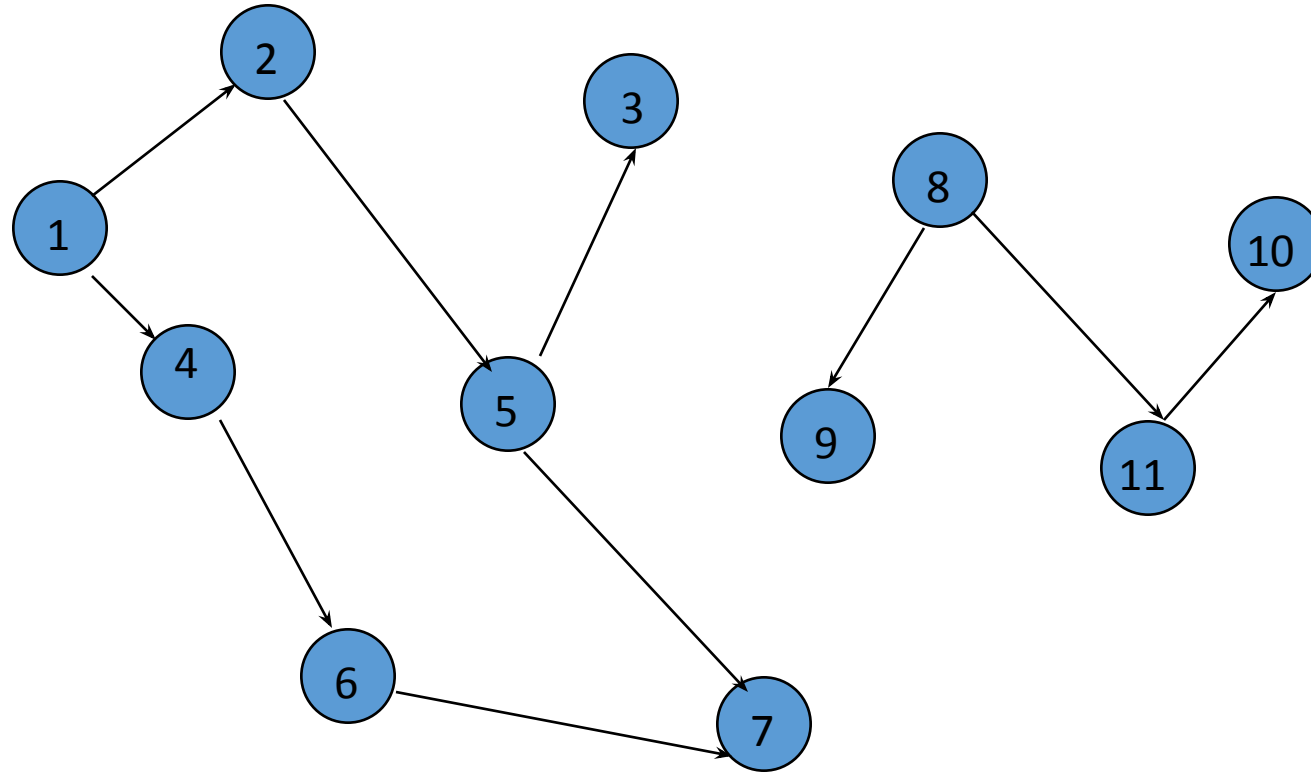
Directed and undirected graph

- Undirected graph \Rightarrow no oriented edge.
- Directed graph \Rightarrow every edge has an orientation.

Undirected Graph



Directed Graph (Digraph)



Applications

Vertex	Edge
City	Road
Computer	Communication Link
Railway Station	Tracks
Bus Station	Road Route
Social connect - User	Friendship

Terminology



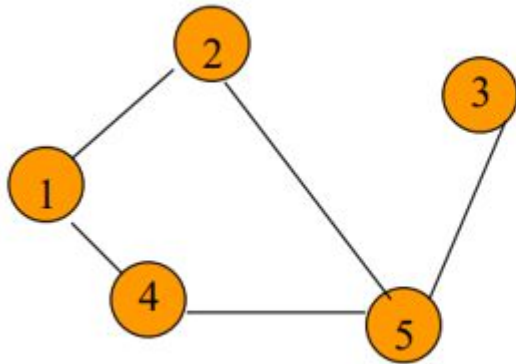
- **Loop:** an edge that connects a vertex to itself.
- **Path:** a sequence of vertices, p_0, p_1, \dots, p_m , such that each adjacent pair of vertices p_i and p_{i+1} are connected by an edge.
- **Cycle:** a simple path with no repeated vertices or edges other than the starting and ending vertices. A cycle in a directed graph is called a directed cycle.
- **Multiple edges:** in principle, a graph can have two or more edges connecting the same two vertices in the same direction.
- **Simple graphs:** the graphs that have no loops and no multiple edges.
- **Directed acyclic graphs:** A directed graph with no cycles is a directed acyclic graph (DAG).

Representation of Graphs

- Adjacency matrix
- Adjacency List

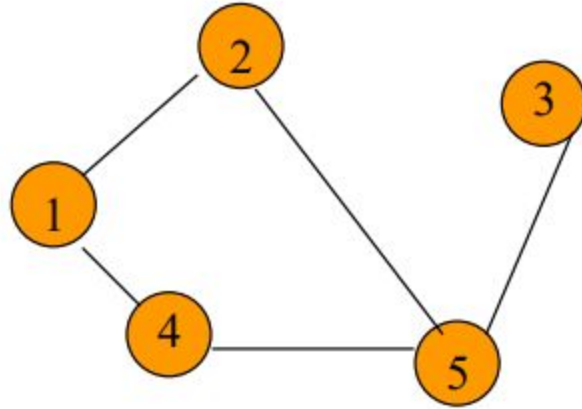
Adjacency Matrix

- 0/1 $n \times n$ matrix, where $n = \#$ of vertices
- $A(i,j) = 1$ iff (i,j) is an edge



	1	2	3	4	5
1	0	1	0	1	0
2	1	0	0	0	1
3	0	0	0	0	1
4	1	0	0	0	1
5	0	1	1	1	0

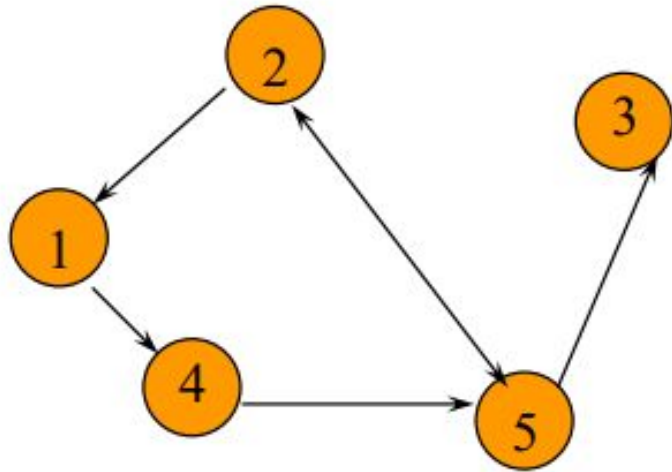
Adjacency Matrix Properties



	1	2	3	4	5
1	0	1	0	1	0
2	1	0	0	0	1
3	0	0	0	0	1
4	1	0	0	0	1
5	0	1	1	1	0

- Diagonal entries are zero.
- Adjacency matrix of an undirected graph is symmetric.
 - $A(i,j) = A(j,i)$ for all i and j .

Adjacency Matrix (Digraph)



	1	2	3	4	5
1	0	0	0	1	0
2	1	0	0	0	1
3	0	0	0	0	0
4	0	0	0	0	1
5	0	1	1	0	0

- Diagonal entries are zero.
- Adjacency matrix of a digraph need not be symmetric.

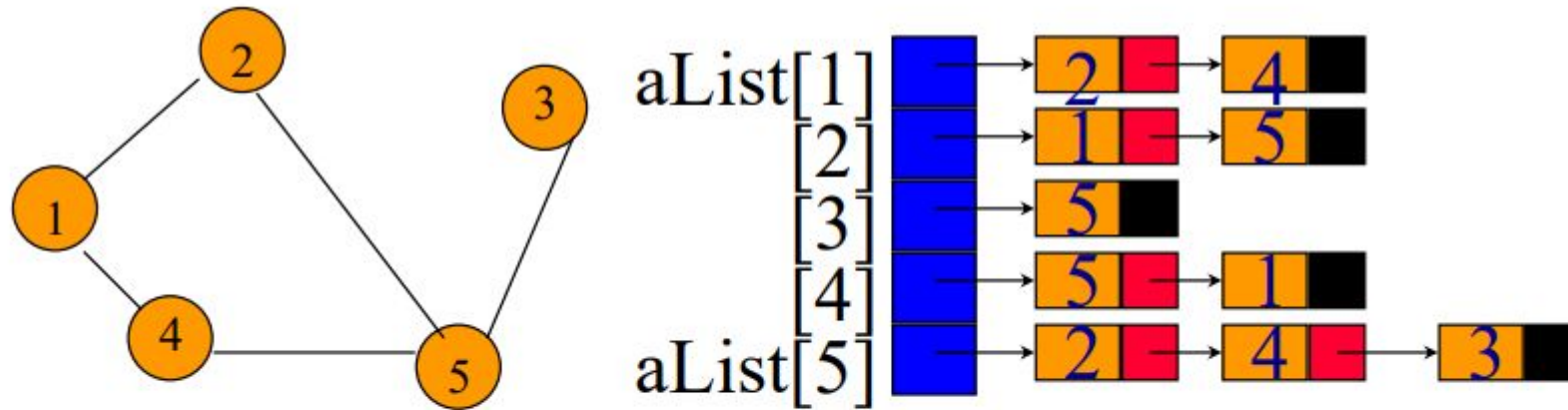
Adjacency Matrix

- n^2 bits of space
- 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.

Adjacency List Representation

- Adjacency list for vertex i is a linear list of vertices adjacent from vertex i
- An array of n adjacency lists

Adjacency List Representation

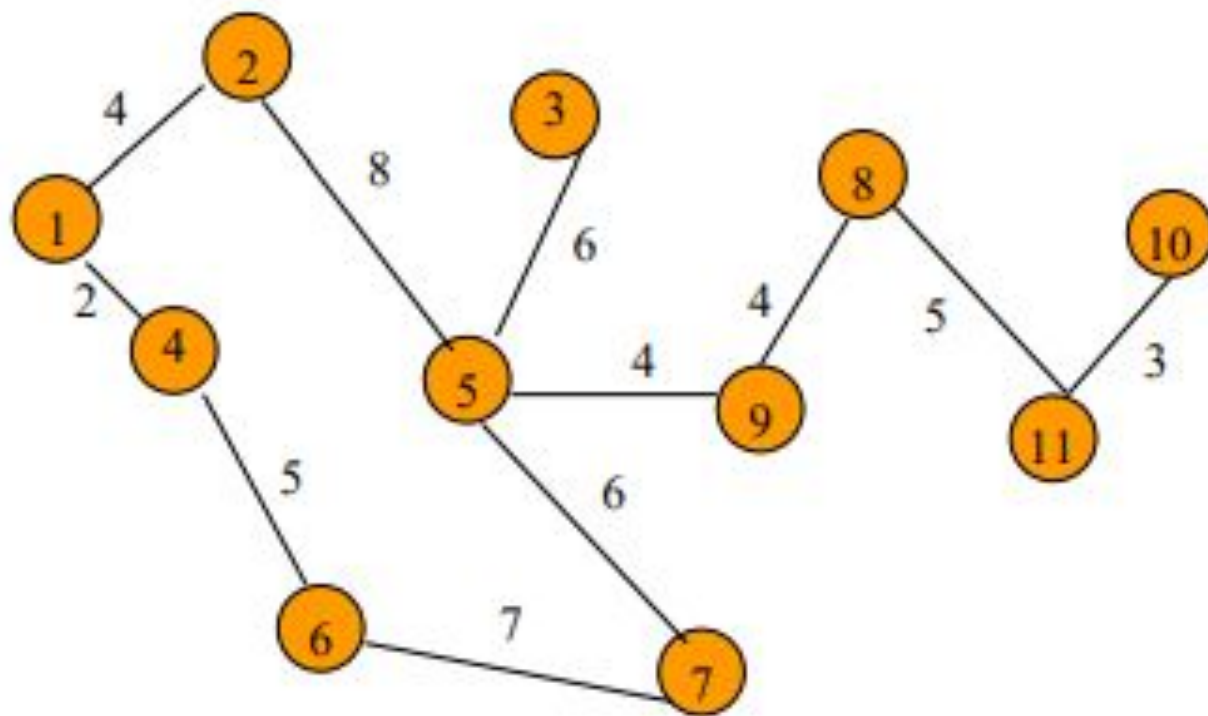


Array Length = n

of chain nodes = $2e$ (undirected graph)

of chain nodes = e (digraph)

Driving Distance/Time Map



- Vertex = city, edge weight = driving distance/time.

Which Representation is Best?

- If space is available, then an adjacency matrix is easier to implement and is generally easier to use than edge lists
- Other operations
 1. Adding or removing edges
 2. Checking whether a particular edge is present
 3. Iterating a loop that executes one time for each edge with a particular source vertex

Choice of representation for efficient implementation of these operations?

Which Representation is Best?

- Operations
 1. Adding or removing edges
 2. Checking whether a particular edge is present
 3. Iterating a loop that executes one time for each edge with a particular source vertex

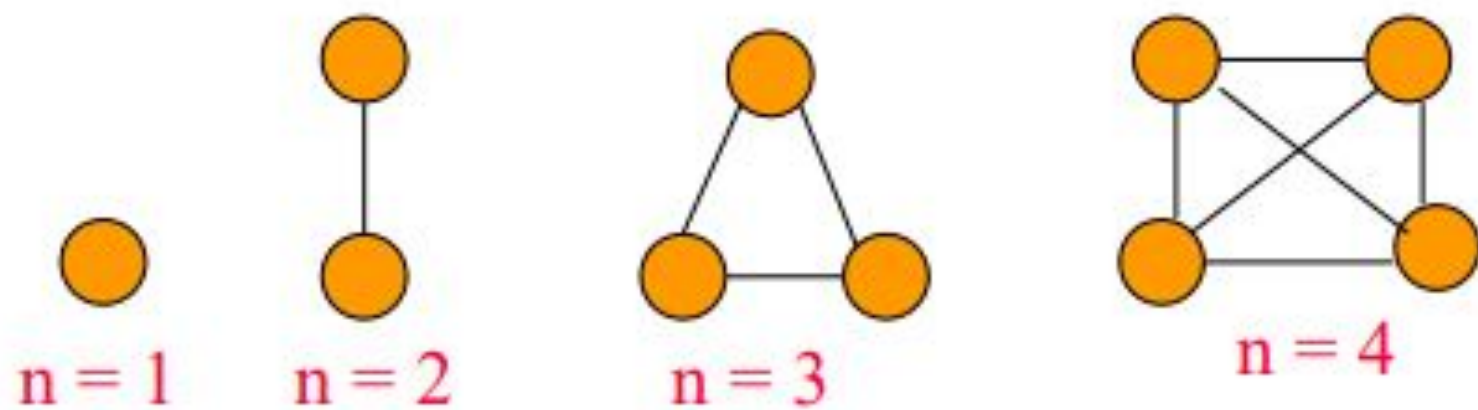
Choice

- Both (1) and (2) require only a small constant amount of time with the adjacency matrices.
- Both (1) and (2) require $O(n)$ operations with the adjacency list representation in the worst case
- With (3), edge lists ($O(e)$, where e is the number of edges that have vertex i as their source) are more efficient than adjacency matrix ($O(n)$).

If each vertex has only a few edges (sparse graph), then an adjacency matrix will waste space, with many 0

Complete Undirected Graph

Has all possible edges.



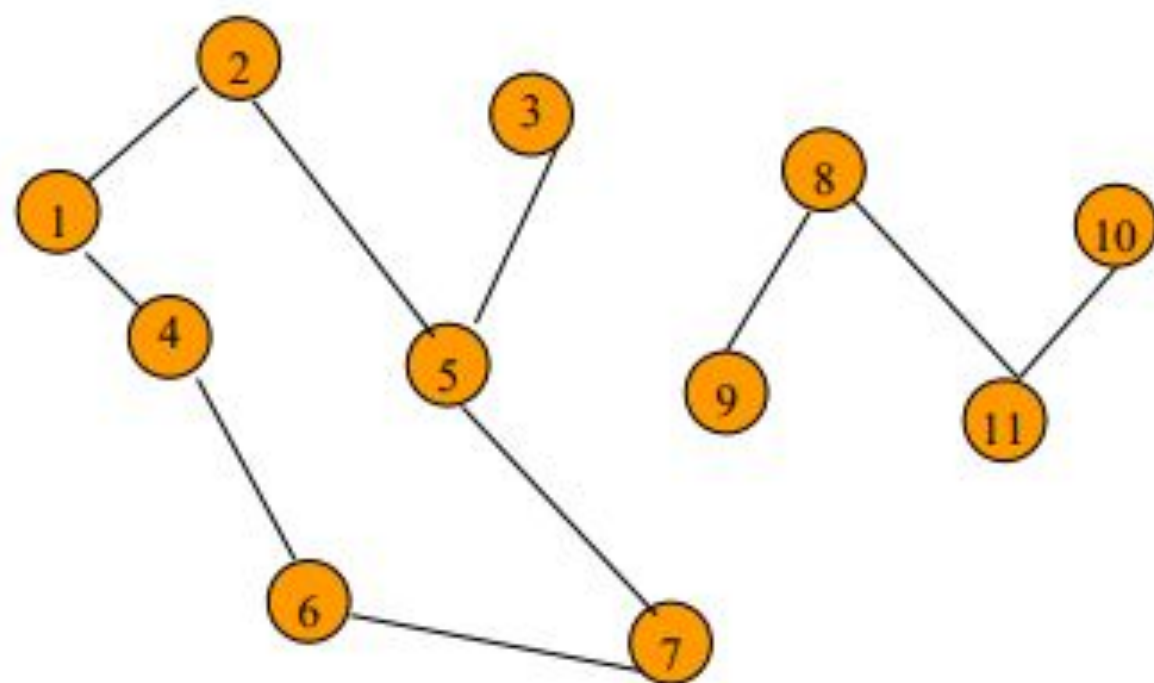
Number Of Edges—Undirected Graph

- Each edge is of the form (u,v) , $u \neq v$.
- Number of such pairs in an n vertex graph is $n(n-1)$.
- Since edge (u,v) is the same as edge (v,u) , the number of edges in a complete undirected graph is $n(n-1)/2$.
- Number of edges in an undirected graph is $\leq n(n-1)/2$.

Number Of Edges—Directed Graph

- Each edge is of the form (u,v) , $u \neq v$.
- Number of such pairs in an n vertex graph is $n(n-1)$.
- Since edge (u,v) is not the same as edge (v,u) , the number of edges in a complete directed graph is $n(n-1)$.
- Number of edges in a directed graph is $\leq n(n-1)$.

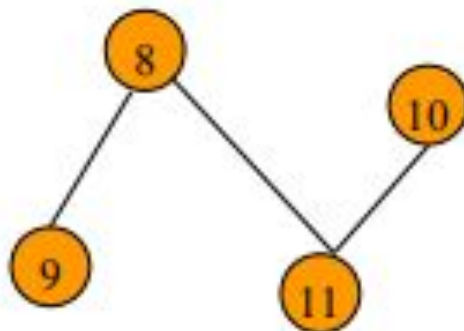
Vertex Degree



Number of edges incident to vertex.

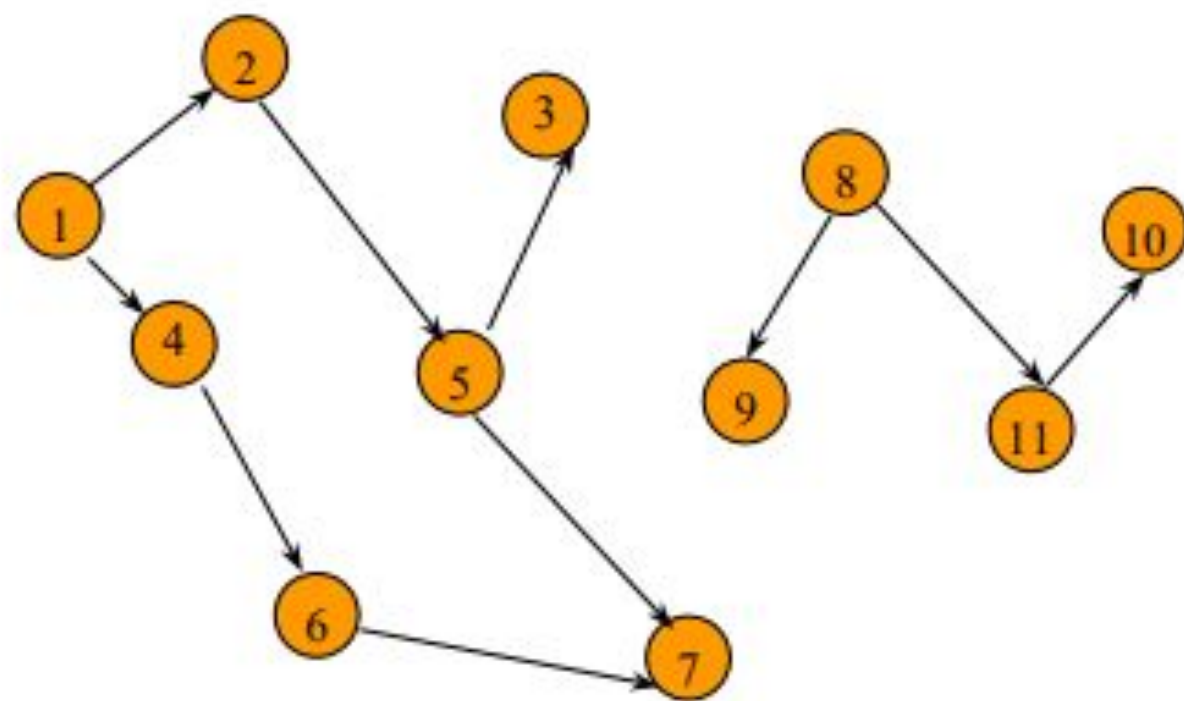
$$\text{degree}(2) = 2, \text{degree}(5) = 3, \text{degree}(3) = 1$$

Sum Of Vertex Degrees



Sum of degrees = $2e$ (e is number of edges)

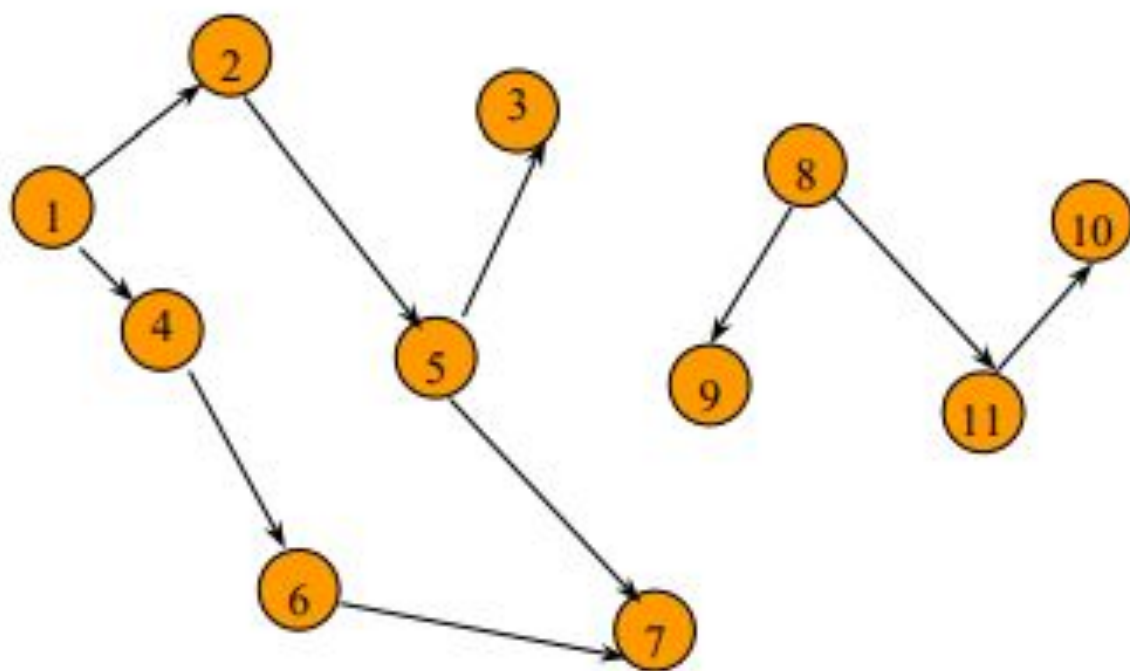
In-Degree Of A Vertex



in-degree is number of incoming edges

$\text{indegree}(2) = 1, \text{indegree}(8) = 0$

Out-Degree Of A Vertex



out-degree is number of outbound edges

$\text{outdegree}(2) = 1$, $\text{outdegree}(8) = 2$

Sum Of In- And Out-Degrees

- Each edge contributes 1 to the in-degree of some vertex and 1 to the out-degree of some other vertex
- Sum of in-degrees = sum of out-degrees = e ,
where e is the number of edges in the digraph

Graph Traversal

- The goal of a graph traversal is to find all nodes reachable from a given set of root nodes.
- In an undirected graph we follow all edges
- In a directed graph we follow only out-edges

Breadth First Traversal

- Explore neighbours first, before moving to the next level of neighbours.
- Repeatedly explore adjacent vertices using Mark each vertex we visit, so we don't process each more than once.

BFS pseudo code

Algorithm BFS(Node start)

 initialize queue q

 insert(q, start)

 mark start as visited

 while(q is not empty) {

 next = delete(q) // and “process”

 for each node u adjacent to next

 if(u is not marked) {

 mark u

 insert (q , u)

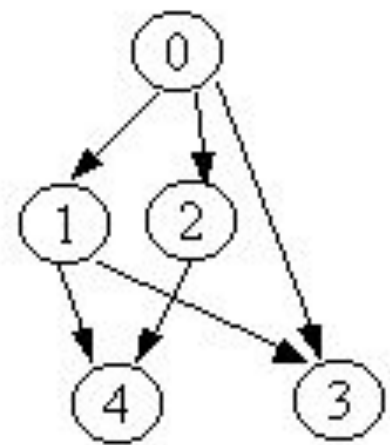
 } [end if] [end for]

 } [end while]


```

Algorithm BFS( start )
  initialize queue q
  insert(q, start )
  mark start as visited
  while(q is not empty) {
    next = delete(q)    // and “process”
    for each node u adjacent to next
      if(u is not marked) {
        mark u
        insert ( q , u)
      } [end if] [end for]
  } [end while]

```

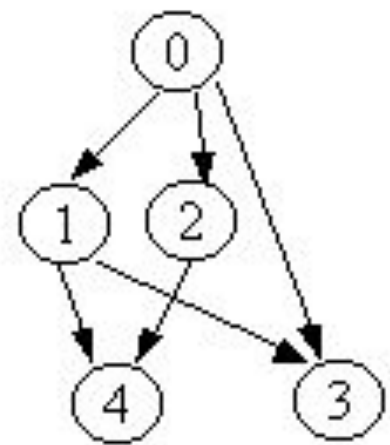


start = 0				
q				
q	0			
visited	0	1	2	3
	T			
next = 0 BFS = 0				
q				
u = 1, 2, 3				
visited	0	1	2	3
	T	T	T	T
q	1	2	3	

```

Algorithm BFS( start )
  initialize queue q
  insert(q, start )
  mark start as visited
  while(q is not empty) {
    next = delete(q)    // and “process”
    for each node u adjacent to next
      if(u is not marked) {
        mark u
        insert ( q , u)
      } [end if] [end for]
  } [end while]

```



u = 1, 2, 3

	0	1	2	3	4
visited	T	T	T	T	

q	1	2	3		
---	---	---	---	--	--

next = 1 BFS = 0 1

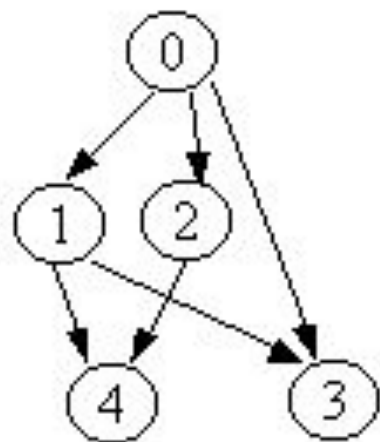
q		2	3		
---	--	---	---	--	--

u = 4, 3

	0	1	2	3	4
visited	T	T	T	T	T

q		2	3	4	
---	--	---	---	---	--

```
Algorithm BFS( start )
  initialize queue q
  insert(q, start )
  mark start as visited
  while(q is not empty) {
    next = delete(q)    // and “process”
    for each node u adjacent to next
      if(u is not marked) {
        mark u
        insert ( q , u)
      } [end if] [end for]
  } [end while]
```



next = 2 u = 4 BFS = 0 1 2

q

		3	4	
--	--	---	---	--

visited

0	1	2	3	4
T	T	T	T	T

q

			4	
--	--	--	---	--

next = 3 BFS = 0 1 2 3

			4	
--	--	--	---	--

next = 4 **BFS = 0 1 2 3 4**

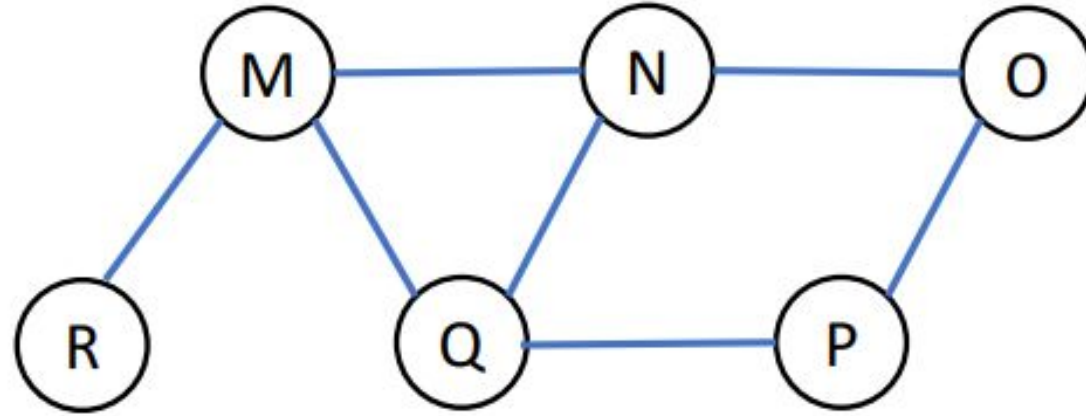
visited

0	1	2	3	4
T	T	T	T	T

q

--	--	--	--	--

What is one possible order of visiting the nodes of the following graph when using Breadth First Search (BFS)?



A) MNOPQR

C) QMNPOR

B) NQMPOR

D) QMNPOR

Depth First Traversal

- Follow a path until it ends, or until a cycle.
- Use a stack

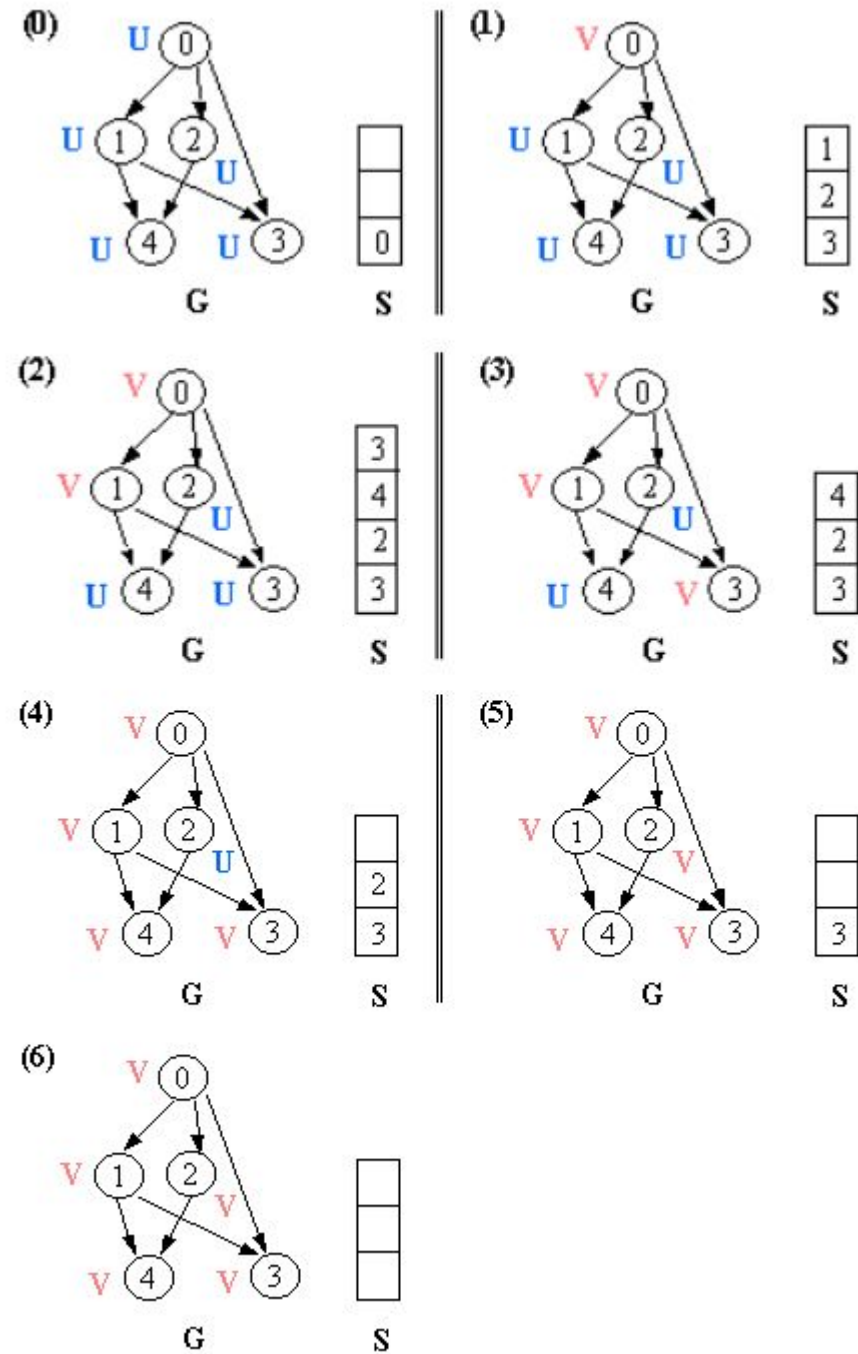
Depth First Search (DFS)

Algorithm DFS(G)

1. Initialize all vertices as "unvisited".
2. Let S be a stack.
3. Push the root on S
4. While (S not empty) {
5. Let n = Pop(S)
7. If (n is marked as "unvisited") {
8. Mark n as "visited"
9. Print n
10. For each vertex v adjacent to n
11. If v is marked as "unvisited"
12. push v on S.
13. end [end if]
14. end [end while]

Algorithm DFS(G)

1. Initialize all vertices as "unvisited".
2. Let S be a stack.
3. Push the root on S
4. While (S not empty) {
5. Let n = Pop(S)
7. If (n is marked as "unvisited") {
8. Mark n as "visited"
9. Print n
10. For each vertex v adjacent to n
11. If v is marked as "unvisited"
12. push v on S.
13. end [end if]
14. end [end while]



Graph Traversal Uses

- In addition to finding paths, we can use graph traversals to answer:
 - What are all the vertices reachable from a starting vertex?
 - Is an graph connected?
- What if we want to actually output the path?
 - Instead of just “marking” a node, store the previous node along the path
 - When you reach the goal, follow path fields back to where you started (and then reverse the answer)
 - If just wanted path length, could put the integer distance at each node instead once

Applications

- Google Maps
- Facebook
- Social networks
- World wide web
- Operating systems - resource allocation graph
- Computer games
- Robot planning
- Semantic networks