

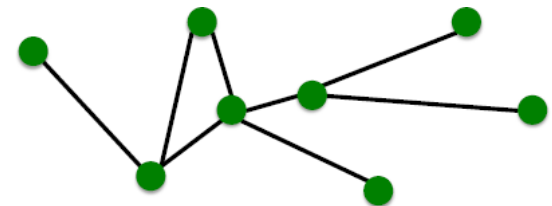
# Graphs



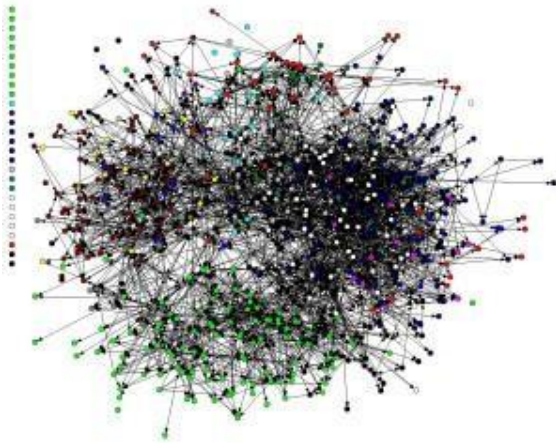
- Depth First Search (DFS)
- Breath First Search (BFS)

# Introduction

- **Graph** – A tool to model binary relationships among entities/objects Specified by two sets – Set of vertices  $V$  and set of Edges  $E$
- **Vertex/Node** – represent entities
- **Edge** – represent existence of relationship between a pair of entities A graph  $G(V, E)$  where  $E \subseteq V \times V$



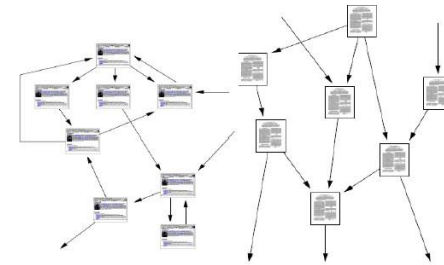
# Graph everywhere



**Email  
Communication  
Network**



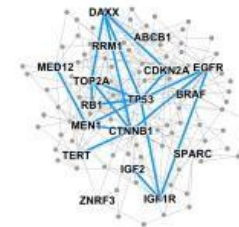
Social networks



Information networks:  
Web & citations

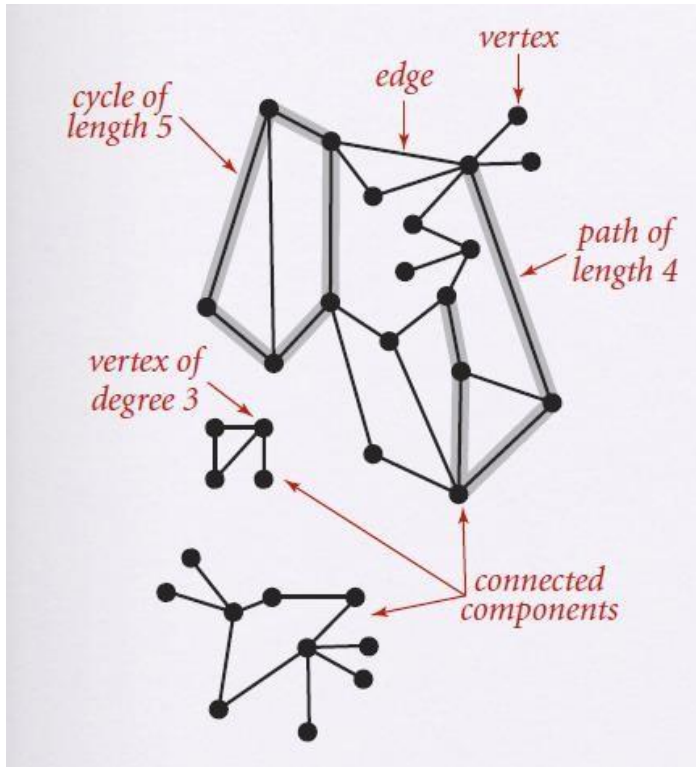


Patient networks

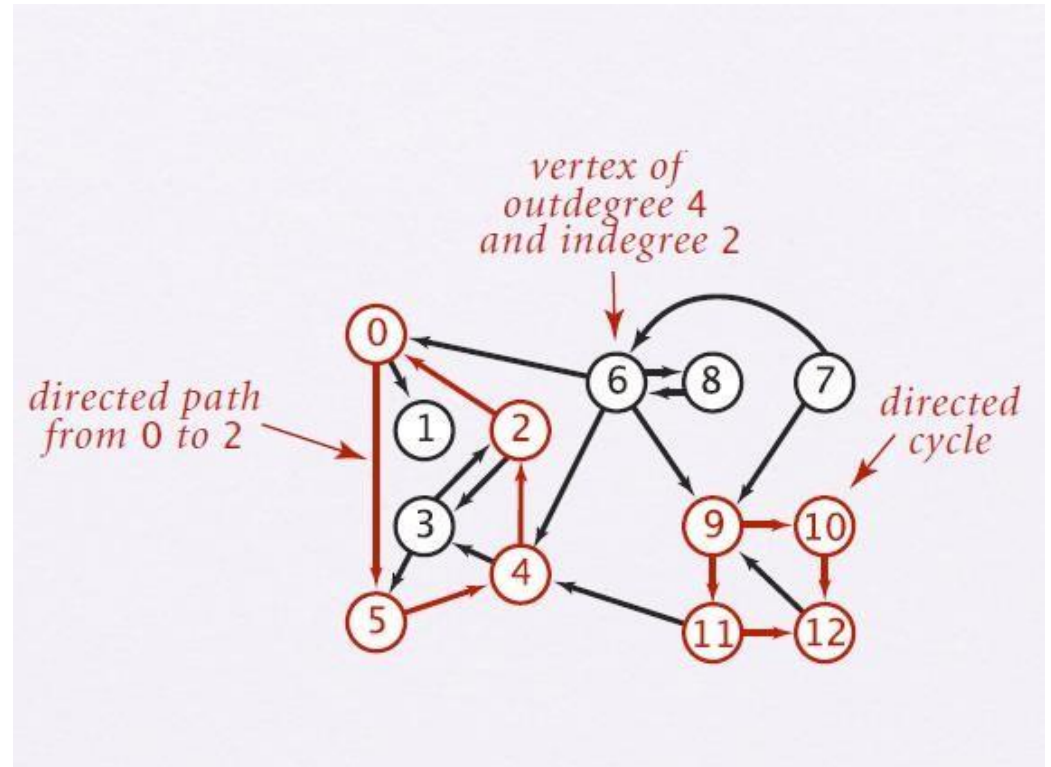


Disease pathways

# Graph terminology



# Undirected graph



## Directed graph

# Handshaking Lemma

- **Undirected Graph**

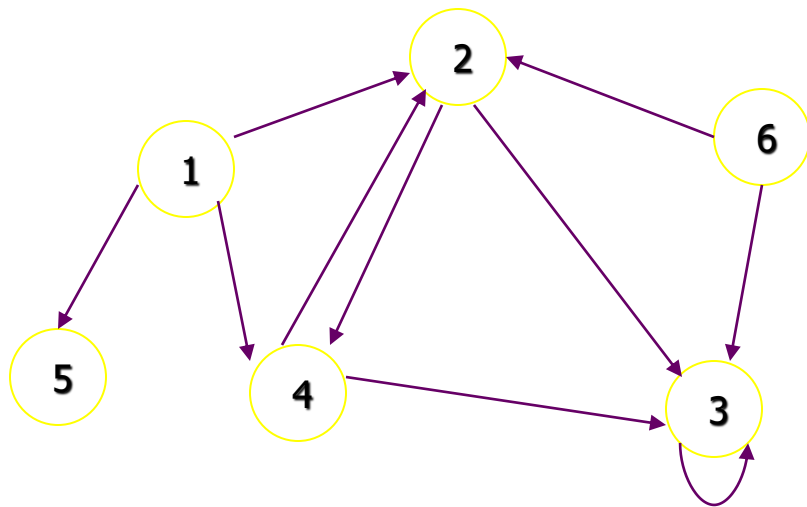
**Lemma: Sum of degrees of all the vertices is twice the number of edges**

$$\sum_{v \in V} \deg(v) = 2|E|$$

- **Directed Graph**

**Lemma: Sum of in-degrees of all vertices is same as sum of out-degrees of all vertices is same as total number of edges**

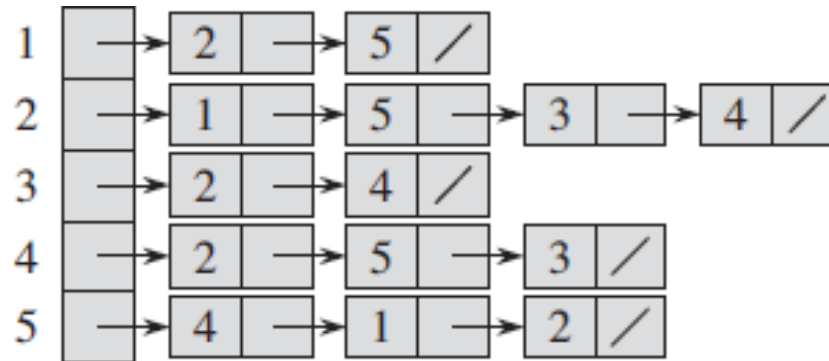
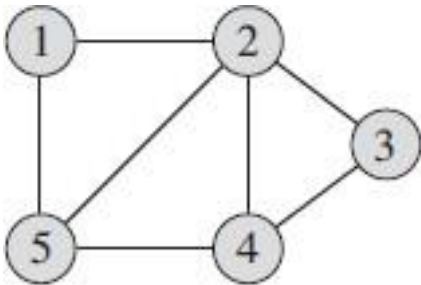
$$\sum_{v \in V} \text{Indeg}(v) = \sum_{v \in V} \text{Outdeg}(v) = |E|$$



- Trees are special kinds of directed graphs and are characterized by the fact that one of their nodes, the root , has no incoming arcs and every other node can be reached from the root by a unique path, i.e., by following one and only one sequence of consecutive arcs.
- In the preceding digraph, vertex 1 is “rootlike” node having no incoming arcs, but there are many different paths form vertex 1 to various other nodes. So that is not tree. For example , to vertex 3.

# Adjacency Matrix v.s. Adjacency List

$G = \langle V, E \rangle$



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

Undirected:  $|V| + 2|E|$

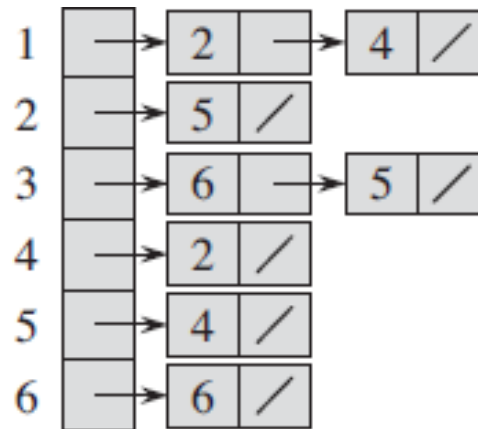
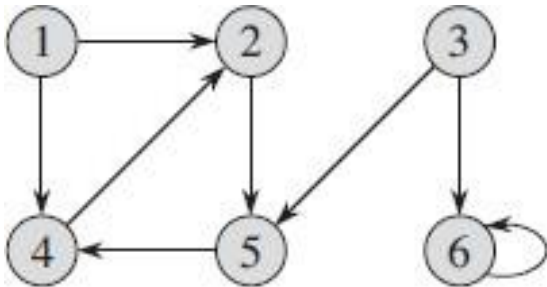
Undirected:  $|V|^2$

For every edge connected with  $v$  ...  
Is  $u$  and  $v$  connected with an edge?



# Adjacency Matrix v.s. Adjacency List

$G = \langle V, E \rangle$



	1	2	3	4	5	6
1	0	1	0	1	0	0
2	0	0	0	0	1	0
3	0	0	0	0	1	1
4	0	1	0	0	0	0
5	0	0	0	1	0	0
6	0	0	0	0	0	1

Directed:  $|V| + |E|$

Directed:  $|V|^2$

For every outgoing edge connected with  $v$  ...  
Is  $u$  has an outgoing edge with  $v$ ?

# Analysis

- For both directed/undirected graphs, the adjacency list representation has the desirable property that the amount of memory it requires  $\theta(V+E)$
- A potential disadvantage of the adjacency list representation is that there is no quicker way to determine if a given edge  $(u,v)$  is present in the graph than to search for  $v$  in the adjacency list  $\text{Adj}[u]$ . This disadvantage can be remedied by an adjacency matrix representation at the cost of using asymptotically more memory.

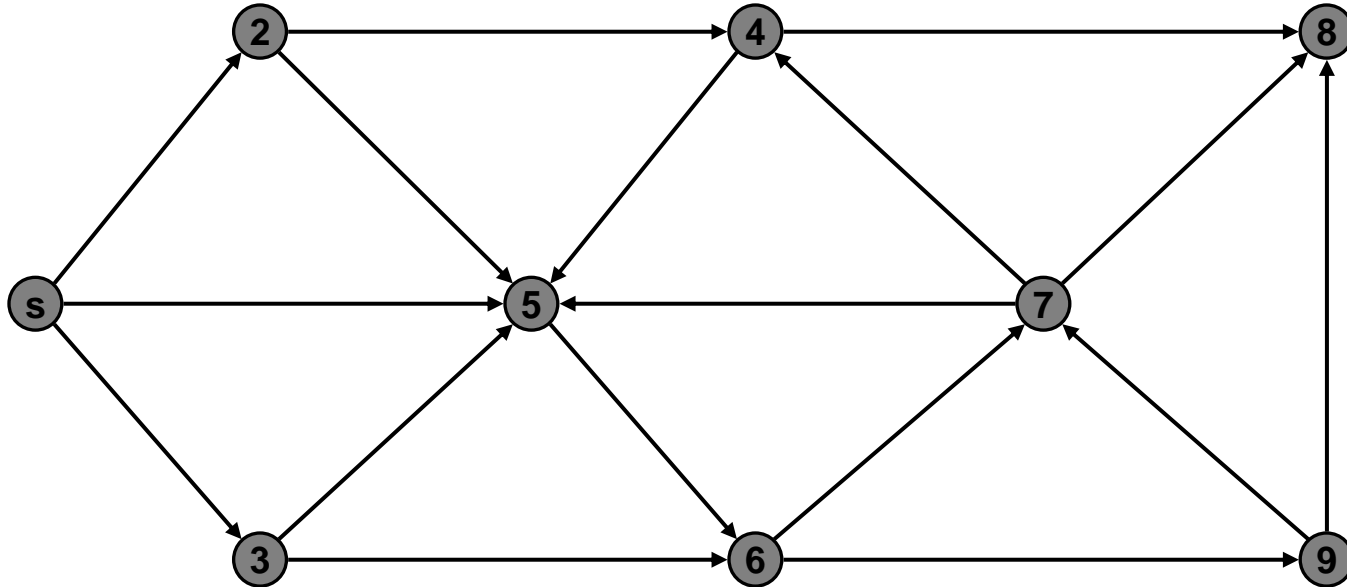
# Analysis

- Adjacency matrix of a graph requires  $\theta(V^2)$  memory, independent of the number of edges in the graph.
- Although the adjacency list representation is asymptotically at least as efficient as the adjacency matrix representation, the simplicity of adjacency matrix may make it preferable when graphs are reasonably small.

# Traversing Graphs

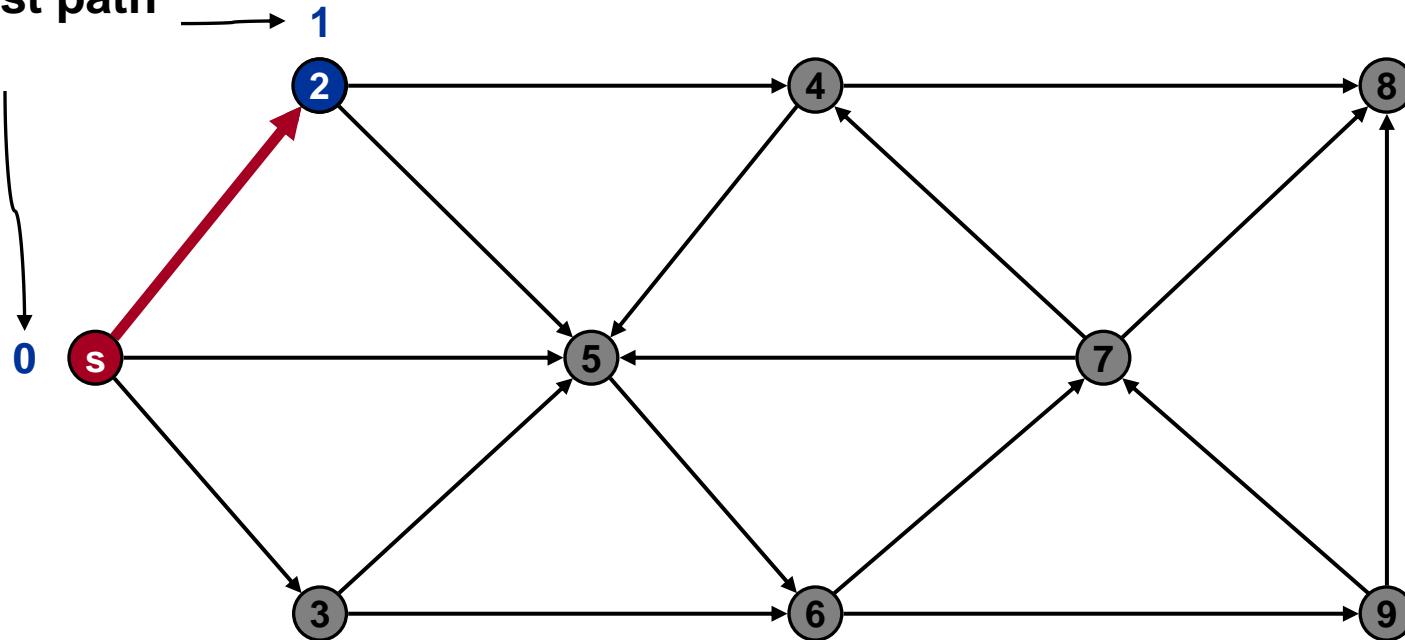
- Two common types of graph traversals are Depth First Search (DFS) and Breadth First Search (BFS).
- DFS is implemented with a stack, and BFS with a queue.
- The aim in both types of traversals is to visit each vertex of a graph *exactly once*.
- In DFS, you follow a path as far as you can go before backing up. With BFS, you visit all the neighbors of the current node before exploring further a nodes in the graph.

# Breadth First Search



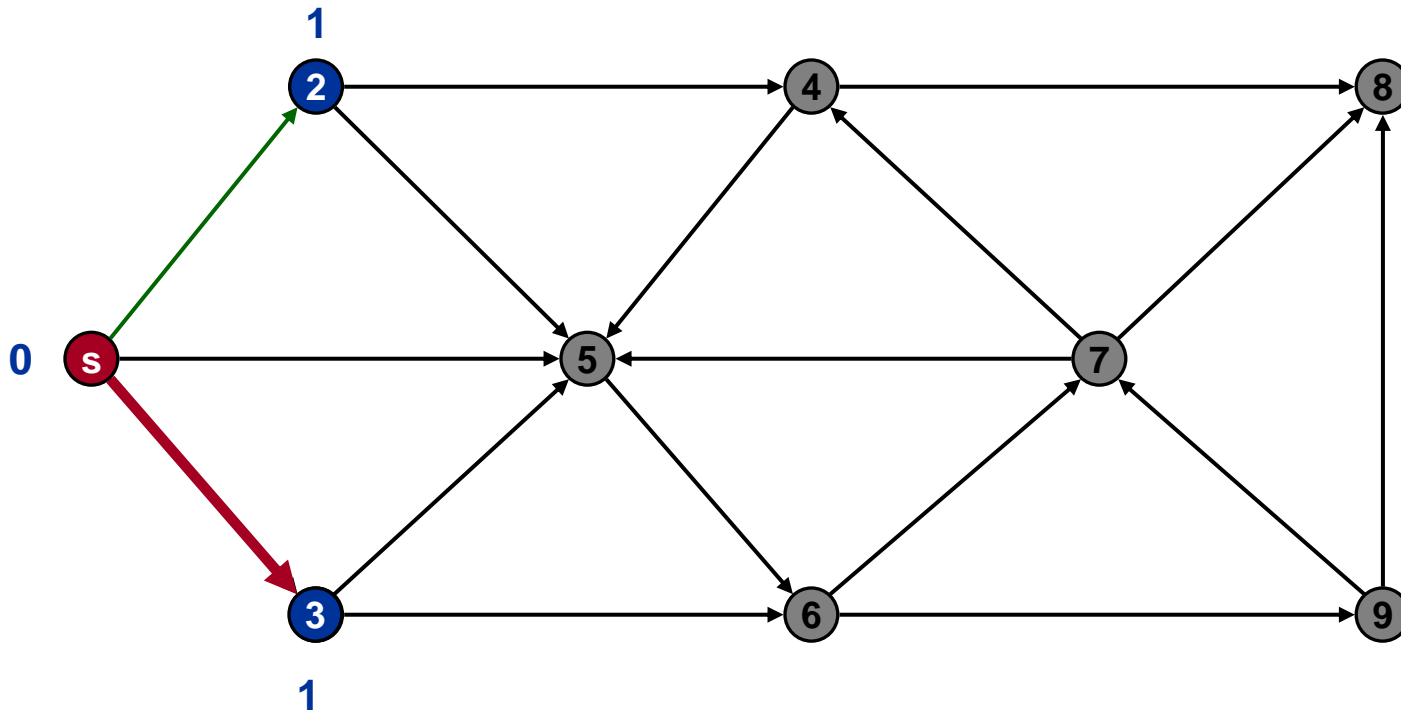
# Breadth First Search

Shortest path  
from s



Queue: s

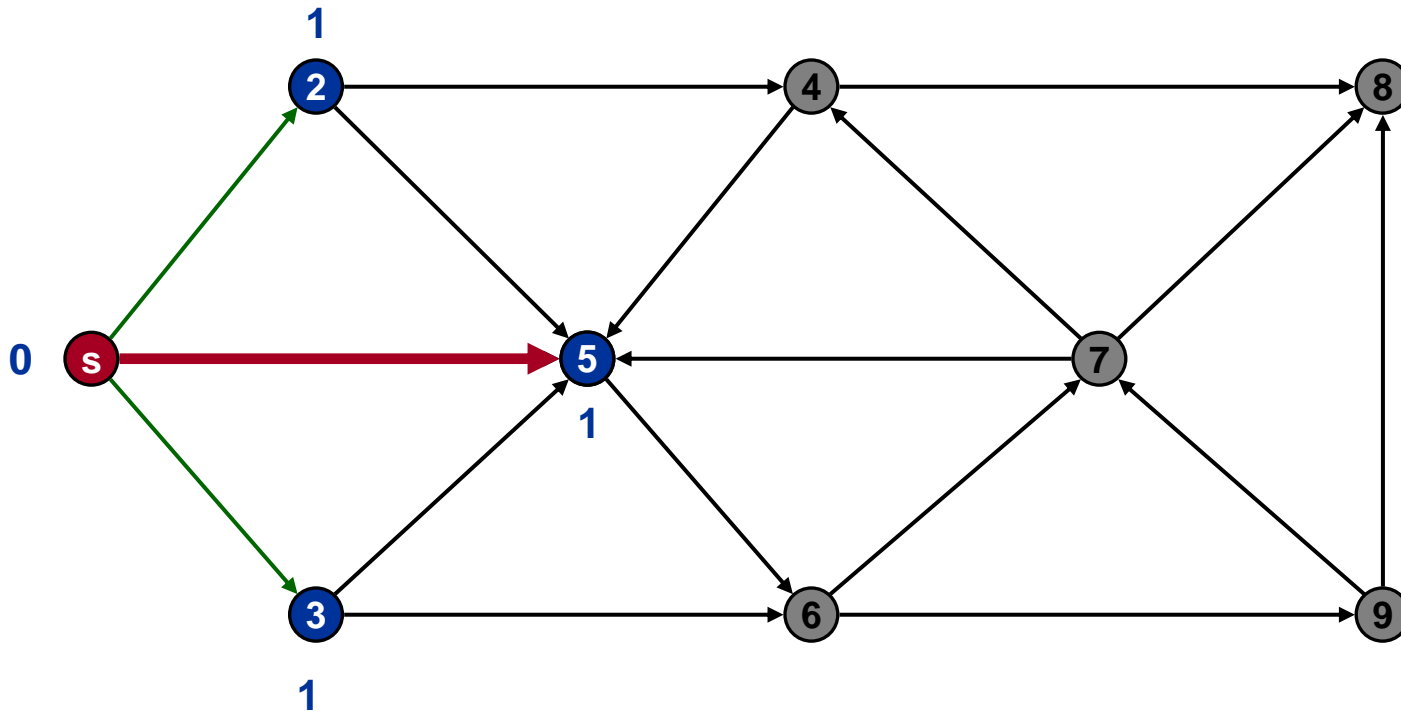
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: s 2

# Breadth First Search

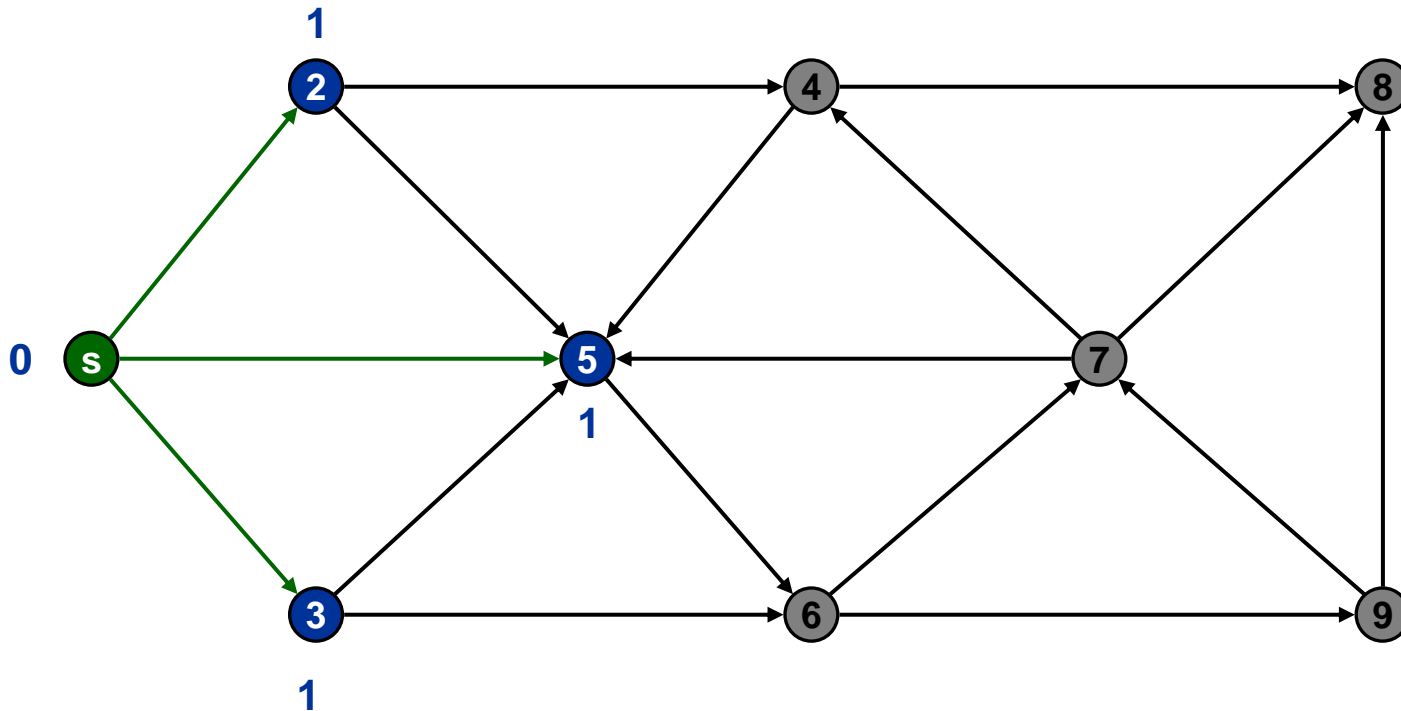


Undiscovered
Discovered
Top of queue
Finished

Queue: s 2 3



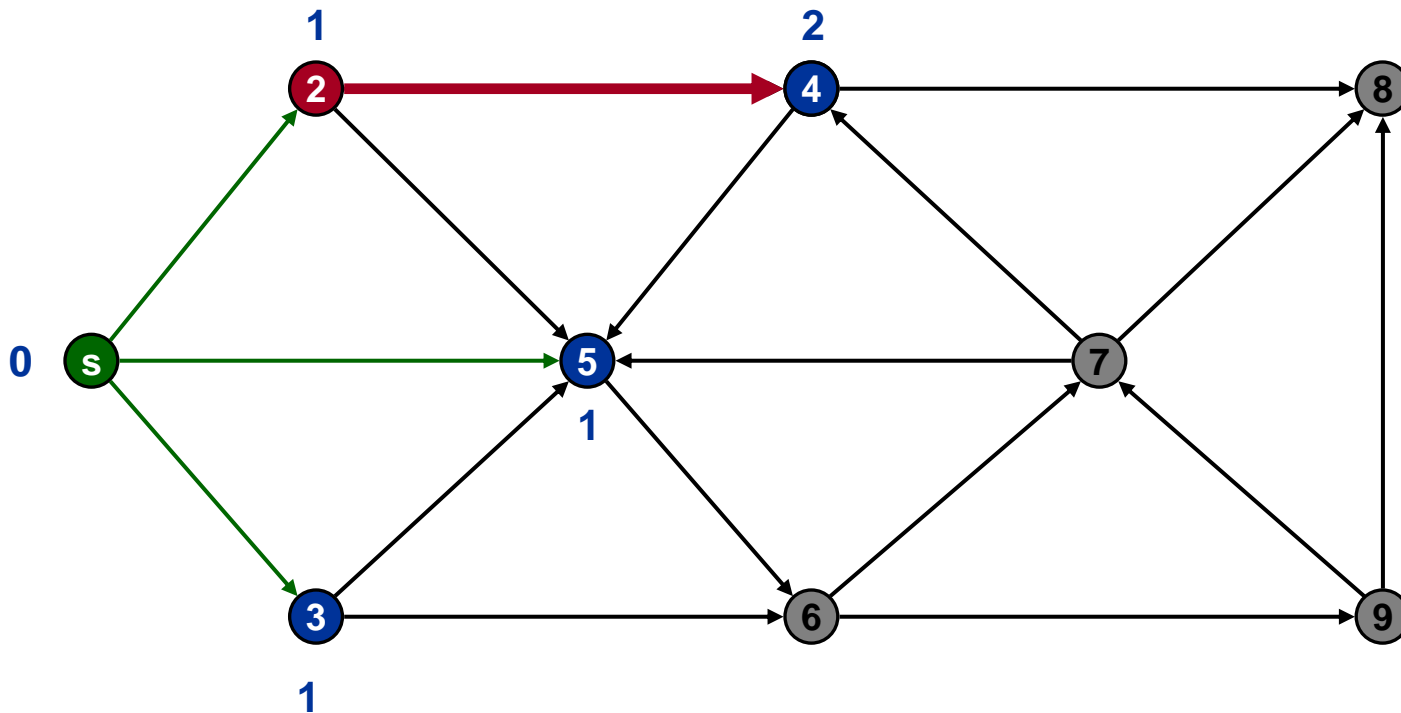
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 2 3 5

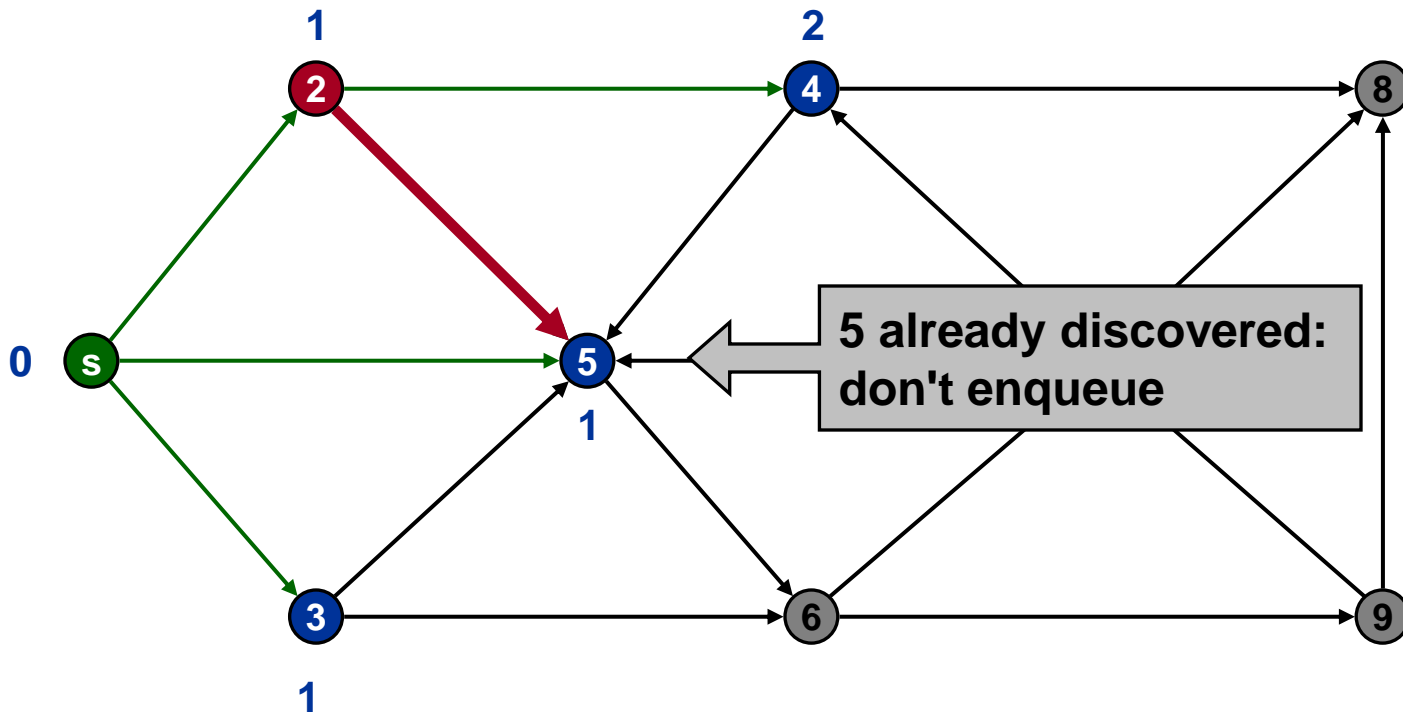
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 2 3 5

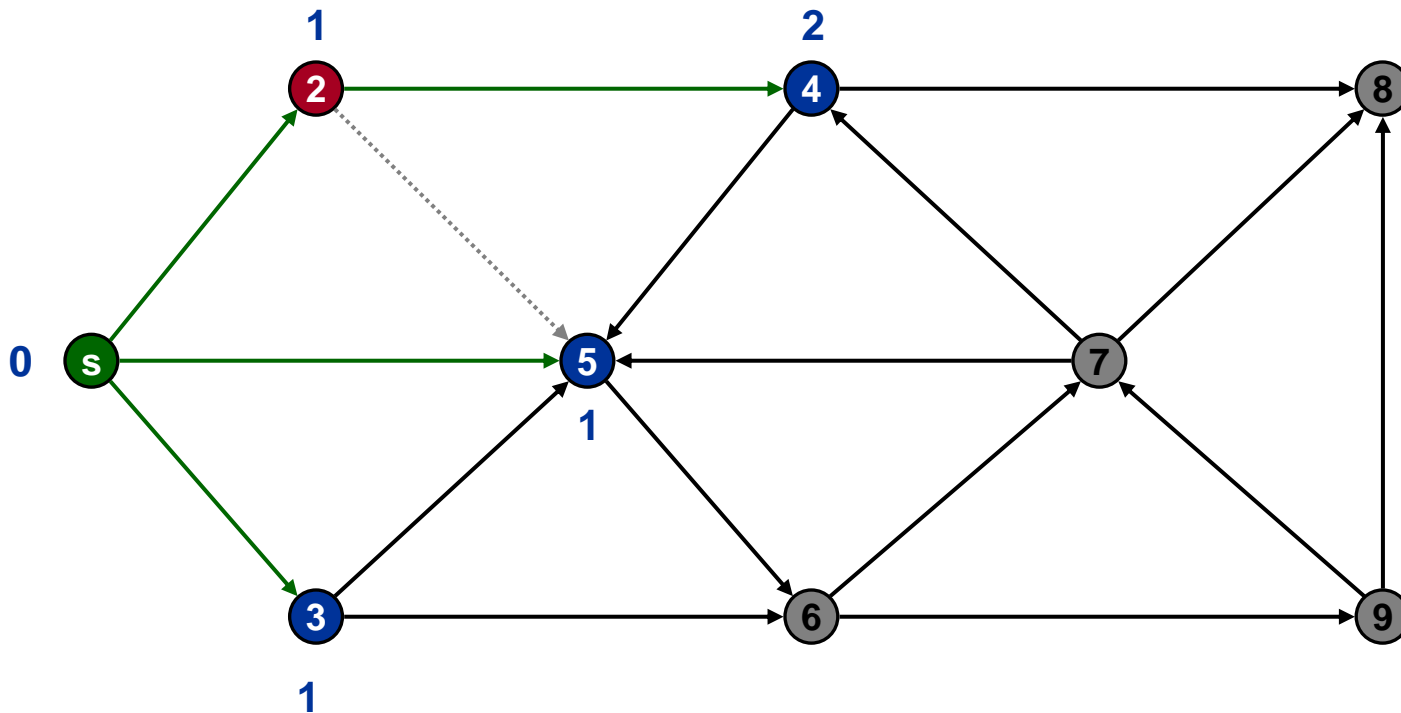
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 2 3 5 4

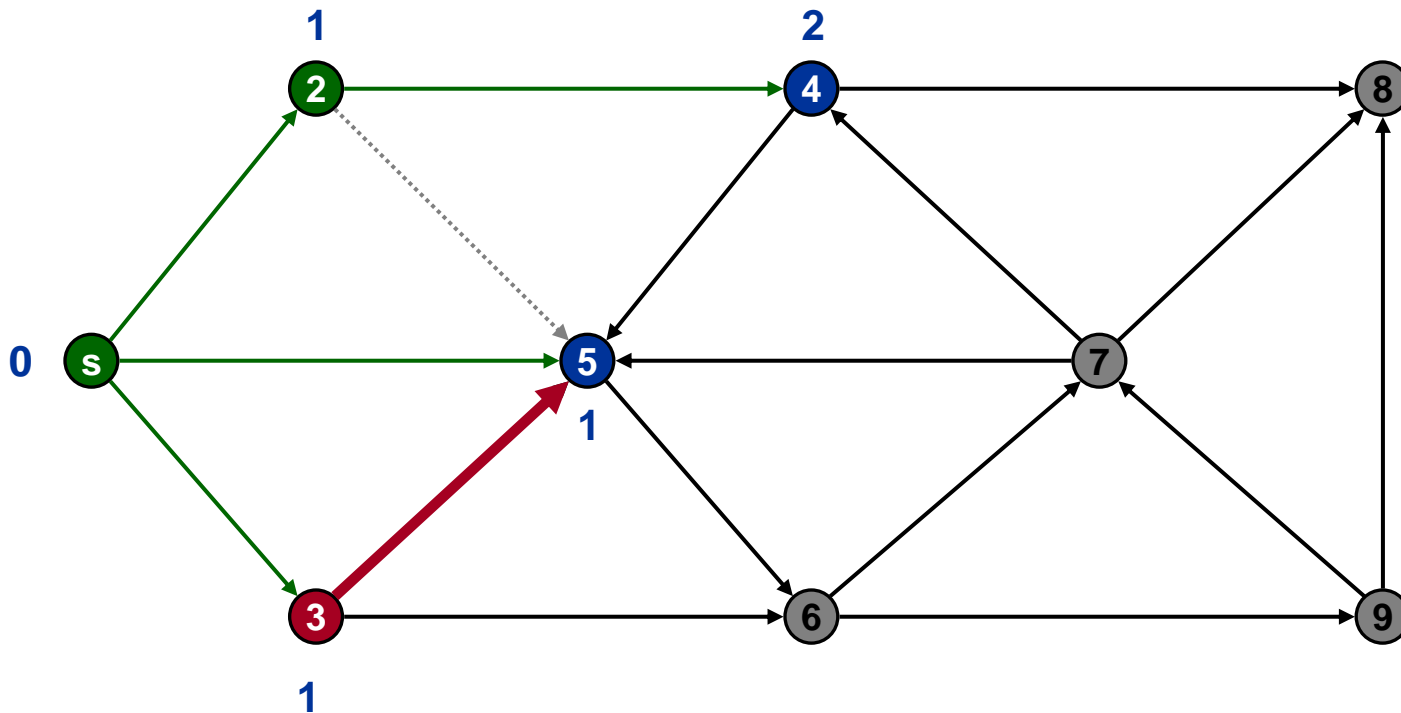
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 2 3 5 4

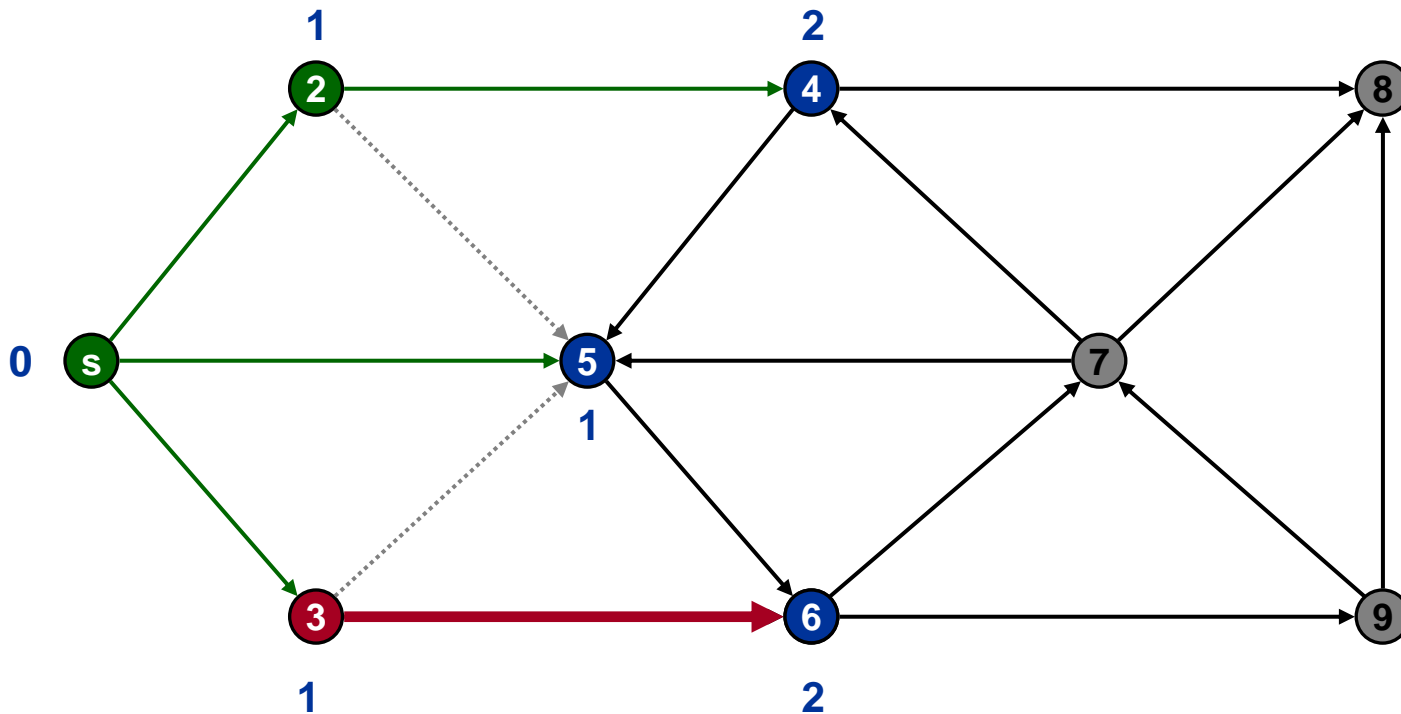
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 3 5 4

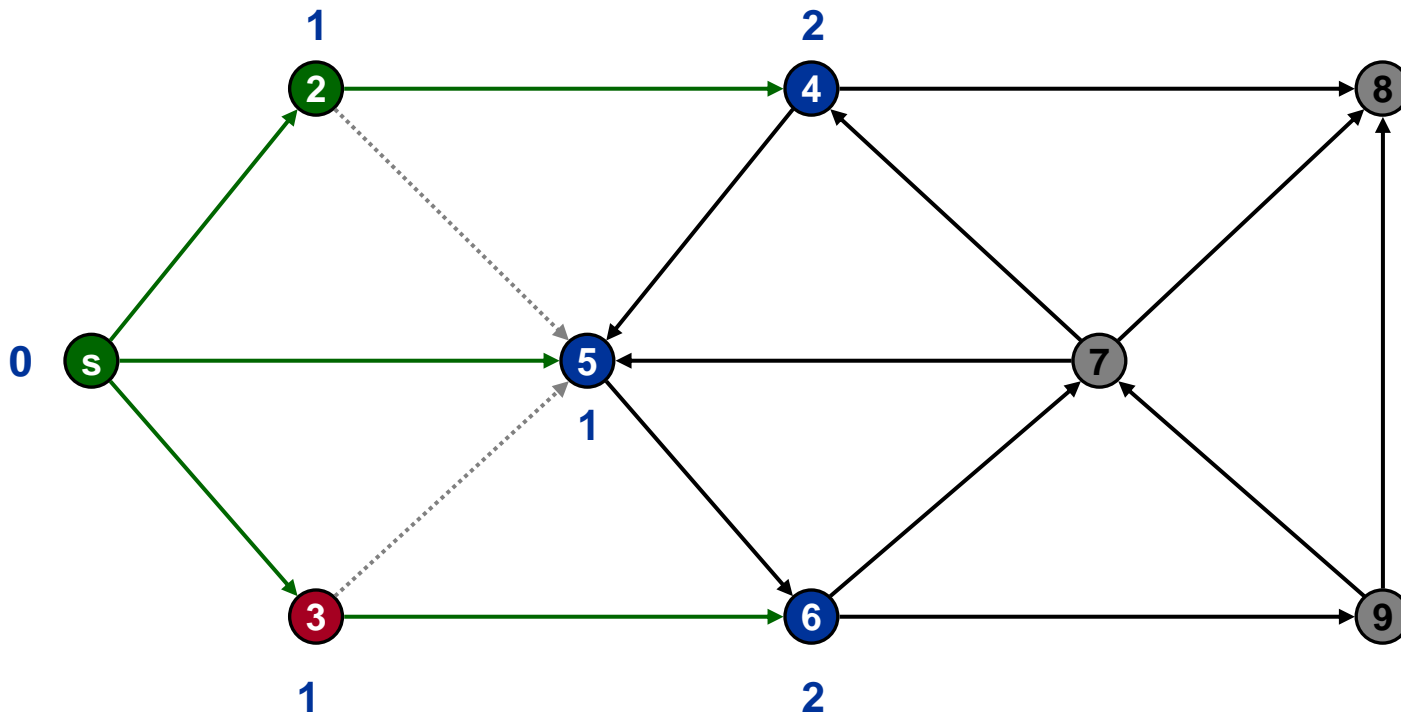
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 3 5 4

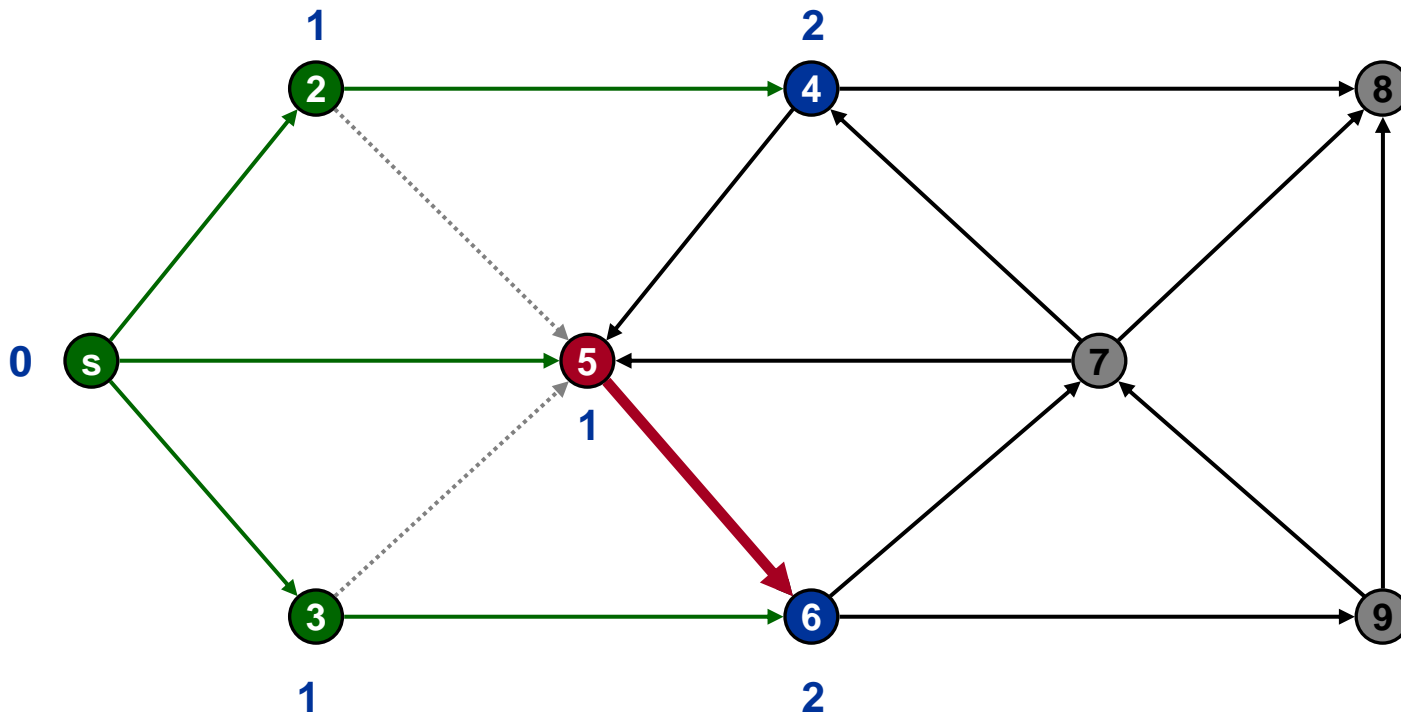
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 3 5 4 6

# Breadth First Search

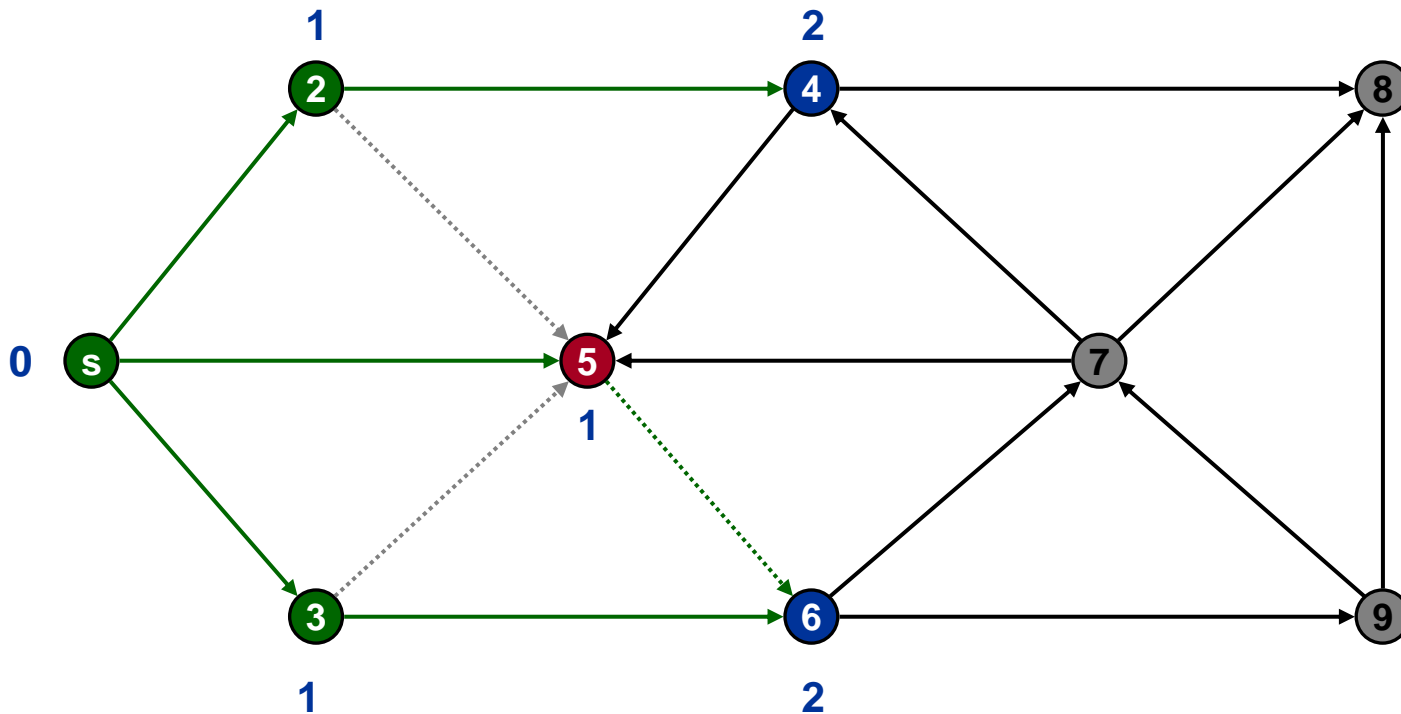


Undiscovered
Discovered
Top of queue
Finished

Queue: 5 4 6



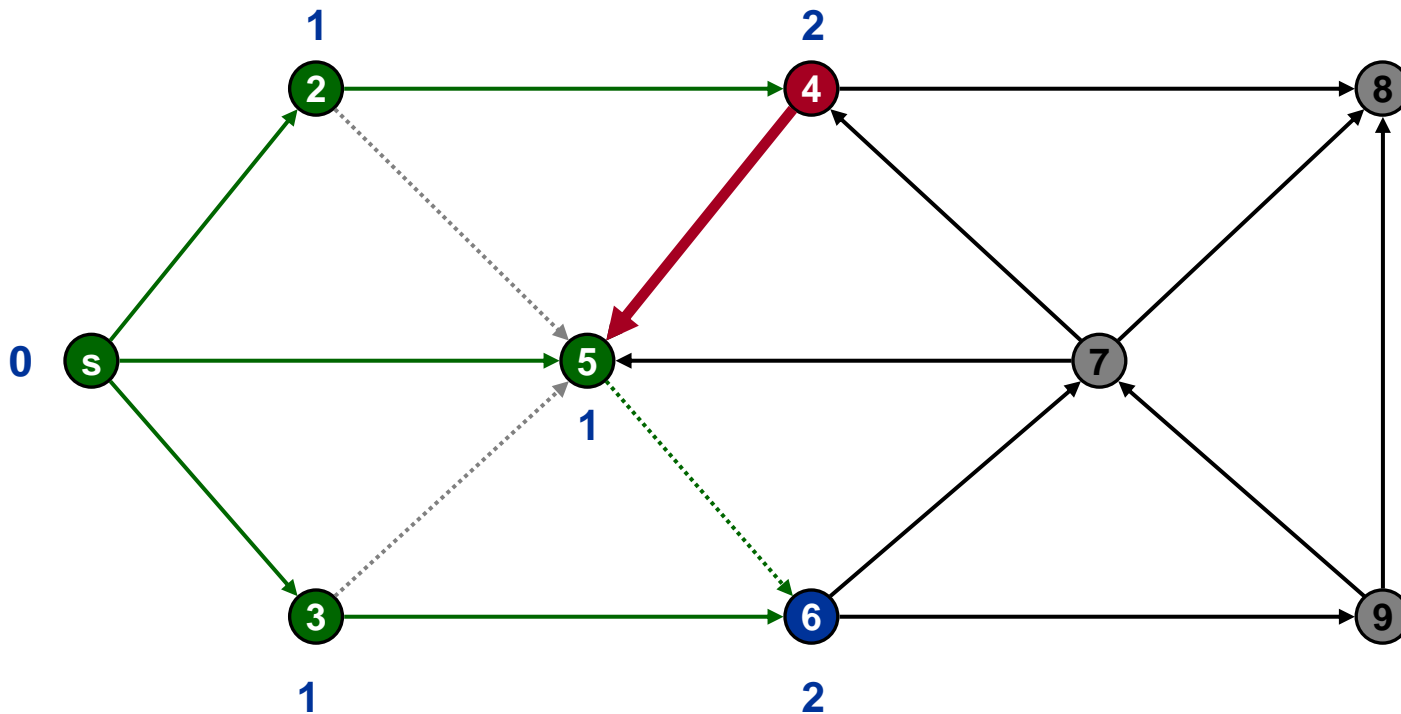
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 5 4 6

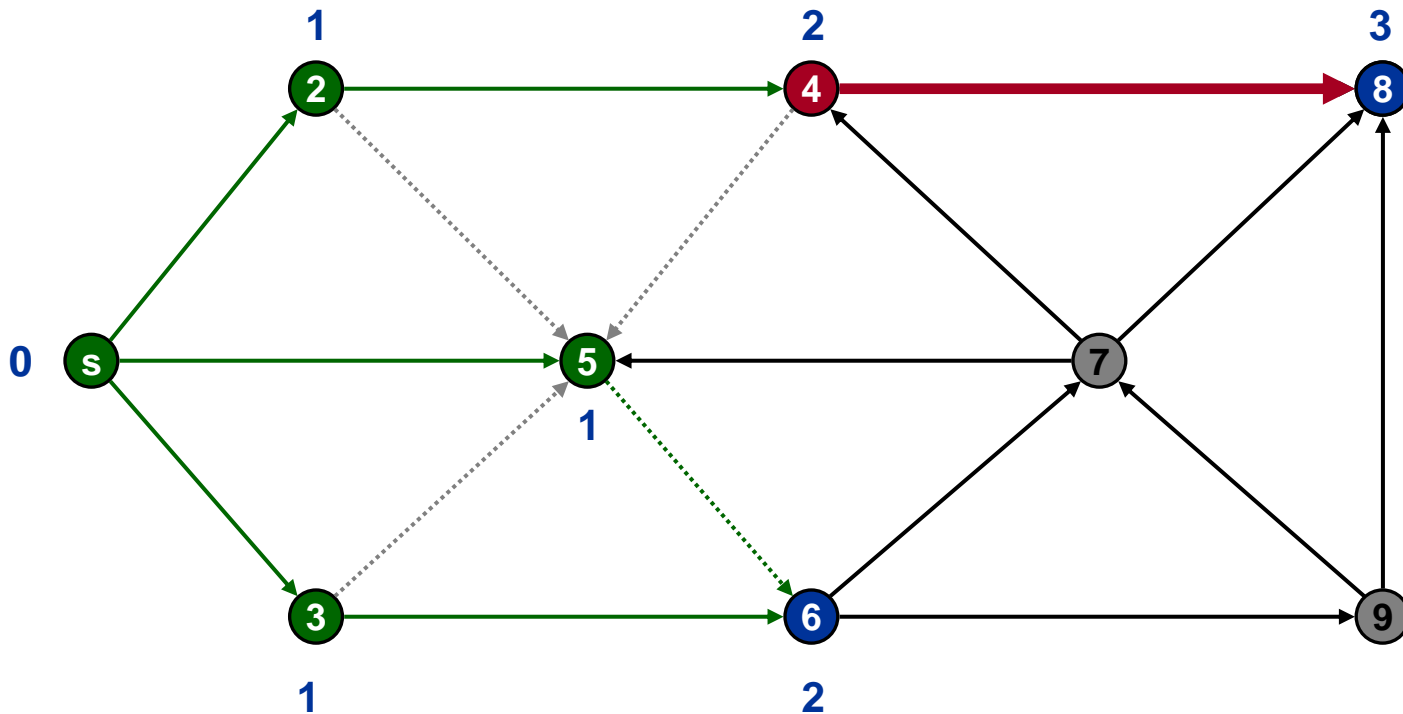
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 4 6

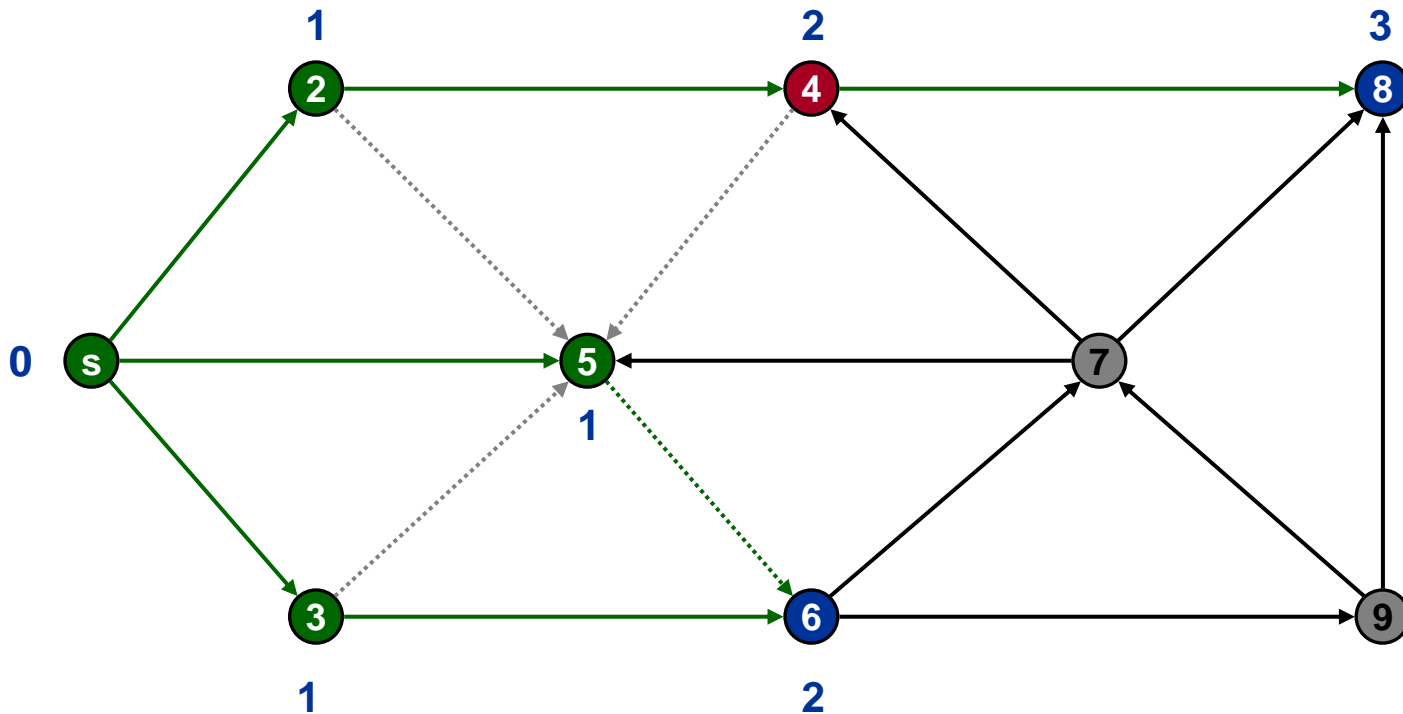
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 4 6

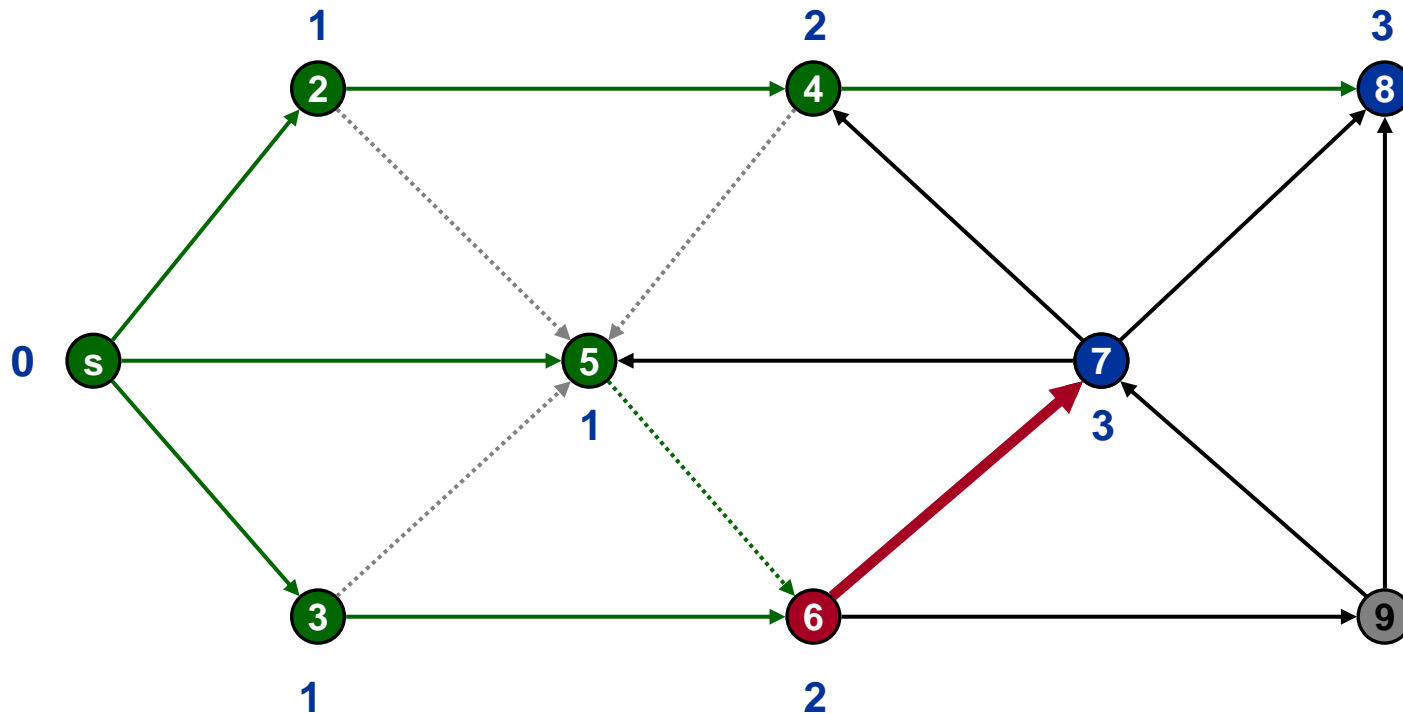
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 4 6 8

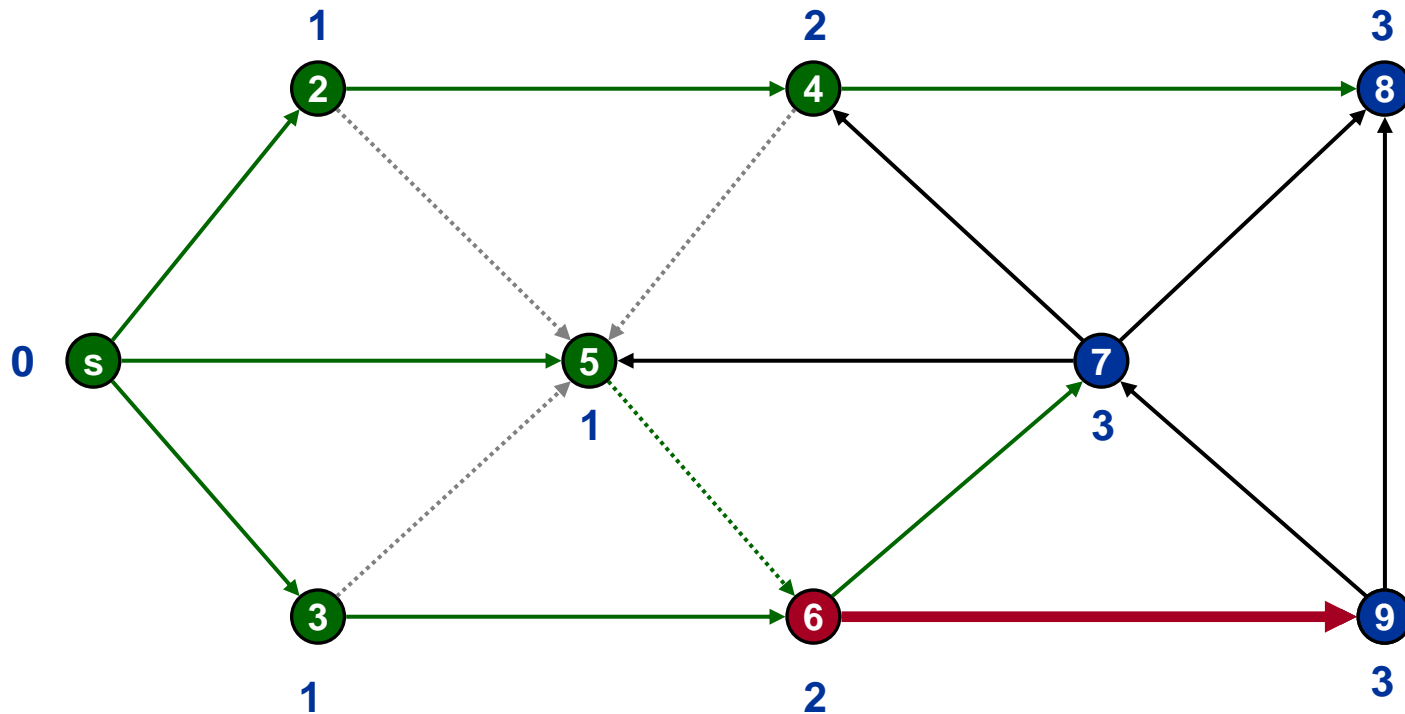
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 6 8

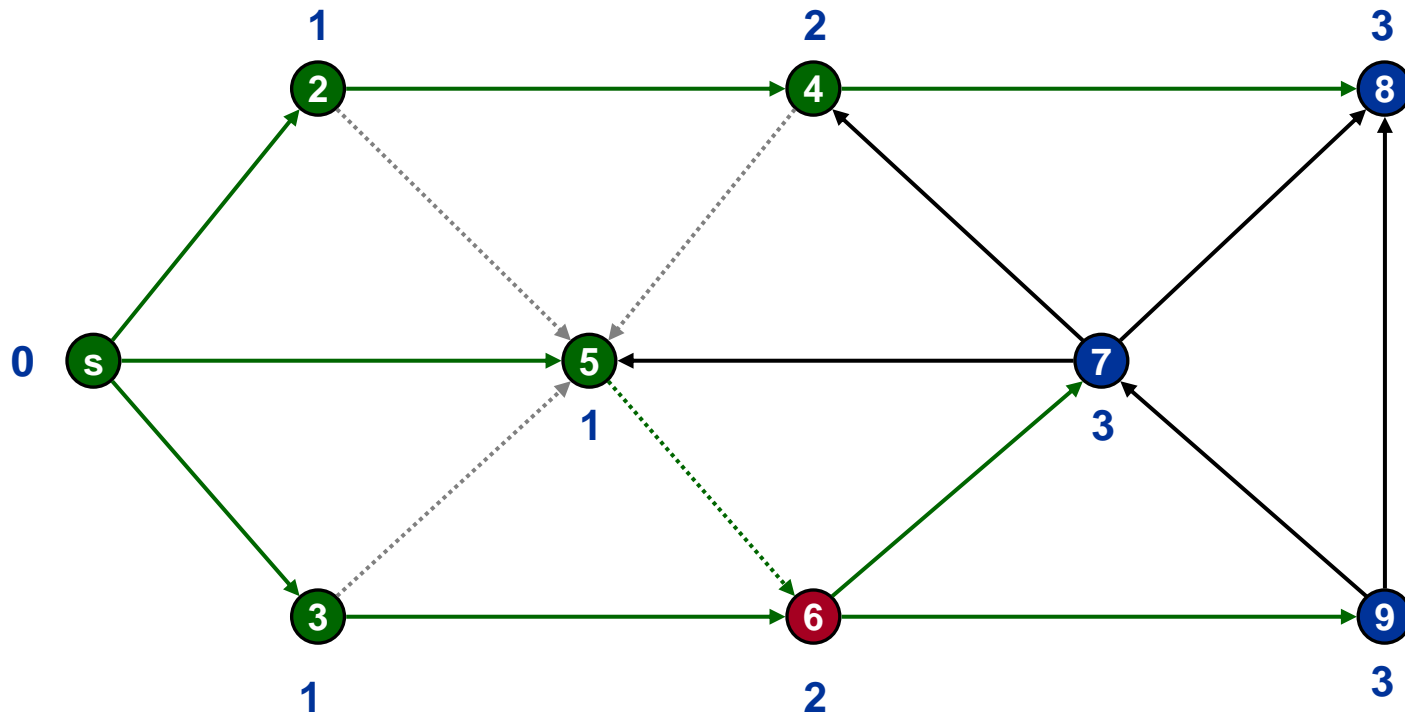
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 6 8 7

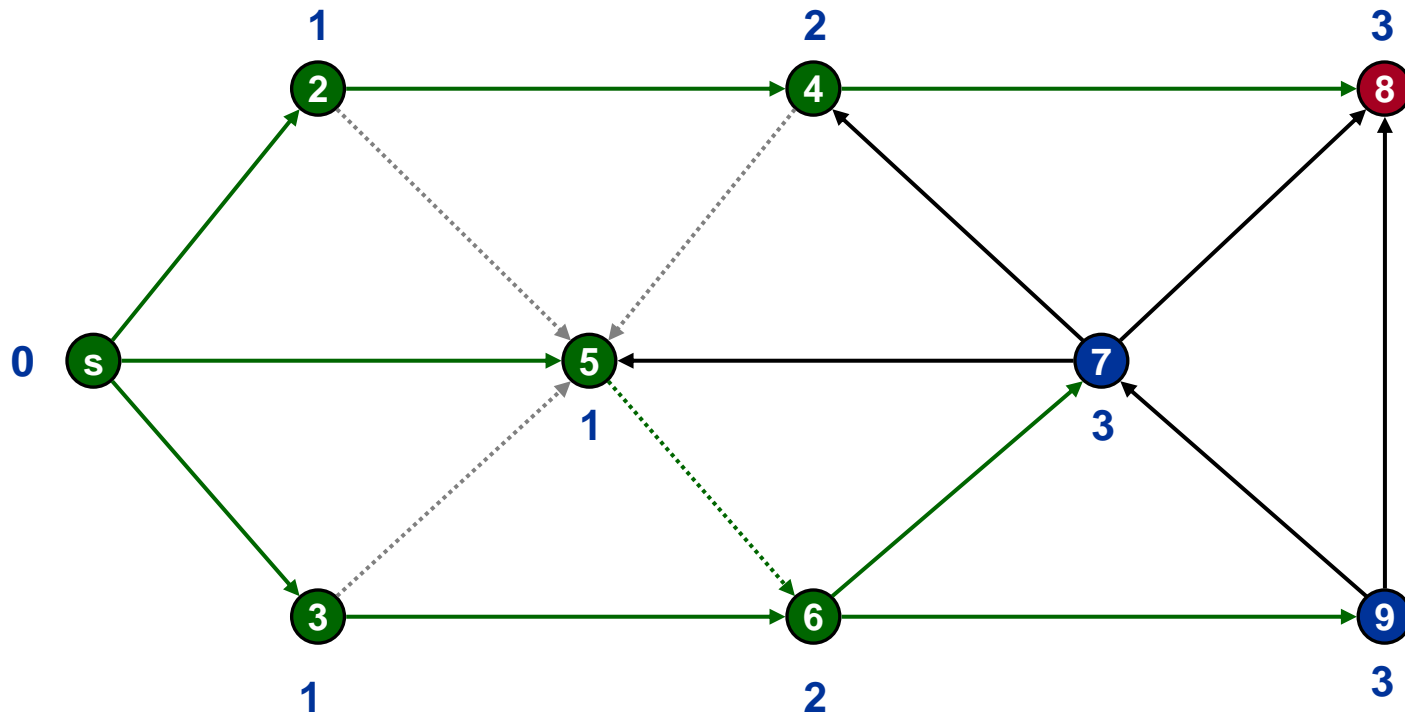
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 6 8 7 9

# Breadth First Search

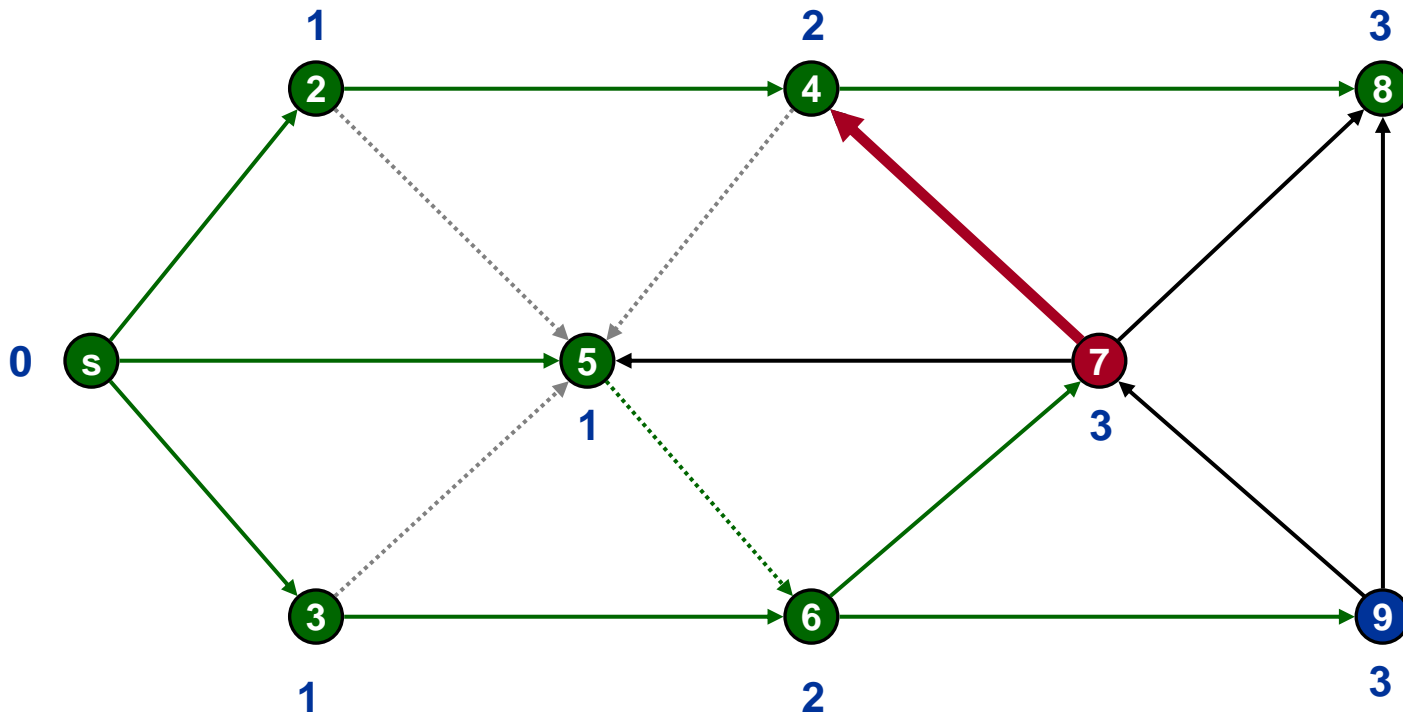


Undiscovered
Discovered
Top of queue
Finished

Queue: 8 7 9



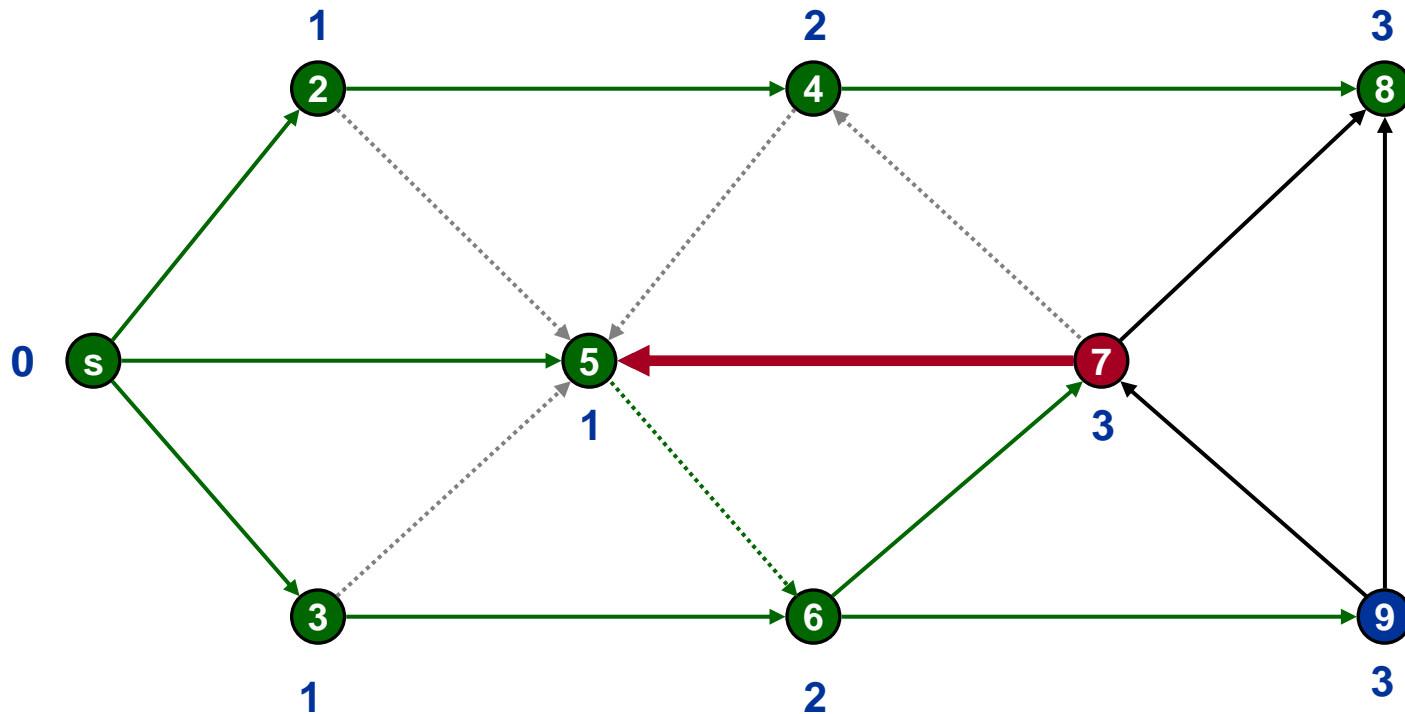
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 7 9

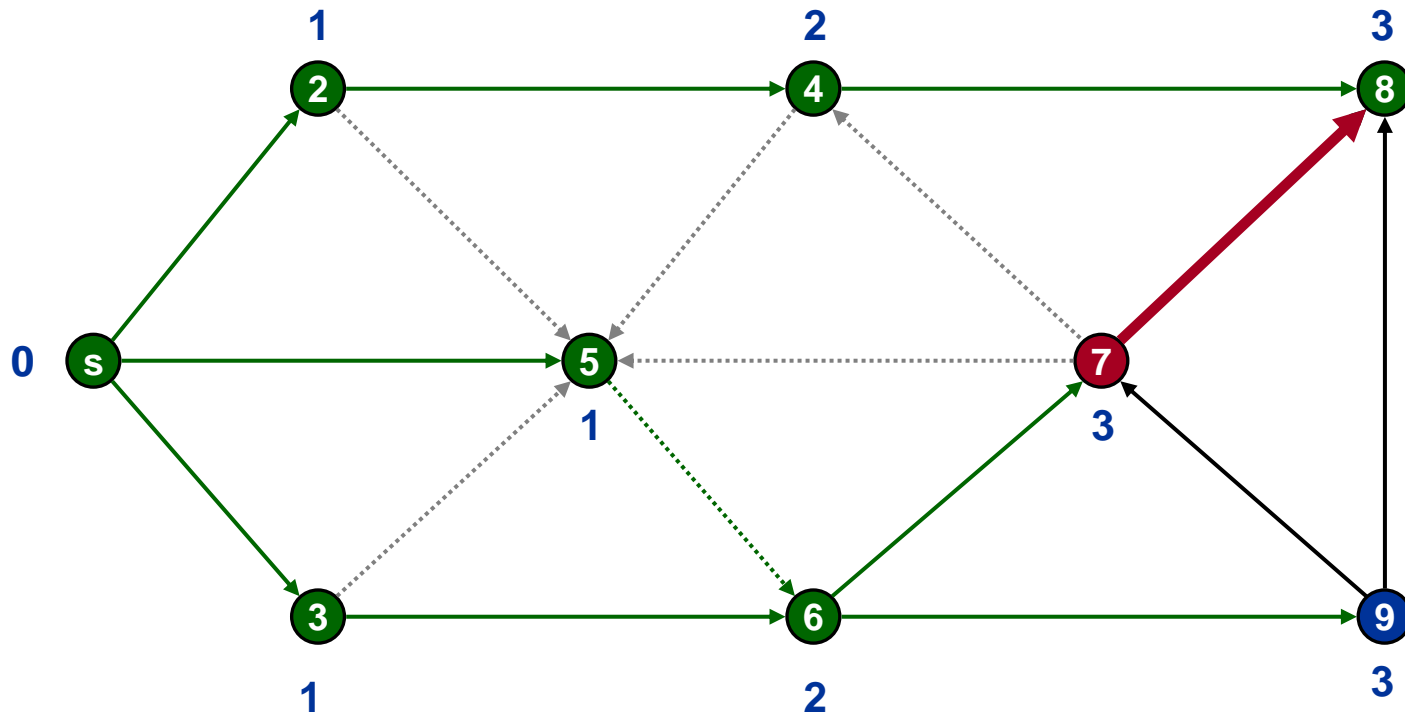
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 7 9

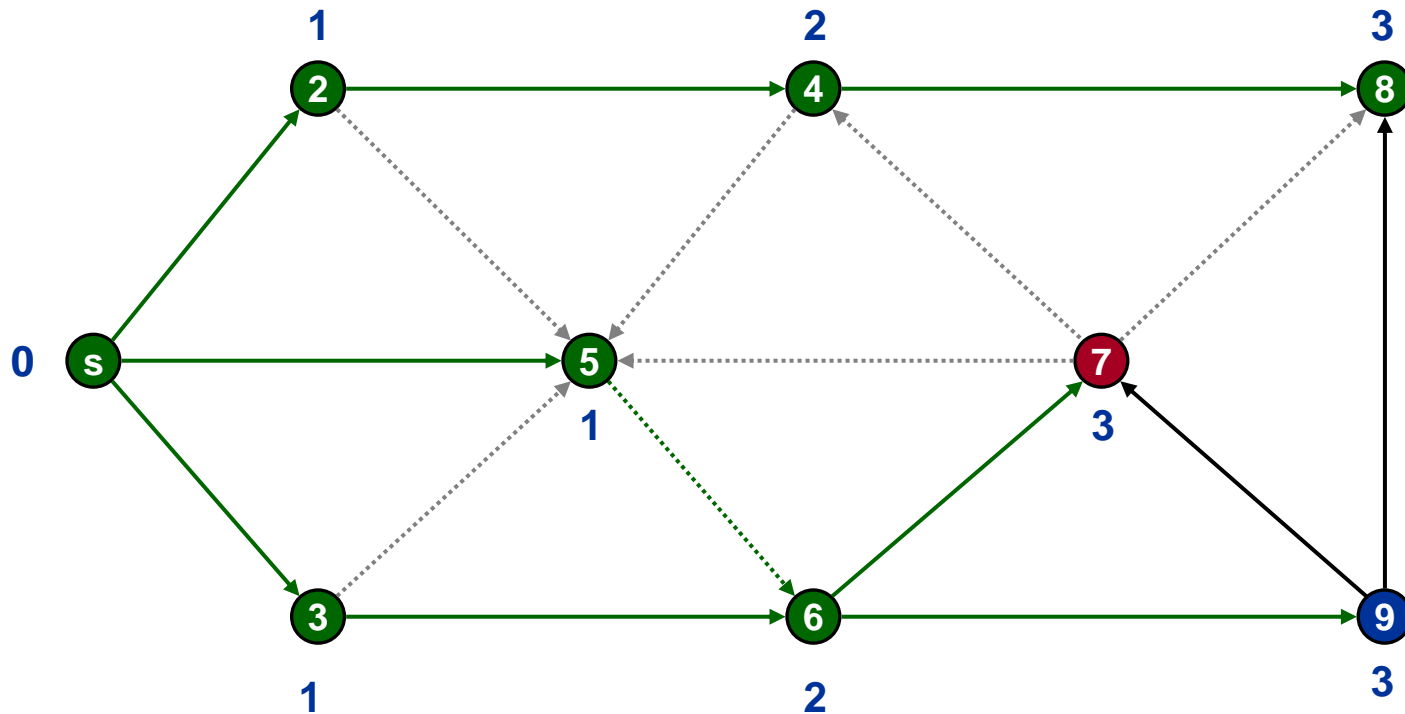
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 7 9

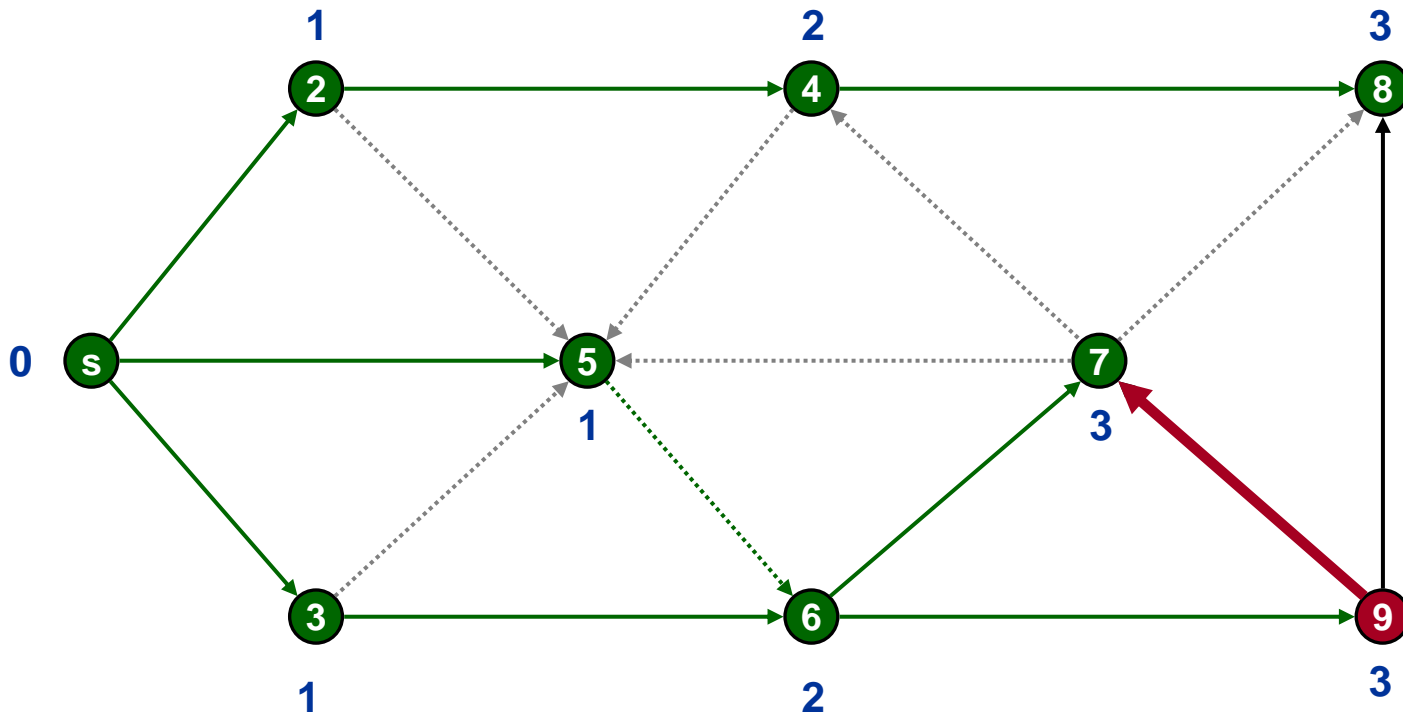
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 7 9

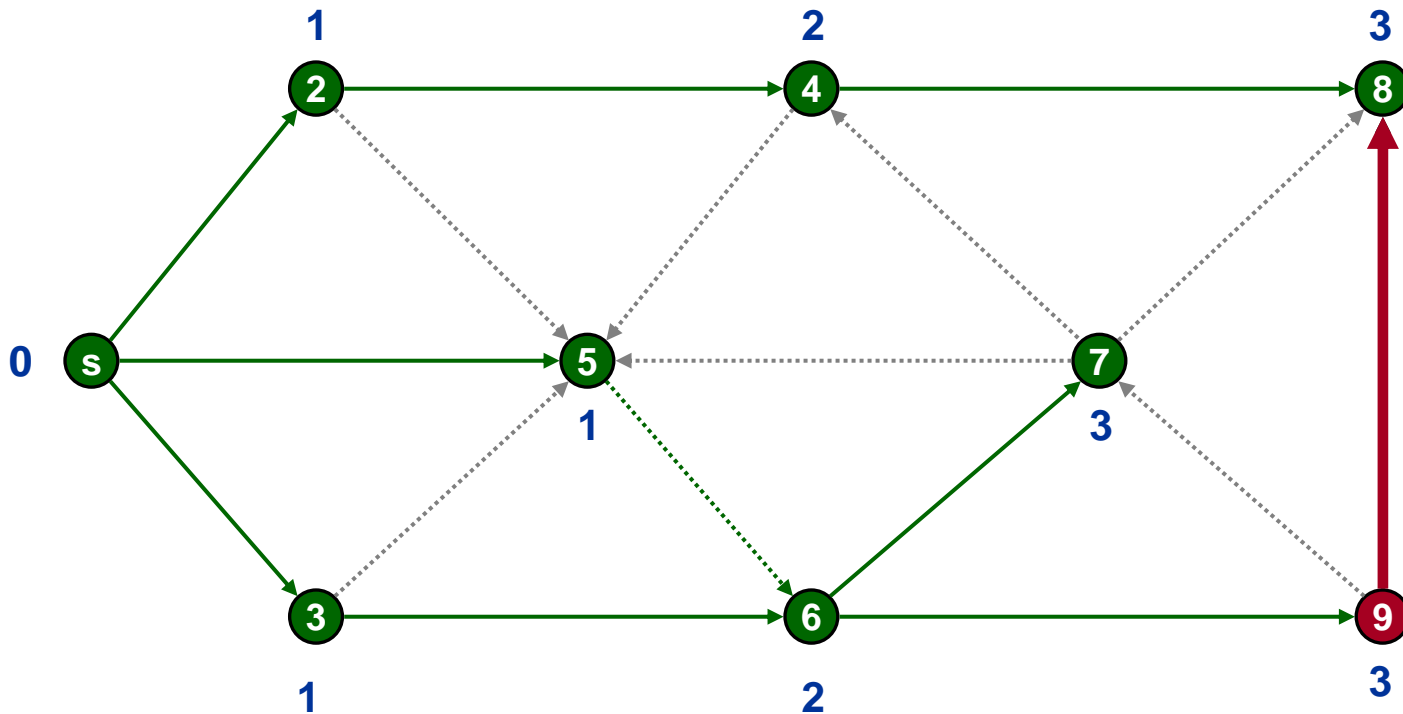
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 9

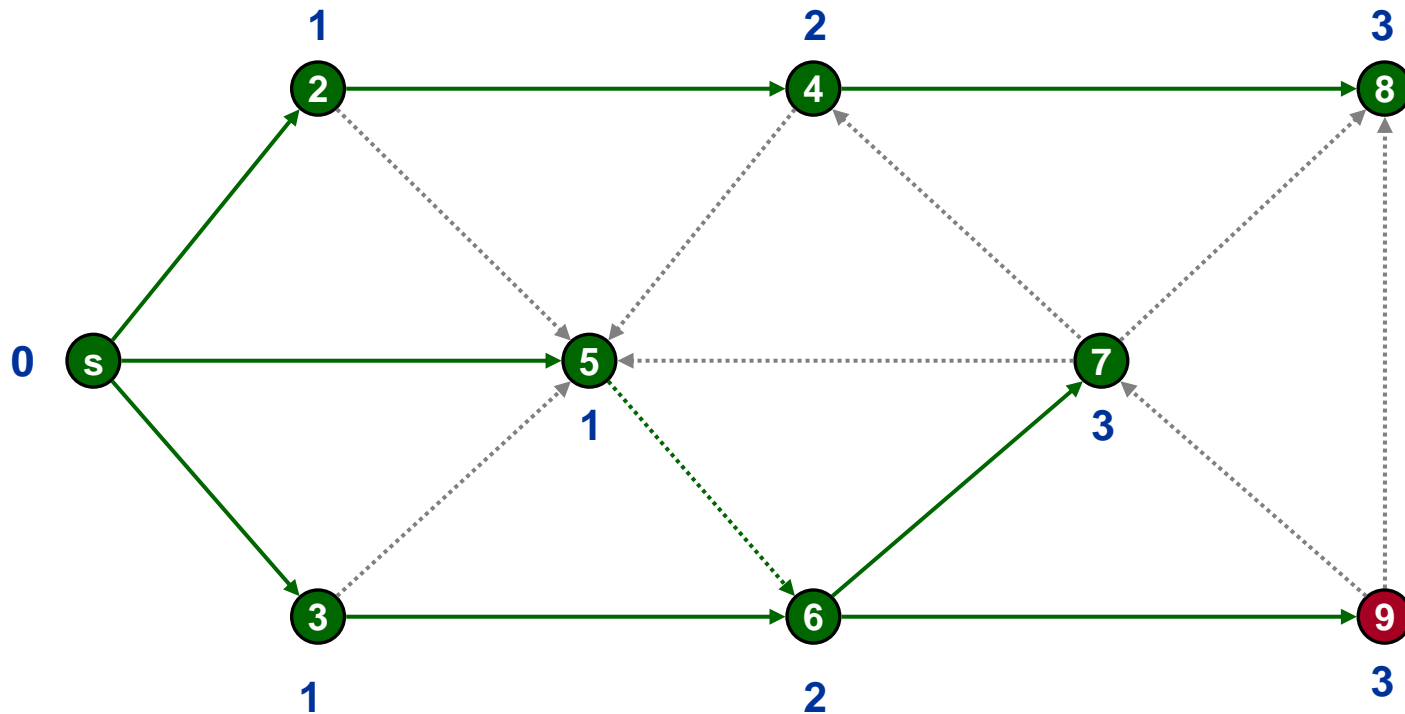
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 9

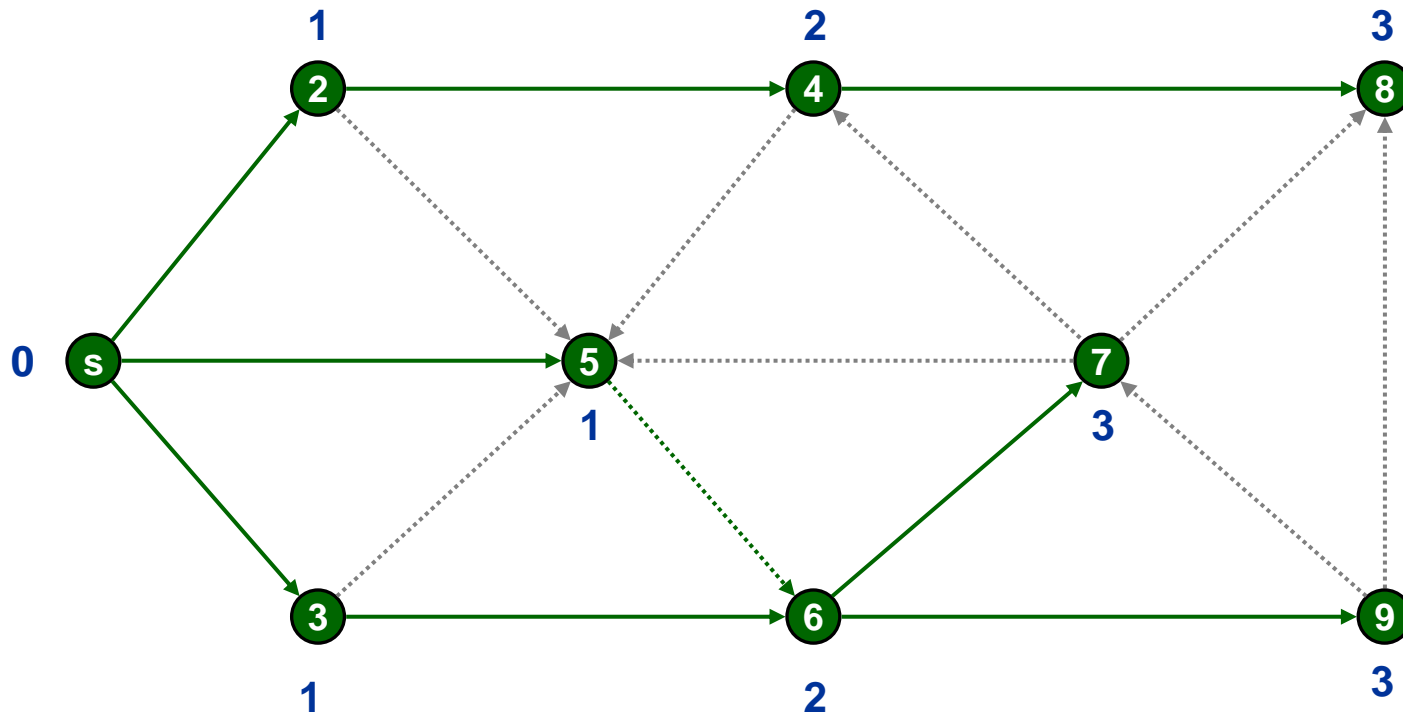
# Breadth First Search



Undiscovered
Discovered
Top of queue
Finished

Queue: 9

# Breadth First Search

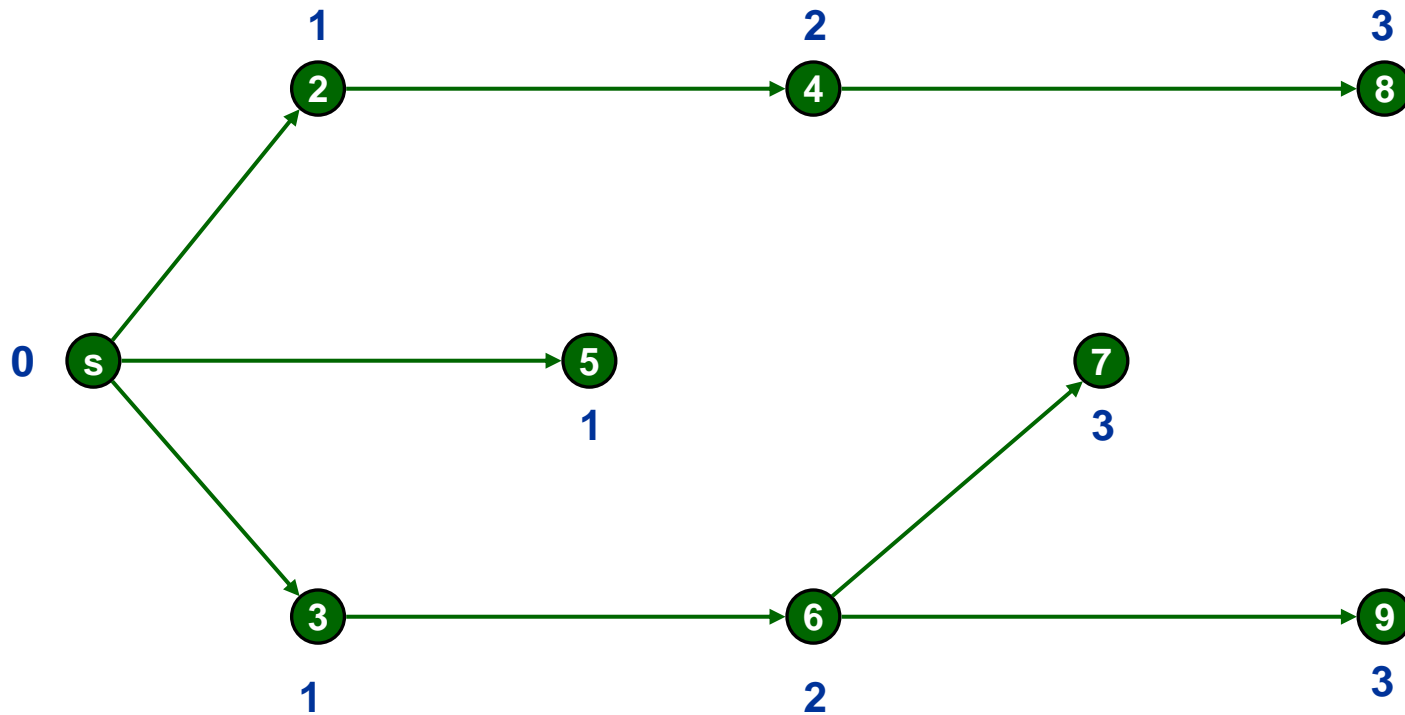


Undiscovered
Discovered
Top of queue
Finished

Queue:

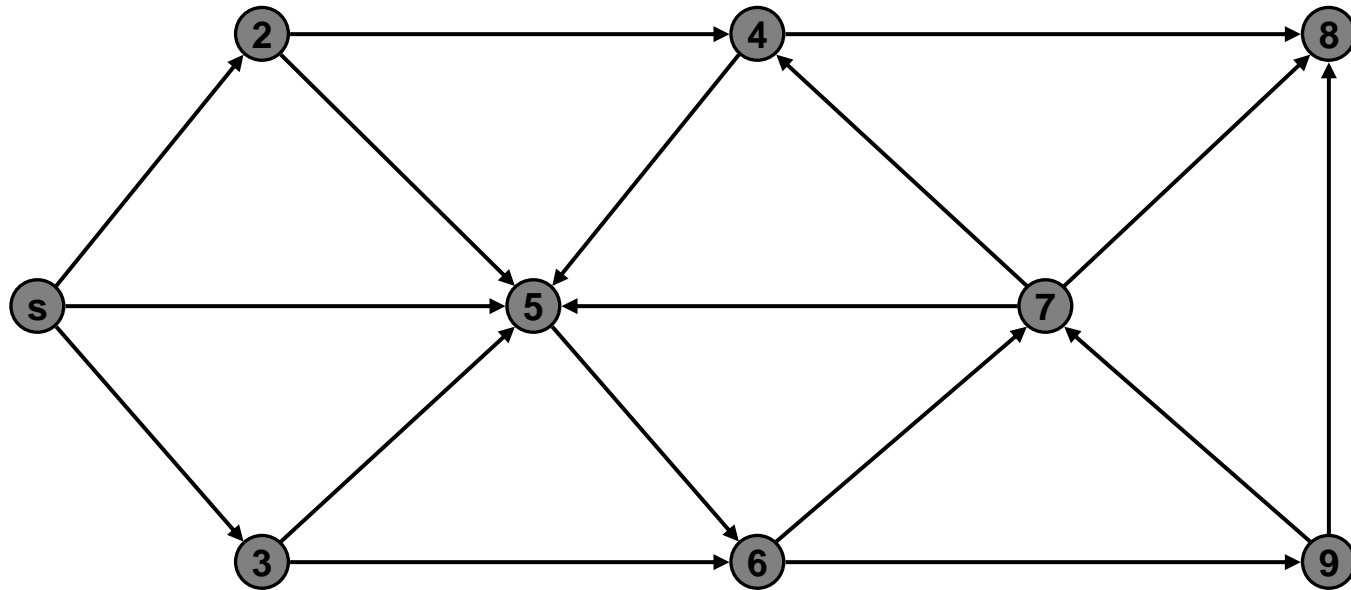


# Breadth First Search



**Level Graph**

# Depth First Search



- Apply DFS algorithm on the same graph using **stack** and see what is DFS Tree generated after exhausting whole stack.

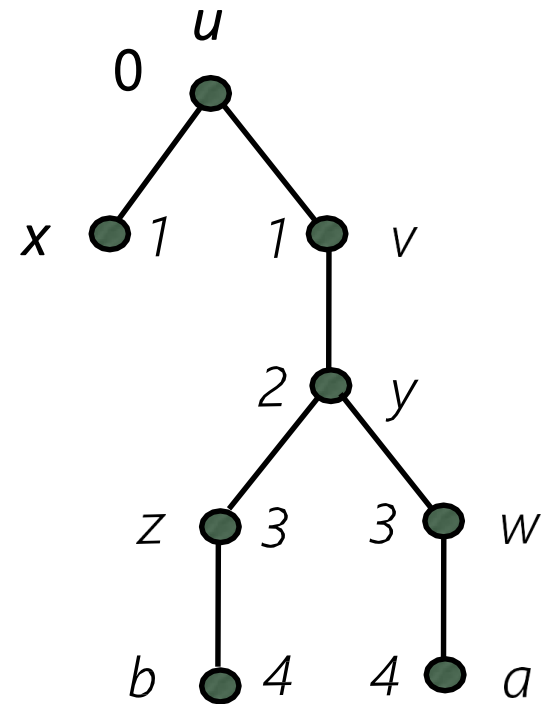
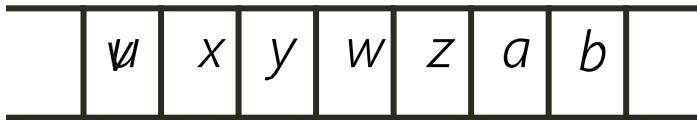
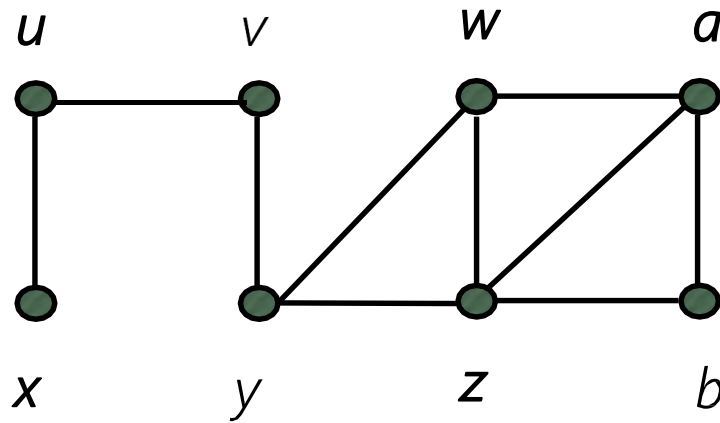
# BFS/DFS

- Time Complexity:
- The operations of enqueueing and dequeueing takes  $O(1)$  time, so total time devoted to queue operations is  $O(V)$ .
- Since sum of the lengths of all adjacency lists is  $\theta(E)$ , the total time spent in scanning adjacency lists is  $O(E)$ .
- Total running time of BFS is  $\theta(V+E)$ .
- Same reasoning can be made for DFS.

# Complexity

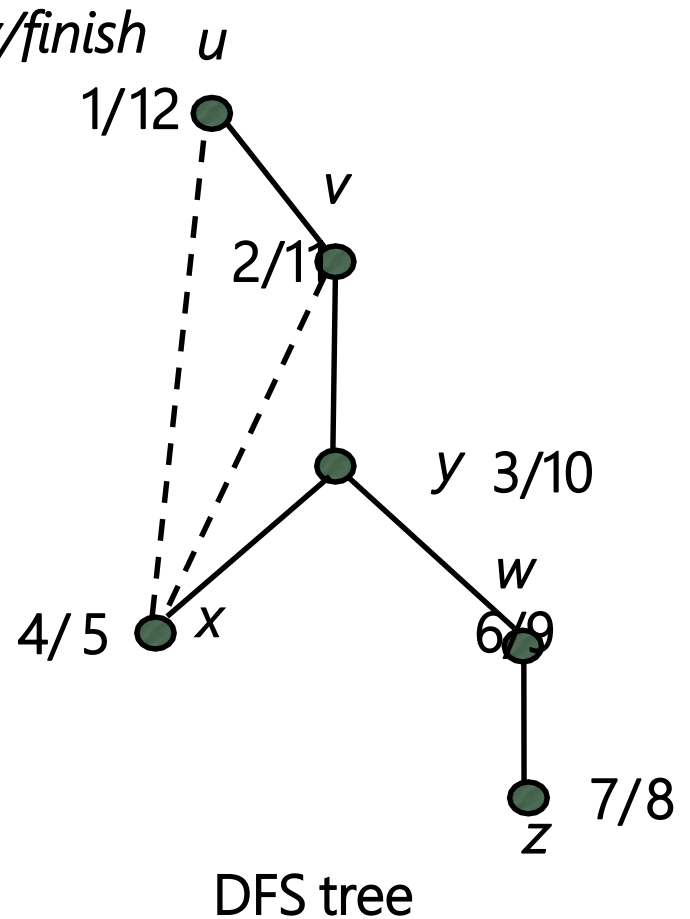
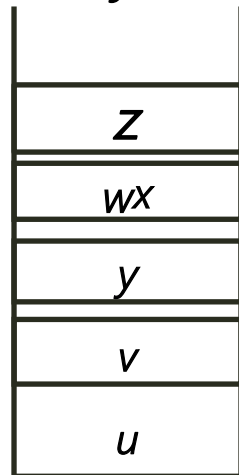
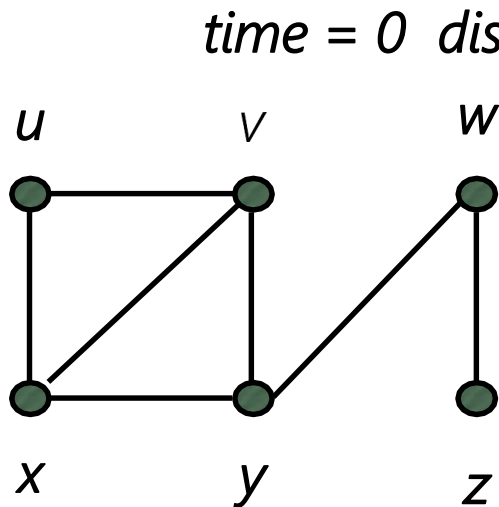
		Time	Space
Undirected	Adj. Matrix	$O( V ^2)$	$O( V )$
	Adj. List	$O( V  + 2 E )$	

# Breadth-first search

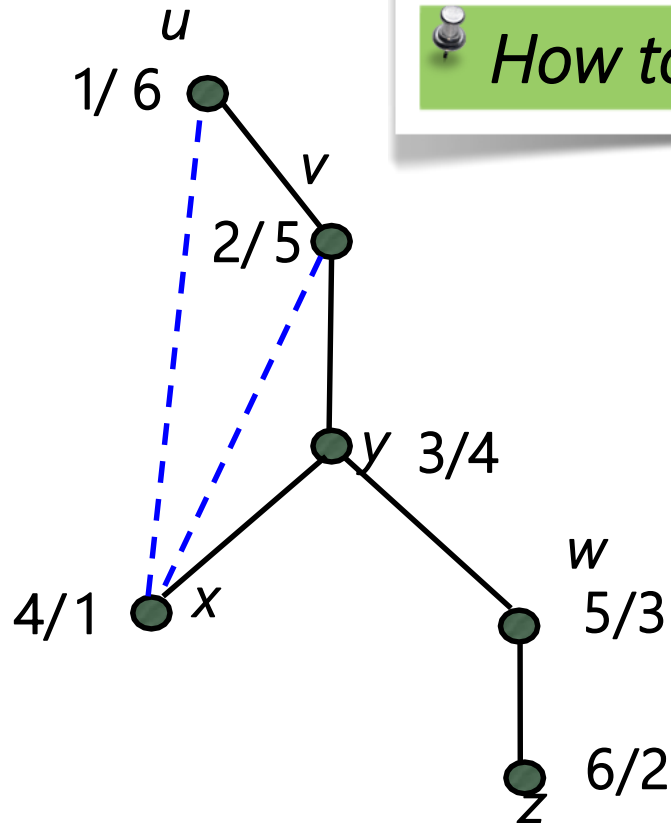


BFS tree

# Depth-first search



## DFS tree: undirected



DFS tree

 *How to figure out back edges?*

- tree edge: 
- back edge: 

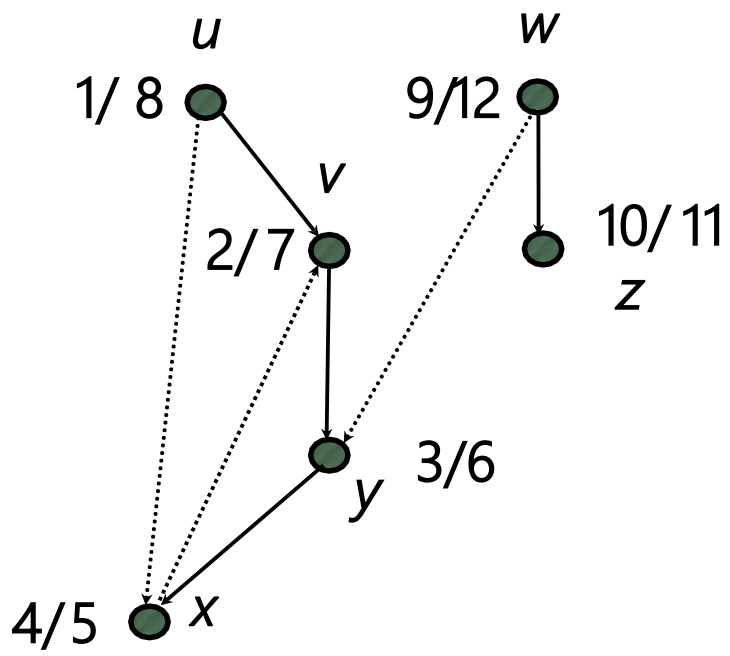
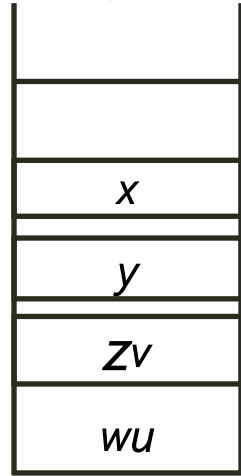
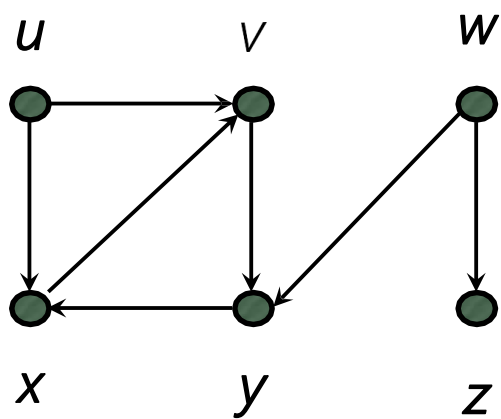
# Complexity

		Time	Space
Undirected	Adj. Matrix	$O( V ^2)$	$O( V )$
	Adj. List	$O( V  + 2 E )$	



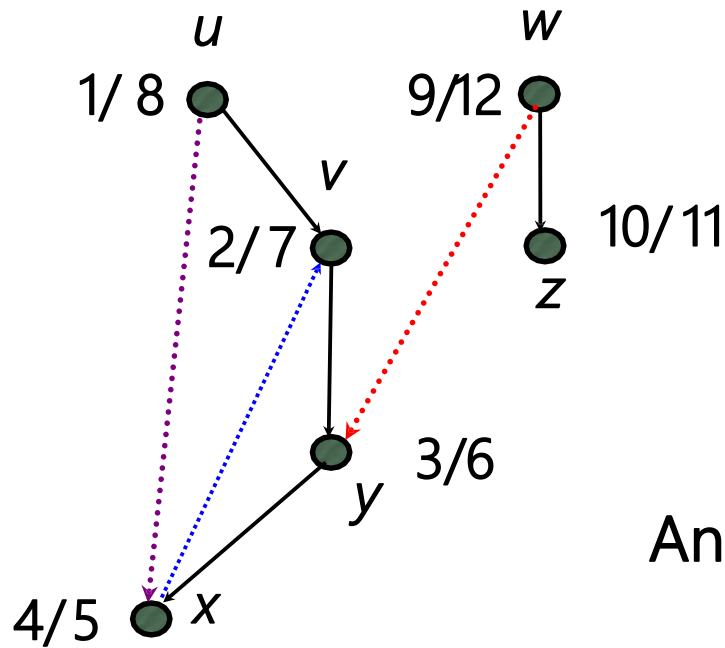
# DFS tree: directed graph





time = 0



DFS trees

# DFS tree



- tree edge: 
- back edge: 
- forward edge: 
- cross edge: 

An edge  $(u,v)$  is a *back edge* iff  
 $\text{finish}(u) < \text{finish}(v)$

# Graph Acyclicity

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NO back edges!

# Connectivity

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## Definition

An undirected graph is **connected**, if there is a path between any pair of vertices.

A **connected component** is a subgraph that is internally connected but has no edges to the remaining vertices.

$\#trees == \#connected\ components$