

M, 09/16/19

Fall'19 CSCE 629

# Analysis of Algorithms

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## Lecture 7

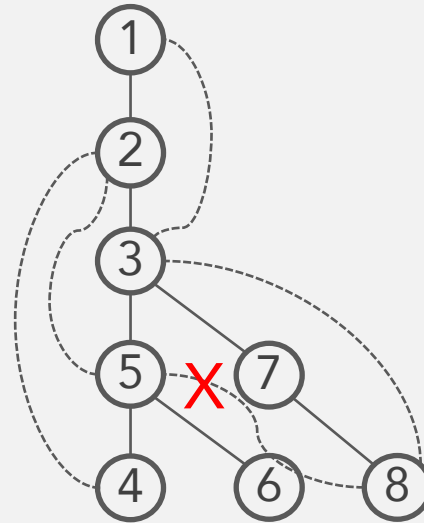
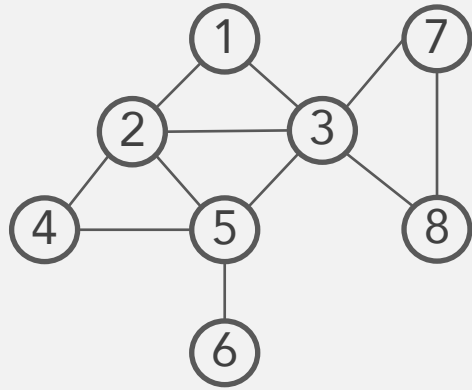
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- Graph representations
- BFS/DFS implementations
- Connected component

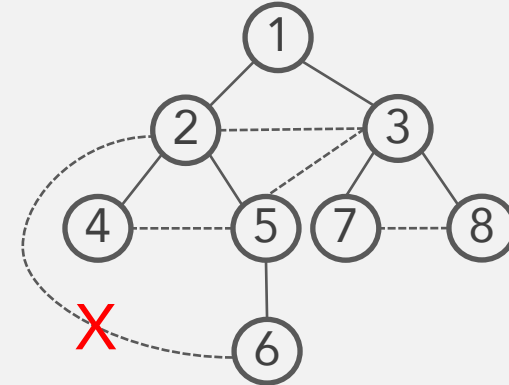
Credit: based on slides by A. Smith & K. Wayne

# DFS Recap

- Constructing DFS tree



## Contrast with BFS tree



- Running time: linear  $O(|V| + |E|)$  (more to come)
- Let  $T$  be a DFS tree of  $G$ , and let  $u$  &  $v$  be nodes in  $T$ . Let  $(u, v)$  be an edge of  $G$  that is **not an edge of  $T$** . Then one of  $u$  or  $v$  is an **ancestor** of the other.

# Implementing (B/D)FS

## Generic traversal algorithm

1.  $R = \{s\}$
2. **While** there is an edge  $(u, v)$  where  $u \in R$  and  $v \notin R$ , add  $v$  to  $R$ .

To implement it, need to choose

- Graph representation
- Data structures to track...
  - Vertices already explored
  - Edge to be followed next

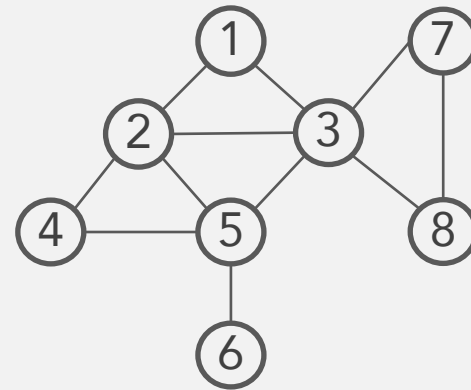
These choices affect the **order** of traversal

# Graph representation 1: adjacency matrix

$$G = (V, E), |V| = n, |E| = m$$

■ Adjacency matrix  $A$ :  $n$ -by- $n$ .  $A_{uv} = 1$  iff.  $(u, v)$  is an edge

- Lookup an edge:  $\Theta(1)$  time
- List all neighbors:  $\Theta(n)$
- Symmetric (undirected graph)
- Space:  $\Theta(n^2)$ , good for dense graphs



A	1	2	3	4	5	6	7	8
1	0	1	1	0	0	0	0	0
2	1	0	1	1	1	0	0	0
3	1	1	0	0	1	0	1	1
4	0	1	0	0	1	0	0	0
5	0	1	1	1	0	0	0	0
6	0	0	0	0	1	0	0	0
7	0	0	1	0	0	0	0	1
8	0	0	1	0	0	0	1	0

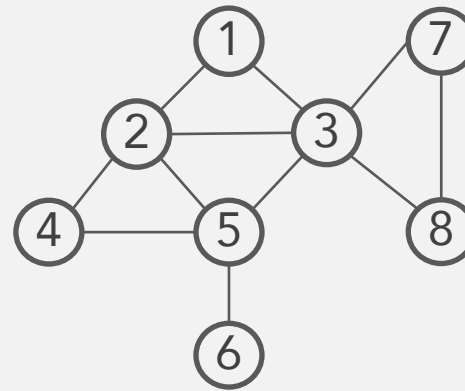
# Graph representation 2: adjacency lists

$$G = (V, E), |V| = n, |E| = m$$

■ **Adjacency list.**  $\forall u \in V, Adj[u] = \{v: v \text{ adjacent to } u\}$

- Lookup an edge  $(u, v)$ :  $\Theta(\deg(u))$  time
- Directed graph: out-going edges
- Space:  $\Theta(n + m)$ , good for **sparse** graphs

How many entries in the lists?  
 $\sum_u \deg(u) = 2m$



$$Adj[1] = \{2, 3\}$$

$$Adj[2] = \{1, 3, 4, 5\}$$

$$Adj[3] = \{1, 2, 5, 7, 8\}$$

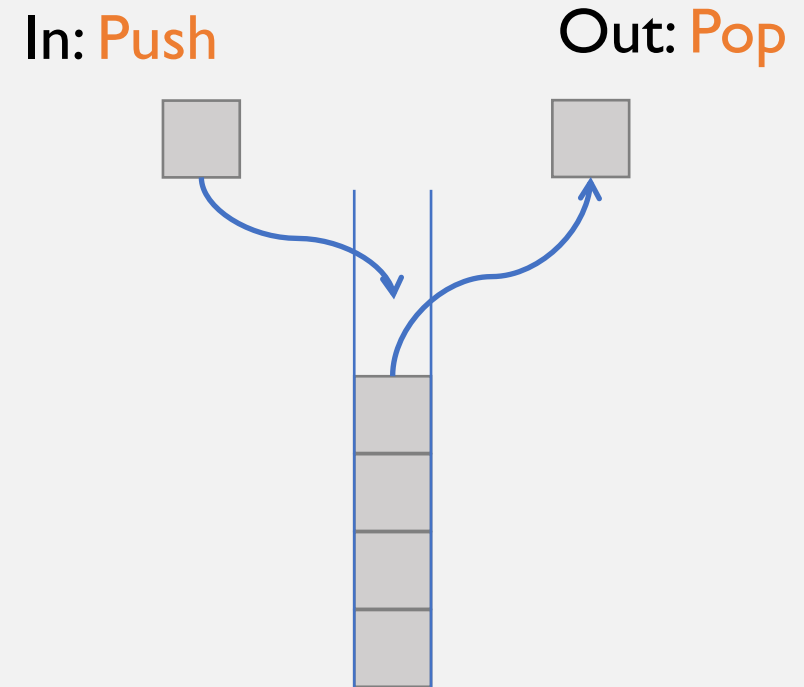
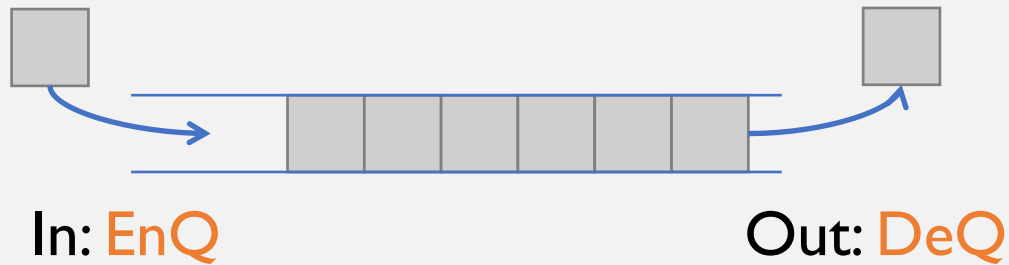
$\vdots$

$$Adj[8] = \{3, 7\}$$

# Review: queue & stack

Two options for maintaining a set of elements

1. **Queue**: first-in first out (FIFO)
2. **Stack**: last-in first out (LIFO)



# BFS implementation

- Input:  $G = (V, E)$  by adjacency list  $Adj$ . Start node  $s$ .
- Output: BFS tree  $T$  (rooted at  $s$ ). Initialized to empty.

**BFS**( $s$ ): // **Discovered**[1,...,n]: array of bits  
(explored or not) – initialized to all zeros.

// **Queue**  $Q \leftarrow \emptyset$

1. Set **Discovered**[ $s$ ] = 1

2. **EnQ**( $s$ ) // add  $s$  to  $Q$

3. **While**  $Q$  not empty, **DeQ**( $u$ )

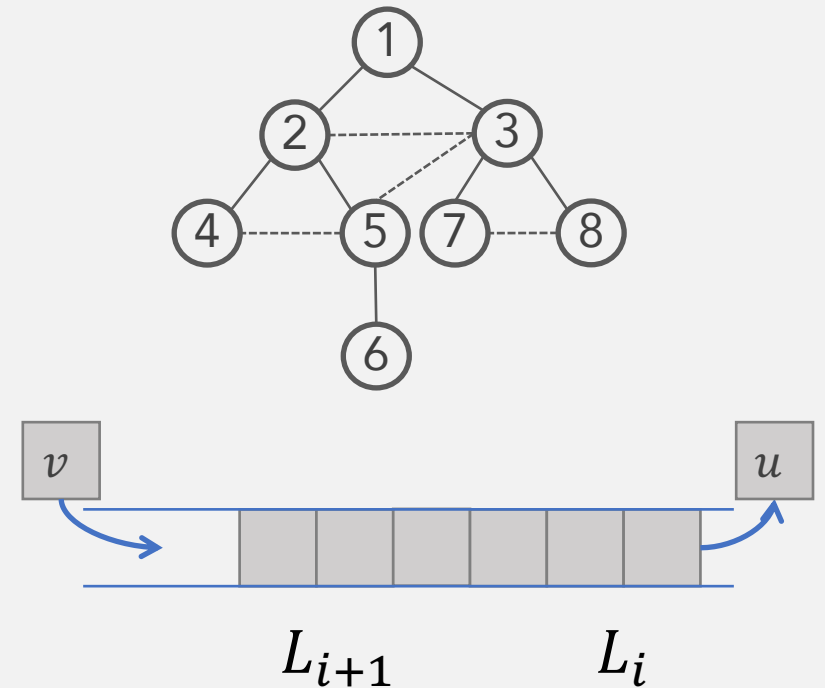
**For** each  $(u, v)$  incident to  $u$

**If** **Discovered**[ $v$ ] = 0 **then**

            Set **Discovered**[ $v$ ] = 1

            Add edge  $(u, v)$  to  $T$

**EnQ**( $v$ )



# BFS running time

**BFS**( $s$ ): // **Discovered**[1,...,n]: array of bits  
(explored or not) – initialized to all zeros.

// **Queue**  $Q \leftarrow \emptyset$

1. Set **Discovered**[ $s$ ] = 1

2. **EnQ**( $s$ ) // add  $s$  to  $Q$

3. **While**  $Q$  not empty, **DeQ**( $u$ )

**For** each  $(u, v)$  incident to  $u$

**If** **Discovered**[ $v$ ] = 0 **then**

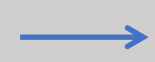
            Set **Discovered**[ $v$ ] = 1

            Add edge  $(u, v)$  to  $T$

**EnQ**( $v$ )



$O(1)$ , run once for all



$O(1)$ , run once **per vertex**



$O(1)$ , run  $\leq$  twice **per edge**

**Theorem.** **BFS** takes  $O(m + n)$  time (**linear** in input size).



# DFS implementation

**Theorem.** DFS takes  $O(m + n)$  time (linear in input size).

**DFS**( $s$ ): // Discovered[1,...,n]

// Stack  $S \leftarrow \emptyset$

1. Set Discovered[ $s$ ] = 1

2. Push( $s$ ) // add  $s$  to  $S$

3. While  $S$  not empty, Pop( $u$ )  
    If Discovered[ $u$ ] = 0 then

        Set Discovered[ $u$ ] = 1

        For each  $(u, v)$  incident to  $u$

            Push( $v$ )

**BFS**( $s$ ):

...

3. While  $Q$  not empty, DeQ( $u$ )

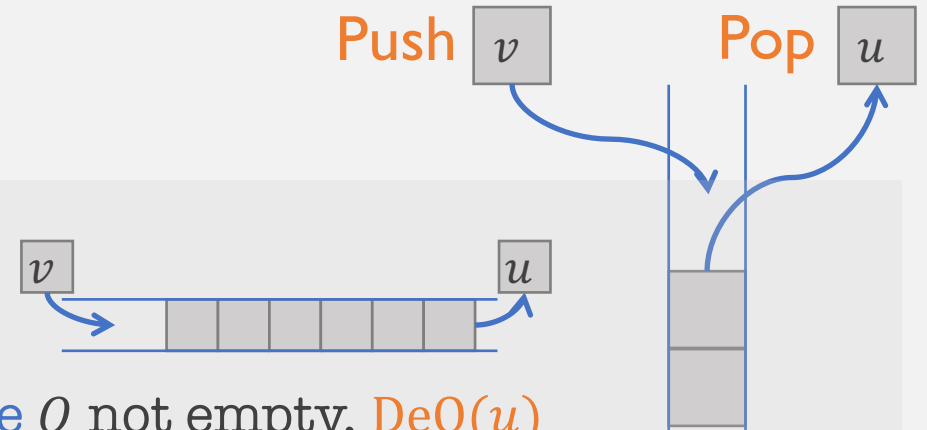
    For each  $(u, v)$  incident to  $u$

        If Discovered[ $v$ ] = 0 then

            Set Discovered[ $v$ ] = 1

            Add edge  $(u, v)$  to  $T$

            EnQ( $v$ )

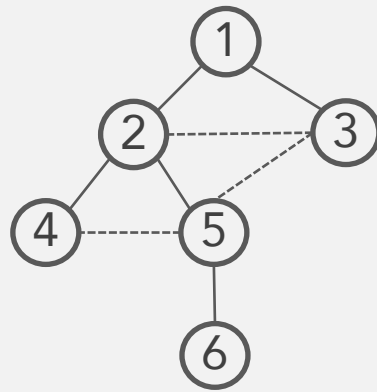
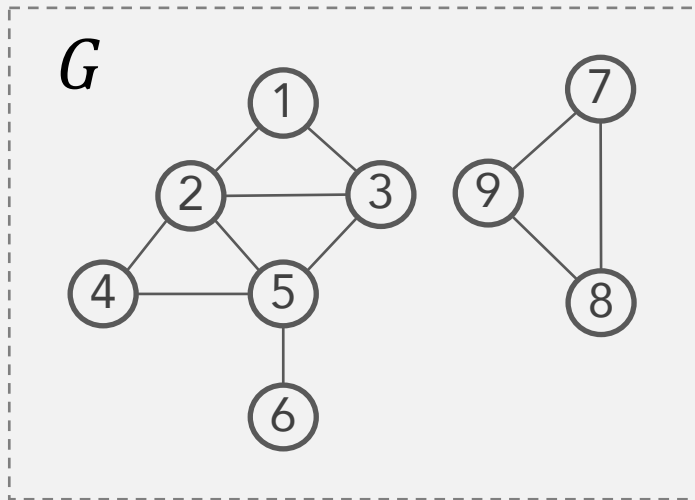


**Exercise.** How to build DFS tree  $T$  along the way?

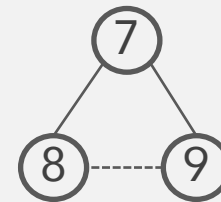
# Connected components

- B/DFS actually tells more than  $s$ - $t$  connectivity...

Connected component of  $G$  containing  $s$ :  
all nodes reachable from  $s$



$BFS(1)$



$BFS(7)$

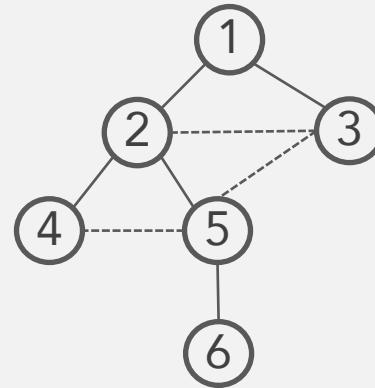
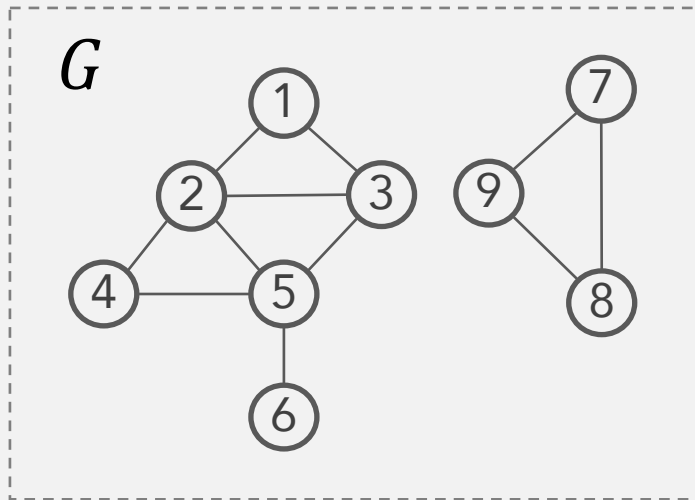
- **Claim.** For any two nodes  $s$  and  $t$ , their connected components are either **identical** or **disjoint**.

# The set of all connected components

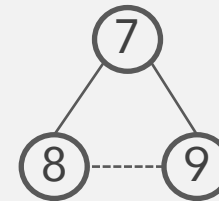
## ■ In-class discussion

- How to find all connected components?
- How fast?
- Why care?

- Iterate over  $V$ , run B/DFS
- $\sum_i O(n_i + m_i) = O(m + n)$
- Basic topology about  $G$



$BFS(1)$



$BFS(7)$