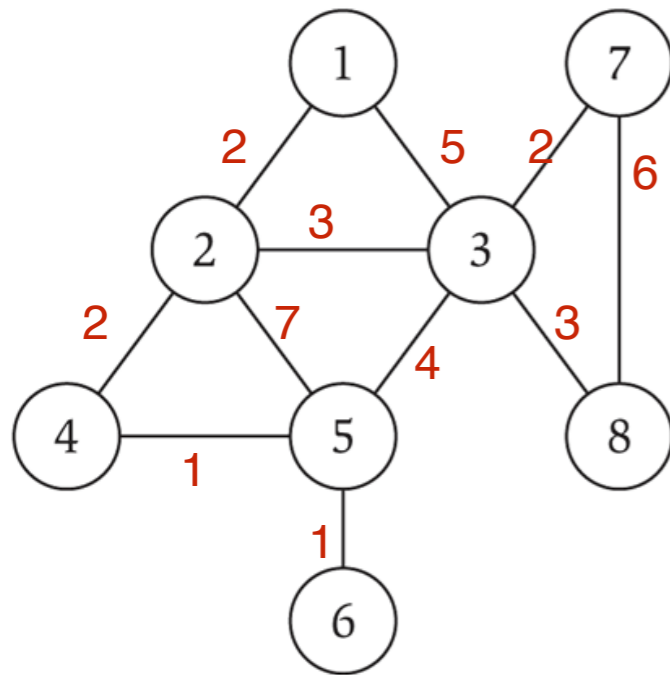


# TopHat review



NodeId	Neighbors
1	2   2    3   5
2	1   2    4   2    5   7    3   3
3	2   3    1   5    5   4    7   2    8   3
4	2   2    5   1
8	3   3    7   6
7	3   2    8   7
5	2   7    4   1    3   4    6   1
6	5   1

neighbor id      edge weight

Question:

Let A be an adjacency list. What is the total number of keys stored in A?

- A.  $\Theta(|V|)$     C.  $\Theta(|E|)$     **E.  $\Theta(|V| + |E|)$**   
 B.  $\Theta(|V|^2)$     D.  $\Theta(\max\{degree(v)\})$

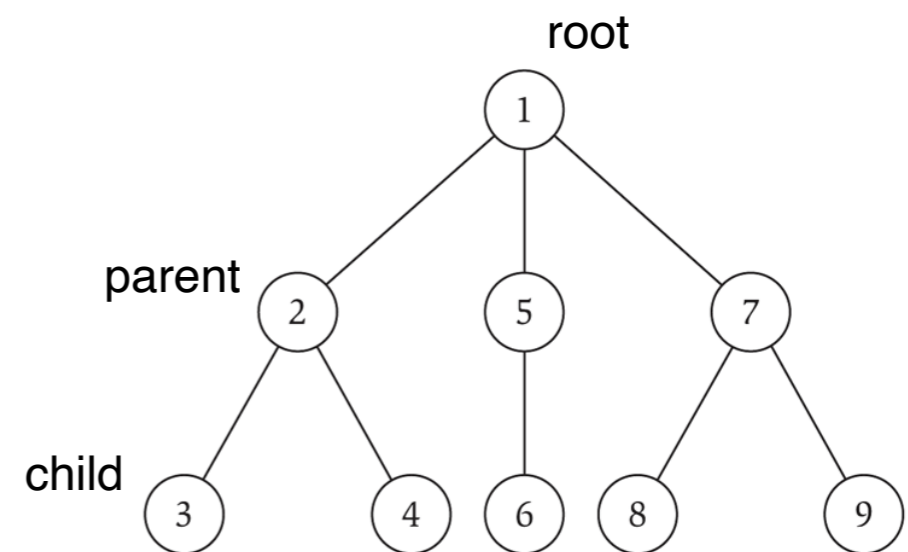
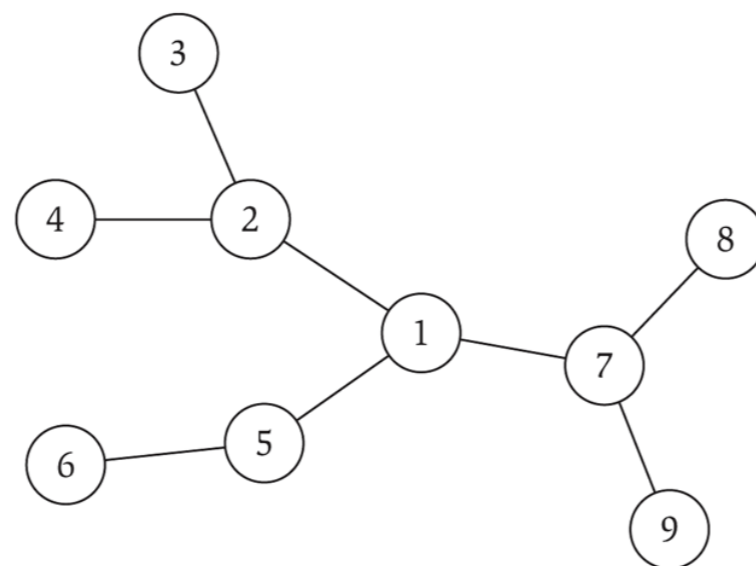
# Trees

A **cycle** in a graph is a path, such that the first and last vertex is the same.

An undirected (connected) graph is a **tree** if it doesn't contain any cycles.

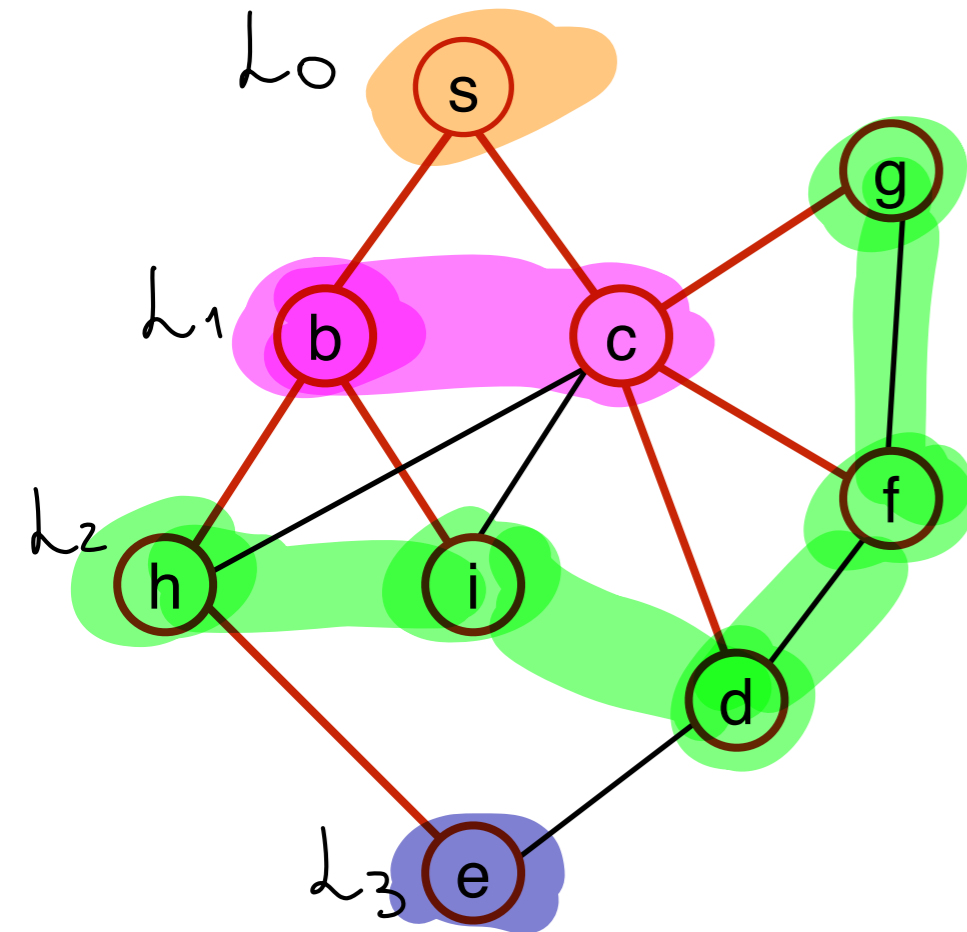
We can designate a node in the tree to be the **root**.

- we use the term parent, child, ancestor in this context. (e.g. parent = the last node on the path from the root to the child.)

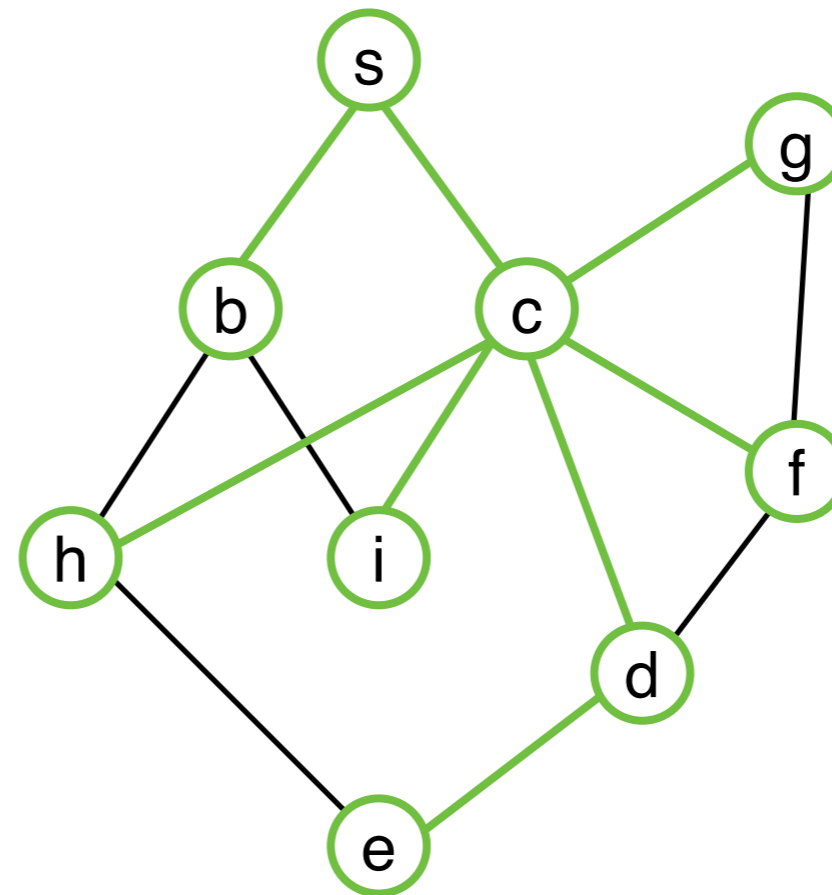


## BFS tree

- Trees define a path between nodes.
- What is the relationship between the paths in the BFS tree(s) and the distance of vertices from  $s$ ?

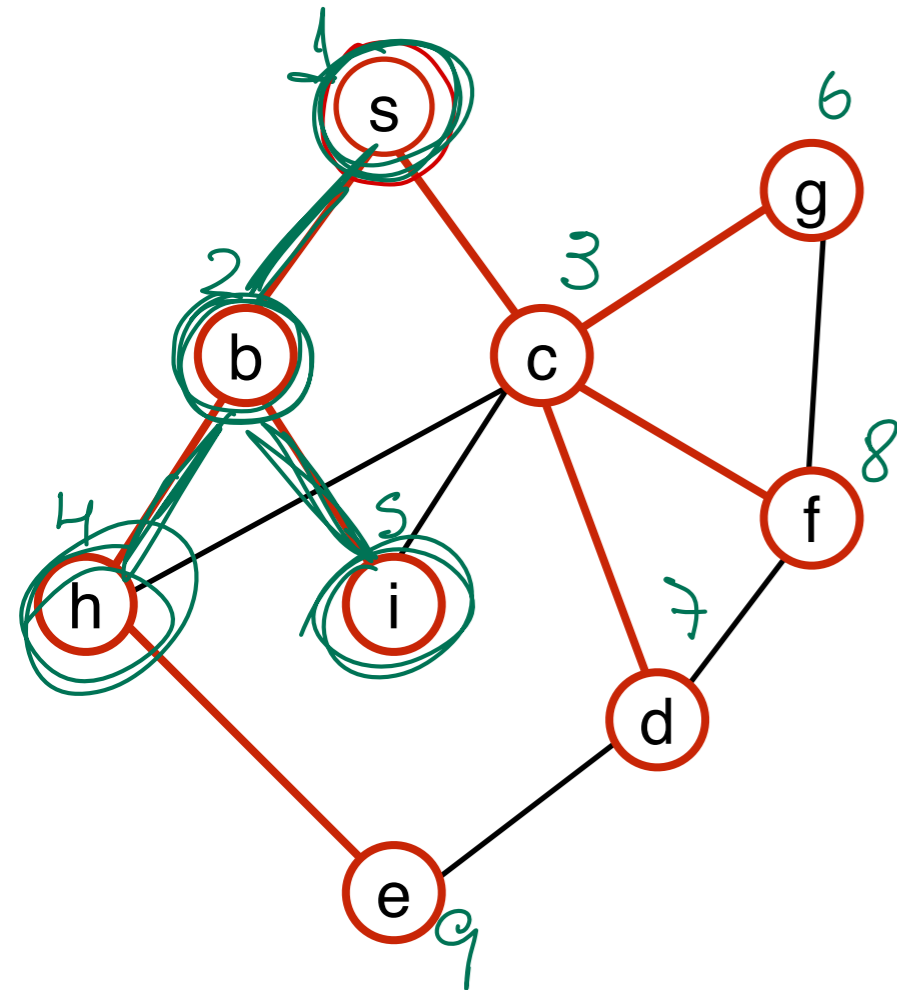


BFS search tree



an other BFS search tree

# BFS




---

## Algorithm 1: BFS( $G, s$ )

---

```

/*  $G$  is hash table, the adjacency list of a graph */
/*  $s$  is a source vertex in  $G$  */
-1  $parents \leftarrow \{\}$  /* empty hash table,  $parents[v] = v$ 's parent. */
-2  $dist \leftarrow \{\}$  /* empty hash table,  $dist[v] =$  distance from  $s$ . */
-3  $Q \leftarrow$  empty FIFO queue /* keep track of active nodes */
-4  $Q.enqueue(s)$ ,  $parents[s] = None$ ,  $dist[s] = 0$  /* initialization  $\Theta(1)$  */
-5 while  $Q$  is not empty do  $\leftarrow ? \Theta(n)$  times
-6    $u \leftarrow Q.dequeue()$ ;  $\Theta(1)$ 
-7   for  $v$  in  $G[u]$  do  $\leftarrow ? \delta(u)$ 
      /* explore neighbors of active node  $u$  */
-8   if  $v$  not in  $parents$  then
      /*  $v$  was so far undiscovered */
-9      $parents[v] = u$ ;
-10     $dist[v] = dist[u] + 1$ ;
-11     $Q.enqueue(v)$ ;  $\Theta(1)$ 
-12 return  $parents, dist$ 

```

---

notation:

- $G[u]$  returns the neighbor list of node  $u$
- $parents[v]$ ,  $dist[v]$  returns the value (node ID, number) stored at index  $v$

# BFS - running time analysis

---

## Algorithm 1: BFS( $G, s$ )

---

$\Theta(1)$  = constant time  
to initialize  
data structures

$\Theta(n)$   
iterations

$\Theta(\delta(u))$

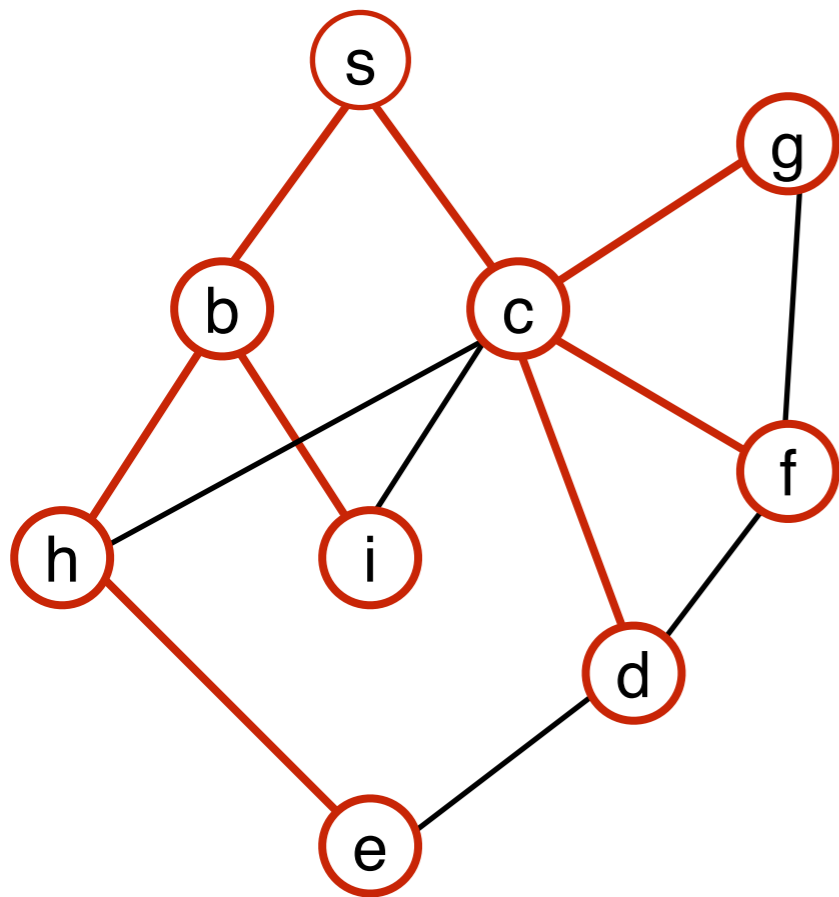
```
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6  $Q.enqueue(s)$ ,  $parents[s] = None$ ,  $dist[s] = 0$  /* initialization */
7 while  $Q$  is not empty do
8    $u \leftarrow Q.dequeue()$ ;
9   for  $v$  in  $G[u]$  do
10    /* explore neighbors of active node  $u$  */
11    if  $v$  not in  $parents$  then
12     /*  $v$  was so far undiscovered */
13      $parents[v] = u$ ;
14      $dist[v] = dist[u] + 1$ ;
15      $Q.enqueue(v)$ ;
16 return  $parents, dist$ 
```

---

$$\Theta(1) + \sum_{i=1}^n \delta(u) \Rightarrow \Theta(|V| + |E|)$$

# BFS

- BFS: a single source shortest paths algorithm, e.g. returns the distance from a node  $s$  to each other node  $v$ .



BFS search tree

# TopHat

Select all that are true when running BFS on graph  $G$  from source  $s$ .

- A. The BFS search tree is unique.
- B. When running BFS on  $G$  twice with different processing order the values in  $\text{dist}[\ ]$  (i.e. the computed distance values) are identical in the two runs.
- C. The shortest path from  $s$  to a node  $v$  is always unique.
- D. If there is an edge connecting nodes  $u$  and  $v$  then their distances from  $s$  cannot be the same.
- E. The path from  $s$  to  $v$  in the BFS tree (i.e. following the edges of the tree from  $s$  to  $v$ ) is a shortest path.

# BFS

**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

In consequence BFS should **return**

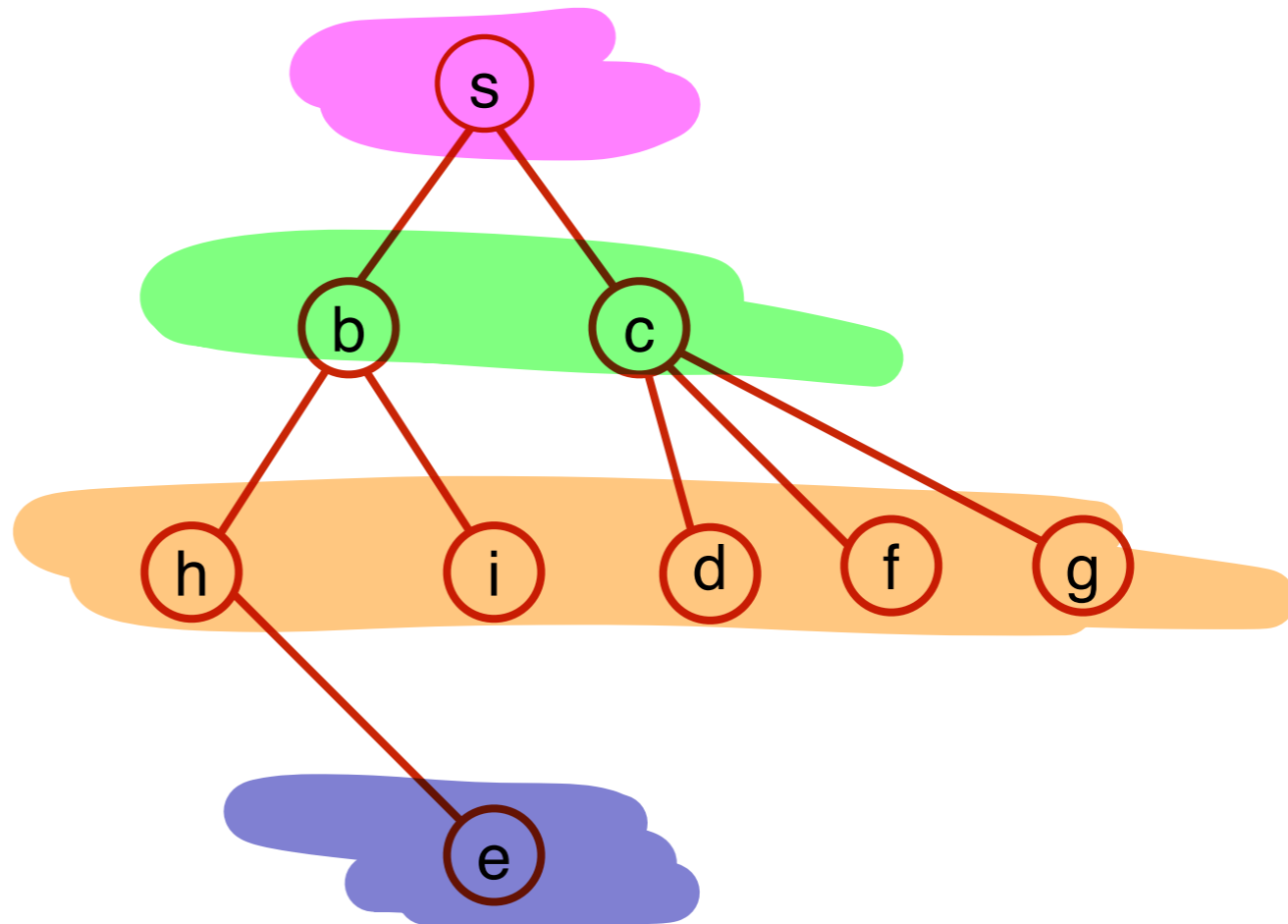
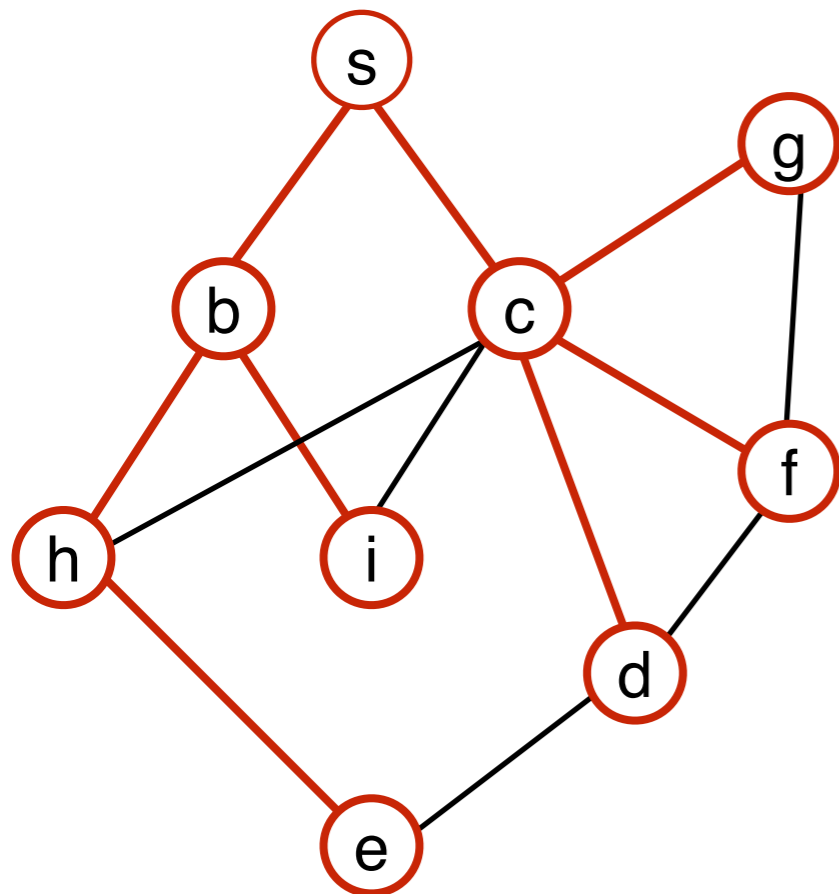
- the layer of each node, so that we get the distances
- the BFS tree, since they encode the shortest paths themselves

## Breadth first search - correctness (multiple slides)

**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

Proof.

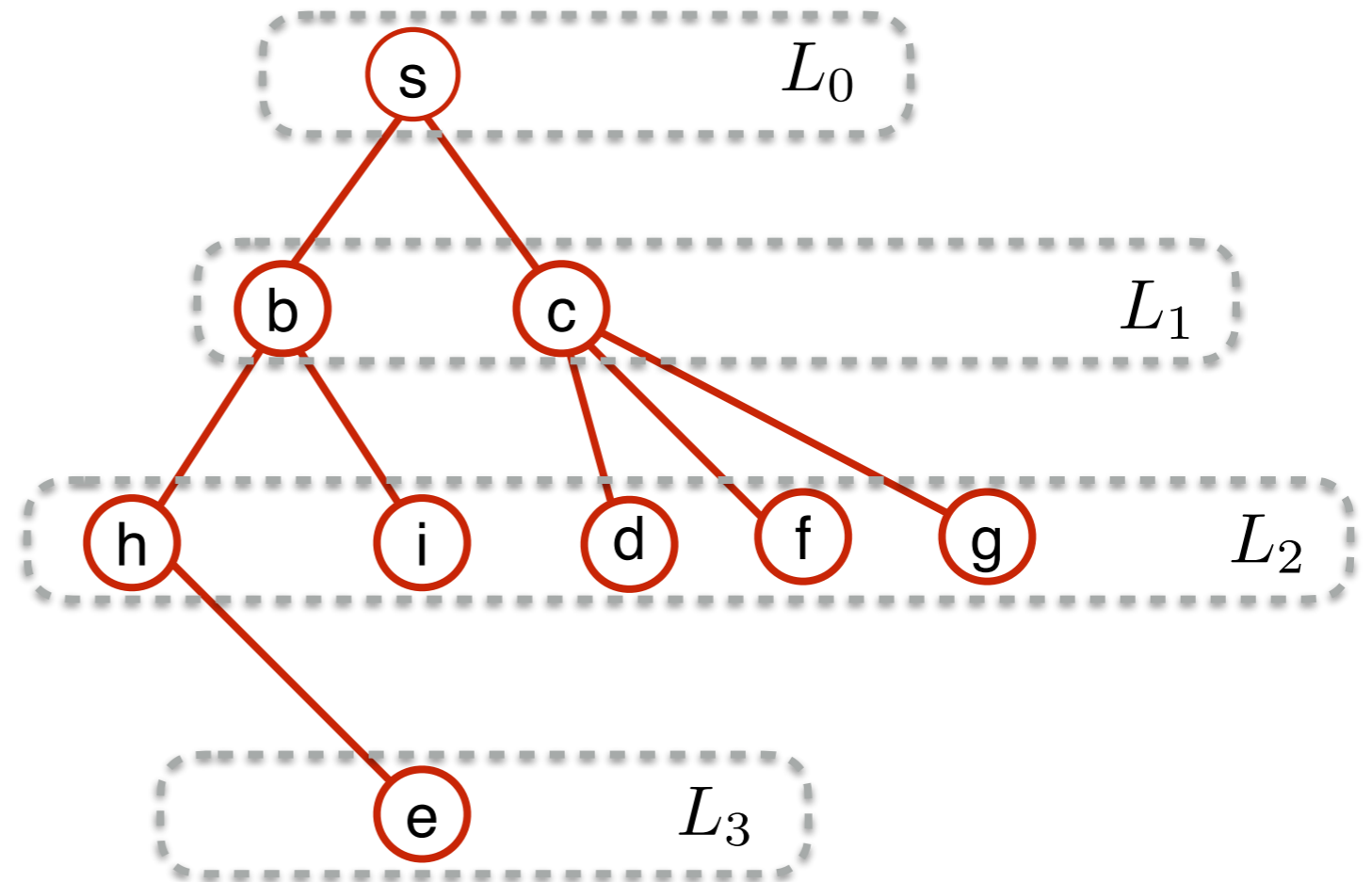
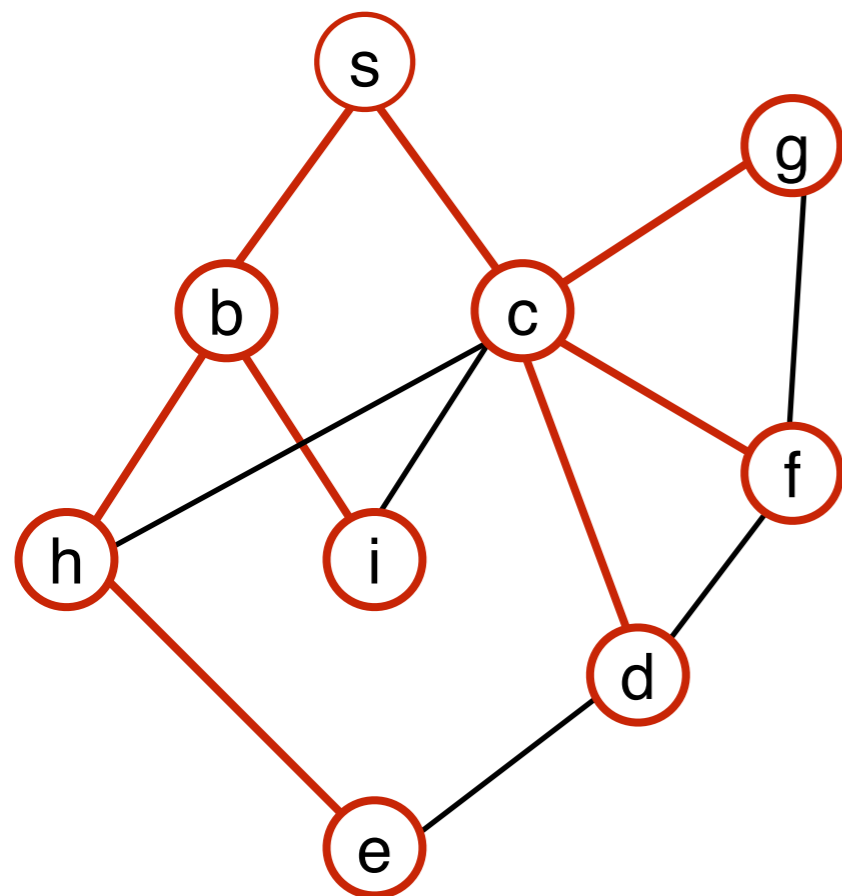
This is the BFS tree associated with  $G$ .



## Breadth first search - correctness (multiple slides)

**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

Proof.

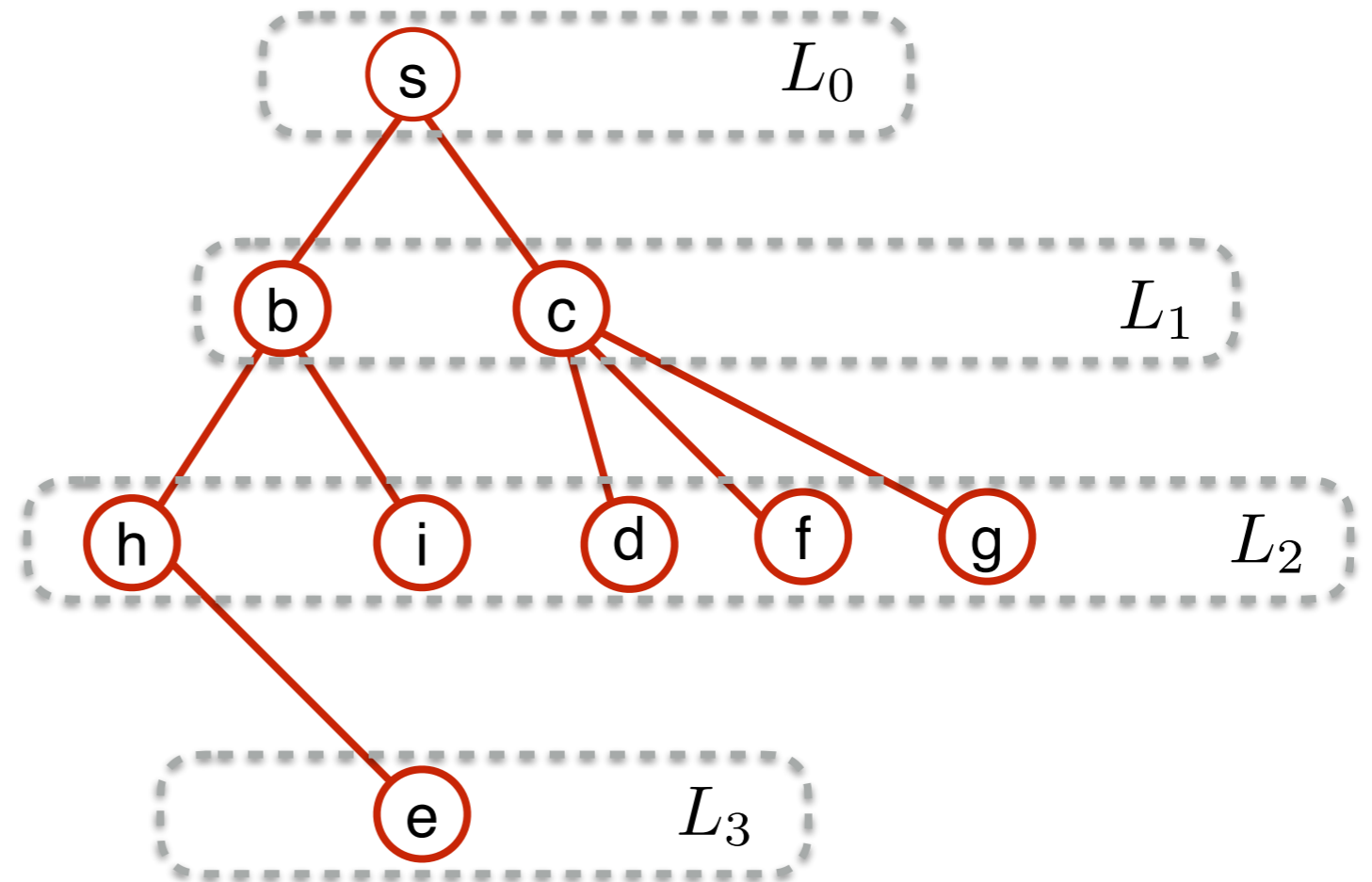


## Breadth first search - correctness (multiple slides)

**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

Proof.

**Proposition:** any two connected nodes are either in the same or consecutive layers.



Note that the proposition applies to every edge in  $G$ , both those in the BFS tree and those that are not.

## Breadth first search - correctness (multiple slides)

**Proposition:** any two connected nodes are either in the same or consecutive layers.

Proof:

- For an edge  $(u,v)$  without loss of generality we may assume that  $u$  was discovered first.
- If  $v$  is in the same layer as  $u$ , the proposition is true
- if  $v$  is not in the same layer, then by the assumption it hasn't been discovered yet
- by the design of BFS  $v$  is an undiscovered neighbor of  $u$ , hence is assigned to the next layer.

## Breadth first search - correctness (multiple slides)

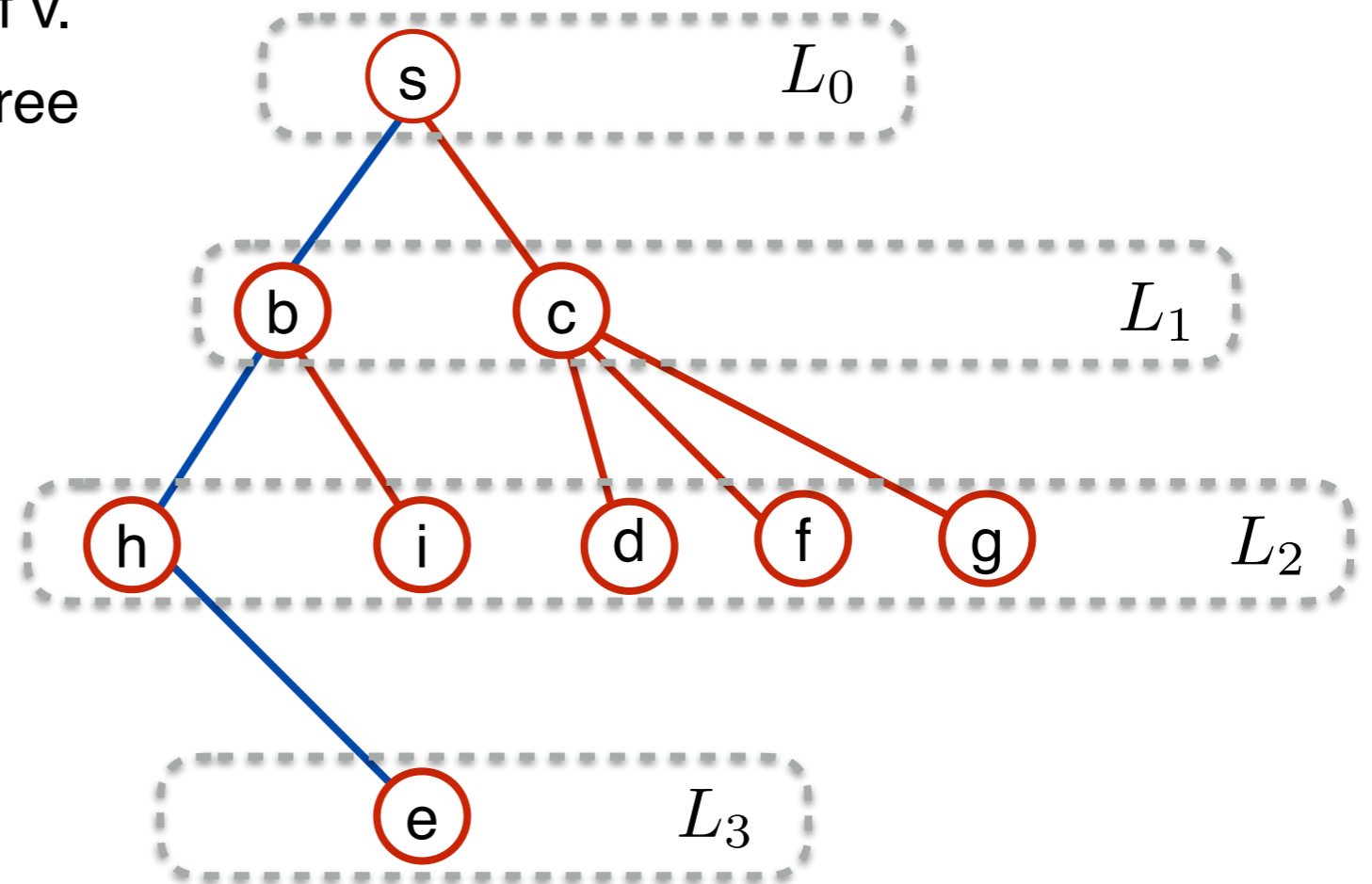
**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

Proof.

Clearly, there is a path from  $s$  to  $v$  of the same length as the layer of  $v$ .

- the one implied by the BFS tree

Is it possible that there is a path from  $s$  to  $v$  with fewer edges?

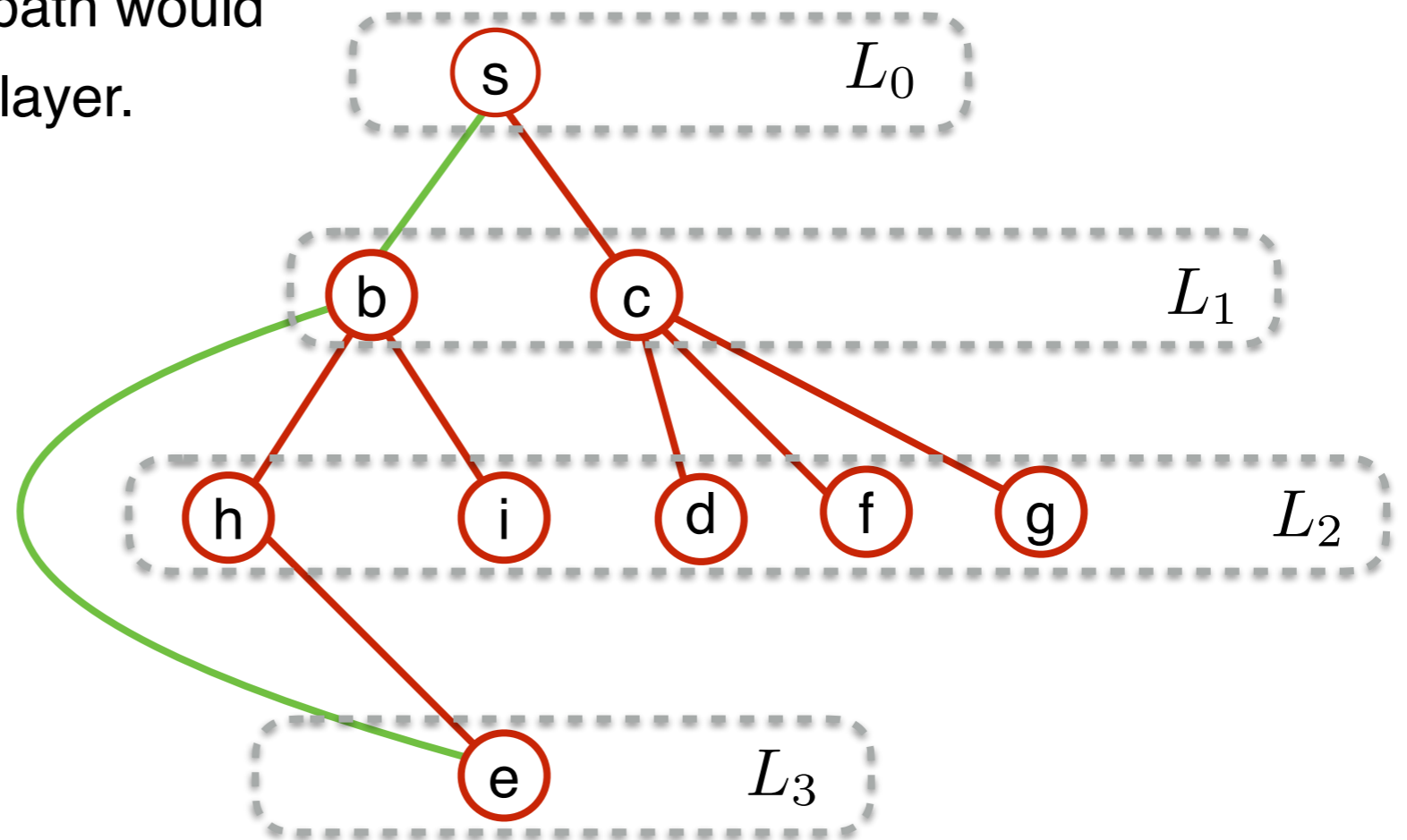


## Breadth first search - correctness (multiple slides)

**Theorem.** For a node  $v$  the length of the shortest path connecting  $s$  to  $v$  is equal to the layer of  $v$  in BFS.

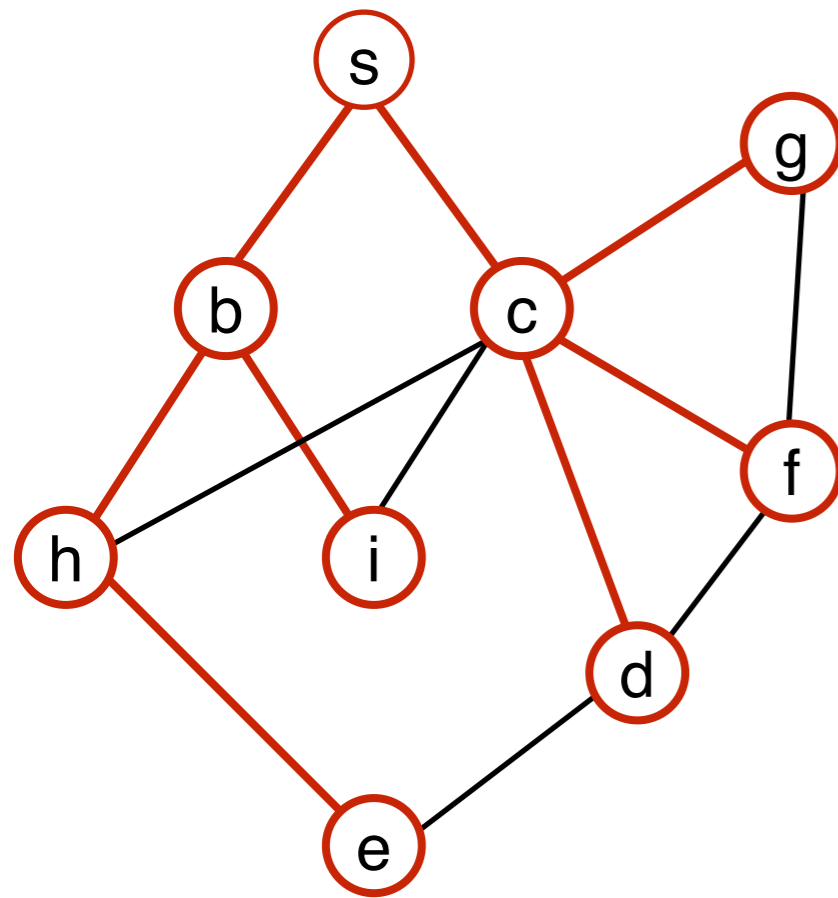
Proof.

For purpose of contradiction, suppose there is a shorter path. That path would have to bypass at least one layer.



This is in contradiction with the proposition that neighbors are at most one layer apart. QED

# BFS



---

## Algorithm 1: BFS( $G,s$ )

---

```
/*  $G$  is hash table, the adjacency list of a graph */
/*  $s$  is a source vertex in  $G$  */
1  $parents \leftarrow \{\}$  /* empty hash table,  $parents[v] = v$ 's parent. */
2  $dist \leftarrow \{\}$  /* empty hash table,  $dist[v] =$  distance from  $s$ . */
3  $Q \leftarrow$  empty FIFO queue /* keep track of active nodes */
4  $Q.enqueue(s)$ ,  $parents[s] = None$ ,  $dist[s] = 0$  /* initialization */
5 while  $Q$  is not empty do
6    $u \leftarrow Q.dequeue()$ ;
7   for  $v$  in  $G[u]$  do
8     /* explore neighbors of active node  $u$  */
9     if  $v$  not in  $parents$  then
10      /*  $v$  was so far undiscovered */
11       $parents[v] = u$ ;
12       $dist[v] = dist[u] + 1$ ;
13       $Q.enqueue(v)$ ;
14 return  $parents, dist$ 
```

---

## Exercise.

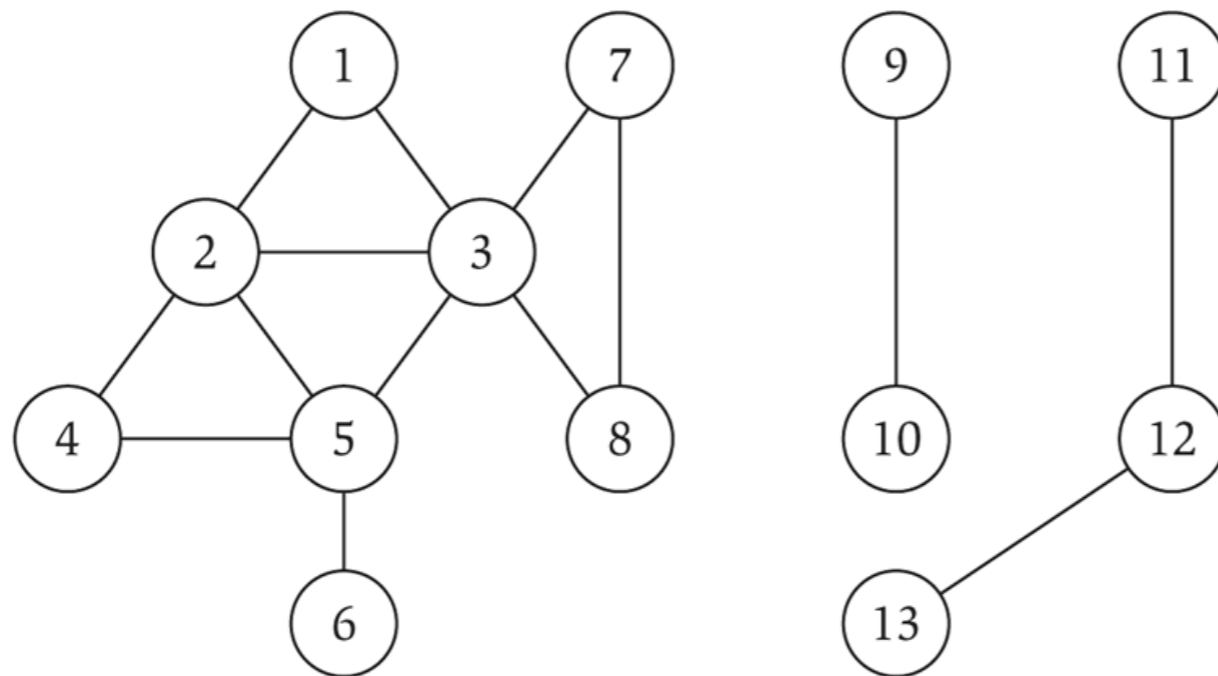
- Given the parents table reconstruct the BFS tree
- For a node  $v$  find the path from  $v$  back to  $s$ . (This is called backtracking)
- do both in  $O(n)$  time

# Connected component

**Def.** An undirected graph is **connected** if for every pair of nodes **u** and **v**, there is a path between **u** and **v**.

The **connected components** of a graph are its connected subgraphs.

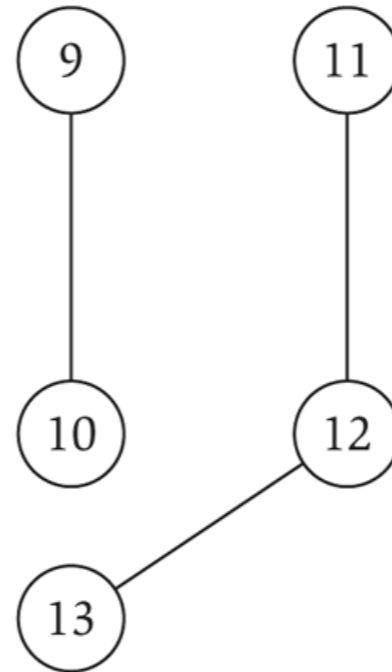
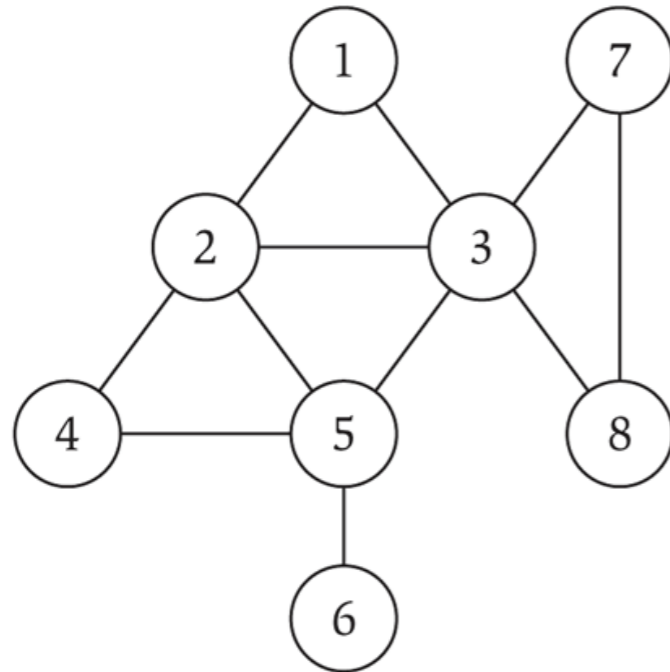
(an analogous concept for directed graph are the strongly connected components.)



graph with 3 connected components:  
 $\{1,2,3,4,5,6,7,8\}$   
 $\{9,10\}$   
 $\{11,12,13\}$

# Connected component

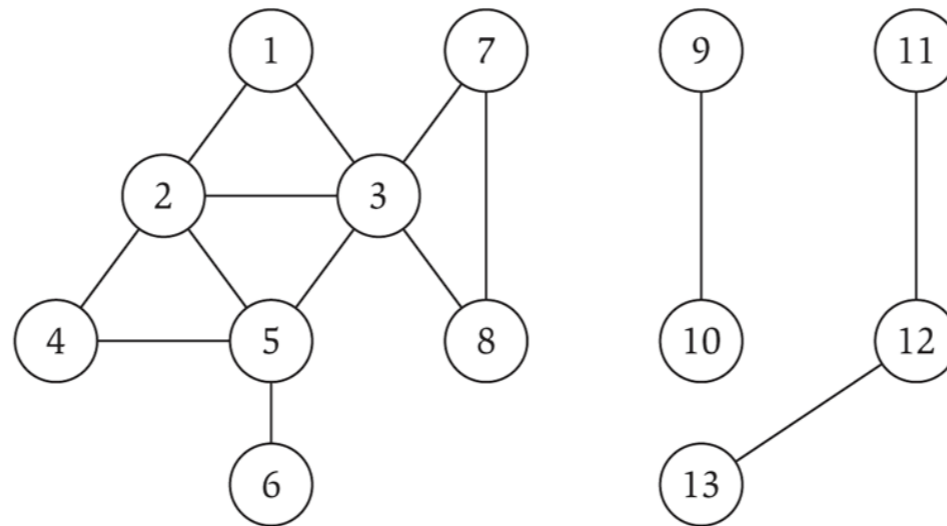
Design an algorithm to find the connected components of an undirected graph.



1. pick a random node  $v$   
and run BFS from  $v$   
→ the nodes that are discovered  
will be part of  $v$ 's component
2. pick another  $w$  at random  
that is not discovered yet
3. go back to 1. using  $w$   
instead of  $v$

# Connected component

Find an algorithm to find all the connected components in  $G$ .

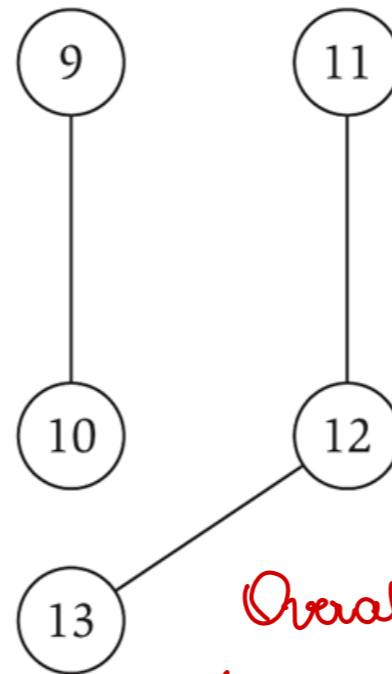
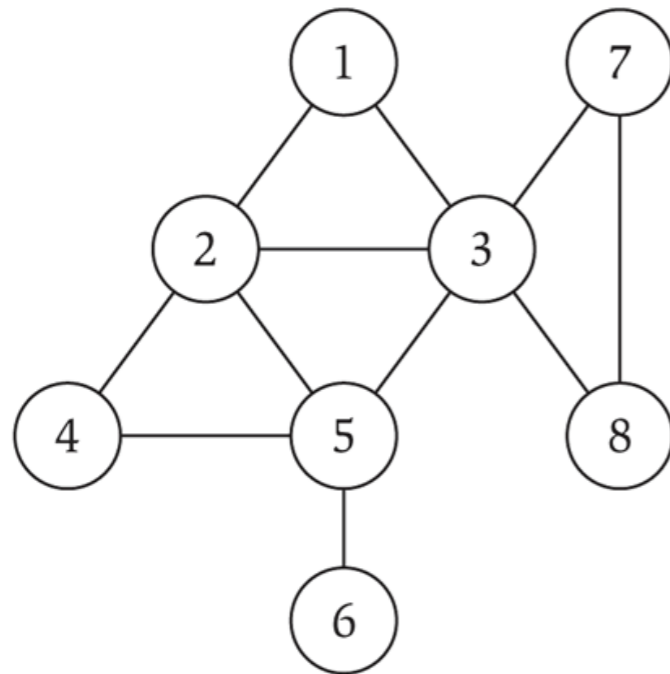


Algorithm: repeatedly run BFS from a yet undiscovered node to find the next connected component.

Running time: still  $O(n+m)$

# Connected component - TopHat

Design an algorithm to find the connected components of an undirected graph.



Runtime on component 1

$$\Theta(n_1 + m_1)$$

Runtime on component 2

$$\Theta(n_2 + m_2)$$

Runtime on component 3

$$\Theta(n_3 + m_3)$$

Overall runtime:

$$\Theta(n_1 + m_1) + \Theta(n_2 + m_2) + \Theta(n_3 + m_3)$$

What is the running time of this algorithm on a graph with  $n$  nodes,  $m$  edges and  $k$  connected components?

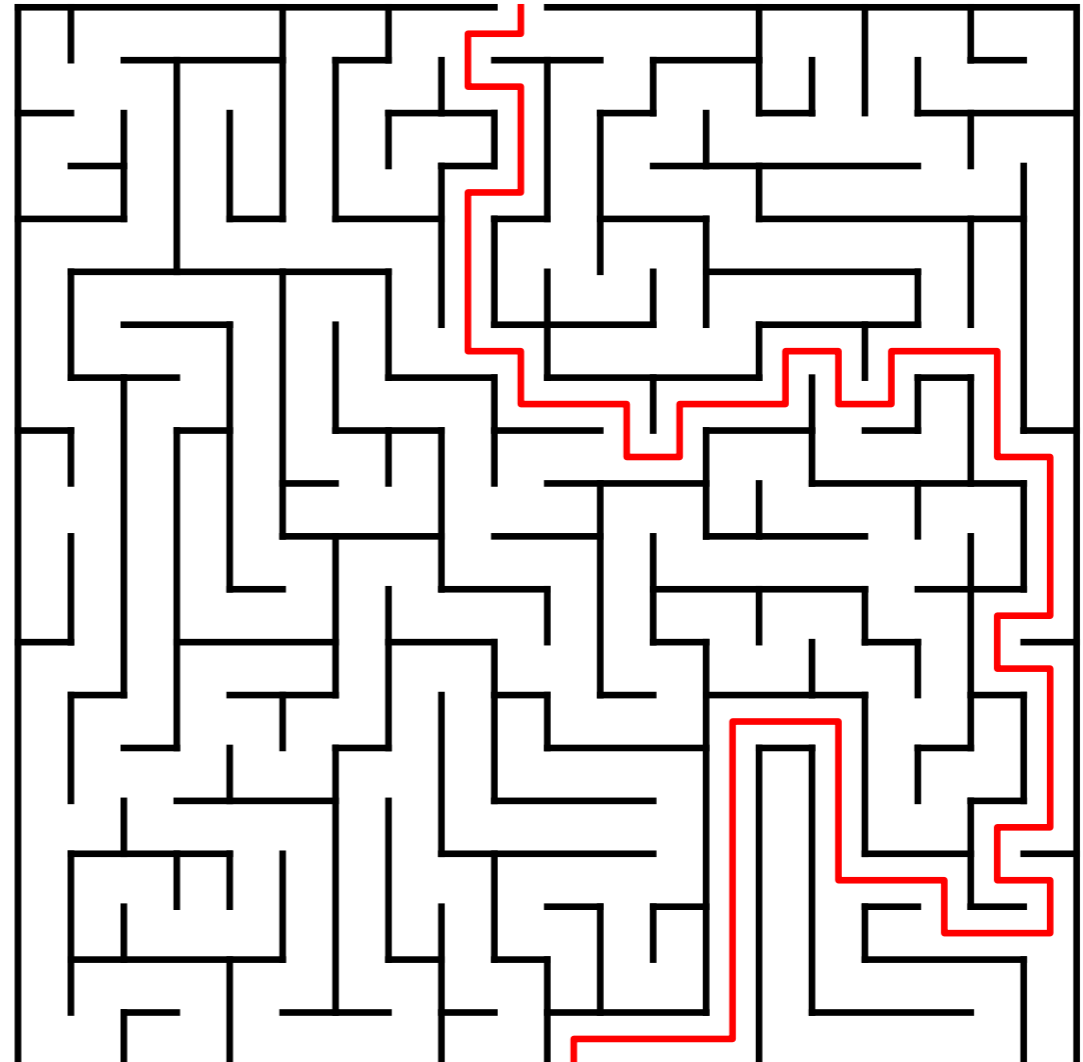
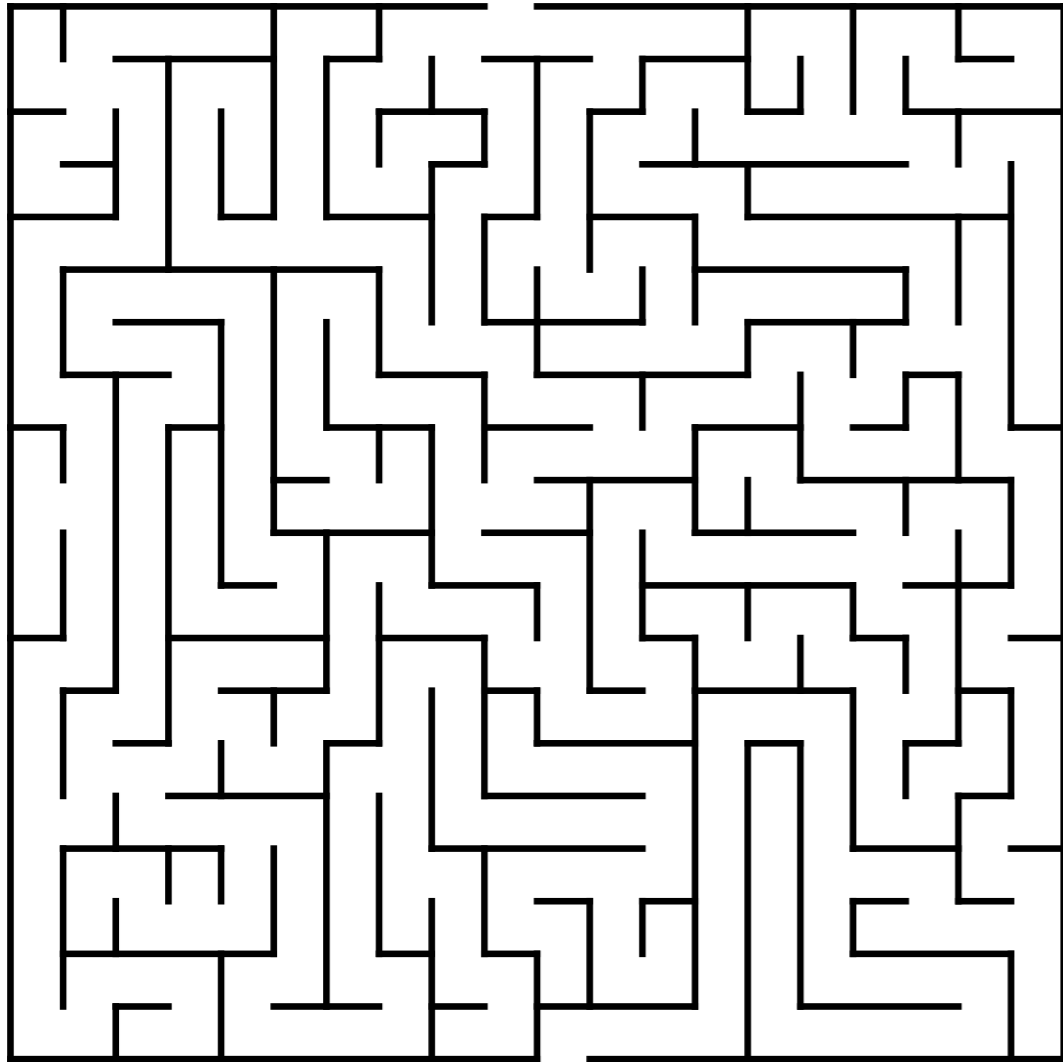
A.  $\Theta(n(n + m))$

B.  $\Theta(k(n + m))$

C.  $\Theta(n + m)$

$$\Theta(\underbrace{n_1 + n_2 + n_3}_{n} + \underbrace{m_1 + m_2 + m_3}_{m})$$
$$\Theta(n + m)$$

# Maze



# Ariadne's thread in logic

## Theseus and the Minotaur

- Greek mythology

## Ariadne's thread

- principle in logic
- solving a problem through exhaustive application of logic through all available routes
- key element: maintain a record with all available and all exhausted options (the record is sometimes referred to as the 'thread')
- record is kept for the purpose of backtracking - reverse earlier decisions and try alternatives

# Depth First Search (DFS) – high level description

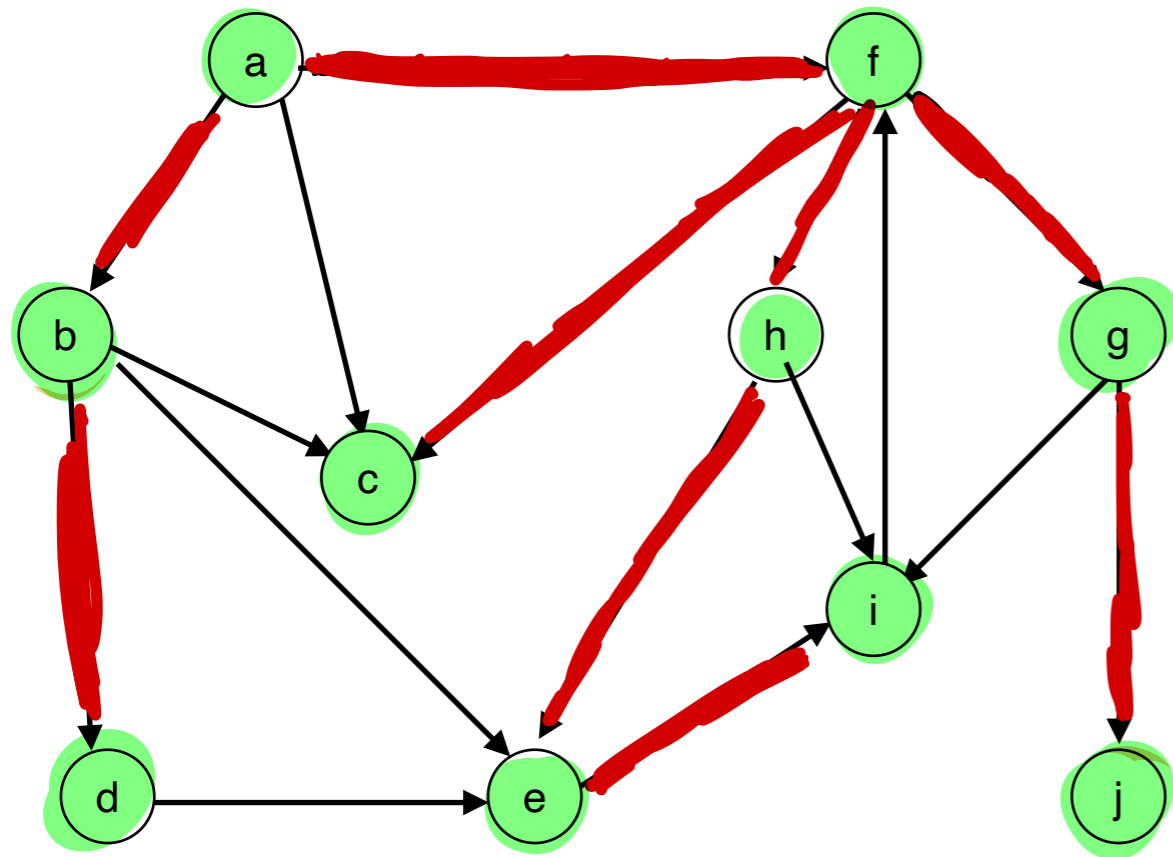
Let  $G(V,E)$  be a directed graph.

Depth First Search (DFS): Graph traversal algorithm. = *it explores the entire graph*

- visits all reachable nodes in a graph
- “depth first” — traverse the furthest away from the source first
- recursive in nature
- output:
  - DFS tree
  - timestamps (discovery time, finish time). Used for applications.

(Recommended reading on DFS CLRS chapter 22.3)

# DFS



source: a

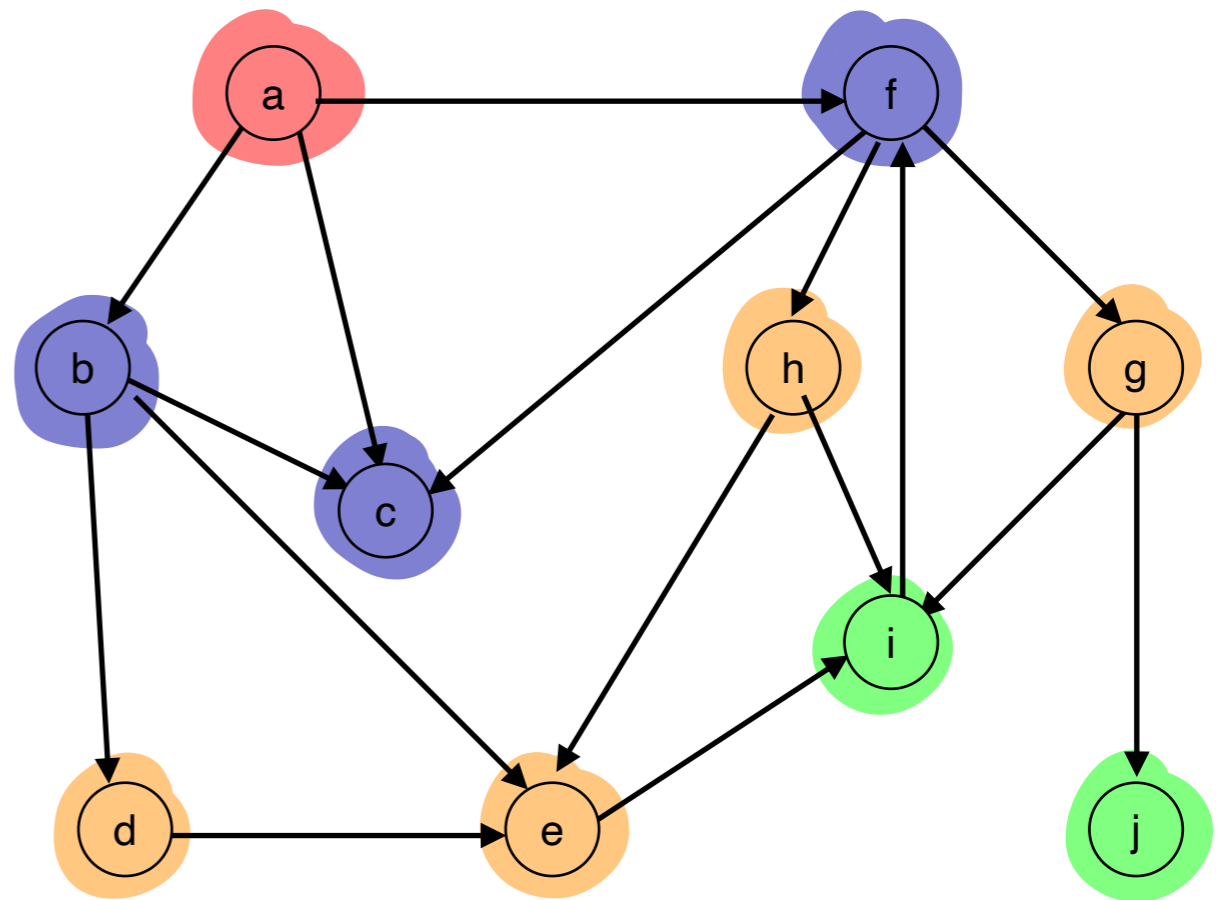
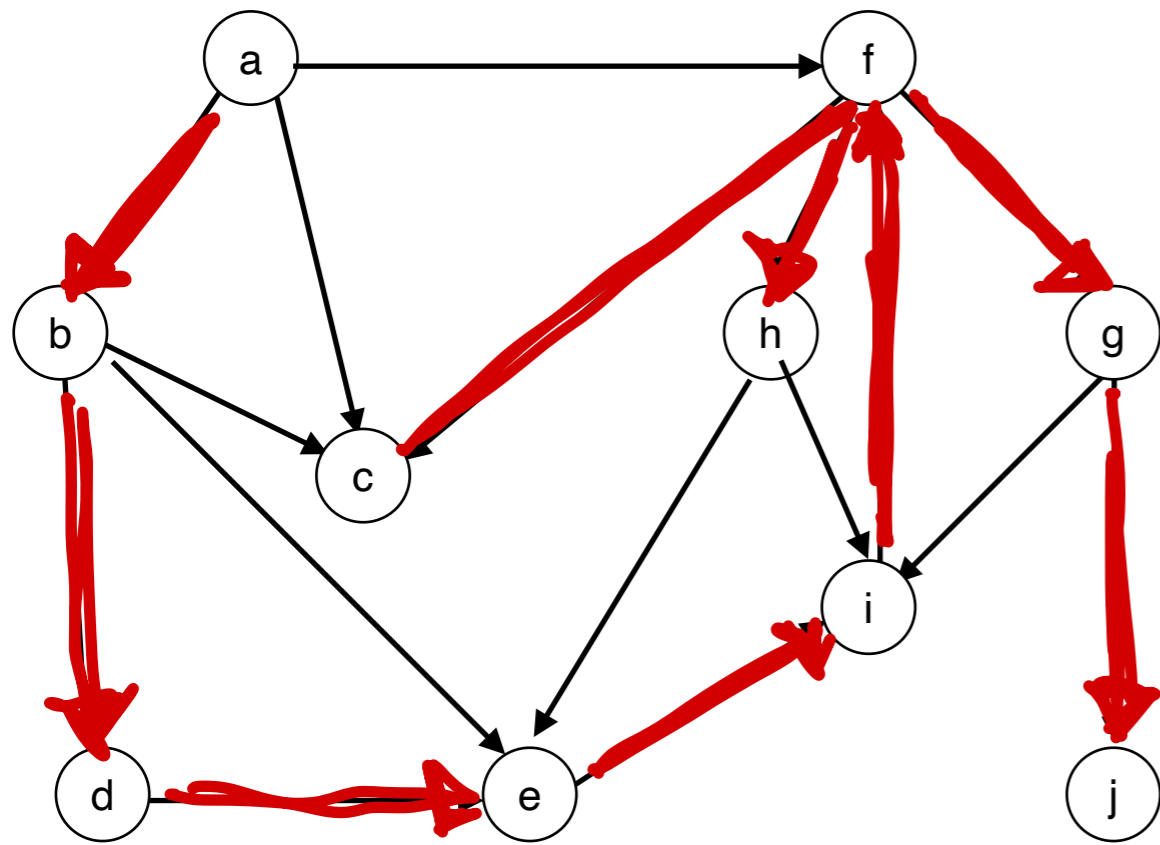
node states: **unexplored**, **discovered**, **finished**

timestamps:

- **discovery time** - time of first visit
- **finish time** - time of last visit

	discovery	finish
a	0	19
b	15	18
c	12	13
d	16	17
e	3	6
f	1	14
g	8	11
h	2	7
i	4	5
j	9	10

# DFS vs. BFS example



source: a - b - d - e - i - f

a - f

# DFS recursive pseudocode

---

## Algorithm 1: DFSwrapper( $G, s$ )

---

```
1 /*  $G$  is the adjacency list of a graph */
2 /*  $s$  is a source node */
3 discovered  $\leftarrow$  empty set /* ids of discovered nodes */
4 parents  $\leftarrow$  hash table /* ids of parents in DFS tree */
5 times  $\leftarrow$  hash table /* times[ $u$ ] = tuple <discovery, finish> */
6  $t \leftarrow -1$  /* counter */
7 discovered.add( $s$ ), parents[ $s$ ] = None;
8 Return DFS( $G, s$ )
```

---

initialize  
 $\Theta(1)$

---

## Algorithm 2: DFS( $G, u$ )

---

```
1 discovered.add( $u$ );  $\leftarrow$ 
2  $t = t + 1$ ;  $\leftarrow$ 
3 times[ $u$ ][0] =  $t$ ;  $\leftarrow$ 
4 for  $v$  in  $G[u]$  do  $\leftarrow$ 
    | /* recursively explore  $u$ 's neighbors
5    | if  $v$  not in discovered then
6    | | parents[ $v$ ] =  $u$ ;
7    | | DFS( $G, v$ );  $\leftarrow$ 
8    |  $t = t + 1$ ;
9    | times[ $u$ ][1] =  $t$ ;
```

---

How can we figure out  
the amount of recursive calls?

**Exercise.** write an iterative implementation of DFS using stacks.

# DFS recursive – runtime of recursive algorithm

---

## Algorithm 1: DFSwrapper( $G, s$ )

---

```
1 /*  $G$  is the adjacency list of a graph */
2 /*  $s$  is a source node */
3 discovered  $\leftarrow$  empty set /* ids of discovered nodes */
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6  $t \leftarrow -1$  /* counter */
7 discovered.add( $s$ ), parents[ $s$ ] = None;
8 Return DFS( $G, s$ )
```

---

$\Theta(1)$

---

## Algorithm 2: DFS( $G, u$ )

---

```
1 discovered.add( $u$ );
2  $t = t + 1$ ;
3 times[ $u$ ][0] =  $t$ ;
4 for  $v$  in  $G[u]$  do
    | /* recursively explore  $u$ 's neighbors */
5 | if  $v$  not in discovered then
6 | | parents[ $v$ ] =  $u$ ;
7 | | DFS( $G, v$ );
8  $t = t + 1$ ;
9 times[ $u$ ][1] =  $t$ ;
```

---

Does the depth matter?

# DFS recursive – runtime of recursive algorithm

How many recursive calls to DFS total?

One call of DFS for every node in  $G$   
 $\Theta(n)$  calls

Runtime of operations done within the current DFS call?

$\Theta(\delta(u))$

---

## Algorithm 2: DFS( $G, u$ )

---

```
1 discovered.add(u);
2 t = t + 1;
3 times[u][0] = t;
4 for v in G[u] do
5     /* recursively explore u's neighbors */
6     if v not in discovered then
7         parents[v] = u;
8         DFS(G, v);
9 t = t + 1;
10 times[u][1] = t;
```

$\Theta(1) = \text{constant time}$   
for loop runs  $\Theta(\delta(u))$  times  
 $\Theta(1)$   
 $\rightarrow n$  recursive calls

$$\Theta(n) + \sum_{i=1}^n \Theta(\delta(u)) = \Theta(|V| + |E|)$$