

# Graph Basics

Data Structures and Algorithms

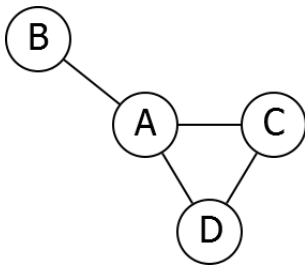
# Formal Definition

## Definition

An (undirected) **Graph** is a collection  $V$  of **vertices**, and a collection  $E$  of **edges** each of which connects a part of vertices.

# Drawing Graphs

Vertices: Points. Edges: Lines.

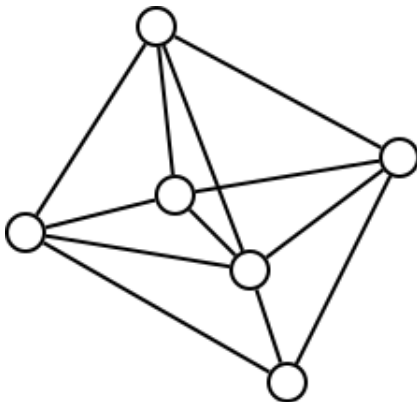


Vertices:  $A, B, C, D$

Edges:  $(A, B), (A, C), (A, D), (C, D)$

# Problem

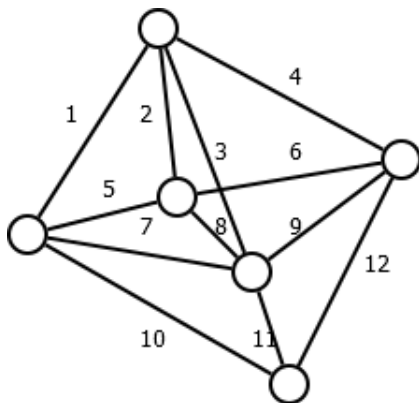
How many edges are in the graph given below?



# Answer

12.

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# Loops and Multiple Edges

Loops connect a vertex to i tself.

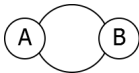


# Loops and Multiple Edges

**Loops** connect a vertex to i tself.



Multiple edges between same vertices.

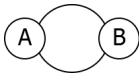


# Loops and Multiple Edges

**Loops** connect a vertex to i tself.



Multiple edges between same vertices.



if a graph has neither, it i s **simple**.



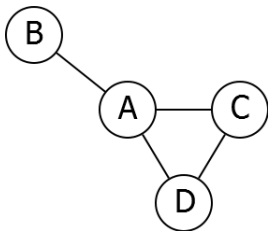
# Representing Graphs

To compute things about graphs we first need to **represent** them.

There are many ways to do this.

# Edge List

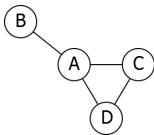
List of all edges:



Edges:  $(A, B)$ ,  $(A, C)$ ,  $(A, D)$ ,  $(C, D)$

# Adjacency Matrix

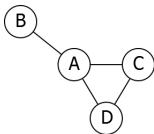
Matrix. Entries 1 if there is an edge, 0 if there is not.



	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>
<i>A</i>	0	1	1	1
<i>B</i>	1	0	0	0
<i>C</i>	1	0	0	1
<i>D</i>	1	0	1	0

# Adjacency List

For each vertex, a list of adjacent vertices.



*A* adjacent to *B*, *C*, *D*

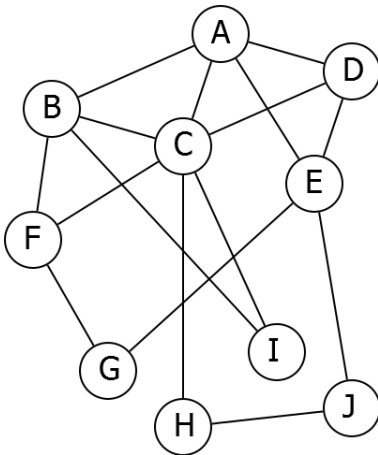
*B* adjacent to *A*

*C* adjacent to *A*, *D*

*D* adjacent to *A*, *C*

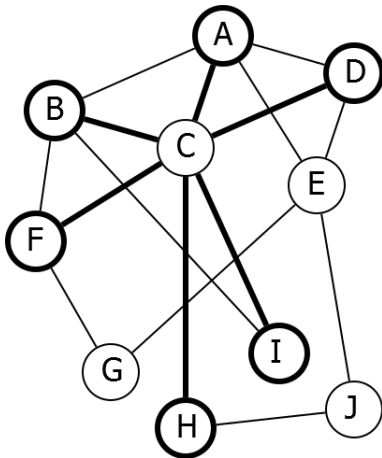
# Problem

What are the neighbors of **C**?



# Solution

*A,B,D,F,H,I.*

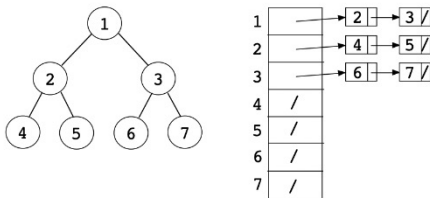


# Question

Give an adjacency-list representation for a complete binary tree on 7 vertices. Give an equivalent adjacency-matrix representation. Assume that vertices are numbered from 1 to 7 as in a binary heap. (Edges are directed from parent to child)

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Adjacency Matrix:

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



# Algorithm Runtimes

Graph algorithm runtimes depend on  $|V|$  and  $|E|$ .

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For example,  $O(|V| + |E|)$  (linear time),

$O(|V||E|)$ ,  $O(|V|^{3/2})$ ,

$O(|V| \log(|V|) + |E|)$ .

# Density

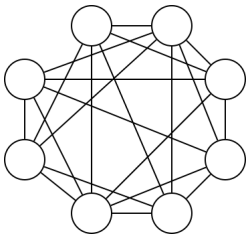
Which is faster,  $O(|V|^{3/2})$  or  $O(|E|)$ ?

# Density

Which is faster,  $O(|V|^{3/2})$  or  $O(|E|)$ ?  
Depends on graph! Depends on the **density**,  
namely how many edges you have in terms  
of the number of vertices.

# Dense Graphs

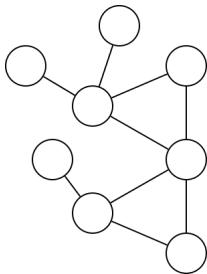
in **dense** graphs,  $|E| \approx |V|^2$ .



A large fraction of pairs of vertices are connected by edges.

# Sparse Graphs

in **sparse** graphs,  $|E| \approx |V|$ .



Each vertex has only a few edges.

# Graph Traversal

## Depth First Search (DFS)

A standard DFS implementation puts each vertex of the graph into one of two categories:

- Visited
- Not Visited

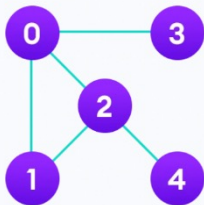
The purpose of the algorithm is to mark each vertex as visited while avoiding cycles.

The DFS algorithm works as follows:

1. Start by putting any one of the graph's vertices on top of a stack.
2. Take the top item of the stack and add it to the visited list.
3. Create a list of that vertex's adjacent nodes. Add the ones which aren't in the visited list to the top of the stack.
4. Keep repeating steps 2 and 3 until the stack is empty.

# Example

Let's see how the Depth First Search algorithm works with an example. We use an undirected graph with 5 vertices.



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**Visited**

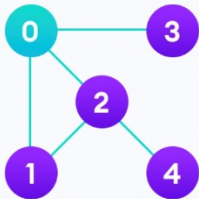
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**Stack**



# Example

We start from vertex 0, the DFS algorithm starts by putting it in the Visited list and putting all its adjacent vertices in the stack.



0				
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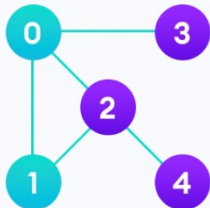
**Visited**

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

**Stack**

# Example

Next, we visit the element at the top of stack i.e. 1 and go to its adjacent nodes. Since 0 has already been visited, we visit 2 instead.



0	1			
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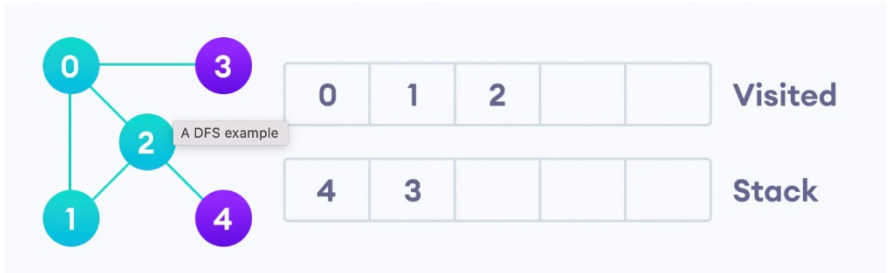
Visited

2	3			
---	---	--	--	--

Stack

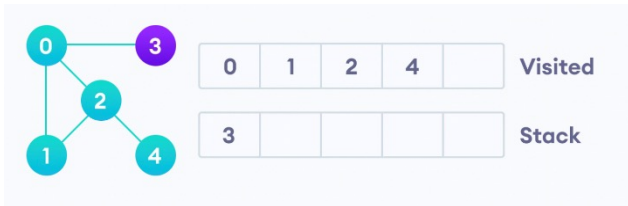
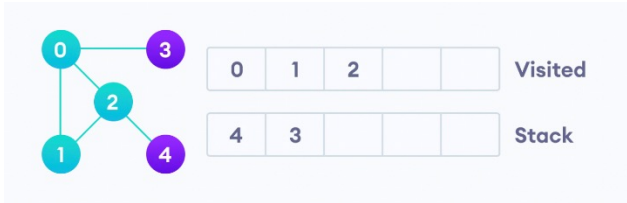
# Example

Vertex 2 has an unvisited adjacent vertex in 4, so we add that to the top of the stack and visit it.



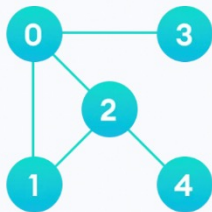
# Example

Vertex 2 has an unvisited adjacent vertex in 4, so we add that to the top of the stack and visit it.



## Example

After we visit the last element 3, it doesn't have any unvisited adjacent nodes, so we have completed the Depth First Traversal of the graph.



0	1	2	4	3
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**Visited**

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**Stack**

# Complexity of Depth First Search

The time complexity of the DFS algorithm is represented in the form of  $O(V + E)$ , where  $V$  is the number of nodes and  $E$  is the number of edges.

The space complexity of the algorithm is  $O(V)$ .

# Question

Give the visited node order for Depth First Search(DFS), starting with s, given the following adjacency lists and accompanying figure:

$$\text{adj}(s) = [a, c, d],$$

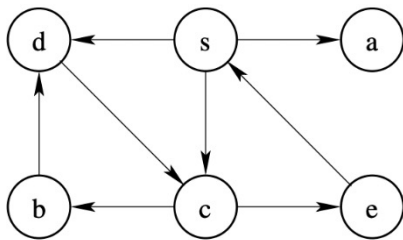
$$\text{adj}(a) = [],$$

$$\text{adj}(c) = [e, b],$$

$$\text{adj}(b) = [d],$$

$$\text{adj}(d) = [c],$$

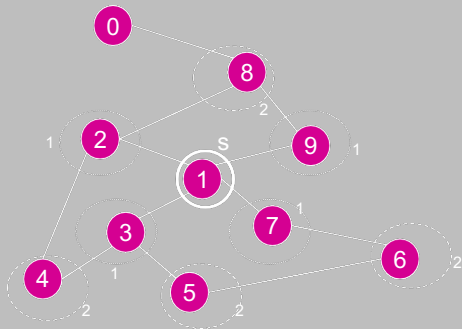
$$\text{adj}(e) = [s].$$



(b) Depth First Search Solution: s a c e b d (not unique!)

# BFS and Shortest Path Problem

- Given any source vertex  $s$ , BFS visits the other vertices at **increasing distances** away from  $s$ . In doing so, BFS discovers paths from  $s$  to other vertices
- What do we mean by “**distance**”? The **number of edges on a path from  $s$**



Example

Consider  $s$ =vertex 1

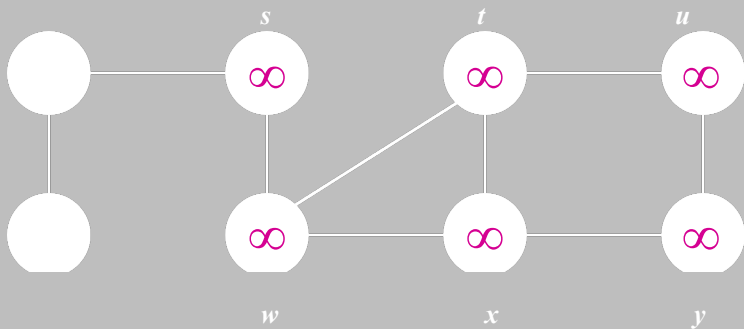
Nodes at distance 1?  
2, 3, 7, 9

Nodes at distance 2?  
8, 6, 5, 4

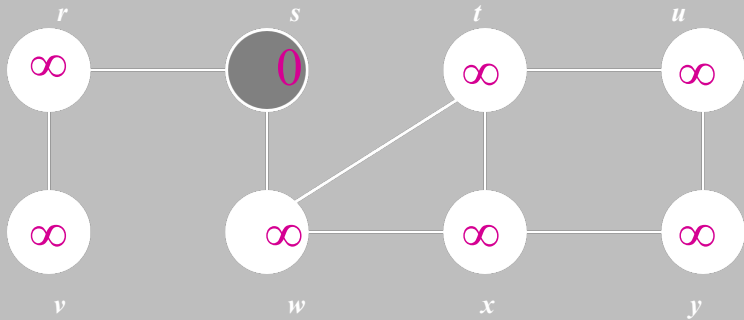
Nodes at distance 3?  
0



# Breadth-First Search: Example

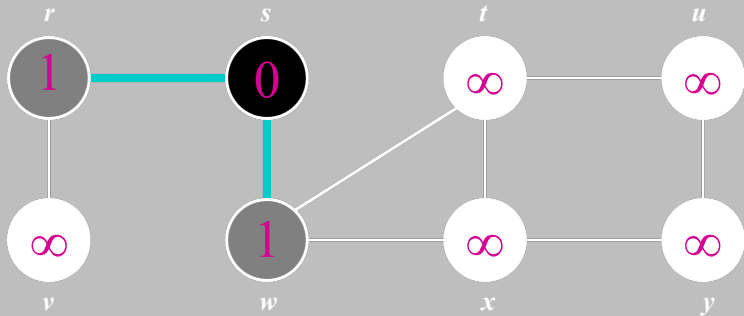


# Breadth-First Search: Example



$S$

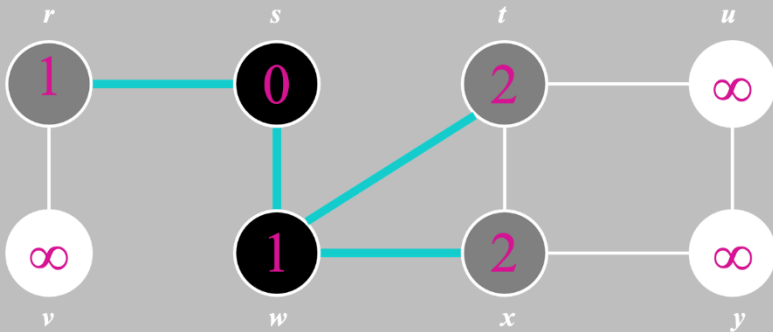
# Breadth-First Search: Example



$Q$ : 

$w$	$r$
-----	-----

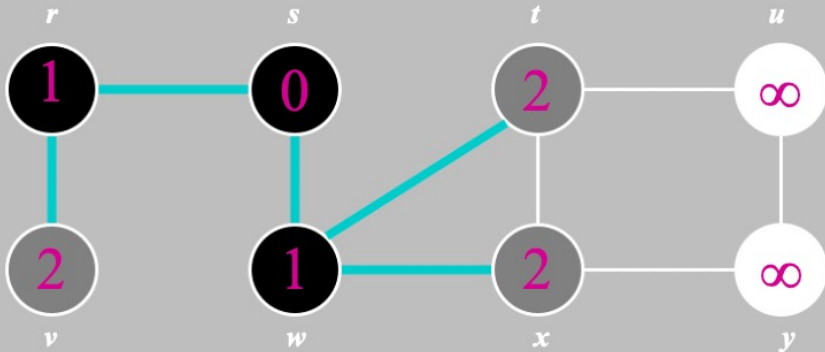
# Breadth-First Search: Example



$Q$ : 

$r$	$t$	$x$
-----	-----	-----

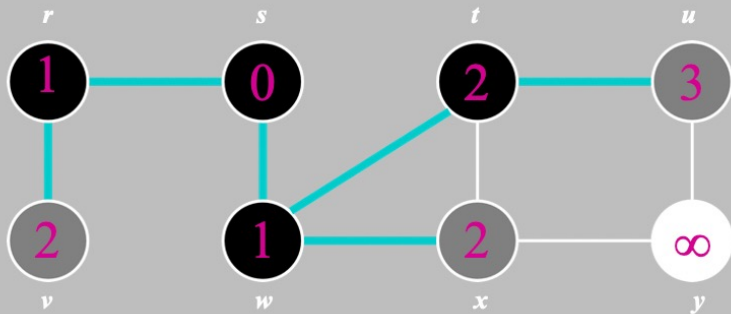
# Breadth-First Search: Example



$Q$ : 

$t$	$x$	$v$
-----	-----	-----

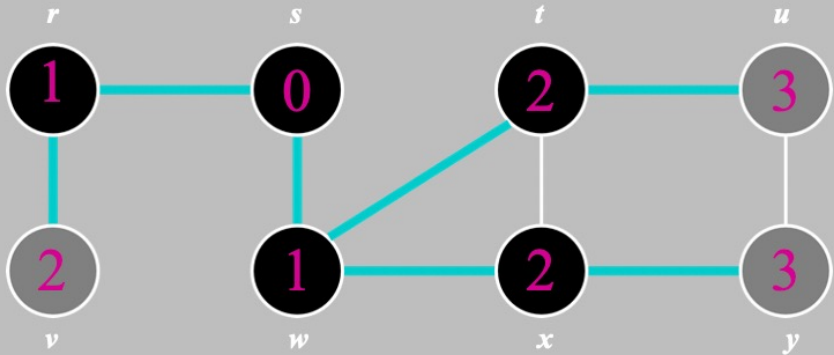
# Breadth-First Search: Example



$Q$ : 

$x$	$v$	$u$
-----	-----	-----

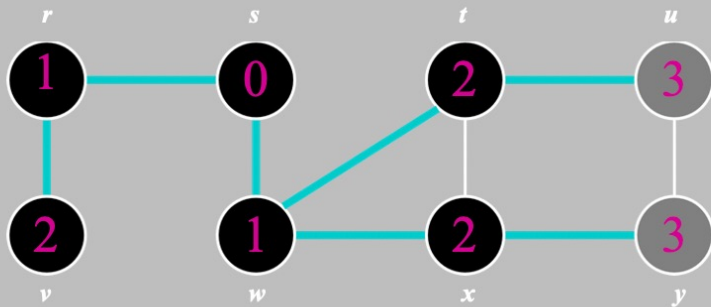
# Breadth-First Search: Example



$Q$ : 

$v$	$u$	$y$
-----	-----	-----

# Breadth-First Search: Example

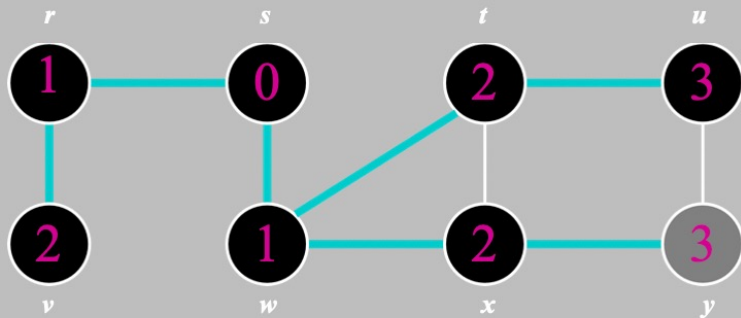


$Q$ : 

$u$	$y$
-----	-----

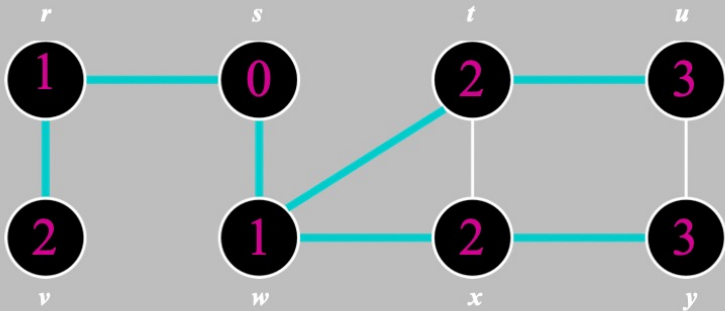


# Breadth-First Search: Example



$Q$ :  $y$

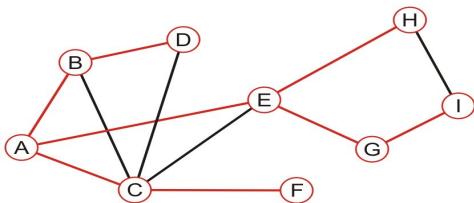
# Breadth-First Search: Example



$Q: \emptyset$

# Question

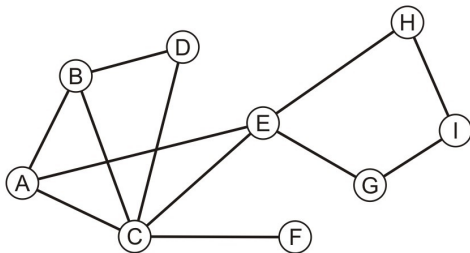
Give the visited node order for Breadth First Search(BFS), starting with A, given the accompanying figure:



(a) Breadth First Search Solution: A, B, C, E, D, F, G, H, I

# Solution

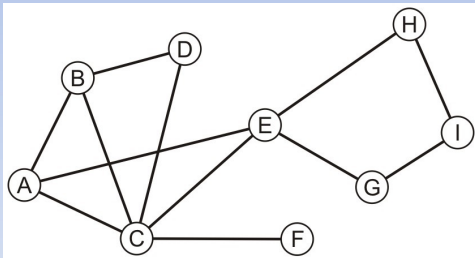
Consider this graph



# Solution

Performing a breadth-first traversal

- Push the first vertex onto the queue

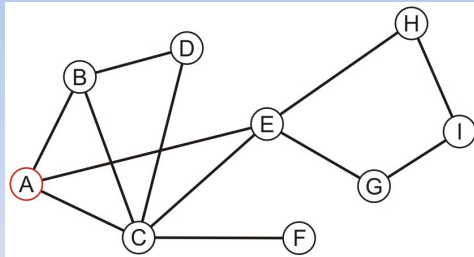


# Solution

Performing a breadth-first traversal

- Pop A and push B, C and E

A



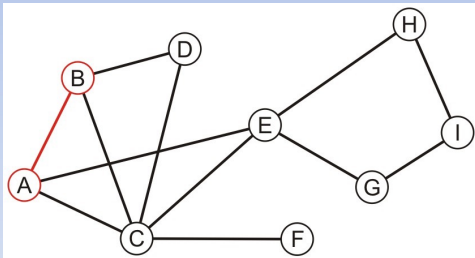
B	C	E			
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# Solution

Performing a breadth-first traversal:

- Pop B and push D

A, B



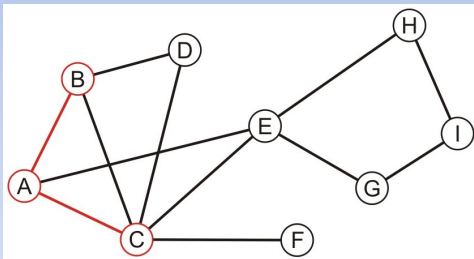
C	E	D			
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# Solution

Performing a breadth-first traversal:

- Pop C and push F

A, B, C



E	D	F			
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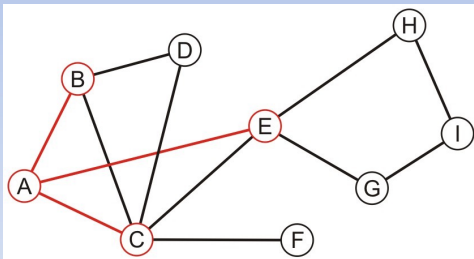


# Solution

Performing a breadth-first traversal:

- Pop E and push G and H

A, B, C, E



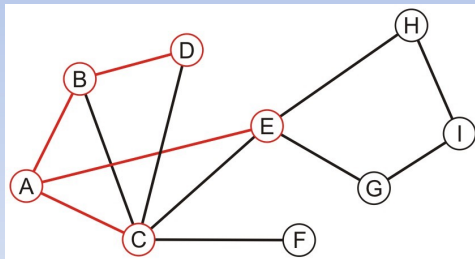
D	F	G	H		
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# Solution

Performing a breadth-first traversal:

- Pop D

A, B, C, E, D



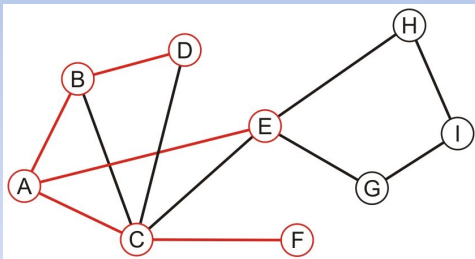
F	G	H			
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# Solution

Performing a breadth-first traversal:

- Pop F

A, B, C, E, D, F



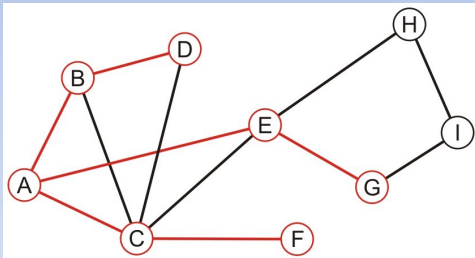
G	H				
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# Solution

Performing a breadth-first traversal:

- Pop G and push I

A, B, C, E, D, F, G



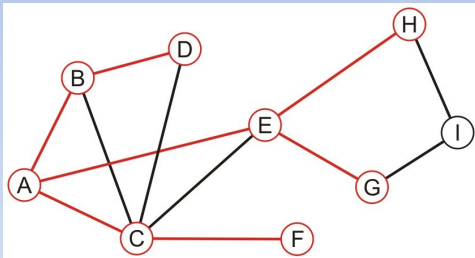
H	I				
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# Solution

Performing a breadth-first traversal:

- Pop H

A, B, C, E, D, F, G, H

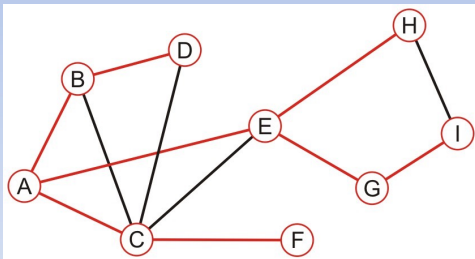


# Solution

Performing a breadth-first traversal:

- Pop I

A, B, C, E, D, F, G, H, I

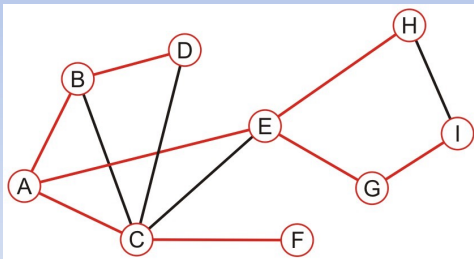


# Solution

Performing a breadth-first traversal:

- The queue is empty: we are finished

A, B, C, E, D, F, G, H, I



# Question

Give the visited node order for Breadth First Search(BFS), starting with s, given the following adjacency lists and accompanying figure:

$$\text{adj}(s) = [a, c, d],$$

$$\text{adj}(a) = [],$$

$$\text{adj}(c) = [e, b],$$

$$\text{adj}(b) = [d],$$

$$\text{adj}(d) = [c],$$

$$\text{adj}(e) = [s].$$

