

# ADT for Quick Search Tree data structure

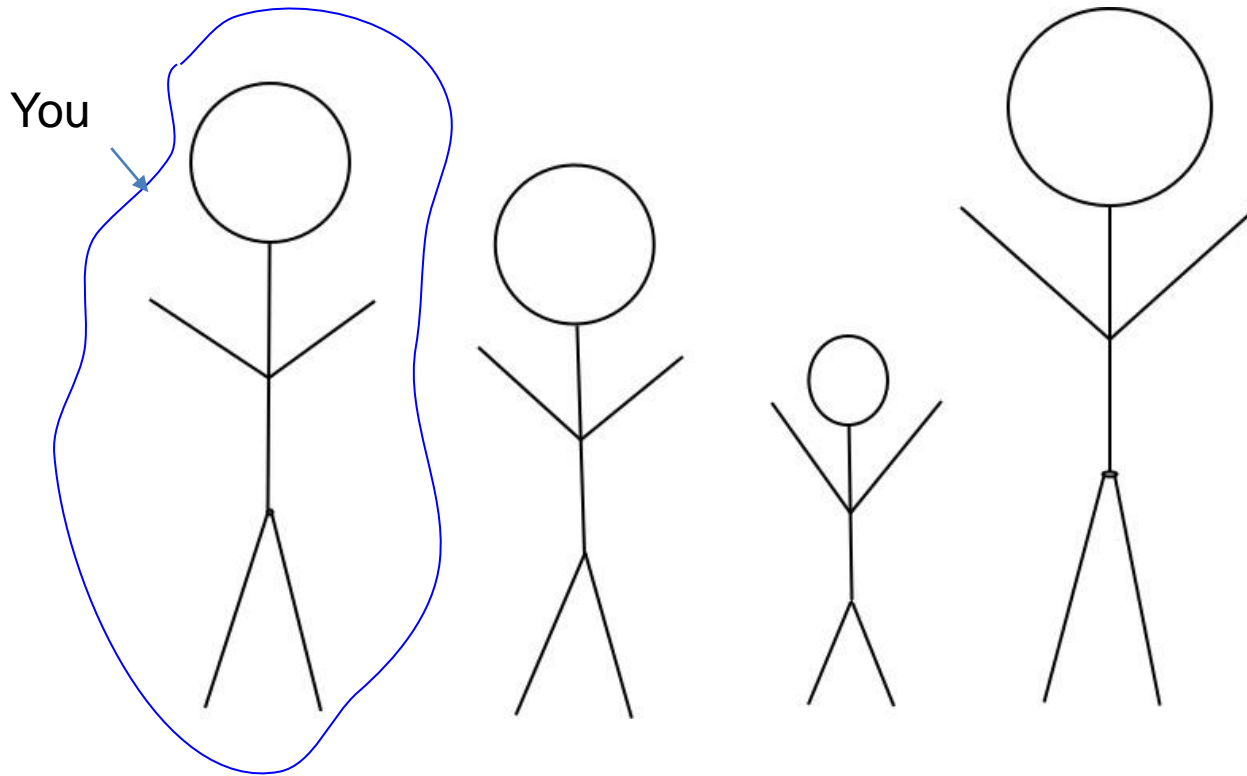
Lecture 17

*by Marina Barsky*








# Motivation 2: Closest Height

Find people in your class whose height is closest to yours.



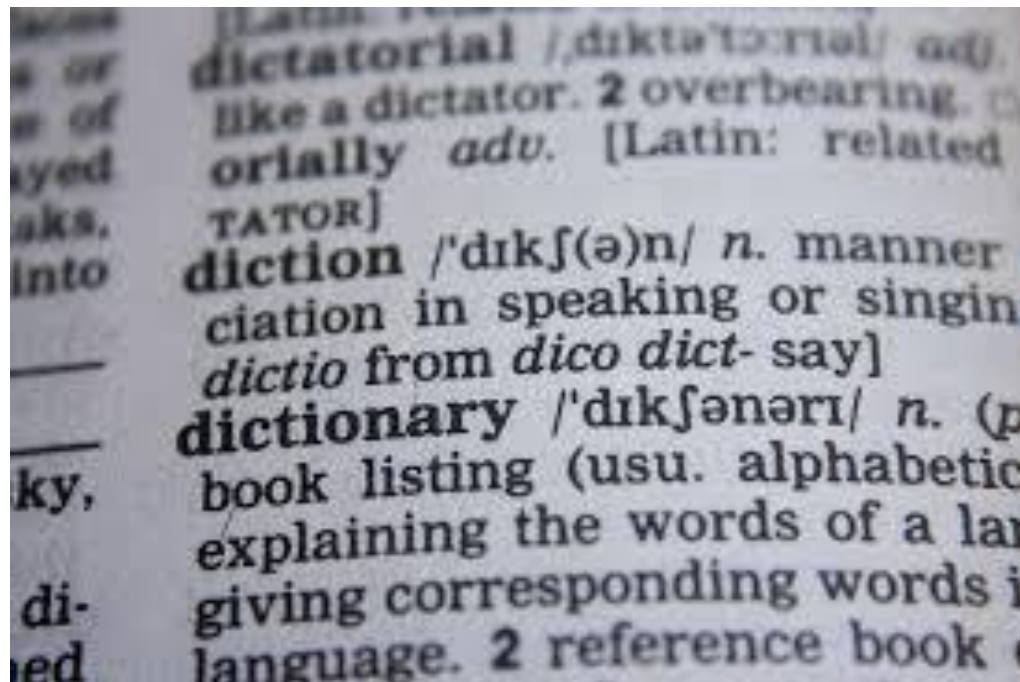
# Motivation 3: Date Ranges

Find all emails received in a given period

Inbox					
FROM	KNOW	TO	SUBJECT	SENT TIME	
"lawiki.i2p admin" <J5uF>		<b>Bote User &lt;uhOd&gt;</b>	<b>hi</b>	<b>Unknown</b>	
<i>anonymous</i>		Bote User <uhOd>	Sanders 2016	Aug 30, 2015 3:27 PM	
<i>anonymous</i>		Bote User <uhOd>	I2PCon 2016	Aug 30, 2015 3:25 PM	
<b>Anon Developer &lt;gvbM&gt;</b>		<b>Bote User &lt;uhOd&gt;</b>	<b>Re: Bote changess</b>	<b>Aug 30, 2015 2:54 PM</b>	
<b>I2P User &lt;uUUx&gt;</b>		<b>Bote User &lt;uhOd&gt;</b>	<b>Hello World!</b>	<b>Aug 30, 2015 2:51 PM</b>	

# Motivation 4: Partial Search

Find all words that **start with** some given *prefix*



## Specification

A **Quick Search ADT** stores a number of elements each with a *key* and supports the following operations:

- ***Search(x)***: returns the element with the key= $x$
- ***Range(lo, hi)***: returns all elements with keys between  $lo$  and  $hi$
- ***NearestNeighbor(x)***: returns *an element* with the key closest to  $x$

1	4	6	7	10	13	15
---	---	---	---	----	----	----

*Search(7)*

1	4	6	7	10	13	15
---	---	---	---	----	----	----

*Range(5, 13)*

1	4	6	7	10	13	15
---	---	---	---	----	----	----

*NearestNeighbor(5)*

1	4	6	7	10	13	15
---	---	---	---	----	----	----

# Sorted keys

1	4	6	7	10	13	15
---	---	---	---	----	----	----

- It seems that the best idea is to store the elements **sorted** by keys



# How to make this dynamic?

- Store keys in **sorted order**
- But we also want to be able to add/remove keys efficiently

# Quick Search ADT

## Full Specification

A **Quick Search ADT** stores a number of elements each with a *key* and supports the following operations:

- ***Search*( $x$ )**: returns the element with the key= $x$
- ***Range*( $lo$ ,  $hi$ )**: returns all elements with keys between  $lo$  and  $hi$
- ***NearestNeighbor*( $x$ )**: returns an element with the key closest to  $x$
- ***Insert*( $x$ )**: adds an element with key  $x$
- ***Remove*( $x$ )**: removes the element with key  $x$

# Example

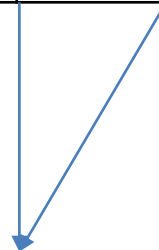
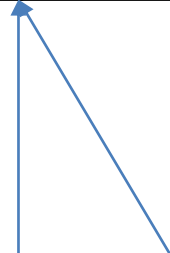
1	4	6	7	10	13	15
---	---	---	---	----	----	----

*Insert (3)*

1	3	4	6	7	10	13	15
---	---	---	---	---	----	----	----

*Remove (10)*

1	3	4	6	7	13	15
---	---	---	---	---	----	----



# Possible Implementations

1	4	6	7	10	13	15
---	---	---	---	----	----	----

Let's try known data structures:

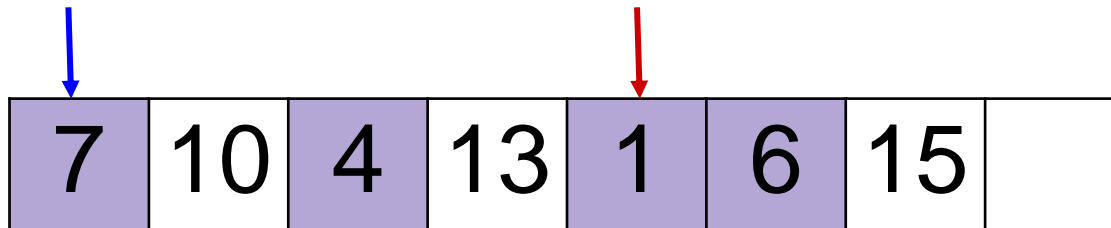
- Array
- Sorted array
- Linked list

# Array

→ Range Search:

$O(n)$  ✗

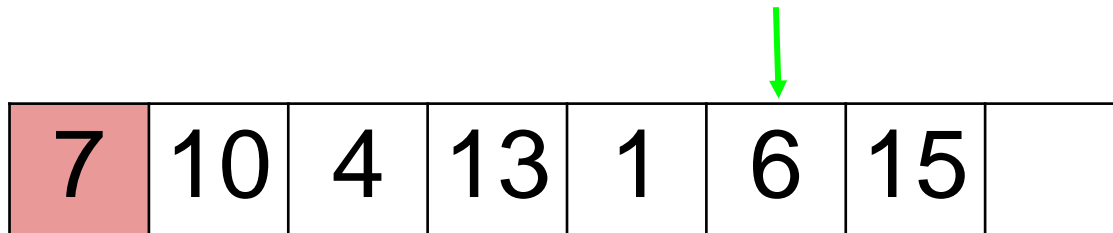
range(1,7)



# Array

- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗

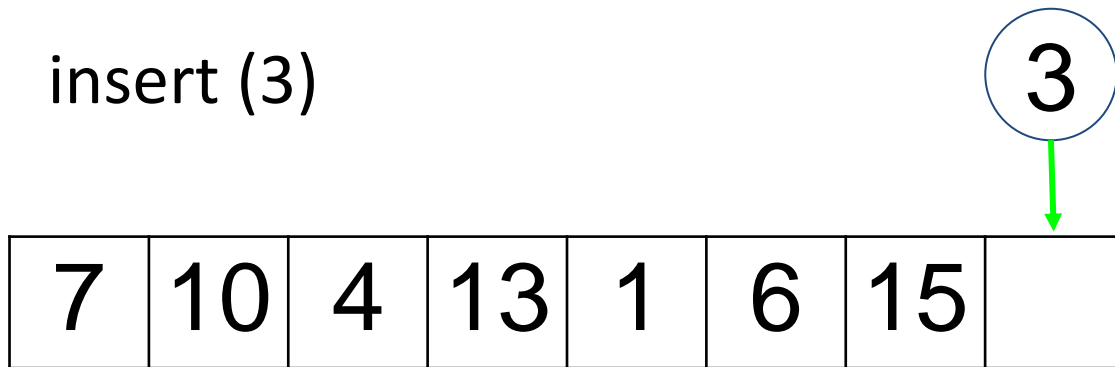
nearestNeighbor(6)



# Array

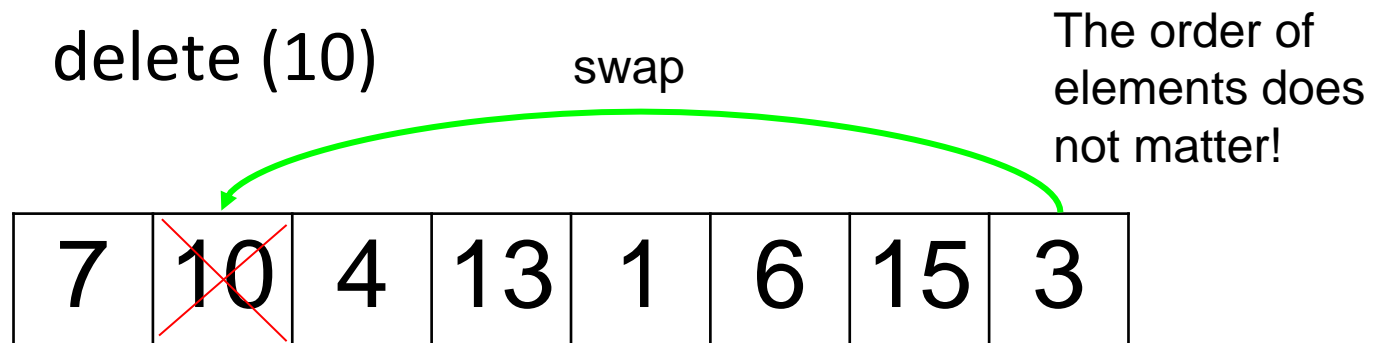
- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗
- Insert:  $O(1)$  ✓

insert (3)



# Array

- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗
- Insert:  $O(1)$  ✓
- Remove:  $O(1)^*$  ✓

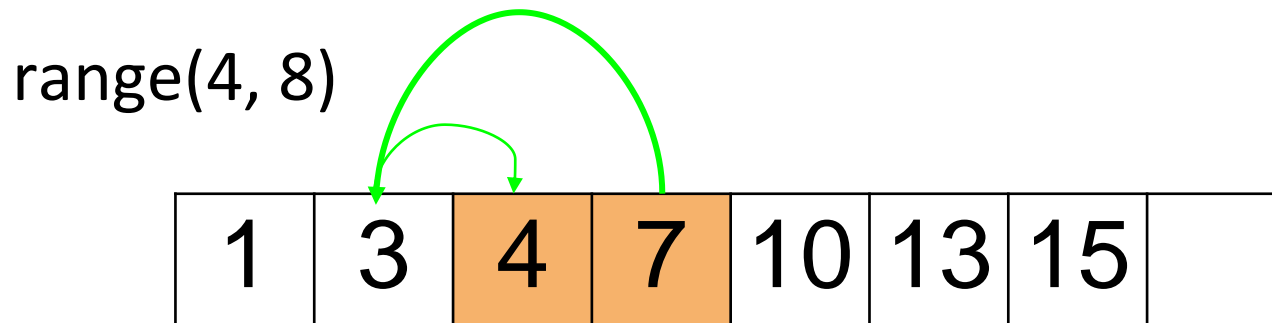


After locating an index of the element to be removed



# Sorted Array

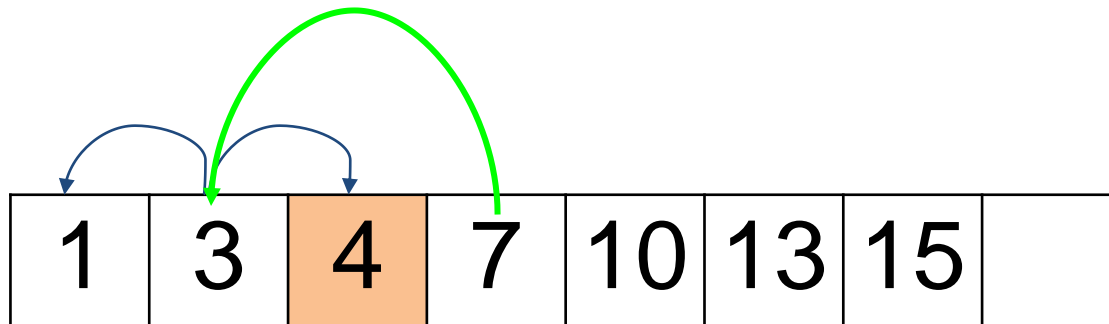
→ Range Search:  $O(\log(n))$  ✓



# Sorted Array

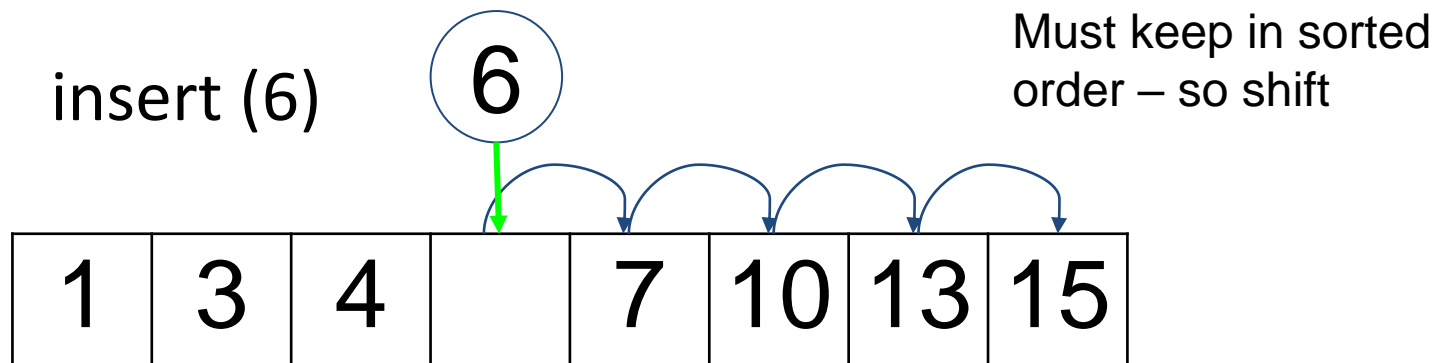
- Range Search:  $O(\log(n))$  ✓
- Nearest Neighbor:  $O(\log(n))$  ✓

nearestNeighbor(3)



# Sorted Array

- Range Search:  $O(\log(n))$  ✓
- Nearest Neighbor:  $O(\log(n))$  ✓
- Insert:  $O(n)$  ✗

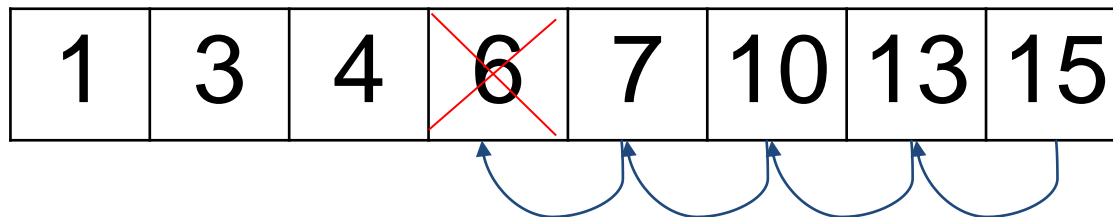


# Sorted Array

- Range Search:  $O(\log(n))$  ✓
- Nearest Neighbor:  $O(\log(n))$  ✓
- Insert:  $O(n)$  ✗
- Remove:  $O(n)$  ✗

delete (6)

Cannot have gaps  
– shift again



# Linked List

→ Range Search:

$O(n)$  ✗

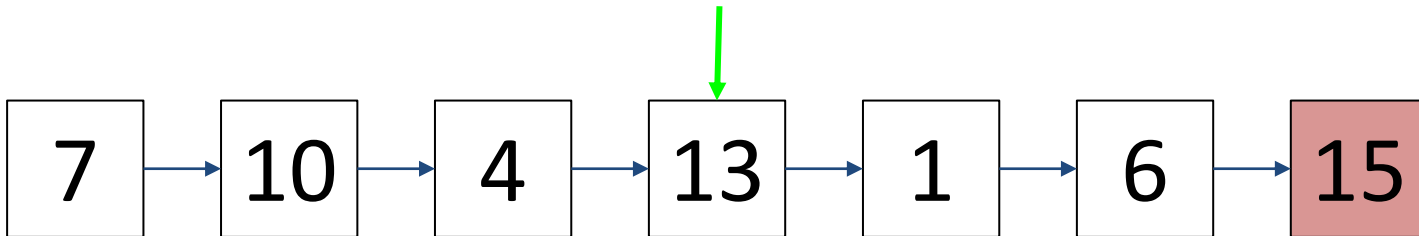
range (4, 9)



# Linked List

- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗

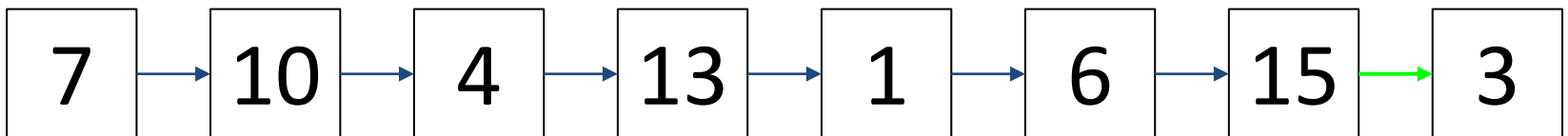
nearestNeighbor(13)



# Linked List

- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗
- Insert:  $O(1)$  ✓

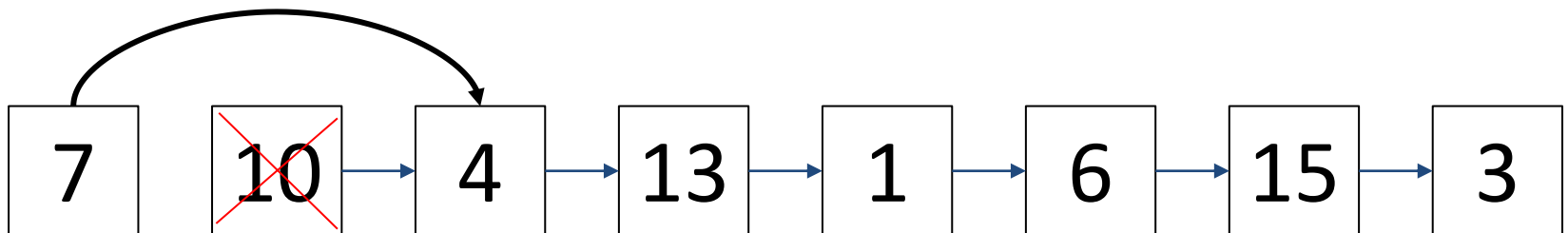
insert (3)



# Linked List

- Range Search:  $O(n)$  ✗
- Nearest Neighbor:  $O(n)$  ✗
- Insert:  $O(1)$  ✓
- Remove:  $O(1)^*$  ✓

delete (10)



\*after locating the node with the element to be removed

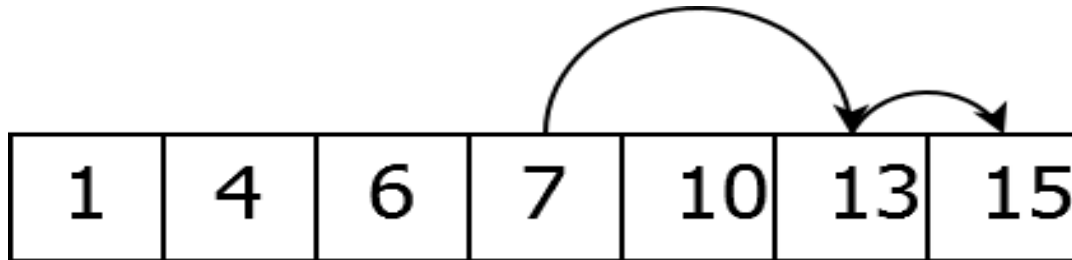
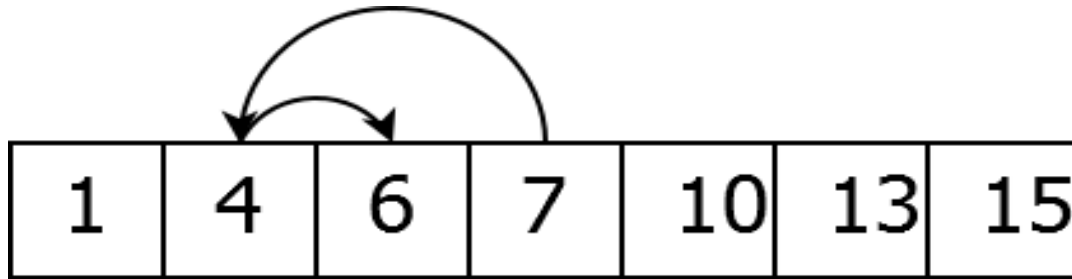


# Nothing works!

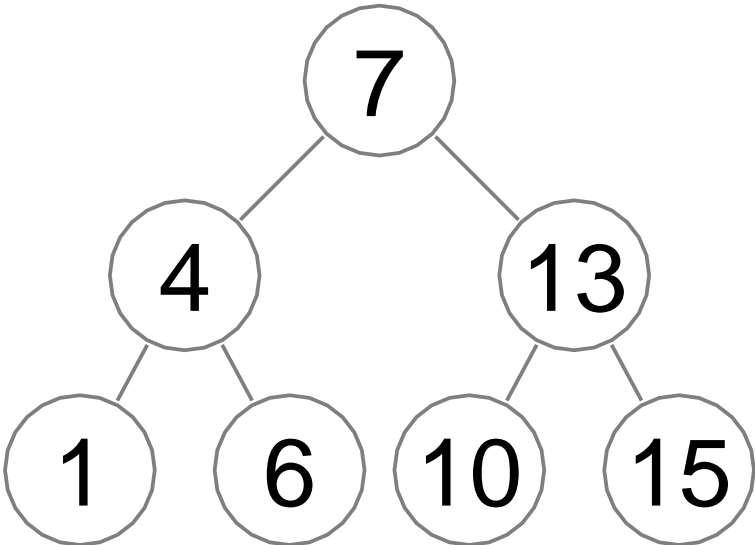
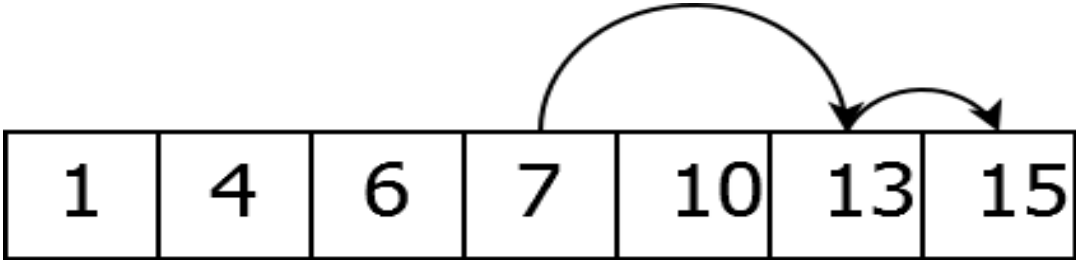
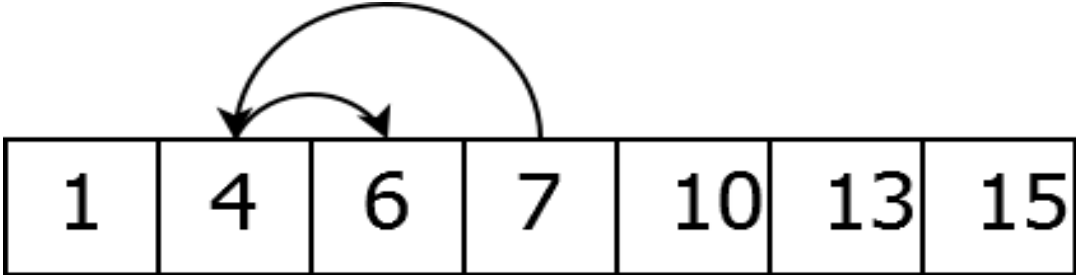
- We want an efficient data structure for fast **search and update** operations
- None of the known data structures work
- Sorted arrays are good for search but not for update

**We need something new...**

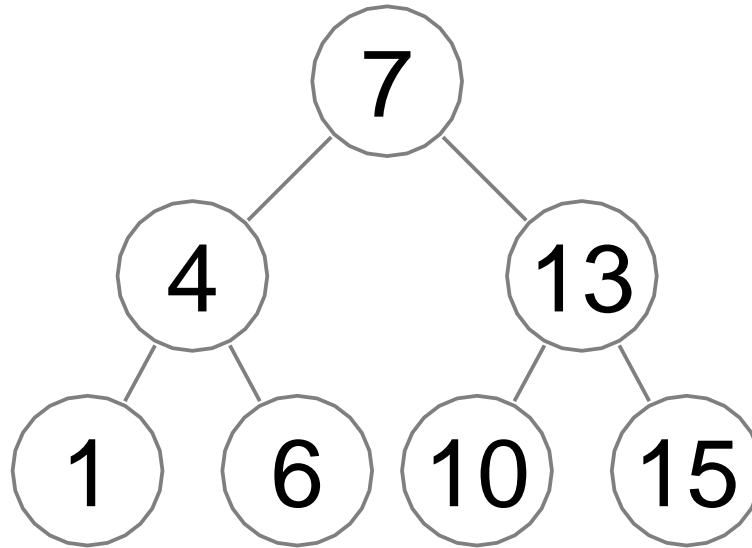
# Recall: Binary Search



# What if we record search questions...



# We will get a tree



Binary Search Tree

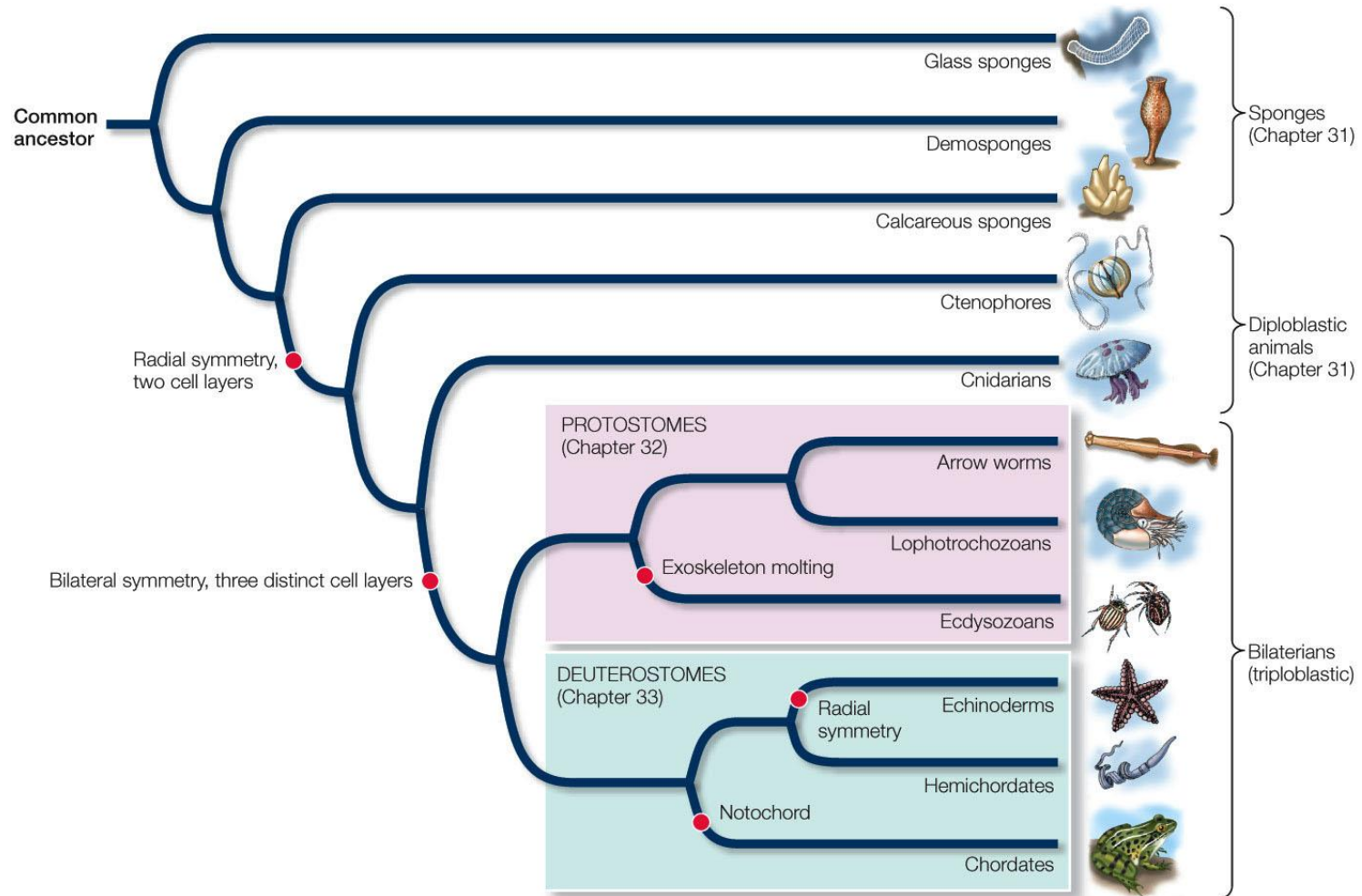
# New Data Structure: *Tree*



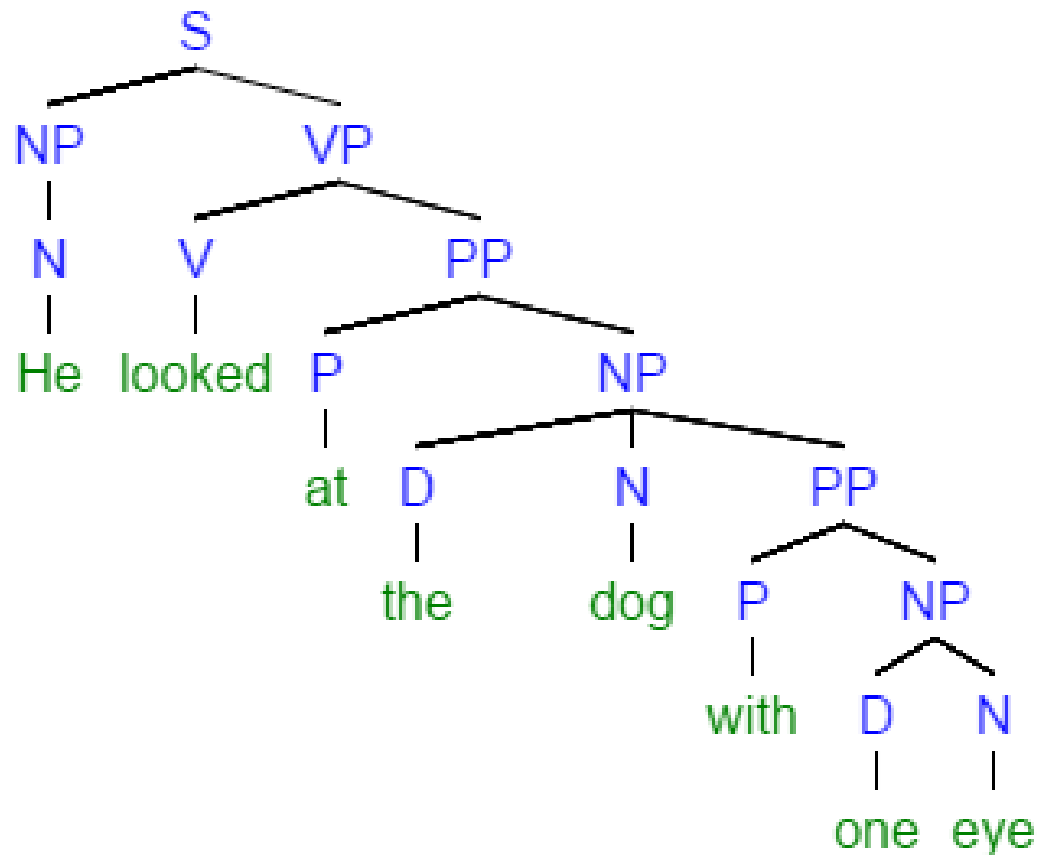
Natalie Jeremijenko, *Tree Logic*,  
Massachusetts Museum of Contemporary Art  
(MASS MoCA), 1999

# Biology:

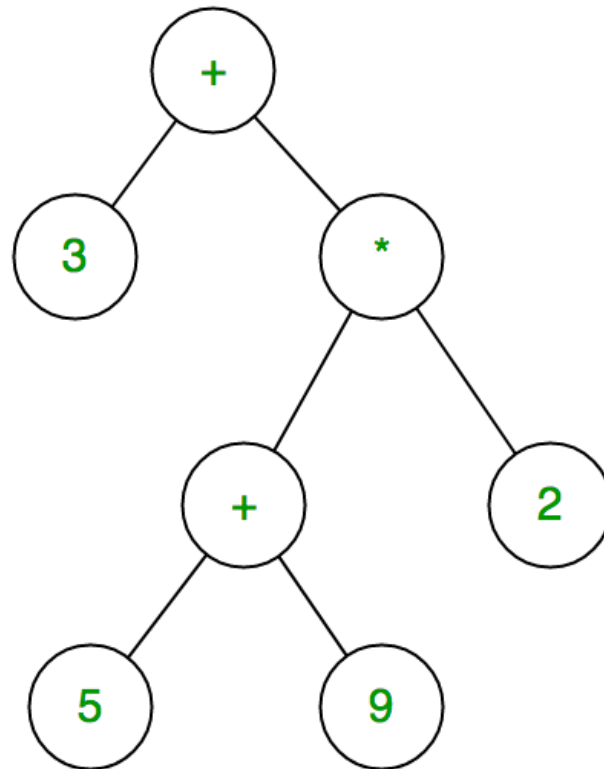
## Phylogenetic Tree of animals



# Natural Language Processing: Syntax Tree



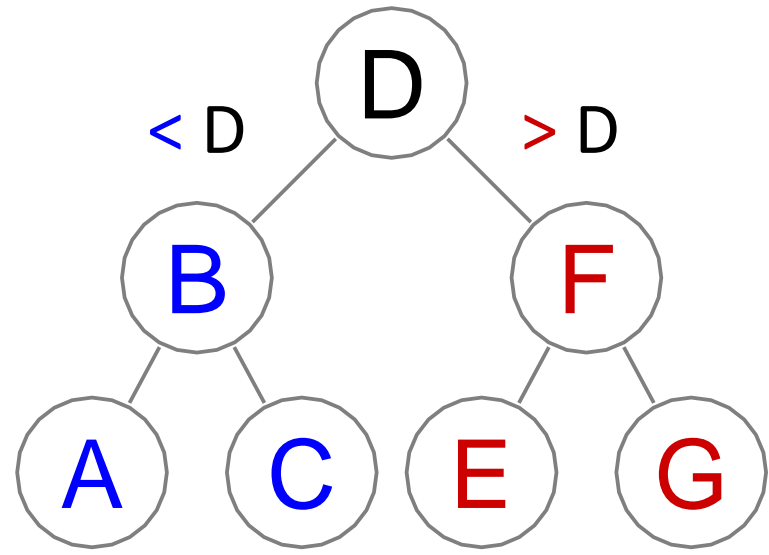
# Computer programs: Expression Tree



$$3 + ((5 + 9) * 2)$$

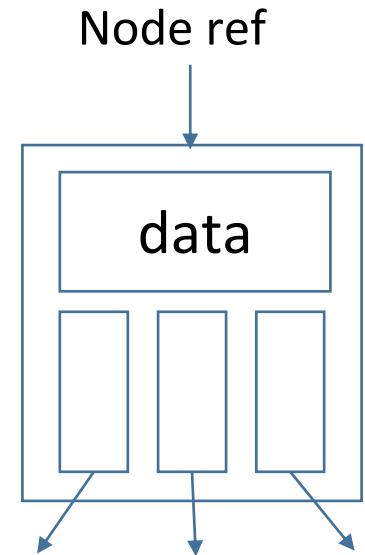


# Quick Search: Binary Search Tree



# Tree - new recursive data structure

- Main element of the tree: *node*
- Each node contains data and an **array** of links to the child nodes



```
class TreeNode {  
    int data;  
    TreeNode [] children;  
    [TreeNode parent;]  
}
```

```
class TreeNode:  
    def __init__(self, data):  
        self.data = data  
        self.children = []  
        [self.parent = None]
```

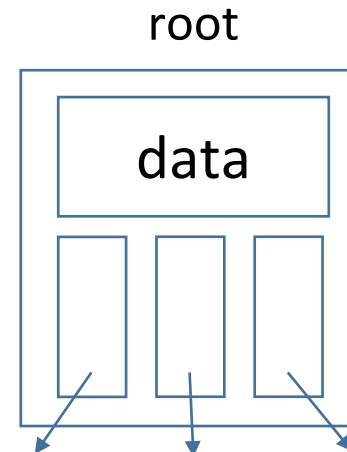
# Tree is defined by a single reference variable *root*

*Tree* is either

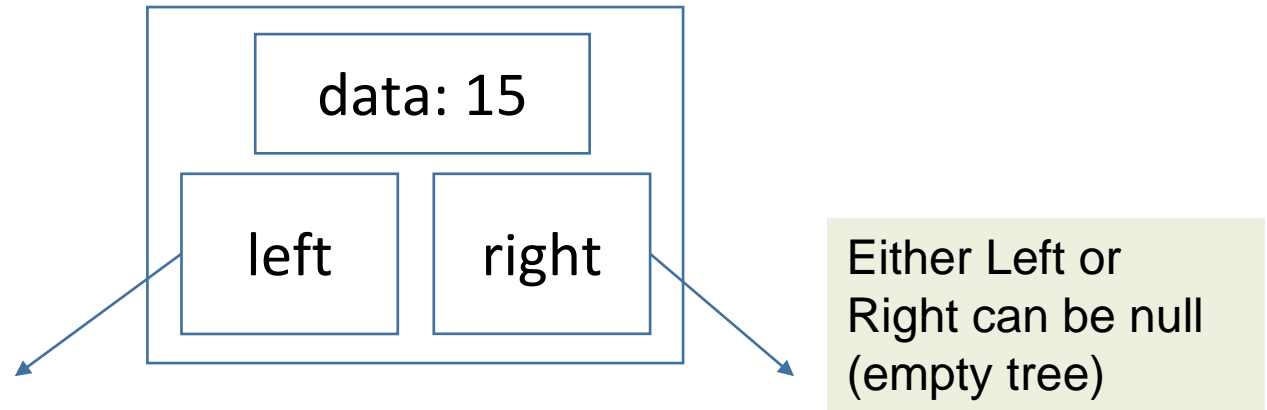
- Null (empty tree)
- Root node which contains data and links to child nodes



OR

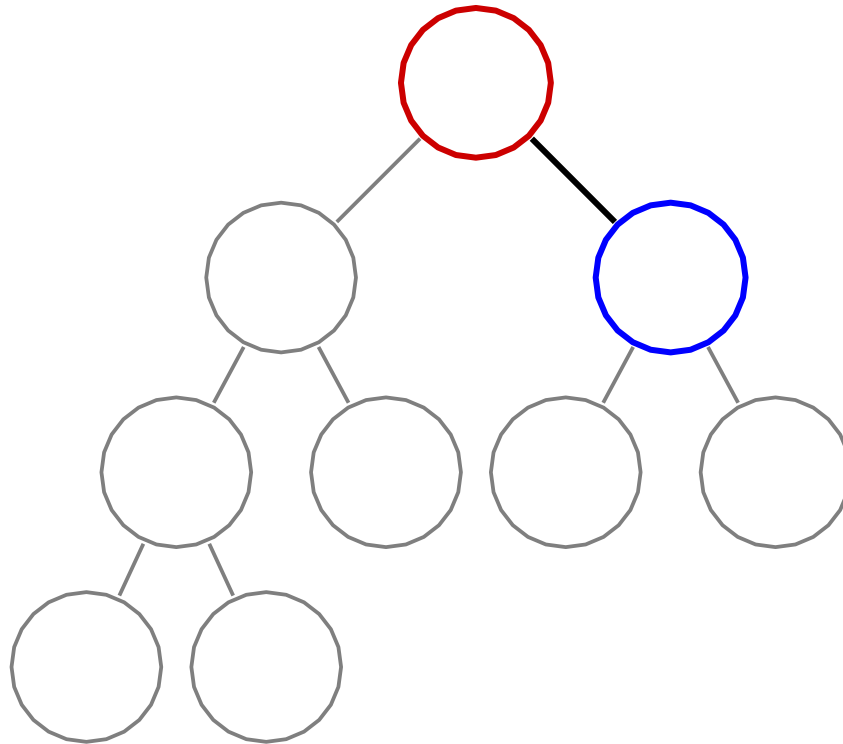


# Binary tree: each node has 2 children

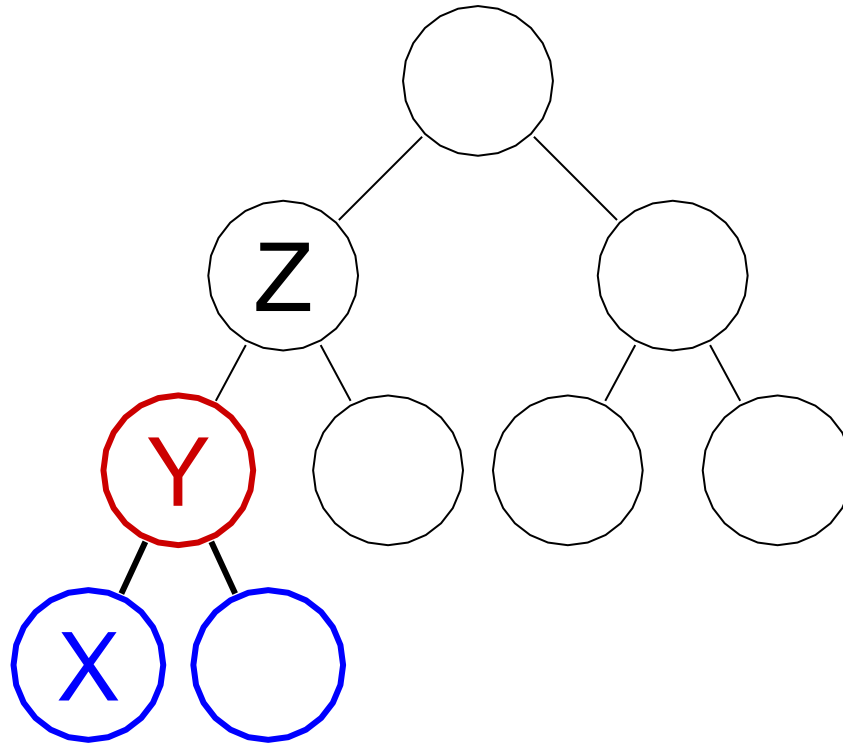


```
class Node {  
    int data;  
    Node left;  
    Node right;  
    [Node parent;]  
}
```

# Tree terminology: **parent** and **child**

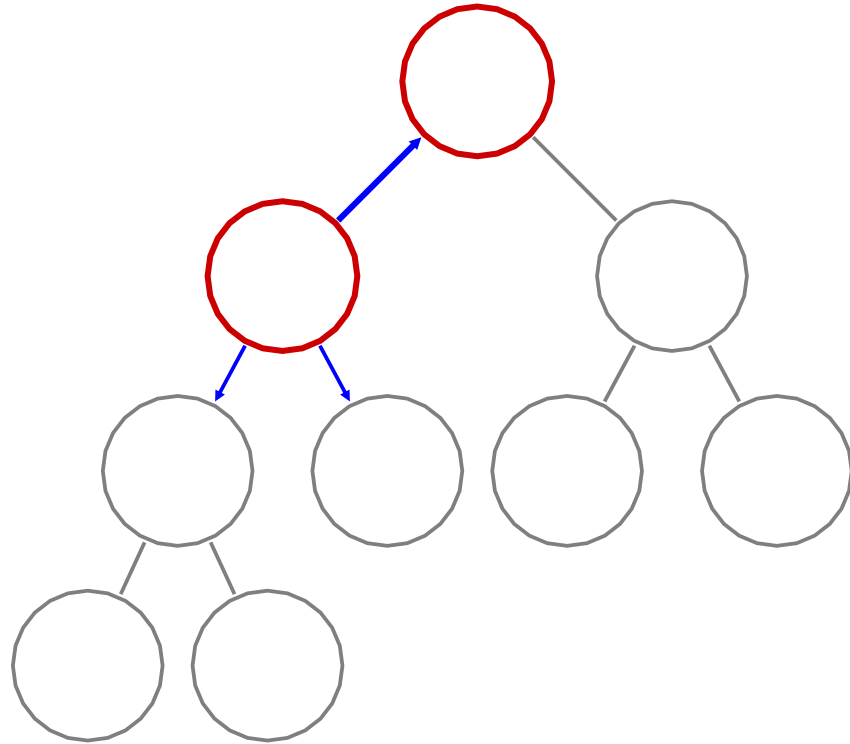


# Tree terminology: **parent** and **child**



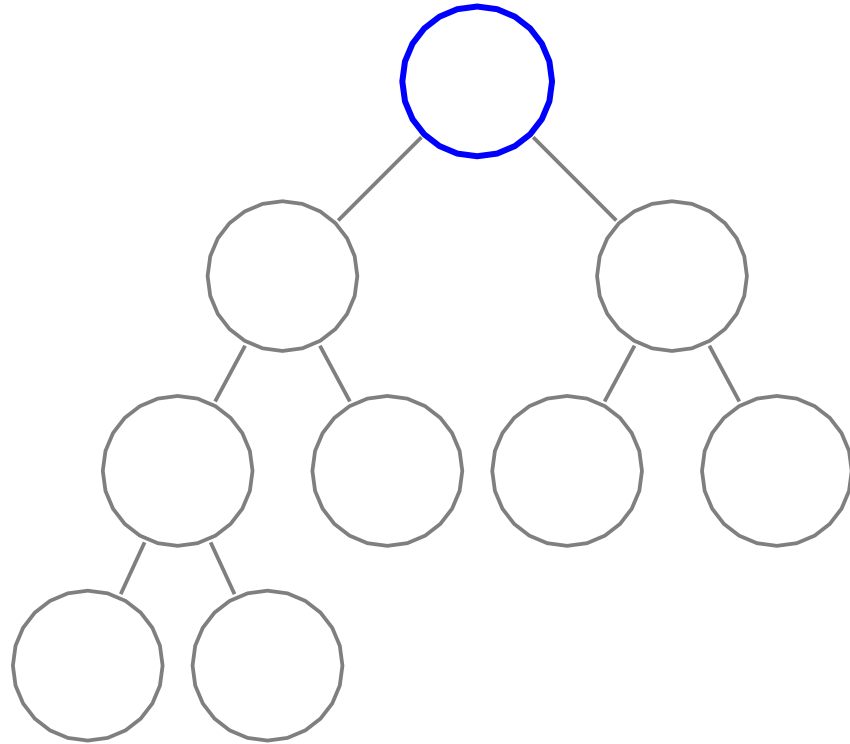
*Have direct relationship*

# Tree terminology: **node** and **edge**



***An edge connects nodes:  
parent-child or child-parent relationships***

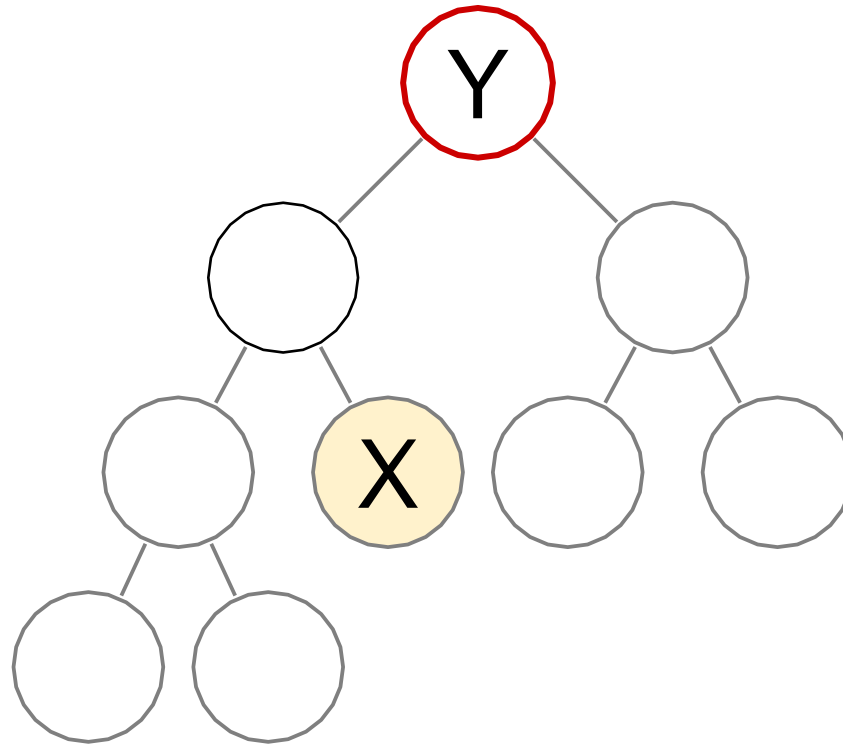
# Tree terminology: **root**



***The parent of all nodes, the starting point***

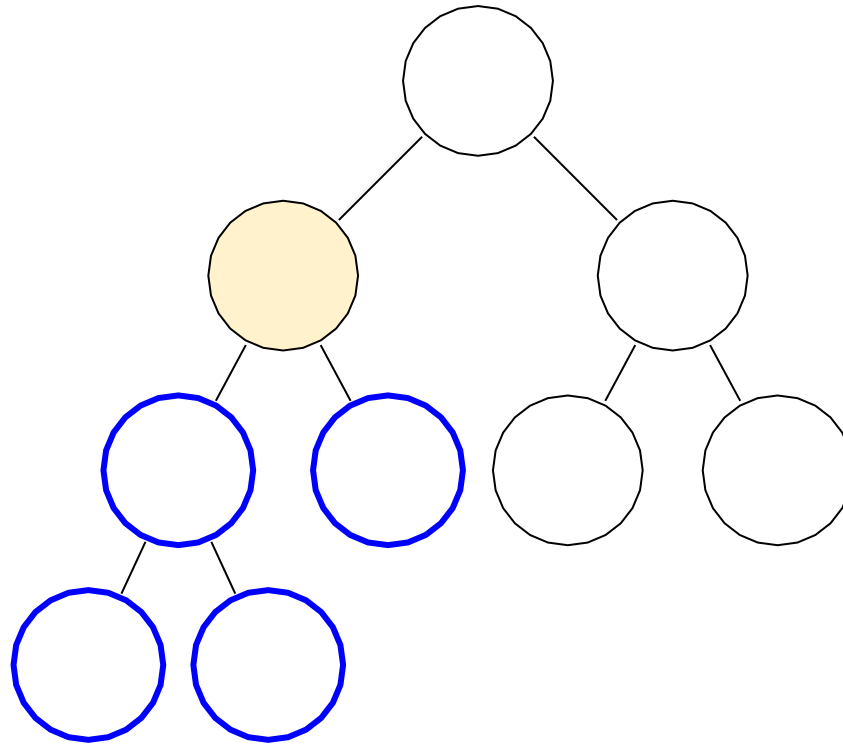


# Tree terminology: ancestor and descendant



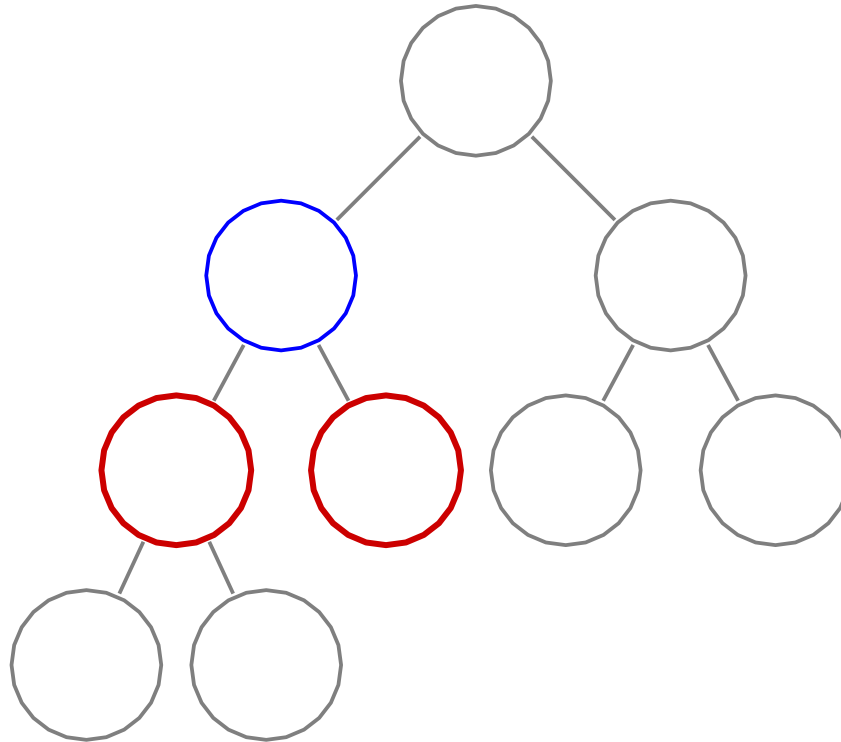
**Ancestor: parent, or parent of parent, etc.**

# Tree terminology: ancestor and descendant



**Descendant: child, or child of child, etc.**

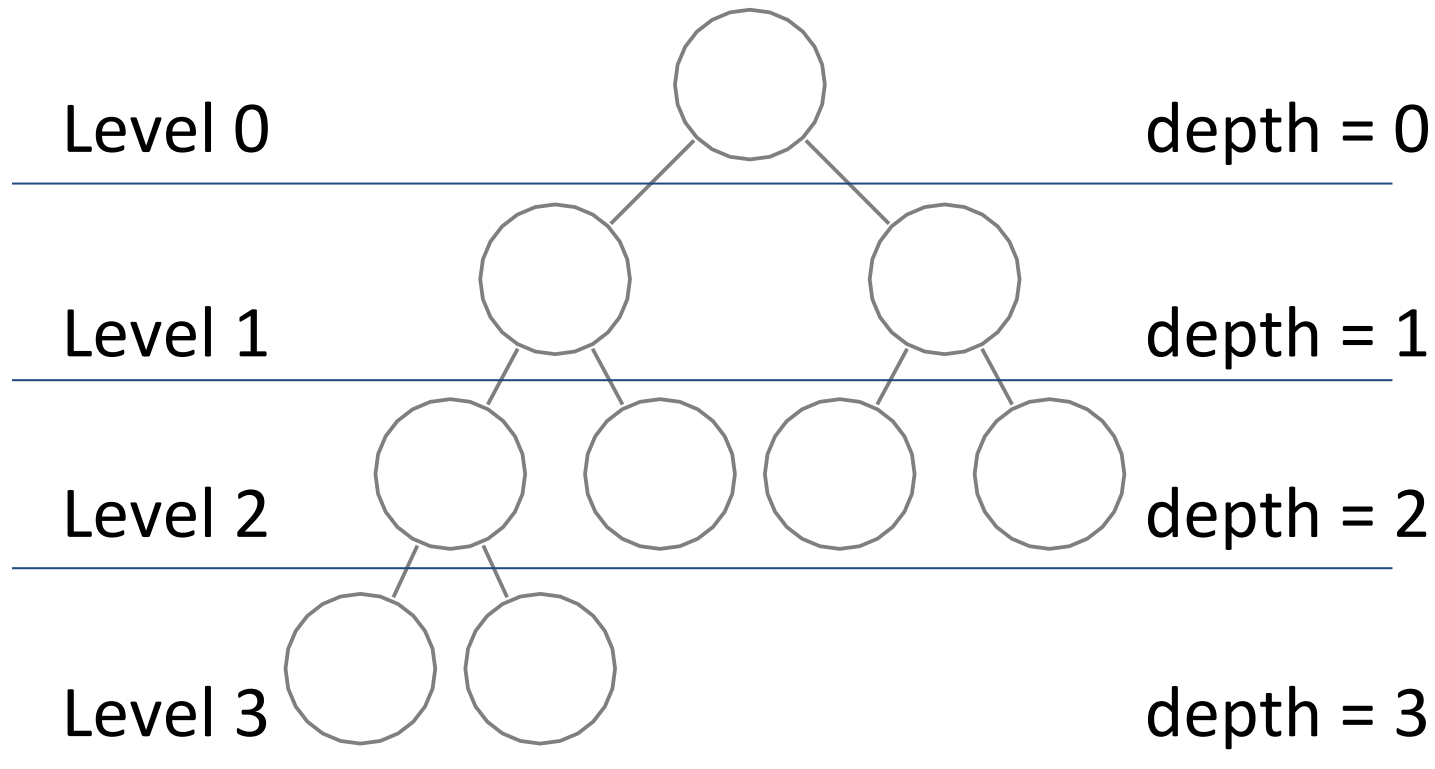
# Tree terminology: **siblings**



**Sharing the same parent**



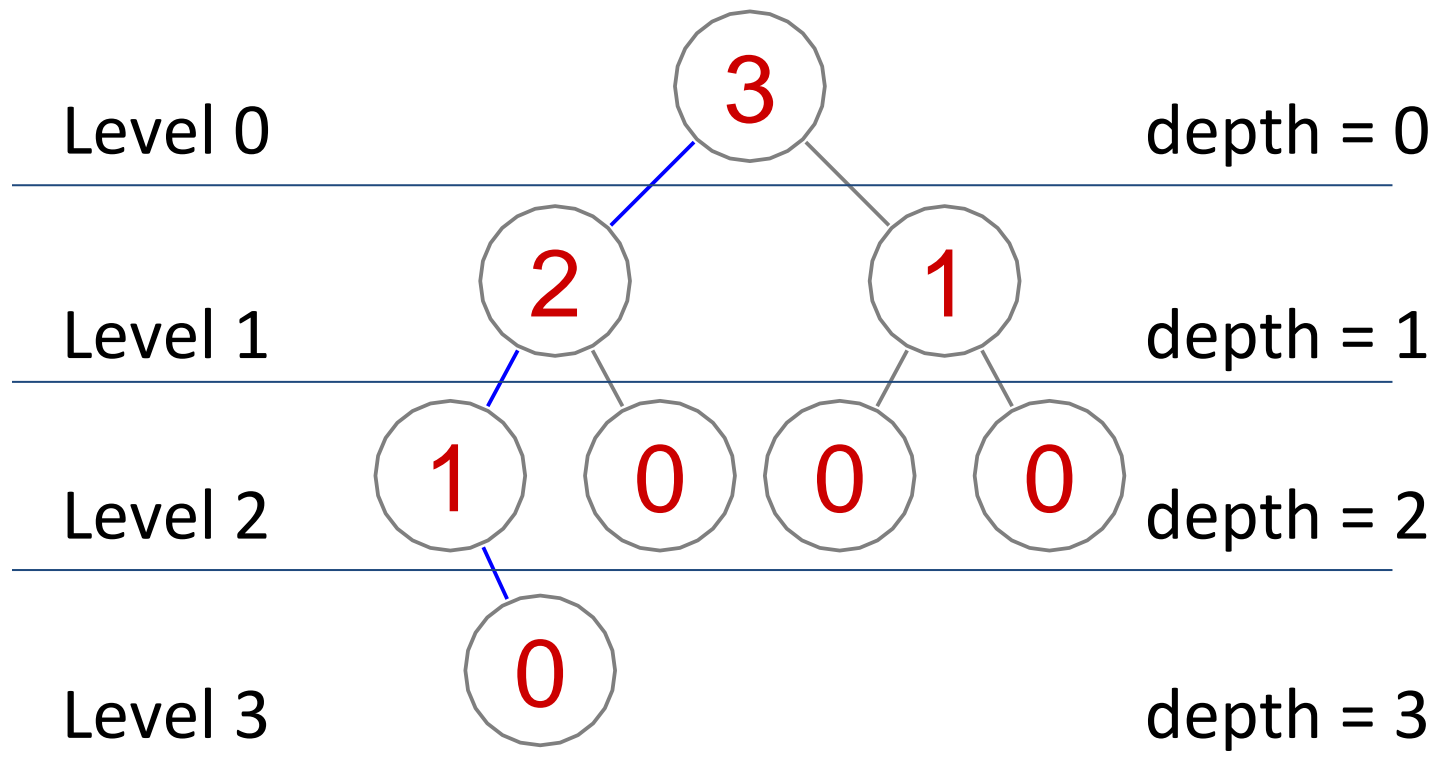
# Tree levels and node depth



**Distance from the root:**

**how many edges to go from the root to the node**

# Node height



**Distance from the node to the bottom:  
how many edges to go to the furthest leaf**

## Algorithm *height* (node)

```
if node == null :  
    return 0  
if node.left == null and node.right == null:  
    return 0  
return 1 + Max(height(node.left),  
               height(node.right))
```

## Algorithm *size* (*tree*)

```
if tree == null
```

```
    return 0
```

```
return 1 + size(tree.left) + size(tree.right)
```

Recursive algorithms are common



Which of the following correctly computes the *depth* of a given tree node in the non-empty tree?

A. Algorithm `depth(node)`  
    if `node == null`  
        return 0  
    return `1 + depth(node.parent)`

B. Algorithm `depth(node)`  
    if `node.parent == null`  
        return 0  
    return `1 + depth(node.parent)`

C. Algorithm `depth(node)`  
    if `node == null`  
        return -1  
    return `1 + depth(node.parent)`

D. More than one is correct

E. None is correct



# Tree traversals

- Task: list all the nodes in the tree

Two types of traversals:

- ❖ *Depth-first*: we completely traverse one sub-tree before exploring a sibling sub-tree
- ❖ *Breadth-first*: We traverse all nodes at one level before progressing to the next level

# Depth-first tree traversals

- In-order
- Pre-order
- Post-order

# Depth-first: in order

Algorithm *InOrderTraversal(tree)*

```
if tree == Null :
```

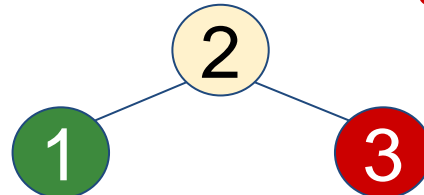
```
    return
```

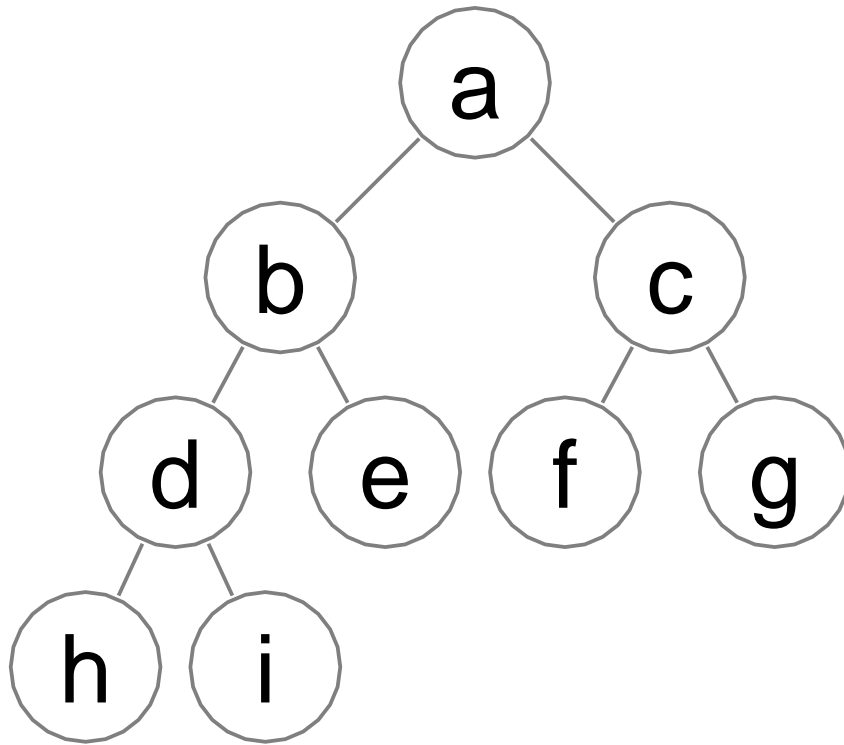
```
InOrderTraversal(tree.left)
```

```
print (tree.key)
```

```
InOrderTraversal(tree.right)
```

left - me - right



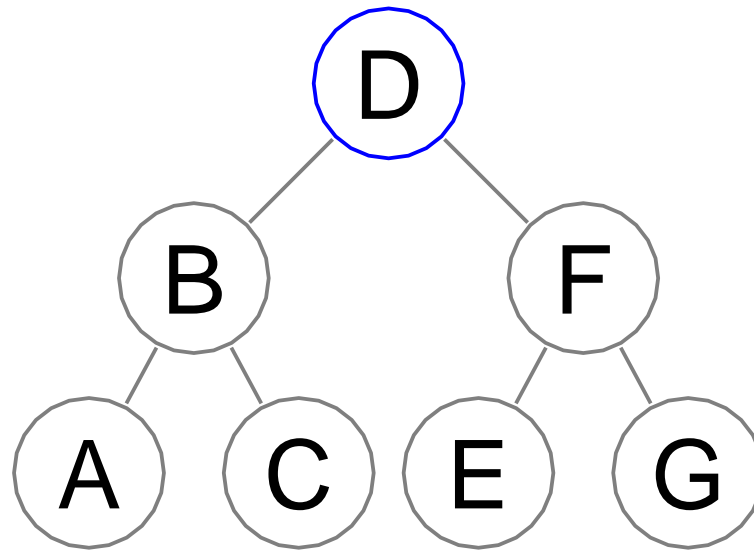


Which sequence of nodes is obtained as a result of **in-order traversal** of the tree on the left?

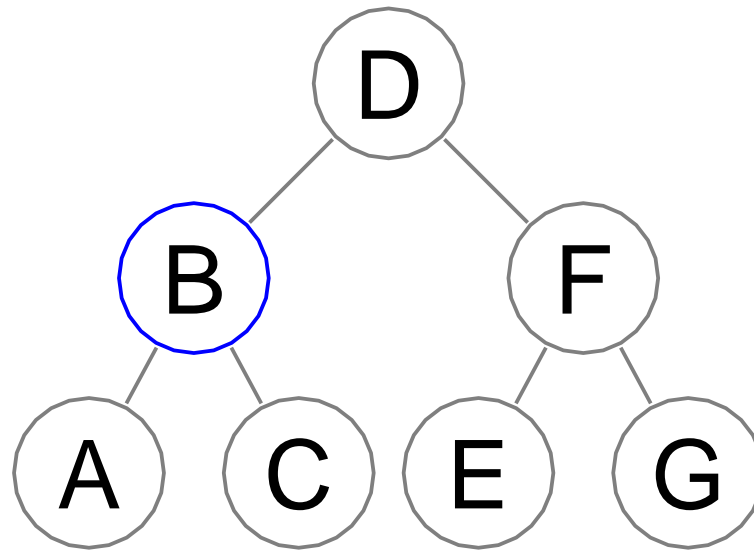
- A. abdhiectfg
- B. hdibeafcg
- C. ahdbefcg
- D. More than one is correct
- E. None is correct



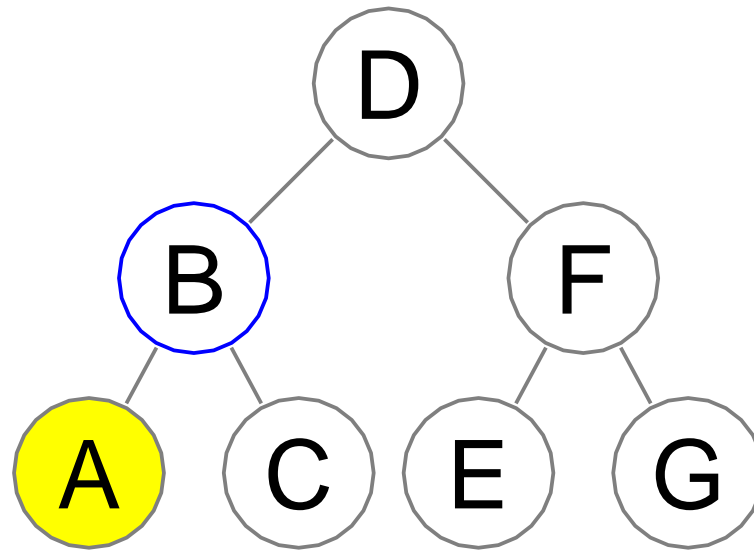
# In-order



# In-order



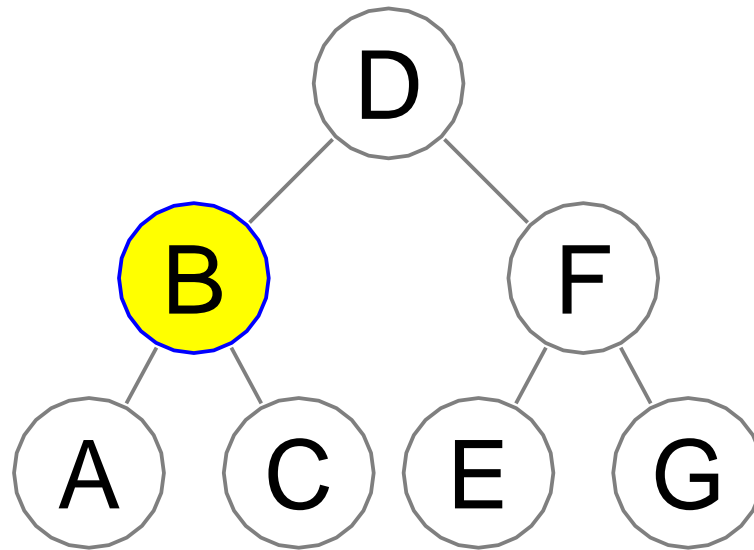
# In-order



A

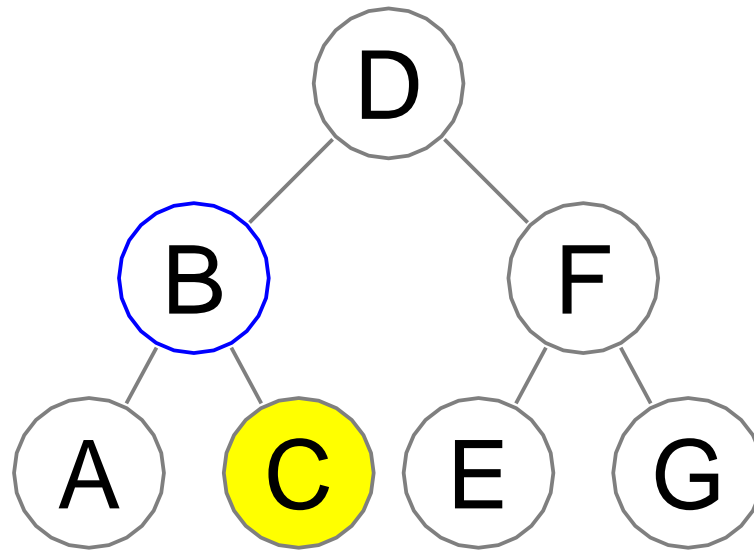


# In-order



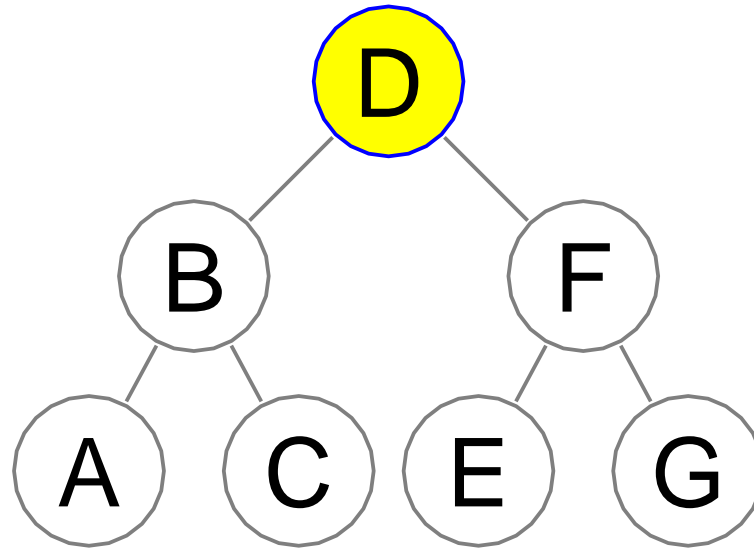
A B

# In-order



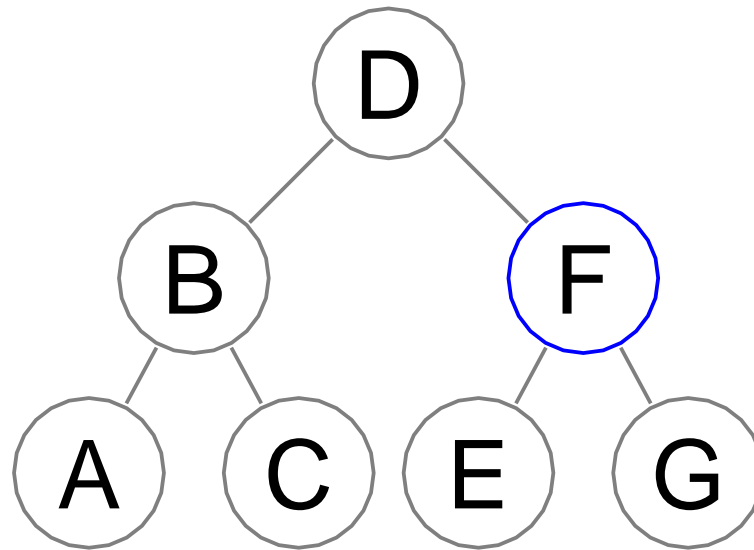
A B C

# In-order



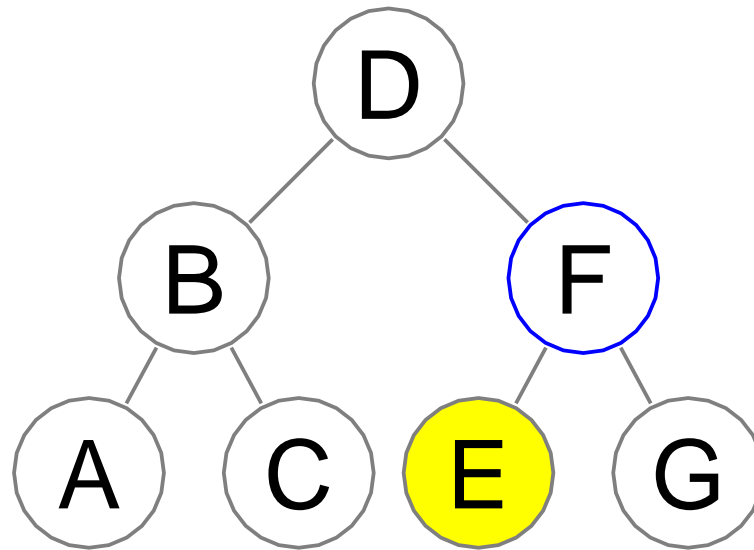
A B C D

# In-order



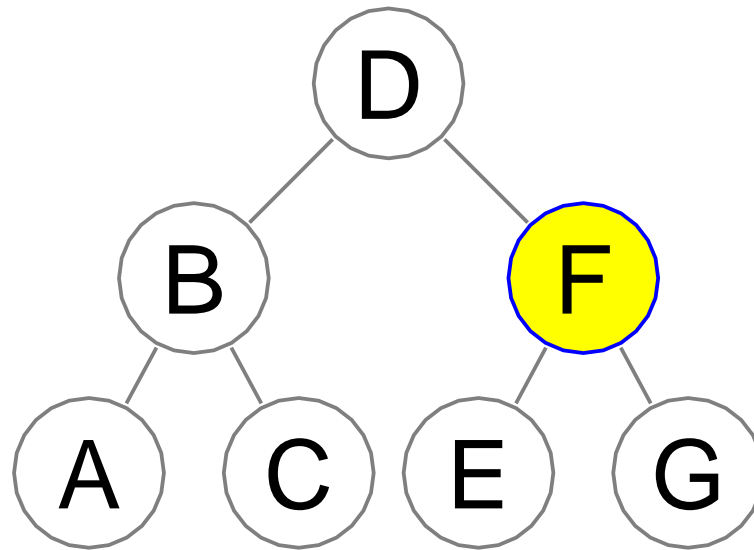
A B C D

# In-order



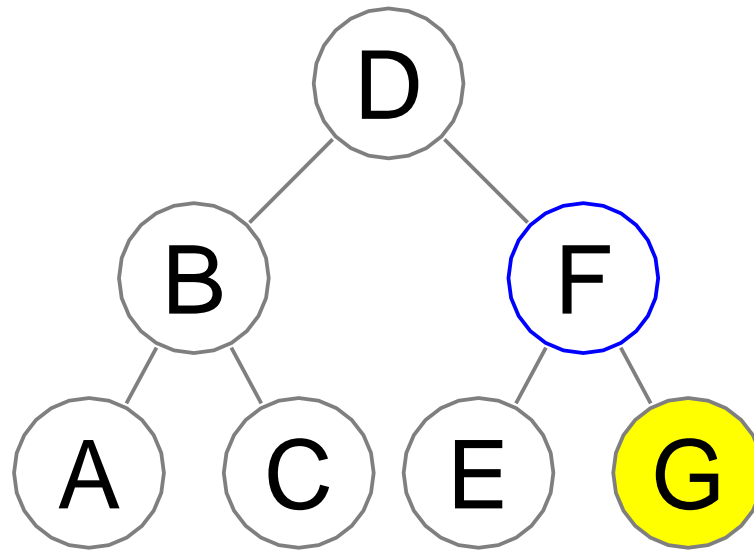
A B C D E

# In-order



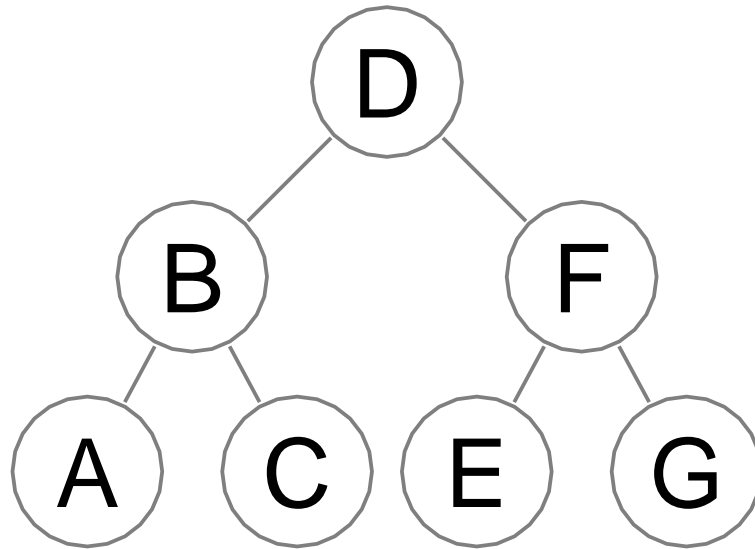
A B C D E F

# In-order



A B C D E F G

# In-order



me,  
node D

A B C D E F G

left subtree of D

right subtree of D



# Depth-first: pre-order

Algorithm *PreOrderTraversal(tree)*

```
if tree == null:
```

```
    return
```

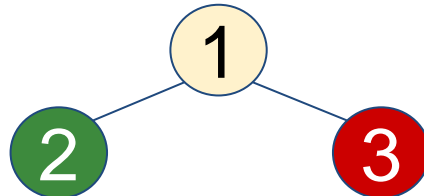
```
print (tree.key)
```

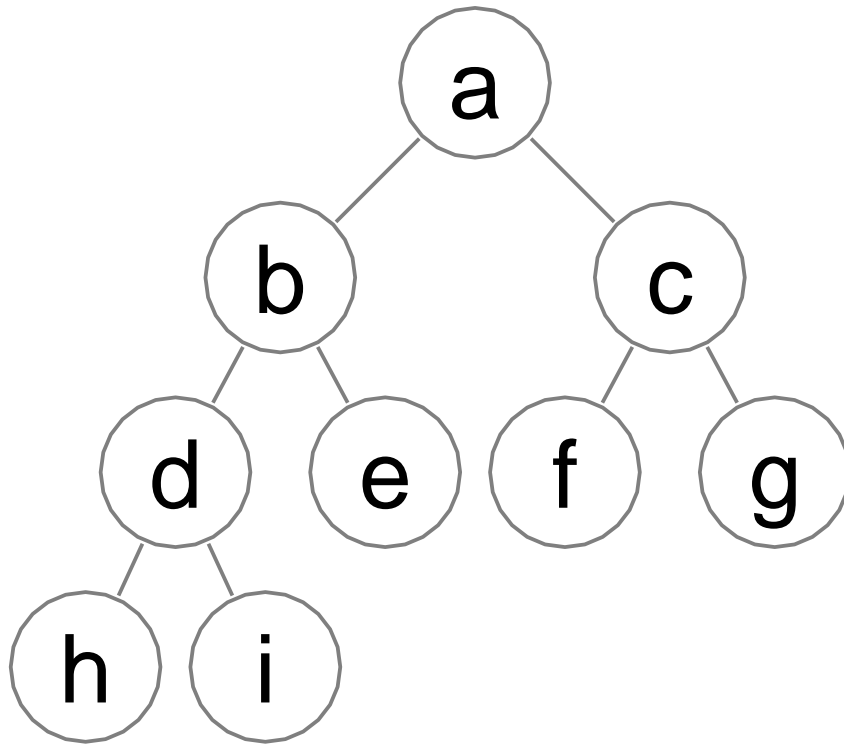
```
PreOrderTraversal(tree.left)
```

```
PreOrderTraversal(tree.right)
```

me first

me → left → right



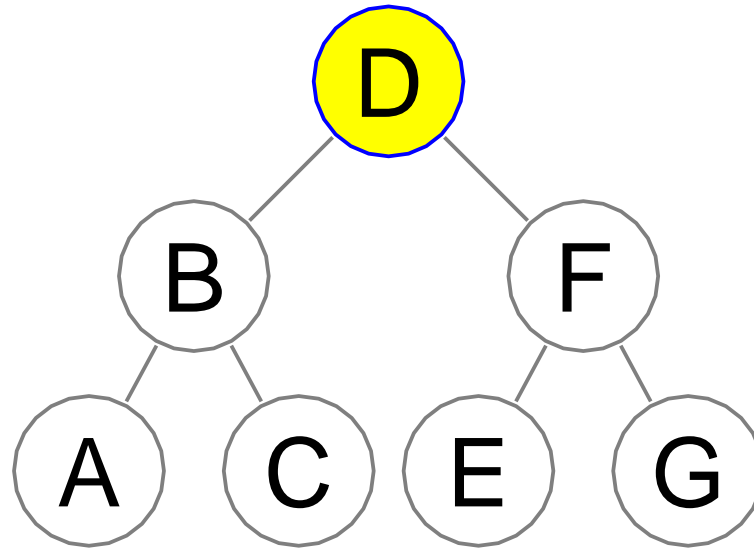


Which sequence of nodes is obtained as a result of **pre-order traversal** of the tree on the left?

- A. abdhiectfg
- B. abcdehifg
- C. abdhiectfg
- D. More than one is correct
- E. None is correct

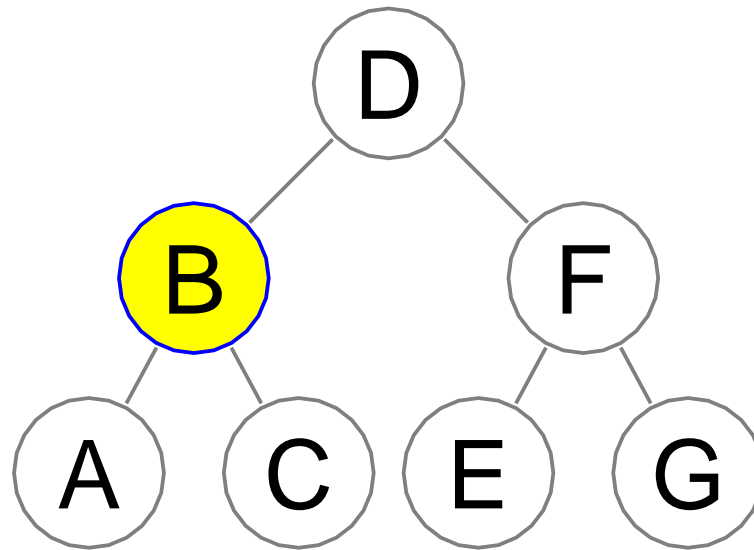


# Pre-order



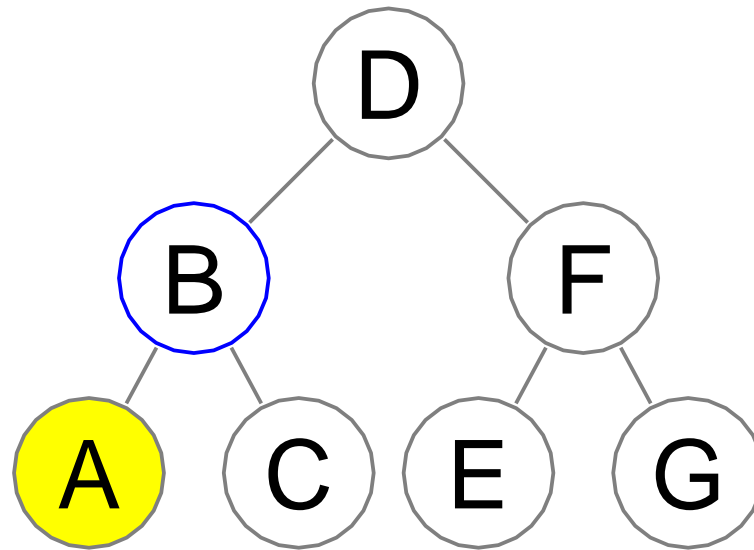
D

# Pre-order



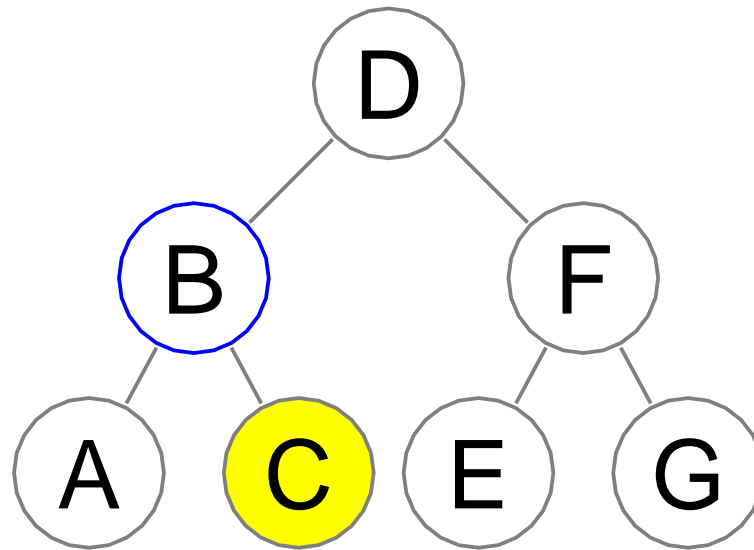
D B

# Pre-order



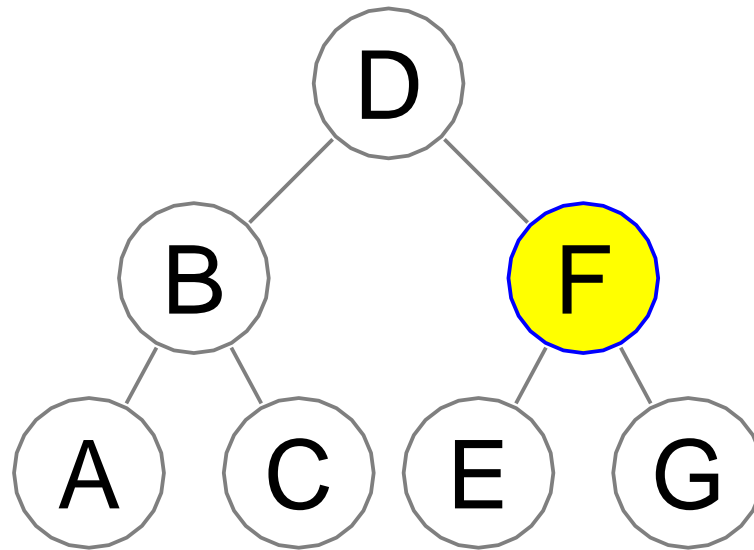
D B A

# Pre-order



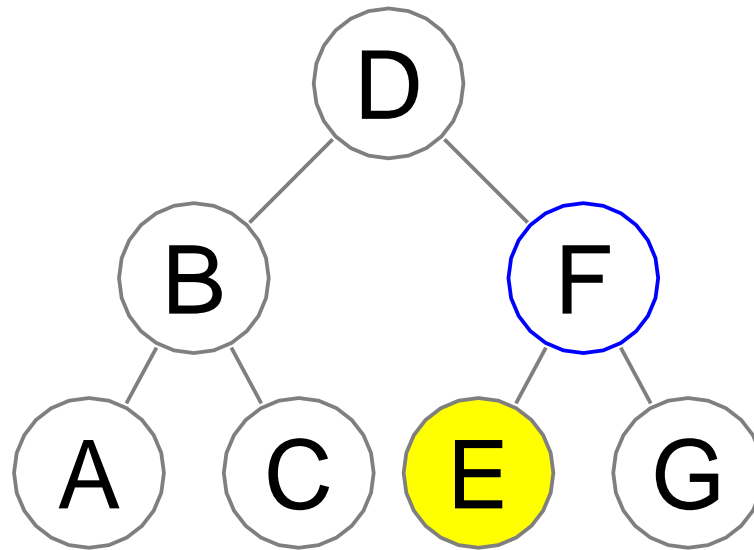
D B A C

# Pre-order



D B A C F

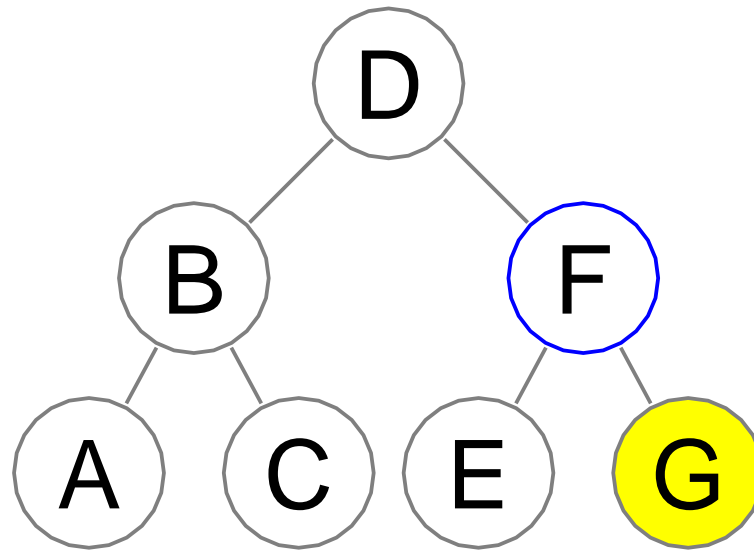
# Pre-order



D B A C F E

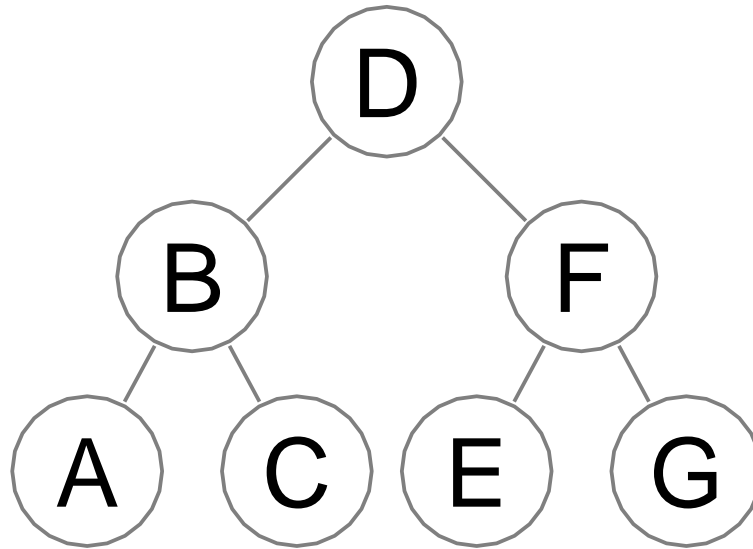


# Pre-order



D B A C F E G

# Pre-order



me,  
node D

D

B A C

F E G

left subtree of D    right subtree of D

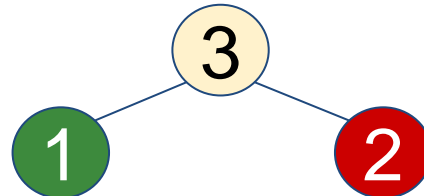
# Depth-first: post-order

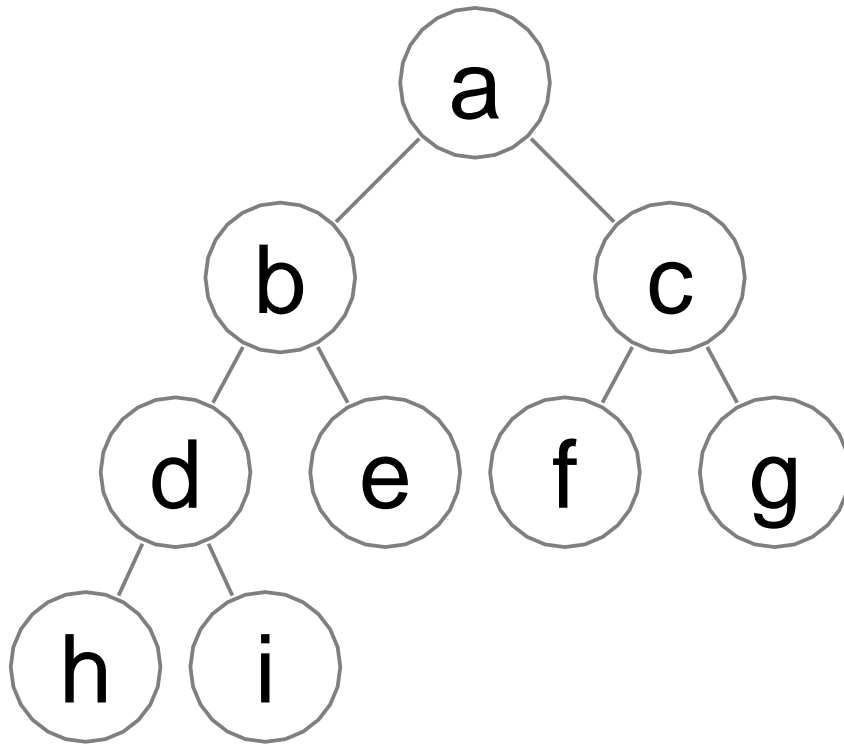
Algorithm *PostOrderTraversal(tree)*

```
if tree == null:  
    return  
    PostOrderTraversal(tree.left)  
    PostOrderTraversal(tree.right)  
    print(tree.key)
```

children first

left → right → me



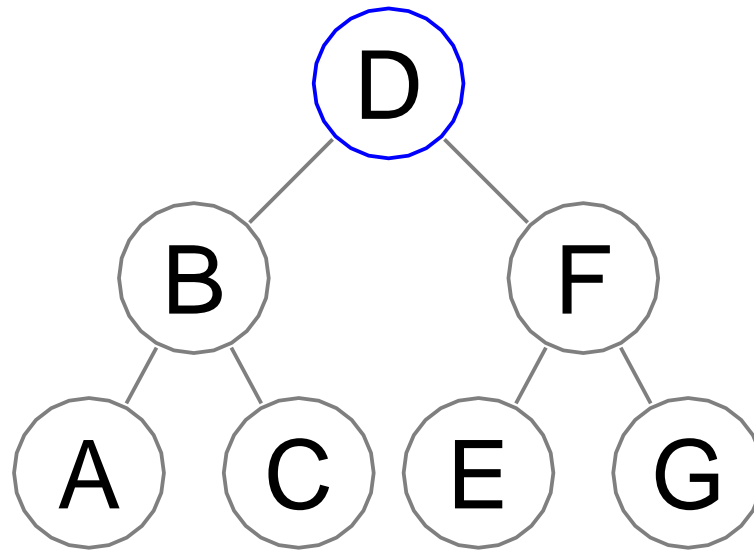


Which sequence of nodes is obtained as a result of **post-order traversal** of the tree on the left?

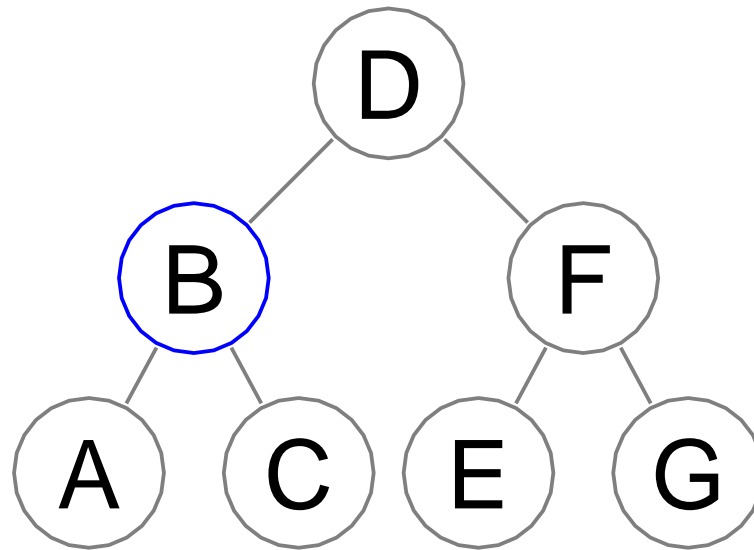
- A. abdhiectfg
- B. abcdehifg
- C. hidebfgca
- D. More than one is correct
- E. None is correct



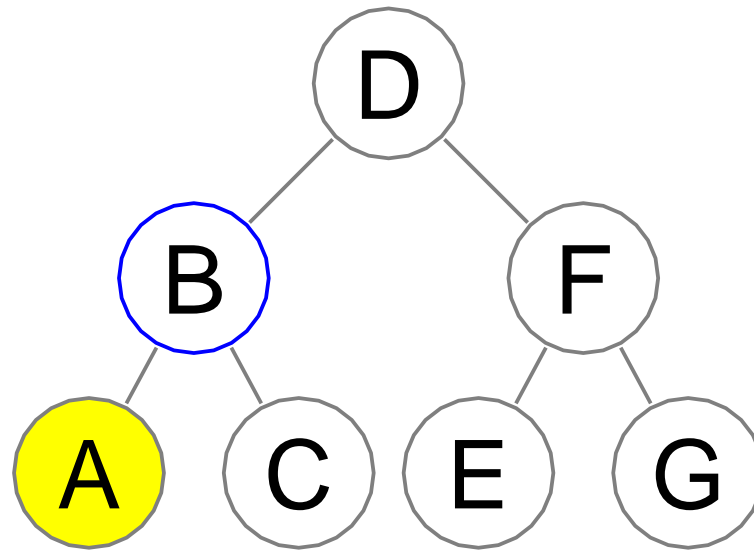
# Post-order



# Post-order

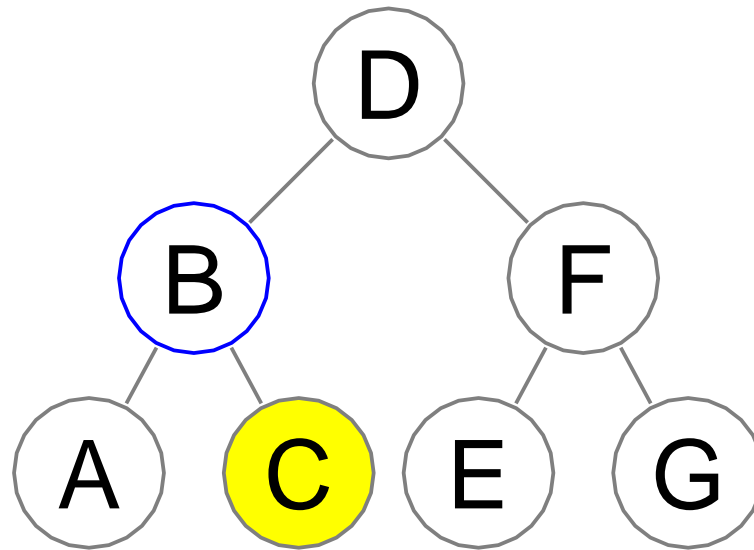


# Post-order



A

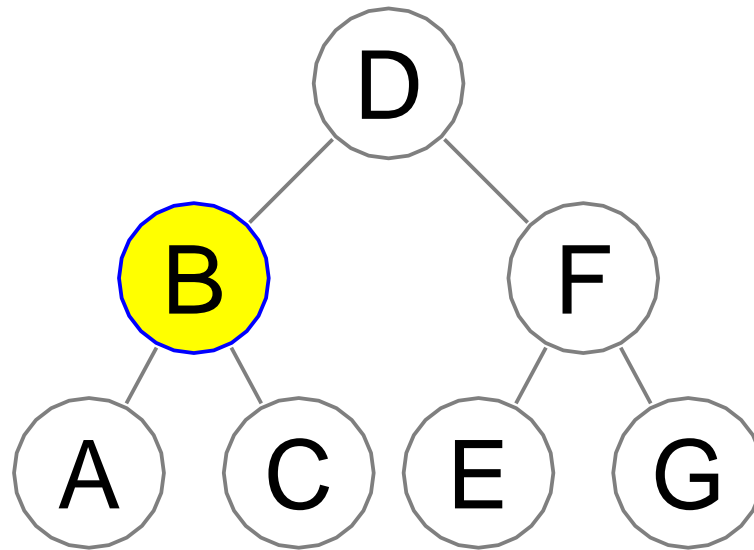
# Post-order



A C

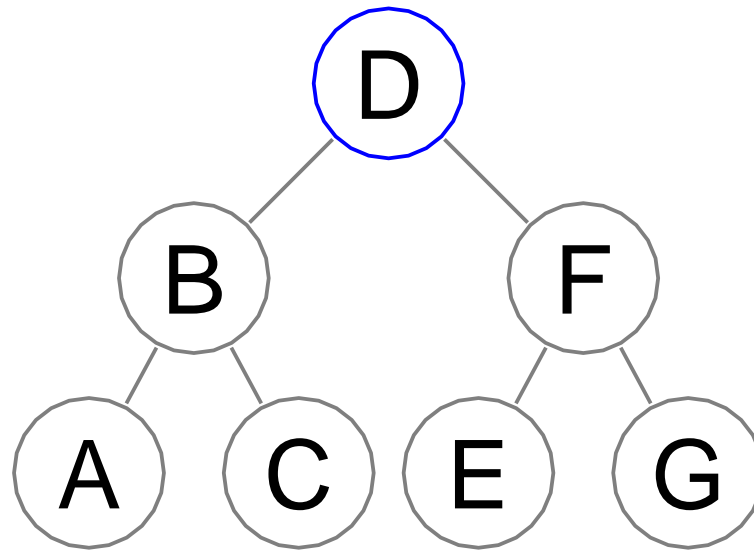


# Post-order



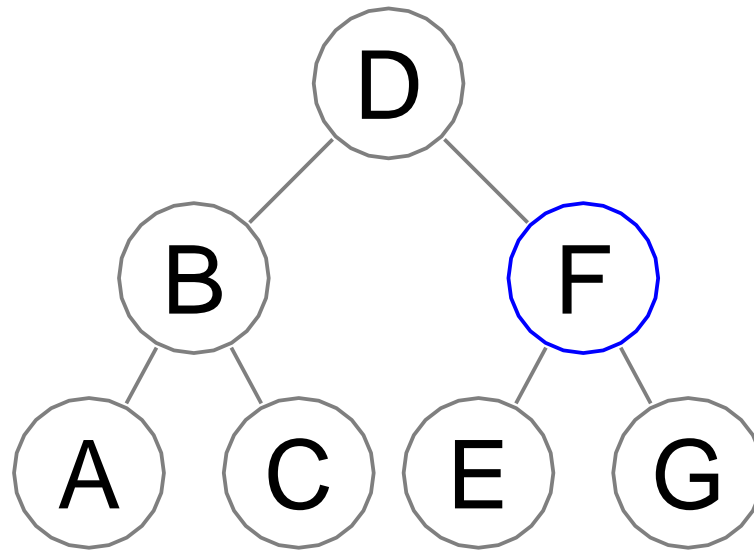
A C B

# Post-order



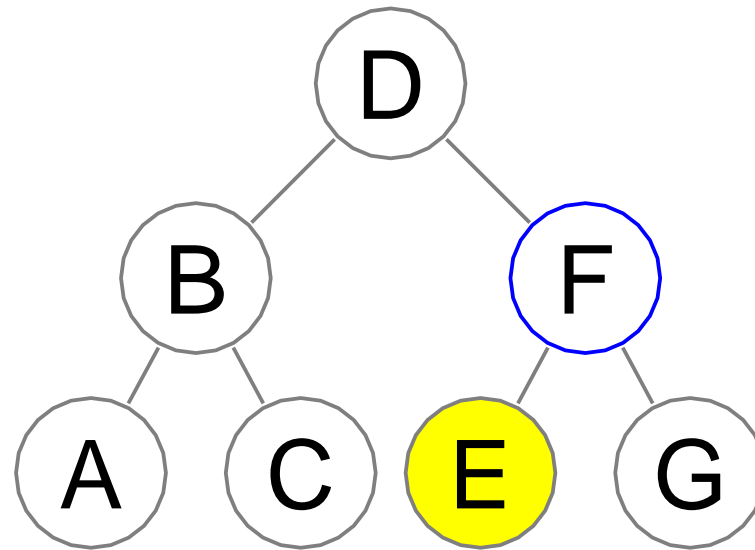
A C B

# Post-order



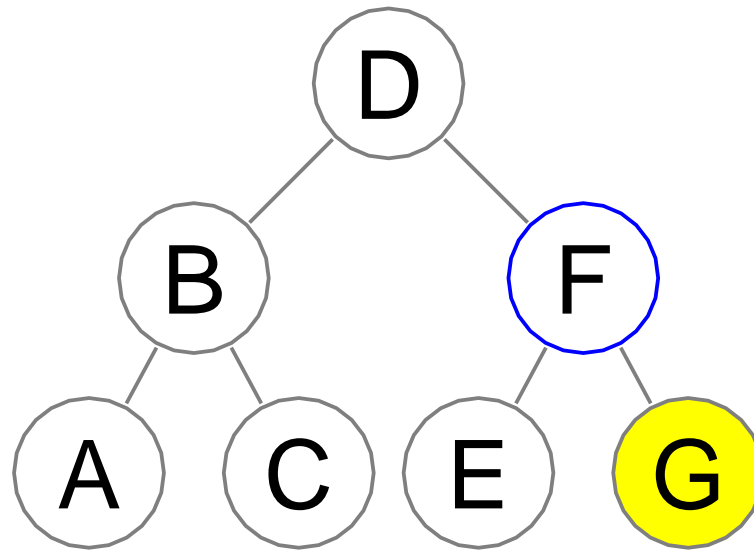
A C B

# Post-order



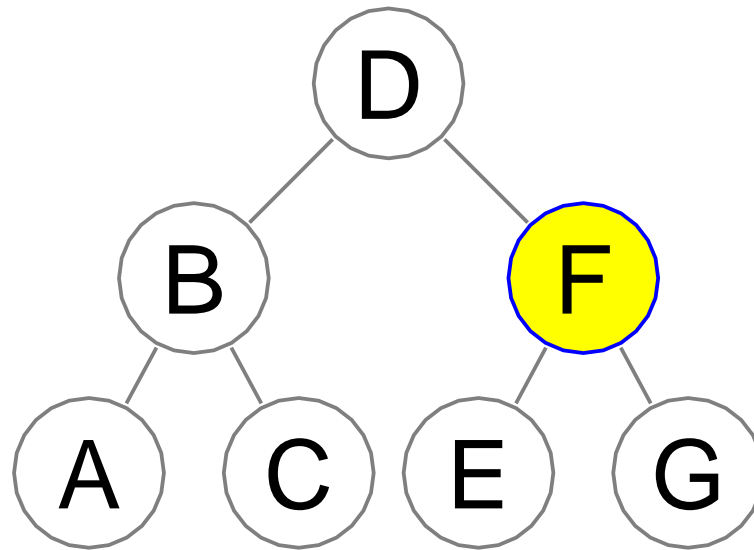
A C B E

# Post-order



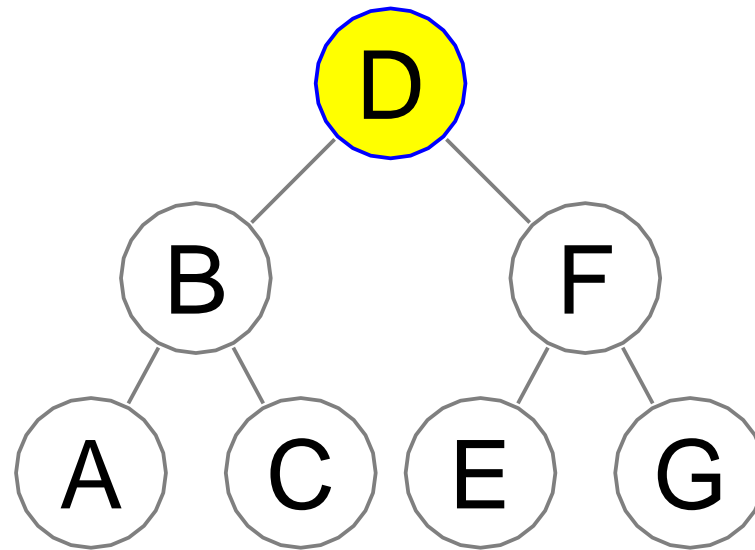
A C B E G

# Post-order



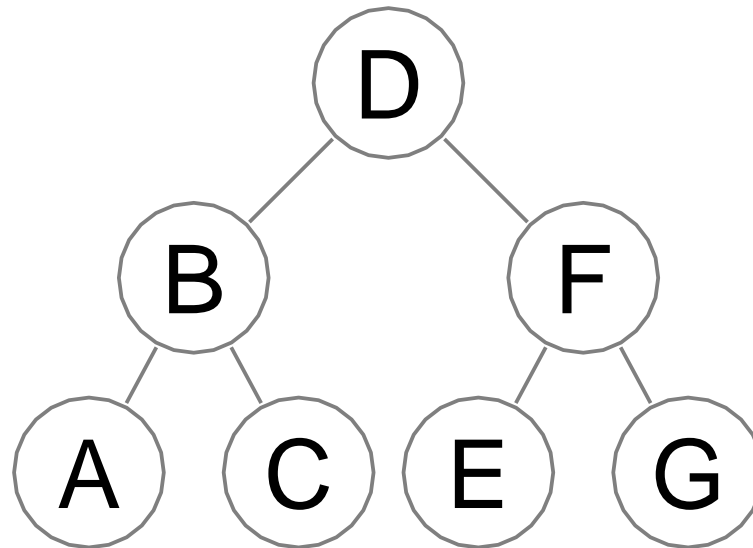
A C B E G F

# Post-order



A C B E G F D

# Post-order



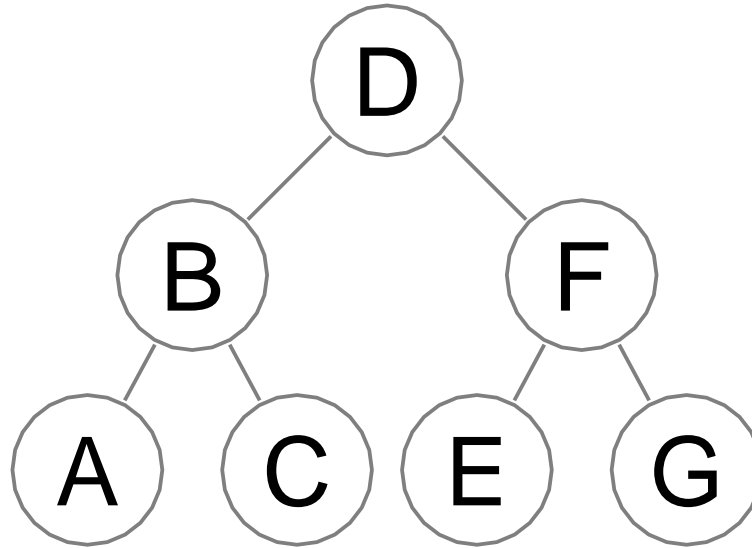
me, node D

A C B    E G F    D

left subtree of D    right subtree of D



# Breadth-first traversal



Level traversal:

D

B F

A C E G

# Algorithm *BreadthFirstTraversal(tree)*

```
if tree == null:
```

```
    return
```

► *Queue q*

```
q.enqueue(tree)
```

```
while not q.isEmpty():
```

```
    node ← q.dequeue()
```

```
    print(node)
```

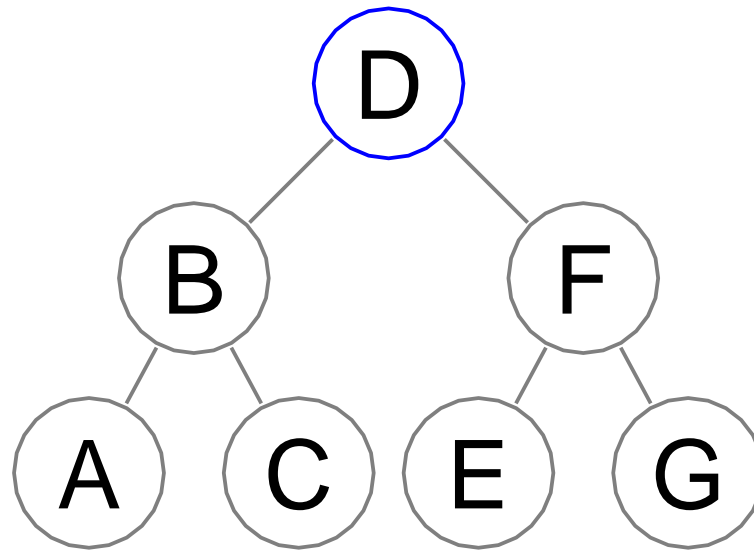
```
    if node.left != null:
```

```
        q.enqueue(node.left)
```

```
    if node.right != null:
```

```
        q.enqueue(node.right)
```

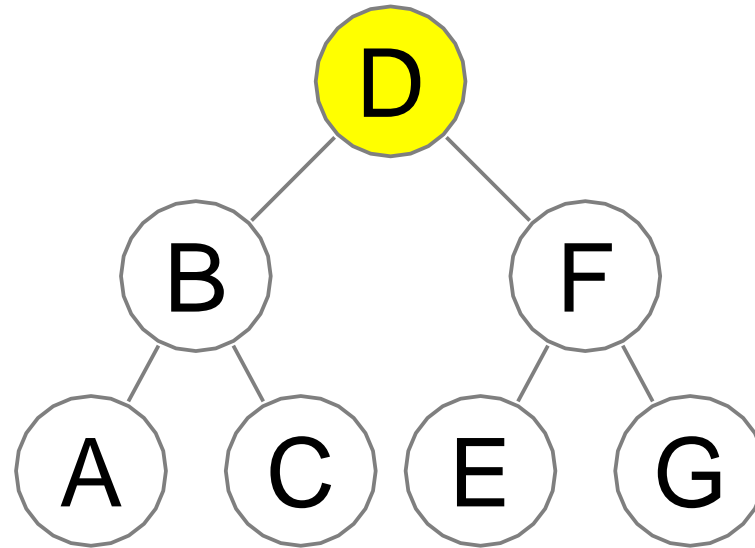
# Breadth first: level traversal



Queue: D

Output:

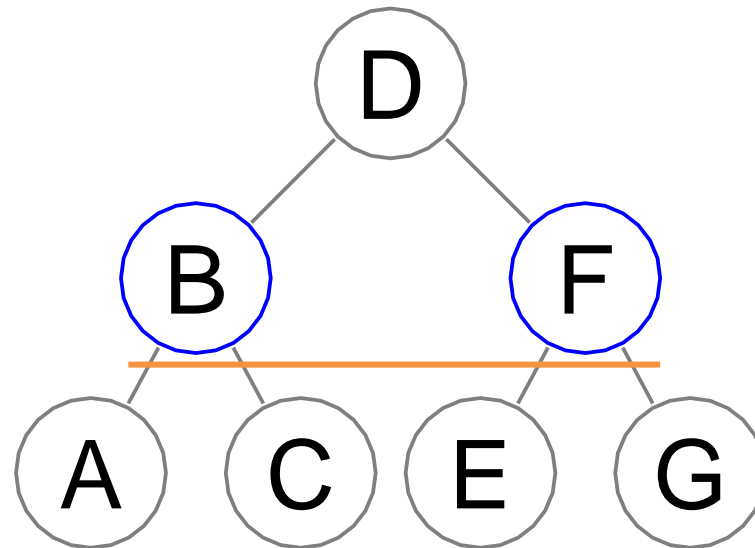
# Breadth first: level traversal



Queue:

Output: D

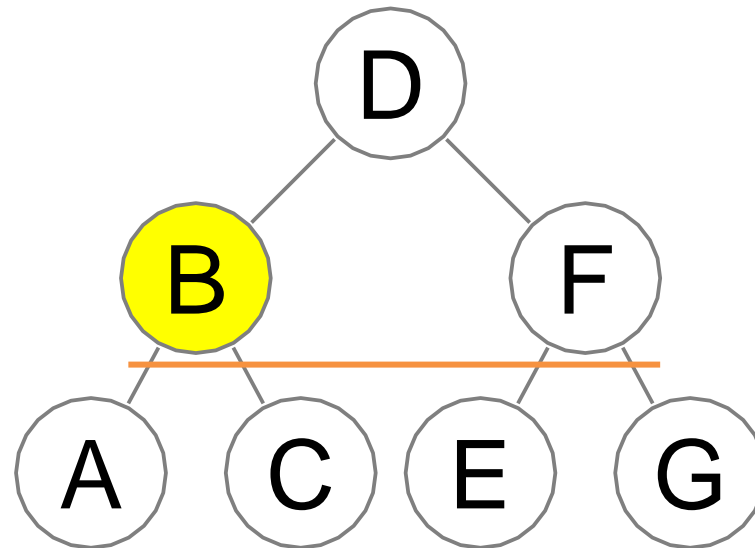
# Breadth first: level traversal



Queue: B F

Output: D

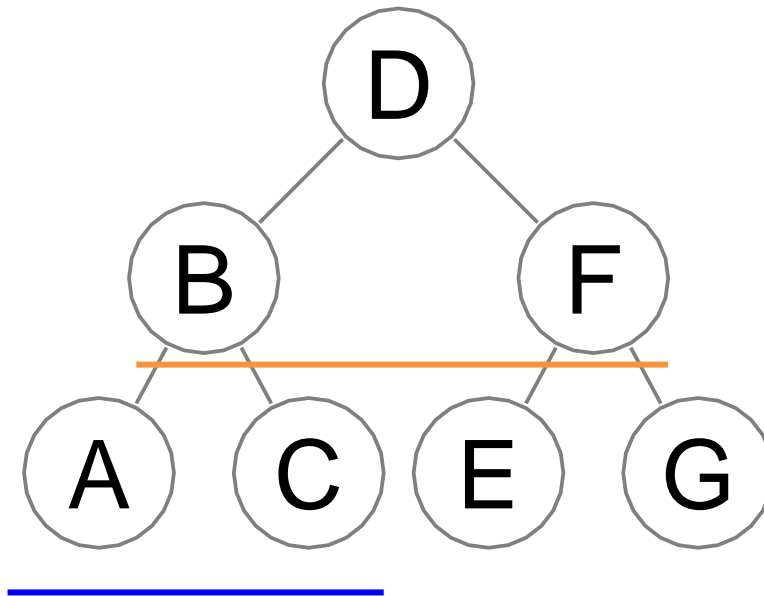
# Breadth first: level traversal



Queue: B F

Output: D

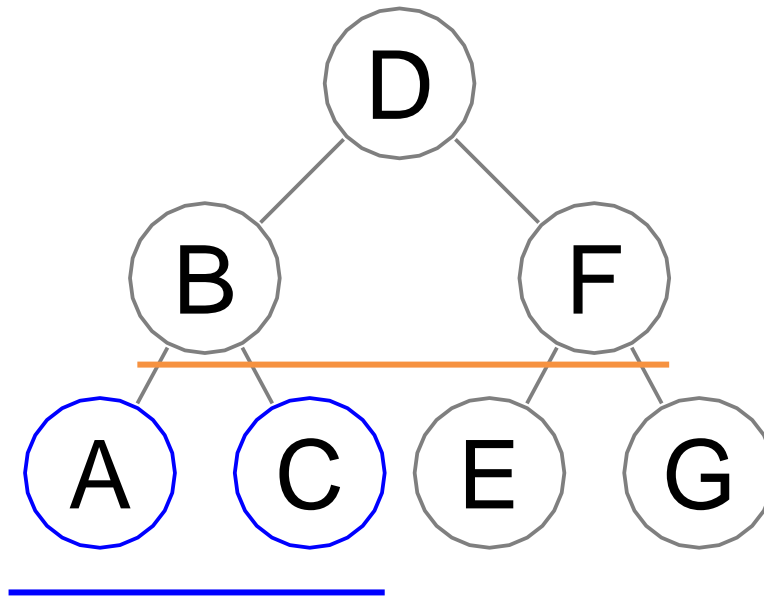
# Breadth first: level traversal



Queue: F

Output: D B

# Breadth first: level traversal

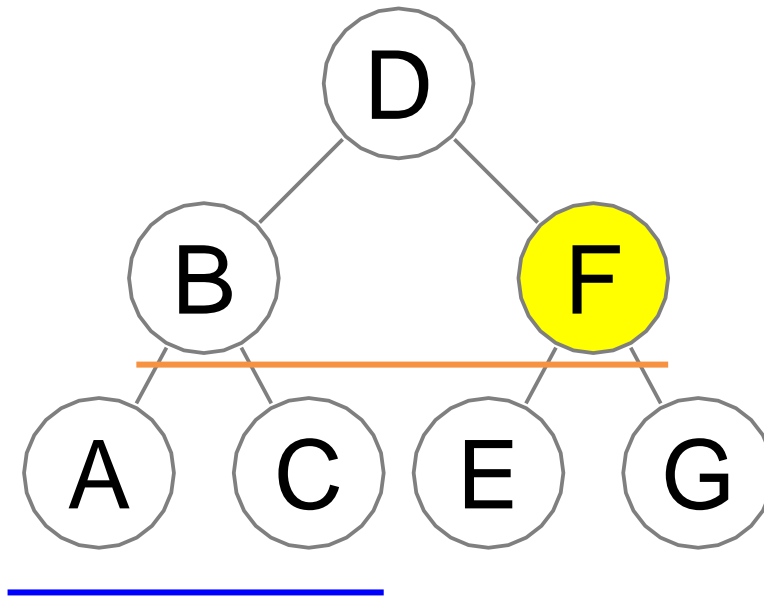


Queue: F A C

Output: D B



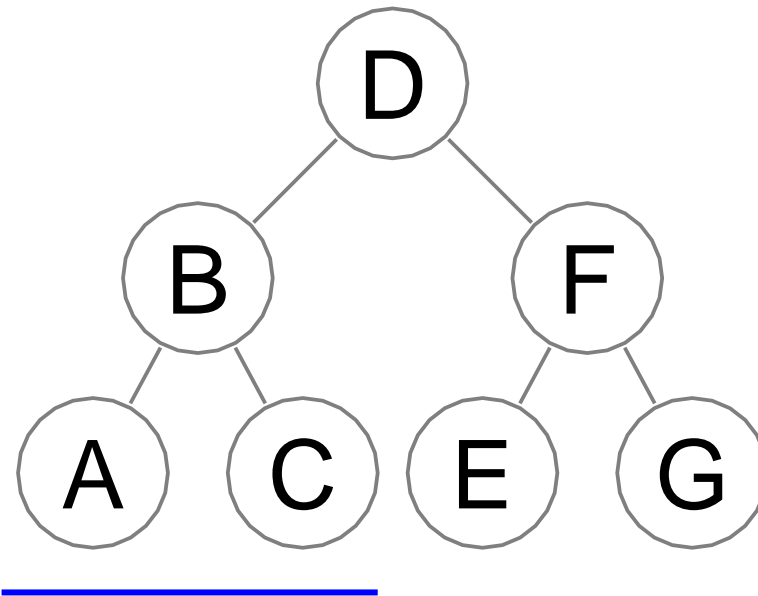
# Breadth first: level traversal



Queue: F A C

Output: D B

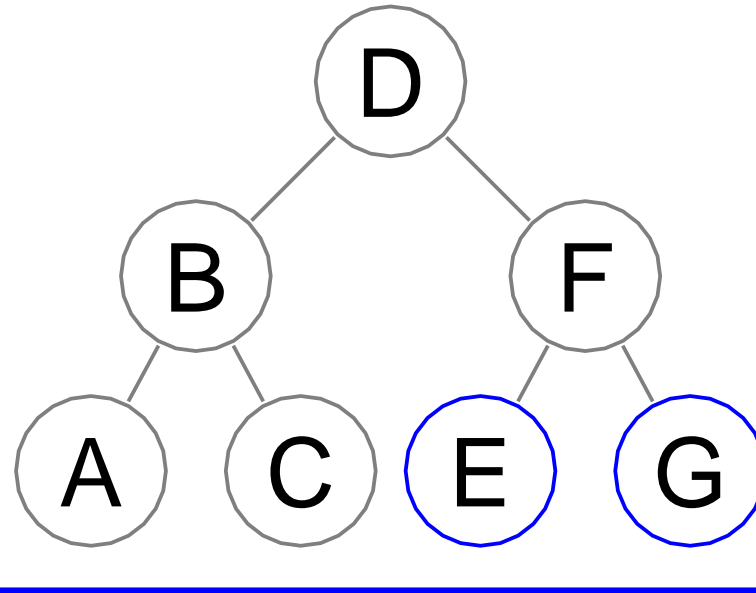
# Breadth first: level traversal



Queue: A C

Output: D B F

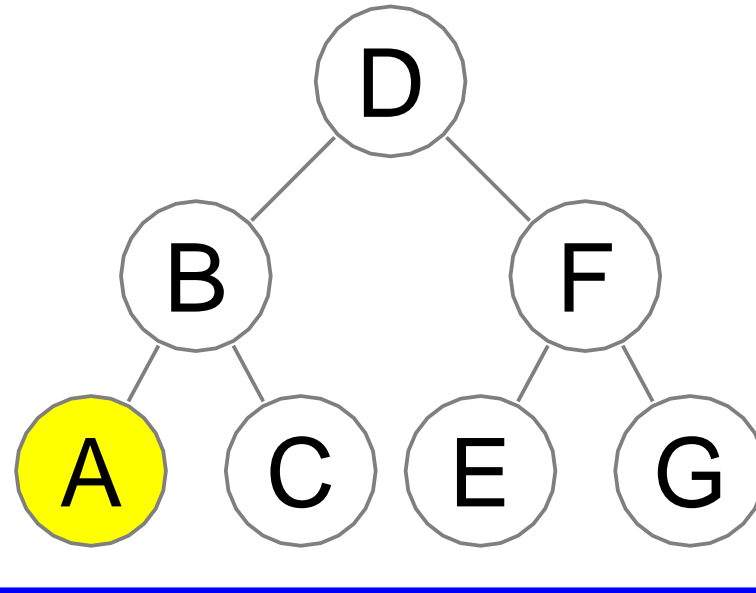
# Breadth first: level traversal



Queue: A C E G

Output: D B F

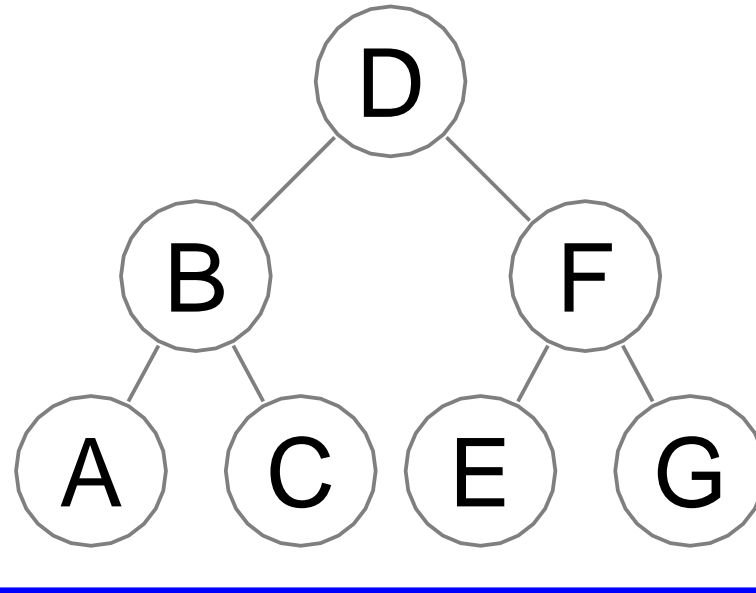
# Breadth first: level traversal



Queue: A C E G

Output: D B F

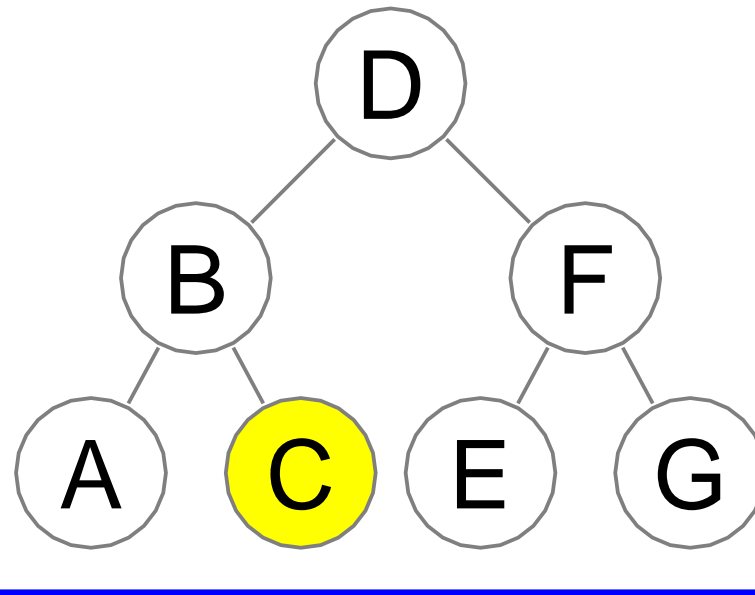
# Breadth first: level traversal



Queue: C E G

Output: D B F A

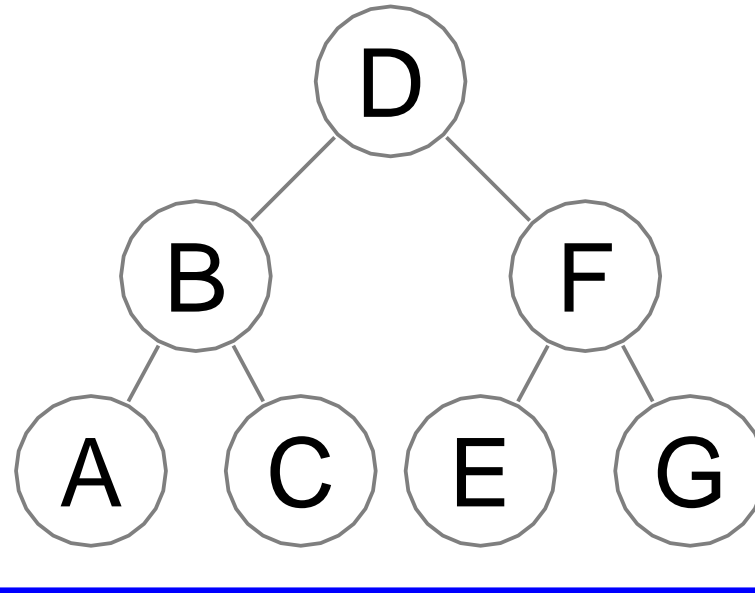
# Breadth first: level traversal



Queue: C E G

Output: D B F A

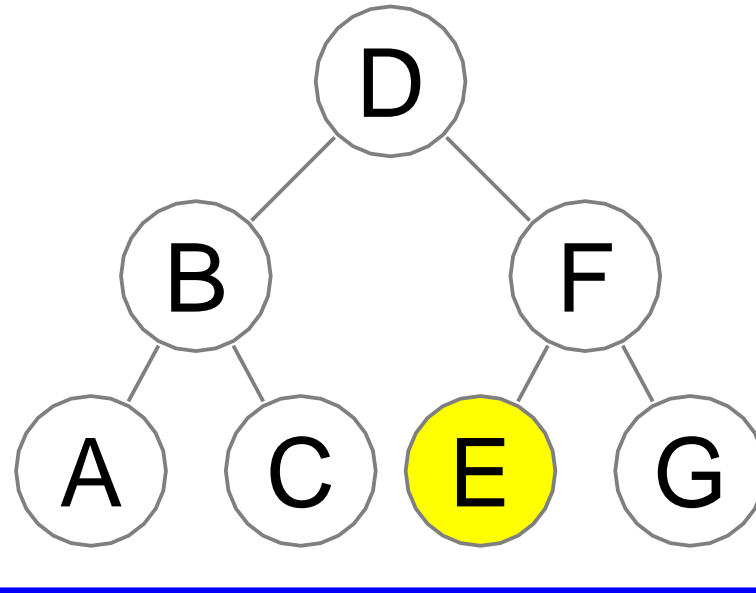
# Breadth first: level traversal



Queue: E G

Output: D B F A C

# Breadth first: level traversal

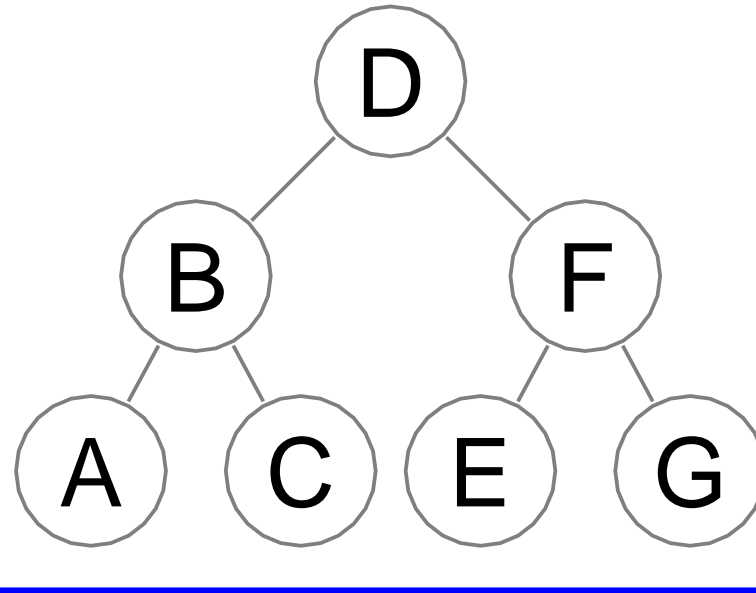


Queue: E G

Output: D B F A C



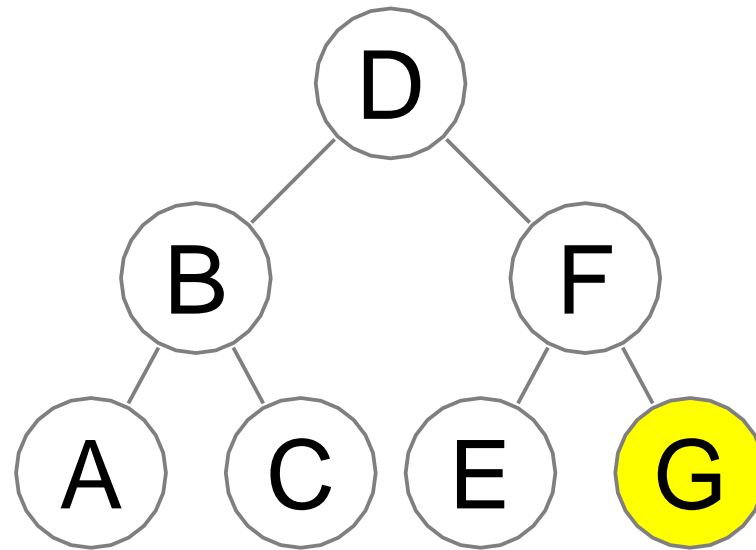
# Breadth first: level traversal



Queue: G

Output: D B F A C E

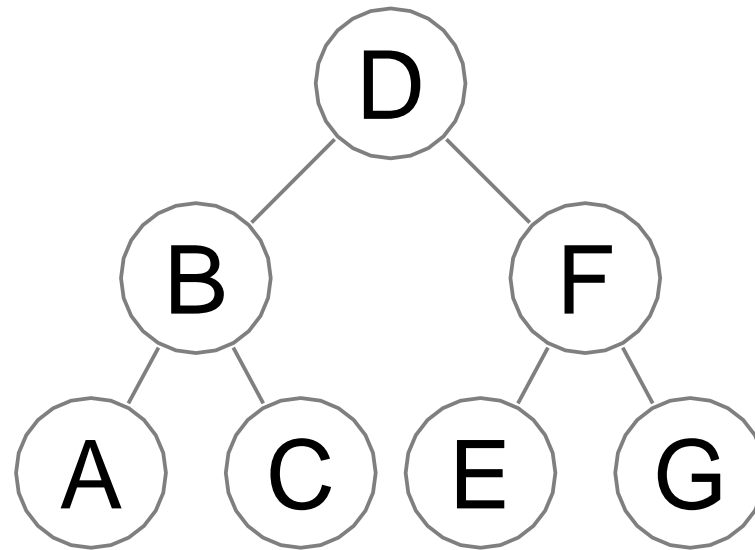
# Breadth first: level traversal



Queue: G

Output: D B F A C E

# Breadth first: level traversal



Queue: empty

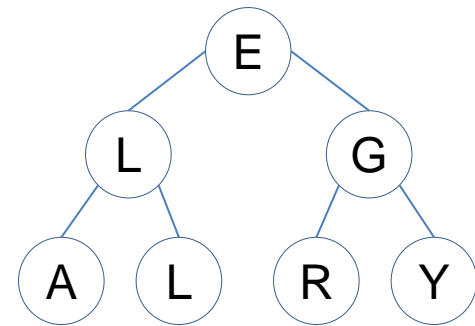
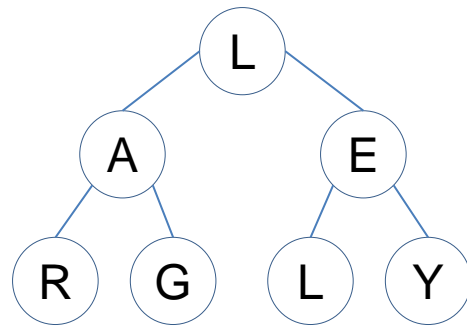
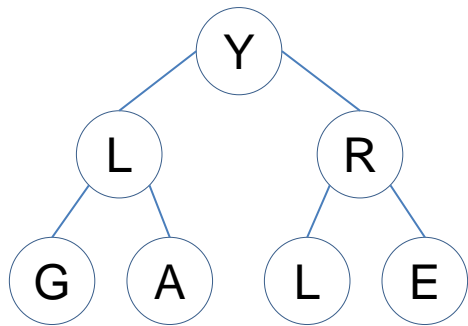
Output: D B F A C E G

# Tree data structure: notes

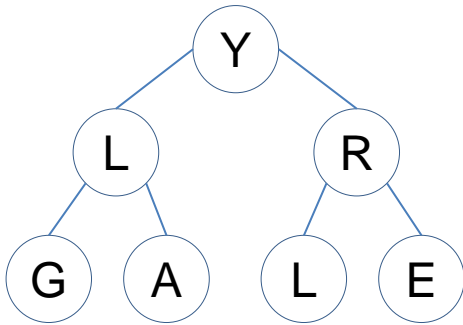
- *Tree* is fully defined by its root node
- Each node has (at least) a key and links to children
- Tree traversals:
  - Depth-first: uses recursion (stack)
    - pre-order
    - in-order
    - post-order
  - Breadth-first: uses queue
- When working with a tree, recursive algorithms are common
- In Computer Science, **trees grow down!**



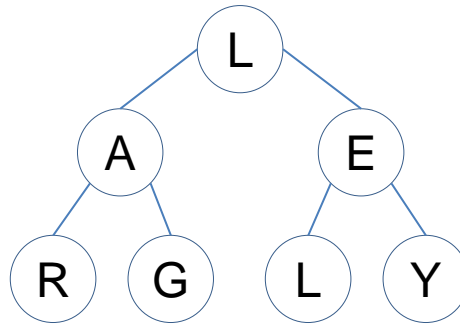
Can you guess which (real) words are spelled by some type of traversal of these trees?



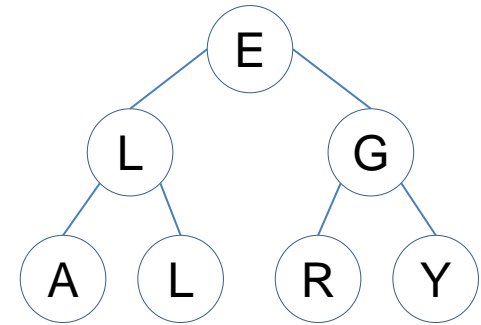
Which type of traversal is used to spell these words?



GALLERY



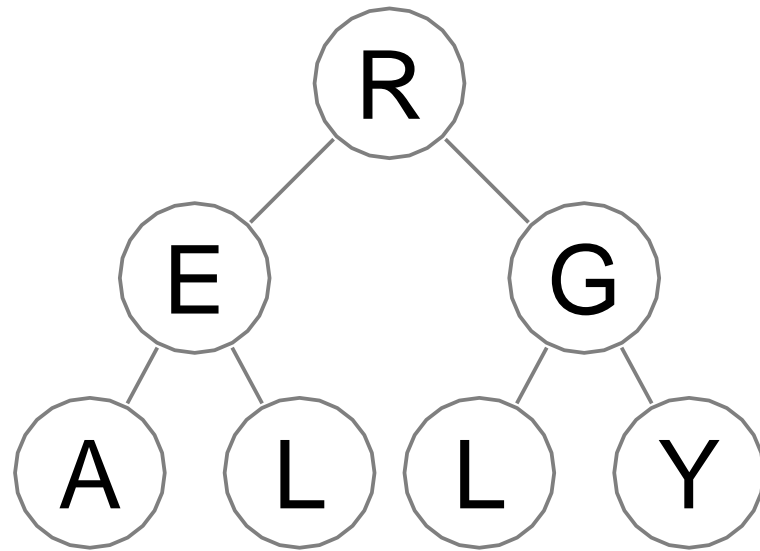
LARGELY



ALLERGY

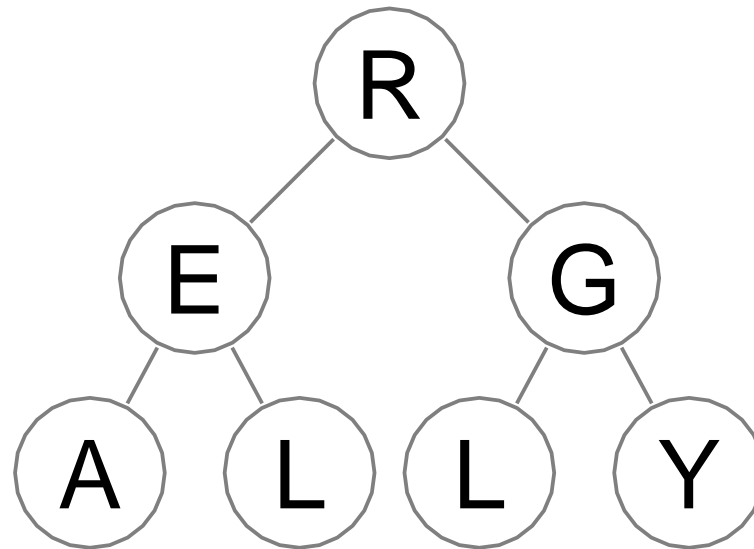
- A. in-order, pre-order, post-order
- B. pre-order, post-order, in-order
- C. post-order, in-order, pre-order
- D. None of the above (something else)





For completeness: **breadth-first** traversal

*regally*



For completeness: **breadth-first** traversal