



# Data Structures

## Chapter 4: Search trees

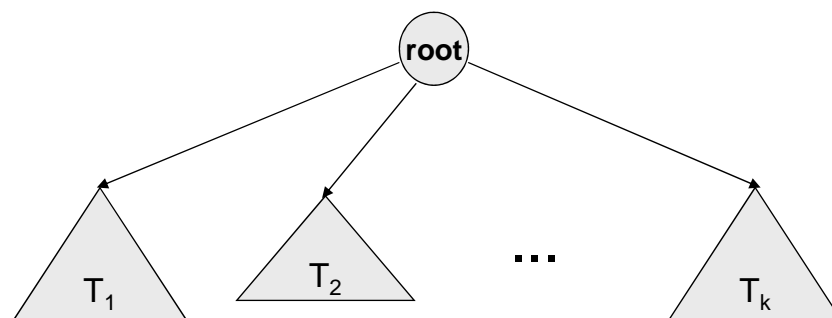
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2015-2016

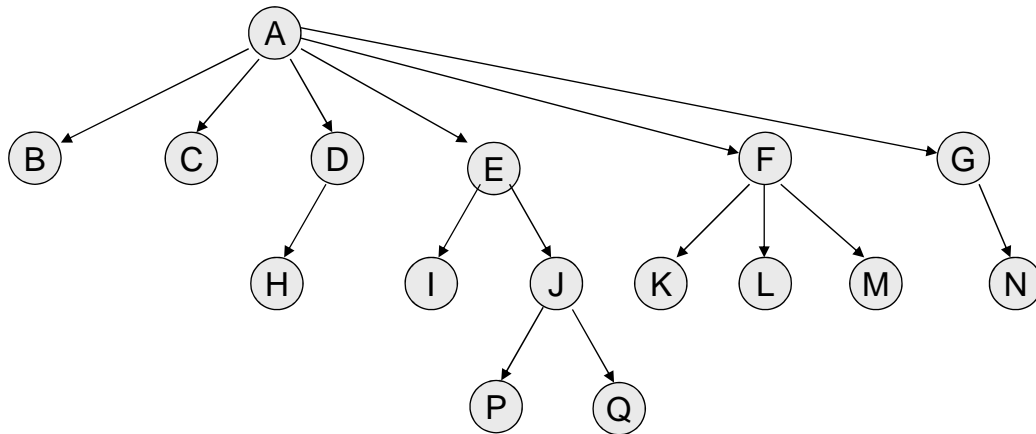
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## What is a Tree?

- A tree is a collection of nodes with the following properties:
  - The collection can be empty.
  - Otherwise, a tree consists of a distinguished node  $r$ , called *root*, and zero or more nonempty sub-trees  $T_1, T_2, \dots, T_k$ , each of whose roots are connected by a *directed edge* from  $r$ .
- The root of each sub-tree is said to be *child* of  $r$ , and  $r$  is the *parent* of each sub-tree root.
- If a tree is a collection of  $N$  nodes, then it has  $N-1$  edges.



# Preliminaries



- Node A has 6 children: B, C, D, E, F, G.
- B, C, H, I, P, Q, K, L, M, N are leaves in the tree above.
- K, L, M are siblings since F is parent of all of them.

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# Preliminaries (continued)

- A **path** from node  $n_1$  to  $n_k$  is defined as a sequence of nodes  $n_1, n_2, \dots, n_k$  such that  $n_i$  is parent of  $n_{i+1}$  ( $1 \leq i < k$ )
  - The **length** of a path is the number of edges on that path.
  - There is a path of length zero from every node to itself.
  - There is exactly one path from the root to each node.
- The **depth** of node  $n_i$  is the length of the path from root to node  $n_i$
- The **height** of node  $n_i$  is the length of longest path from node  $n_i$  to a leaf.
- If there is a path from  $n_1$  to  $n_2$ , then  $n_1$  is **ancestor** of  $n_2$ , and  $n_2$  is **descendent** of  $n_1$ .
  - If  $n_1 \neq n_2$  then  $n_1$  is **proper ancestor** of  $n_2$ , and  $n_2$  is **proper descendent** of  $n_1$ .

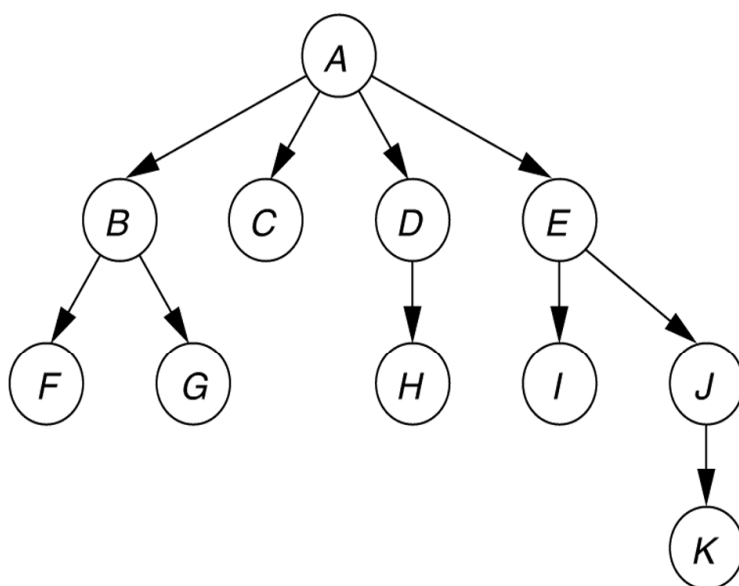
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- The **subtree** of  $T$  rooted at a node  $v$  is the tree consisting of all the descendants of  $v$  in  $T$  (including  $v$  itself).
- An **edge** of tree  $T$  is a pair of nodes  $(u, v)$  such that  $u$  is the parent of  $v$ , or vice versa.

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**Figure 1**

A tree, with height and depth information



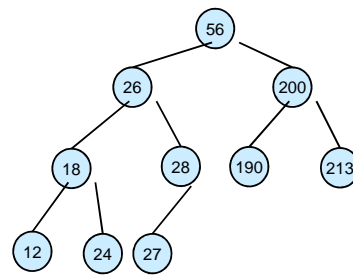
Node	Height	Depth
A	3	0
B	1	1
C	0	1
D	1	1
E	2	1
F	0	2
G	0	2
H	0	2
I	0	2
J	1	2
K	0	3

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# binary tree

- Recursive definition
  1. An empty tree is a binary tree
  2. A node with two child subtrees is a binary tree
  3. Only what you get from 1 by a finite number of applications of 2 is a binary tree.

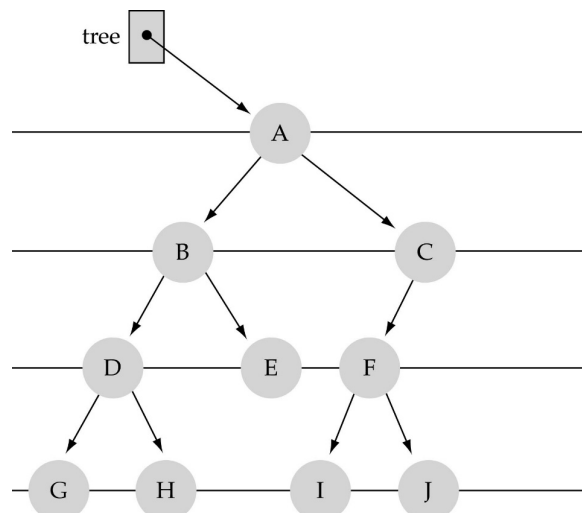
Is this a binary tree?



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## What is a binary tree?

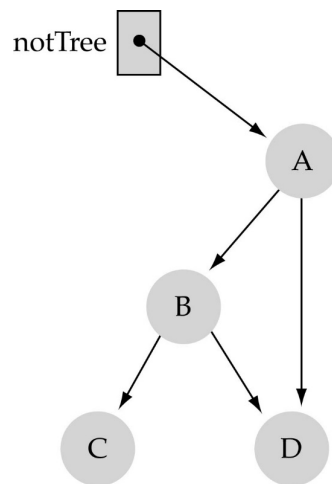
- *Property 1*: each node can have up to two successor nodes.



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# What is a binary tree? (cont.)

- **Property 2:** a unique path exists from the root to every other node

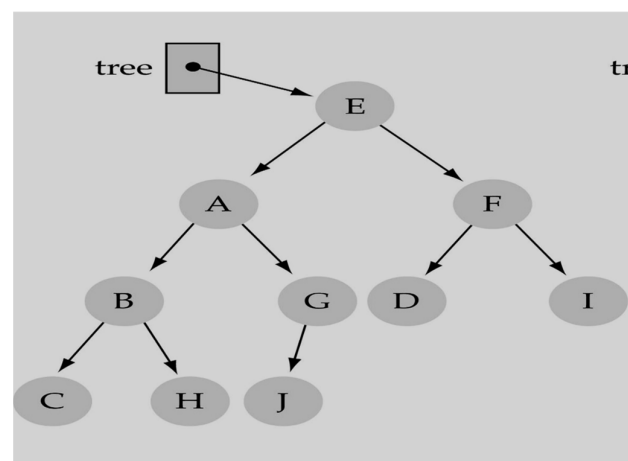


Not a valid binary tree!

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# Some terminology

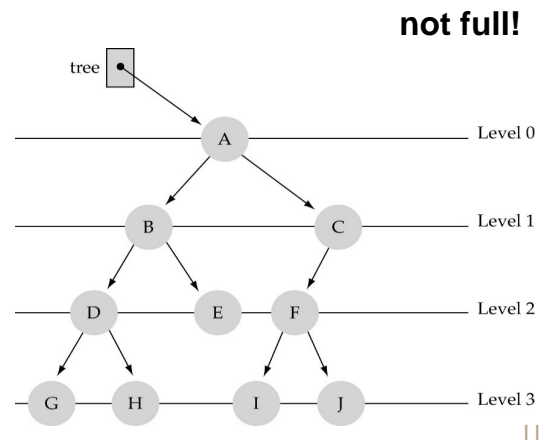
- The successor nodes of a node are called its *children*
- The predecessor node of a node is called its *parent*
- The "beginning" node is called the *root* (has no parent)
- A node without *children* is called a *leaf*



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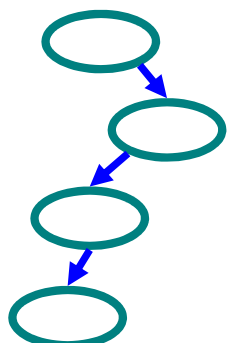
## Some terminology (cont'd)

- Nodes are organized in levels (indexed from 0).
- **Level (or depth) of a node:** number of edges in the path from the root to that node.
- **Height of a tree  $h$ :** #levels =  $L$
- **Full tree:** every node has exactly two children **and** all the leaves are on the same level.

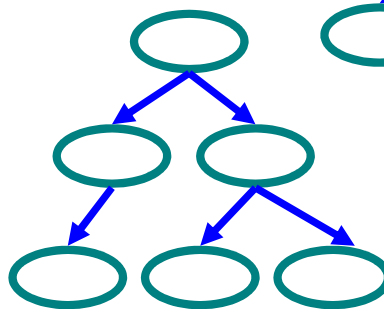


## Types of Binary Trees

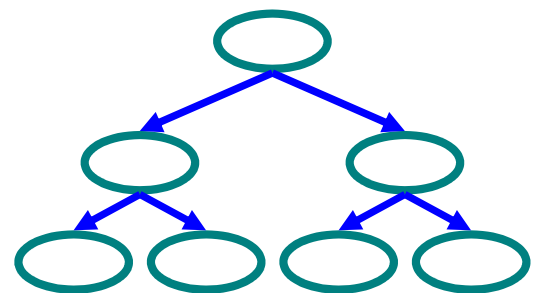
- Degenerate – only one child
- Complete – always two children
- Balanced – “mostly” two children



Degenerate  
binary tree



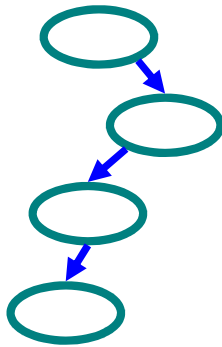
Balanced  
binary tree



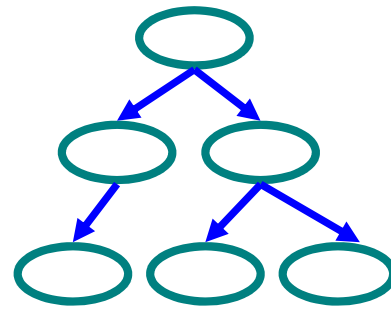
Complete  
binary tree

# Binary Trees Properties

- Degenerate
  - Height =  $O(n)$  for  $n$  nodes
  - Similar to linked list
- Balanced
  - Height =  $O(\log(n))$  for  $n$  nodes
  - Useful for searches



**Degenerate  
binary tree**



**Balanced  
binary tree**

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# Traversals of Binary Trees

## Preorder Traversal of a Binary Tree

- **visit the root**
- **traverse in preorder the children (subtrees)**

Algorithm preorder( $T,v$ ):

Perform the “visit” action for node  $v$

for each child  $w$  of  $v$  in  $T$  do

    Preorder( $T,w$ )

- Preorder traversal can be applied to any binary tree as following:

Algorithm binaryPreorder( $T,v$ ):

if  $v$  has a left child  $u$  in  $T$  then

    binaryPreorder( $T,u$ )     { recursively traverse left subtree }

if  $v$  has a right child  $w$  in  $T$  then

    binaryPreorder( $T,w$ )

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# Traversals of Binary Trees

## Postorder Traversal of a Binary Tree

- **traverse in postorder the children (subtrees)**
- **visit the root**

Algorithm `binaryPostorder(T,v)`:

if `v` has a left child `u` in `T` then

`binaryPostorder(T,u)`

if `v` has a right child `w` in `T` then

`binaryPostorder(T,w)`

perform the “visit” action for node `v`

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# Traversals of Binary Trees

## Inorder Traversal of a Binary Tree

- An additional traversal method for a binary tree is the inorder traversal.
- We visit a node between the recursive traversals of its left and right subtrees.
- The inorder traversal of the subtree rooted at a node `v` in a binary tree `T` is given:

Algorithm `inorder(T,v)`:

if `v` has a left child `u` in `T` then

`inorder(T,u)`

perform the “visit” action for node `v`

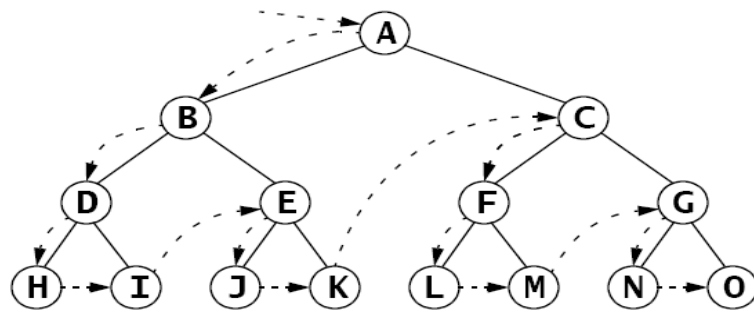
if `v` has a right child `w` in `T` then

`inorder(T,w)`

- The inorder traversal of a binary tree `T` is visiting the nodes of `T` “from left to right”
- Indeed, for every node `v`, the inorder traversal visits `v` after all the nodes in the left subtree of `v` and before all the nodes in the right subtree of `v`.

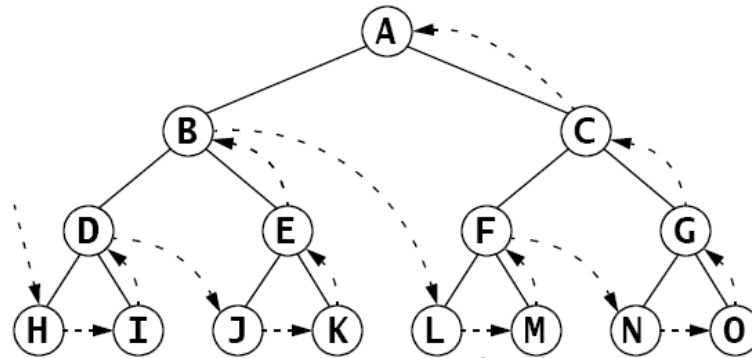
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**Figure The preorder traversal of a binary tree**

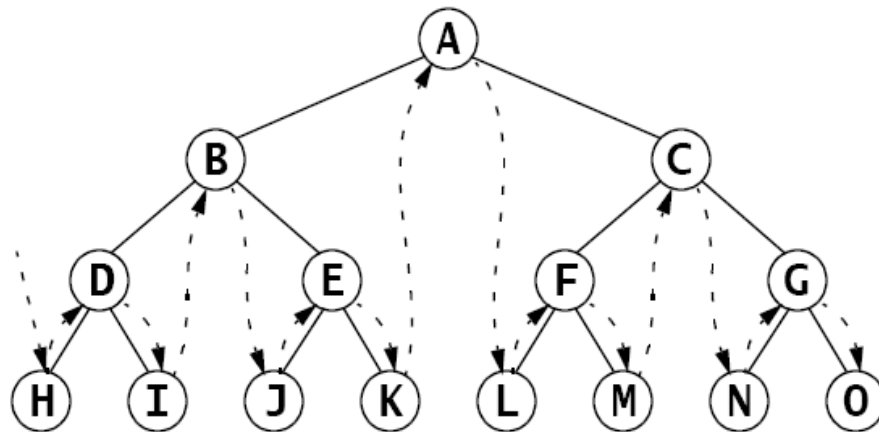
The nodes are visited in the order **A, B, D, H, I, E, J, K, C, F, L, M, G, N, O.**



**Figure The postorder traversal of a binary tree**

The nodes are visited in the order **H, I, D, J, K, E, B, L, M, F, N, O, G, C, A.**

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**Figure 11.18 The inorder traversal of a binary tree**

The nodes are visited in the order **H, D, I, B, J, E, K, A, L, F, M, C, N, G, O.**

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# Example Preorder Traversal

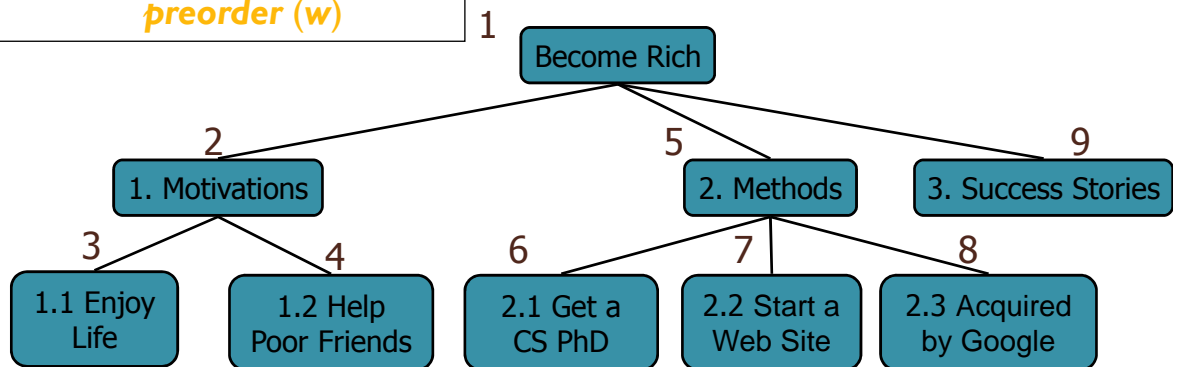
- A traversal visits the nodes of a tree in a systematic manner
- In a preorder traversal, a node is visited before its descendants
- Application: print a structured document

**Algorithm *preOrder*(v)**

*visit*(v)

for each child *w* of *v*

*preorder* (*w*)



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# Example Postorder Traversal

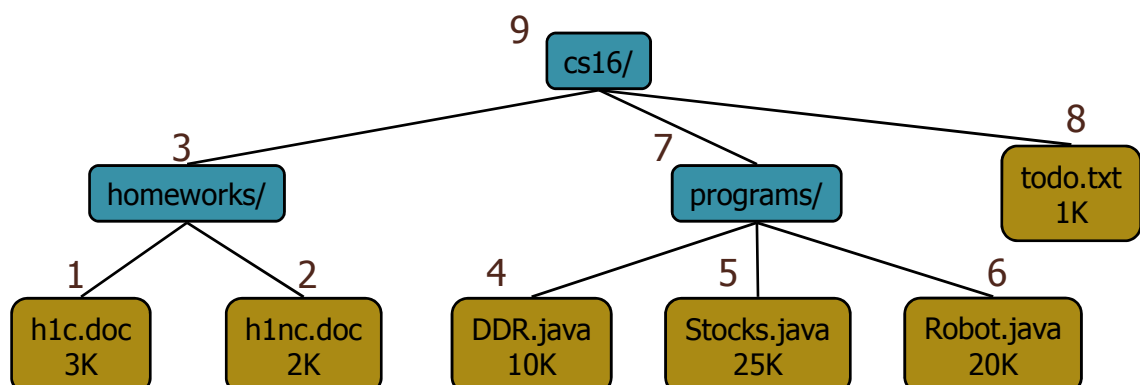
- In a postorder traversal, a node is visited after its descendants
- Application: compute space used by files in a directory and its subdirectories

**Algorithm *postOrder*(v)**

for each child *w* of *v*

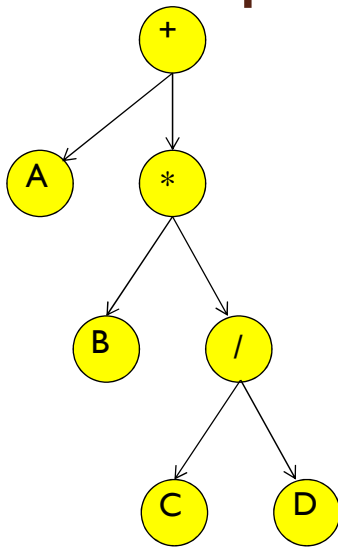
*postOrder* (*w*)

*visit*(v)



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# Example Traversing Trees



- Preorder: Root, then Children
  - + A \* B / C D
- Postorder: Children, then Root
  - A B C D / \* +
- Inorder: Left child, Root, Right child
  - A + B \* C / D

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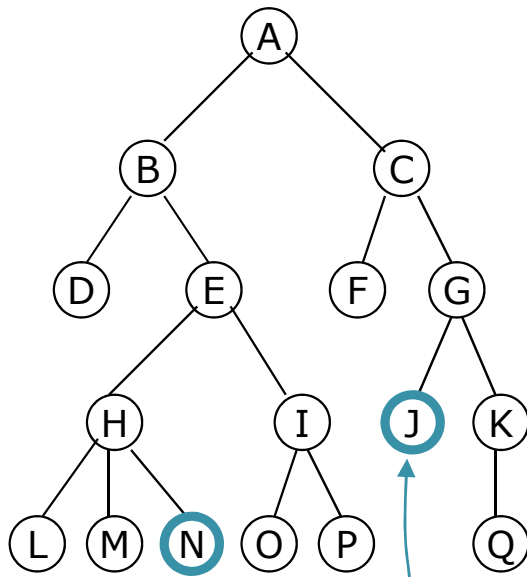
## Example Code for Recursive Preorder

```
void print_preorder ( TreeNode T)
{
    TreeNode P;
    if ( T == NULL ) return;
    else { print_element(T.Element);
          P = T.FirstChild;
          while (P != NULL) {
              print_preorder ( P );
              P = P.NextSibling; }
    }
}
```

What is the running time for a tree with N nodes?

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# Tree searches

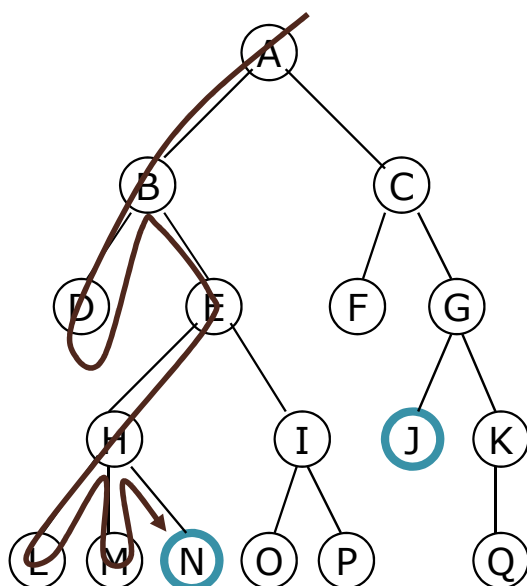


- A tree search starts at the root and explores nodes from there, looking for a goal node (a node that satisfies certain conditions, depending on the problem)
- For some problems, any goal node is acceptable (N or J); for other problems, you want a minimum-depth goal node, that is, a goal node nearest the root (only J)

Goal nodes

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# Depth-first searching



- A depth-first search (DFS) explores a path all the way to a leaf before backtracking and exploring another path
- For example, after searching A, then B, then D, the search backtracks and tries another path from B
- Nodes are explored in the order **A B D E H L M N I O P C F G J K Q**
- N will be found before J

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# How to do depth-first searching

- Put the root node on a stack;  
while (stack is not empty) {  
    remove a node from the stack;  
    if (node is a goal node) return success;  
    put all children of node onto the stack;  
}  
return failure;
- At each step, the stack contains some nodes from each of a number of levels
  - The size of stack that is required depends on the branching factor  $b$
  - While searching level  $n$ , the stack contains approximately  $b \cdot n$  nodes
- When this method succeeds, it doesn't give the path

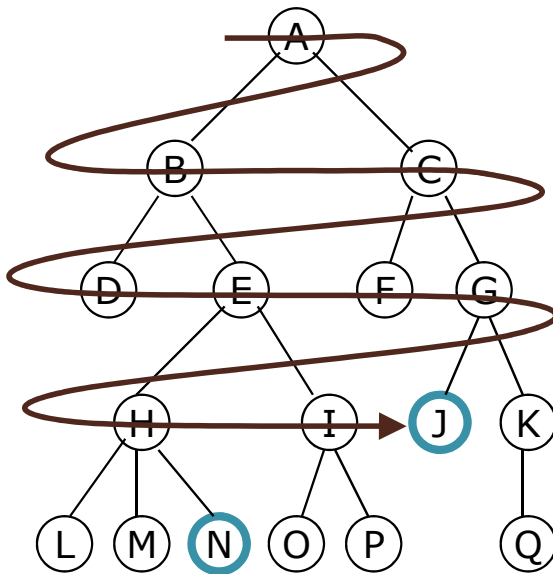
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# Recursive depth-first search

- `search(node)`:  
    { print node and }  
    if node is a goal, { return success; }  
    for each child  $c$  of node { { print  $c$  and }  
        if `search( $c$ )` is successful, { return success; }  
    }  
    return failure;
- The (implicit) stack contains only the nodes on a path from the root to a goal
  - The stack only needs to be large enough to hold the deepest search path
  - When a solution is found, the path is on the (implicit) stack, and can be extracted as the recursion “unwinds”

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# Breadth-first searching



- A breadth-first search (BFS) explores nodes nearest the root before exploring nodes further away
- For example, after searching A, then B, then C, the search proceeds with D, E, F, G
- Node are explored in the order **A B C D E F G H I J K L M N O P Q**
- **J** will be found before **N**

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## How to do breadth-first searching

- Put the root node on a queue;  
while (queue is not empty) {  
    remove a node from the queue;  
    if (node is a goal node) return success;  
    put all children of node onto the queue;  
}  
return failure;
- Just before starting to explore level  $n$ , the queue holds *all* the nodes at level  $n-1$
- In a typical tree, the number of nodes at each level increases *exponentially* with the depth
- Memory requirements may be infeasible
- When this method succeeds, it doesn't give the path
- There is *no* "recursive" breadth-first search equivalent to recursive depth-first search

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# Comparison of algorithms

- **Depth-first searching:**
  - Put the root node on a stack;  
while (stack is not empty) {  
    remove a node from the stack;  
    if (node is a goal node) return success;  
    put all children of node onto the stack;  
}  
return failure;
- **Breadth-first searching:**
  - Put the root node on a queue;  
while (queue is not empty) {  
    remove a node from the queue;  
    if (node is a goal node) return success;  
    put all children of node onto the queue;  
}  
return failure;

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## Depth- vs. breadth-first searching

- When a breadth-first search succeeds, it finds a minimum-depth (nearest the root) goal node
- When a depth-first search succeeds, the found goal node is not necessarily minimum depth
- For a large tree, breadth-first search memory requirements may be excessive
- For a large tree, a depth-first search may take an excessively long time to find even a very nearby goal node
- How can we combine the advantages (and avoid the disadvantages) of these two search techniques?

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# Depth-limited searching

- Depth-first searches may be performed with a depth limit:
- `boolean limitedDFS(Node node, int limit, int depth) {`
  - `if (depth > limit) return failure;`
  - `if (node is a goal node) return success;`
  - `for each child of node {`
    - `if (limitedDFS(child, limit, depth + 1))`
      - `return success;`
  - `}`
  - `return failure;`
  - `}`
- Since this method is basically DFS, if it succeeds then the path to a goal node is in the stack

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# Depth-first iterative deepening

- `limit = 0;`  
`found = false;`  
`while (not found) {`
  - `found = limitedDFS(root, limit, 0);`
  - `limit = limit + 1;`
- `}`
- This searches to depth 0 (root only), then if that fails it searches to depth 1, then depth 2, etc.
- If a goal node is found, it is a nearest node *and* the path to it is on the stack
  - Required stack size is limit of search depth (plus 1)

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## Time requirements for depth-first iterative deepening on binary tree

Nodes at each level	Nodes searched by DFS	Nodes searched by iterative DFS
1	1	1
2	+2 = 3	+3 = 4
4	+4 = 7	+7 = 11
8	+8 = 15	+15 = 26
16	+16 = 31	+31 = 57
32	+32 = 63	+63 = 120
64	+64 = 127	+127 = 247
128	+128 = 255	+255 = 502

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## Time requirements on tree with branching factor 4

Nodes at each level	Nodes searched by DFS	Nodes searched by iterative DFS
1	1	1
4	+4 = 5	+5 = 6
16	+16 = 21	+21 = 27
64	+64 = 85	+85 = 112
256	+256 = 341	+341 = 453
1024	+1024 = 1365	+1365 = 1818
4096	+4096 = 5461	+5461 = 7279
16384	+16384 = 21845	+21845 = 29124

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## Iterative deepening: summary

- When searching a binary tree to depth 7:
  - DFS requires searching 255 nodes
  - Iterative deepening requires searching 502 nodes
  - Iterative deepening takes only about twice as long
- When searching a tree with branching factor of 4 (each node may have four children):
  - DFS requires searching 21845 nodes
  - Iterative deepening requires searching 29124 nodes
  - Iterative deepening takes about  $4/3 = 1.33$  times as long
- The higher the branching factor, the lower the relative cost of iterative deepening depth first search

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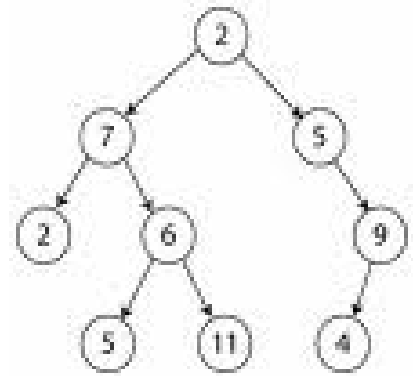
## Other search techniques

- Breadth-first search (BFS) and depth-first search (DFS) are the foundation for all other search techniques
- We might have a **weighted tree**, in which the edges connecting a node to its children have differing “weights”
  - We might therefore look for a “least cost” goal
- The searches we have been doing are **blind searches**, in which we have no prior information to help guide the search
  - If we have some measure of “how close” we are to a goal node, we can employ much more sophisticated search techniques
  - We will *not* cover these more sophisticated techniques
- Searching a graph is very similar to searching a tree, except that we have to be careful not to get caught in a cycle
  - We *will* cover some graph searching techniques

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# How to search a binary tree?

- (1) Start at the root
- (2) Search the tree level by level, until you find the element you are searching for or you reach a leaf.



Is this better than searching a linked list?

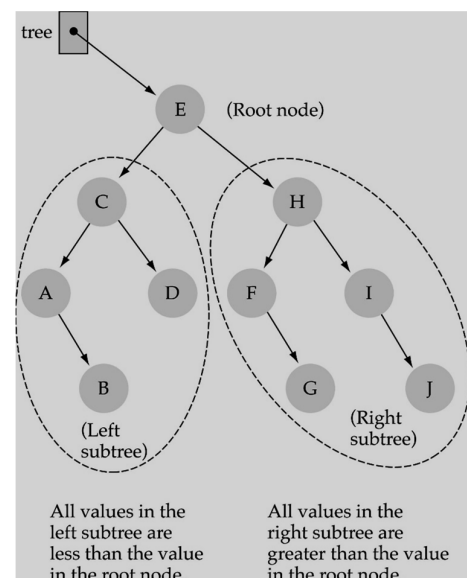
No →  $O(N)$

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# Binary Search Trees (BSTs)

- **Binary Search Tree Property:**

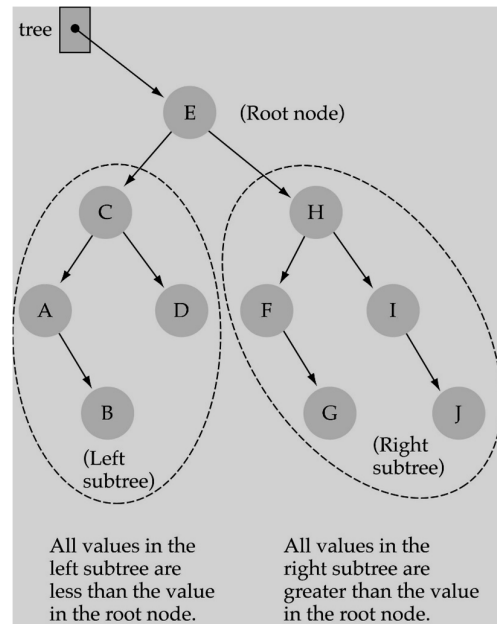
The value stored at a node is *greater* than the value stored at its left child and *less* than the value stored at its right child



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# Binary Search Trees (BSTs)

In a BST, the value stored at the root of a subtree is *greater* than any value in its left subtree and *less* than any value in its right subtree!



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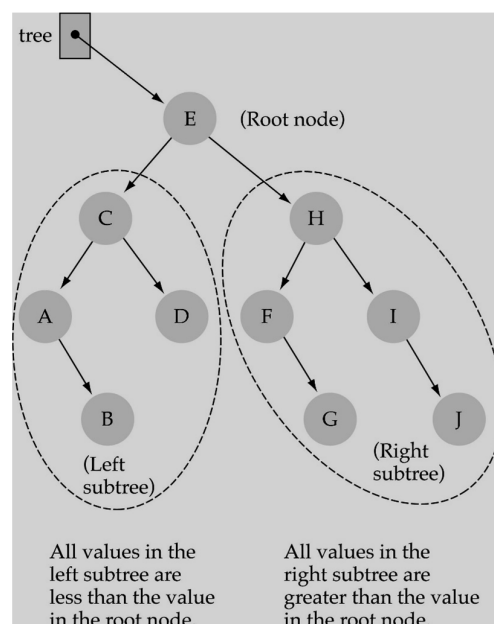
# Binary Search Trees (BSTs)

Where is the smallest element?

**Ans:** leftmost element

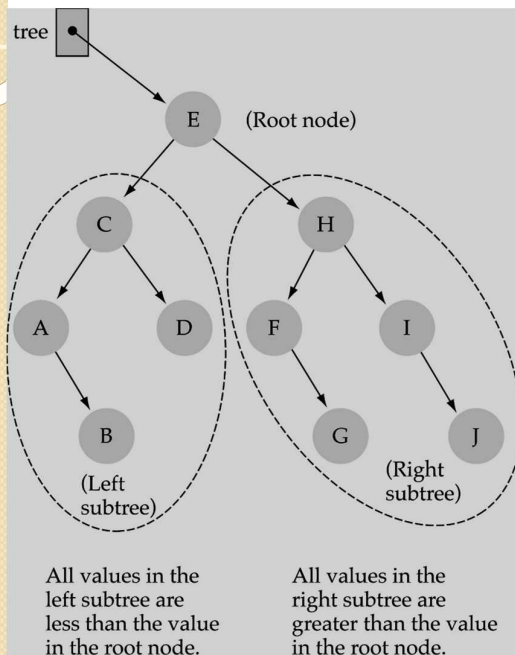
Where is the largest element?

**Ans:** rightmost



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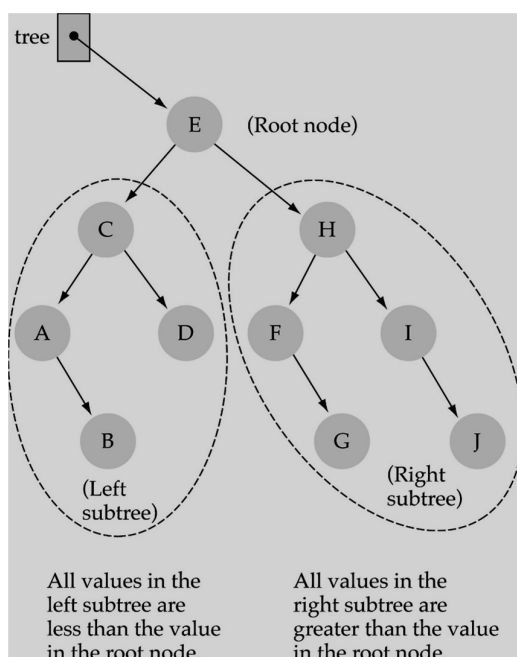
## How to search a binary search tree?



- (1) Start at the root
- (2) Compare the value of the item you are searching for with the value stored at the root
- (3) If the values are equal, then *item found*; otherwise, if it is a leaf node, then *not found*

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## How to search a binary search tree?

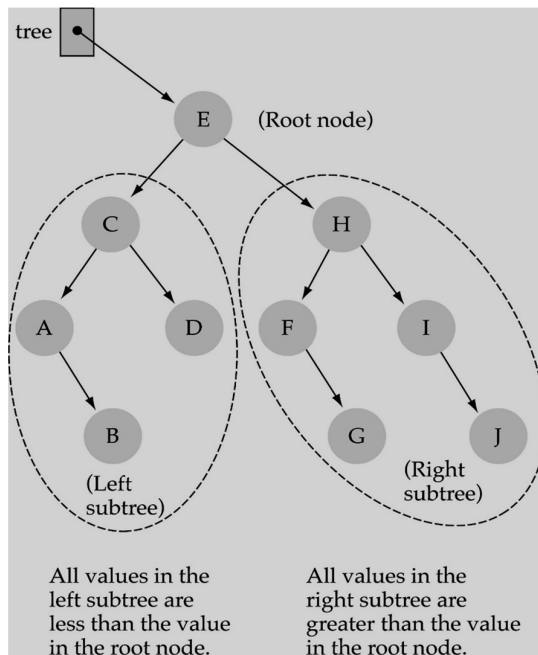


- (4) If it is less than the value stored at the root, then search the **left subtree**
- (5) If it is greater than the value stored at the root, then search the **right subtree**
- (6) Repeat steps 2-6 for the root of the subtree chosen in the previous step 4 or 5

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# How to search a binary search tree?

this better than searching a linked list?



Yes !! --->  $O(\log N)$

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## Binary Tree Implementation

```
Class Node {
    int data; // Could be int, a class, etc
    Node *left, *right; // null if empty

    void insert ( int data ) { ... }
    void delete ( int data ) { ... }
    Node *find ( int data ) { ... }
    ...
}
```

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## Iterative Search of Binary Tree

```
Node *Find( Node *n, int key) {
    while (n != NULL) {
        if (n->data == key) // Found it
            return n;
        if (n->data > key) // In left subtree
            n = n->left;
        else // In right subtree
            n = n->right;
    }
    return null;
}
Node * n = Find( root, 5);
```

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## Recursive Search of Binary Tree

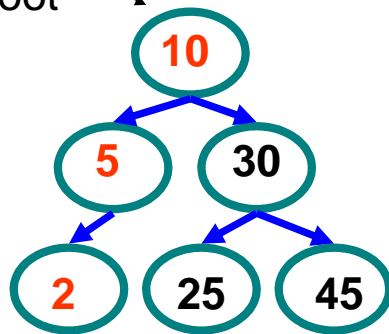
```
Node *Find( Node *n, int key) {
    if (n == NULL) // Not found
        return( n );
    else if (n->data == key) // Found it
        return( n );
    else if (n->data > key) // In left subtree
        return Find( n->left, key );
    else // In right subtree
        return Find( n->right, key );
}
Node * n = Find( root, 5);
```

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# Example Binary Searches

Find ( root, 2 )

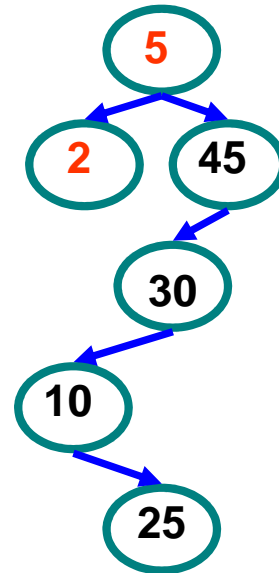
root



10 > 2, left  
5 > 2, left  
2 = 2, found

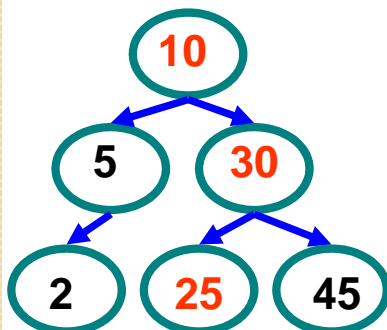
5 > 2, left

2 = 2, found

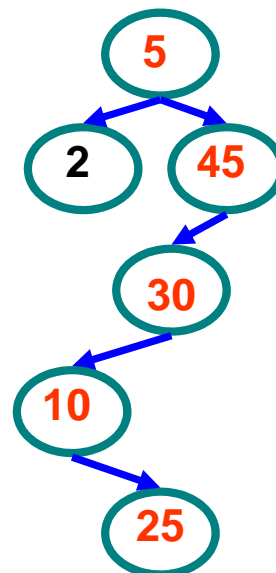


# Example Binary Searches

Find ( root, 25 )



10 < 25, right  
30 > 25, left  
25 = 25, found



5 < 25, right  
45 > 25, left  
30 > 25, left  
10 < 25, right  
25 = 25, found