

# DATA STRUCTURES

## Binary Trees Traversals. Binary Search Trees

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# In the previous lecture:

- Trees
  - Terminology
- Binary trees (I)
  - Terminology
  - Properties
  - Possible representations
  - Traversals (I)
    - Level order
    - Preorder

# In the today's lecture:

- Binary Trees
  - Traversals
    - Inorder
    - Postorder
- Binary Search Trees



*Traversing a tree* means visiting all of its nodes.



For a binary tree there are 4 possible traversals:

- Level order (breadth first) - the same as in case of a (non-binary) tree ✓ (discussed in the previous lecture)
- Preorder ✓ (discussed in the previous lecture)
- Inorder
- Postorder

# Inorder traversal



In case of *inorder* traversal:



▶ Traverse the left subtree - if exists



▶ Visit the *root* of the tree

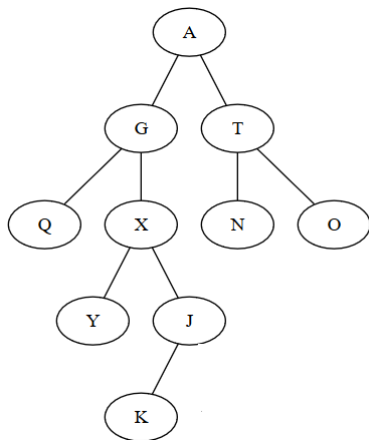


▶ Traverse the right subtree - if exists



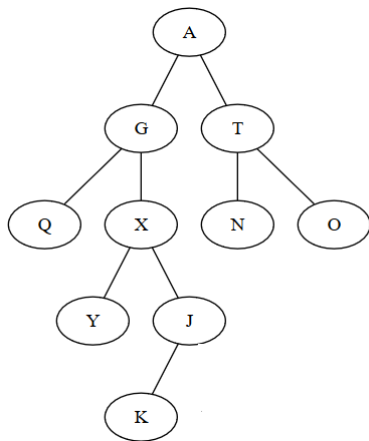
When traversing the subtrees (left or right) the same inorder traversal is applied.

# Inorder traversal example



- Inorder traversal:

## Inorder traversal example



- Inorder traversal: Q, G, Y, X, K, J, A, N, T, O

# Binary tree - linked representation with dynamic allocation



Linked representation with dynamic allocation:

- There is one node for every element of the tree
- The structure representing a node contains:
  - the information
  - a pointer to the left child
  - a pointer to the right child
  - optionally, a pointer to the parent
- NIL denotes the absence of a node
  - $\Rightarrow$  the root of an empty tree is NIL



# Binary tree representation

- In the following, we are going to use the dynamically allocated linked representation for a binary tree:



## Representation of a node in a Binary Tree:

BTNode:

info: TElem

left: ↑ BTNode

right: ↑ BTNode



## Representation of a Binary Tree:

BinaryTree:

root: ↑ BTNode

# Inorder traversal - recursive implementation

- The simplest implementation for inorder traversal is with a recursive algorithm.



## Recursive inorder traversal:

**subalgorithm** `inorder_recursive(node)` **is:**

*//pre: node is a  $\uparrow$  `BTNode`*

# Inorder traversal - recursive implementation

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**if** node  $\neq$  NIL **then**

    inorder\_recursive([node].left)

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`inorder_recursive([node].left)`

    @visit node

`inorder_recursive([node].right)`

**end-if**

**end-subalgorithm**



We need a wrapper subalgorithm to perform the first call to *inorder\_recursive* with the root of the tree as parameter.



# Inorder traversal - recursive implementation

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`inorder_recursive([node].right)`

**end-if**

**end-subalgorithm**



We need a wrapper subalgorithm to perform the first call to *inorder\_recursive* with the root of the tree as parameter.



$\Theta(n)$  for a tree with  $n$  nodes.

# Inorder traversal - non-recursive implementation



We can implement the inorder traversal algorithm without recursion, using an auxiliary stack to store the nodes.



We start with an empty stack and an auxiliary current (pointer to) node (*currentNode*) is set to the root



While *currentNode* is not NIL, push it to the stack and set it to its left child



While stack not empty:



Pop a node and visit it



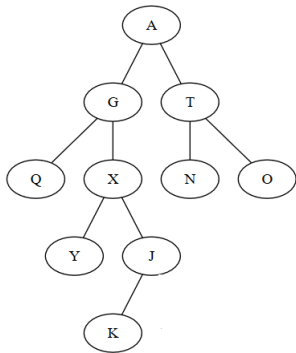
Set *currentNode* to the right child of the popped node



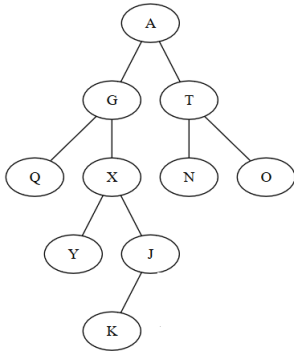
While *currentNode* is not NIL, push it to the stack and set it to its left child



## Inorder traversal - non-recursive implementation example



# Inorder traversal - non-recursive implementation example



- ▶ currentNode: A (Stack: )
- ▶ currentNode: NIL (Stack: A G Q)
- ▶ Visit Q, currentNode NIL (Stack: A G)
- ▶ Visit G, currentNode X (Stack: A)
- ▶ currentNode: NIL (Stack: A X Y)
- ▶ Visit Y, currentNode NIL (Stack: A X)
- ▶ Visit X, currentNode J (Stack: A)
- ▶ currentNode: NIL (Stack: A J K)
- ▶ Visit K, currentNode NIL (Stack: A J)
- ▶ Visit J, currentNode NIL (Stack: A)
- ▶ Visit A, currentNode T (Stack: )
- ▶ currentNode: NIL (Stack: T N)
- ▶ ...

# Inorder traversal - non-recursive implementation



## Iterative inorder traversal:

**subalgorithm** inorder(tree) **is:**

*//pre: tree is a BinaryTree*

# Inorder traversal - non-recursive implementation



## Iterative inorder traversal:

**subalgorithm** inorder(tree) **is:**

*//pre: tree is a BinaryTree*

*init(s) //s:Stack is an auxiliary stack*

# Inorder traversal - non-recursive implementation



## Iterative inorder traversal:

**subalgorithm** inorder(tree) **is:**

*//pre: tree is a BinaryTree*

init(s) *//s:Stack is an auxiliary stack*

currentNode  $\leftarrow$  tree.root

# Inorder traversal - non-recursive implementation



## Iterative inorder traversal:

**subalgorithm** inorder(tree) **is:**

*//pre: tree is a BinaryTree*

init(s) *//s:Stack is an auxiliary stack*

currentNode  $\leftarrow$  tree.root

**while** currentNode  $\neq$  NIL **execute**

    push(s, currentNode)

    currentNode  $\leftarrow$  [currentNode].left

**end-while**

# Inorder traversal - non-recursive implementation



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**subalgorithm** inorder(tree) **is**:

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**while** currentNode  $\neq$  NIL **execute**

    push(s, currentNode)

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**end-while**

**while** not isEmpty(s) **execute**

# Inorder traversal - non-recursive implementation



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    currentNode  $\leftarrow$  [currentNode].left

**end-while**

**while** not isEmpty(s) **execute**

    currentNode  $\leftarrow$  pop(s)

    @visit currentNode



# Inorder traversal - non-recursive implementation



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    currentNode  $\leftarrow$  [currentNode].right

# Inorder traversal - non-recursive implementation



## Iterative inorder traversal:

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**end-while**

**while** not isEmpty(s) **execute**

    currentNode  $\leftarrow$  pop(s)

    @visit currentNode

    currentNode  $\leftarrow$  [currentNode].right

**while** currentNode  $\neq$  NIL **execute**

        push(s, currentNode)

        currentNode  $\leftarrow$  [currentNode].left

**end-while**

**end-while**

**end-subalgorithm**

# Inorder traversal - non-recursive implementation - complexity



Time complexity:  $\Theta(n)$



Extra space complexity:  $O(n)$

# Postorder traversal



In case of *postorder* traversal:



▶ Traverse the left subtree - if exists



▶ Traverse the right subtree - if exists

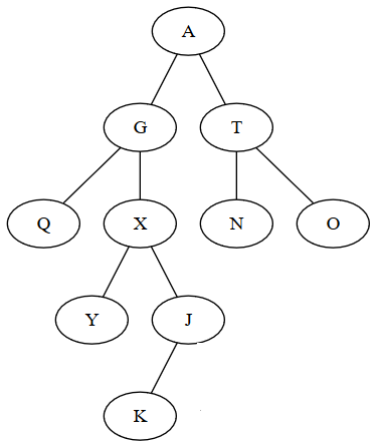


▶ Visit the *root* of the tree



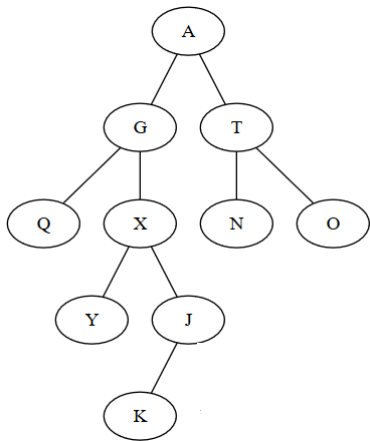
When traversing the subtrees (left or right) the same postorder traversal is applied.

## Postorder traversal example



- Postorder traversal:

## Postorder traversal example



- Postorder traversal: Q, Y, K, J, X, G, N, O, T, A

# Postorder traversal - recursive implementation

- The simplest implementation for postorder traversal is with a recursive algorithm.



## Recursive postorder traversal:

**subalgorithm** `postorder_recursive(node)` **is:**

*//pre: node is a  $\uparrow$  BTreeNode*

**if** `node  $\neq$  NIL` **then**

`postorder_recursive([node].left)`

`postorder_recursive([node].right)`

    @visit node

**end-if**

**end-subalgorithm**



We need again a wrapper subalgorithm to perform the first call to *postorder\_recursive* with the root of the tree as parameter.



The traversal takes  $\Theta(n)$  time for a tree with  $n$  nodes.



## Postorder traversal - non-recursive traversal

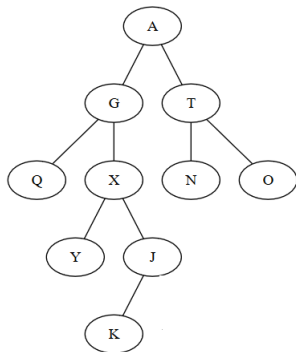
- ▶ We start with an empty stack and a current node (*currentNode*) set to the root of the tree
- ▶ While *currentNode* is not NIL, push to the stack its right child, the *currentNode* and then set *currentNode* to its left child.
- ▶ While the stack is not empty:
  - ▶ Pop a node from the stack (*currentNode*)
  - ▶ If it has a right child, the stack is not empty and contains the right child on top of it, then pop the right child, push *currentNode* and set *currentNode* to its right child.
  - ▶ Otherwise, visit *currentNode* and set it to NIL
  - ▶ While *currentNode* is not NIL, push to the stack its right child, the *currentNode* and then set *currentNode* to its left child.



# Postorder traversal - non-recursive implementation example



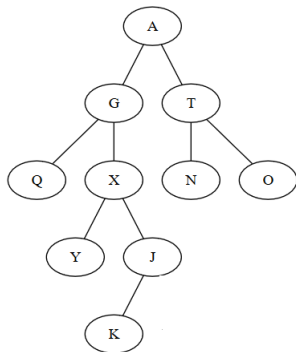
currentNode: A (Stack: )



# Postorder traversal - non-recursive implementation example

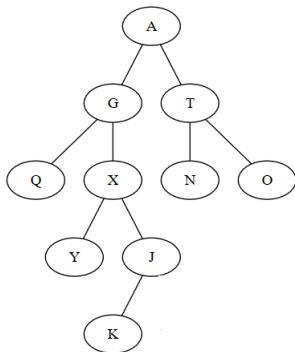
▶ currentNode: A (Stack: )

▶ currentNode: NIL (Stack: T A X G Q)

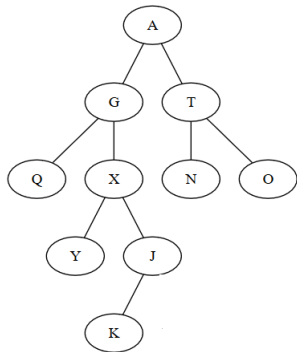


# Postorder traversal - non-recursive implementation example

- ▶ currentNode: A (Stack: )
- ▶ currentNode: NIL (Stack: T A X G Q)
- ▶ Visit Q, currentNode NIL (Stack: T A X G)

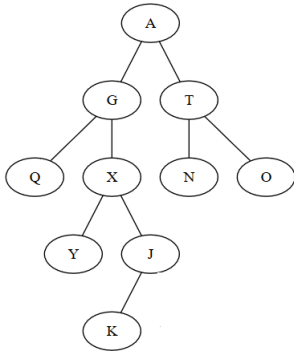


# Postorder traversal - non-recursive implementation example



- ▶ currentNode: A (Stack: )
- ▶ currentNode: NIL (Stack: T A X G Q)
- ▶ Visit Q, currentNode NIL (Stack: T A X G)
- ▶ currentNode: X (Stack: T A G)

# Postorder traversal - non-recursive implementation example



- ▶ currentNode: A (Stack: )
- ▶ currentNode: NIL (Stack: T A X G Q)
- ▶ Visit Q, currentNode NIL (Stack: T A X G)
- ▶ currentNode: X (Stack: T A G)
- ▶ currentNode: NIL (Stack: T A G J X Y)
- ▶ Visit Y, currentNode: NIL (Stack: T A G J X)
- ▶ currentNode: J (Stack: T A G X)
- ▶ currentNode: NIL (Stack: T A G X J K)
- ▶ Visit K, currentNode: NIL (Stack: T A G X J)
- ▶ Visit J, currentNode: NIL (Stack: T A G X)
- ▶ Visit X, currentNode: NIL (Stack: T A G)
- ▶ Visit G, currentNode: NIL (Stack: T A)
- ▶ currentNode: T (Stack: A)
- ▶ currentNode: NIL (Stack: A O T N)

...

# Postorder traversal - non-recursive implementation



## Iterative postorder traversal:

**subalgorithm** postorder(tree) **is:**

*//pre: tree is a BinaryTree*

init(s) *//s: Stack is an auxiliary stack*

currentNode  $\leftarrow$  tree.root

**while** currentNode  $\neq$  NIL **execute**

**if** [currentNode].right  $\neq$  NIL **then**

        push(s, [currentNode].right)

**end-if**

    push(s, currentNode)

    currentNode  $\leftarrow$  [currentNode].left

**end-while**

**while** not isEmpty(s) **execute**

    currentNode  $\leftarrow$  pop(s)

**if** [currentNode].right  $\neq$  NIL and (not isEmpty(s)) and [currentNode].right = top(s) **then**

        pop(s)

        push(s, currentNode)

        currentNode  $\leftarrow$  [currentNode].right

*//continued on the next slide*

# Postorder traversal - non-recursive implementation



## Iterative postorder traversal:

```
else
    @visit currentNode
    currentNode ← NIL
end-if
while currentNode ≠ NIL execute
    if [currentNode].right ≠ NIL then
        push(s, [currentNode].right)
    end-if
    push(s, currentNode)
    currentNode ← [currentNode].left
end-while
end-while end-subalgorithm
```



Time complexity:  $\Theta(n)$



Extra space complexity:  $O(n)$

# Binary tree iterator



The interface of the binary tree contains the *iterator* operation, which should return an iterator.

- This operation receives a parameter that specifies what type of traversal we want to perform with the iterator (*preorder*, *inorder*, *postorder*, *level order*).



The traversal algorithms discussed so far traverse all the elements of the binary tree at once, but an iterator has to do an element-by-element traversal.



For defining an iterator, we have to divide the code into the functions of an iterator: *init*, *getCurrent*, *next*, *valid*.



# Inorder binary tree iterator



## Representation of an inorder iterator:

InorderIterator:

bt: BinaryTree

s: Stack

currentNode:  $\uparrow$ BTNode

# Inorder binary tree iterator - init



## The constructor of an inorder iterator over a binary tree:

**subalgorithm** init (it, bt) **is**:

*//pre: it - is an InorderIterator, bt is a BinaryTree*

it.bt  $\leftarrow$  bt

init(it.s)

node  $\leftarrow$  bt.root

**while** node  $\neq$  NIL **execute**

    push(it.s, node)

    node  $\leftarrow$  [node].left

**end-while**

**if** not isEmpty(it.s) **then**

    it.currentNode  $\leftarrow$  top(it.s)

**else**

    it.currentNode  $\leftarrow$  NIL

**end-if**

**end-subalgorithm**

# Inorder binary tree iterator - getCurrent



**The function for getting the current element of an inorder iterator over a binary tree:**

```
function getCurrent(it) is:  
  if not valid(it) then  
    @throw an exception  
  end-if  
  getCurrent  $\leftarrow$  [it.currentNode].info  
end-function
```

# Inorder binary tree iterator - valid



**The function for checking the validity of an inorder iterator over a binary tree:**

```
function valid(it) is:  
  if it.currentNode = NIL then  
    valid  $\leftarrow$  false  
  else  
    valid  $\leftarrow$  true  
  end-if  
end-function
```

# Inorder binary tree iterator - next



**The operation for advancing to the next element of an inorder iterator over a binary tree:**

**subalgorithm** next(it) **is:**

node  $\leftarrow$  pop(it.s)

**if** [node].right  $\neq$  NIL **then**

node  $\leftarrow$  [node].right

**while** node  $\neq$  NIL **execute**

push(it.s, node)

node  $\leftarrow$  [node].left

**end-while**

**end-if**

**if** not isEmpty(it.s) **then**

it.currentNode  $\leftarrow$  top(it.s)

**else**

it.currentNode  $\leftarrow$  NIL

**end-if**

**end-subalgorithm**



How to remember the difference between traversals?

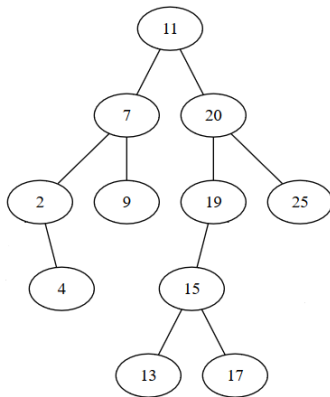
- Left subtree is always traversed before the right subtree.
- The visiting of the root node is what changes:
  - **PRE**order - visit the root **before** the left and right
  - **IN**order - visit the root **between** the left and right
  - **POST**order - visit the root **after** the left and right



A **binary search tree** is a binary tree that satisfies the following property:

- Let  $x$  be a node in a binary search tree.
  - For every node  $y$  from the left subtree of  $x$ , the information from  $y$  is less than or equal to the information from  $x$
  - For every node  $y$  from the right subtree of  $x$ , the information from  $y$  is greater than or equal to the information from  $x$

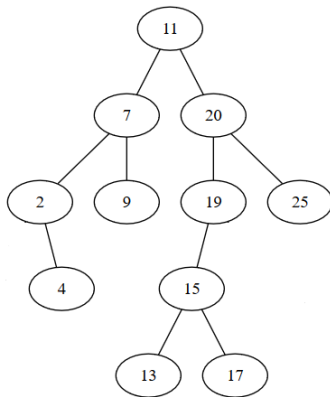
# Binary Search Tree Example



Inorder:



# Binary Search Tree Example



Inorder: 2 4 7 9 11 13 15 17 19 20 25



An inorder traversal of a binary search tree will visit the elements in increasing order.

# Binary Search Tree - terminology



The terminology discussed for binary trees is valid for binary search trees as well:



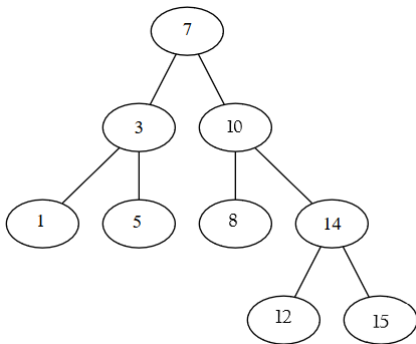
We can have a binary search trees that are:

- full
- complete
- almost complete
- degenerated
- balanced

# Binary tree - Terminology



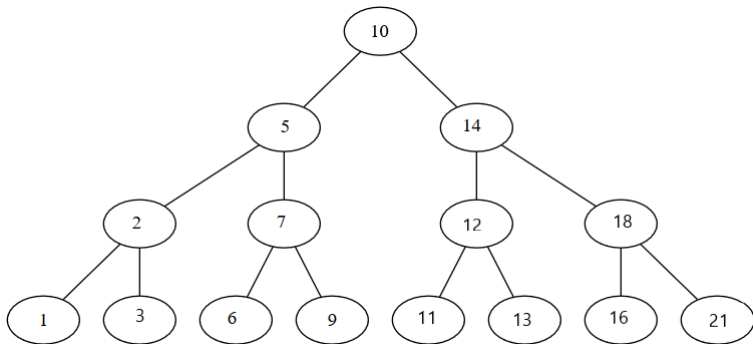
A binary search tree is called **full** if every internal node has exactly two children.



# Binary tree - Terminology



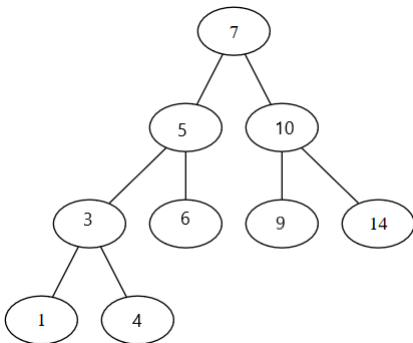
A binary search tree is called **complete** if every level of the tree is completely filled.



## Binary tree - Terminology



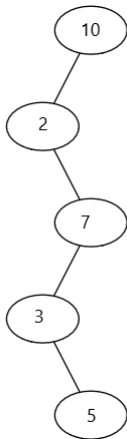
A binary search tree is called **almost complete** if every level of the tree is completely filled, except possibly the bottom level, which is filled from left to right.



## Binary tree - Terminology



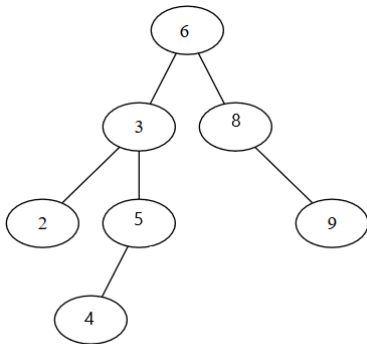
A binary search tree is called **degenerated** if every internal node has exactly one child (it is actually a chain of nodes).



## Binary tree - Terminology



A binary search tree is called **balanced** if the difference between the height of the left and right subtrees is at most 1 for every node from the tree.



# Binary Search Tree



Binary search trees inherit the numerical properties of binary trees:



The number of nodes in a complete binary search tree of height  $N$  is



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The number of nodes in a complete binary search tree of height  $N$  is  $2^{N+1} - 1$  (it is  $1 + 2 + 4 + 8 + \dots + 2^N$ )



The maximum number of nodes in a binary search tree of height  $N$  is

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The number of nodes in a complete binary search tree of height  $N$  is  $2^{N+1} - 1$  (it is  $1 + 2 + 4 + 8 + \dots + 2^N$ )



The maximum number of nodes in a binary search tree of height  $N$  is  $2^{N+1} - 1$  - if the tree is complete.



The minimum number of nodes in a binary search tree of height  $N$  is

# Binary Search Tree



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The maximum number of nodes in a binary search tree of height  $N$  is  $2^{N+1} - 1$  - if the tree is complete.



The minimum number of nodes in a binary search tree of height  $N$  is  $N + 1$  - if the tree is degenerated.



A binary search tree with  $N$  nodes has a height between  $\lceil \log_2 N \rceil$  and  $N - 1$ .



Binary search trees can be used as representation for **sorted** containers

- Sorted Set
- Sorted Map
- etc.



Basic operations:

- searching for an element
- inserting an element
- removing an element



## Other operations:

- get the minimum element
- get the maximum element
- find the successor of an element
- find the predecessor of an element

# Binary Search Tree - Representation

- A linked representation with dynamic allocation for binary search trees:



## Representation of a node in a Binary Search Tree:

BSTNode:

info: TComp

left:  $\uparrow$  BSTNode

right:  $\uparrow$  BSTNode

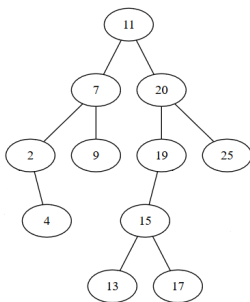


## Representation of a Binary Search Tree:

Binary Search Tree:

root:  $\uparrow$  BSTNode

# Binary Search Tree - search operation



How can we search for 15? What about the 14?

# Binary Search Tree - search operation



How can we **search** for an element in a binary search tree?



The idea of searching for an element *elem*:



We start at the root of the tree.



For each node *node* encountered:



If *node* = *NIL*  $\Rightarrow$  unsuccessful search



If *[node].info* = *elem*  $\Rightarrow$  successful search



If *[node].info* > *elem*  $\Rightarrow$  search recursively the left subtree



If *[node].info* < *elem*  $\Rightarrow$  search recursively the right subtree





## Recursively searching in a Binary Search Tree:

**function** search\_rec (node, elem) **is:**

*//pre: node is a BSTNode and elem is the TElem we are searching for*



## Recursively searching in a Binary Search Tree:

**function** search\_rec (node, elem) **is:**

*//pre: node is a BSTNode and elem is the TElem we are searching for*

**if** node = NIL **then**

    search\_rec  $\leftarrow$  false

**else**



## Recursively searching in a Binary Search Tree:

**function** search\_rec (node, elem) **is:**

*//pre: node is a BSTNode and elem is the TElem we are searching for*

**if** node = NIL **then**

    search\_rec  $\leftarrow$  false

**else**

**if** [node].info = elem **then**

        search\_rec  $\leftarrow$  true



## Recursively searching in a Binary Search Tree:

```
function search_rec (node, elem) is:  
//pre: node is a BSTNode and elem is the TElem we are searching for  
  if node = NIL then  
    search_rec  $\leftarrow$  false  
  else  
    if [node].info = elem then  
      search_rec  $\leftarrow$  true  
    else if [node].info < elem then  
      search_rec  $\leftarrow$  search_rec([node].right, elem)  
    else  
      search_rec  $\leftarrow$  search_rec([node].left, elem)  
    end-if  
  end-function
```

# BST - search operation - recursive implementation - complexity



The time complexity of the *search* operation is

# BST - search operation - recursive implementation - complexity



The time complexity of the *search* operation is  $O(h)$ , where  $h$  is the height of the tree.



The maximum height of a tree with  $n$  nodes is

# BST - search operation - recursive implementation - complexity



The time complexity of the *search* operation is  $O(h)$ , where  $h$  is the height of the tree.



The maximum height of a tree with  $n$  nodes is  $n - 1$  (if the tree is degenerated).



Therefore, the time complexity of the *search* operation can also be expressed as  $O(n)$ .

# BST - search operation - recursive implementation



We need a wrapper to call the recursive function with the root of the tree:



## Recursive searching function - initial call

**function** search (tree, e) **is:**

*//pre: tree is a Binary Search Tree, e is the elem we are looking for*

search  $\leftarrow$  search\_rec(tree.root, e)

**end-function**



# BST - search operation - non-recursive implementation

- The iterative implementation of the *search* operation:



## Iteratively searching in a Binary Search Tree:

**function** search (tree, elem) **is:**

*//pre: tree is a Binary Search Tree and elem is the TElem we are searching for*

# BST - search operation - non-recursive implementation

- The iterative implementation of the *search* operation:



## Iteratively searching in a Binary Search Tree:

**function** search (tree, elem) **is:**

*//pre: tree is a Binary Search Tree and elem is the TElem we are searching for*

currentNode  $\leftarrow$  tree.root

found  $\leftarrow$  false

# BST - search operation - non-recursive implementation

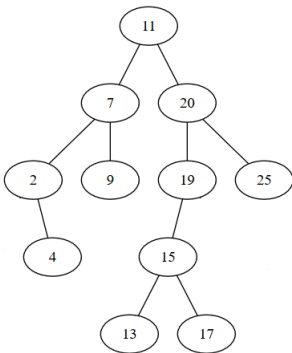
- The iterative implementation of the *search* operation:



## Iteratively searching in a Binary Search Tree:

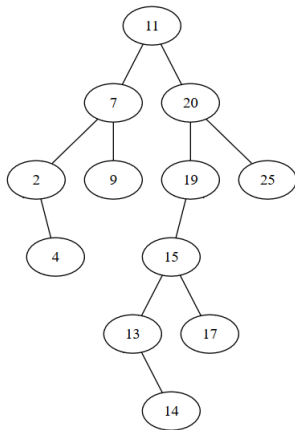
```
function search (tree, elem) is:  
//pre: tree is a Binary Search Tree and elem is the TElem we are searching for  
currentNode  $\leftarrow$  tree.root  
found  $\leftarrow$  false  
while currentNode  $\neq$  NIL and not found execute  
    if [currentNode].info = elem then  
        found  $\leftarrow$  true  
    else if [currentNode].info < elem then  
        currentNode  $\leftarrow$  [currentNode].right  
    else  
        currentNode  $\leftarrow$  [currentNode].left  
    end-if  
end-while  
search  $\leftarrow$  found  
end-function
```

## BST - insert operation



Where can we insert element 14?

## BST - insert operation



# BST - insert operation - recursive implementation

- An function that creates a new node with a given element:



## Creating a node with a given element:

**function** initNode(e) **is:**

*//pre: e is a TComp*

*//post: initNode:  $\uparrow$  BSTNode  $\leftarrow$  a node with e as information*

allocate(newNode)

[newNode].info  $\leftarrow$  e

[newNode].left  $\leftarrow$  NIL

[newNode].right  $\leftarrow$  NIL

initNode  $\leftarrow$  newNode

**end-function**

# BST - insert operation - recursive implementation



## Recursively inserting in a Binary Search Tree::

```
function insert_rec(node, e) is:  
  //pre: node is a BSTNode, e is TComp  
  //post: a node containing e was added in the tree starting from node  
  if node = NIL then  
    node  $\leftarrow$  initNode(e)  
  else if [node].info  $\geq$  e then  
    [node].left  $\leftarrow$  insert_rec([node].left, e)  
  else  
    [node].right  $\leftarrow$  insert_rec([node].right, e)  
  end-if  
  insert_rec  $\leftarrow$  node  
end-function
```

## BST - insert operation - recursive implementation



The time complexity of the *insert* operation is



# BST - insert operation - recursive implementation



The time complexity of the *insert* operation is  $O(h)$  (or  $O(n)$ )



We need a wrapper function to call *insert\_rec* with the root of the tree:



## Recursive insertion function - initial call:

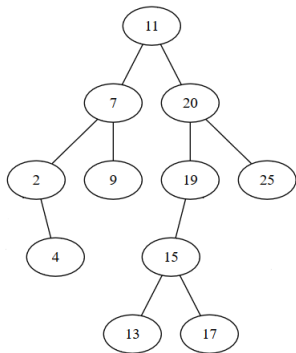
**function** insert (tree, e) **is:**

*//pre: tree is a Binary Search Tree, e is the elem to be inserted*

*tree.root  $\leftarrow$  insert\_rec(tree.root, e)*

**end-function**

## BST - Finding the minimum element



How can we find the minimum element of the binary search tree?

# BST - Finding the minimum element



## Finding the minimum in a Binary Search Tree:

**function** minimum(tree) **is:**

*//pre: tree is a Binary Search Tree*

*//post: minimum = the minimum value from the tree*

# BST - Finding the minimum element



## Finding the minimum in a Binary Search Tree:

**function** minimum(tree) **is:**

*//pre: tree is a Binary Search Tree*

*//post: minimum = the minimum value from the tree*

currentNode  $\leftarrow$  tree.root

**if** currentNode = NIL **then**

    @empty tree, no minimum

**else**

**while** [currentNode].left  $\neq$  NIL **execute**

        currentNode  $\leftarrow$  [currentNode].left

**end-while**

    minimum  $\leftarrow$  [currentNode].info

**end-if**

**end-function**

## BST - Finding the minimum element



The time complexity of the *minimum* operation is

## BST - Finding the minimum element



The time complexity of the *minimum* operation is  $O(h)$  (or  $O(n)$ )



We can adapt the *minimum* function for finding the minimum of a subtree



The parameter would be a pointer to the root of the subtree

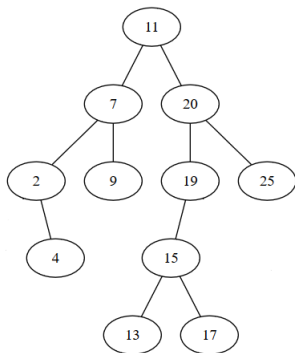


Maximum can be found symmetrically



It is in the rightmost node of the BST

## Finding the parent of a node



How can we find the parent of the node?

# Finding the parent of a node



## Finding the parent of a node in a Binary Search Tree:

**function** parent(tree, node) **is:**

*//pre: tree is a Binary Search Tree, node is a pointer to a BSTNode, node  $\neq$  NIL*

*//post: returns the parent of node, or NIL if node is the root*

c  $\leftarrow$  tree.root

**if** c = node **then** *//node is the root*

parent  $\leftarrow$  NIL

**else**

**while** c  $\neq$  NIL **and** [c].left  $\neq$  node **and** [c].right  $\neq$  node **execute**

**if** [c].info  $\geq$  [node].info **then**

c  $\leftarrow$  [c].left

**else**

c  $\leftarrow$  [c].right

**end-if**

**end-while**

parent  $\leftarrow$  c

**end-if**

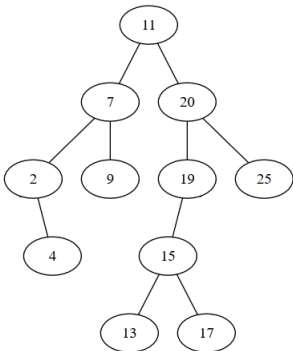
**end-function**



Complexity:  $O(h)$  (or  $O(n)$ )



## BST - Finding the successor



How can we find the successor of a node?



How can we find the successor of 11? What about the successor of 17?

## BST - Finding the successor of a node



How can we find the **successor** of a node  $x$  in a binary search tree?



The idea is the following:



If  $x$  has a non-empty right subtree:



Its successor is just the leftmost node in  $x$ 's right subtree



If  $x$  does not have a right subtree:



The successor of  $x$  is the lowest ancestor of the node whose left child is also an ancestor of  $x$



We go up the tree from  $x$  until we encounter a node that is the left child of its parent. The parent of that node is the successor.

# BST - Finding the successor of a node



## Finding the successor of a node in a Binary Search Tree:

**function** successor(tree, x) **is:**

*//pre: tree is a Binary Search Tree, x is a pointer to a BSTNode,  $x \neq \text{NIL}$*

*//post: returns the node with the next value after the value from x*

*//or NIL if x is the maximum*

**if** [x].right  $\neq$  NIL **then**

    c  $\leftarrow$  [x].right

**while** [c].left  $\neq$  NIL **execute**

        c  $\leftarrow$  [c].left

**end-while**

    successor  $\leftarrow$  c

**else**

    p  $\leftarrow$  parent(tree, x)

**while** p  $\neq$  NIL **and** [p].left  $\neq$  x **execute**

        x  $\leftarrow$  p

        p  $\leftarrow$  parent(tree, p)

**end-while**

    successor  $\leftarrow$  p

**end-if**

**end-function**

## BST - Finding the successor of a node



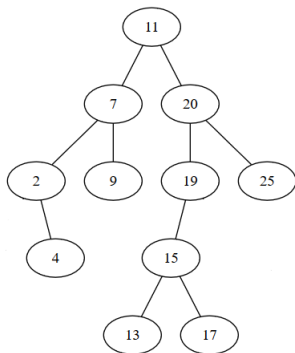
Time complexity of *successor* depends on *parent* function:

- If *parent* runs in  $\Theta(1) \Rightarrow$  complexity of successor is  $O(h)$  (or  $O(n)$ )
- If *parent* runs in  $O(n) \Rightarrow$  complexity of successor is  $O(h^2)$  (or  $O(n^2)$ )



Similar to *successor*, we can define a *predecessor* function as well.

## BST - Remove a node



How can we remove the value 25? What about removing 2?  
What about removing 11?

# BST - Remove a node



When we want to remove a value (a node  $x$  containing the given value) from a BST we have 3 cases:



$x$  has no children



Set the corresponding child of the parent to NIL



$x$  has one descendant



Set the corresponding child of the parent to the child of  $x$



$x$  has two children



Find its predecessor  $p$ , let it take the position of  $x$  in the tree and delete the node containing  $p$

**OR**



Find its successor  $s$ , let it replace  $x$  in the tree and remove the node currently containing it from the tree.

# BST - Removing an element



## Recursively removing an element from a BST:

**function** remove\_rec(p, e) **is:**

*//pre: p:  $\uparrow$  BSTNode, e: TComp*

*//post: e is removed from the BST rooted by p; return the root of the new (sub)tree*

**if** p = NIL **then**

    remove\_rec  $\leftarrow$  p

**else**

**if** e < [p].info **then**

        [p].left  $\leftarrow$  remove\_rec([p].left, e)

        remove\_rec  $\leftarrow$  p

**else if** e > [p].info **then**

        [p].right  $\leftarrow$  remove\_rec([p].right, e)

        remove\_rec  $\leftarrow$  p

**else**

**if** [p].left  $\neq$  NIL **and** [p].right  $\neq$  NIL **then**

            temp  $\leftarrow$  minimum([p].right)

            [p].info  $\leftarrow$  [temp].info

            [p].right  $\leftarrow$  remove\_rec([p].right, [p].info)

            remove\_rec  $\leftarrow$  p

*//continued on the next slide*

# BST - Removing an element



## Recursively removing an element from a BST:

```
    else if [p].left = NIL then
        remove_rec ← [p].right
    else
        remove_rec ← [p].left
    end-if
end-if
end-function
```



The time complexity of the *remove* operation is  $O(h)$  (or  $O(n)$ )



## BST - Removing an element



We need a wrapper function to call *remove\_rec* with the root of the tree:



### Recursively deletion an from a BST - - initial call:

**function** remove (tree, e) **is:**

*//pre: tree is a Binary Search Tree, e is the elem to be removed*

*//post: tree' is a Binary Search Tree obtained by removing e from tree*

tree.root  $\leftarrow$  remove\_rec(tree.root, e)

**end-function**

- Traversals
  - The same as for binary trees

# Containers represented using BSTs



BSTs are used for representing the following containers:

- ADT Set



set in C++ STL, TreeSet in Guava (Google Core Libraries for Java)  
(implemented using balanced BST)

- ADT Map (Sorted Map)



map in C++ STL, TreeMap in Guava (for Java)

- ADT MultiMap (Sorted MultiMap)



multimap in C++ STL, TreeMultimap in Guava (for Java)

- ADT Bag



TreeMultiset in Guava (for Java)

# Binary Search Trees- Applications



Real-world applications of binary search tree data structure:



Unix Kernel

- Managing Virtual Memory Areas (VMAs)



Compilers

- For implementing Syntax Tress



Routing tables

- A routing table is used to link routers in a network. It is usually implemented with a variation of a binary search tree.



Data compression

- Huffman coding



## Bibliography

- David M. Mount, *Lecture notes for the course Data Structures* (CMSC 420), at the Dept. of Computer Science, University of Maryland, College Park, 2001
- Thomas H. Cormen, Charles E. Leiserson, Ronald L. Rivest, and Clifford Stein, *Introduction to Algorithms*, Third Edition, The MIT Press, 2009
- Narasimha Karumanchi, *Data Structures and Algorithms Made Easy: Data Structures and Algorithmic Puzzles*, Fifth Edition, 2016
- Clifford A. Shaffer, *A Practical Introduction to Data Structures and Algorithm Analysis*, Third Edition, 2010

Thank you

► TREES  
THANK  
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BINARY  
YOU