

DATA STRUCTURES AND ALGORITHMS

LECTURE 13

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In Lecture 12...

- Binary Tree Traversals
- Huffman coding
- Binary Search Tree

Today

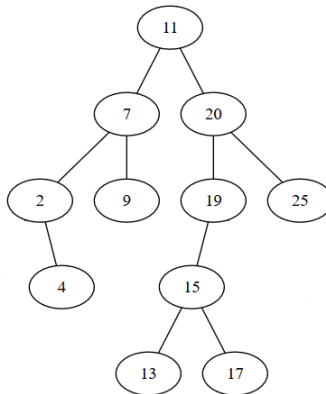
1 Binary Search Trees

2 AVL Trees

Binary search trees

- A *Binary Search Tree* is a binary tree that satisfies the following property:
 - if x is a node of the binary search tree then:
 - 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
- In order to have a binary search tree, we need to store information in the tree that is of type *TComp*.
- Obviously, the relation used to order the nodes can be considered in an abstract way (instead of having " \leq " as in the definition).

Binary Search Tree Example



- If we do an inorder traversal of a binary search tree, we will get the elements in increasing order (according to the relation used).

Binary Search Tree

- Binary search trees can be used as representation for sorted containers: sorted maps, sorted multimaps, priority queues, sorted sets, etc.
- In order to implement these containers on a binary search tree, we need to define the following basic operations:
 - search for an element
 - insert an element
 - remove an element
- Other operations that can be implemented for binary search trees (and can be used by the containers): get minimum/maximum element, find the successor/predecessor of an element.

Binary Search Tree - Representation

- We will use a linked representation with dynamic allocation (similar to what we used for binary trees)
- We will assume that the info is of type TComp and use the relation " \leq "

BSTNode:

info: TComp

left: \uparrow BSTNode

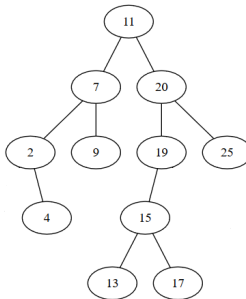
right: \uparrow BSTNode

BinarySearchTree:

root: \uparrow BSTNode

Binary Search Tree - search operation

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



- How can we search for element 15? And for element 14?

BST - search operation - recursive implementation

- How can we implement the *search algorithm* recursively?

BST - search operation - recursive implementation

- How can we implement the *search algorithm* recursively?

```
function search_rec (node, elem) is:  
//pre: node is a BSTNode and elem is the TComp 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 of the search algorithm:

BST - search operation - recursive implementation

- Complexity of the search algorithm: $O(h)$ (which is $O(n)$)
- Since the *search* algorithm takes as parameter a node, we need a wrapper function to call it with the root of the tree.

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

//pre: tree is a BinarySearchTree, e is the elem we are looking for
search \leftarrow search_rec(tree.root, e)

end-function

BST - search operation - non-recursive implementation

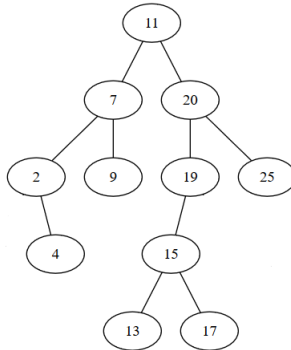
- How can we define the search operation non-recursively?

BST - search operation - non-recursive implementation

- How can we define the search operation non-recursively?

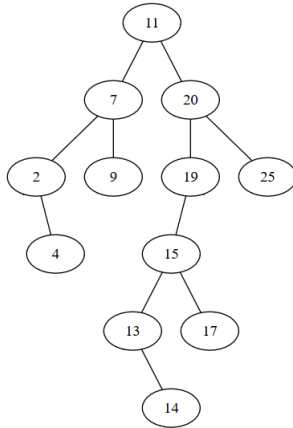
```
function search (tree, elem) is:  
//pre: tree is a BinarySearchTree and elem is the TComp we are searching for  
currentNode  $\leftarrow$  tree.root  
found  $\leftarrow$  false  
while currentNode  $\neq$  NIL and not found execute  
    if [currentNode].info = elem then  
        found  $\leftarrow$  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



- How/Where can we insert element 14?

BST - insert operation



BST - insert operation - recursive implementation

- How can we implement the *insert* operation?

BST - insert operation - recursive implementation

- How can we implement the *insert* operation?
- We will start with a function that creates a new node given the information to be stored in it.

function initNode(e) **is:**

//pre: e is a TComp

//post: initNode \leftarrow a node with e as information

allocate(node)

[node].info \leftarrow e

[node].left \leftarrow NIL

[node].right \leftarrow NIL

initNode \leftarrow node

end-function

BST - insert operation - recursive implementation

```
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
```

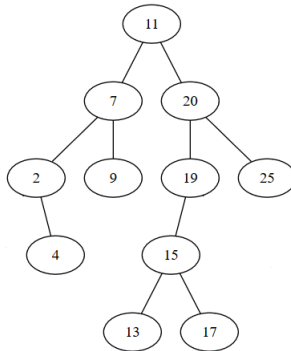
- Complexity:

BST - insert operation - recursive implementation

```
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
```

- Complexity: $O(n)$
- Like in case of the *search* operation, we need a wrapper function to call *insert_rec* with the root of the tree.

BST - Finding the minimum element



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

BST - Finding the minimum element

```
function minimum(tree) is:  
  //pre: tree is a BinarySearchTree  
  //post: minimum  $\leftarrow$  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
```

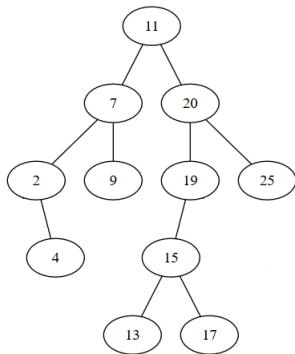
BST - Finding the minimum element

- Complexity of the minimum operation:

BST - Finding the minimum element

- Complexity of the minimum operation: $O(n)$
- We can have an implementation for the minimum, when we want to find the minimum element of a subtree, in this case the parameter to the function would be a node, not a tree.
- We can have an implementation where we return the node containing the minimum element, instead of just the value (depends on what we want to do with the operation)
- Maximum element of the tree can be found similarly.

Finding the parent of a node



- Given a node, how can we find the parent of the node?
(assume a representation where the node has no parent field).

Finding the parent of a node

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

//pre: tree is a BinarySearchTree, node is a pointer to a BSTNode, node \neq NIL

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

$c \leftarrow \text{tree.root}$

if $c = \text{node}$ **then** *//node is the root*

 parent \leftarrow NIL

else

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

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

$c \leftarrow [c].\text{left}$

else

$c \leftarrow [c].\text{right}$

end-if

end-while

 parent $\leftarrow c$

end-if

end-function

● Complexity:

Finding the parent of a node

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

//pre: tree is a BinarySearchTree, 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

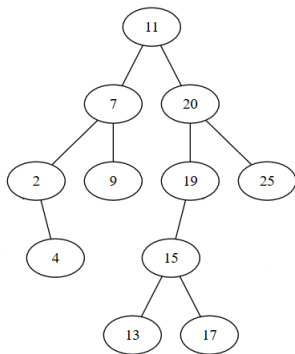
parent \leftarrow c

end-if

end-function

● Complexity: $O(n)$

BST - Finding the successor of a node



- Given a node, how can we find the node containing the next value (considering the relation used for ordering the elements)?
- How can we find the next after 11? After 17? After 13?

BST - Finding the successor of a node

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

//pre: tree is a BinarySearchTree, node is a pointer to a BSTNode, node \neq NIL

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

//or NIL if node is the maximum

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

 c \leftarrow [node].right

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

 c \leftarrow [c].left

end-while

 successor \leftarrow c

else

 p \leftarrow parent(tree, c)

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

 c \leftarrow p

 p \leftarrow parent(tree, p)

end-while

 successor \leftarrow p

end-if

end-function

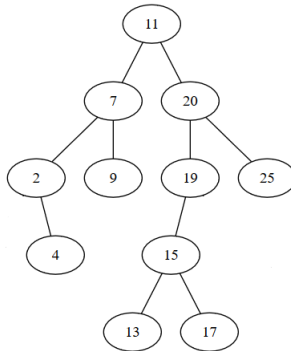
BST - Finding the successor of a node

- Complexity of successor:

BST - Finding the successor of a node

- Complexity of successor: depends on parent function:
 - If *parent* is $\Theta(1)$, complexity of successor is $O(n)$
 - If *parent* is $O(n)$, complexity of successor is $O(n^2)$
- What if, instead of receiving a node, successor algorithm receives as parameter a value from a node (assume unique values in the nodes)? How can we find the successor then?
- Similar to successor, we can define a predecessor function as well.

BST - Remove a node



- How can we remove the value 25? And value 2? And value 11?

BST - Remove a node

- When we want to remove a value (a node containing the value) from a binary search tree we have three cases:
 - The node to be removed has no descendant
 - Set the corresponding child of the parent to NIL
 - The node to be removed has one descendant
 - Set the corresponding child of the parent to the descendant
 - The node to be removed has two descendants
 - Find the maximum of the left subtree, move it to the node to be deleted, and delete the maximum
 - OR**
 - Find the minimum of the right subtree, move it to the node to be deleted, and delete the minimum

BST - Remove a node

```
function removeRec(node, elem) is  
//pre: node is a pointer to a BSTreeNode and elem is the value we remove  
//post: the node with value elem was removed from the (sub)tree that starts  
//with node  
  if node = NIL then  
    removeRec  $\leftarrow$  NIL  
  else if [node].info > elem then  
    [node].left  $\leftarrow$  removeRec([node].left, elem)  
    removeRec  $\leftarrow$  node  
  else if [node].info < elem then  
    [node].right  $\leftarrow$  removeRec([node].right, elem)  
    removeRec  $\leftarrow$  node  
  else //[node].info = elem, we want to remove node  
    //continued on the next slide...
```

```
if [node].left = NIL and [node].right = NIL then
    removeRec ← NIL
else if [node].left = NIL then
    removeRec ← [node].right
else if [node].right = NIL then
    removeRec ← [node].left
else
    min ← minimum([node].right)
    [node].info ← [min].info
    [node].right ← removeRec([node].right, [min].info)
    removeRec ← node
end-if
end-if
end-function
```

- We assume that *minimum* returns a node with the minimum, not just the value.
- Complexity:

```
if [node].left = NIL and [node].right = NIL then
    removeRec ← NIL
else if [node].left = NIL then
    removeRec ← [node].right
else if [node].right = NIL then
    removeRec ← [node].left
else
    min ← minimum([node].right)
    [node].info ← [min].info
    [node].right ← removeRec([node].right, [min].info)
    removeRec ← node
end-if
end-if
end-function
```

- We assume that *minimum* returns a node with the minimum, not just the value.
- Complexity: $O(n)$

Binary Search Tree

- Think about it:
 - Can we define a Sorted List on a Binary Search Tree? If not, why not? If yes, how exactly? What would be the most complicated part?

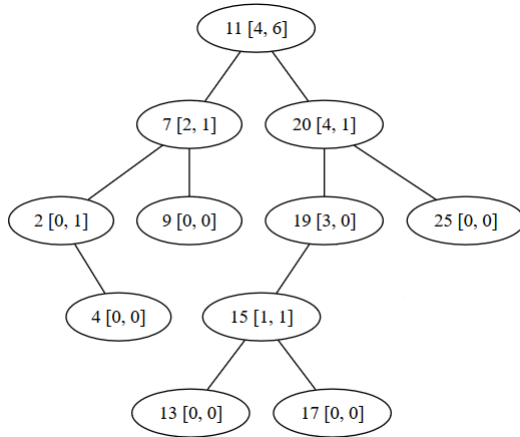
Binary Search Tree

- Think about it:
 - Can we define a Sorted List on a Binary Search Tree? If not, why not? If yes, how exactly? What would be the most complicated part?
 - Lists have positions and operations based on positions. In case of a SortedList we have an operation to remove an element from a position and to return an element from a position (but no insert to position). How can we keep track of positions in a binary search tree?

Binary Search Tree

- Think about it:
 - Can we define a Sorted List on a Binary Search Tree? If not, why not? If yes, how exactly? What would be the most complicated part?
 - Lists have positions and operations based on positions. In case of a SortedList we have an operation to remove an element from a position and to return an element from a position (but no insert to position). How can we keep track of positions in a binary search tree?
 - Hint: Keep in each node the number of nodes in the left subtree and the number of nodes in the right subtree.

Binary Search Tree



- Obviously, these values have to be modified when we add/remove an element.

Balanced Binary Search Trees

- Specific operations for binary trees run in $O(h)$ time, which can be $O(n)$ in worst case
- Best case is a balanced tree, where height of the tree is $O(\log_2 n)$

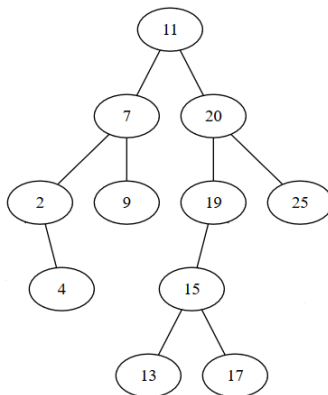
Balanced Binary Search Trees

- Specific operations for binary trees run in $O(h)$ time, which can be $O(n)$ in worst case
- Best case is a balanced tree, where height of the tree is $O(\log_2 n)$
- To reduce the complexity of algorithms, we want to keep the tree balanced. In order to do this, we want every node to be balanced.
- When a node loses its balance, we will perform some operations (called rotations) to make it balanced again.

AVL Trees

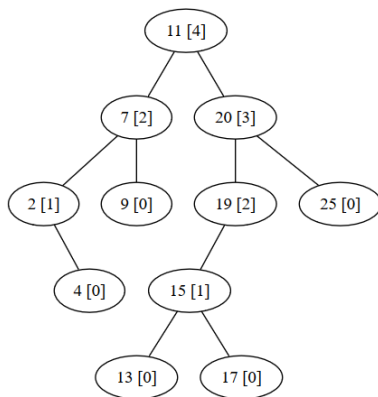
- Definition: An AVL (Adelson-Velskii Landis) tree is a binary tree which satisfies the following property (AVL tree property):
 - If x is a node of the AVL tree:
 - the difference between the height of the left and right subtree of x is 0, 1 or -1 (balancing information)
- Observations:
 - Height of an empty tree is -1
 - Height of a single node is 0

AVL Trees



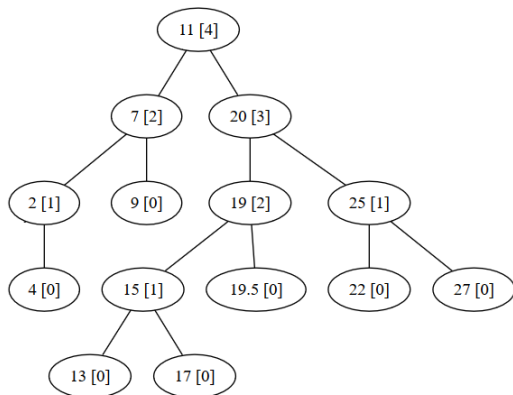
- Is this an AVL tree?

AVL Trees



- Values in square brackets show the height of a node. The tree is not an AVL tree, because the difference between the heights of the left and right subtree for nodes 19 and 20 is 2.

AVL Trees



- This is an AVL tree.

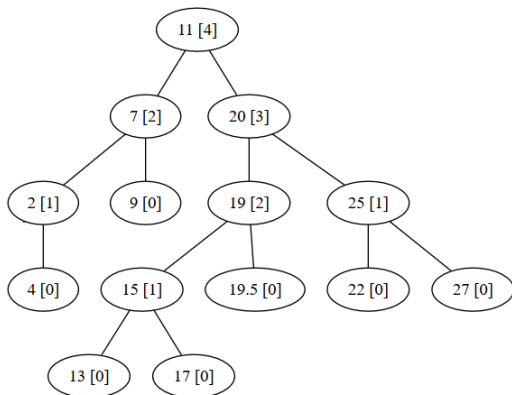
AVL Trees - rotations

- Adding or removing a node might result in a binary tree that violates the AVL tree property.
- In such cases, the property has to be restored and only after the property holds again is the operation (add or remove) considered finished.
- The AVL tree property can be restored with operations called **rotations**.

AVL Trees - rotations

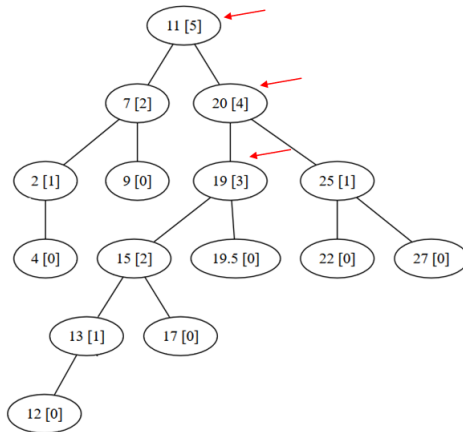
- After an insertion, only the nodes on the path to the modified node can change their height.
- We check the balancing information on the path from the modified node to the root. When we find a node that does not respect the AVL tree property, we perform a suitable *rotation* to rebalance the (sub)tree.

AVL Tress - rotations



- What if we insert element 12?

AVL Trees - rotations

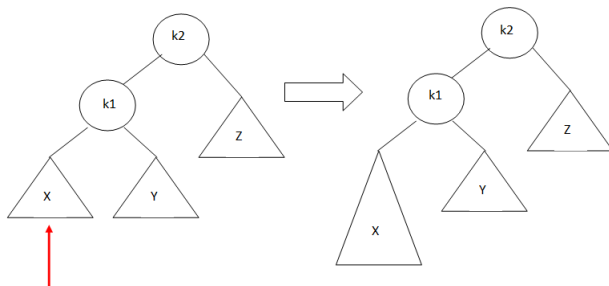


- Red arrows show the unbalanced nodes. We will rebalance node 19.

AVL Trees - rotations

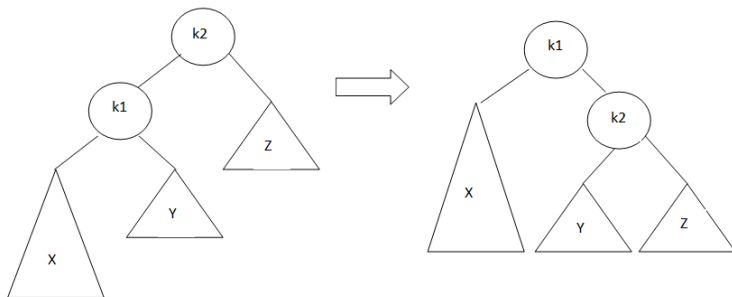
- Assume that at a given point α is the node that needs to be rebalanced.
- Since α was balanced before the insertion, and is not after the insertion, we can identify four cases in which a violation might occur:
 - Insertion into the left subtree of the left child of α
 - Insertion into the right subtree of the left child of α
 - Insertion into the left subtree of the right child of α
 - Insertion into the right subtree of the right child of α

AVL Trees - rotations - case 1

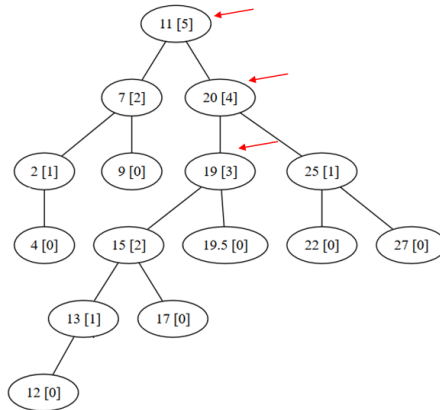


- Solution: single rotation to right

AVL Trees - rotation - Single Rotation to Right

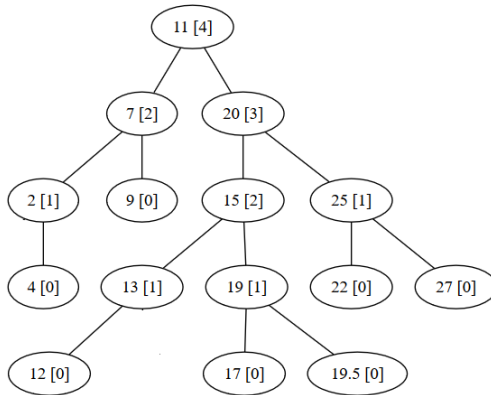


AVL Trees - rotations - case 1 example

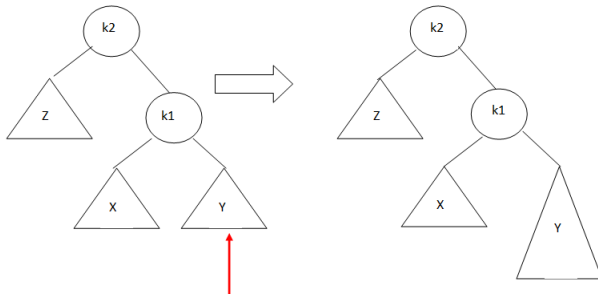


- Node 19 is imbalanced, because we inserted a new node (12) in the left subtree of the left child.

AVL Trees - rotation - case 1 example

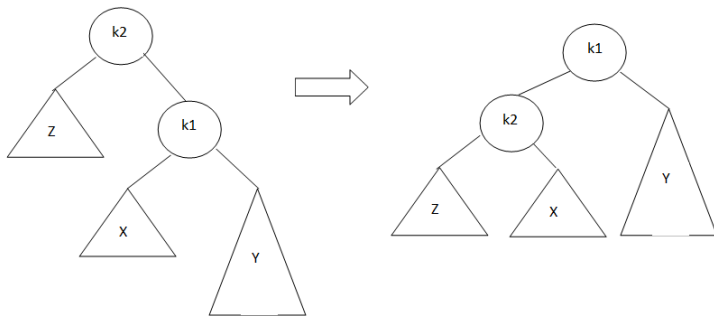


AVL Trees - rotations - case 4

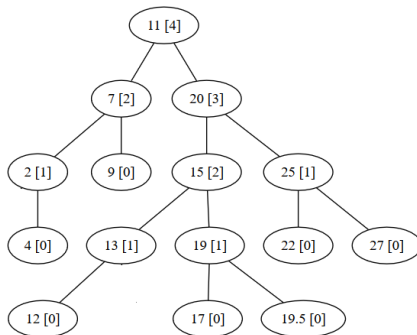


- Solution: **single rotation to left**

AVL Trees - rotation - Single Rotation to Left

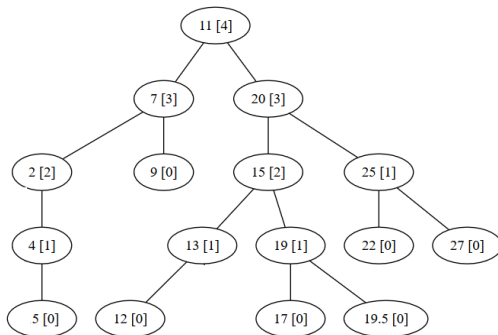


AVL Trees - rotations - case 4 example



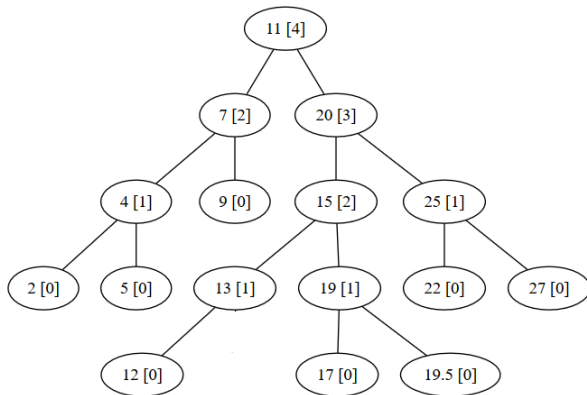
- Insert value 5

AVL Trees - rotations - case 4 example



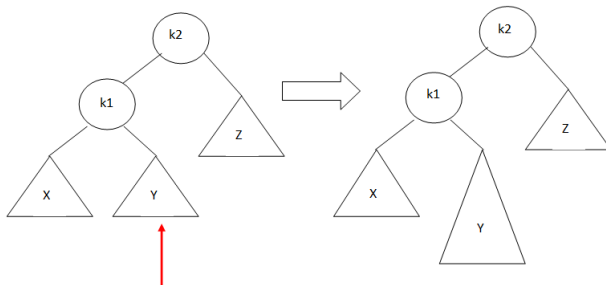
- Node 2 is imbalanced, because we inserted a new node (5) to the right subtree of the right child
- Solution: **single rotation to left**

AVL Trees - rotation - case 4 example



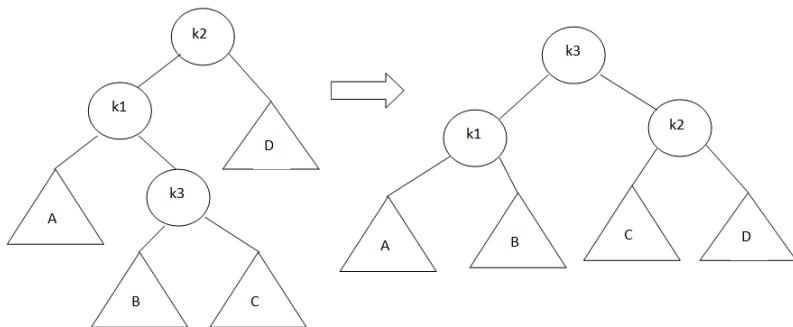
- After the rotation

AVL Trees - rotations - case 2

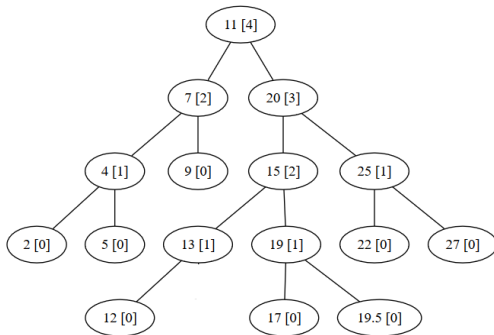


- Solution: **Double rotation to right**

AVL Trees - rotation - Double Rotation to Right

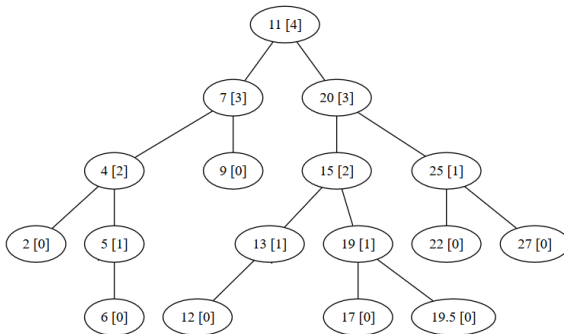


AVL Trees - rotations - case 2 example



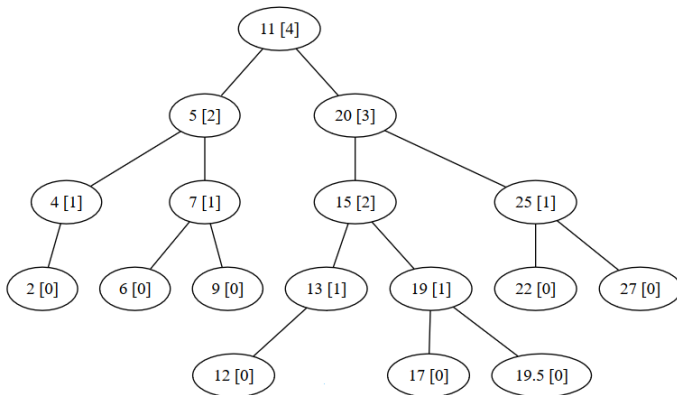
- Insert value 6

AVL Trees - rotations - case 2 example



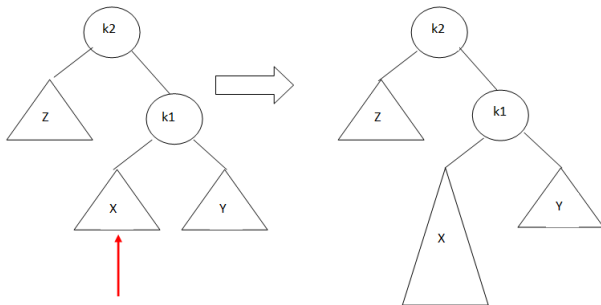
- Node 7 is imbalanced, because we inserted a new node (6) to the right subtree of the left child
- Solution: **double rotation to right**

AVL Trees - rotation - case 2 example



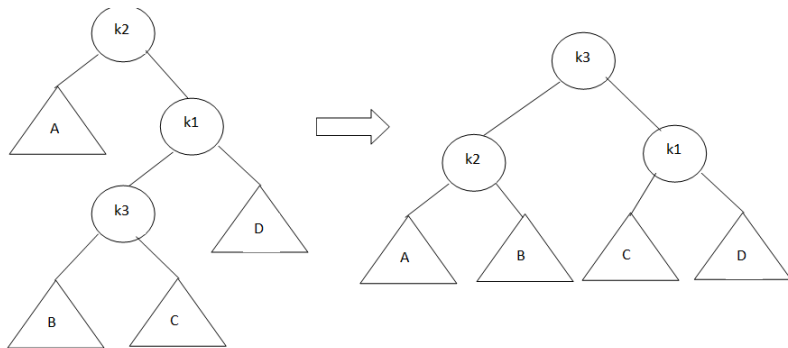
- After the rotation

AVL Trees - rotations - case 3

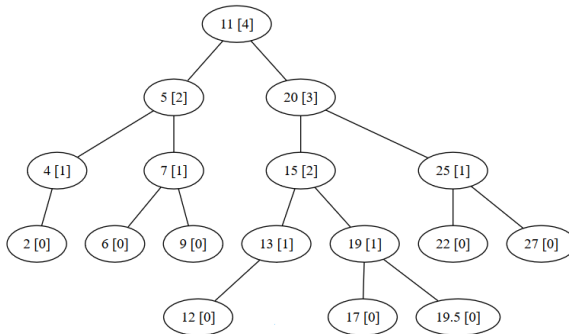


- Solution: **Double rotation to left**

AVL Trees - rotation - Double Rotation to Left

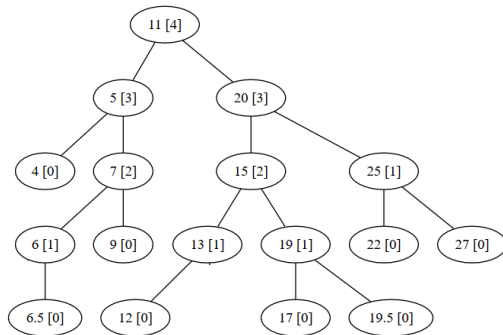


AVL Trees - rotations - case 3 example



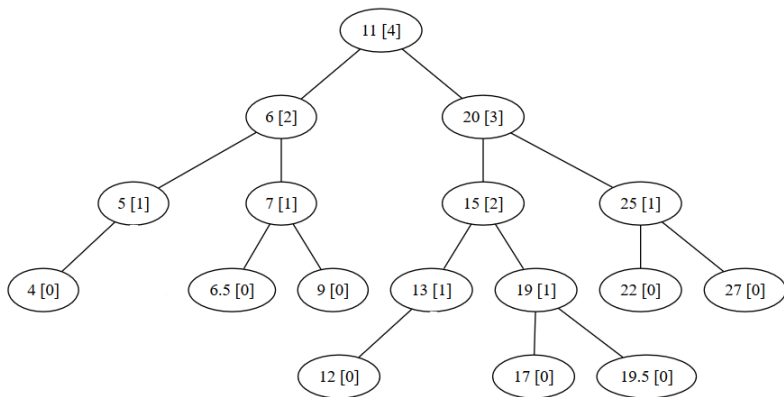
- Remove node with value 2 and insert value 6.5

AVL Trees - rotations - case 3 example



- Node 5 is imbalanced, because we inserted a new node (6.5) to the left subtree of the right child
- Solution: **double rotation to left**

AVL Trees - rotation - case 3 example



- After the rotation