

# AVL TREES

MOTIVATION

## Motivation

- **linked lists**: quite easy to implement  
Stores lots of pointers  
 $O(N)$  search operation time complexity
- **binary search trees**: we came to conclusion that  $O(N)$  search complexity can be reduced to  $O(\log N)$  time complexity  
But if the tree is **unbalanced** : these operations will become slower and slower
- **balanced binary trees**: **AVL trees** or **red-black trees**  
They are **guaranteed** to be balanced  
Why is it good?  $O(\log N)$  is **guaranteed !!!**

## Motivation

Construct a BST from a sorted array  
[1,2,3,4]

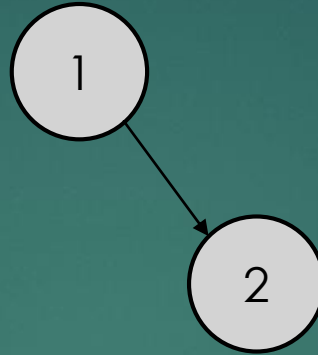
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Construct a BST from a sorted array  
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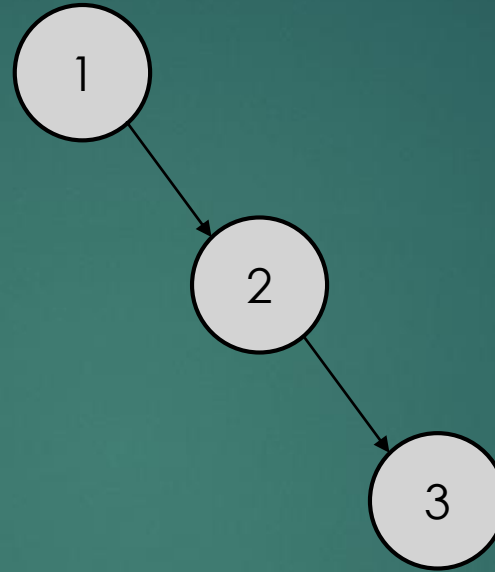
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Construct a BST from a sorted array  
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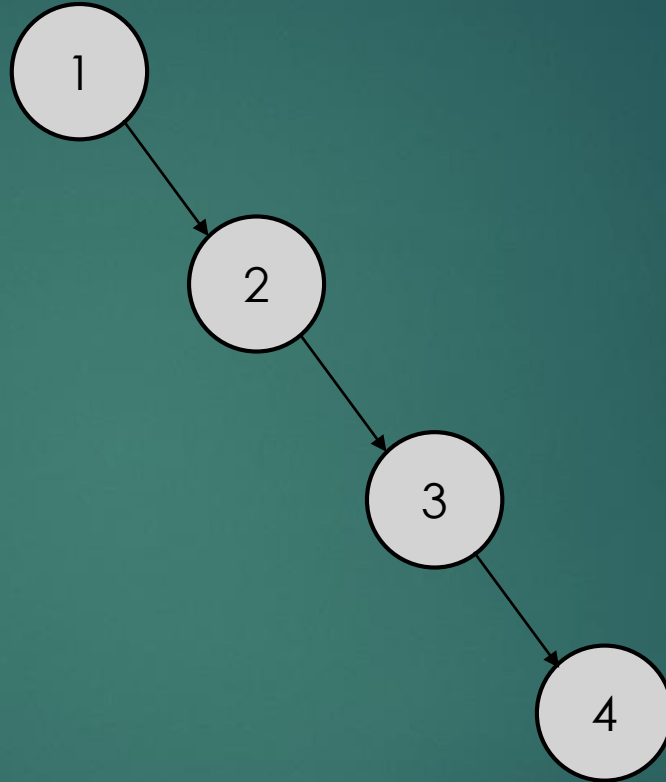
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Construct a BST from a sorted array  
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Construct a BST from a sorted array  
[1,2,3,4]




Conclusion: if we construct a binary search tree from a sorted array, we end up with **a linked list !!!**


$O(\log N)$  **reduced** to  $O(N)$  → A problem we need to **avoid!!**

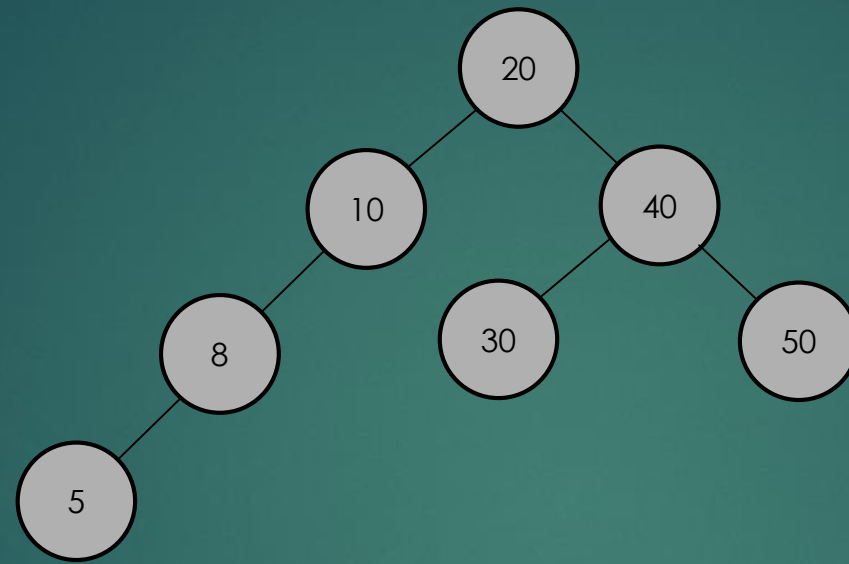
# AVL TREES

BALANCED TREES

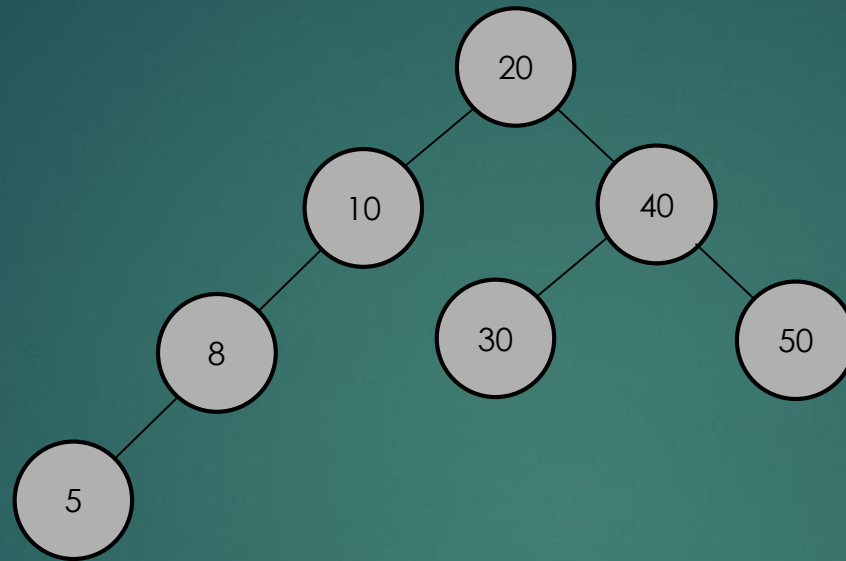


- 
- ▶ The running time of BST operations depends on the **height** of the binary search tree: we should keep the tree **balanced** in order to get the best performance
  - ▶ That's why AVL trees (named after inventors **A**delson-**V**elsky and **L**andis) came to be
  - ▶ 1962: invented by two Russian computer scientists
  - ▶ In an AVL tree, the **heights** of the two child subtrees of any node **differ by at most one**
  - ▶ Another solution to the problem is a **red-black trees**
  - ▶ AVL trees are **faster** than red-black trees because they are **more rigidly balanced** BUT need more work
  - ▶ Operating systems rely heavily on these data structures !!!

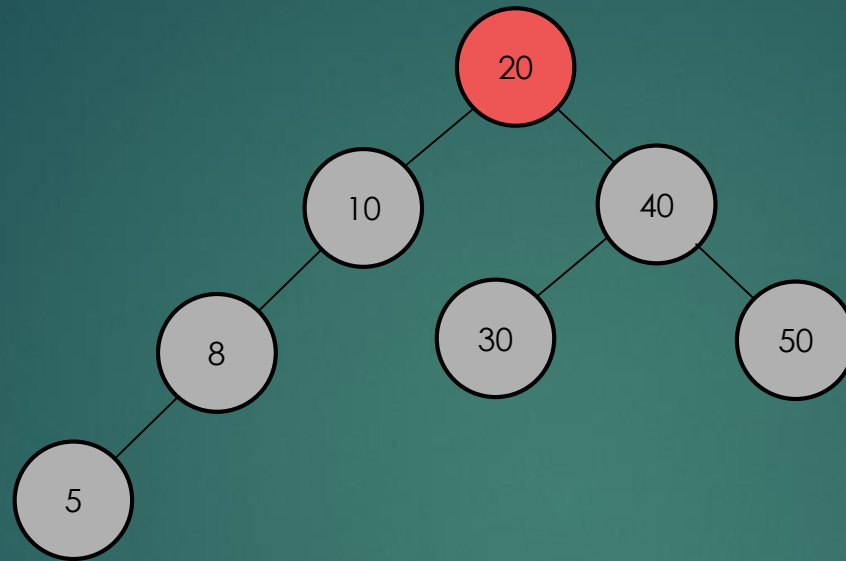
- 
- ▶ Most of the operations are the same as we have seen for binary search trees
  - ▶ Every node can have at most 2 children: the leftChild is smaller, the rightChild is greater than the parent node
  - ▶ The insertion operation is the same **BUT** on **every insertion** we have to **check whether the tree is unbalanced or not**
  - ▶ Deletion operation is the same
  - ▶ Maximum / minimum finding operations are the same as well !!!



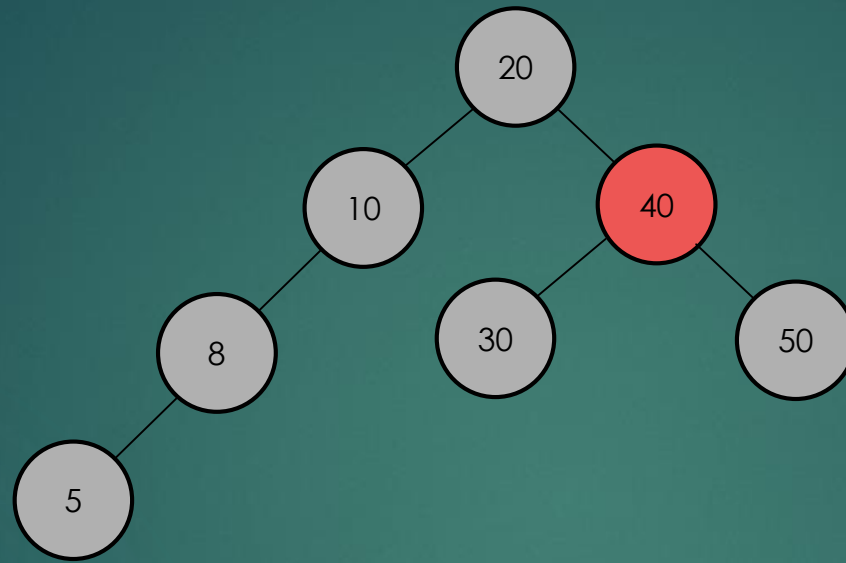
`balancedTree.find(30);`



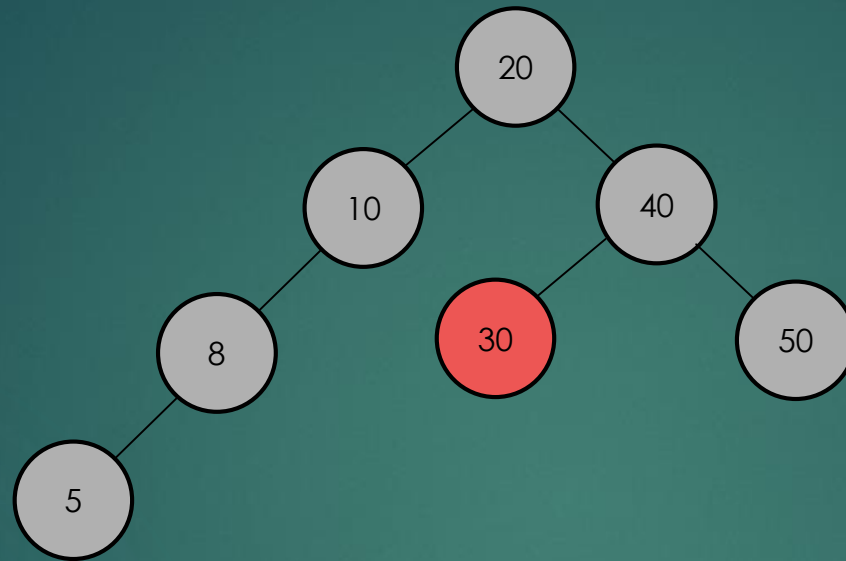
`balancedTree.find(30);`

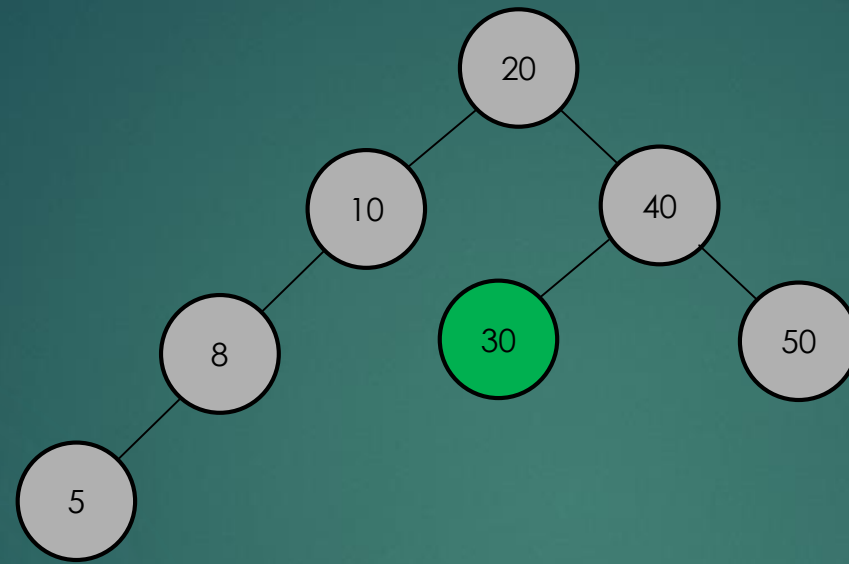


`balancedTree.find(30);`



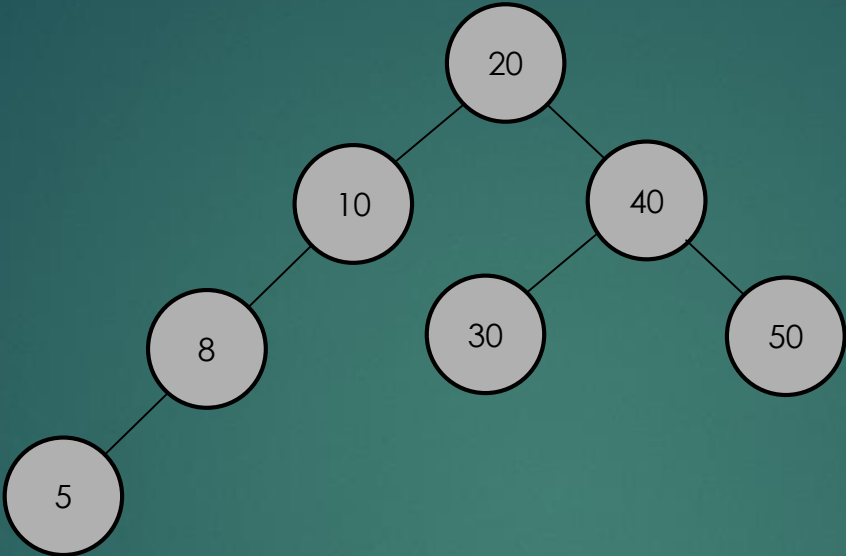
```
balancedTree.find(30);
```



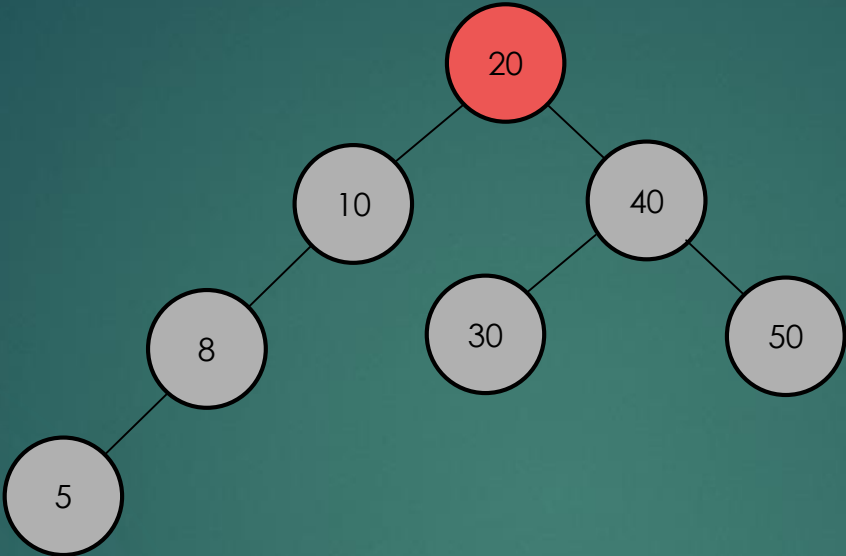




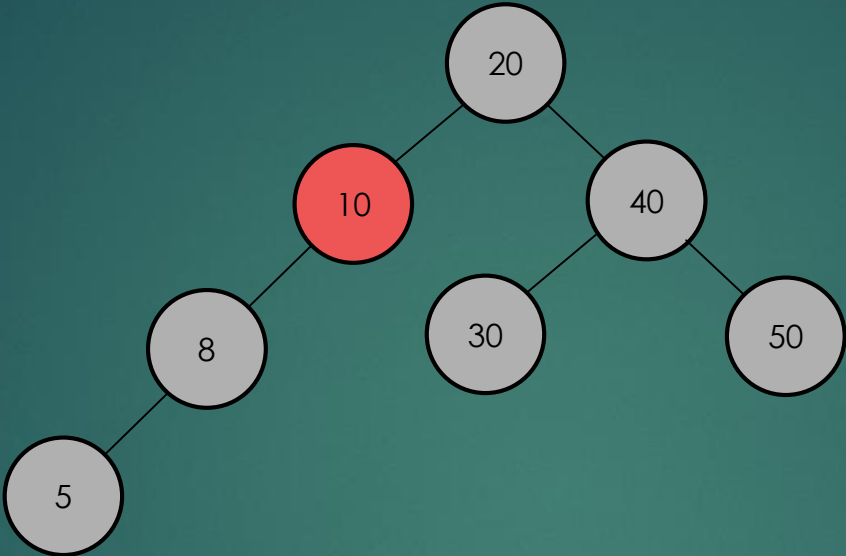
findMin();



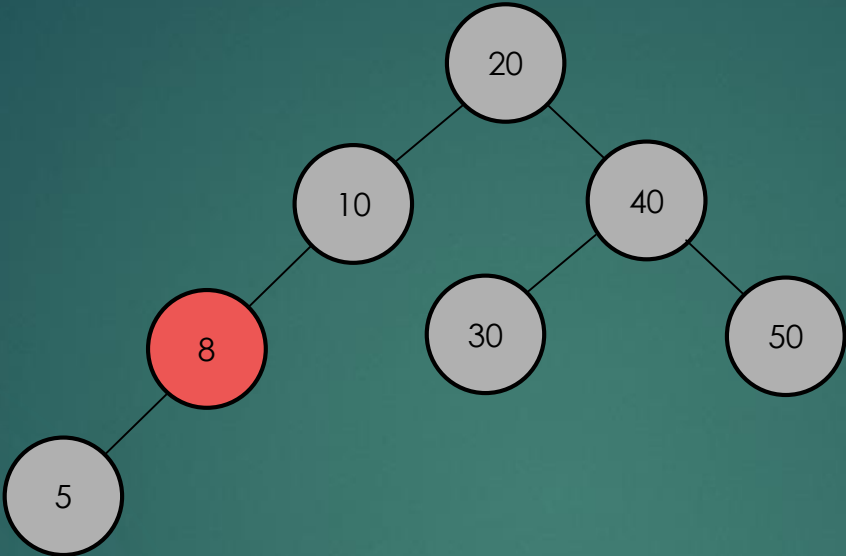
findMin();



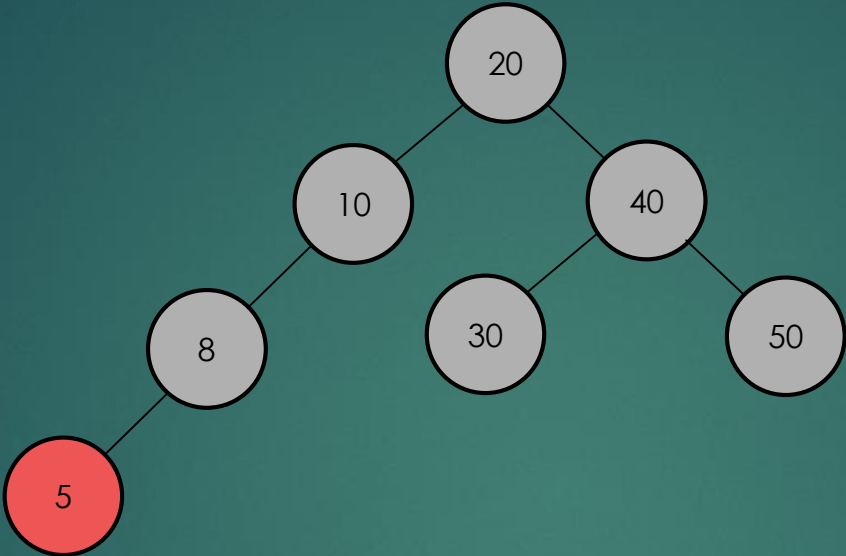
findMin();



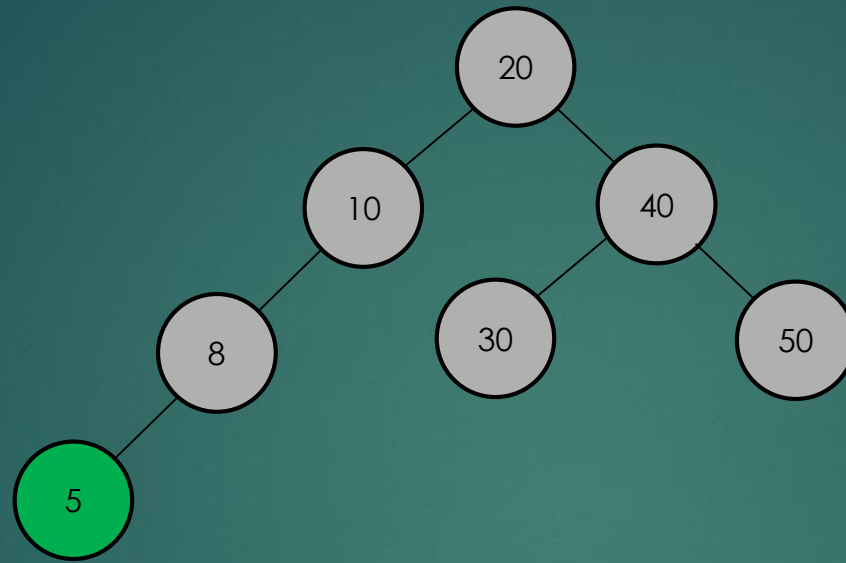
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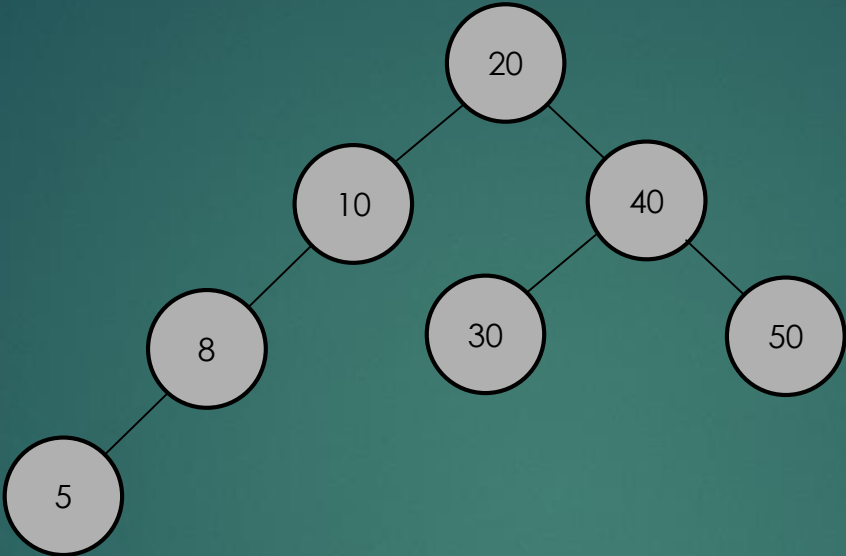


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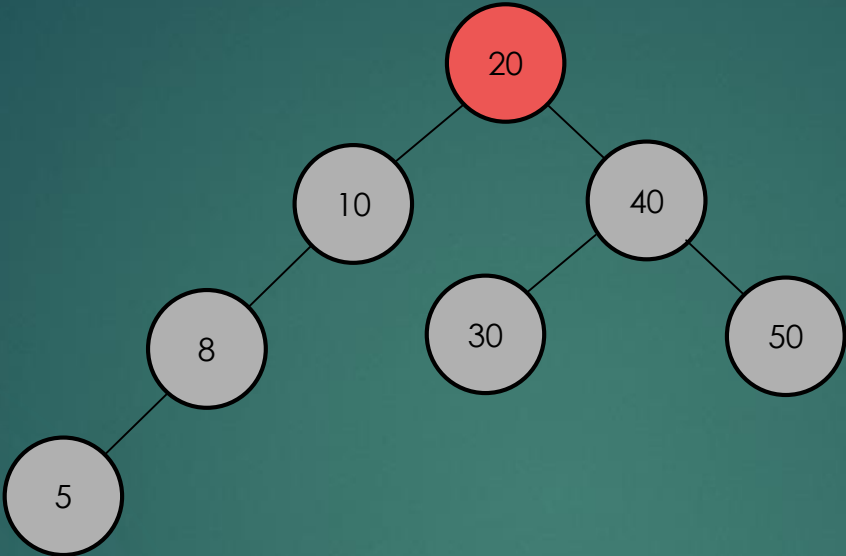


The minimum value in the tree: 5

findMax();

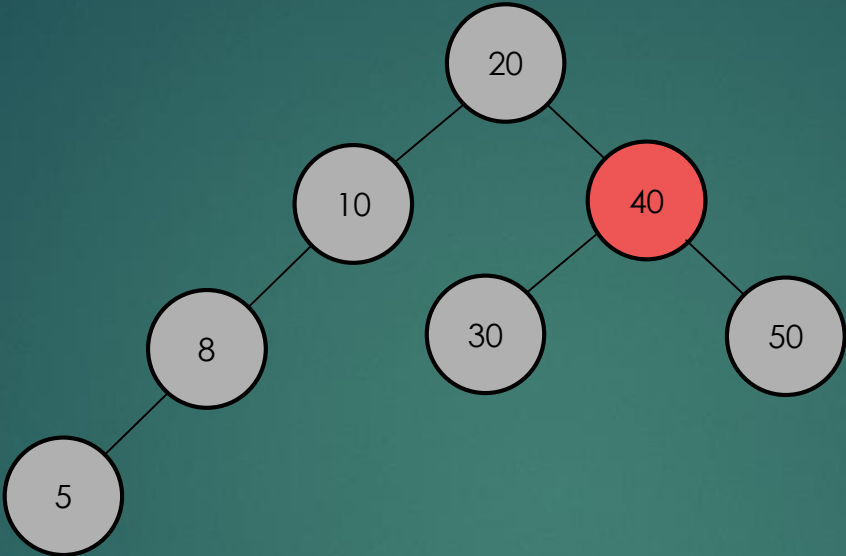


findMax();

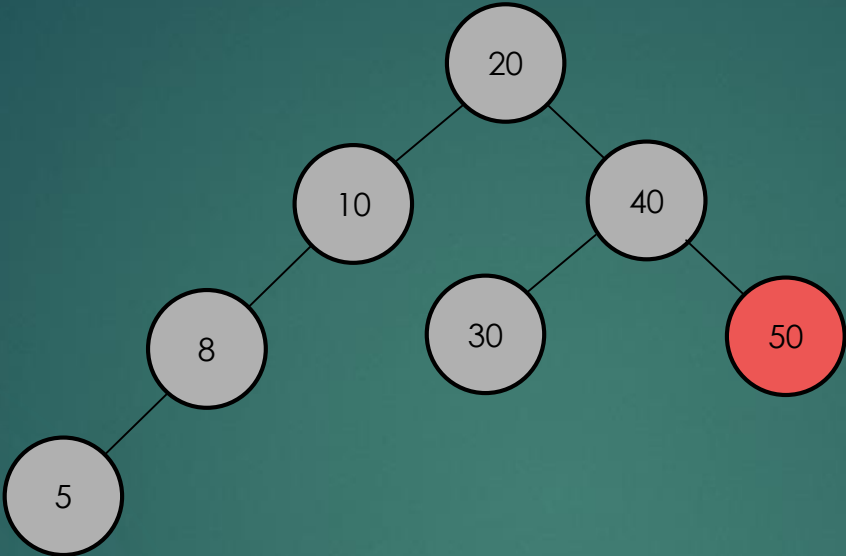




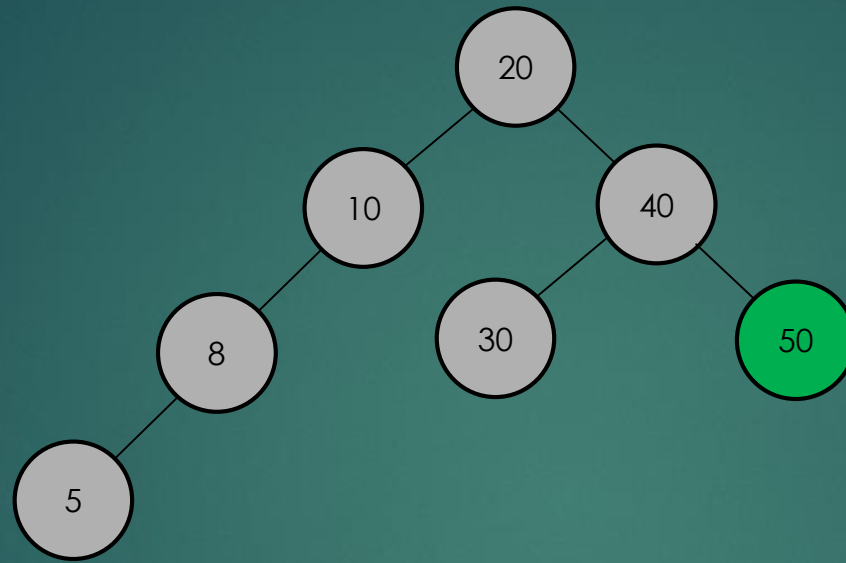
findMax();



findMax();



findMax();



The maximum value in the tree: 50

## Binary search trees

	Average case	Worst case
Space	$O(n)$	$O(n)$
Insert	$O(\log n)$	$O(n)$
Delete	$O(\log n)$	$O(n)$
Search	$O(\log n)$	$O(n)$

## Balanced trees

	Average case	Worst case
Space	$O(n)$	$O(n)$
Insert	$O(\log n)$	$O(\log n)$
Delete	$O(\log n)$	$O(\log n)$
Search	$O(\log n)$	$O(\log n)$

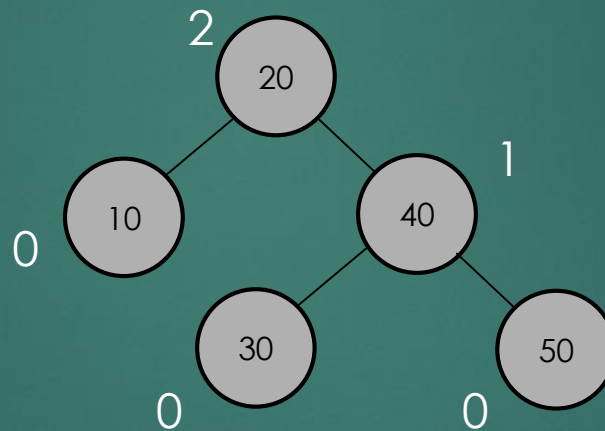
# AVL TREES

BALANCED TREES

**Height** of a node: length of the longest path from it to a leaf

We can use **recursion** to calculate it:

$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$  !!!



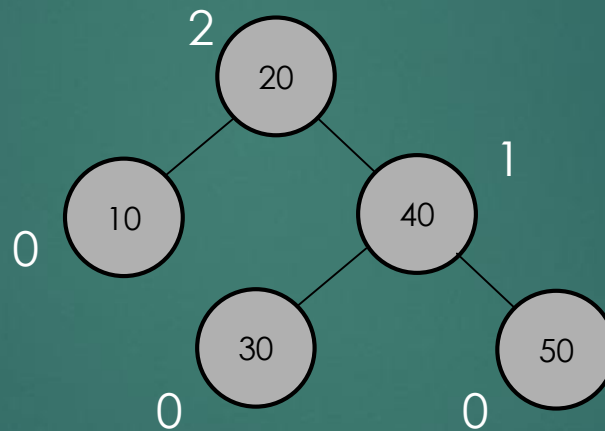
The leaf nodes have NULL children: we consider the **height to be -1 for NULLs** !!!

AVL algorithm uses heights of nodes, we **want the heights as small as possible**: we store the height parameters → **if it gets high, we fix it**

Height of a node: length of the longest path from it to a leaf

We can use recursion to calculate it:

$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$  !!!

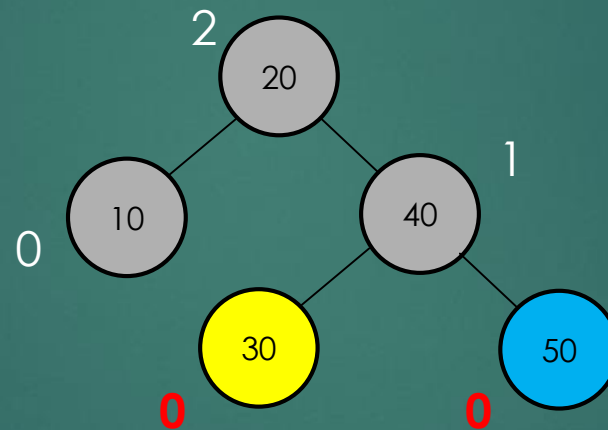


**All subtrees height** parameter does **not differ more than 1** !!!

Height of a node: length of the longest path from it to a leaf

We can use recursion to calculate it:

$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$  !!!

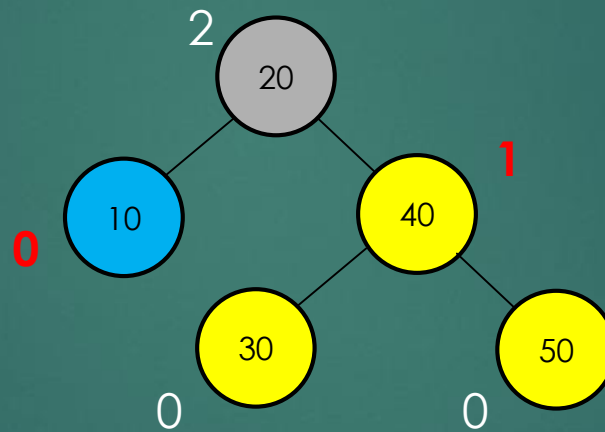




Height of a node: length of the longest path from it to a leaf

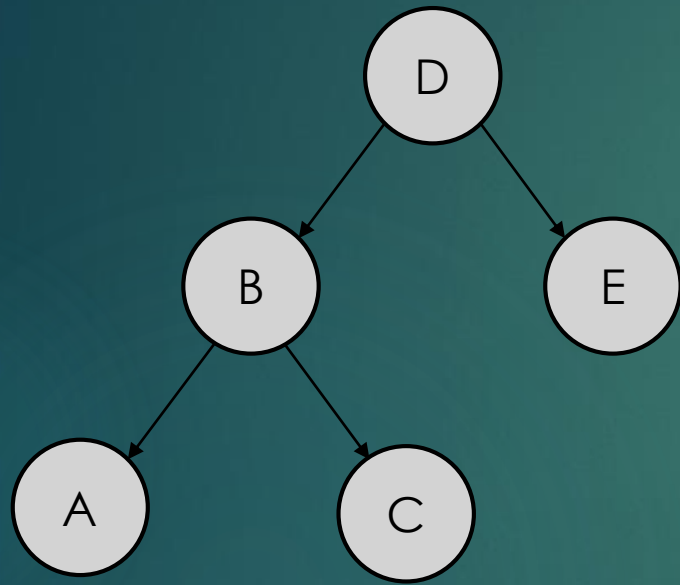
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$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$  !!!

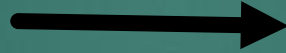


- ▶ AVL tree requires the heights of left and right child of **every node** to **differ at most +1 or -1 !!!**
- ▶  $| \text{height}(\text{leftSubtree}) - \text{height}(\text{rightSubtree}) | \leq 1$
- ▶ So for a balanced tree the height is in the range  $[-1; +1]$
- ▶ We can maintain this property in  $O(\log N)$  time which is quite fast !!!
- ▶ Insertion:
  - ▶ 1.) a simple BST insertion according to the keys
  - ▶ 2.) **fix the AVL property on each insertion** from insertion upward
- ▶ There may be several violations of AVL property from the inserted node up to the root!!!
- ▶ We have to **check them all**

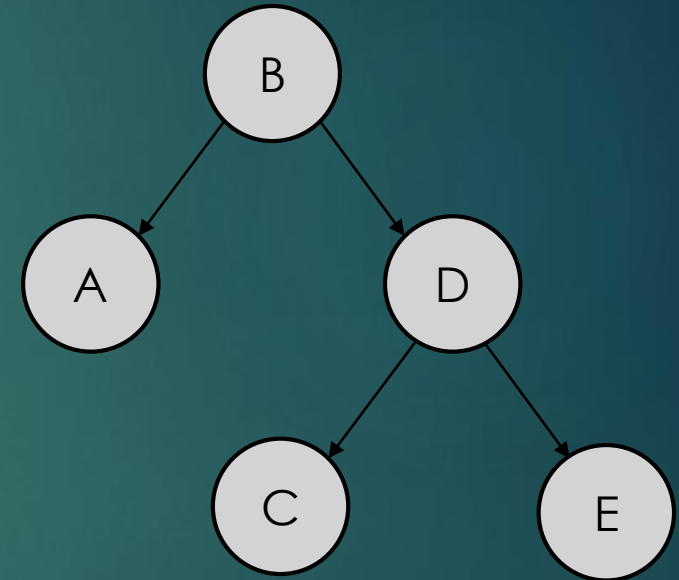
# Rotations



rightRotate(D)

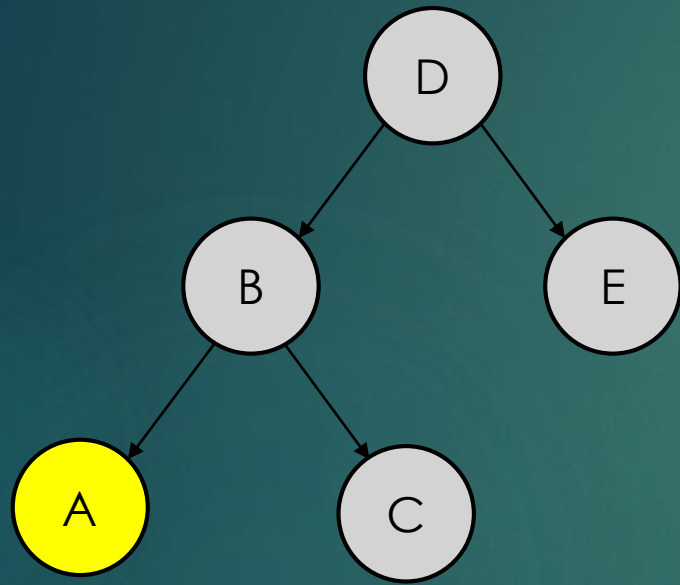


leftRotate(B)



We just have to **update the references** which can be done in **O(1)** time complexity !!! ( the in-order traversal is the same )

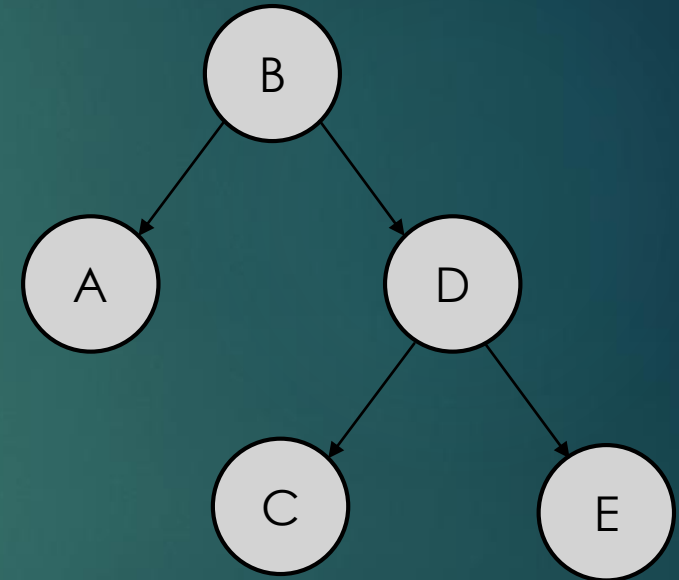
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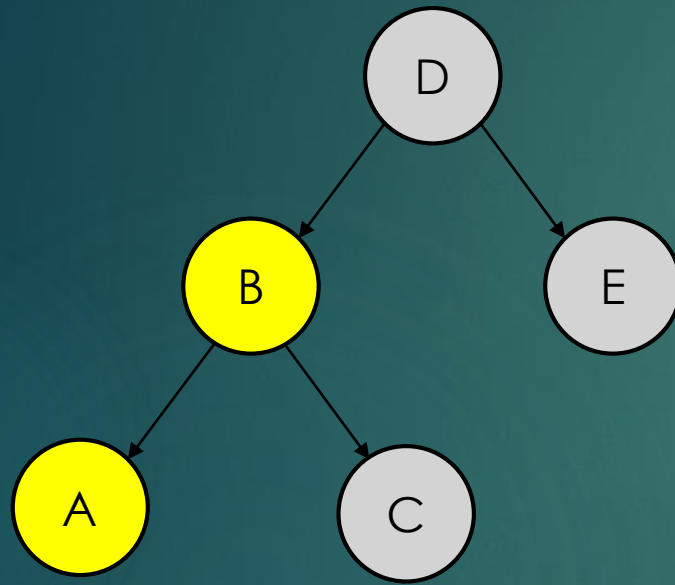


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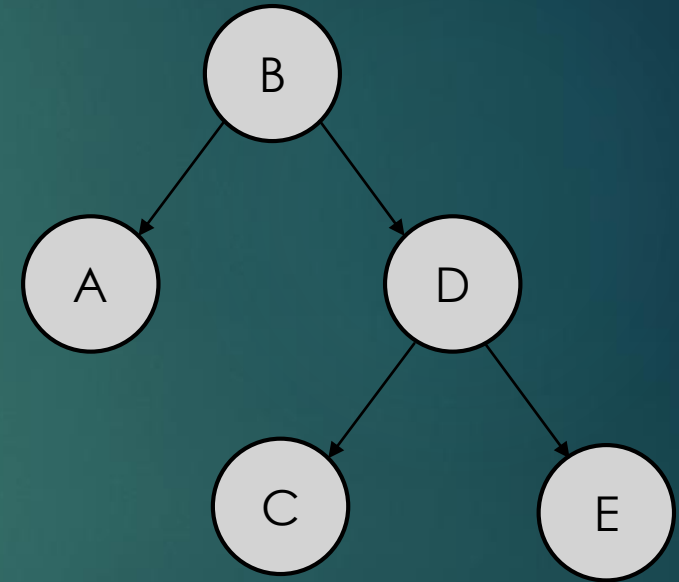
# Rotations



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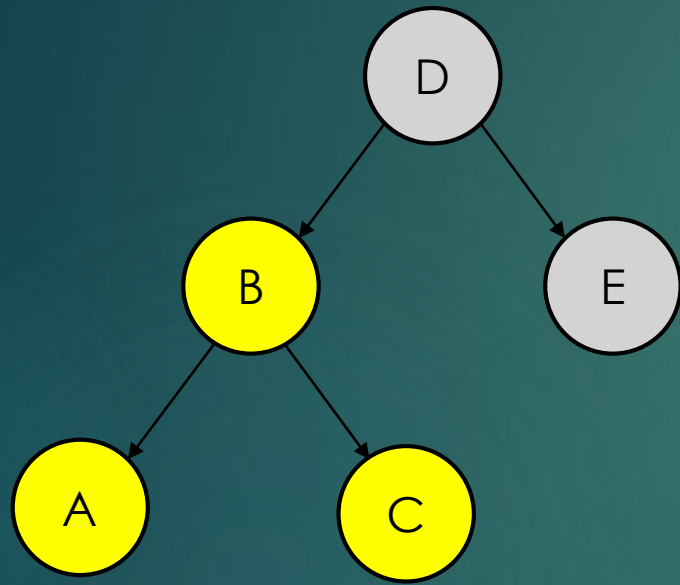


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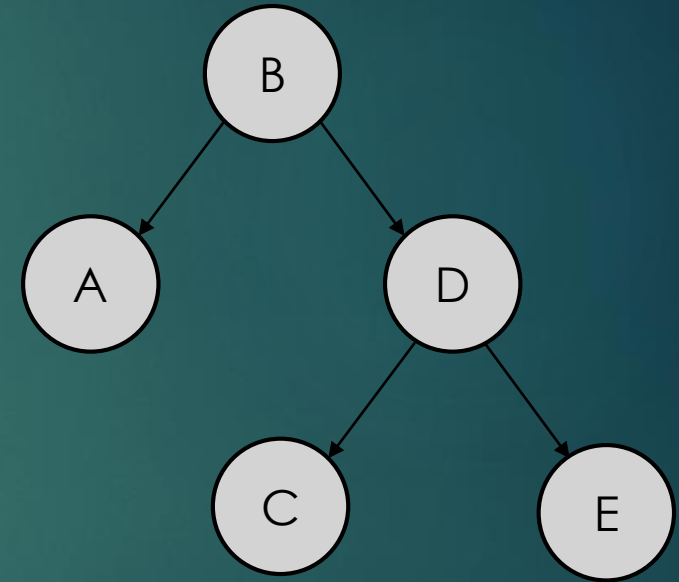
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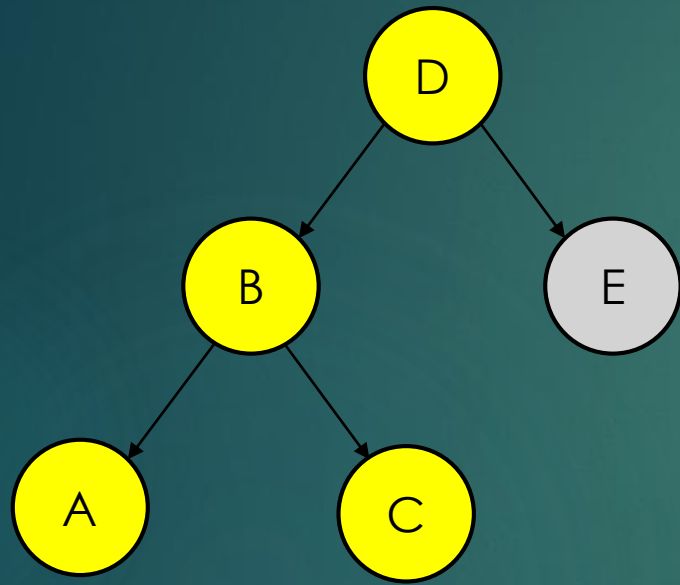


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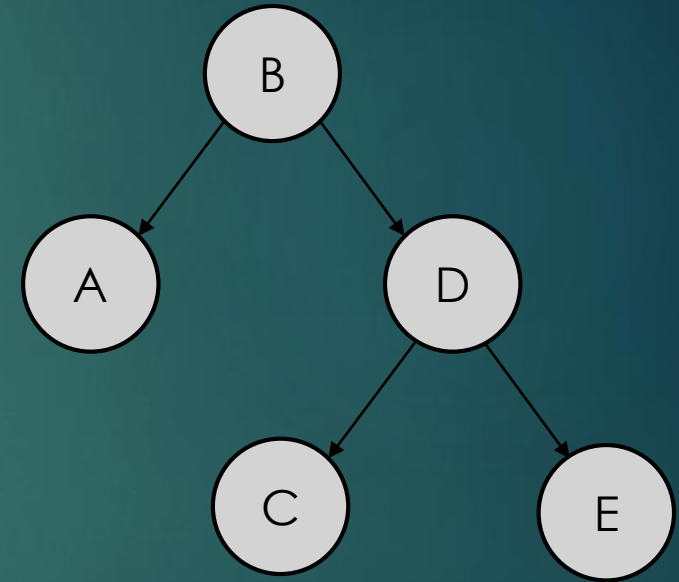
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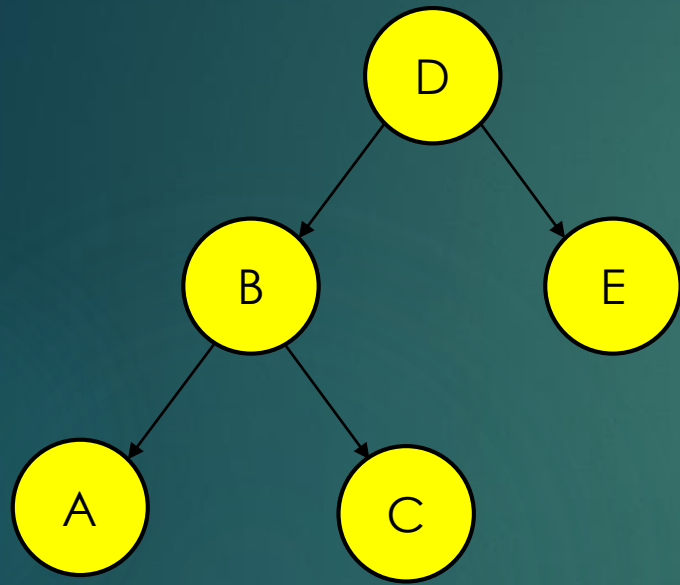


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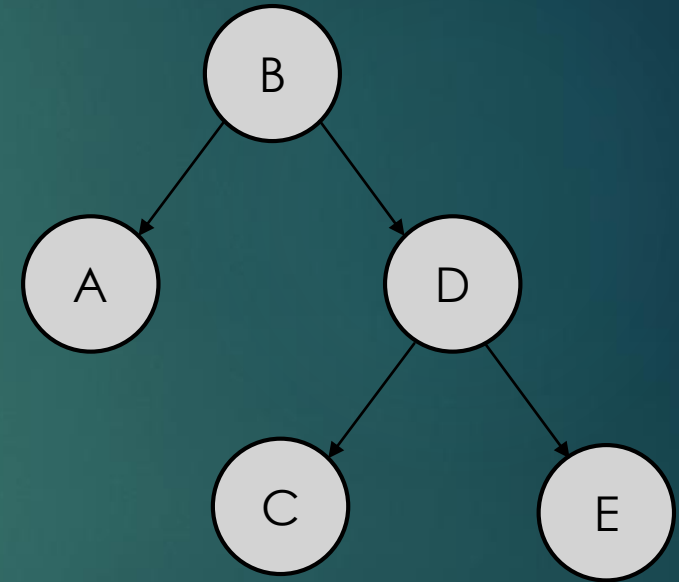
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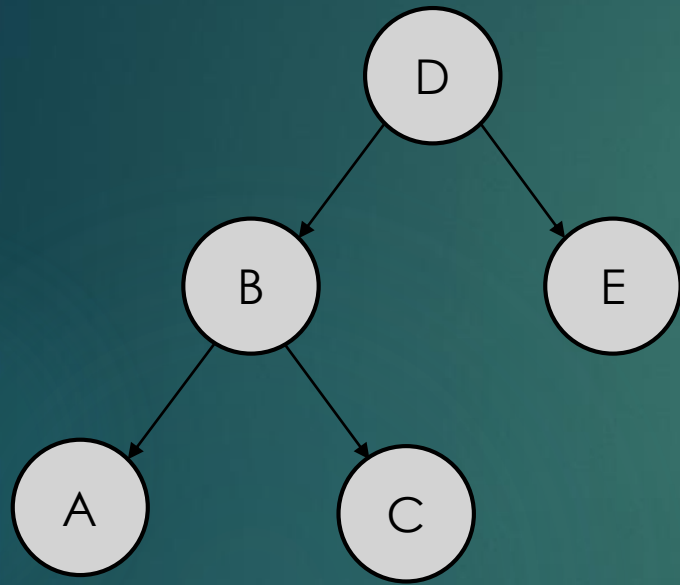
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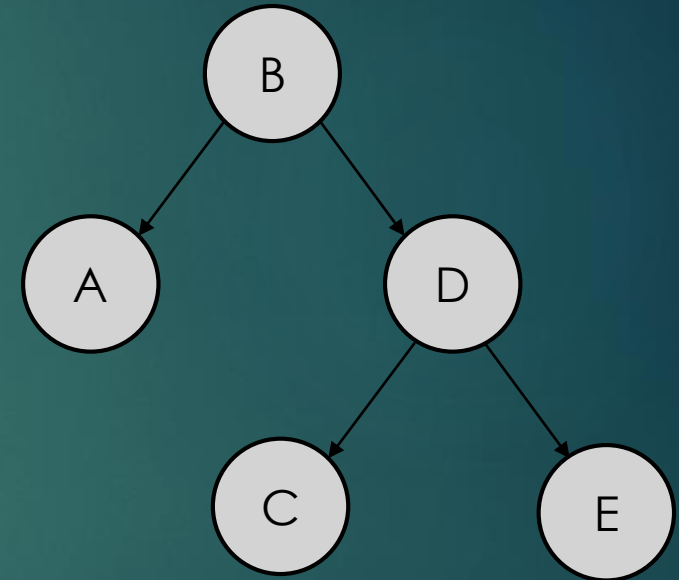
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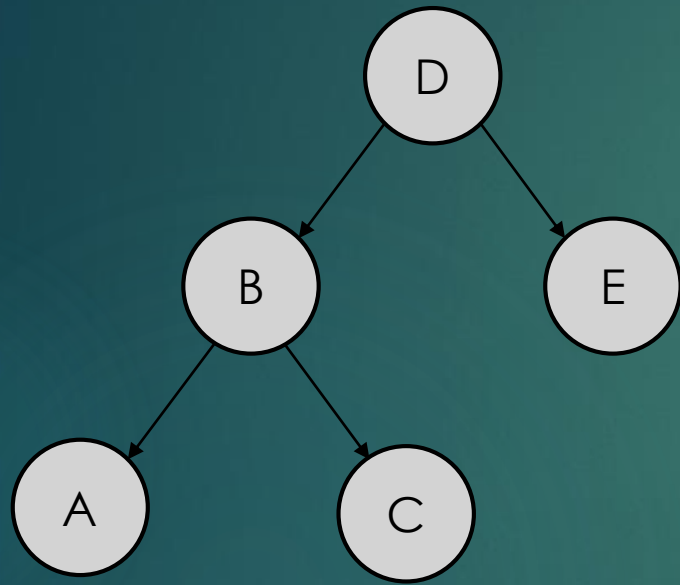


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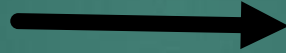


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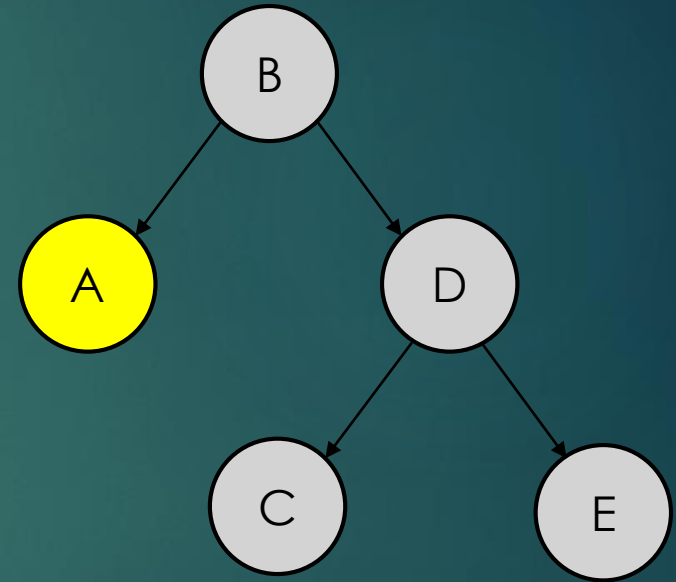
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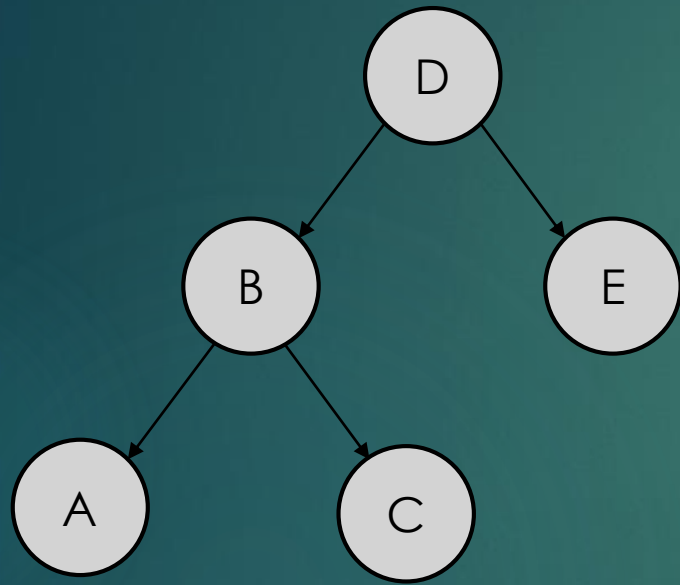


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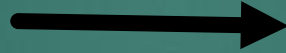


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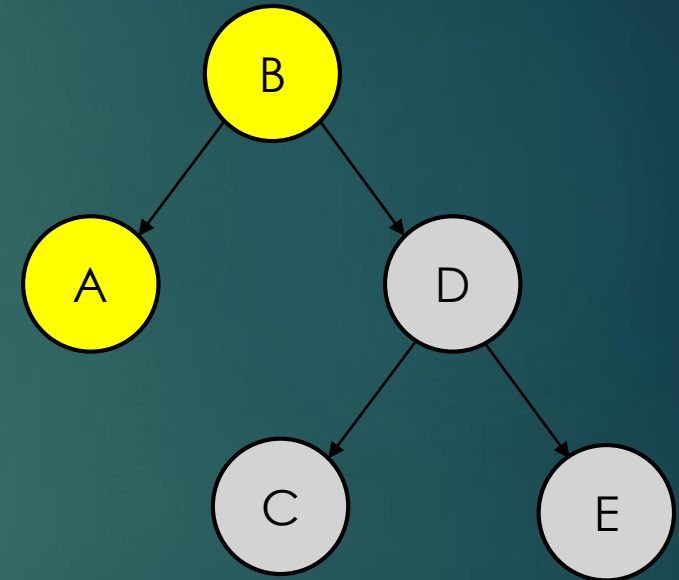
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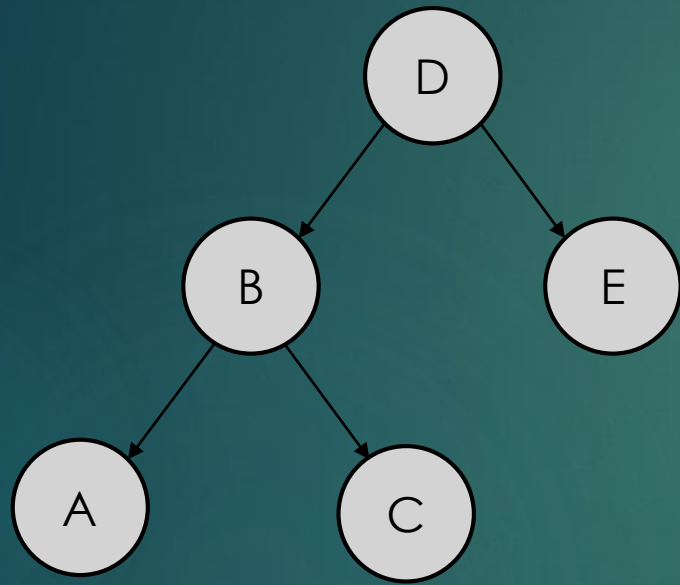


leftRotate(B)



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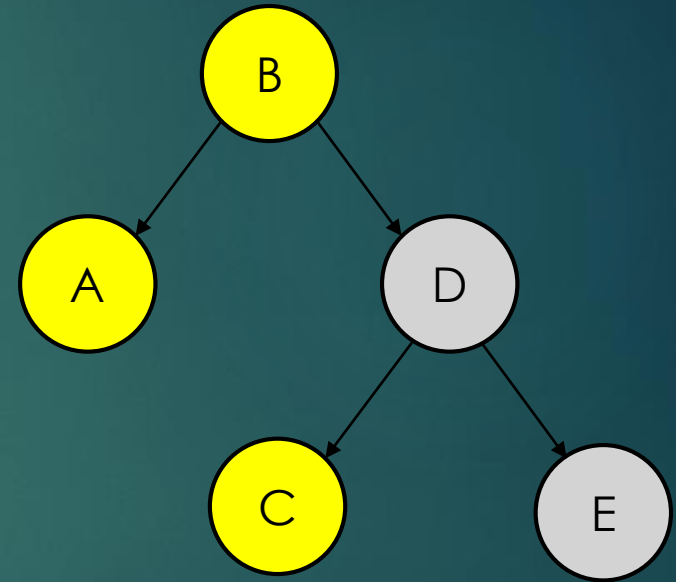
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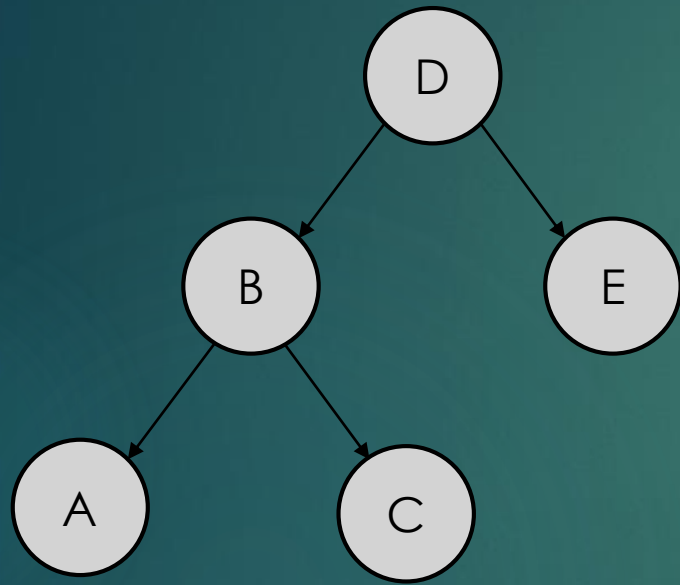


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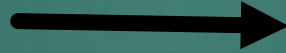


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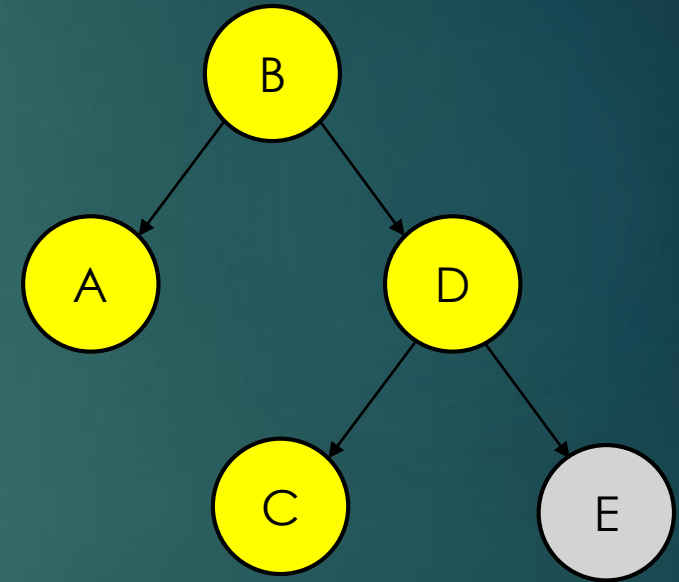
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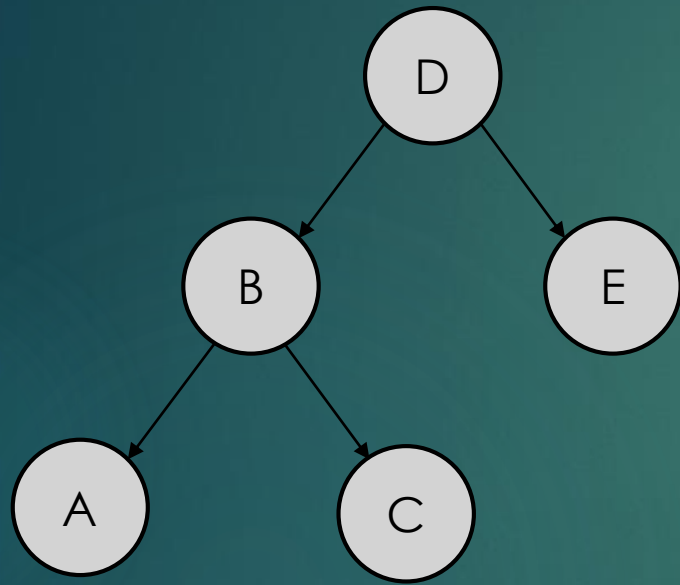


leftRotate(B)



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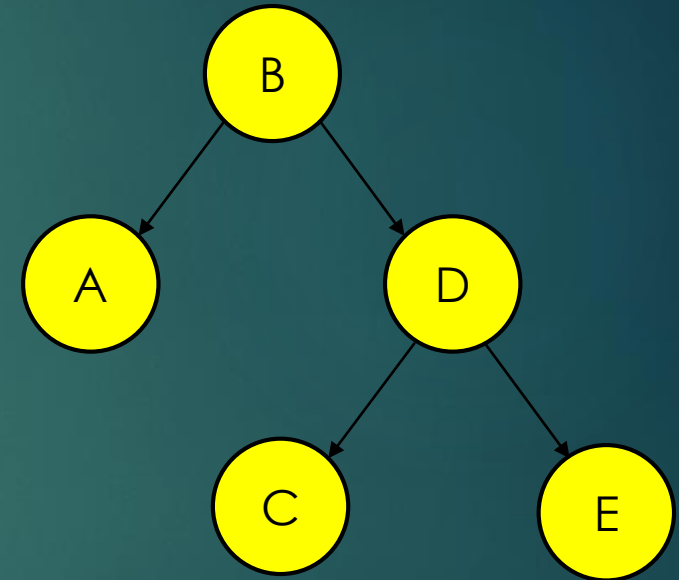
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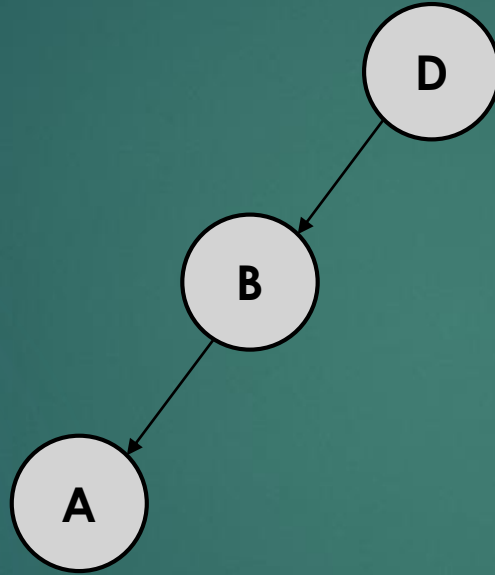


leftRotate(B)



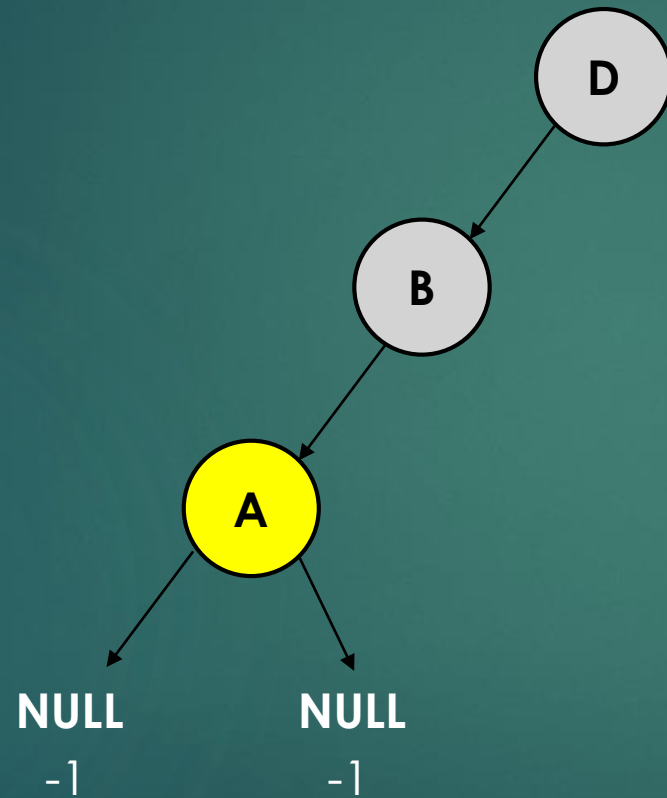
We just have to update the references which can be done in **O(1)** time complexity !!! ( the in-order traversal is the same )

# Rotations case I



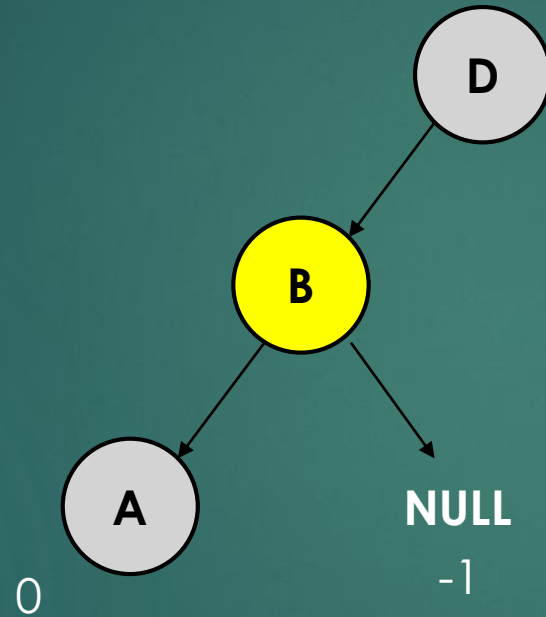
Doubly-left heavy situation.

# Rotations case I

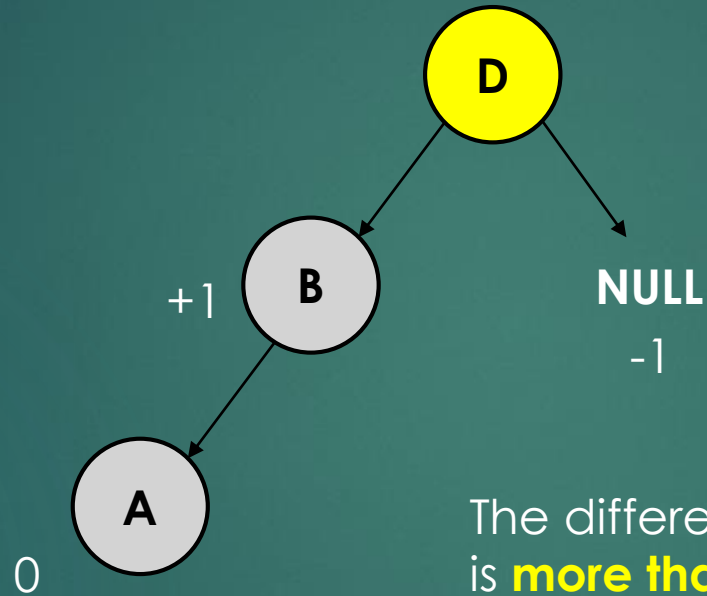




# Rotations case I

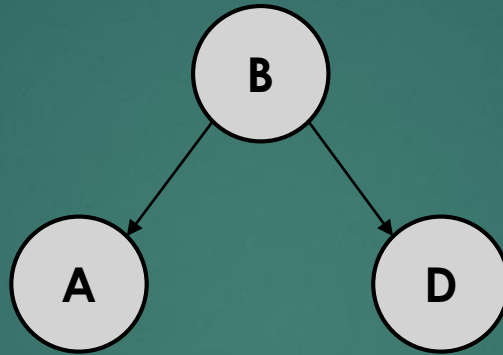


# Rotations case I



The difference of height parameters  
is **more than 1** !!! ( actually it is 2 )  
~ so we **make rotation to the right**

# Rotations case I



The new root node is the **B**, which was the left child of **D** before the rotation !!!

# Rotations case I

```
BEGIN rotateRight(Node node)
```

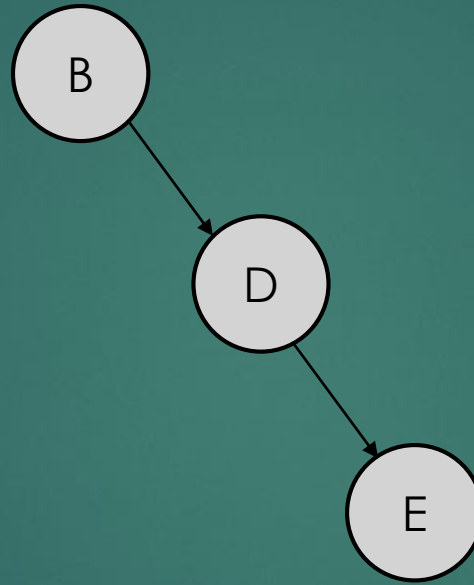
```
    Node tempLeftNode = node.getLeftNode()  
    Node t = tempLeftNode.getRightNode()
```

```
    tempLeftNode.setRightNode(node)  
    node.setLeftNode(t)
```

```
    node.updateheight()  
    tempLeftNode.updateHeight()
```

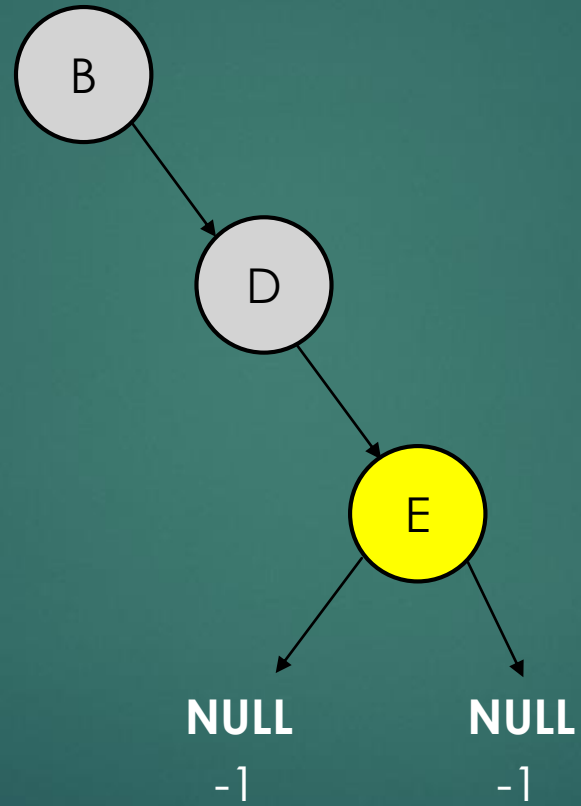
```
END
```

# Rotations case II

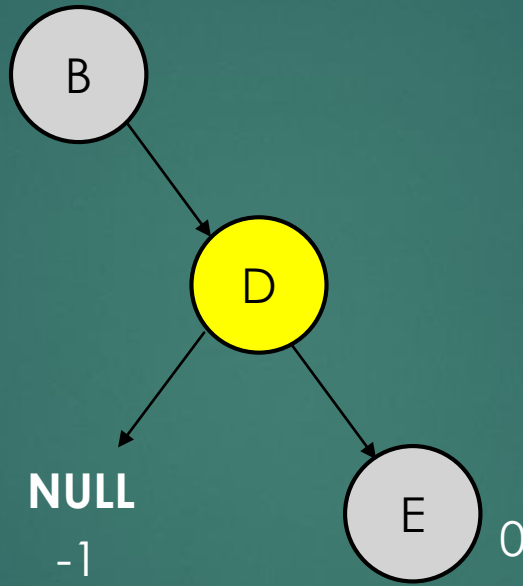


Doubly-right heavy situation.

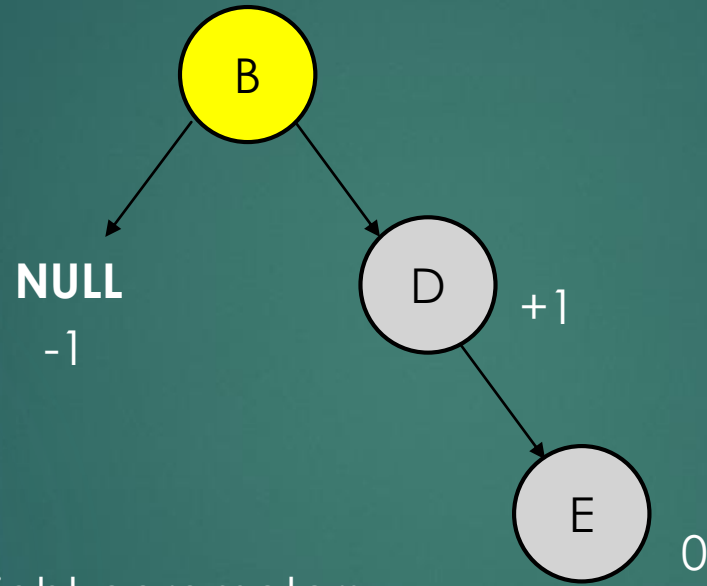
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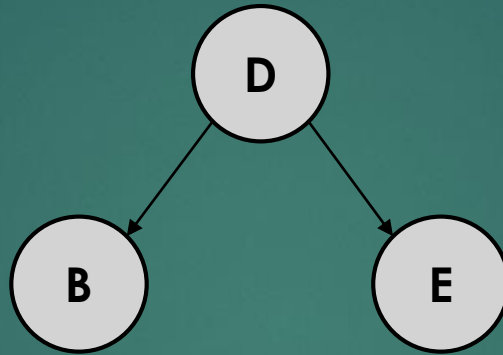
# Rotations case II



The difference of height parameters  
is more than 1 !!! ( actually it is 2 )  
~ so we make rotation to the left



# Rotations case II



The new root node is the **D**, which was the right child of **B** before the rotation !!!

# Rotations case II

```
BEGIN rotateLeft(Node node)
```

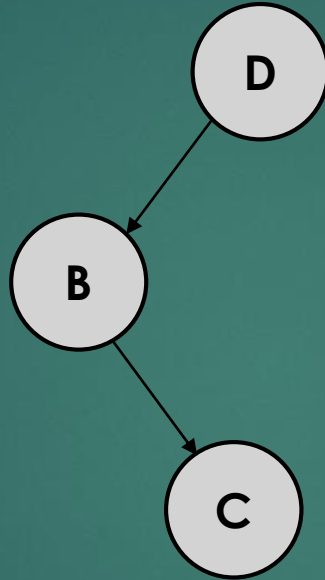
```
    Node tempRightNode = node.getRightNode()  
    Node t = tempRightNode.getLeftNode()
```

```
    tempRightNode.setLeftNode(node)  
    node.setRightNode(t)
```

```
    node.updateheight()  
    tempRightNode.updateHeight()
```

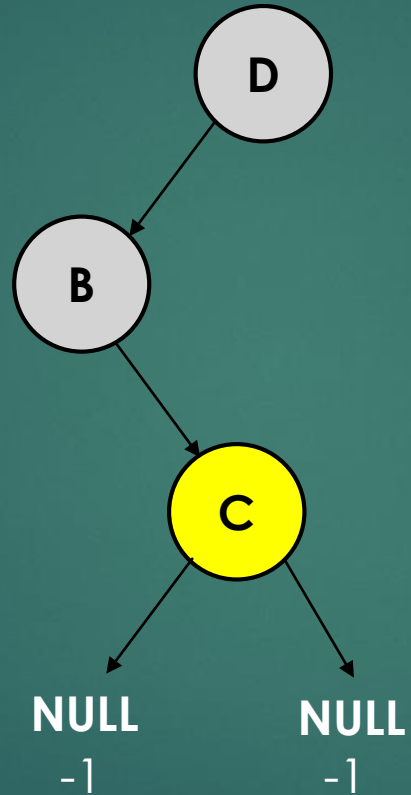
```
END
```

# Rotations case III

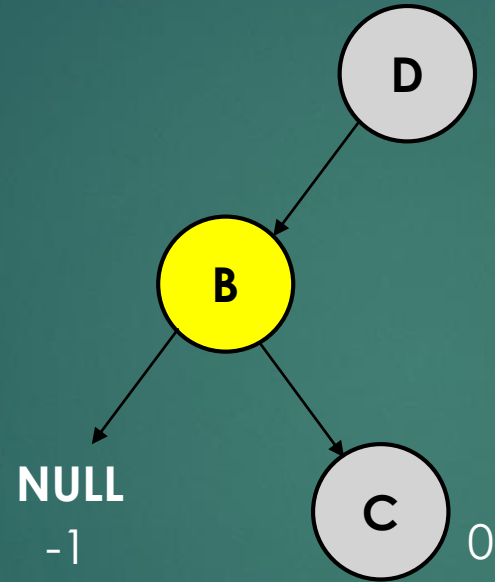


IMPORTANT: these nodes may have left and right children but it does not matter // we do not modify the pointers for them !!!

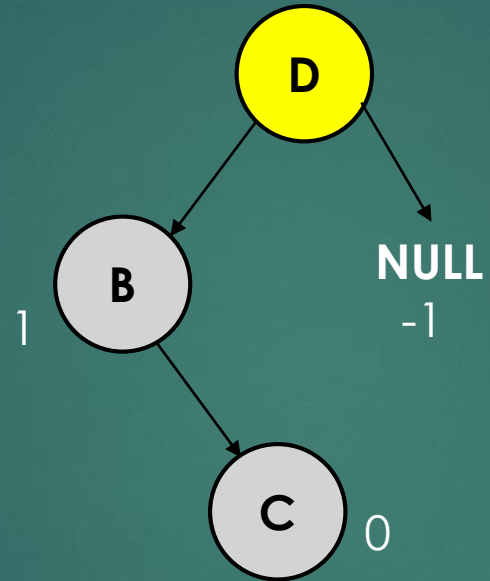
# Rotations case III



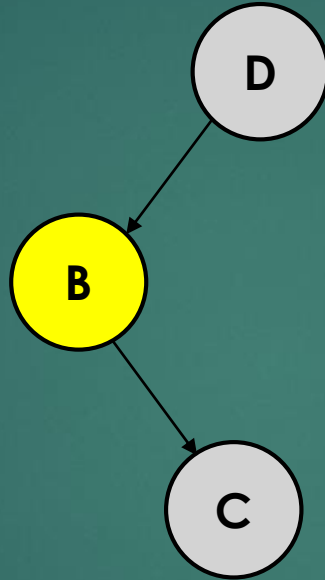
# Rotations case III



# Rotations case III

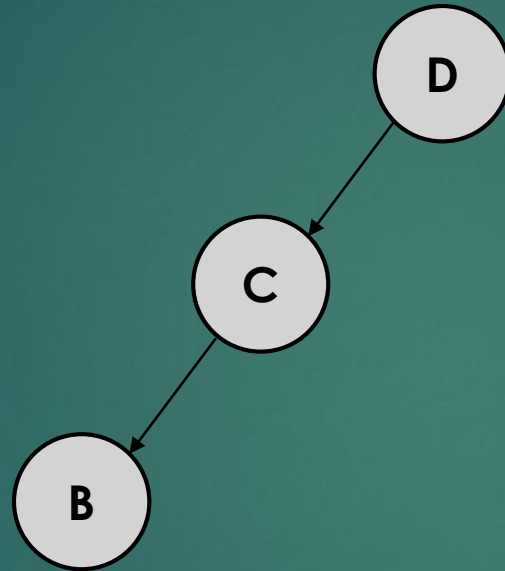


# Rotations case III



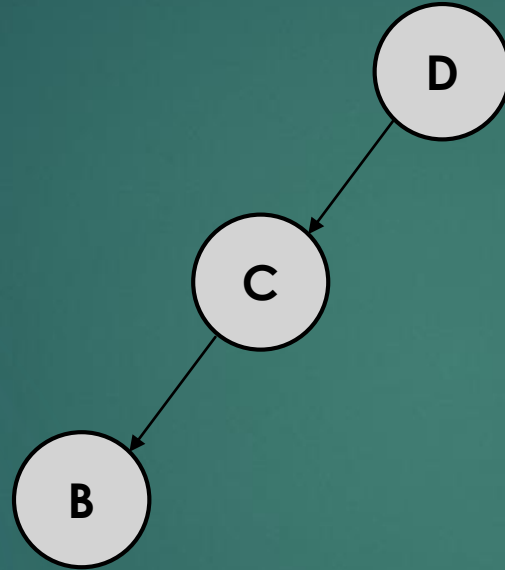
We have to make a left rotation  
on the node B

# Rotations case III



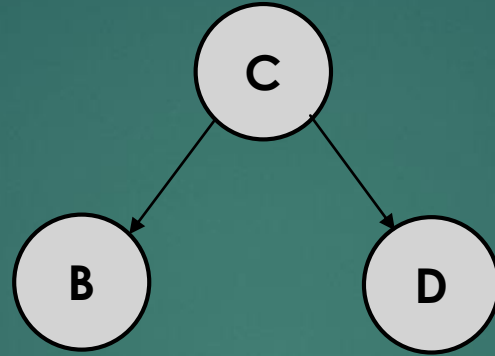


# Rotations case III

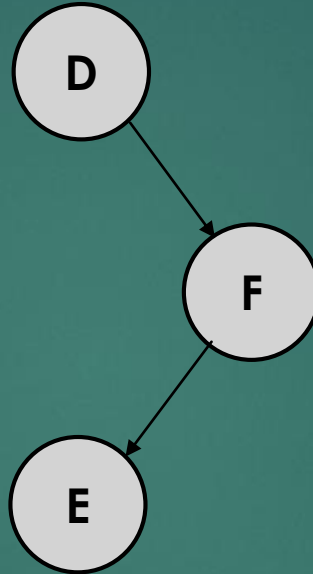


We have to make a left rotation  
on the root node D

# Rotations case III

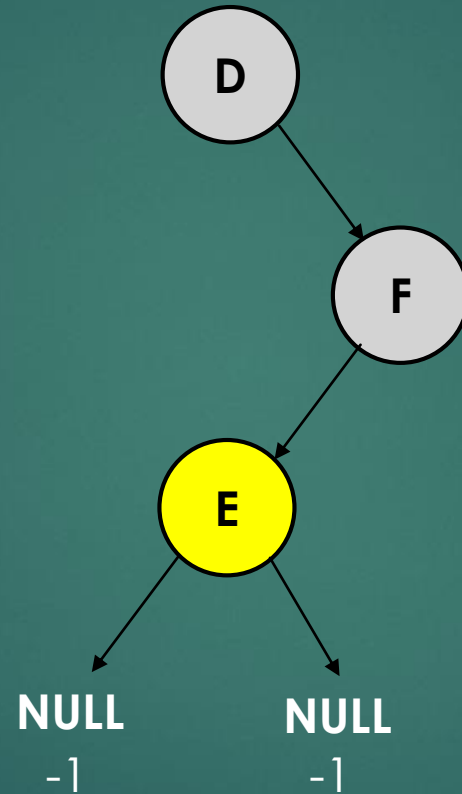


# Rotations case IV

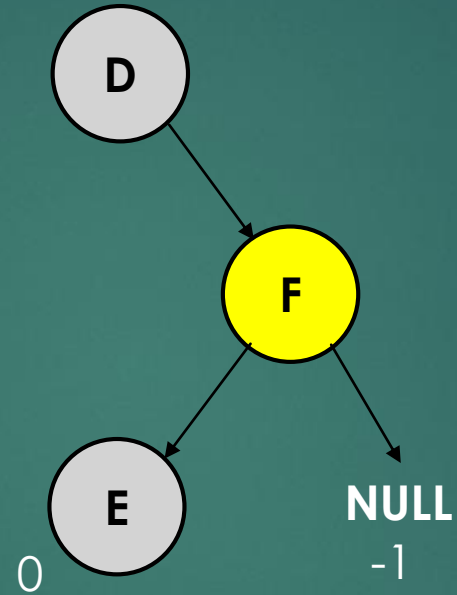


IMPORTANT: these nodes may have left and right children but it does not matter // we do not modify the pointers for them !!!

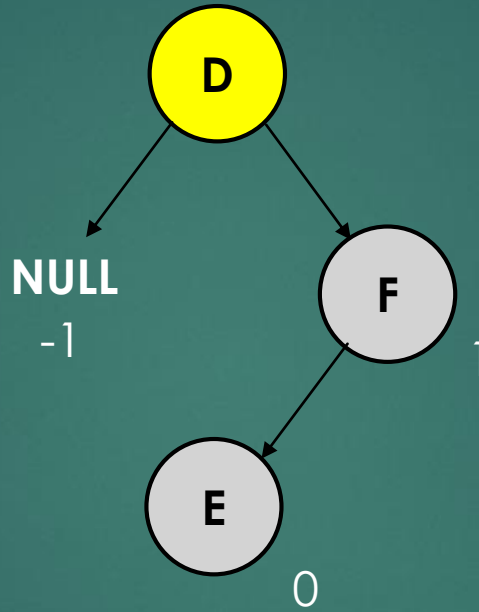
# Rotations case IV



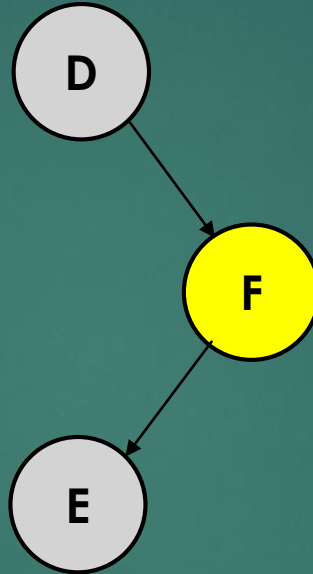
# Rotations case IV



# Rotations case IV

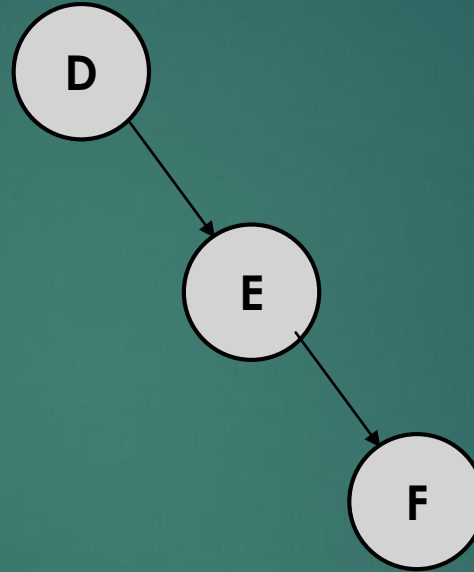


# Rotations case IV



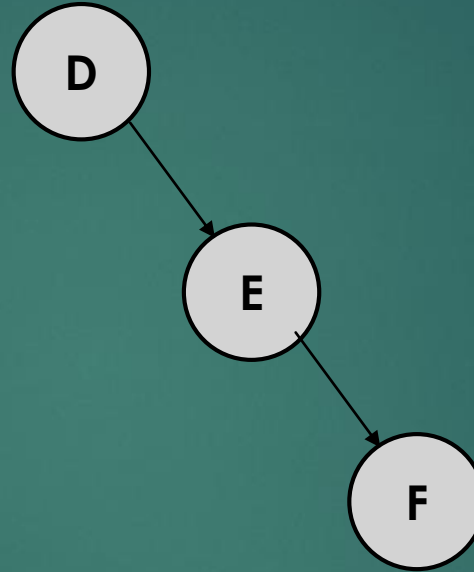
We have to make a right rotation  
on the node F

# Rotations case IV



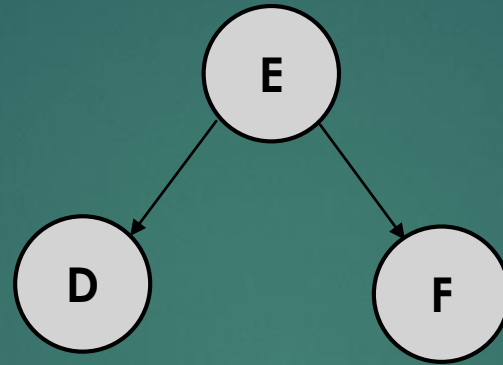


# Rotations case IV



We have to make a left rotation  
on the root node D

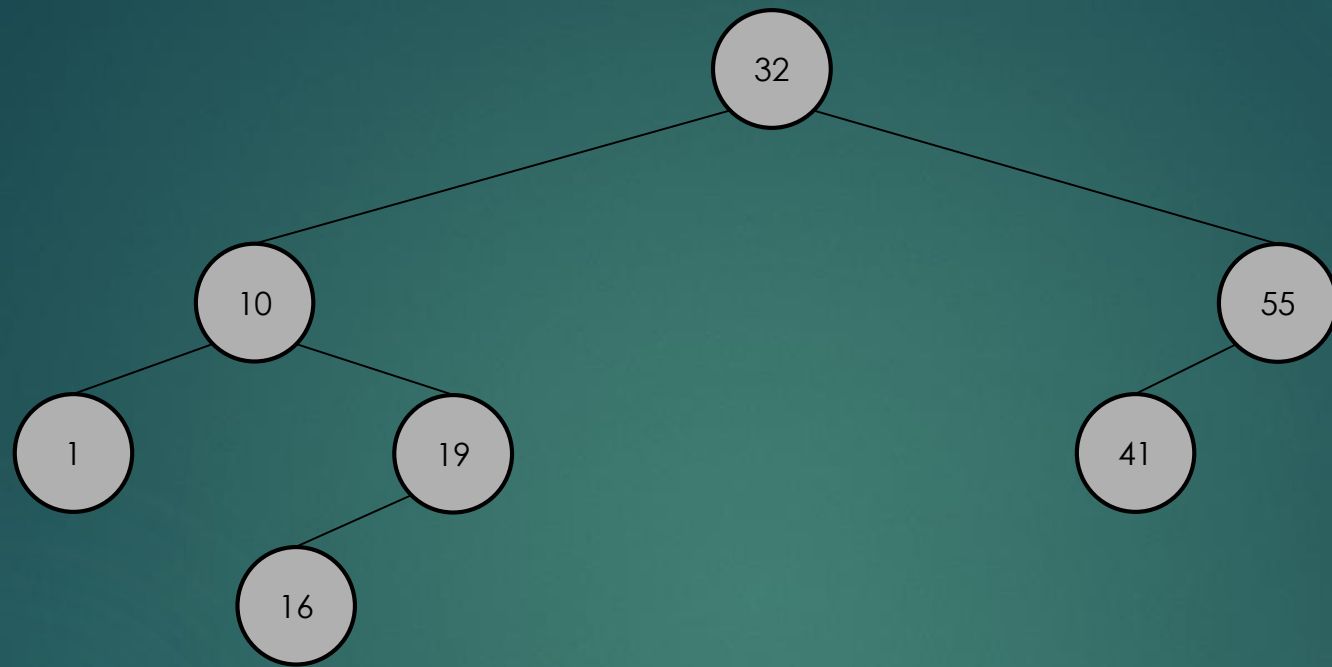
# Rotations case IV



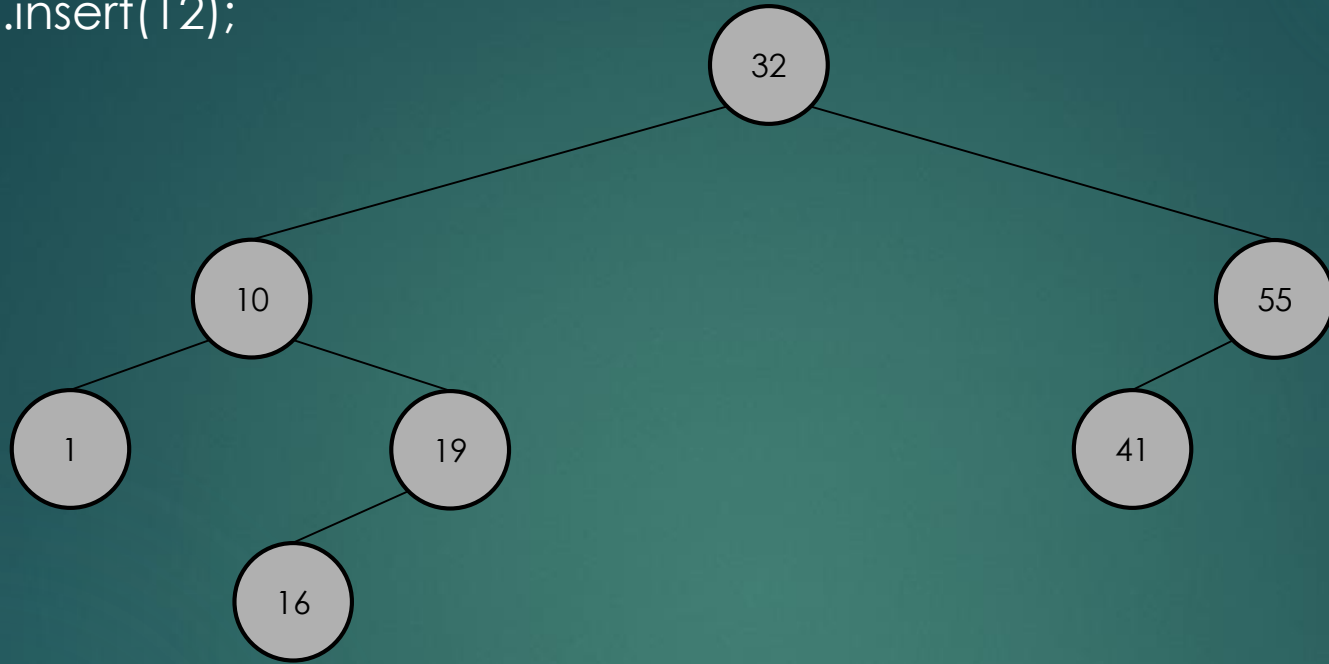


# AVL TREES

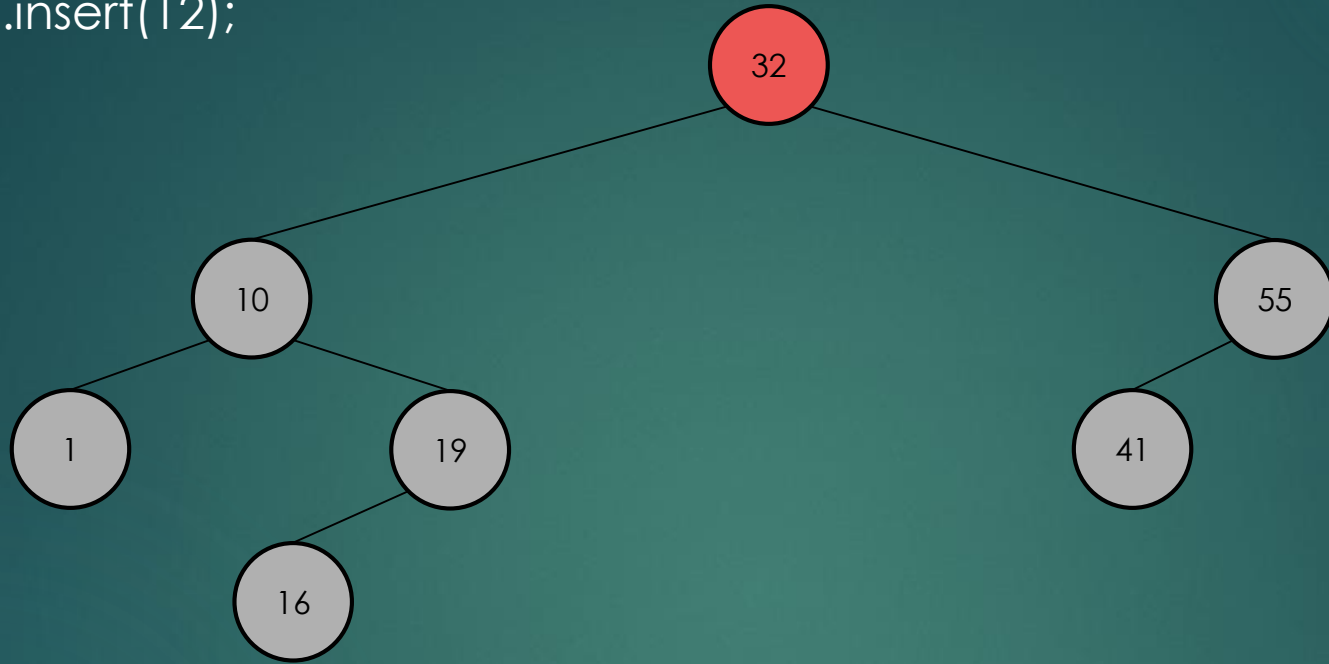
BALANCED TREES



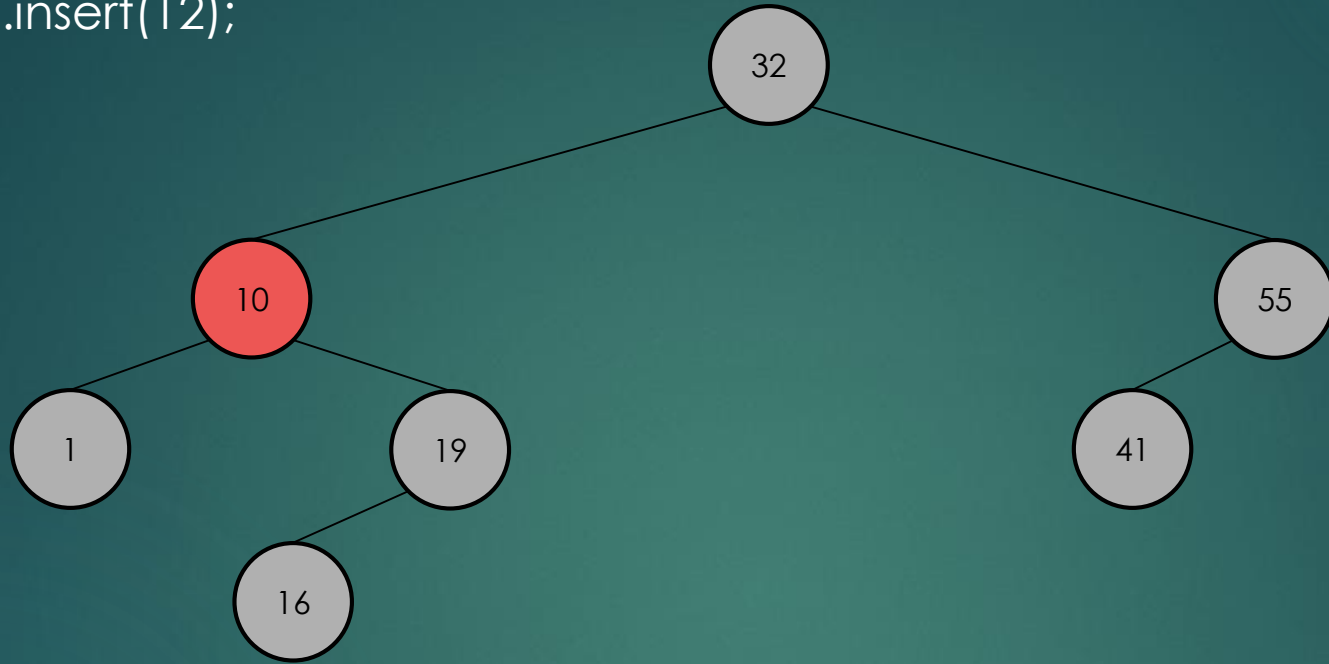
`balancedTree.insert(12);`



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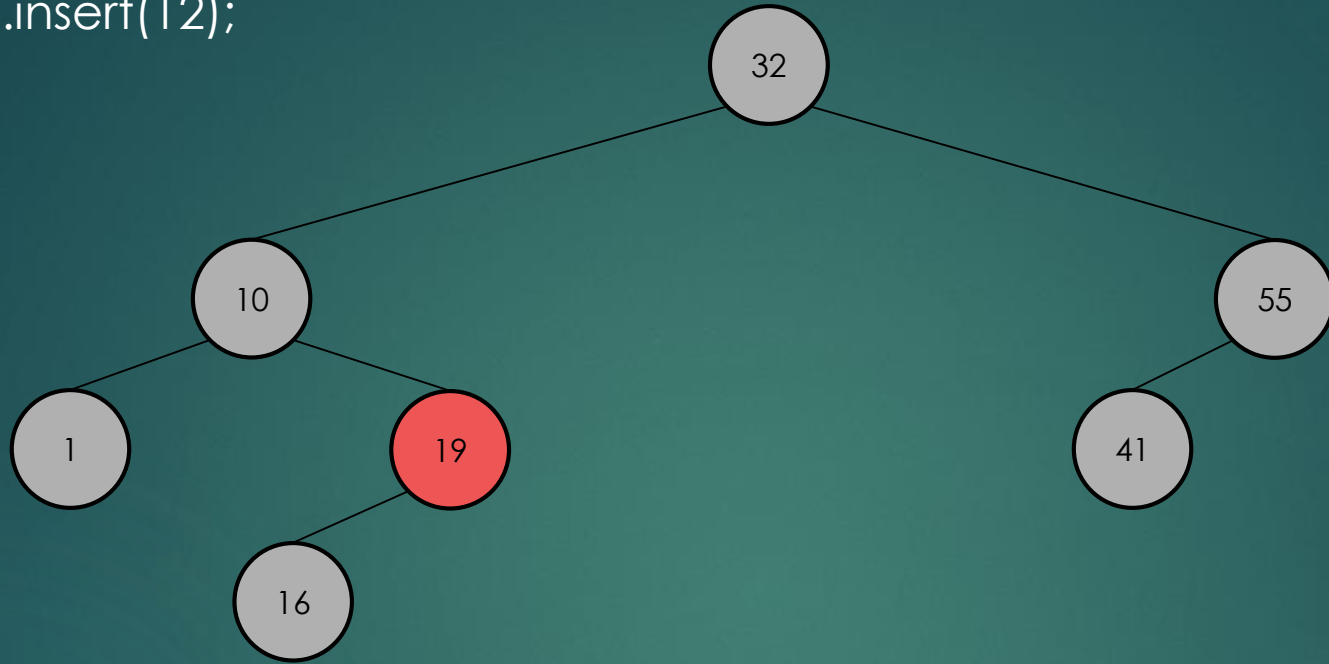


`balancedTree.insert(12);`

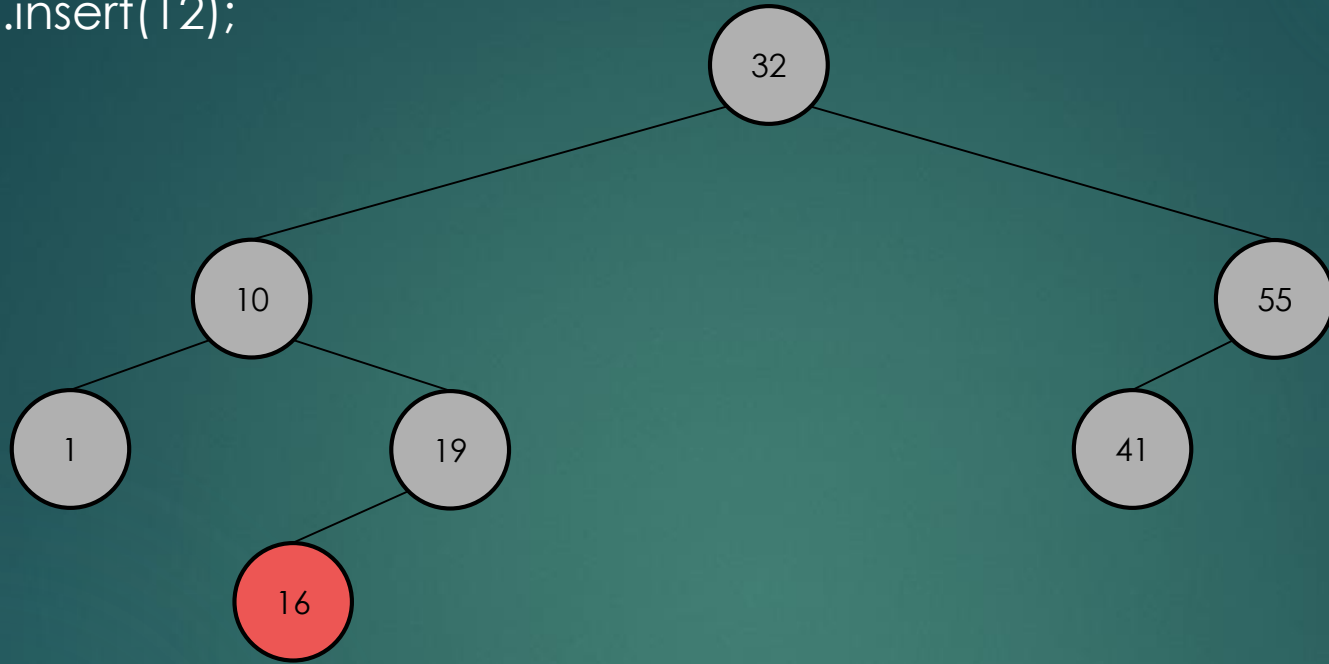




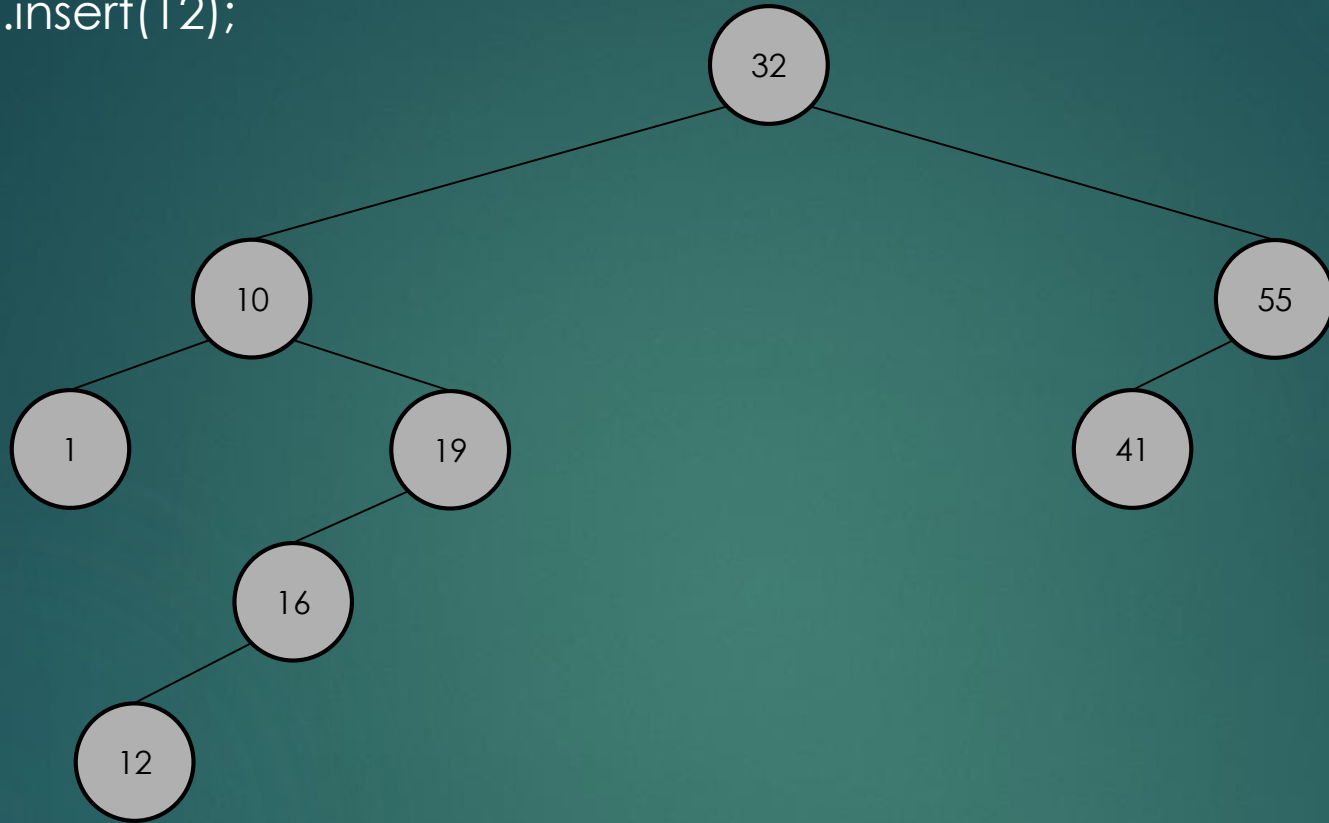
`balancedTree.insert(12);`



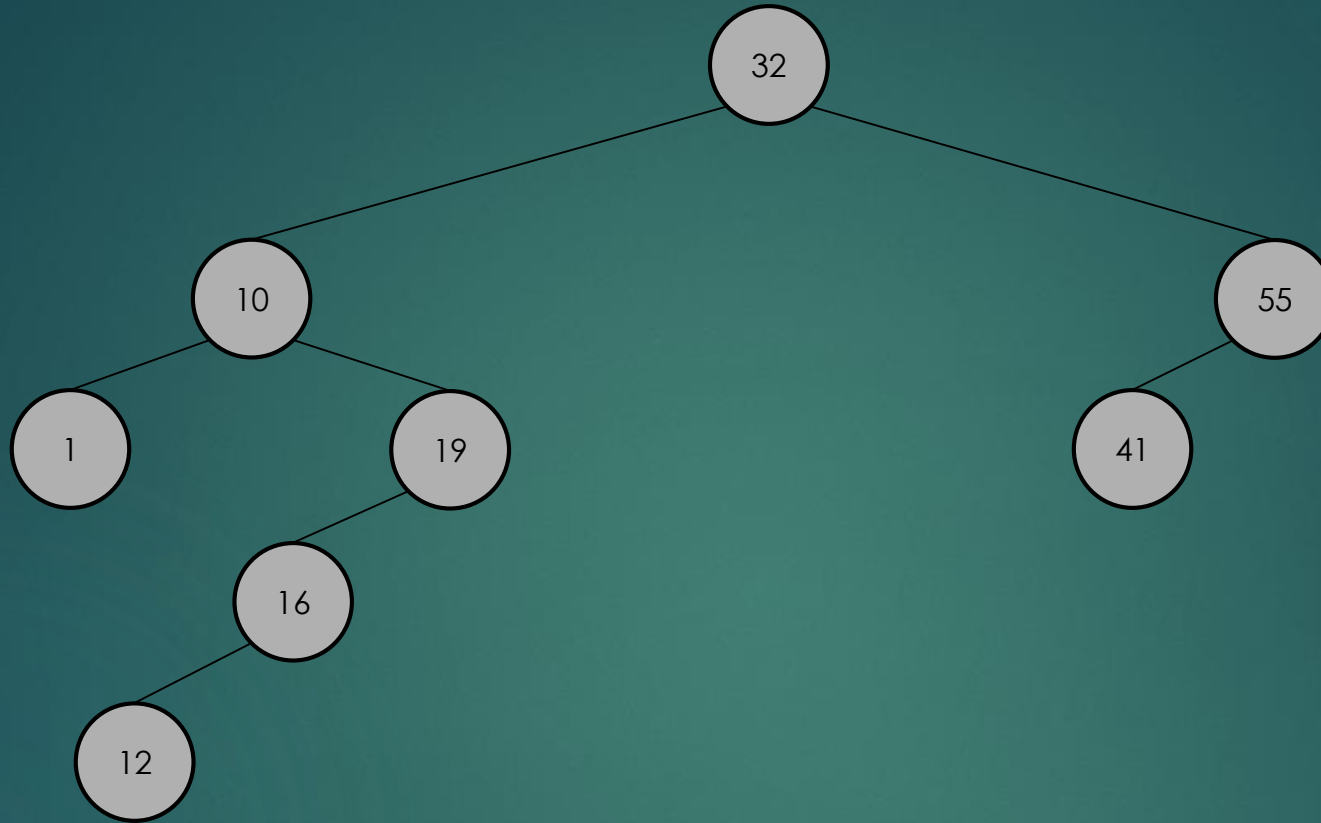
`balancedTree.insert(12);`



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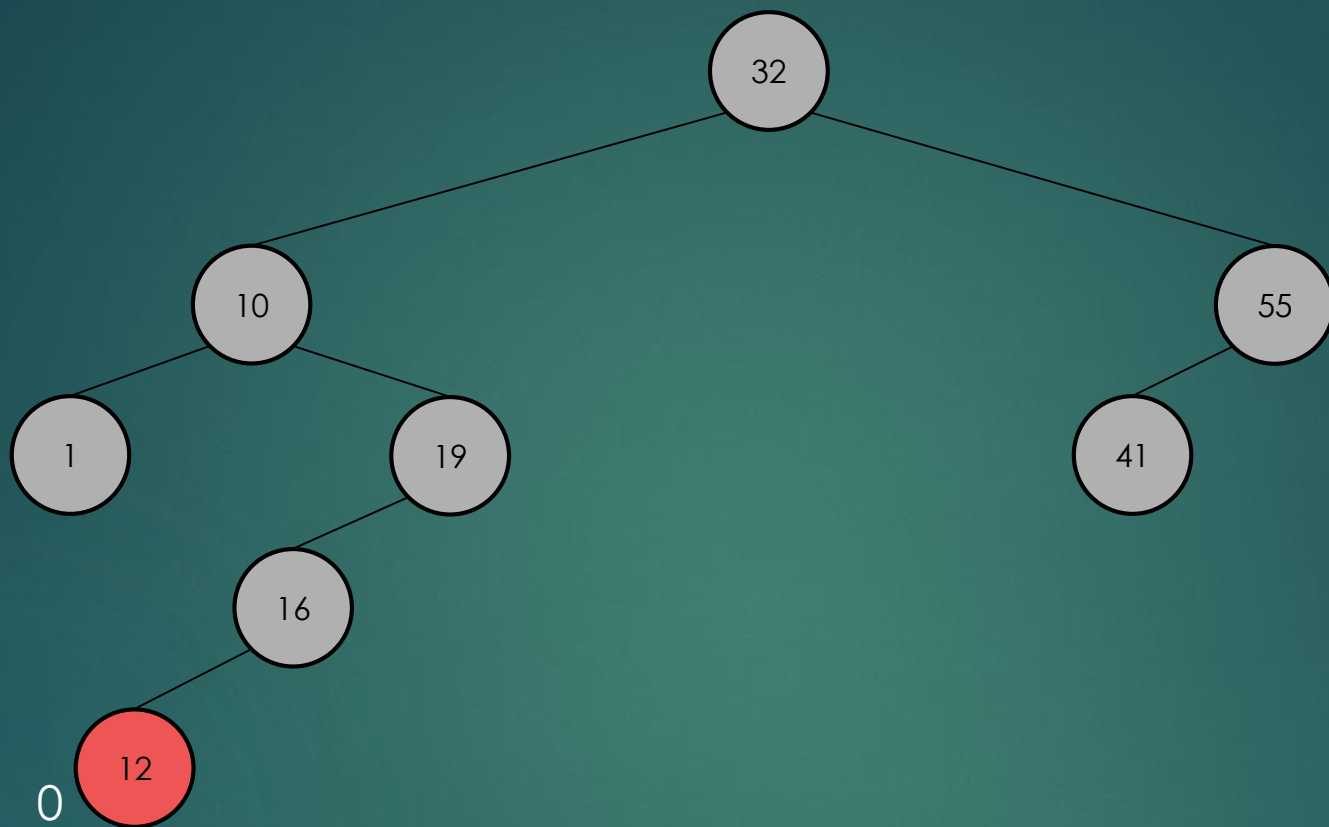


Let's calculate the height for each node



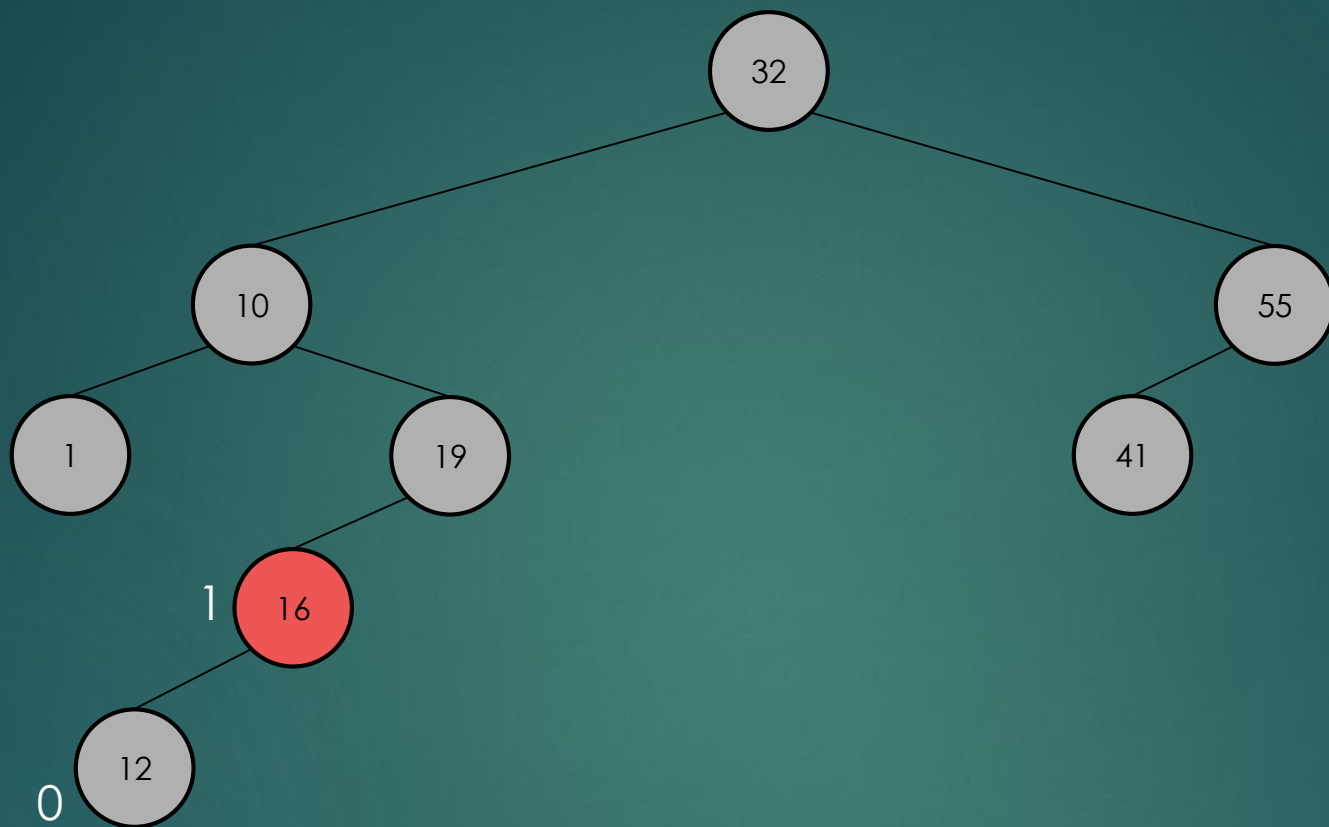
Important: to be able to write algorithm for calculating the height, we consider null pointers ( when a node have no left child for example ) to be of height -1 !!!

Let's calculate the height for each node



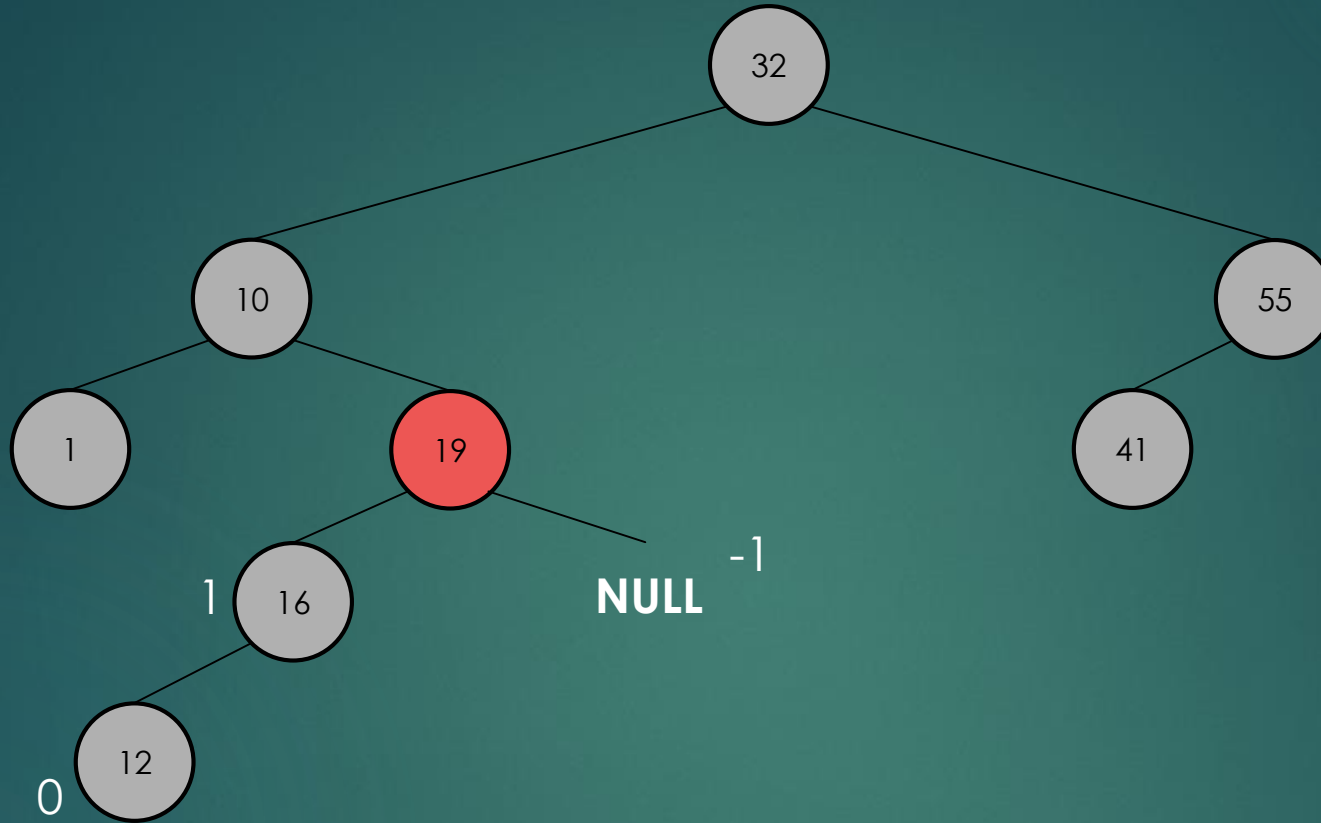
$$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$$

Let's calculate the height for each node



$$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$$

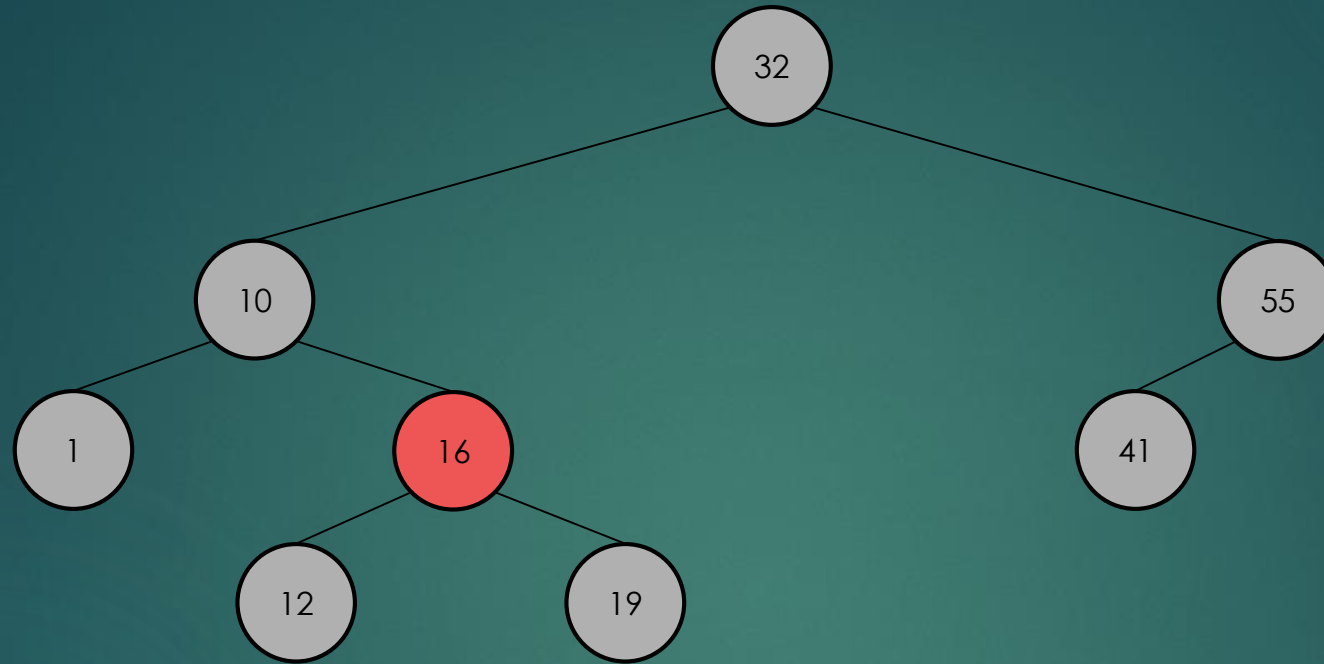
Let's calculate the height for each node



Problem: right child height is -1, left child height is +1 !!!

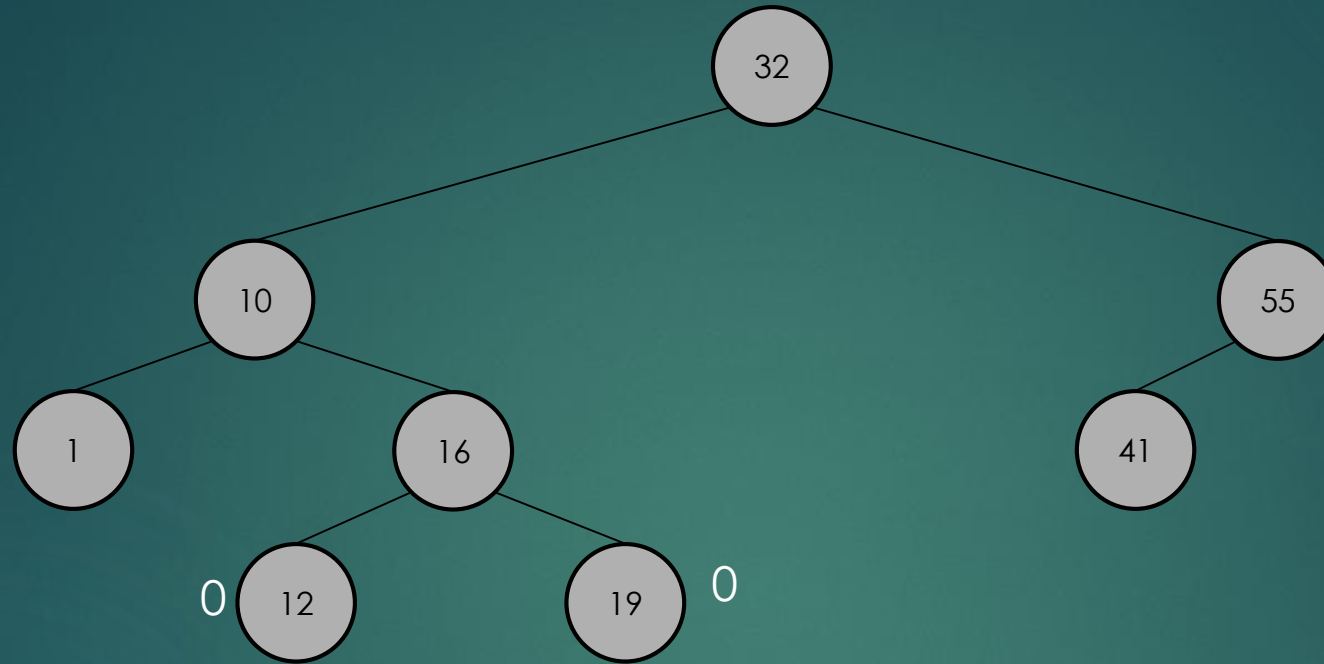
We have to make rotations // NULL objects have height -1 !!!

Let's calculate the height for each node

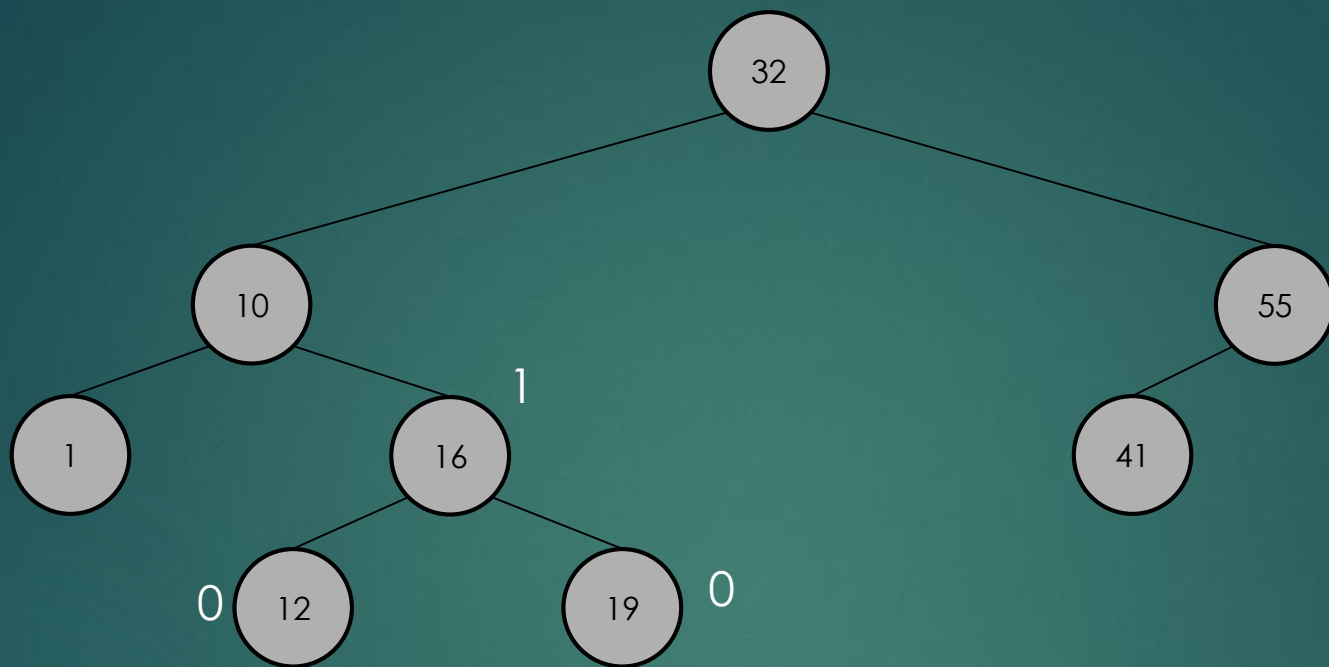




Let's calculate the height for each node

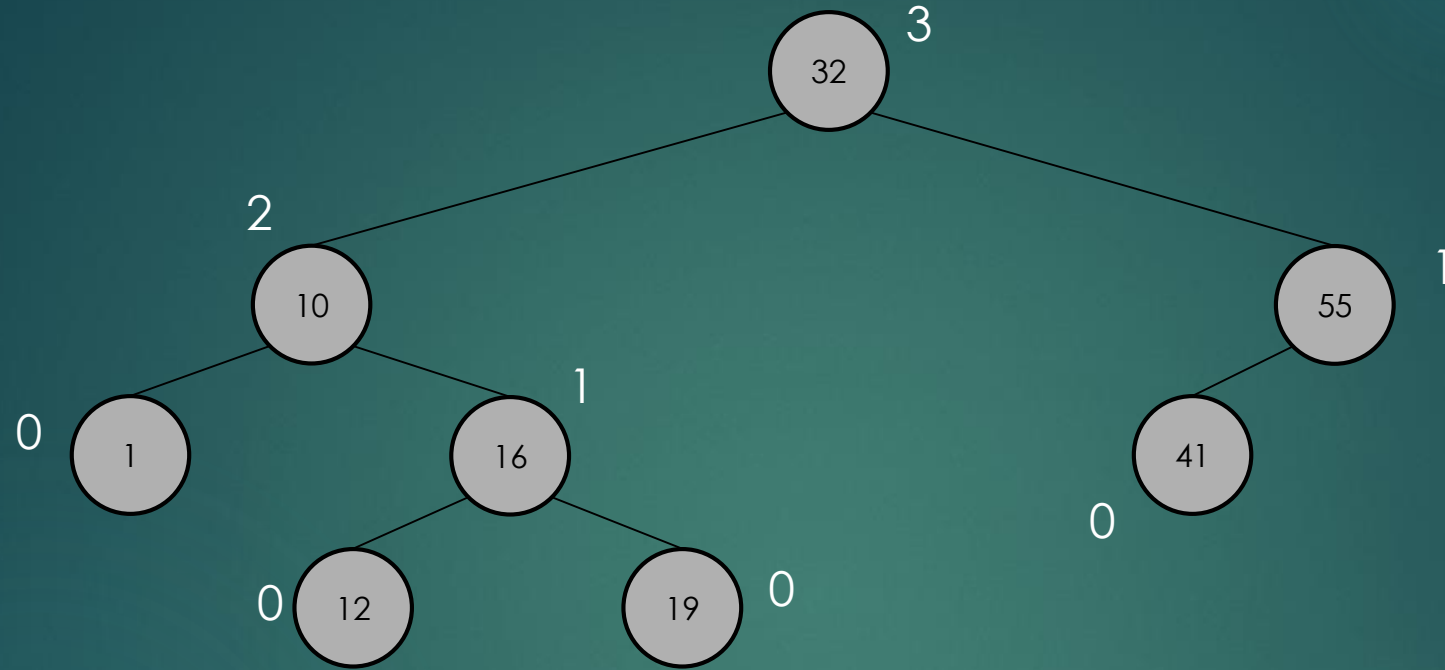


Let's calculate the height for each node



$$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$$

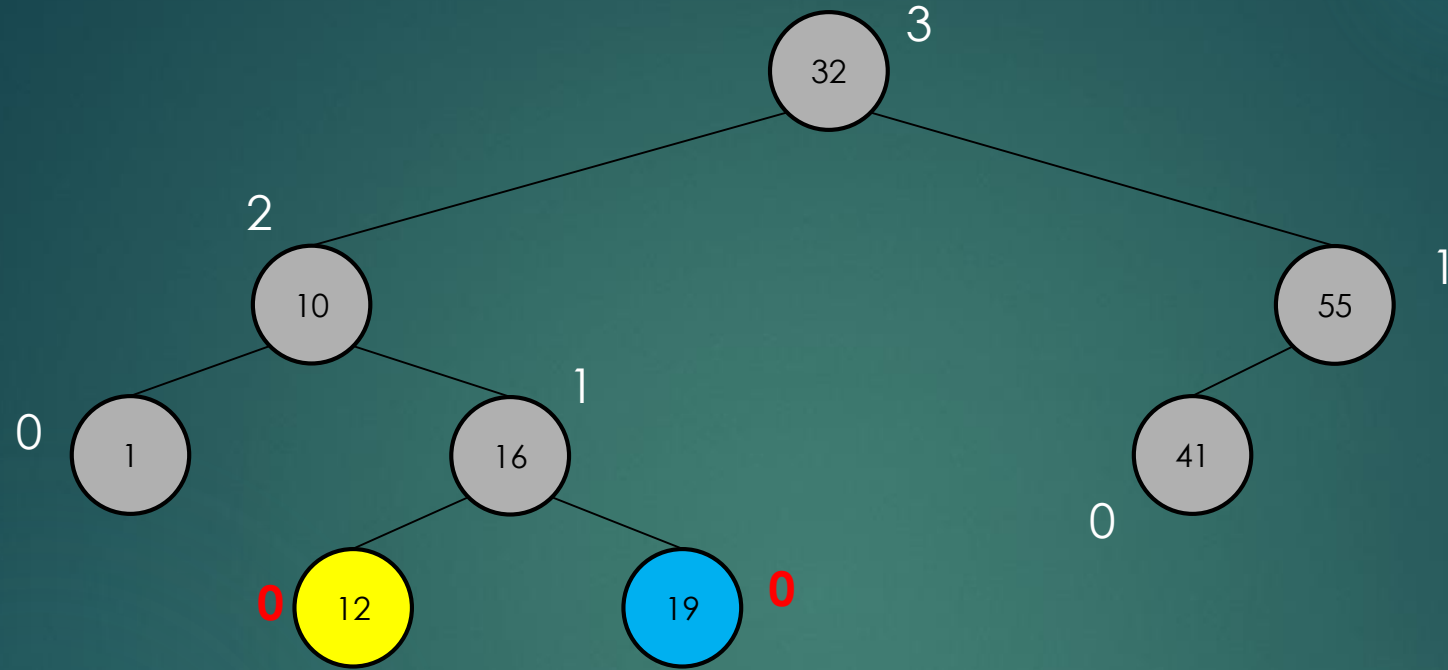
Let's calculate the height for each node



$$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$$

After the rotation: it is a valid balanced tree, the height of any left and right subtree do not differ more than 1 → so no further rotations are needed !!!

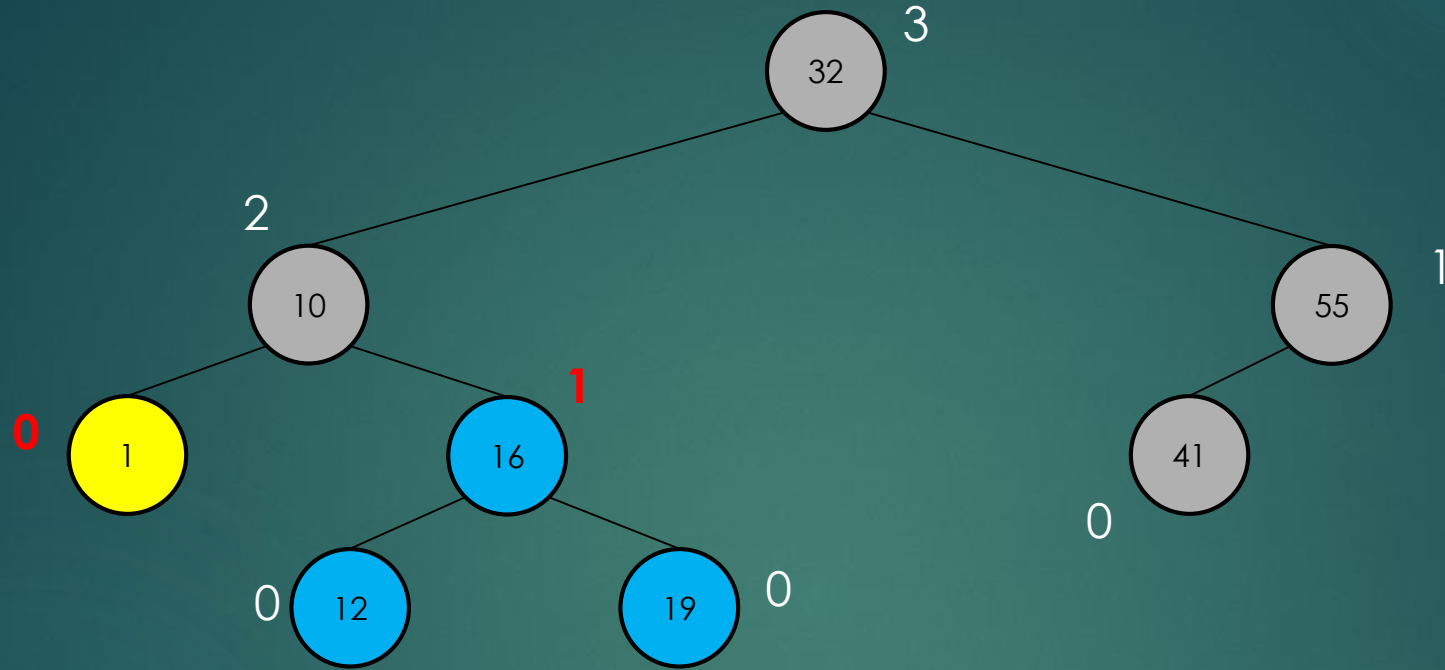
Let's calculate the height for each node



$$\text{height} = \max(\text{leftChild.height()}, \text{rightChild.height()}) + 1$$

After the rotation: it is a valid balanced tree, the height of any left and right subtree do not differ more than 1 → so no further rotations are needed !!!

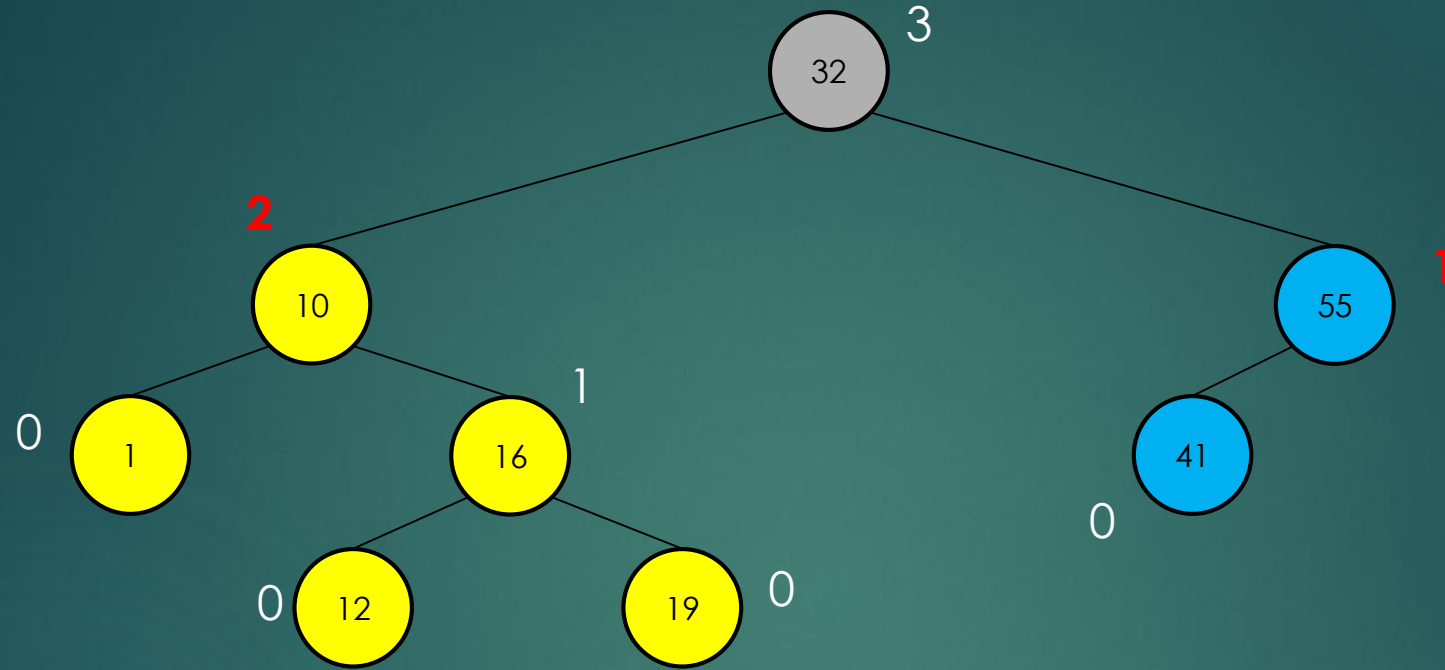
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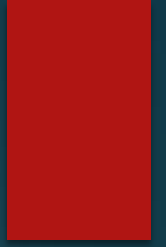
# Rotations

- ▶ Four types of unbalanced situations
  - ▶ LL: doubly left heavy situation...we have to make a right rotation
  - ▶ LR: we have to make a left and a right rotation
  - ▶ RL: we have to make a right and left rotation
  - ▶ RR: we have to make a left rotation

```
balancedTree.insert(10);
```

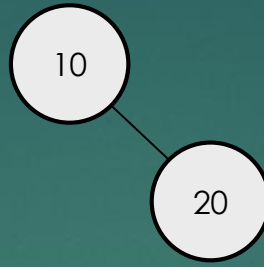


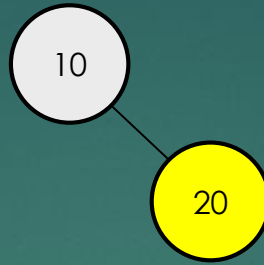
10

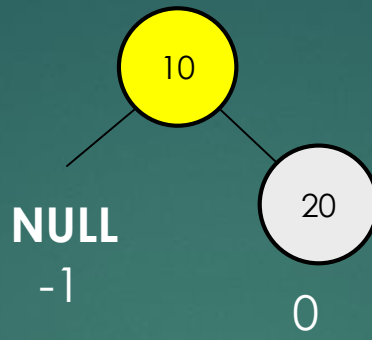


```
balancedTree.insert(20);
```

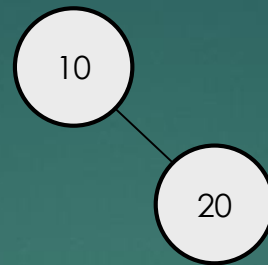


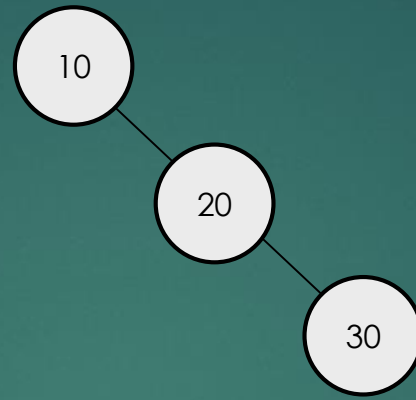


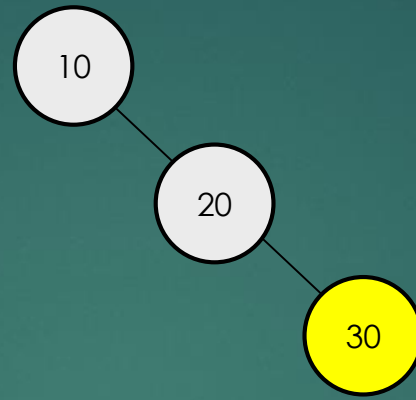




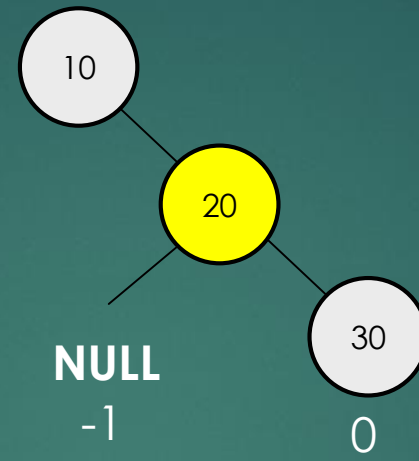
```
balancedTree.insert(30);
```

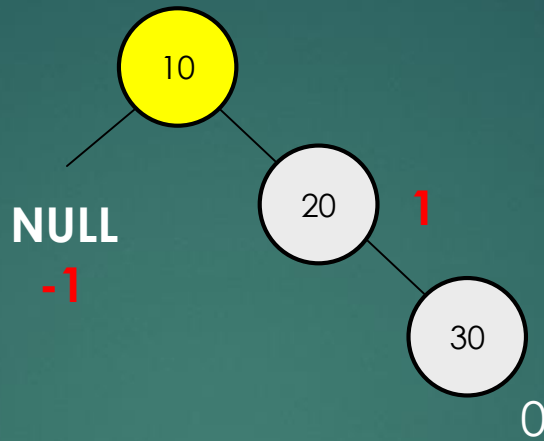




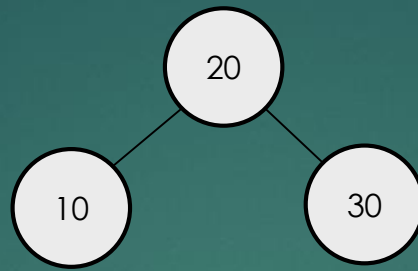




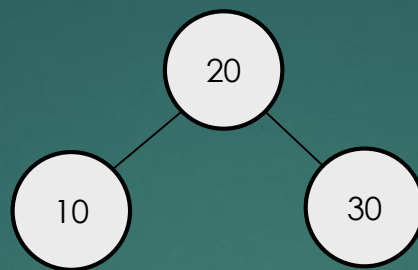


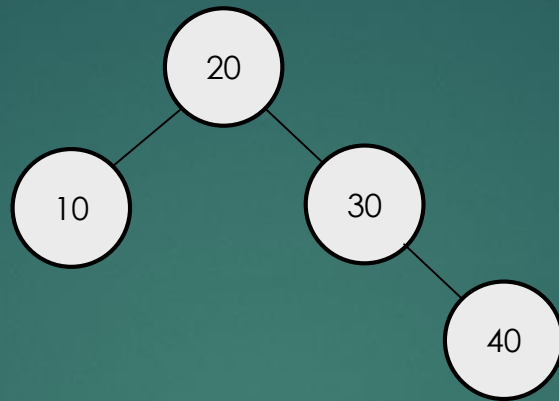


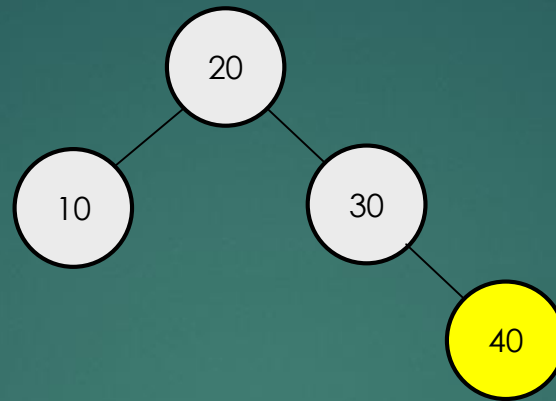
The difference between the height parameters  
is greater than 1 → rotations are needed !!!

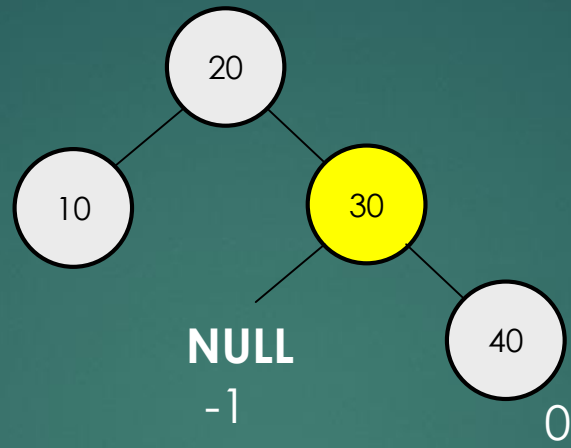


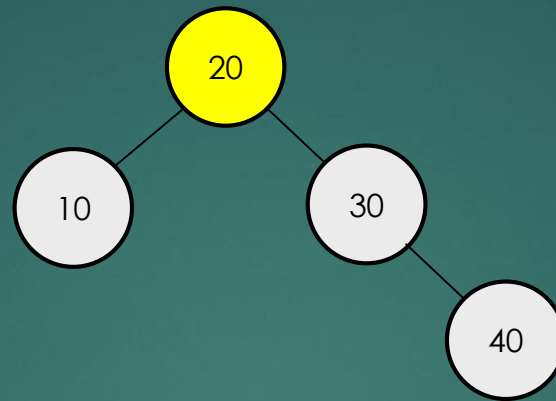
```
balancedTree.insert(40);
```



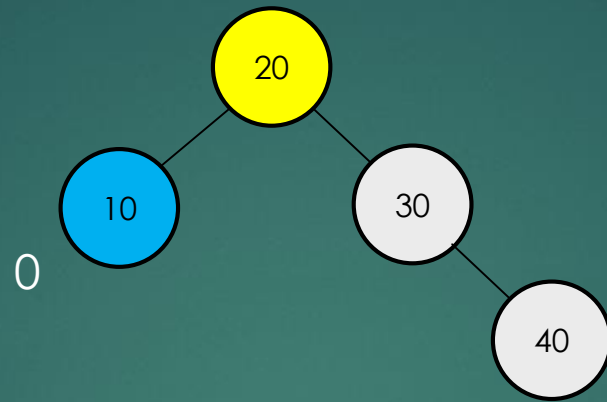


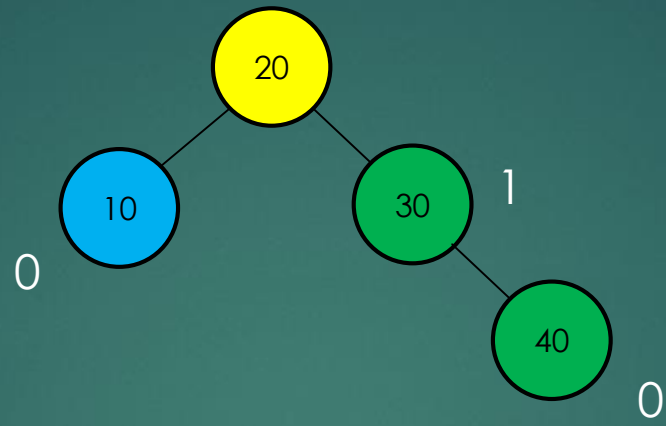




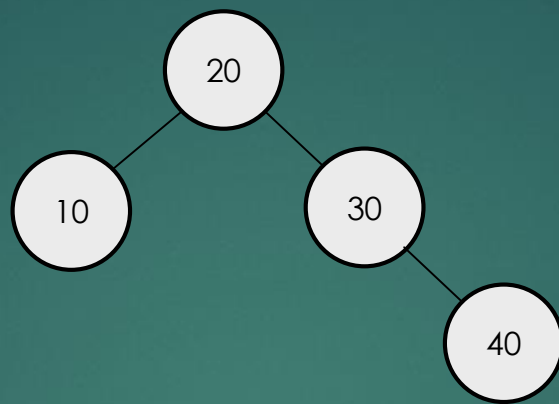


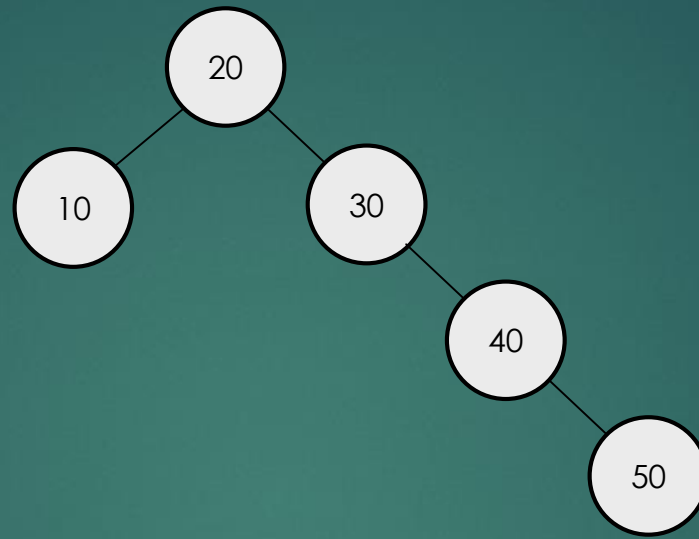


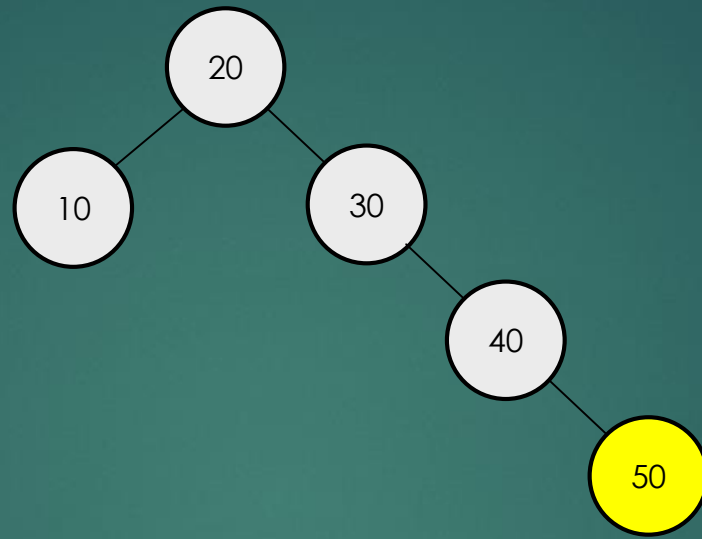


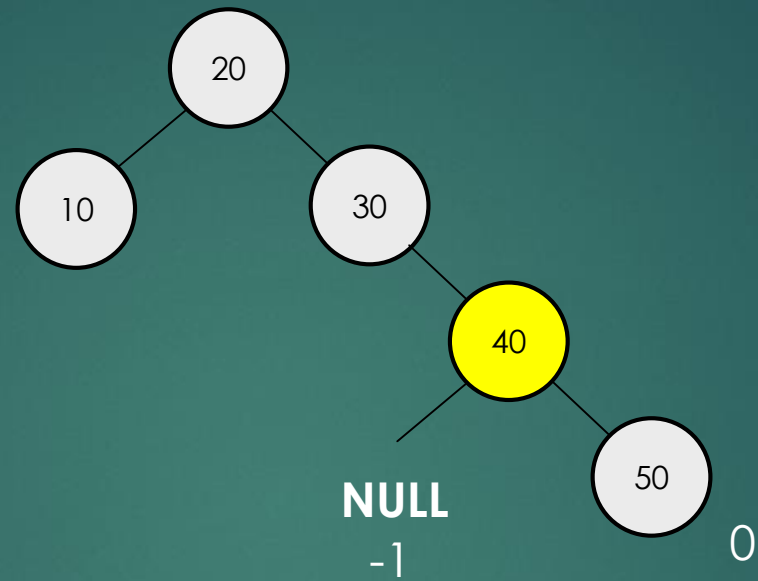


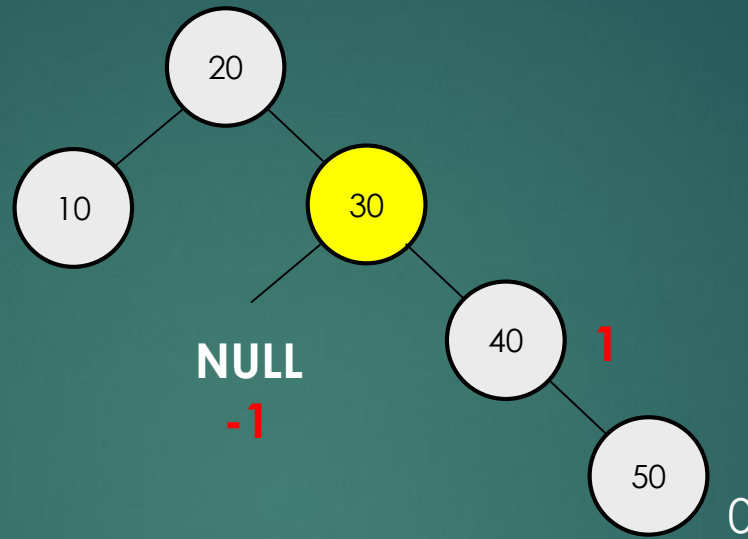
```
balancedTree.insert(50);
```



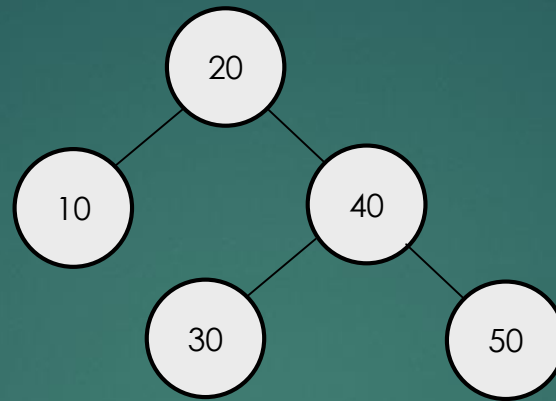






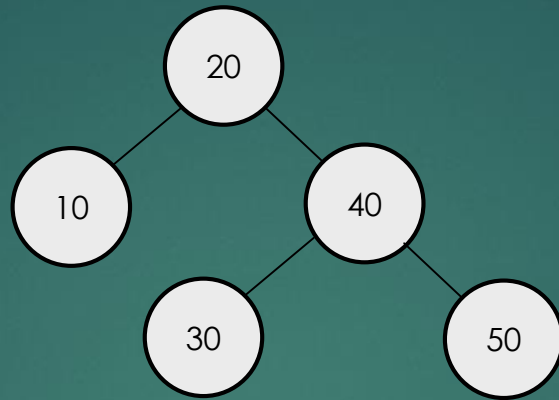


The difference between the height parameters  
is greater than 1 → **rotations are needed** !!!

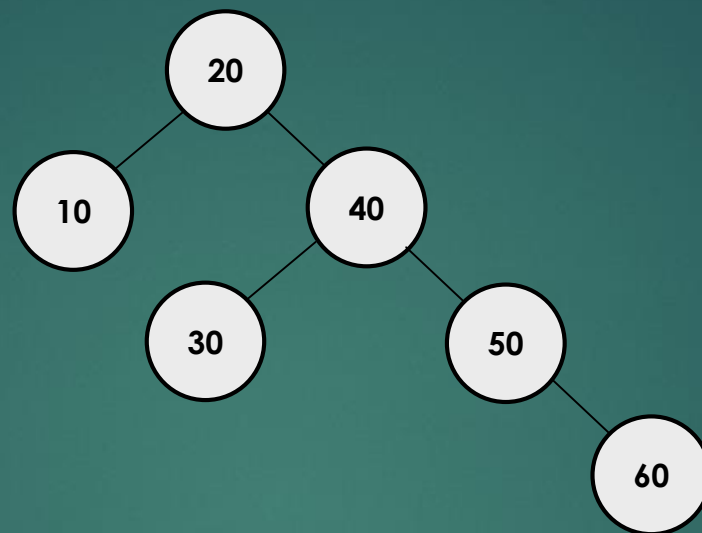


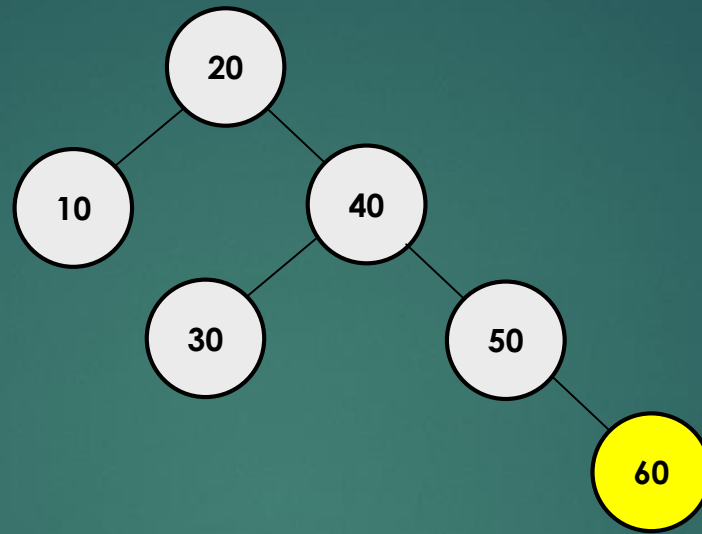


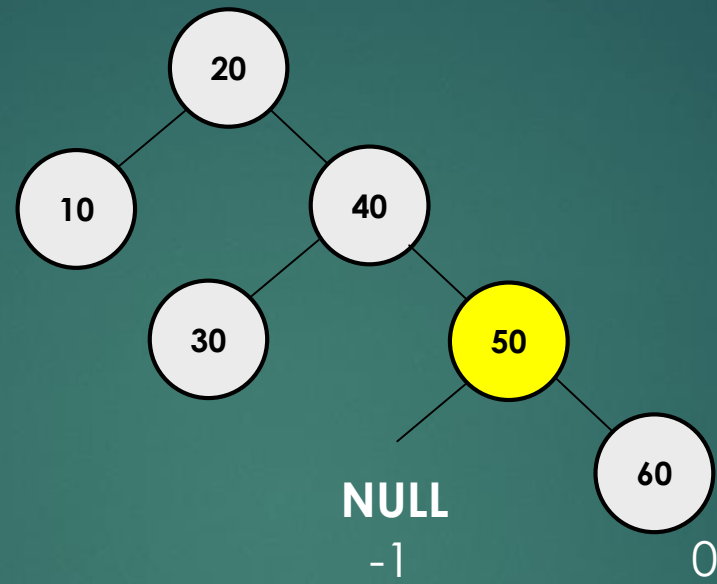
```
balancedTree.insert(60);
```

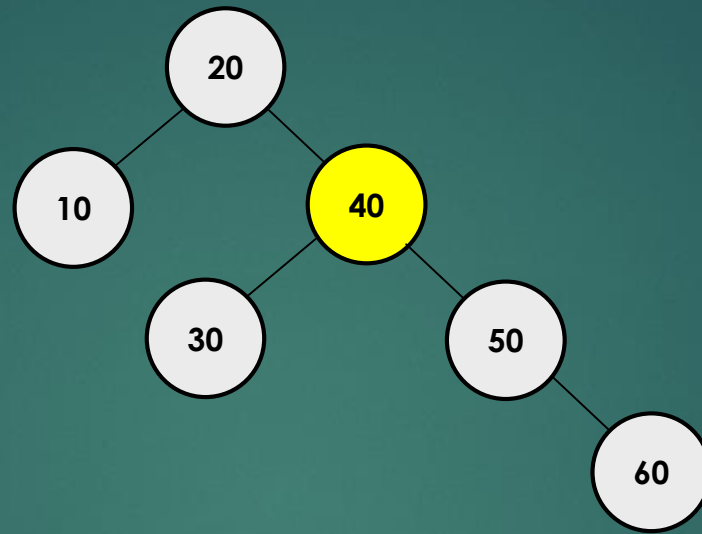


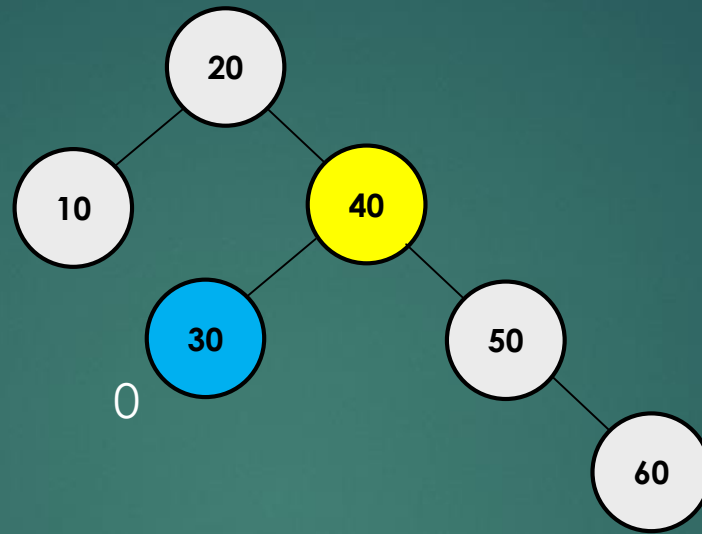
```
balancedTree.insert(60);
```

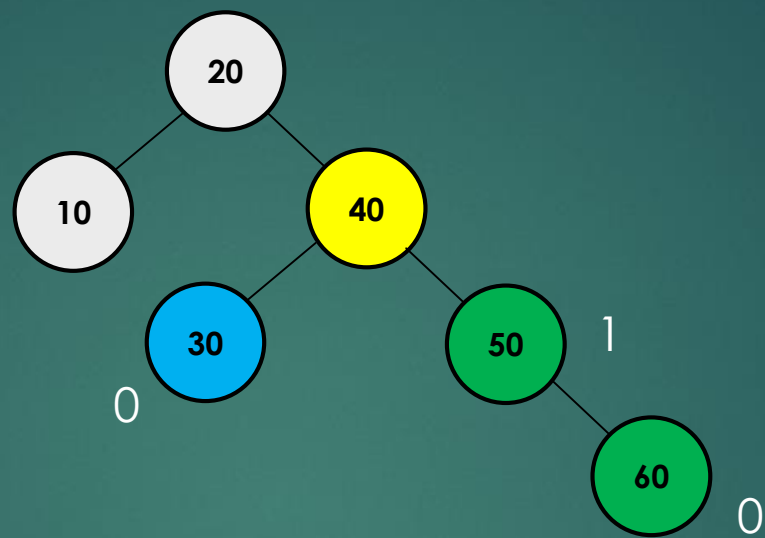


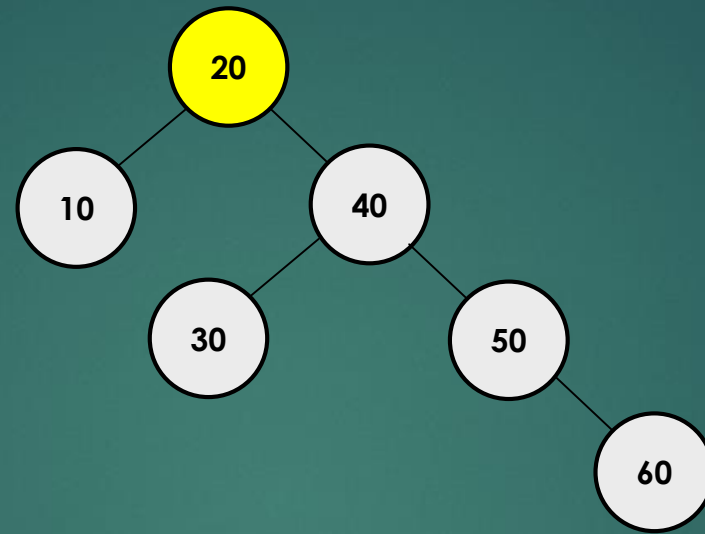




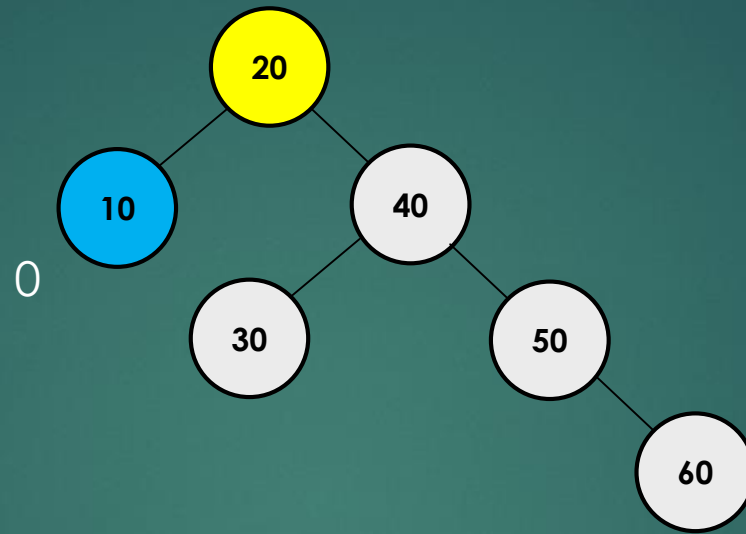


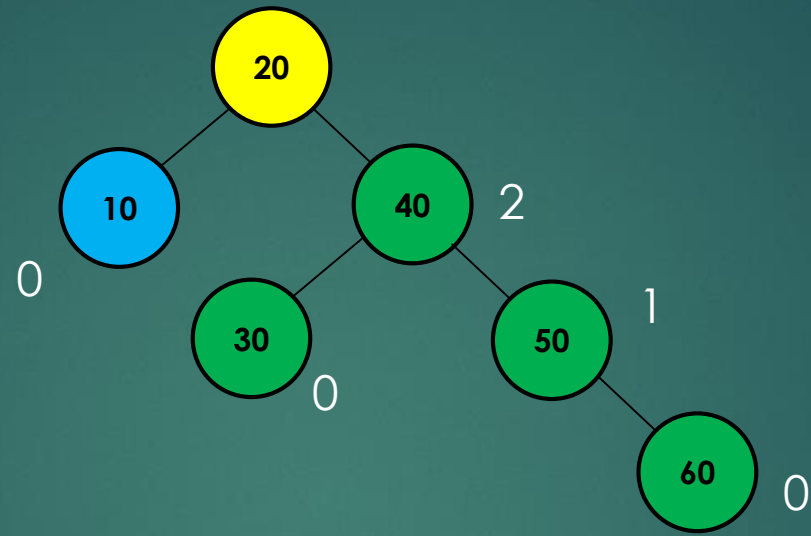


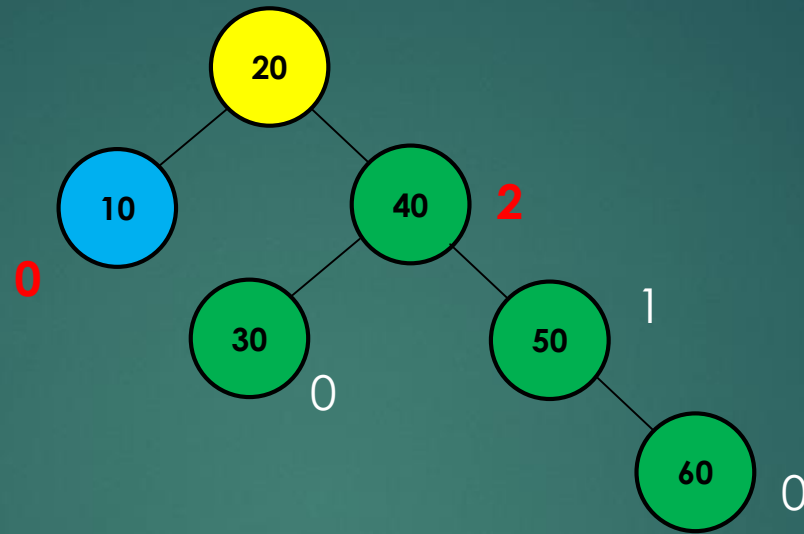




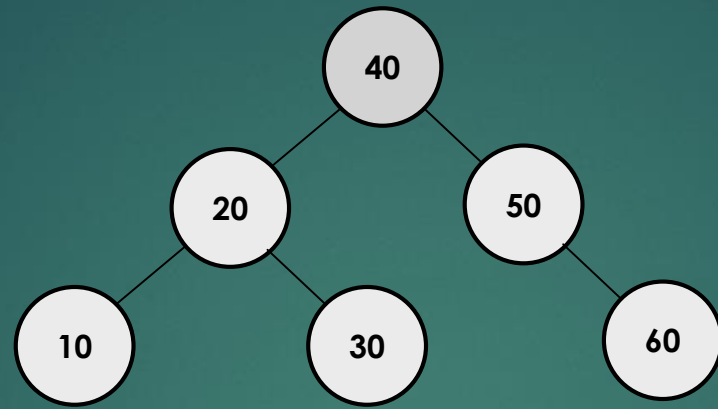








The difference between the height parameters  
is greater than 1 → **rotations are needed** !!!



# AVL TREES

REMOVE

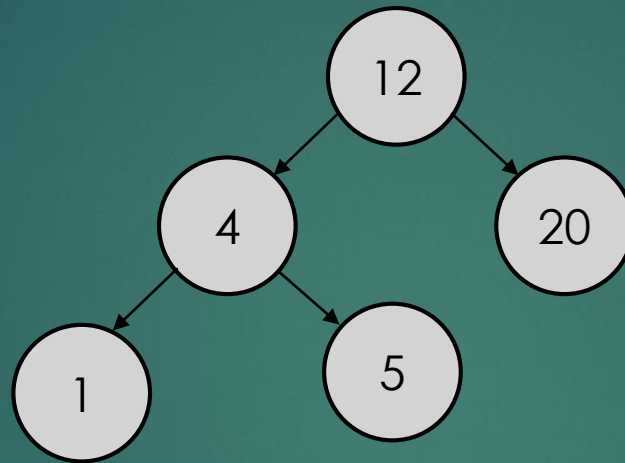
**Delete:** soft delete → we do not remove the node from the BST we just mark that it has been removed  
~ not so efficient solution

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~ not so efficient solution

In the main **three** possible cases:

- 1.) The node we want to get rid of is a leaf node
- 2.) The node we want to get rid of has a single child
- 3.) The node we want to get rid of has 2 children

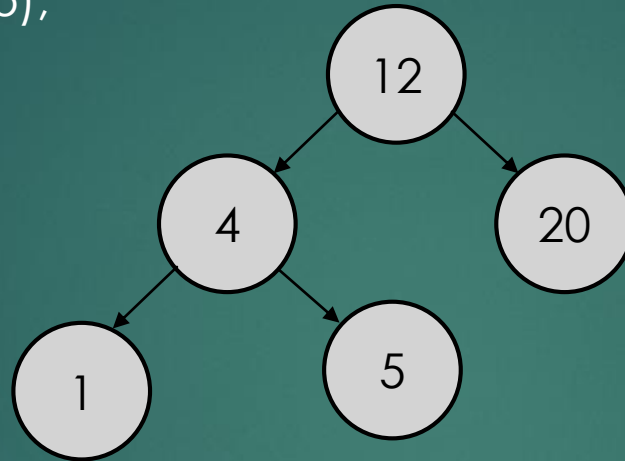
**Delete:** 1.) We want to get rid of a leaf node: very simple, we just have to remove it ( set it to null whatever )





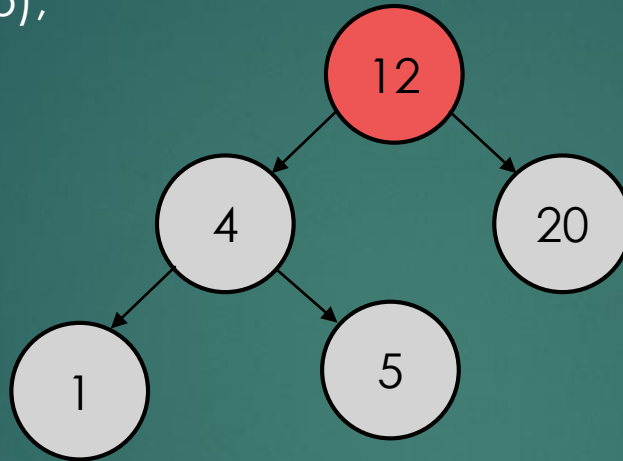
**Delete:** 1.) We want to get rid of a leaf node: very simple, we just have to remove it ( set it to null whatever )

`binarySearchTree.remove(5);`



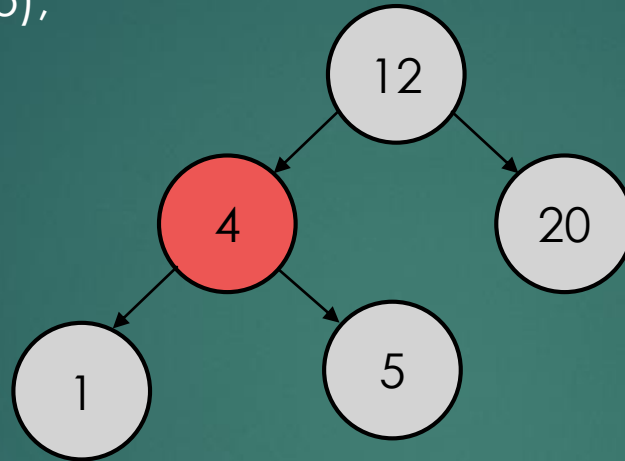
**Delete:** 1.) We want to get rid of a leaf node: very simple, we just have to remove it ( set it to null whatever )

`binarySearchTree.remove(5);`



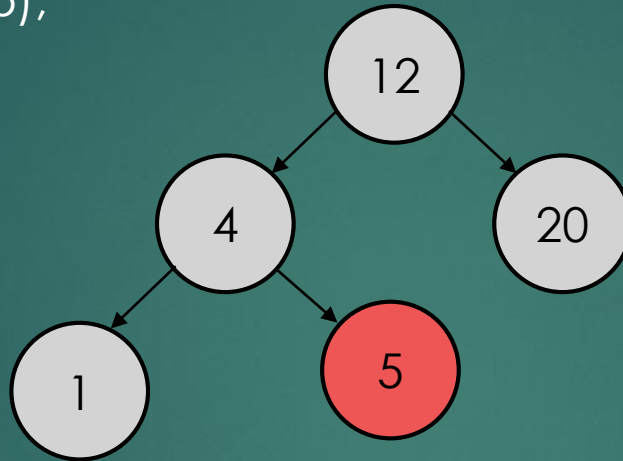
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`binarySearchTree.remove(5);`



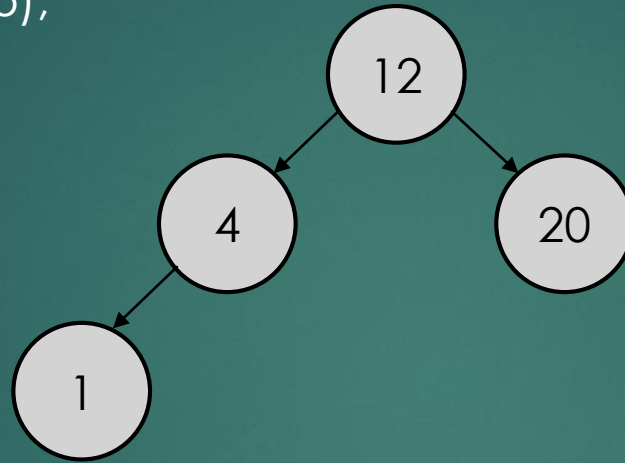
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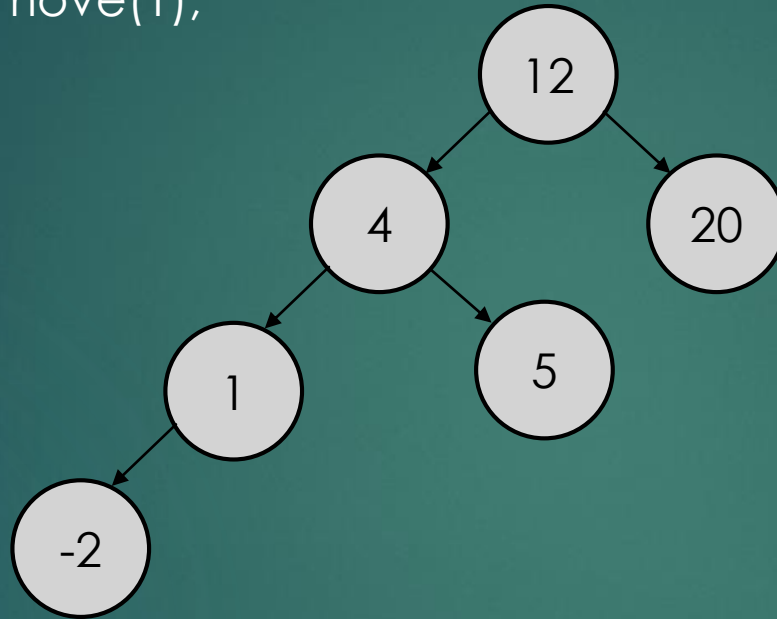


Complexity: we have to find the item itself + we have to delete it or set it to NULL

~  **$O(\log N)$**  find operation +  **$O(1)$**  deletion =  **$O(\log N)$**  !!!

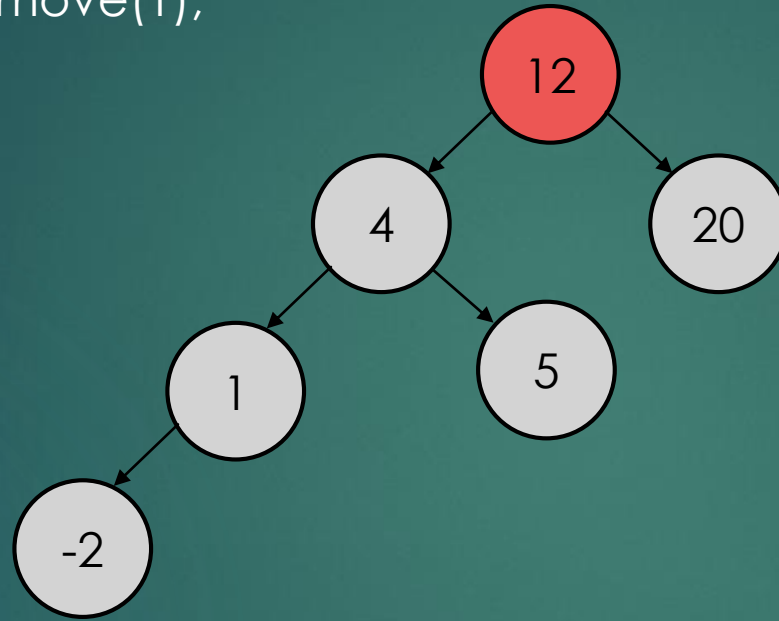
**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

```
binarySearchTree.remove(1);
```



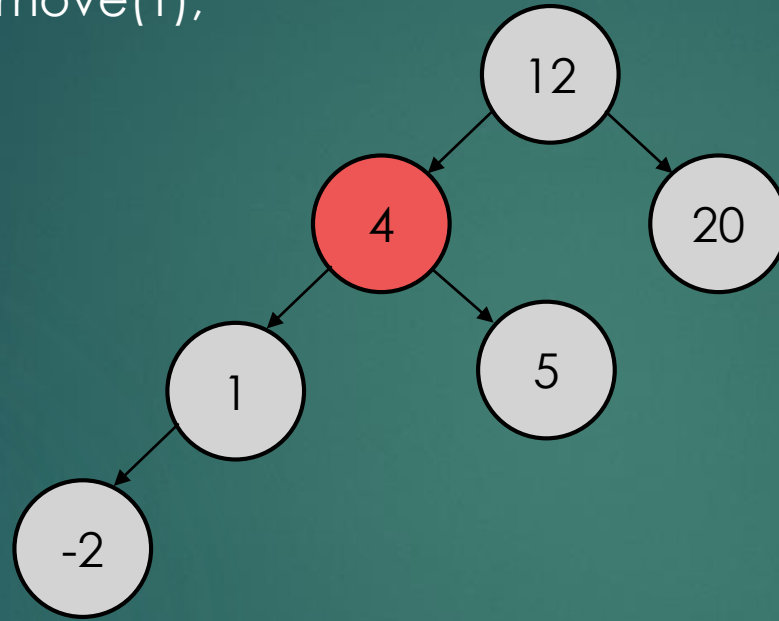
**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

```
binarySearchTree.remove(1);
```



**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

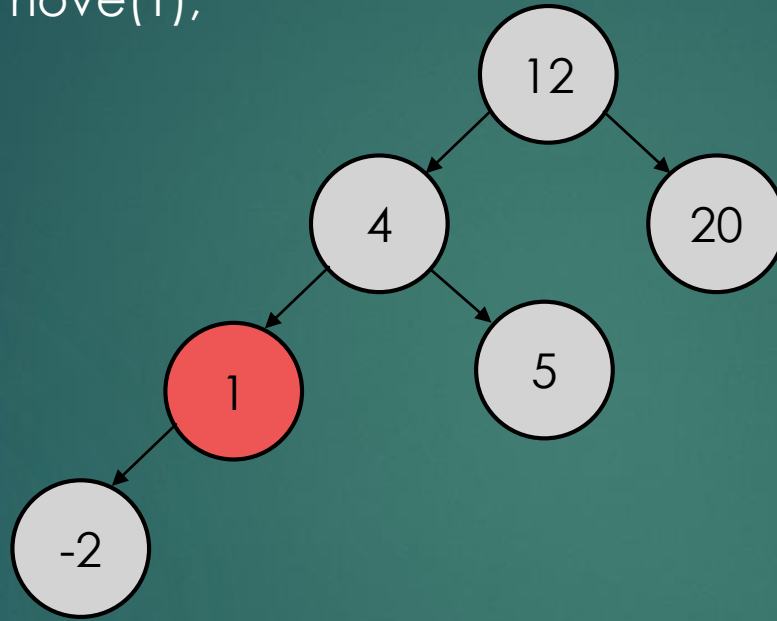
```
binarySearchTree.remove(1);
```





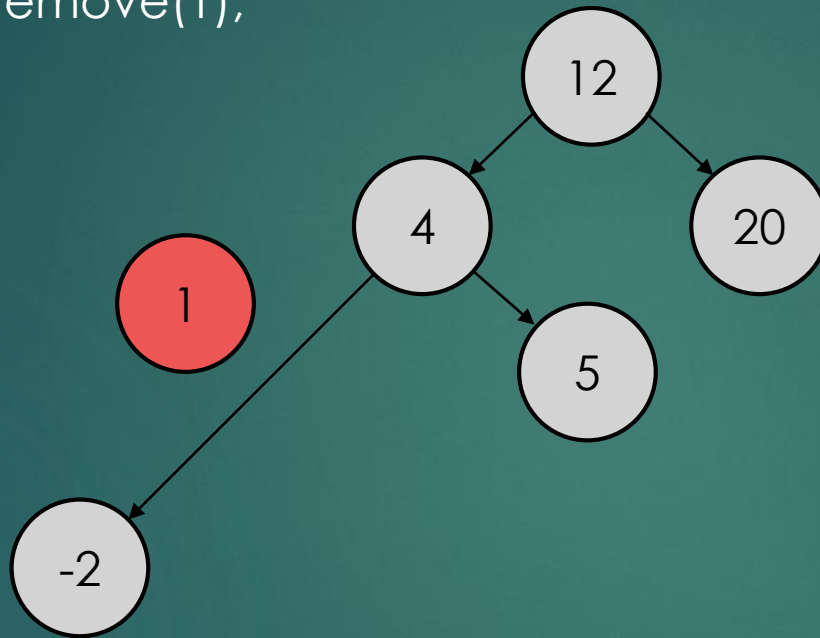
**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

```
binarySearchTree.remove(1);
```



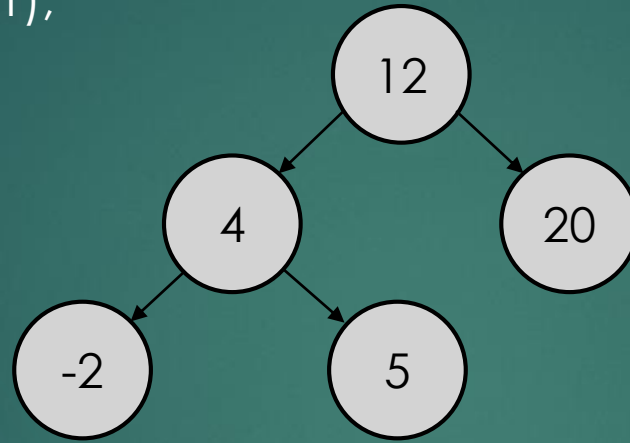
**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

```
binarySearchTree.remove(1);
```



**Delete:** 2.) We want to get rid of a node that has a single child, we just have to update the references

```
binarySearchTree.remove(1);
```



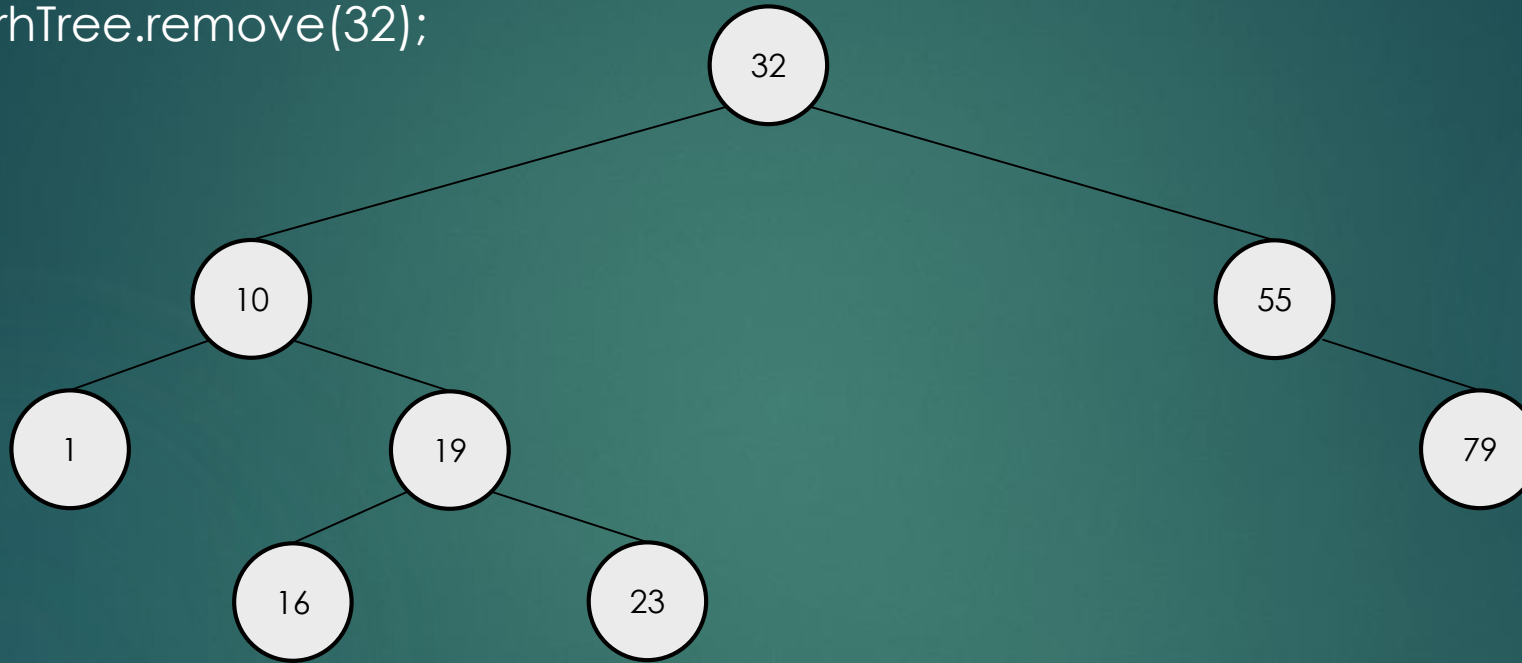
Complexity: first we have to find the item we want to get rid of and we have to update the references  
~ set parent's pointer point to it's grandchild directly

$O(\log N)$  find operation +  $O(1)$  update references =  $O(\log N)$  !!!

Delete: 3.) We want to get rid of a node that has two children

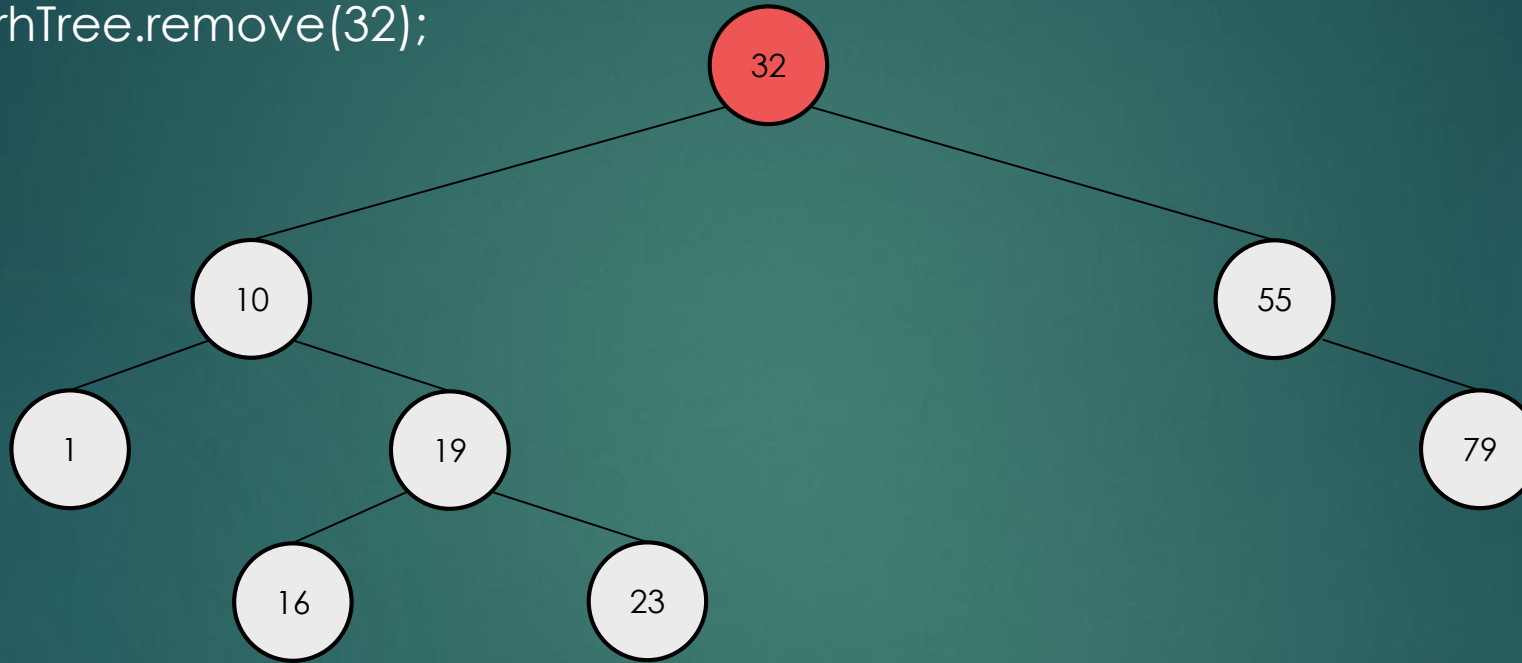
Delete: 3.) We want to get rid of a node that has two children

`binarySearchTree.remove(32);`



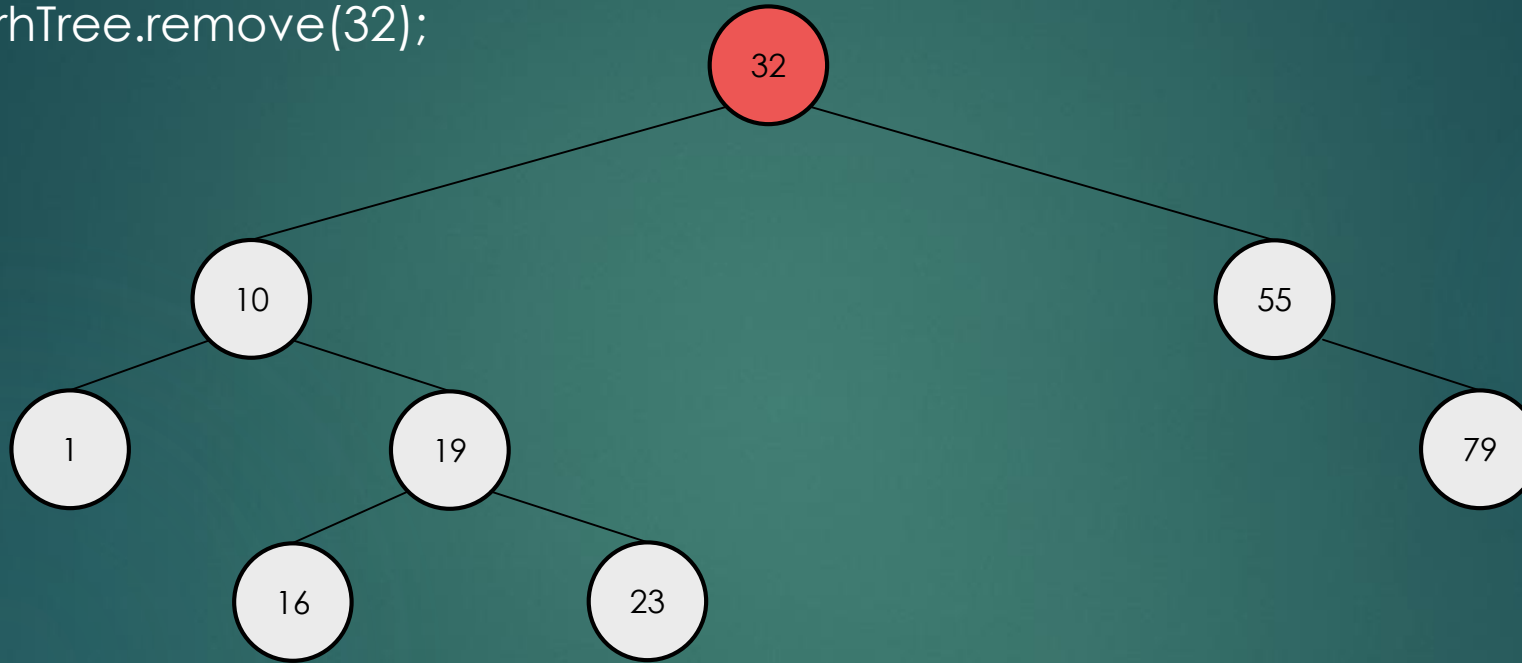
**Delete:** 3.) We want to get rid of a node that has two children

`binarySearchTree.remove(32);`



**Delete:** 3.) We want to get rid of a node that has two children

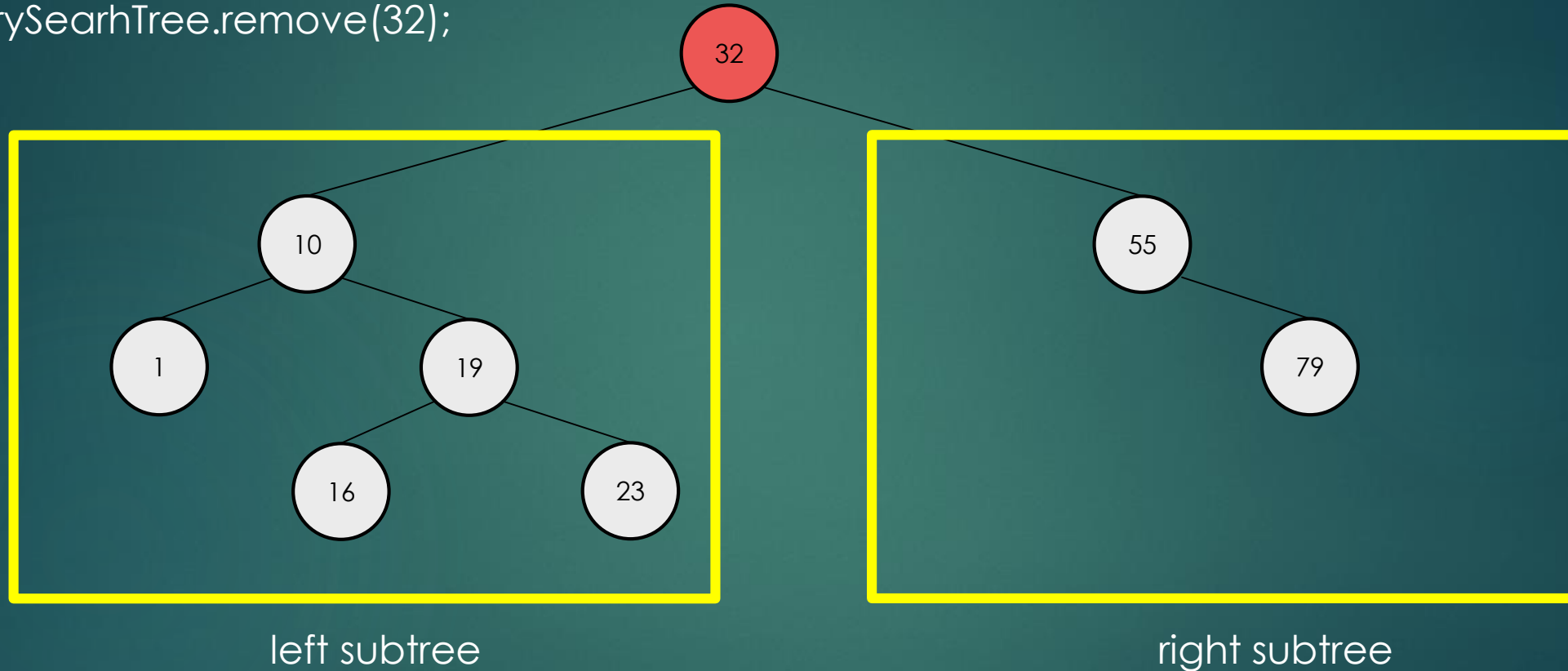
`binarySearchTree.remove(32);`



We have two options: we look for the largest item in the left subtree  
OR the smallest item in the right subtree !!!

**Delete:** 3.) We want to get rid of a node that has two children

`binarySearchTree.remove(32);`

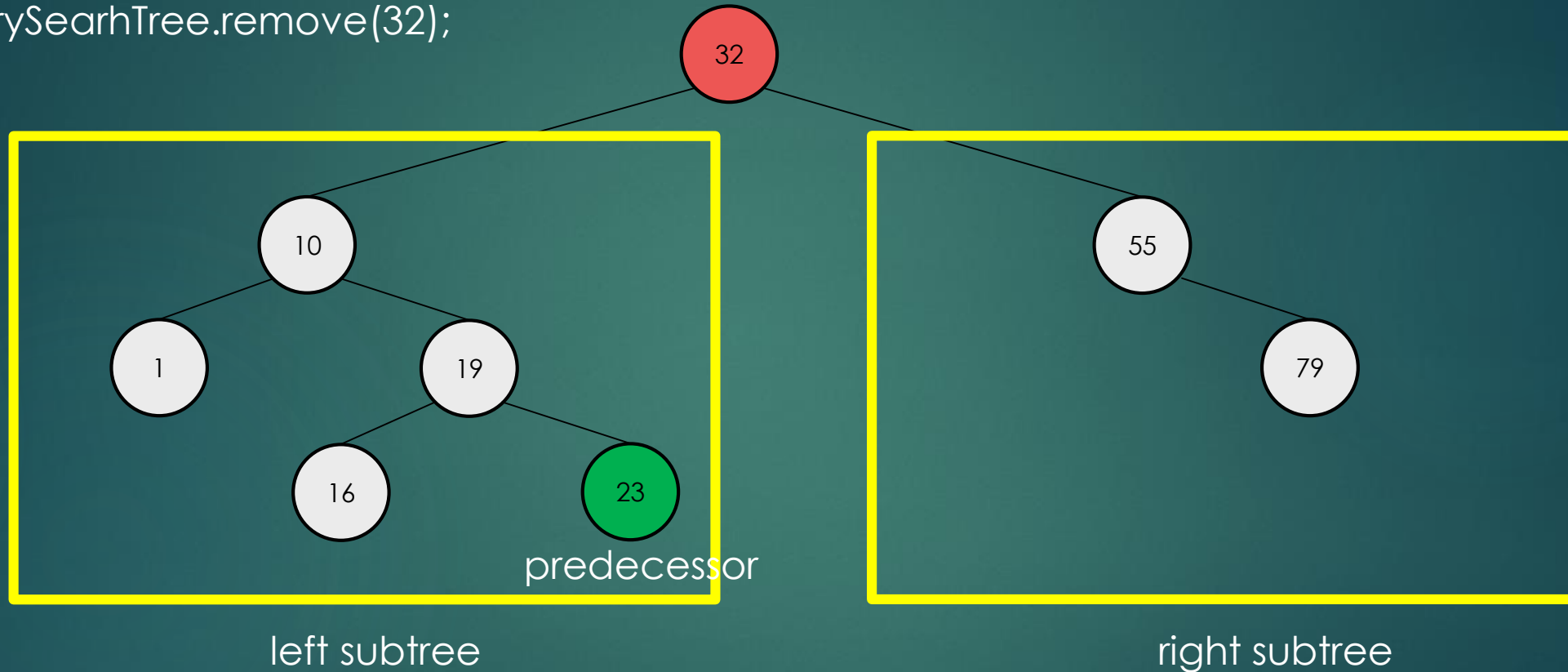


We have two options: we look for the largest item in the left subtree  
OR the smallest item in the right subtree !!!



**Delete:** 3.) We want to get rid of a node that has two children

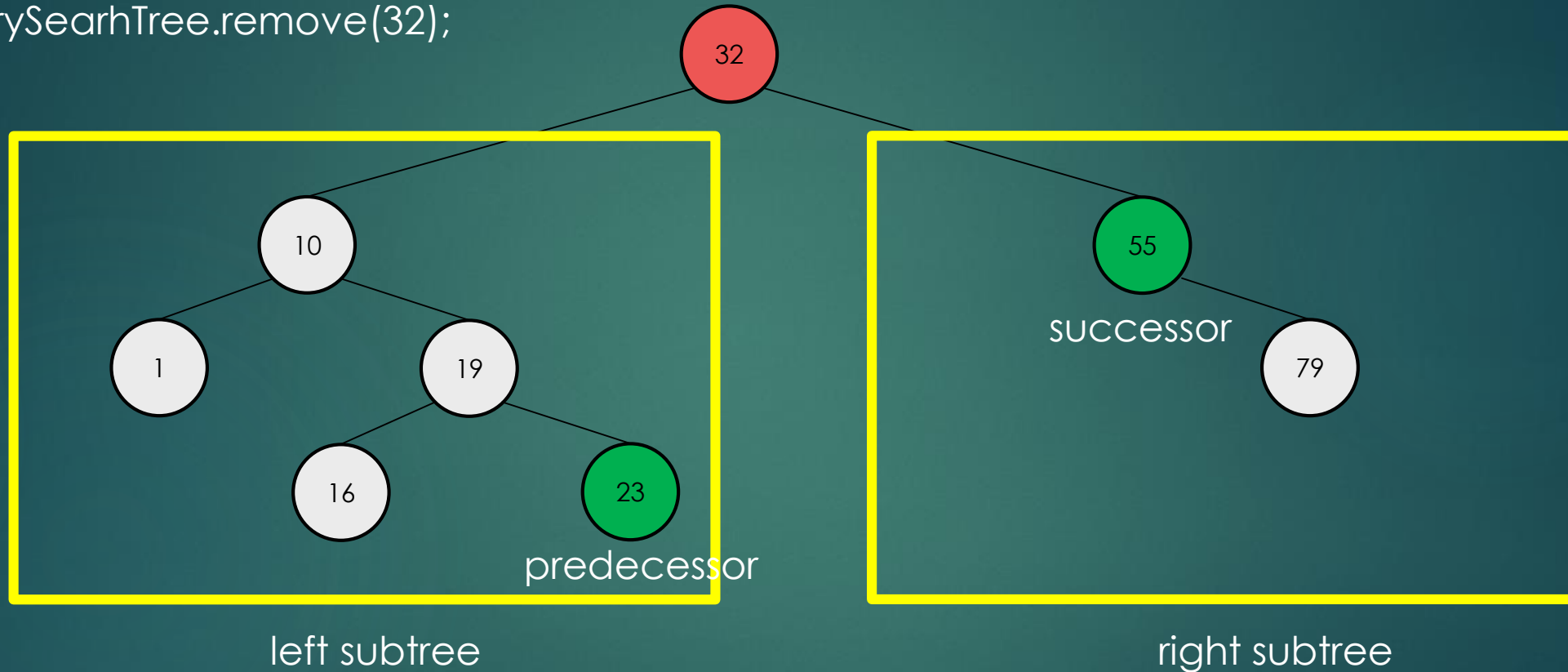
`binarySearchTree.remove(32);`



We have two options: we look for the largest item in the left subtree  
OR the smallest item in the right subtree !!!

**Delete:** 3.) We want to get rid of a node that has two children

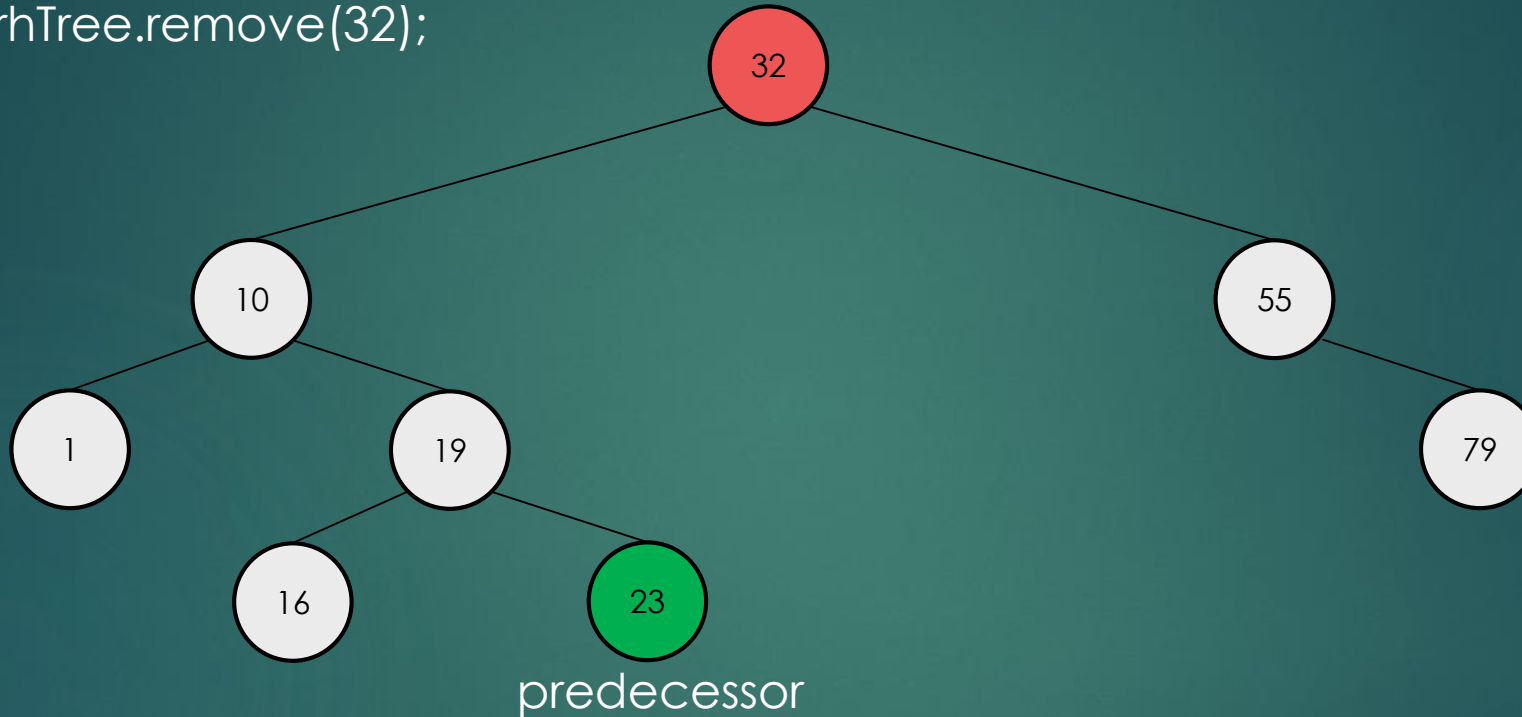
`binarySearchTree.remove(32);`



We have two options: we look for the largest item in the left subtree  
OR the smallest item in the right subtree !!!

**Delete:** 3.) We want to get rid of a node that has two children

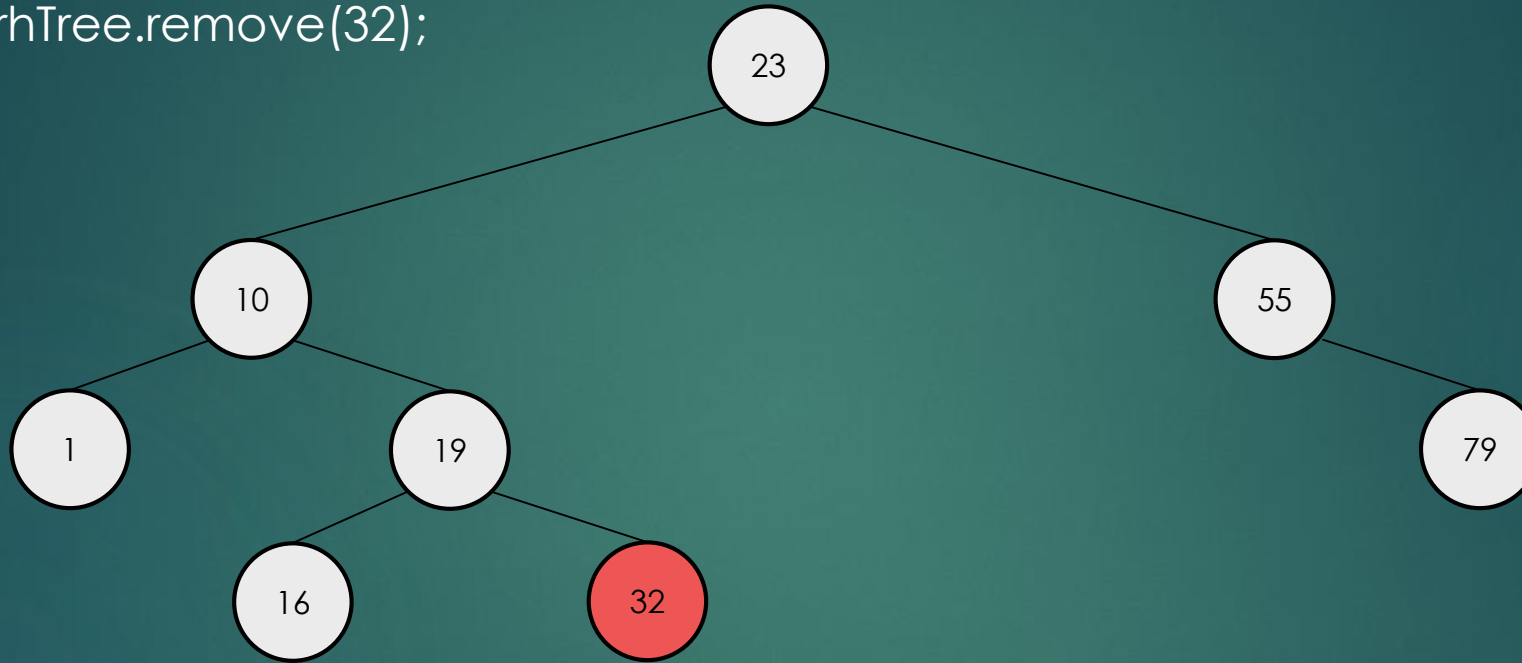
`binarySearchTree.remove(32);`



We look for the predecessor and swap the two nodes !!!

**Delete:** 3.) We want to get rid of a node that has two children

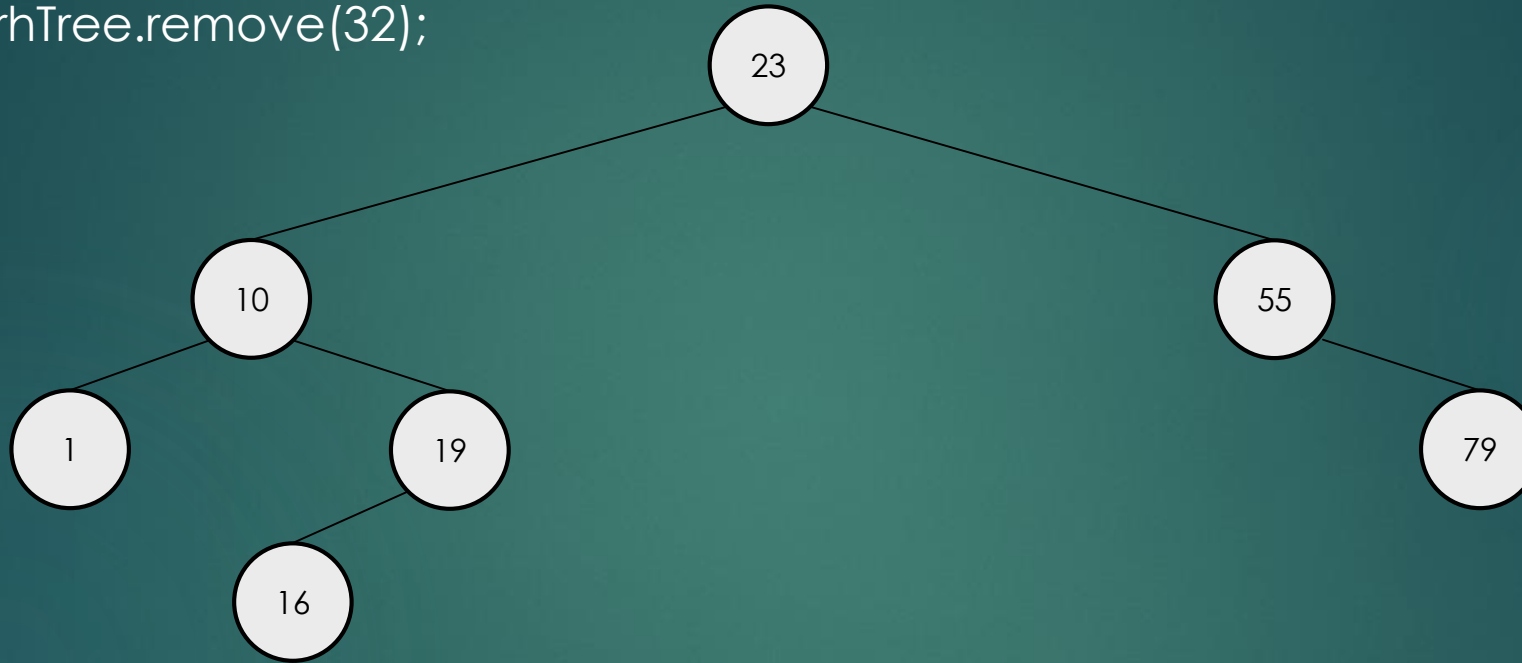
`binarySearchTree.remove(32);`



We look for the predecessor and swap the two nodes !!!  
We end up at a case 1.) situation: we just have to set it to NULL

**Delete:** 3.) We want to get rid of a node that has two children

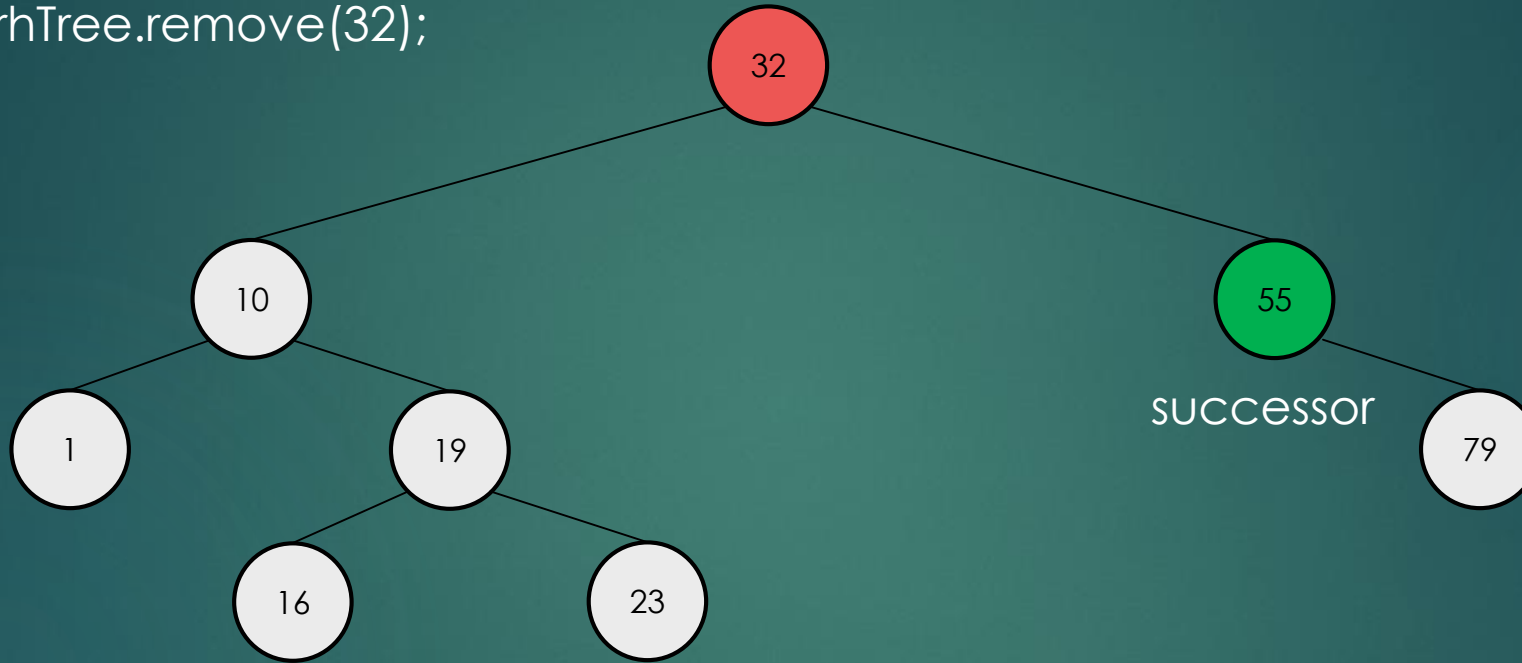
`binarySearchTree.remove(32);`



We look for the predecessor and swap the two nodes !!!  
We end up at a case 1.) situation: we just have to set it to NULL

Delete: 3.) We want to get rid of a node that has two children

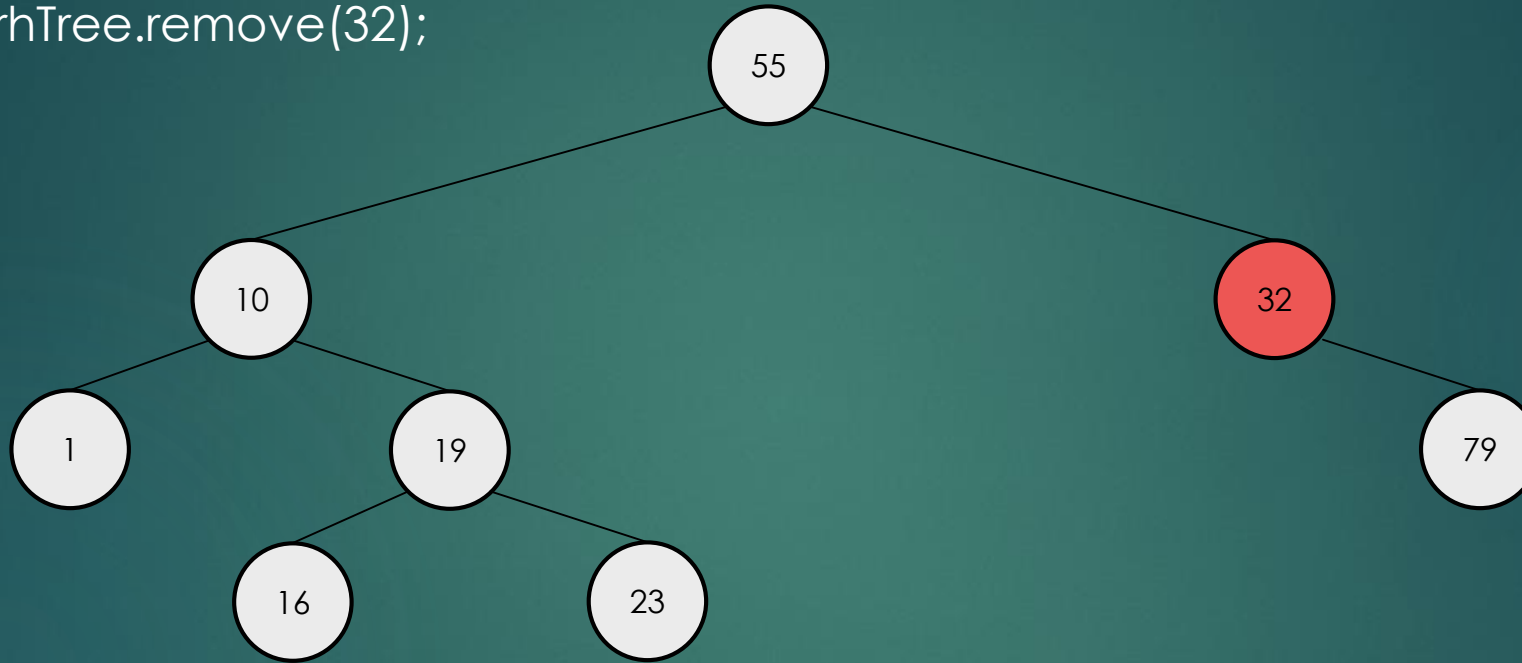
`binarySearchTree.remove(32);`



Another solution → we look for the successor and swap the two nodes !!!

Delete: 3.) We want to get rid of a node that has two children

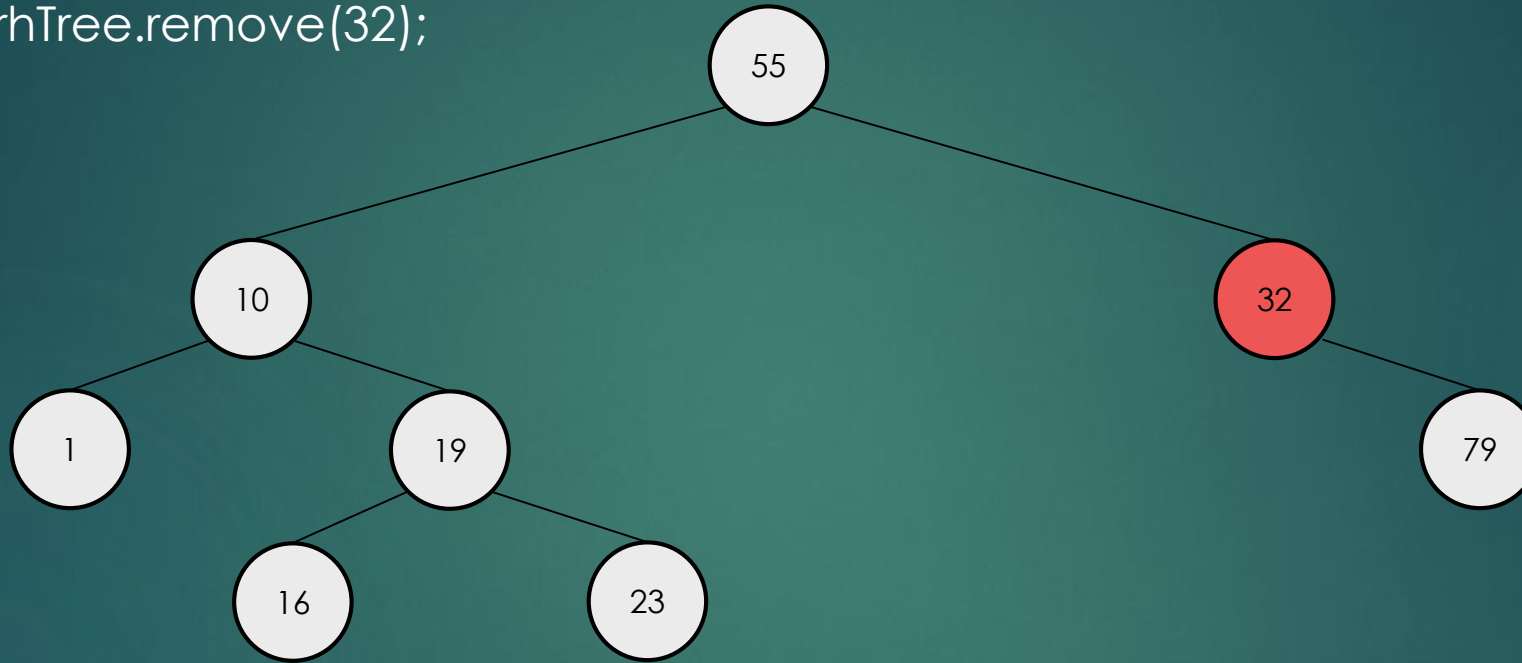
`binarySearchTree.remove(32);`



Another solution → we look for the successor and swap the two nodes !!!

**Delete:** 3.) We want to get rid of a node that has two children

`binarySearchTree.remove(32);`

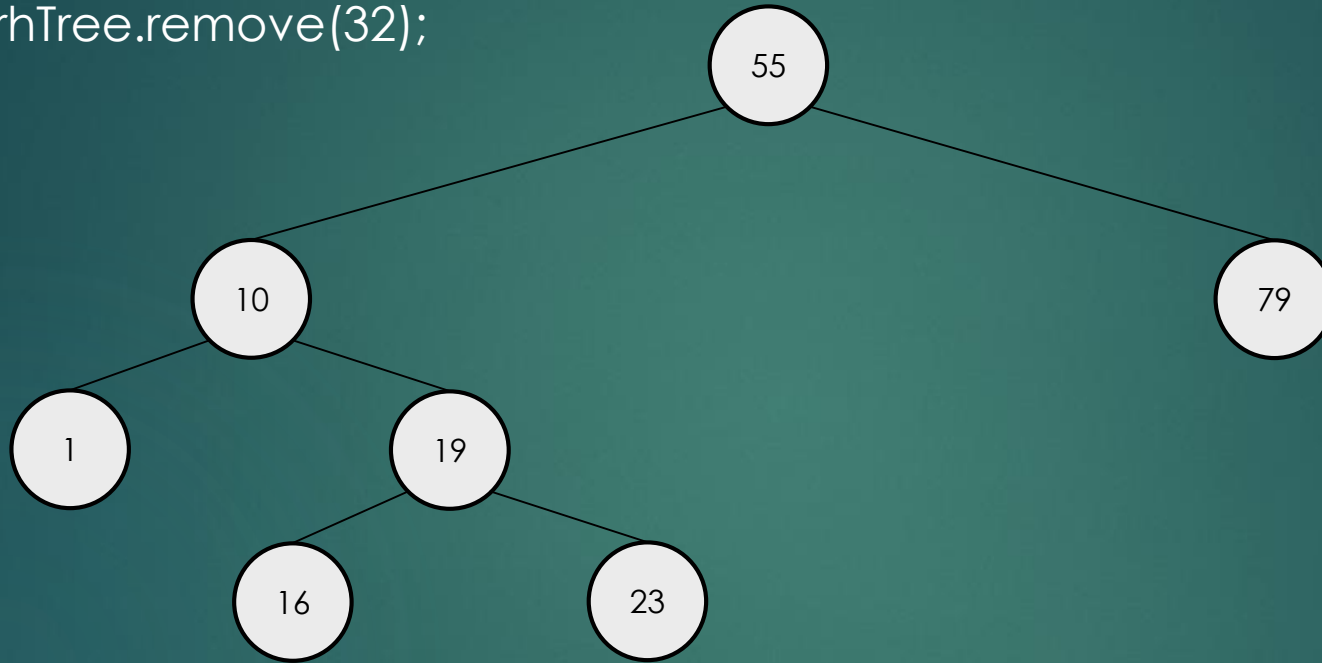


Another solution → we look for the successor and swap the two nodes !!!  
This becomes the Case 2.) situation, we just have to update the references



**Delete:** 3.) We want to get rid of a node that has two children

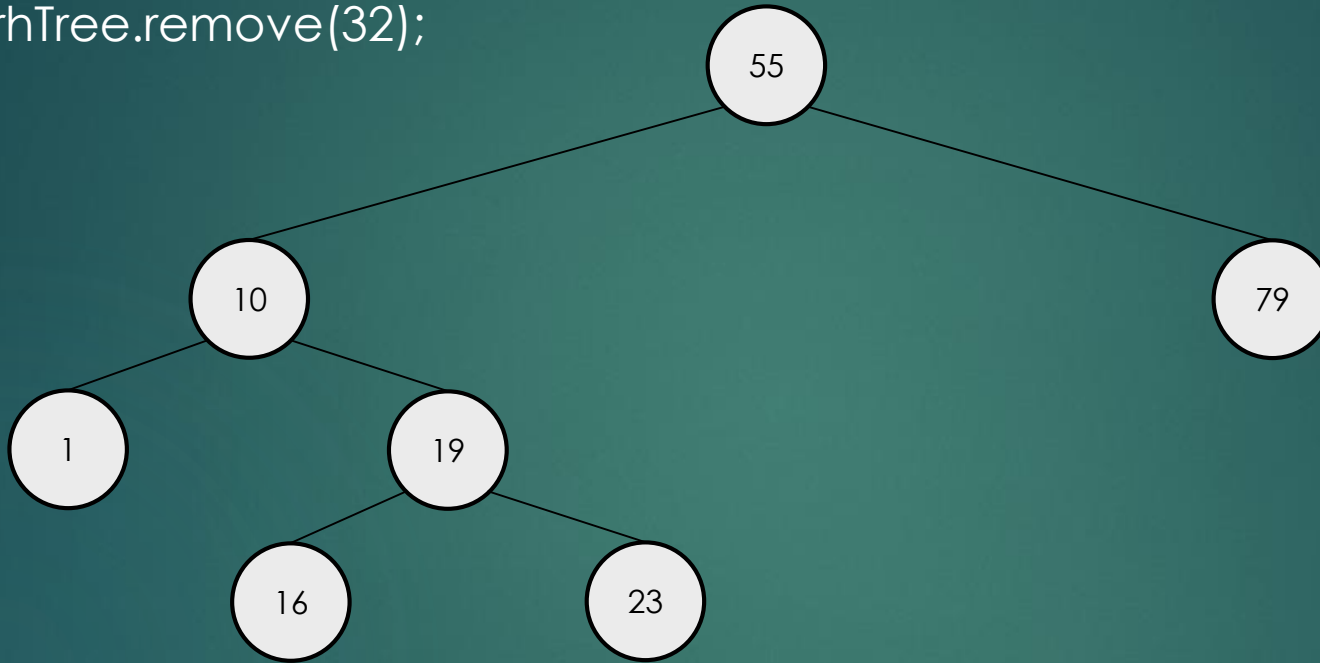
`binarySearchTree.remove(32);`



Another solution → we look for the successor and swap the two nodes !!!  
This becomes the Case 2.) situation, we just have to update the references

Delete: 3.) We want to get rid of a node that has two children

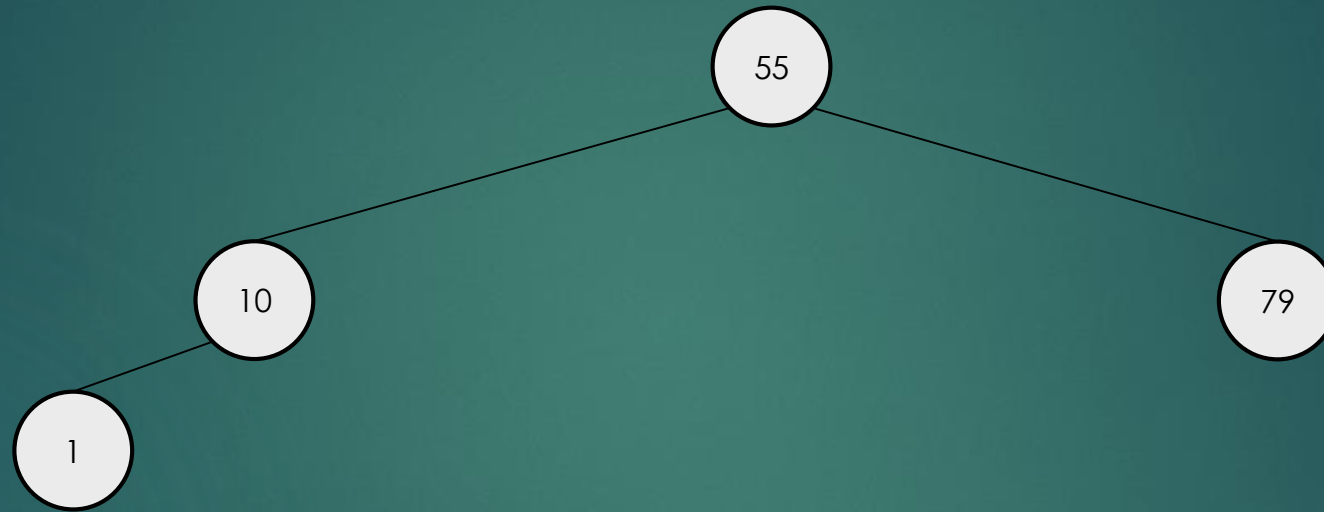
`binarySearchTree.remove(32);`



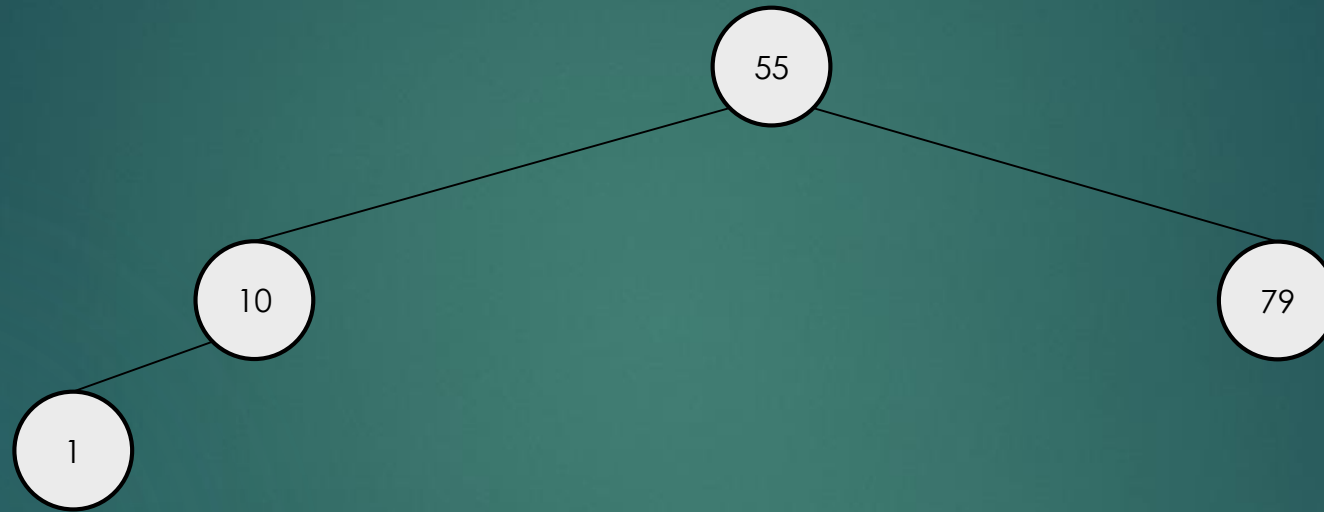
Complexity:  $O(\log N)$

# Conclusion

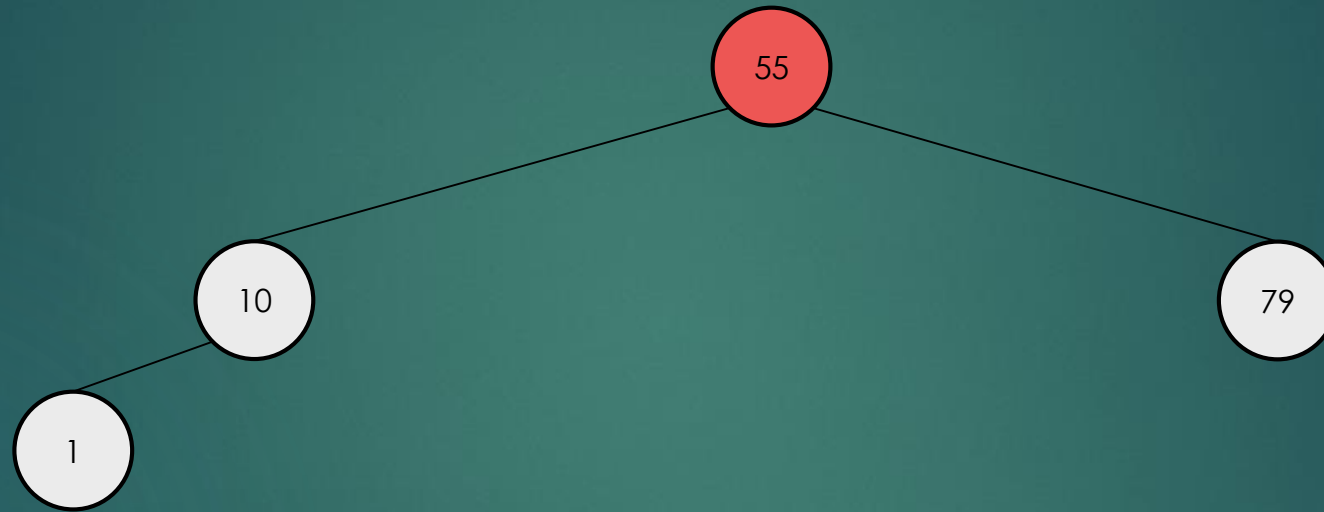
- ▶ It is basically the same as we have seen for simple binary search tree node deletion
- ▶ BUT there is a problem
- ▶ When we remove a node → it may get unbalanced because of that given node is no more in the tree



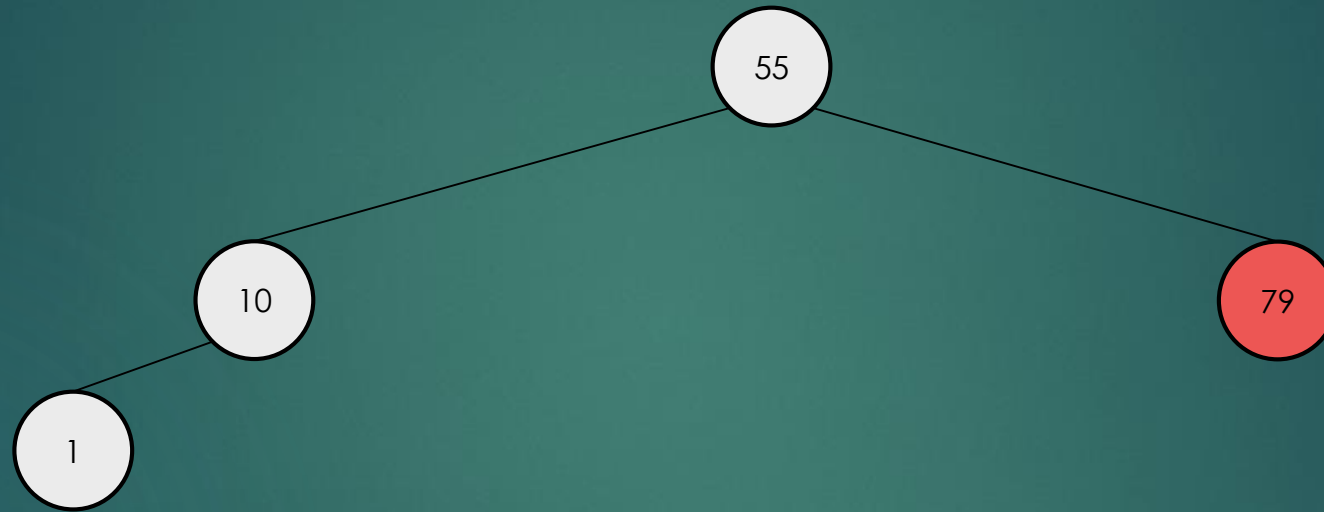
```
tree.remove(79);
```



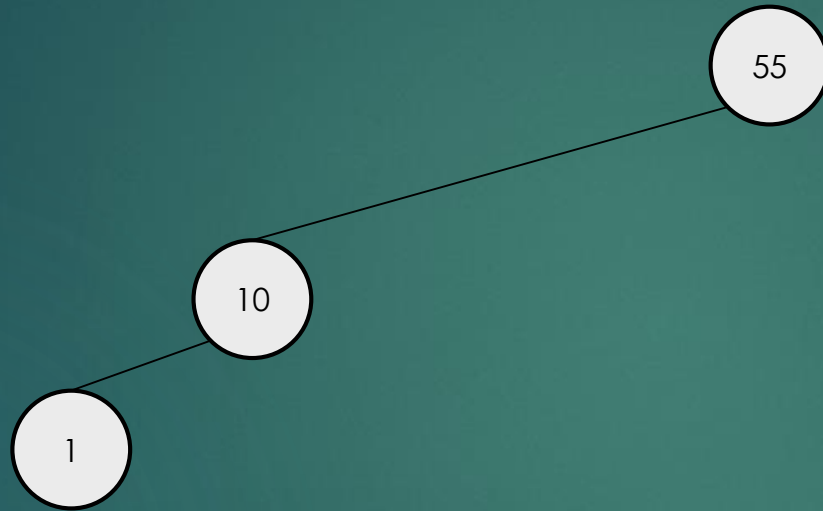
```
tree.remove(79);
```



```
tree.remove(79);
```

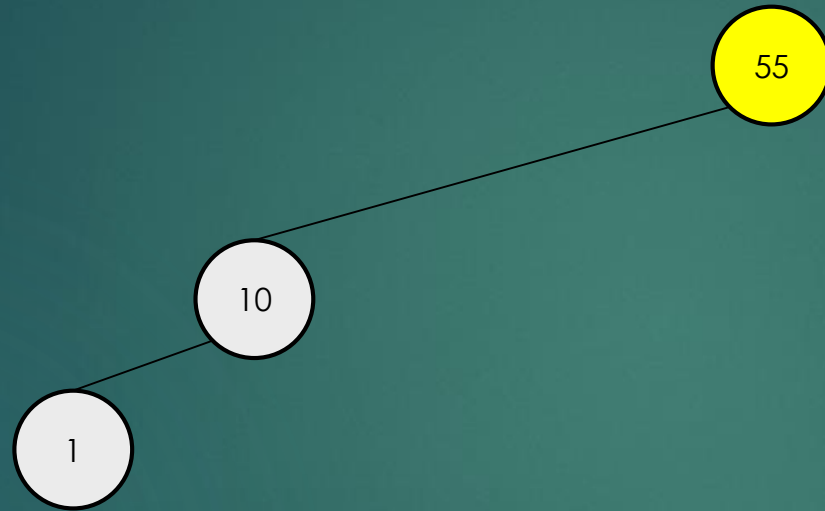


```
tree.remove(79);
```

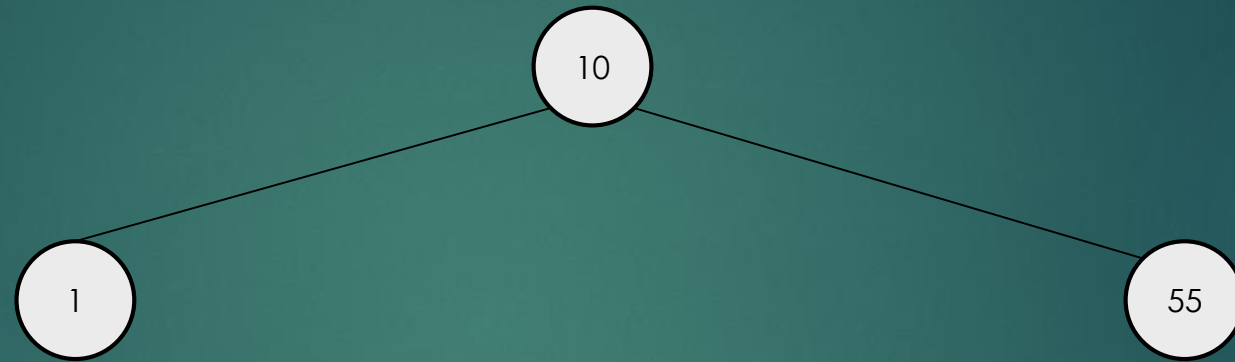




```
tree.remove(79);
```



```
tree.remove(79);
```



# AVL TREES

BALANCED TREES

# AVL sort

- ▶ We can use this data structure to sort items
- ▶ We just have to insert the **N** items we want to sort
- ▶ We have to make an in-order traversal → it is going to yield the numerical or alphabetical ordering !!!

Insertion:  $O(N \cdot \log N)$

In-order traversal:  $O(N)$

Overall complexity:  **$O(N \cdot \log N)$**

# Applications

- ▶ **Databases** when deletions or insertions are not so frequent, but have to make a lot of look-ups
- ▶ Look-up tables usually implemented with the help of **hashtables** BUT AVL trees support more operations in the main
- ▶ We can **sort with the help of AVL trees** !!!
- ▶ // **red-black trees are a bit more popular** because for AVL trees we have to make several rotations ~ a bit slower