CSE 250 Data Structures

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Day 25 Traversing and Balancing Trees

Sets

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(order doesn't matter, and at most one copy of each item)

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(order doesn't matter, and at most one copy of each item key)

The mutable.Set[T] ADT

```
add(element: T): Unit
   Store one copy of element if not already present
apply(element: T): Boolean
   Return true if element is present in the set

remove(element: T): Boolean
   Remove element if present, or return false if not
```

Bags

A **Bag** is an **unordered** collection of **non-unique** elements.

(order doesn't matter, and multiple copies with the same key is OK)

The mutable.Bag[T] ADT

```
add(element: T): Unit
   Register the presence of a new (copy of) element

apply(element: T): Boolean
   Return the number of copies of element in the bag

remove(element: T): Boolean
   Remove one copy of element if present, or return false if not
```

Collection ADTs

Propery	Seq	Set	Bag
Explicit Order	1		
Enforced Uniqueness		✓	
Iterable	✓	✓	1

(Rooted) Trees

(Even More) Tree Terminology

Rooted, Directed Tree - Has a single root node (node with no parents)

Parent of node X - A node with an out-edge to X (max 1 parent per node)

Child of node X - A node with an in-edge from X

Leaf - A node with no children

<u>Depth</u> of node X - The number of edges in the path from the root to X

<u>Height</u> of node X - The number of edges in the path from X to the deepest leaf

(Even More) Tree Terminology

Level of a node - Depth of the node + 1

<u>Size</u> of a tree (n) - The number of nodes in the tree

Height/Depth of a tree (d) - Height of the root/depth of the deepest leaf

(Even More) Tree Terminology

Binary Tree - Every vertex has at most 2 children

Complete Binary Tree - All leaves are in the deepest two levels

<u>Full Binary Tree</u> - All leaves are at the deepest level, therefore every vertex has exactly 0 or 2 children, and d = log(n)

Computing Tree Height

The height of a tree is the height of the root

The children of the root are each roots of the left and right subtrees

So we can compute height recursively:

$$h(root) = \begin{cases} 0 & \text{if the tree is empty} \\ 1 + max(h(\texttt{root.left}), h(\texttt{root.right})) & \text{otherwise} \end{cases}$$

Computing Tree Height

```
def height[T](root: Tree[T]): Int = {
  root match {
    case EmptyTree =>
      0

    case TreeNode(v, left, right) =>
      1 + Math.max( height(left), height(right) )
}
```

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Constraints

- No duplicate keys
- For every node X_L in the left subtree of node X: X_L.key < X.key
- For every node X_R in the right subtree of node $X: X_R$.key > X.key

X partitions its children

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1. Is root empty? (if yes, then the item is not here)

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- 4. Is **k** greater than **root.value**'s key? (If yes, search the right subtree)

What's the complexity?

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Goal: Insert a new tem with key k in a BST rooted at root

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- 4. Is **k** greater than **root.value**'s key? (call insert on right subtree)

insert

```
def insert[V: Ordering] (root: BST[V], value: V): BST[V] =
  node match {
    case TreeNode(v, left, right) =>
      if(Ordering[V].lt( target, v ) ){
        return TreeNode(v, insert(left, target), right)
      } else if(Ordering[V].lt( v, target ) ){
        return TreeNode(v, left, insert(right, target))
      } else {
        return node // already present
    case EmptyTree =>
      return TreeNode(value, EmptyTree, EmptyTree)
```

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 node match {
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      } else {
        return node // already present
                                            What is the complexity?
                                            (how many calls to insert)?
    case EmptyTree =>
      return TreeNode(value, EmptyTree, EmptyTree)
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        return TreeNode(v, left, insert(right, target))
      } else {
        return node // already present
                                            What is the complexity?
                                            (how many calls to insert)? O(d)
    case EmptyTree =>
      return TreeNode(value, EmptyTree, EmptyTree)
```

Remove

Goal: Remove the item with key **k** from a BST rooted at **root**

- 1. find the item
- 2. Replace the found node with the right subtree
- 3. Insert the left subtree under the right

We'll look at this in more detail later, but for now...

What's the complexity? O(d)

Sets and Bags

So we could use this specification of a BST to implement a Set

What about bags? How could we change our BST to implement a Bag?

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Idea 1: Allow multiple copies $(X_L \le X \text{ instead of } <)$

Sets and Bags

So we could use this specification of a BST to implement a Set

What about bags? How could we change our BST to implement a Bag?

Idea 1: Allow multiple copies $(X_1 \le X \text{ instead of } <)$

Idea 2: Only store one copy of each element, but also store a count

Operation	Runtime
find	O(d)
insert	O(d)
remove	O(d)

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insert	O(d)
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What is the runtime in terms of **n**?

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What is the runtime in terms of n? O(n)

Operation	Runtime
find	<i>O</i> (<i>d</i>)
insert	O (<i>d</i>)
remove	<i>O</i> (<i>d</i>)

What is the runtime in terms of n? O(n)

Does it need to be that bad?

Operation	Runtime
find	O(d)
insert	O(d)
remove	O(d)

What is the runtime in terms of n? O(n)

Does it need to be that bad? ...hold that thought

Tree Traversals

Goal: Visit every element of a tree (in linear time?)

Pre-Order (top-down)

Visit the root, then the left subtree, then the right subtree

In-Order

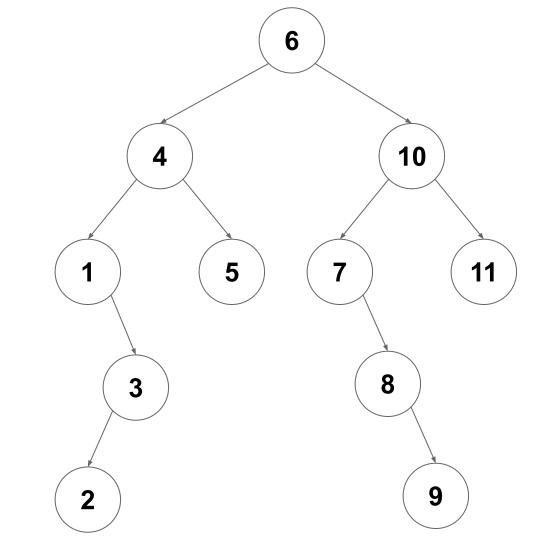
Visit the left subtree, then the root, then the right subtree

Post-Order (bottom-up)

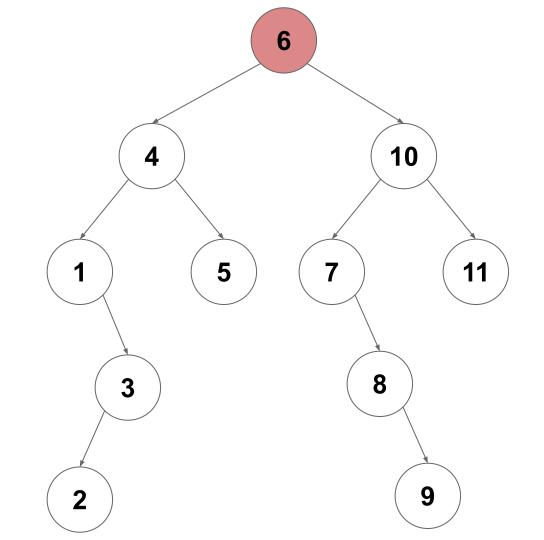
Visit the left subtree, then the right subtree, then the root

Tree Traversal: In-Order

```
def inorderVisit[T](root: ImmutableTree[T], visit: ImmutableTree[T] => Unit) = {
 root match {
    case TreeNode(v, left, right) =>
      /* visit left */
      inorderVisit(left, visit)
      /* visit root */
      visit(v)
      /* visit right */
      inorderVisit(right, visit)
    case EmptyTree =>
      /* Do Nothing */
```

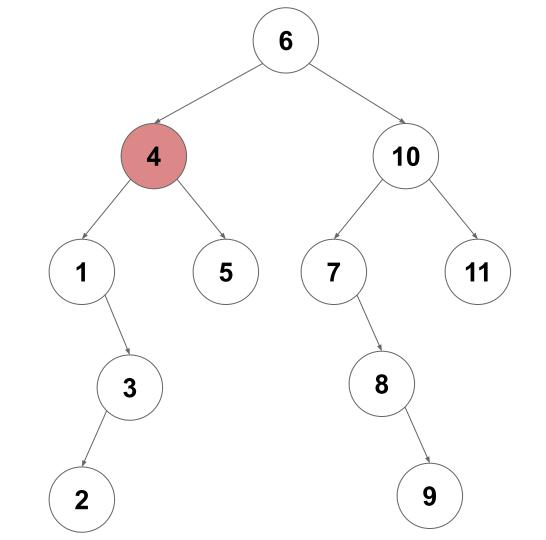


inorderVisit(6)



inorderVisit(6)

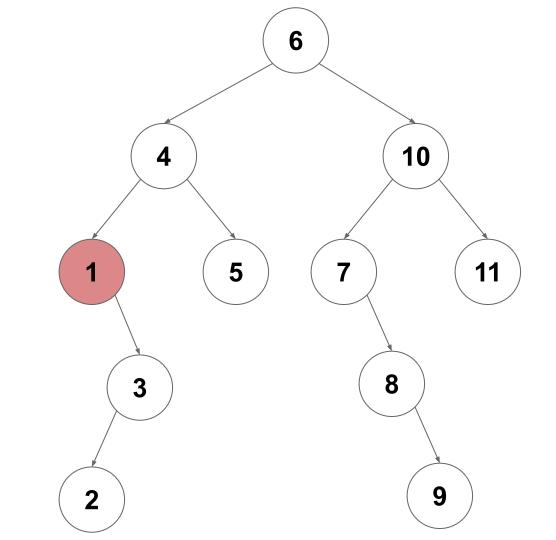
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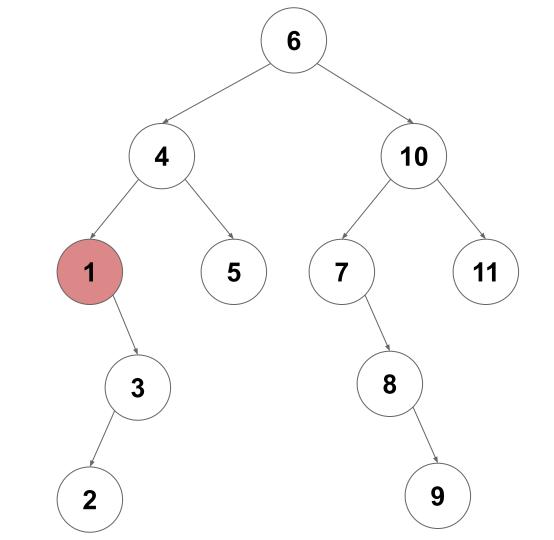


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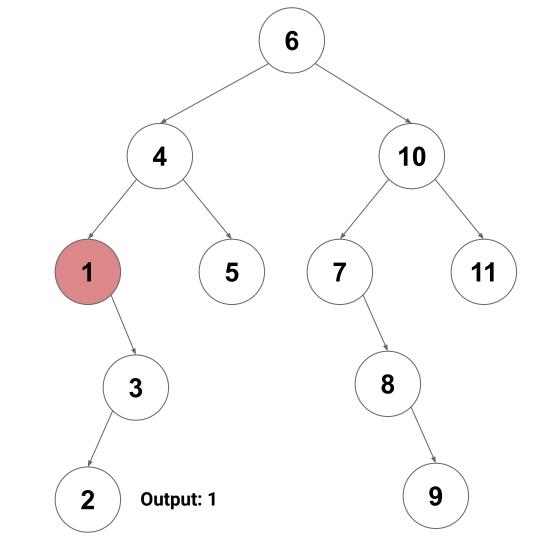


```
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```

```
inorderVisit(4)
```

inorderVisit(1)

visit(1)

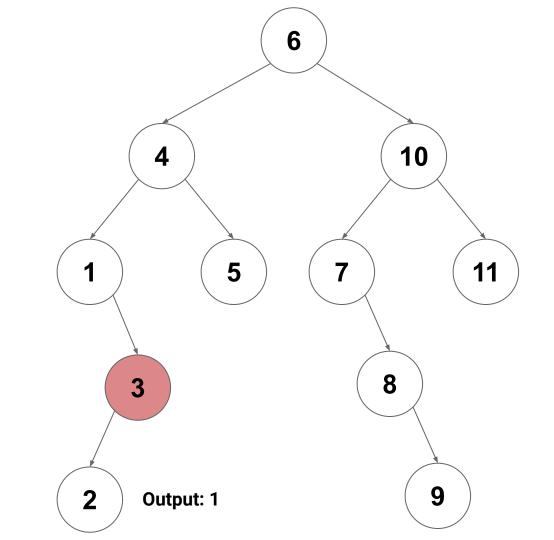


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inorderVisit(3)



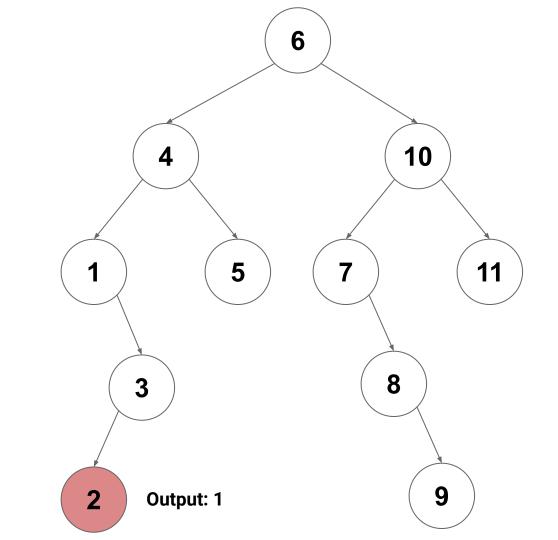
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inorderVisit(2)



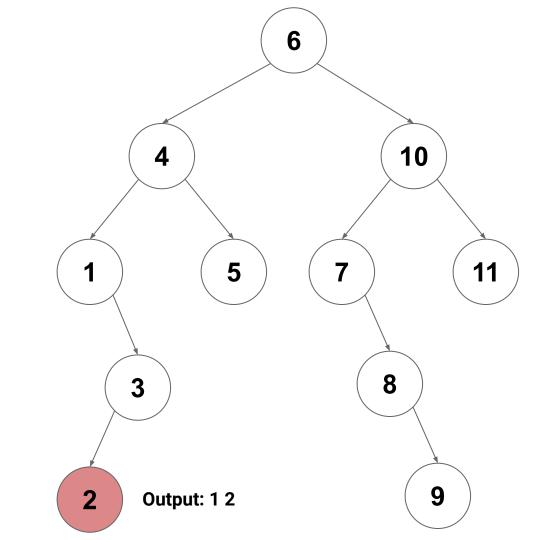
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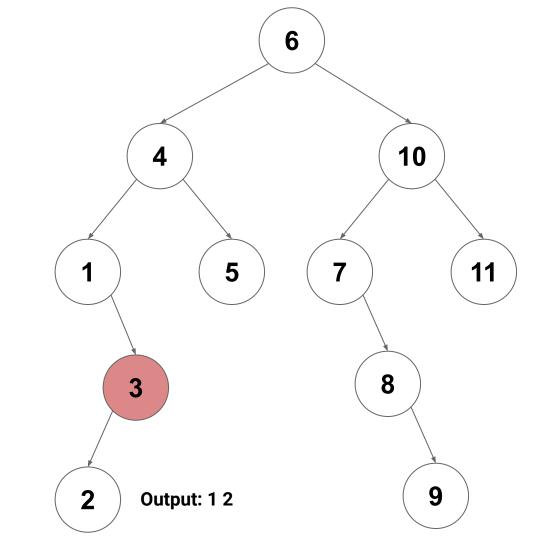


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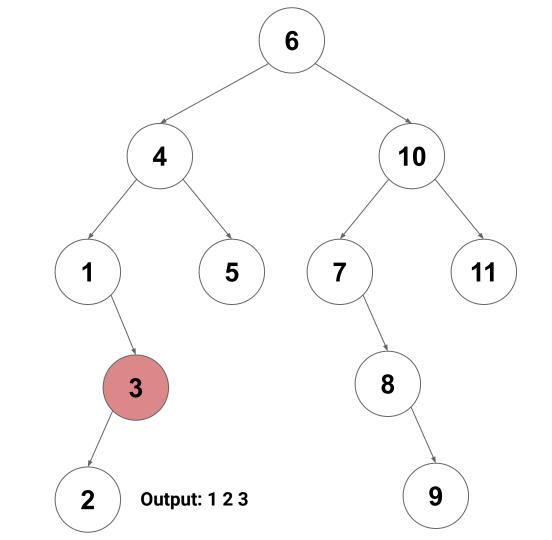


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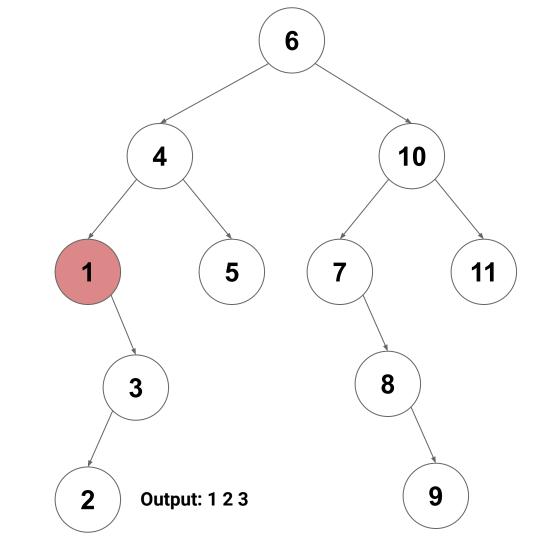
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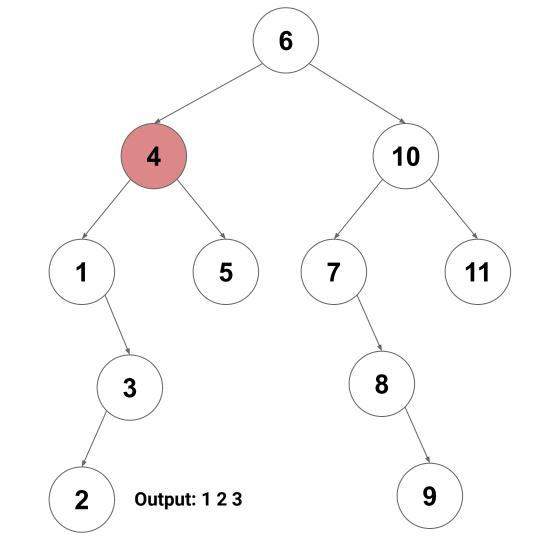
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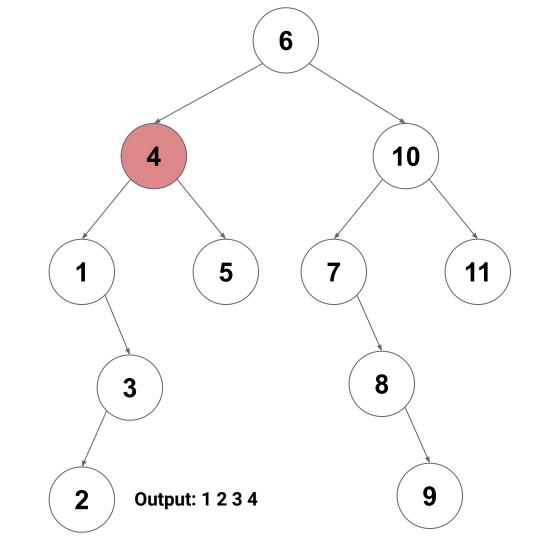
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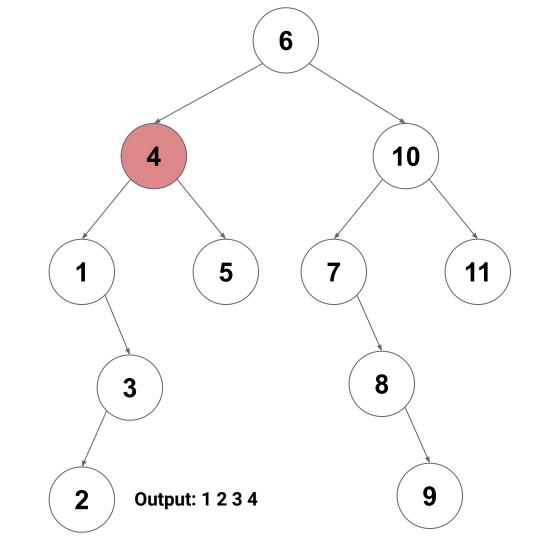
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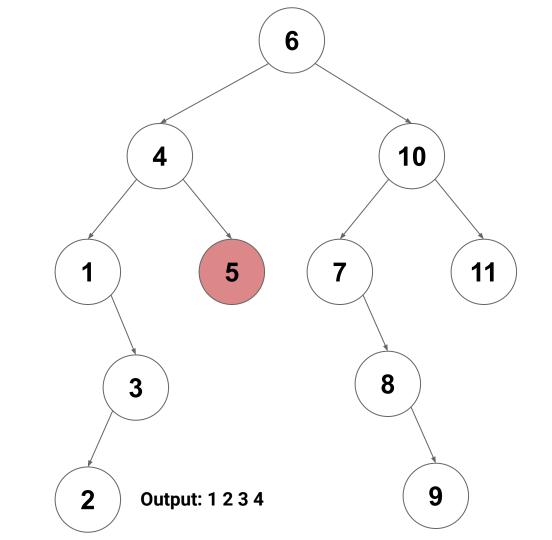
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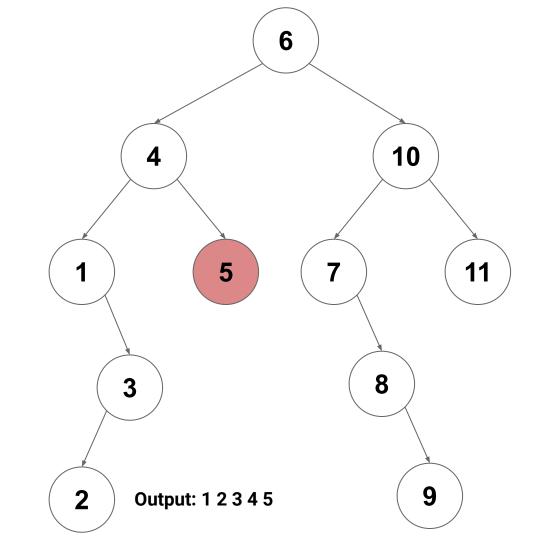
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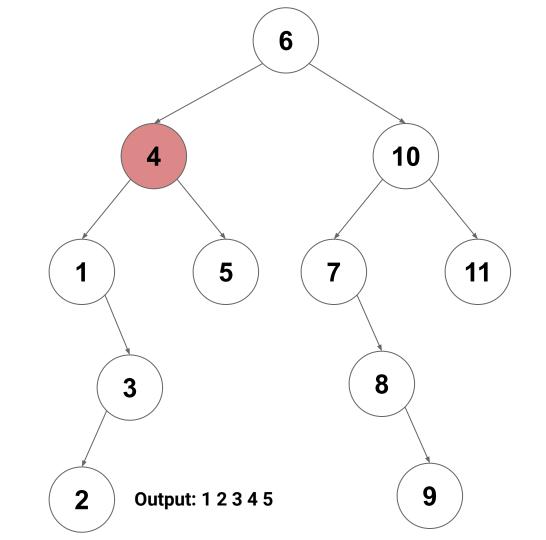
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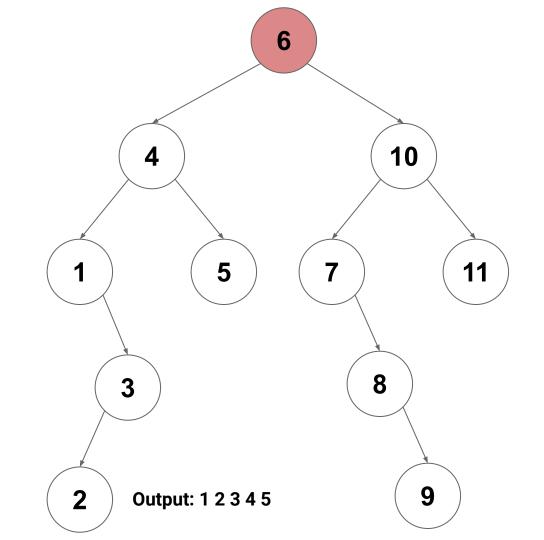


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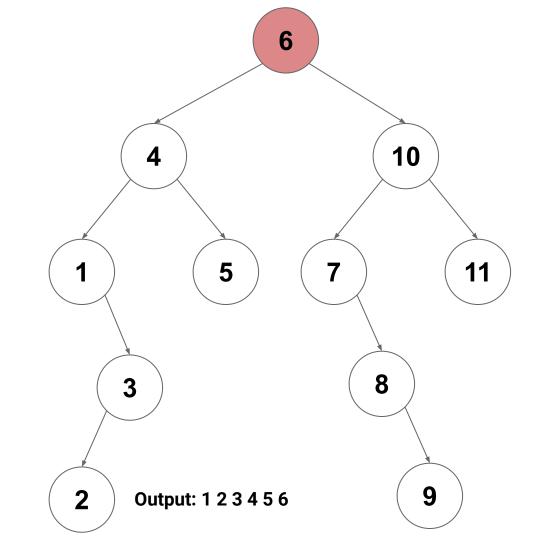
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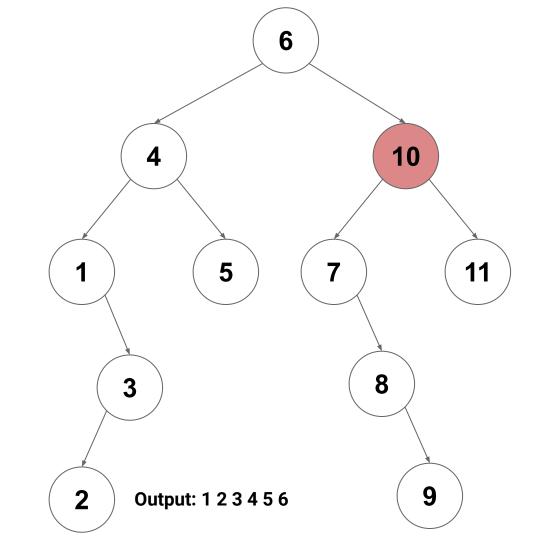


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inorderVisit(6)

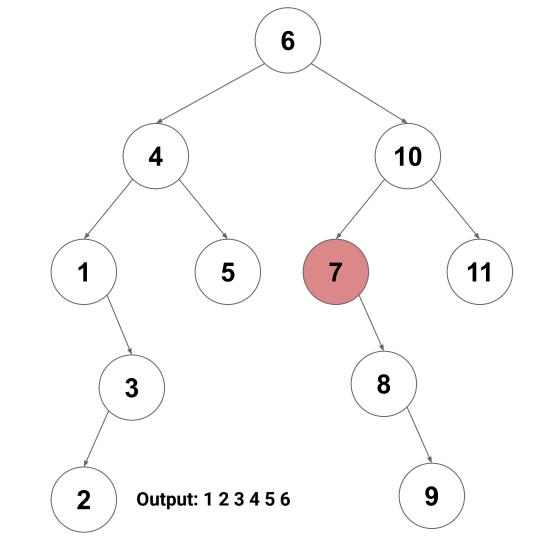
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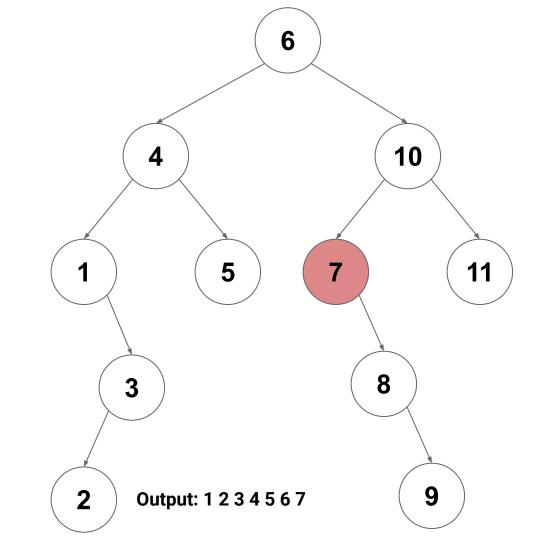


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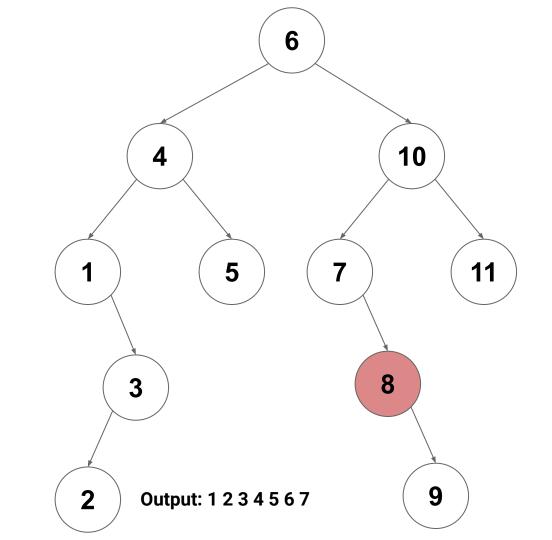


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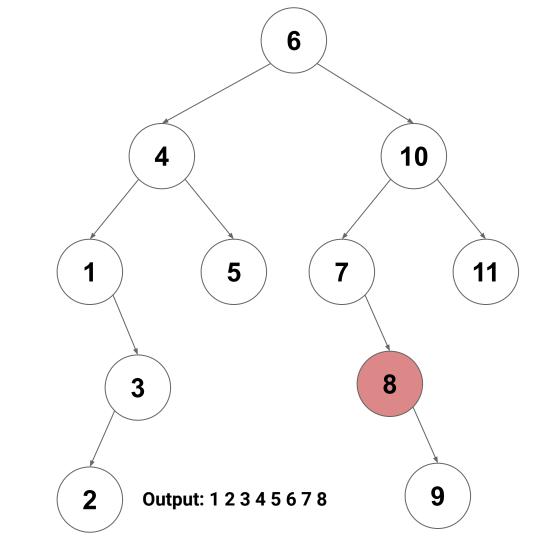
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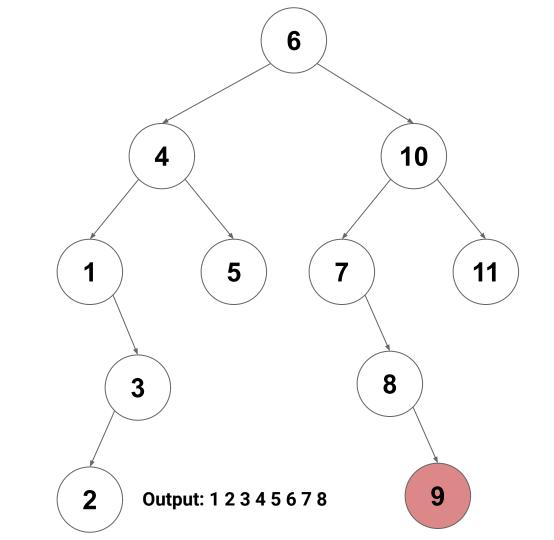
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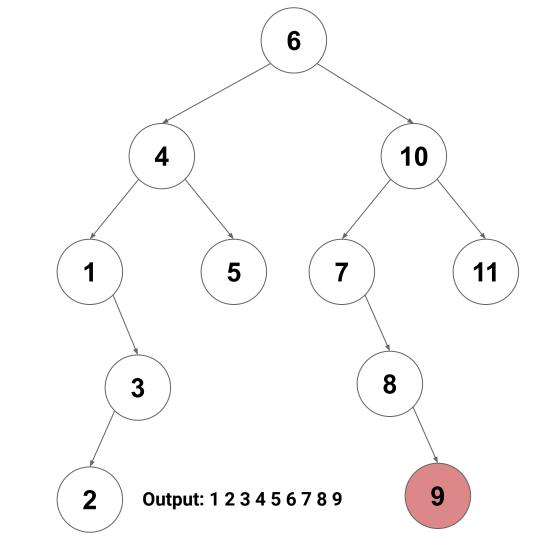
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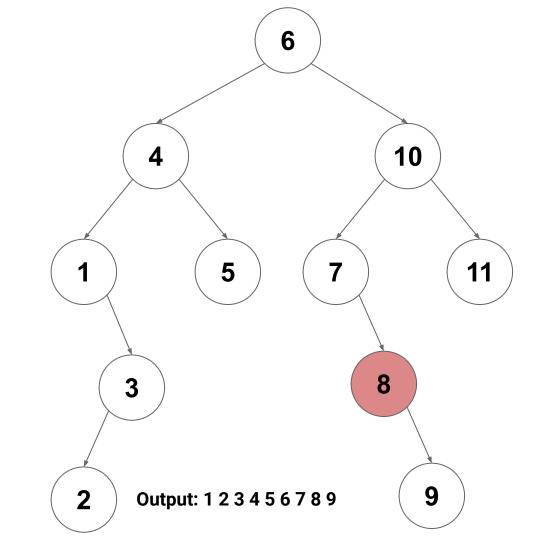


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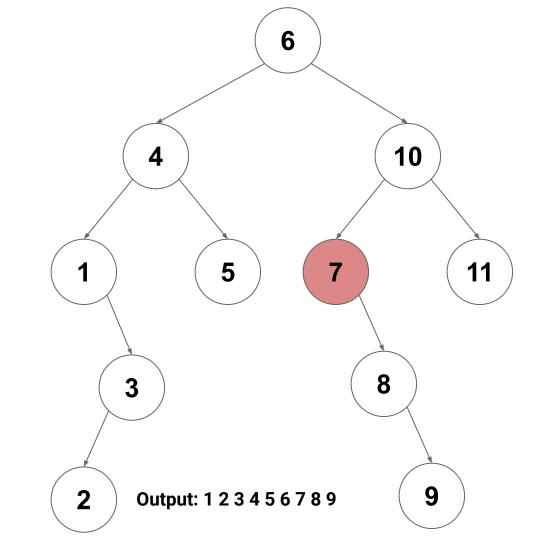
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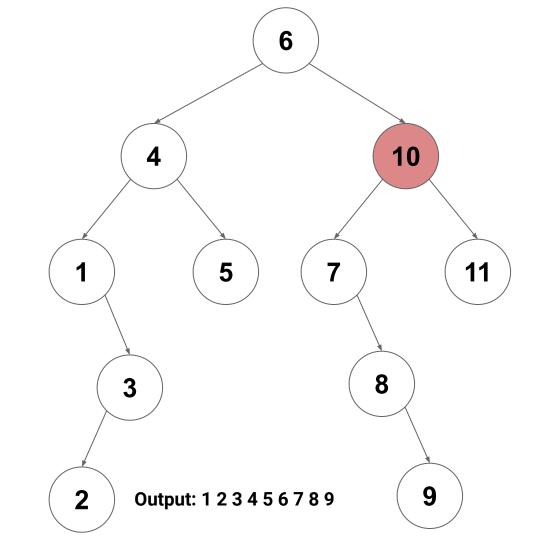
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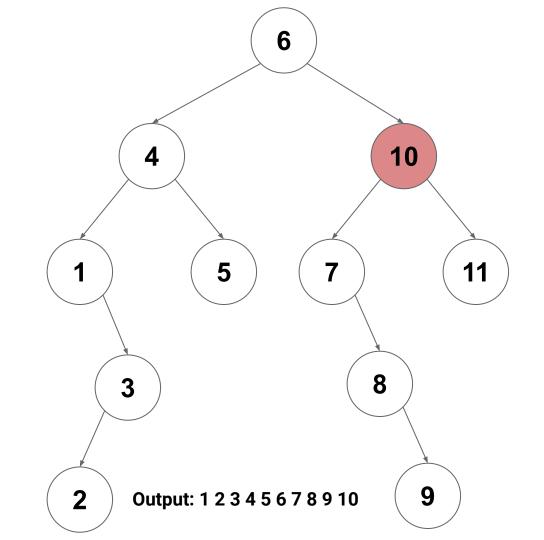
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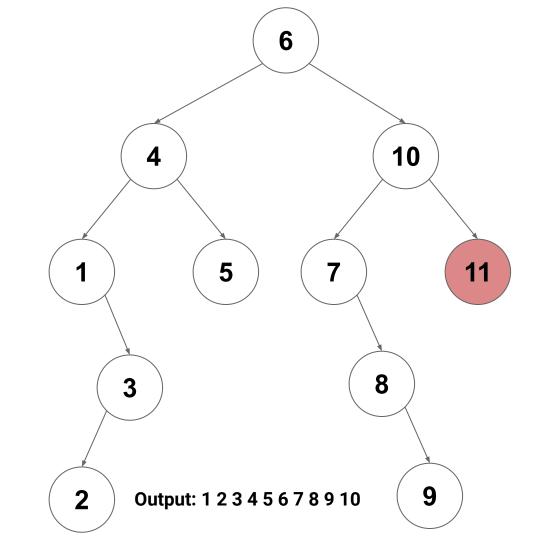
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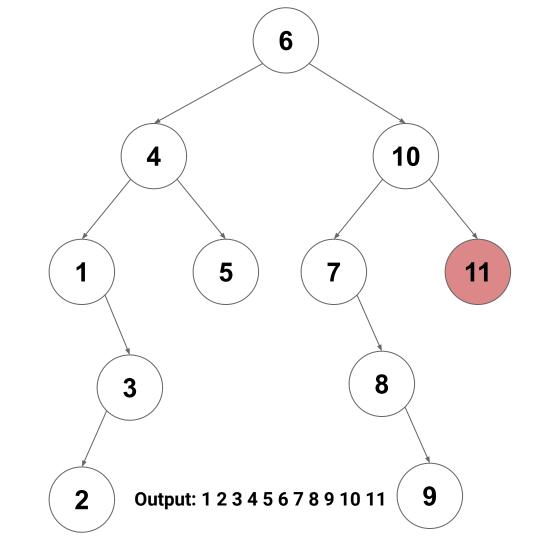


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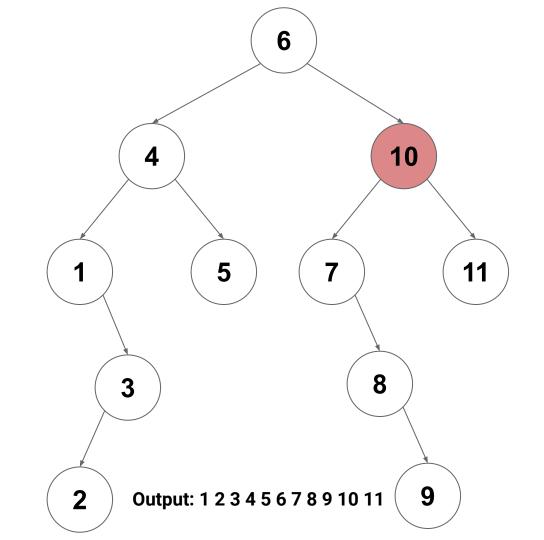
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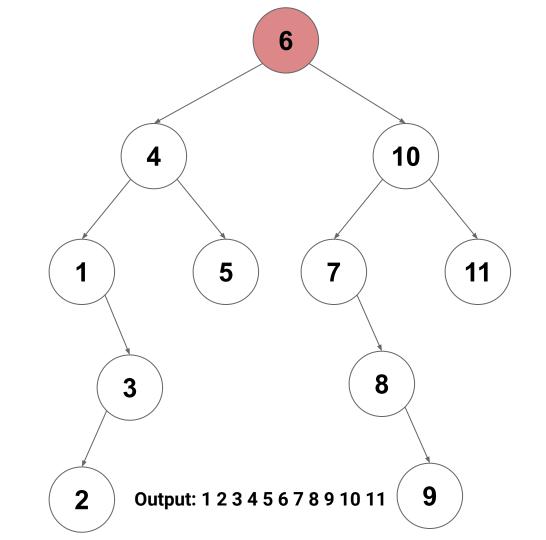


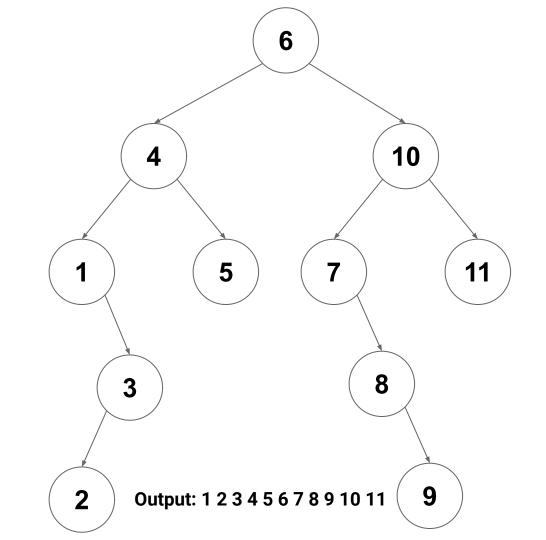
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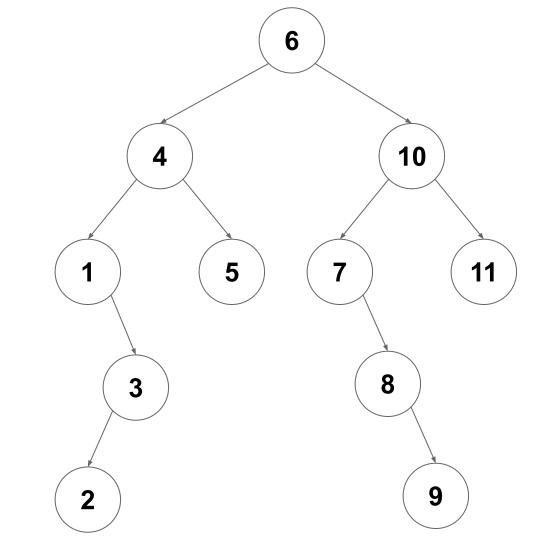
```
class ImmutableTreeIterator[T](root: ImmutableTree[T]) {
  /*** Initialize the Iterator ***/
 val toVisit = mutable.Stack[ImmutableTree[T]]
 pushLeft(root)
 def pushLeft(node: ImmutableTree[T]): Unit =
    node match {
      case EmptyTree => ()
      case t: ImmutableTree =>
        toVisit.push(t)
        pushLeft(t.left)
```

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  /*** Initialize the Iterator ***/
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  def pushLeft(node: ImmutableTree[T]): Unit =
                                                        Initialize our iterator by recursively
    node match {
                                                       pushing the left trees (we know the
                                                            FIRST element in an in-order
      case EmptyTree => ()
                                                                traversal is the left-most
      case t: ImmutableTree =>
        toVisit.push(t)
        pushLeft(t.left)
```

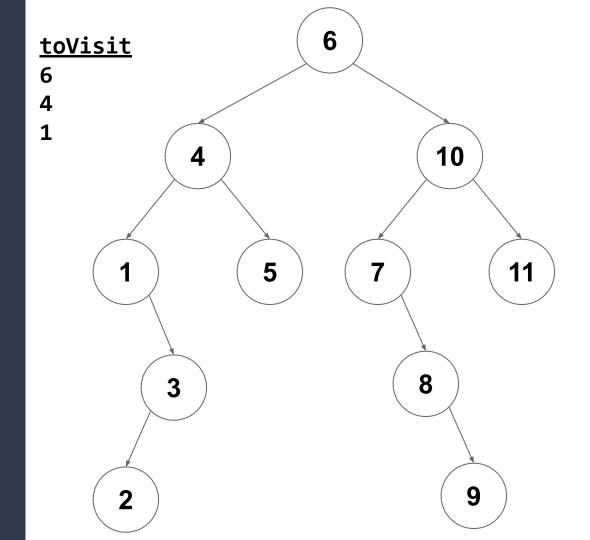
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                                                          Initialize our iterator by recursively
    node match {
                                                         pushing the left trees (we know the
                                                               FIRST element in an in-order
       case EmptyTree => ()
                                                                  traversal is the left-most
       case t: ImmutableTree =>
         toVisit.push(t)
         pushLeft(t.left)
                       This pushes nodes onto our to Visit Stack, followed by their left trees (LIFO!)
```

```
class ImmutableTreeIterator[T](root: ImmutableTree[T]) {
  def isEmpty = toVisit.isEmpty
  def next: T = {
    val nextNode = toVisit.pop
    pushLeft(nextNode.right)
    return nextNode.value
```

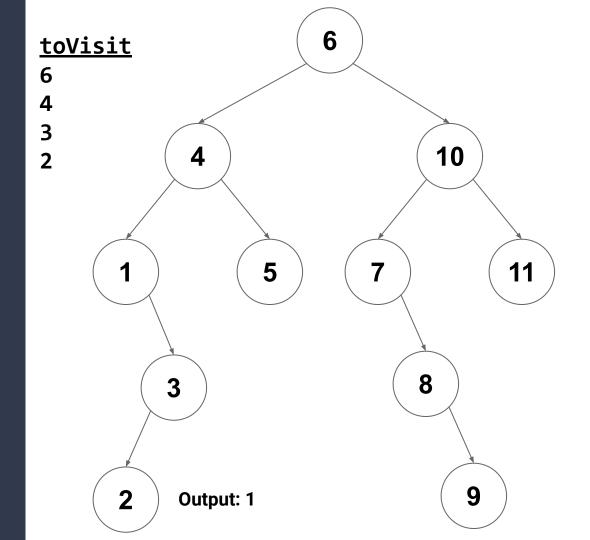
```
class ImmutableTreeIterator[T](root: ImmutableTree[T]) {
  def isEmpty = toVisit.isEmpty
  def next: T = {
    val nextNode = toVisit.pop )
                                            next pops the next node from our stack, and
    pushLeft(nextNode.right)
                                            pushes it's right subtree, then returns it
    return nextNode.value
```



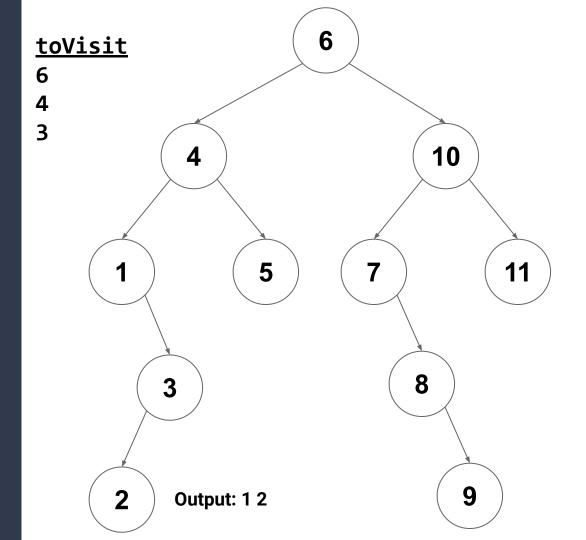
When we create the iterator, the **toVisit** stack is initialized



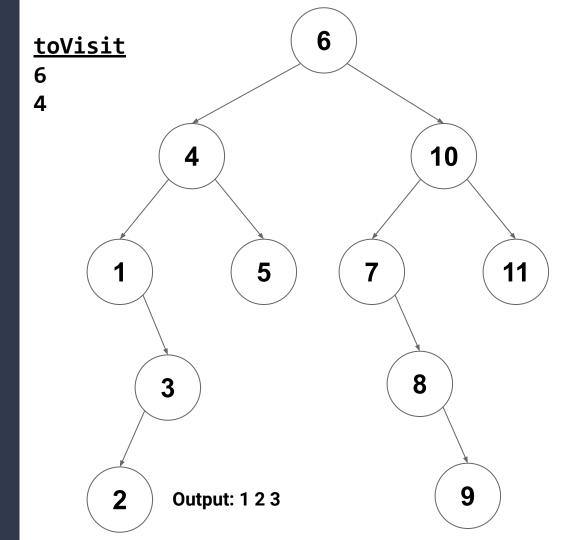
next pops the stack (1), and calls pushLeft on the right subtree of 1



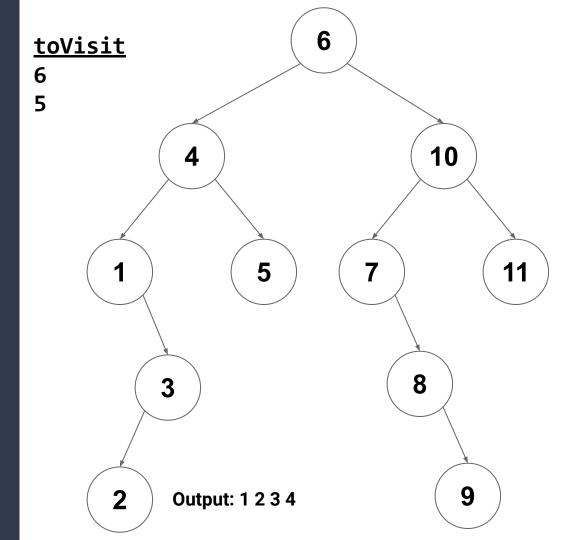
next pops the stack (2) and pushes the right subtree (nothing)



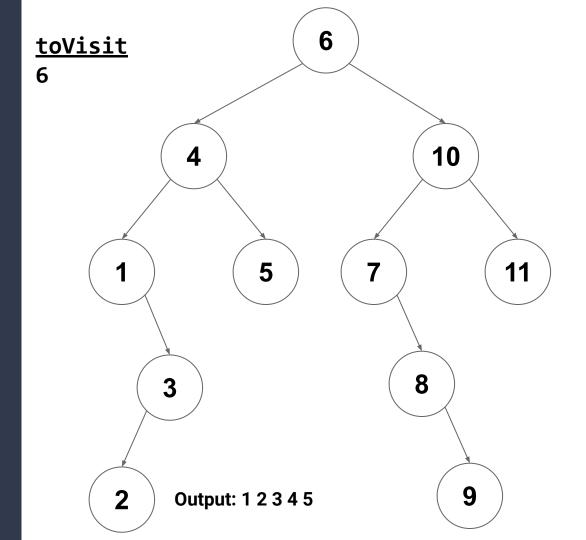
next pops the stack (3) and pushes the right subtree (nothing)



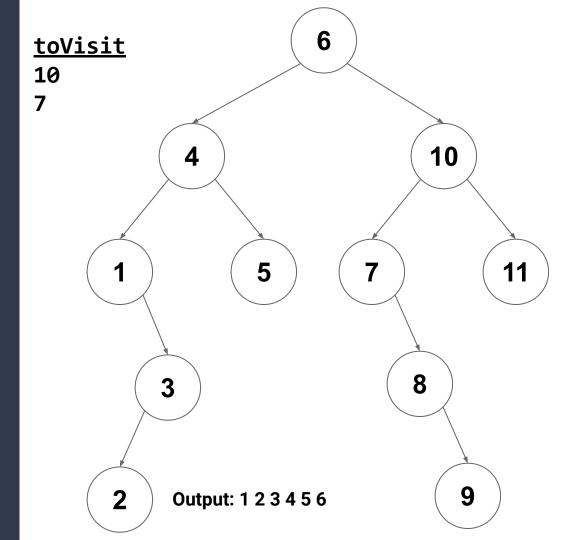
next pops the stack (4) and pushes the right subtree



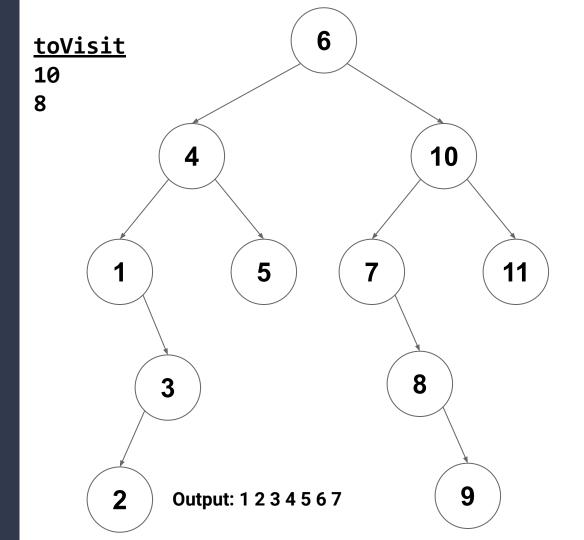
next pops the stack (5) and pushes the right subtree (nothing)



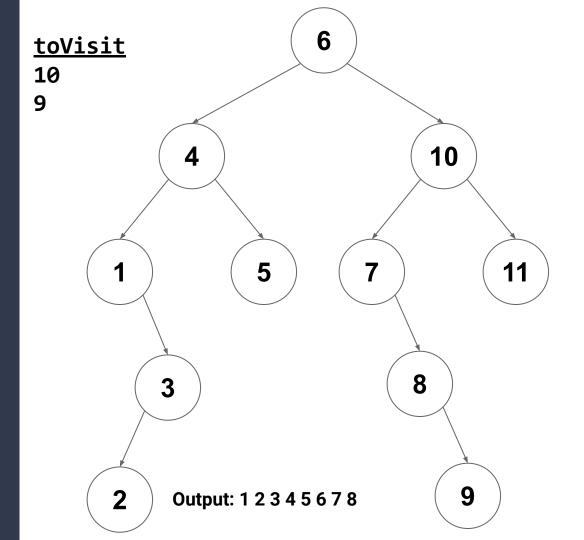
next pops the stack (6) and pushes the right subtree (10 7)



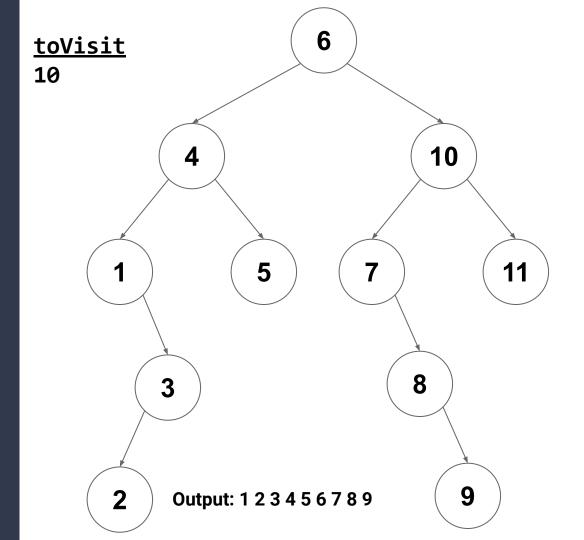
next pops the stack (7) and pushes the right subtree (8)



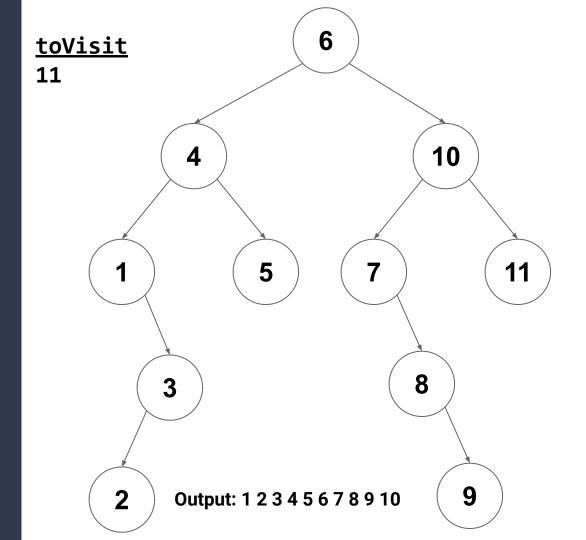
next pops the stack (8) and pushes the right subtree (9)



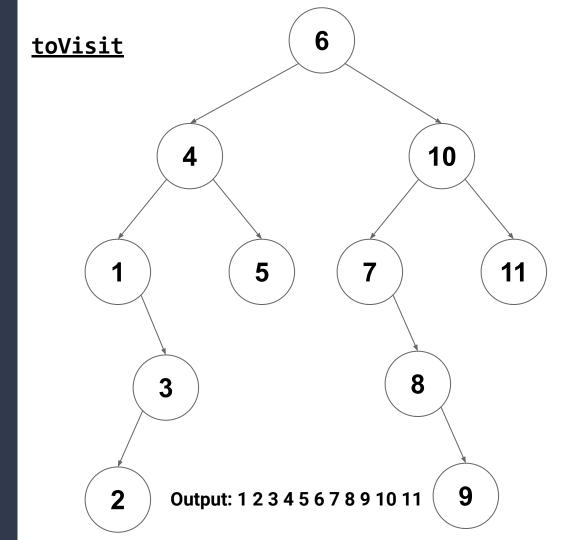
next pops the stack (9) and pushes the right subtree (nothing)



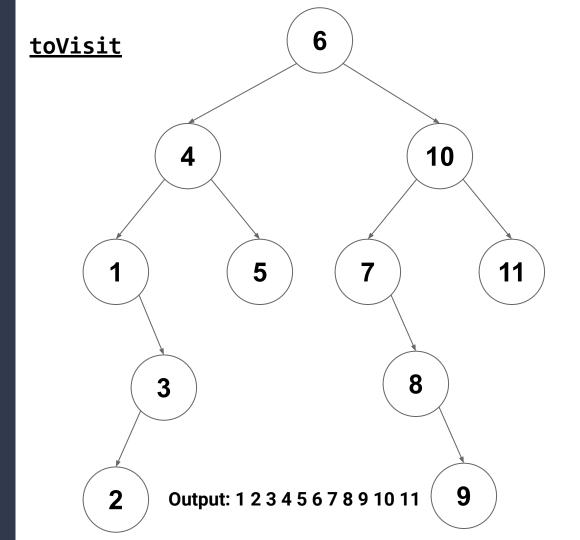
next pops the stack (10) and pushes the right subtree (11)



next pops the stack (11) and pushes the right subtree (nothing)



Our **toVisit** stack is empty, so **isEmpty** will now be true



```
val toVisit = mutable.Stack[ImmutableTree[T]]
pushLeft(root)
```

What is our worst-case runtime to initialize the iterator?

```
val toVisit = mutable.Stack[ImmutableTree[T]]
pushLeft(root)
```

What is our worst-case runtime to initialize the iterator? O(d)

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val toVisit = mutable.Stack[ImmutableTree[T]]
pushLeft(root)
```

What is our worst-case runtime to initialize the iterator? O(d)

(we may have to push as many as **d** nodes onto the stack)

```
def next: T = {
   val nextNode = toVisit.pop
   pushLeft(nextNode.right)
   return nextNode.value
}
```

What is our worst-case runtime to call **next**?

```
def next: T = {
   val nextNode = toVisit.pop
   pushLeft(nextNode.right)
   return nextNode.value
}
```

What is our worst-case runtime to call **next**? O(d)

(we may have to push as many as **d** nodes onto the stack)

What is the worst-case complexity to visit ALL **n** nodes?

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Each node is at the top of the stack exactly once:

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One push *O*(1)

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- One pop **O(1)**

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Each node is at the top of the stack exactly once:

- One push *O*(1)
- One pop **O(1)**

Total: O(n)

Balancing Trees

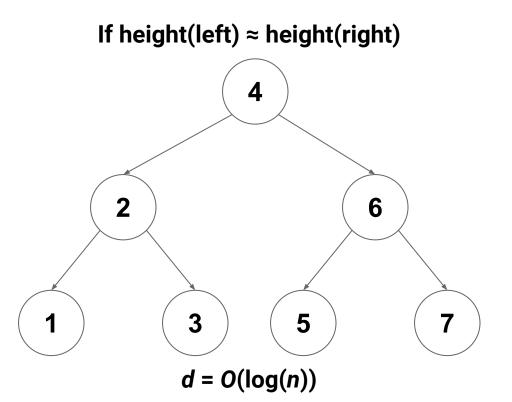
BST Operations

Operation	Runtime
find	O(d)
insert	O(d)
remove	O(d)

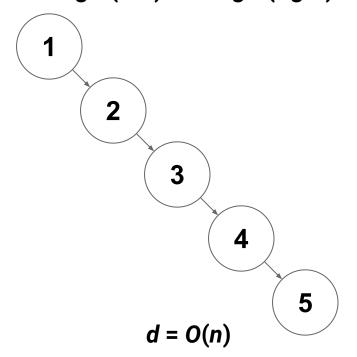
What is the runtime in terms of n? O(n)

$$\log(n) \le d \le n$$

Tree Depth vs Size



If height(left) ≪ height(right)



Balanced Trees are good: Faster find, insert, remove

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What do we mean by balanced?

Balanced Trees are good: Faster find, insert, remove

What do we mean by balanced? |height(left) - height(right)| ≤ 1

Balanced Trees are good: Faster find, insert, remove

What do we mean by balanced? |height(left) - height(right)| ≤ 1

How do we keep a tree balanced?

Balanced Trees - Two Approaches

Option 1

Keep left/right subtrees within+/-1 of each other in height

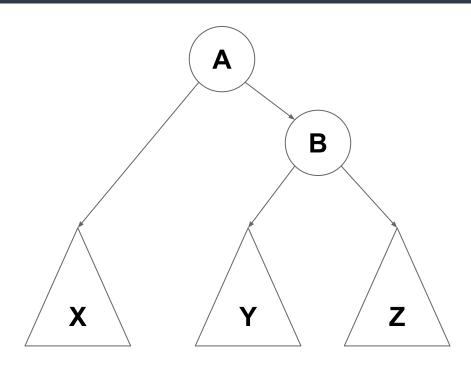
(add a field to track amount of "imbalance")

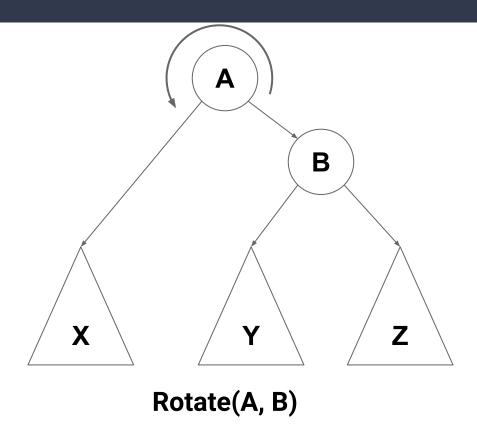
Option 2

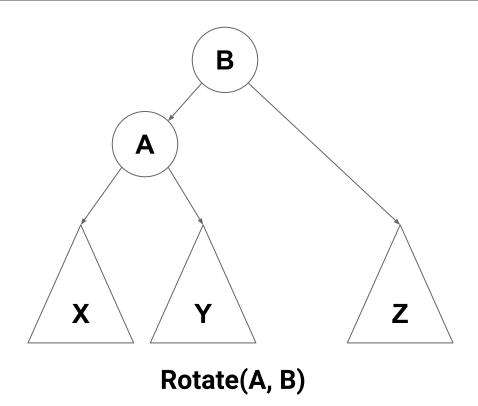
Keep leaves at some minimum depth (d/2)

(Add a color to each node marking it as "red" or "black")

Ok...but how do we enforce this...?

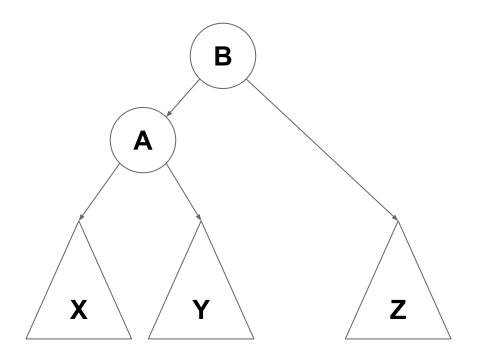






A became B's left child

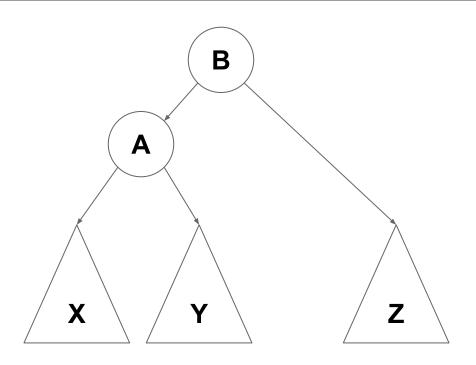
B's left child became A's right child



A became B's left child

B's left child became A's right child

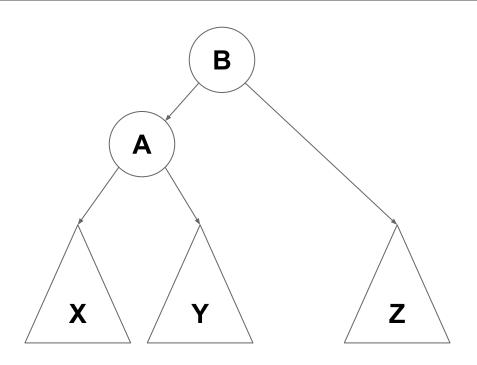
Is ordering maintained?



A became B's left child

B's left child became A's right child

Is ordering maintained? Yes!

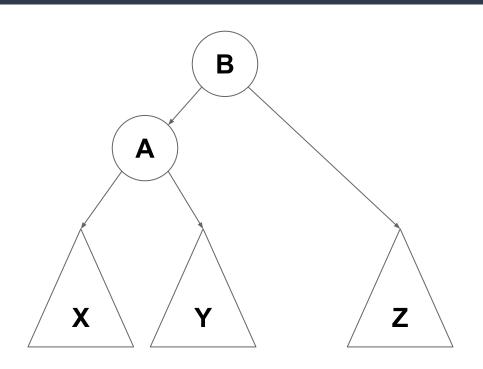


A became B's left child

B's left child became A's right child

Is ordering maintained? Yes!

Complexity?

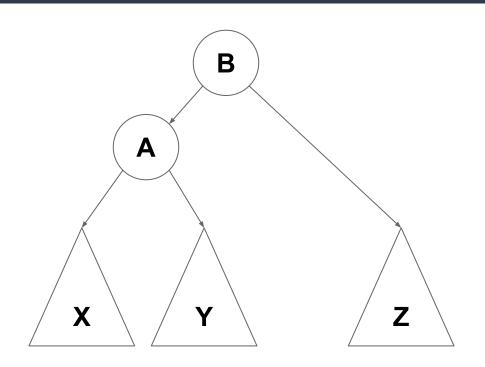


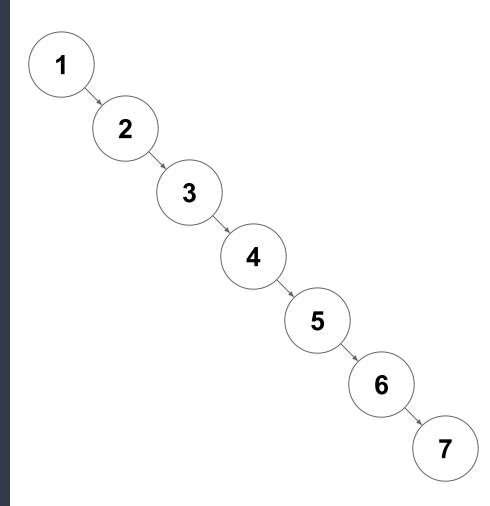
A became B's left child

B's left child became A's right child

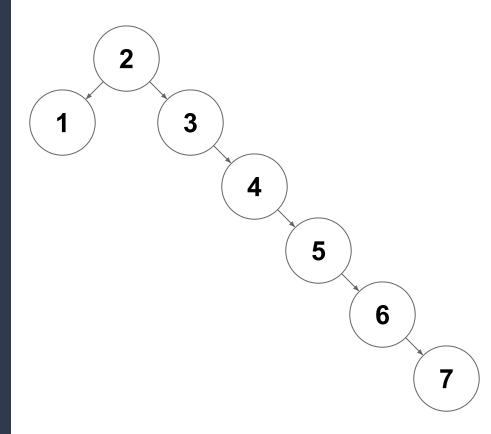
Is ordering maintained? Yes!

Complexity? O(1)

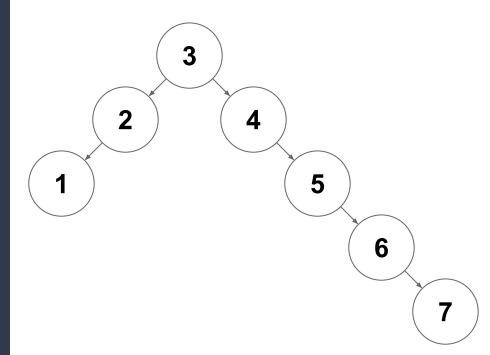




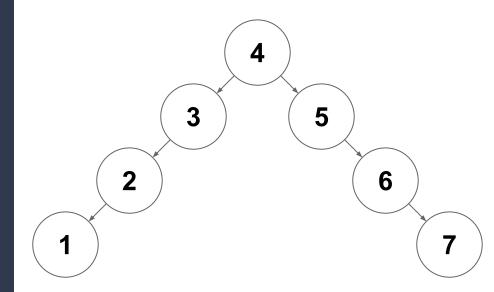
Rotate(1,2)



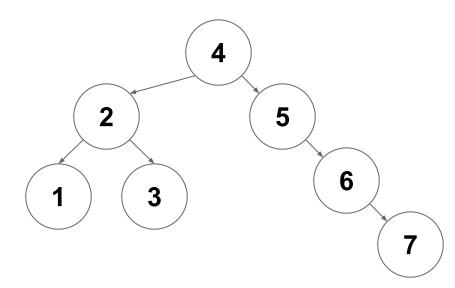
Rotate(2,3)



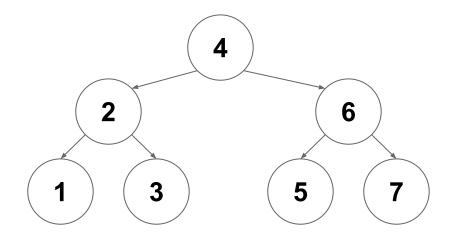
Rotate(3,4)



Rotate(3,2)



Rotate(5,6)



Next Time...

Enforcing Balance with AVL Trees...