

# COMP251: DATA STRUCTURES & ALGORITHMS

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\* Some slides from “Algorithms and Data Structures”  
by Douglas Wilhelm Harder

# Binary Search Trees

# Abstract Sorted Lists

- Previously, we discussed Abstract Lists: the objects are explicitly linearly ordered by the programmer
- We will now discuss the Abstract Sorted List:
  - The relation is based on an implicit linear ordering
- Certain operations no longer make sense:
  - `push_front` and `push_back` are replaced by a generic `insert`

# Implementation

If we implement an Abstract Sorted List using an array or a linked list, we will have operations which are  $\mathbf{O}(n)$

- As an insertion could occur anywhere in a linked list or array, we must either traverse or copy, on average,  $\mathbf{O}(n)$  objects

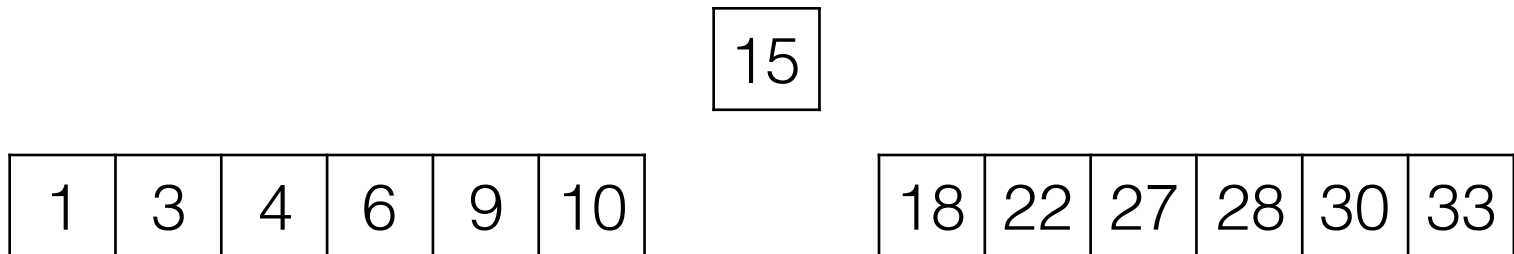
# Binary Search - recap

- If we keep the array in sorted order
- We can use binary search to find any item in the array in  $\mathbf{O}(\log n)$
- But still insertion takes  $\mathbf{O}(n)$  (we should keep the array sorted)

1	3	4	6	9	10	15	18	22	27	28	30	33
---	---	---	---	---	----	----	----	----	----	----	----	----

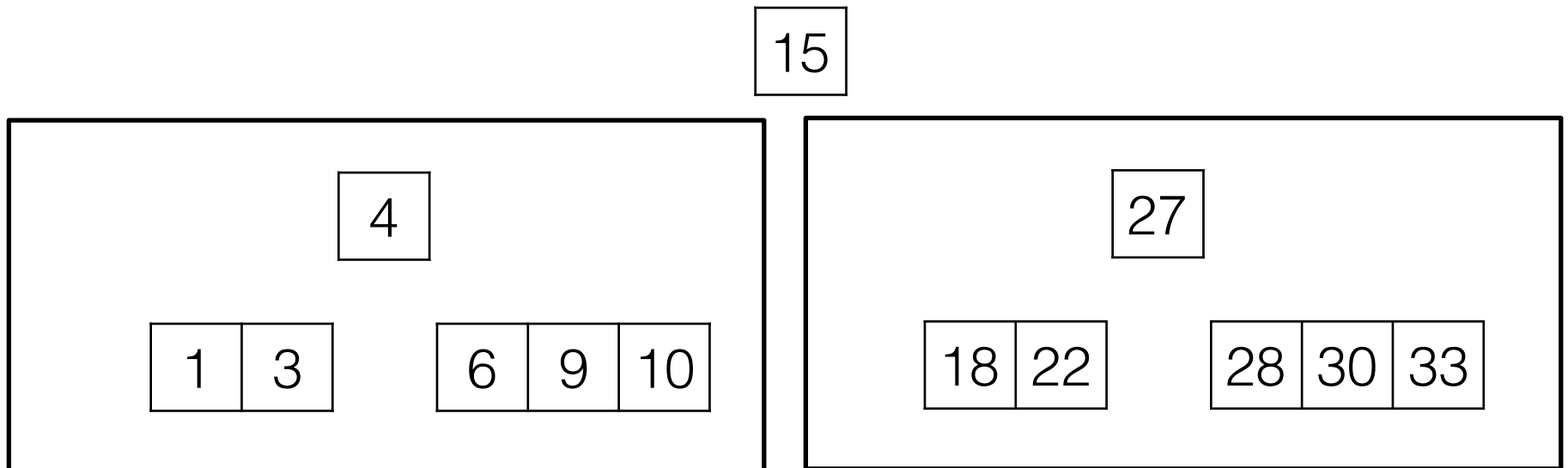
# Binary Search - recap

- Assume we divide the array in two pieces and keep middle element separate
- When we insert, we only have to shift at most  $\frac{1}{2}$  as many elements
  - Time to find  $\mathbf{O}(\log n)$
  - Time to insert/remove  $\frac{1}{2}$  original time



# Binary Search - recap

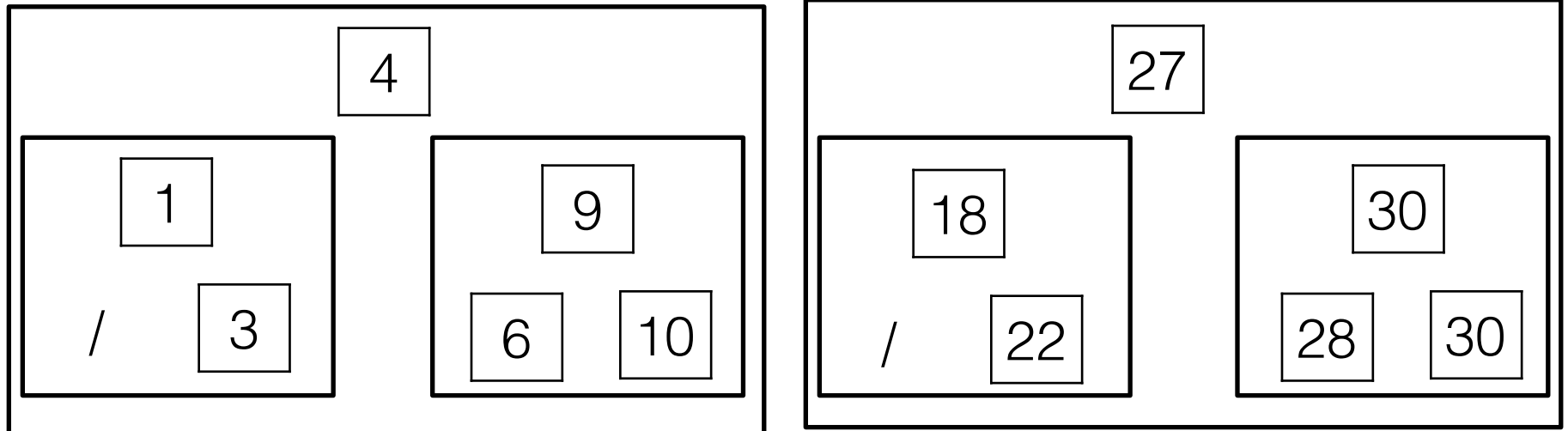
- Time to find  $\mathbf{O}(\log n)$
- Time to insert/remove  $\frac{1}{4}$  original time



# Binary Search - recap

- and so on ...
- Keep splitting and eventually we get rid of array all together.

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# Binary Search Tree

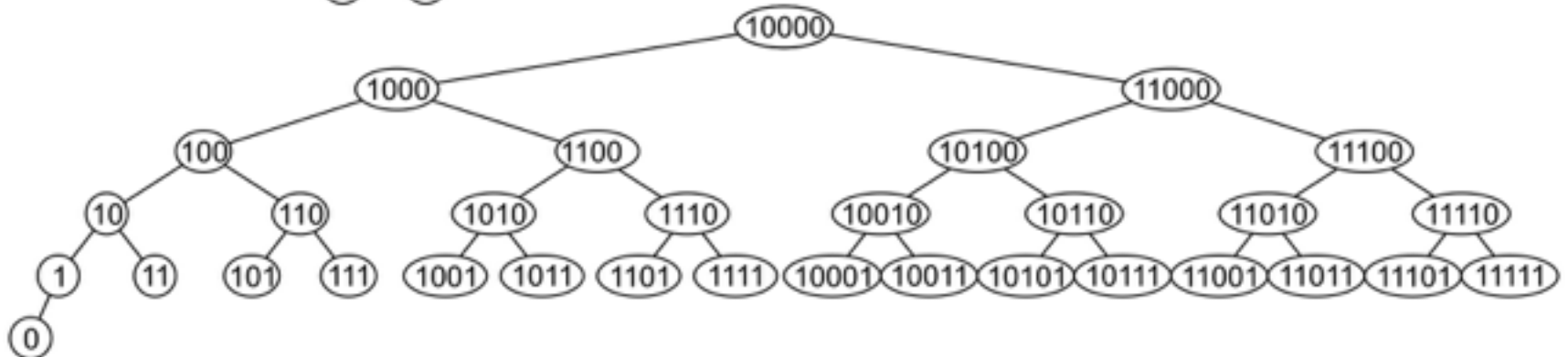
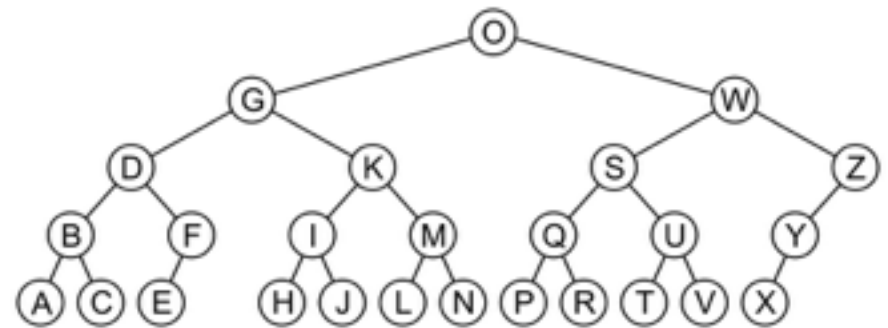
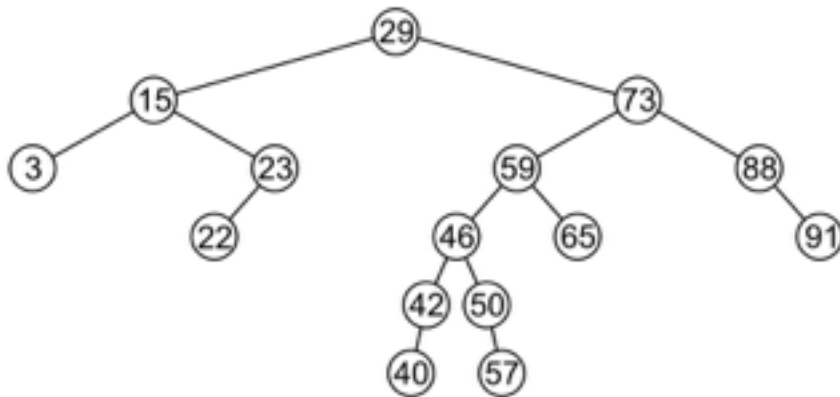
- We've just invented Binary Search Tree!
- $\mathbf{O}(\log n)$  deep: We will see that the runtime for contains, add, remove are all  $\mathbf{O}(\log n)$  if we keep the tree balanced!

# Recursive Definition

- A binary tree  $T$  is a binary search tree if
  - $T$  is empty,or
  - $T$  has two subtrees  $T_L$  and  $T_R$ , where
    - all the values in  $T_L$  are less than the root of  $T$ ,
    - all the values in  $T_R$  are greater than the root of  $T$

# Examples

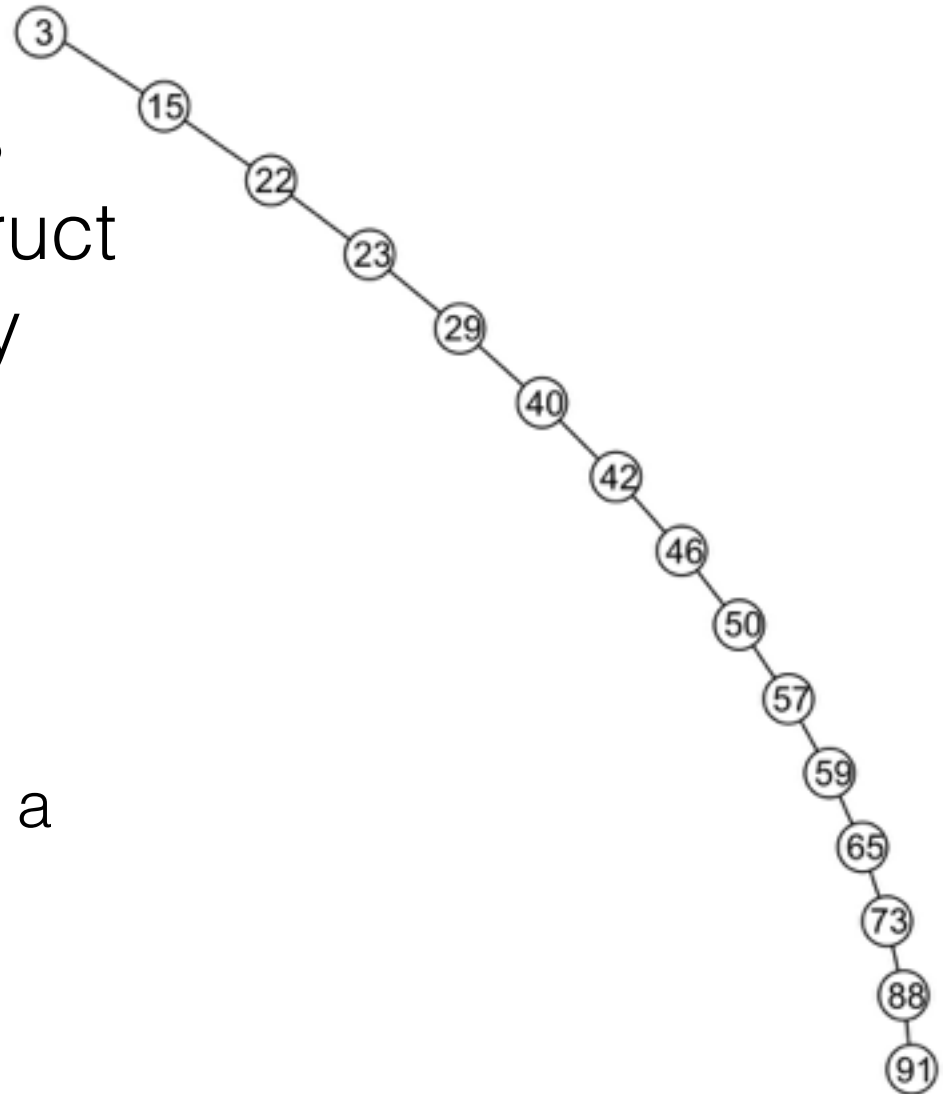
Here are other examples of binary search trees:



# Examples

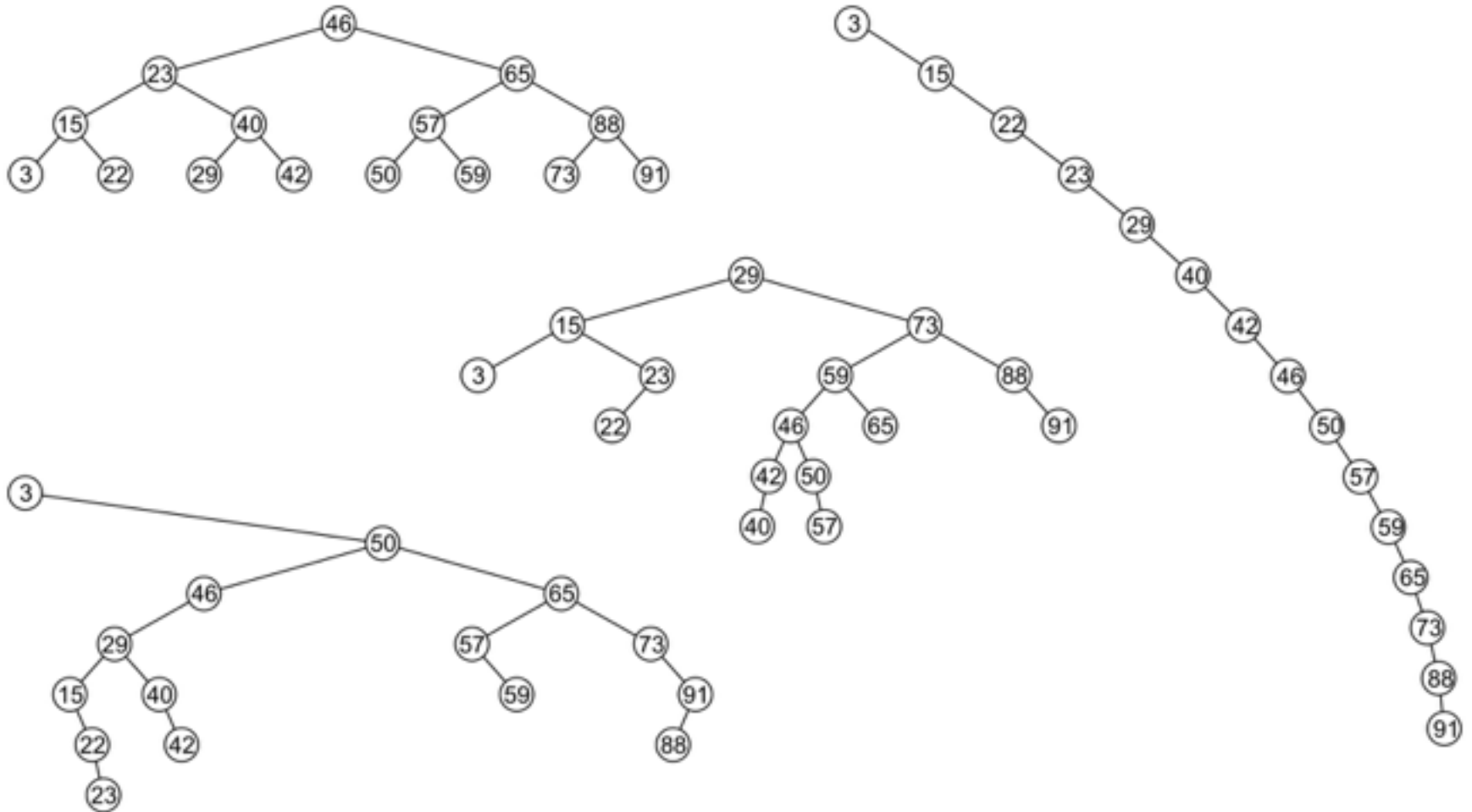
Unfortunately, it is possible to construct *degenerate* binary search trees

- This is equivalent to a linked list, *i.e.*,  $\mathbf{O}(n)$



# Examples

All these binary search trees store the same data



# Duplicate Elements

We will assume that in any binary tree, we are not storing duplicate elements unless otherwise stated

- In reality, it is seldom the case where duplicate elements in a container must be stored as separate entities

You can always consider duplicate elements with modifications to the algorithms we will cover

# Implementation

We will look at an implementation of a binary search tree

- We will have a `BinaryNode` class
- A `BinarySearchTree` class will store a reference to the root node

We will write a generic implementation, however, we will require that the class implements the `compareTo()` method

# Implementation

Any class which uses this binary-search-tree class must implement the compareTo method:

```
public int compareTo(Object obj);  
// it compare the given object obj with the current object  
  (this)
```

This method allows us to compare two instances of this class ( obj1.compareTo(obj2) )

- returns 0 if they are equal
- returns -1 if obj1 is less than obj2
- returns +1 if obj1 is greater than obj2



# Binary Node Class

We use the BinaryNode class:

```
class BinaryNode<AnyType>
{
    AnyType          element;
    BinaryNode<AnyType> left;
    BinaryNode<AnyType> right;

    public BinaryNode( ){
        this( null, null, null );
    }

    public BinaryNode( AnyType theElement, BinaryNode<AnyType> lt,
                      BinaryNode<AnyType> rt) {
        element = theElement;
        left    = lt;
        right   = rt;
    }
}
```

# Implementation

```
/** The tree root. */
protected BinaryNode<AnyType> root;

/** public methods. */
public BinarySearchTree() // --> constructor (create an empty tree)
void insert( x )          // --> Insert x
void remove( x )          // --> Remove x
void removeMin( )         // --> Remove minimum item
AnyType find( x )         // --> Return item that matches x
AnyType findMin( )        // --> Return smallest item
AnyType findMax( )        // --> Return largest item
boolean isEmpty( )        // --> Return true if empty; else false
void clear( )             // --> Remove all items
```

Note: AnyType is comparable! (i.e. class AnyType must implement the compareTo method)

# Constructor

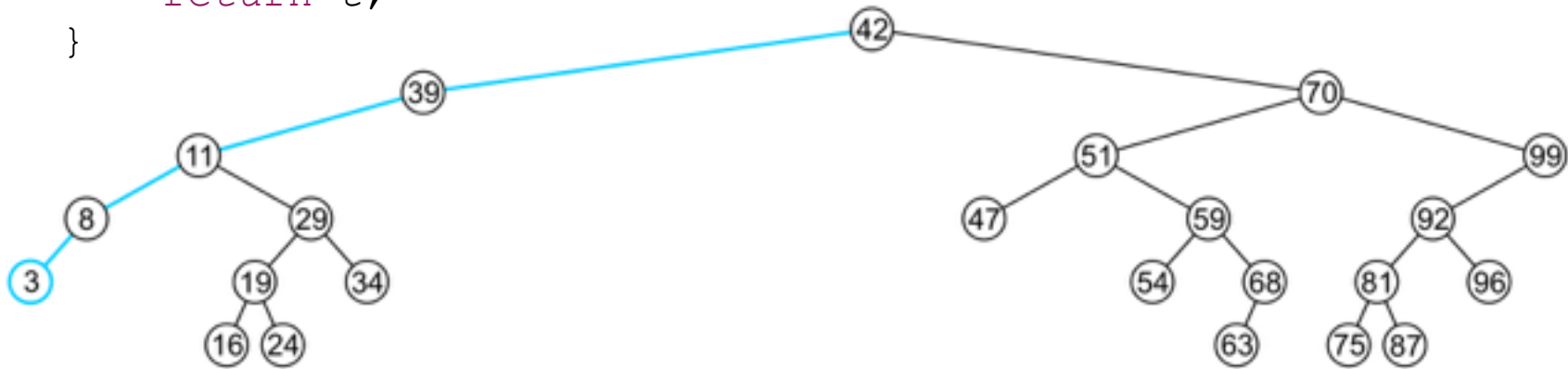
The constructor creates an empty binary search tree (simply set root to null)

```
public BinarySearchTree( )  
{  
    root = null;  
}
```

# Finding the Minimum Object

```
public AnyType findMin( ){  
    return elementAt( findMin( root ) );  
}
```

```
protected BinaryNode<AnyType> findMin(BinaryNode<AnyType> t) {  
    if( t != null )  
        while( t.left != null )  
            t = t.left;  
  
    return t;  
}
```

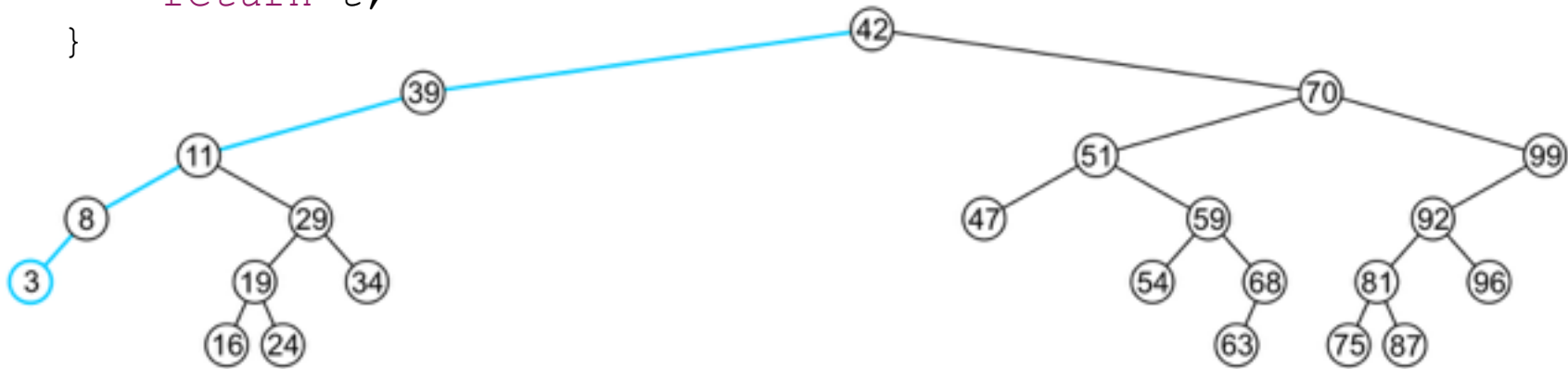


# Finding the Minimum Object

```
public AnyType findMin( ){  
    return elementAt( findMin( root ) );  
}
```

```
protected BinaryNode<AnyType> findMin(BinaryNode<AnyType> t) {  
    if( t != null )  
        while( t.left != null )  
            t = t.left;  
  
    return t;  
}
```

run time  $O(h)$



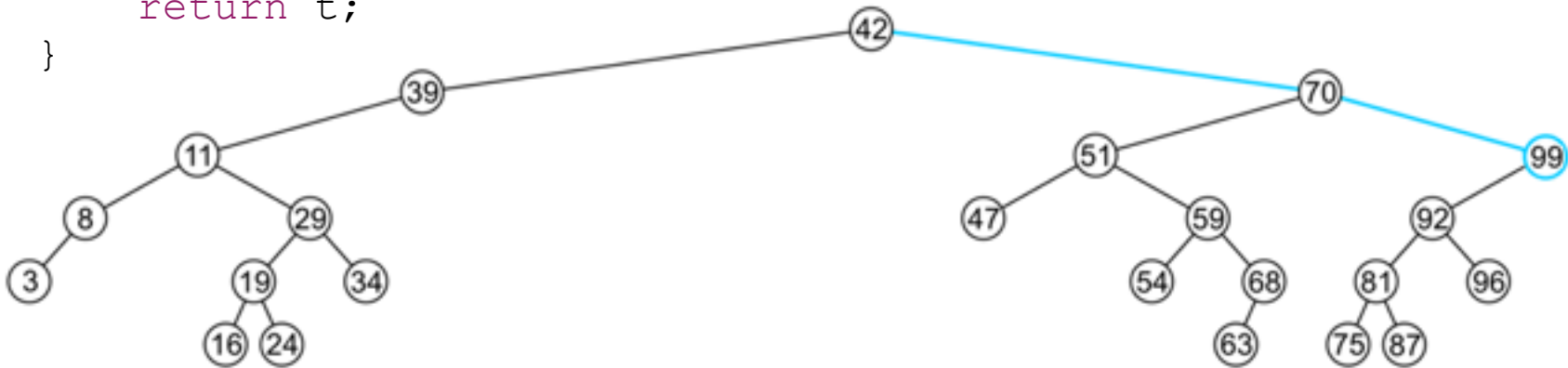
# Finding the Maximum Object

```
public AnyType findMax( ){  
    return elementAt( findMax( root ) );  
}
```

```
protected BinaryNode<AnyType> findMax(BinaryNode<AnyType> t) {  
    if( t != null )  
        while( t.right != null )  
            t = t.right;
```

```
    return t;  
}
```

run time  $O(h)$

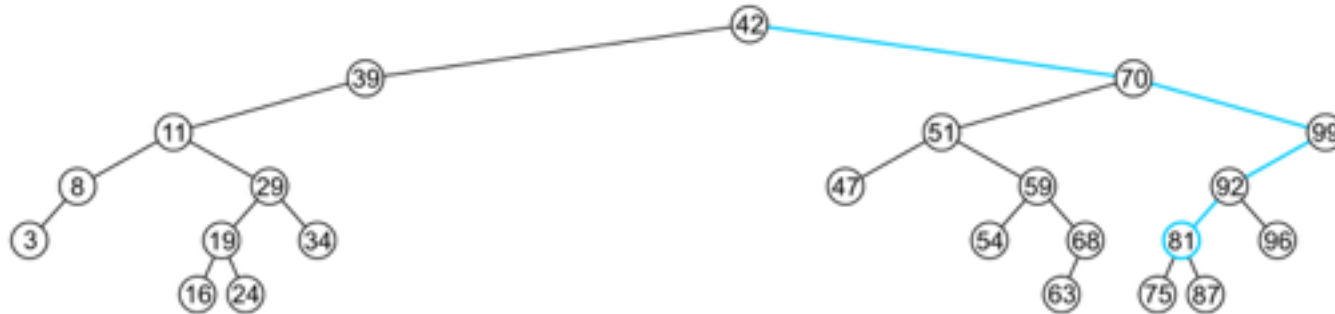


**The extreme values are not necessarily leaf nodes**

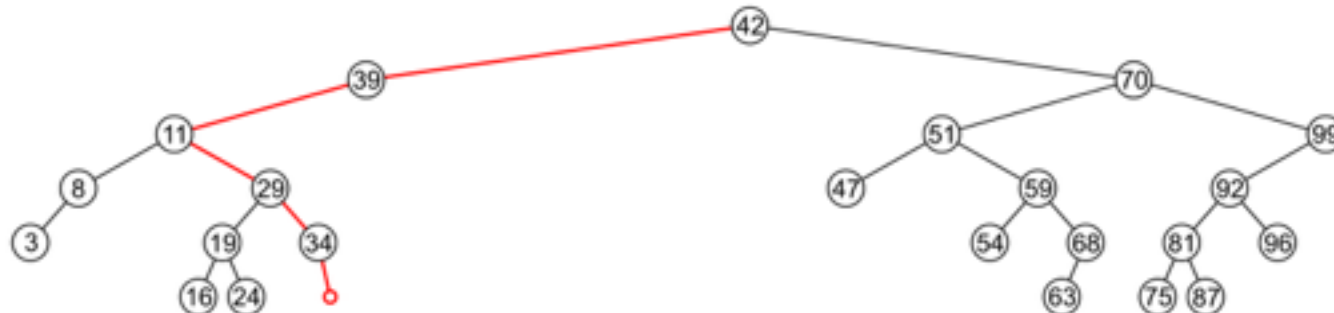
# Find

To determine whether given value is in the BST, we traverse the tree to find the value

–If a node containing the value is found, *e.g.*, 81, return 1



–If an empty node is reached, *e.g.*, 36, the object is not in the tree:



# Find

Starting at the root, we determine whether the value we are looking for:

- is in the root
- might be in the root's left subtree
- might be in the root's right subtree

We can write a recursive method or non-recursive method

Be careful, in recursive case, there are actually two base cases:

- The tree is empty; return false.
- The value is in the root node; return true.



# Find

```
public AnyType find( AnyType x ){
    return elementAt( find( x, root ) );
}

protected BinaryNode<AnyType> find(Anytype x, BinaryNode<AnyType> t){
    while( t != null ){
        if( x.compareTo( t.element ) < 0 )
            t = t.left;
        else if( x.compareTo( t.element ) > 0 )
            t = t.right;
        else
            return t;      // x is matched to t.element
    }

    return null;          // Not found
}
```

**run time  $O(h)$**

non-recursive implementation

# Insert

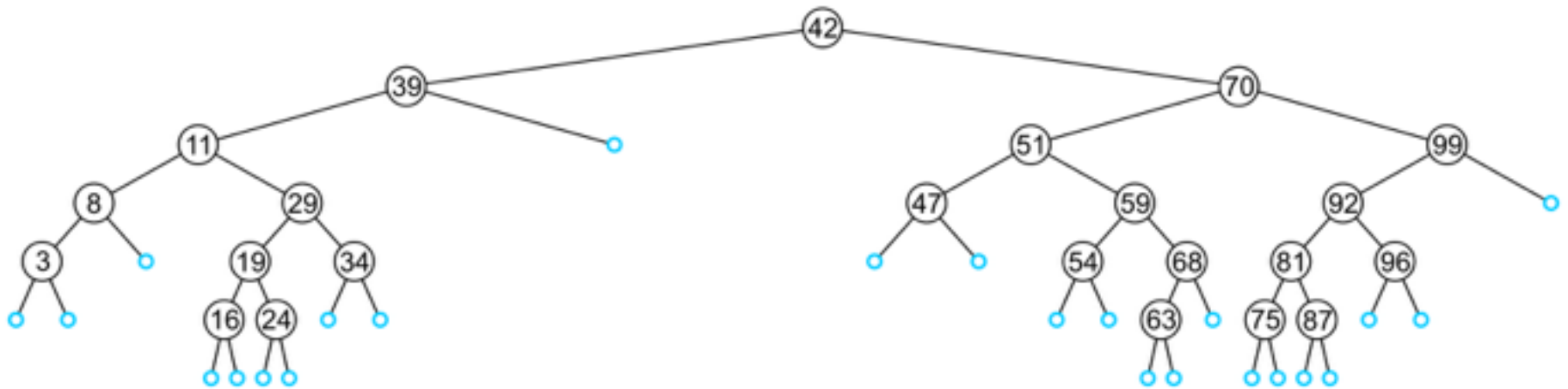
Recall that a Sorted List is implicitly ordered

- It does not make sense to have member functions such as `addFront` and `addEnd`
- Insertion will be performed by a single `insert` member function which places the object into the correct location
  - It is the task of method `insert` to find the correct location for the given object

# Insert

An insertion will be performed at a leaf node:

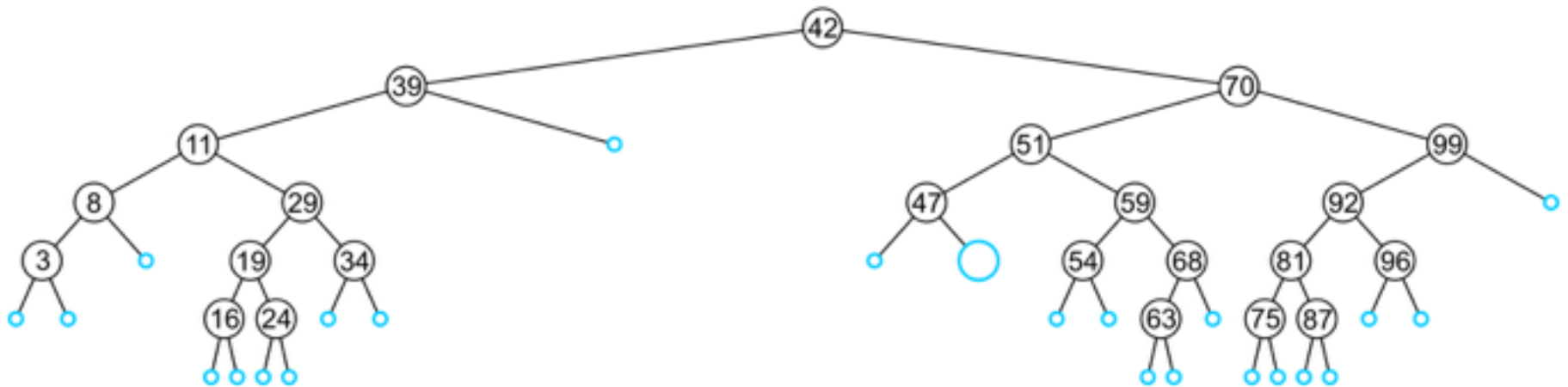
- Any empty node is a possible location for an insertion



The values which may be inserted at any empty node depend on the surrounding nodes

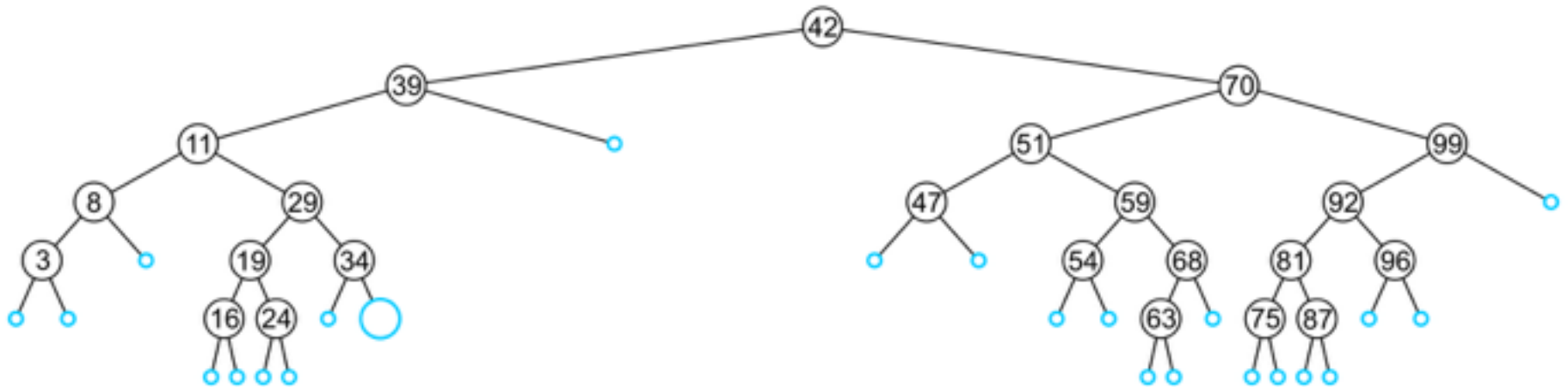
# Insert

For example, this node may hold 48,  
49, or 50



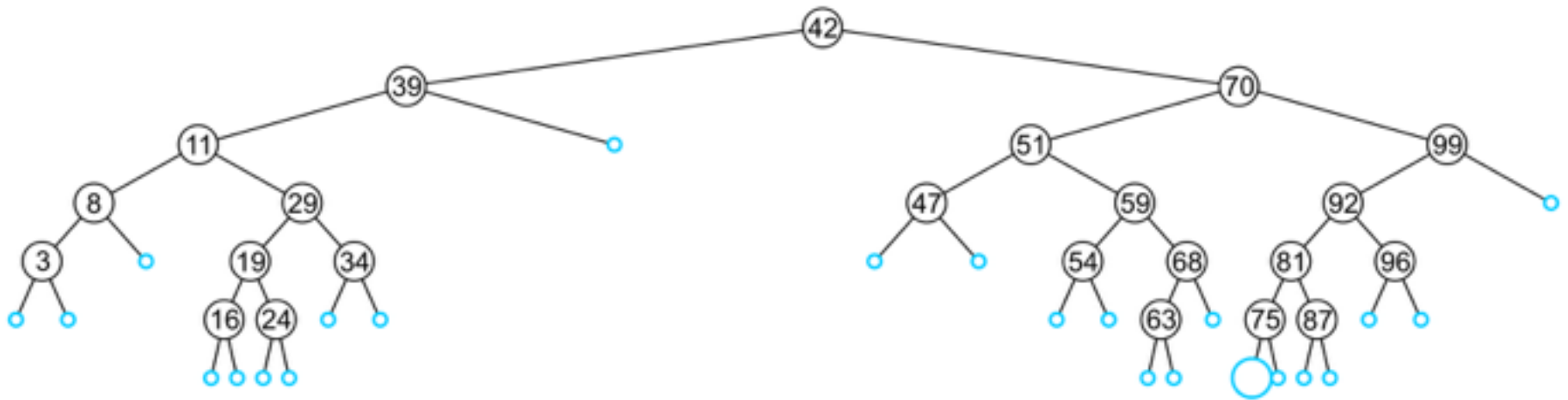
# Insert

An insertion at this location must be 35, 36, 37, or 38



# Insert

This empty node may hold values from 71 to 74



# Insert

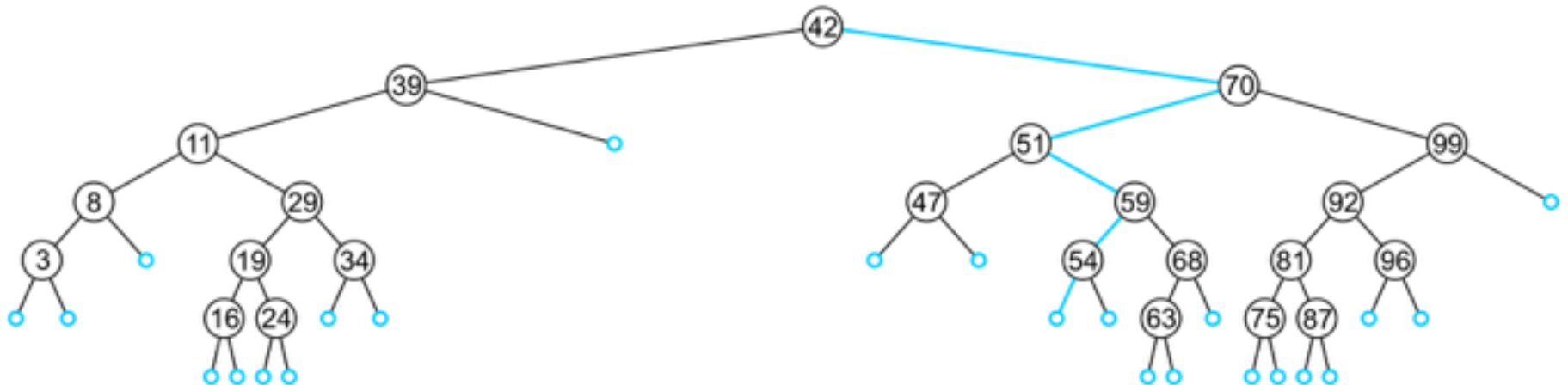
Like find, we will step through the tree

- If we find the object already in the tree, we will return
  - The object is already in the binary search tree (no duplicates) and we do not need to insert it again.
- Otherwise, we will arrive at an empty node
- The object will be inserted into that location
- The run time is  $\mathbf{O}(h)$

# Insert

In inserting the value 52, we traverse the tree until we reach an empty node

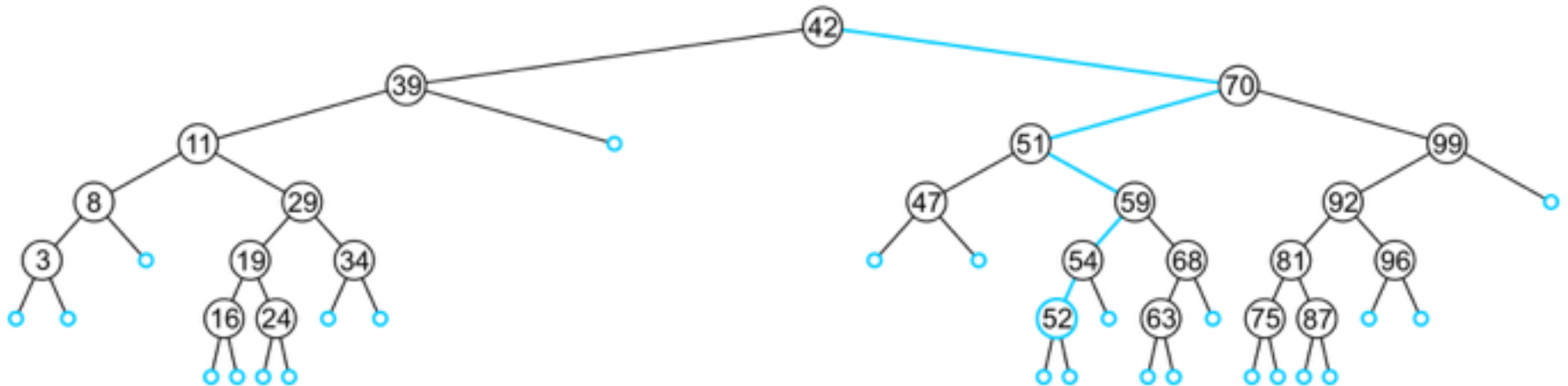
- The left sub-tree of 54 is an empty node





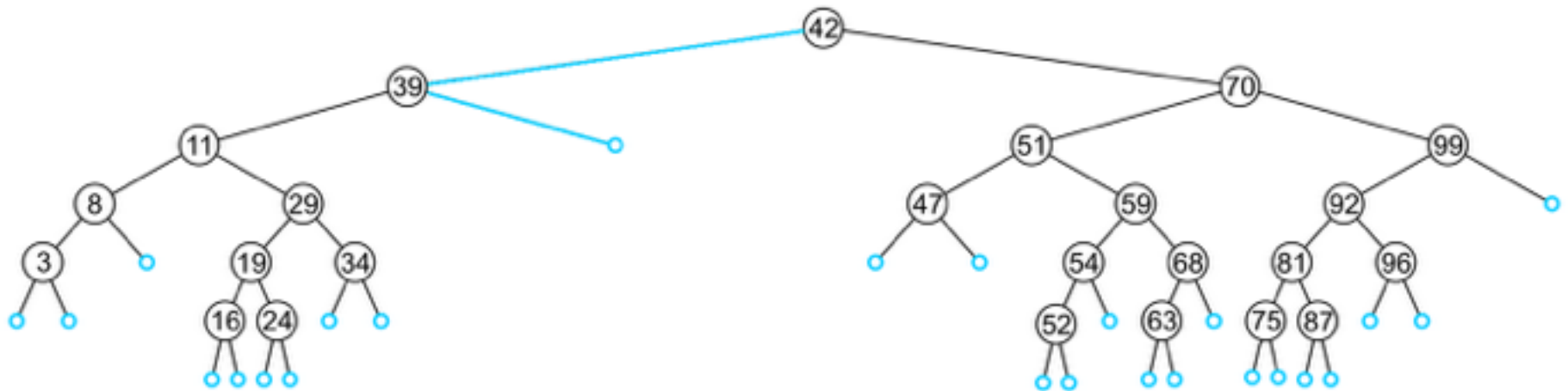
# Insert

A new binary node (leaf) is created and assigned to the `left` child of the node 54



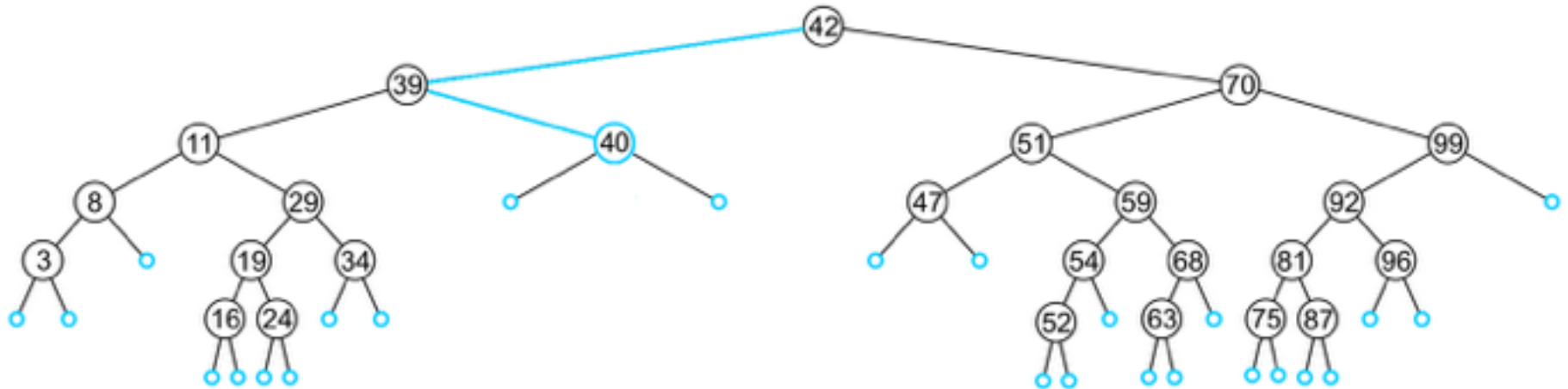
# Insert

In inserting 40, we determine the right sub-tree of 39 is an empty node



# Insert

A new binary node (leaf) storing 40 is created and assigned to the member variable **right**



# Insert

```
public AnyType insert( AnyType x ){
    return root = insert( x, root );
}

protected BinaryNode<AnyType> insert(Anytype x, BinaryNode<AnyType> t)
{
    if( t == null )
        t = new BinaryNode<AnyType>( x );
    else if( x.compareTo( t.element ) < 0 )
        t.left = insert( x, t.left );
    else if( x.compareTo( t.element ) > 0 )
        t.right = insert( x, t.right );
    else
        // Duplicate
        throw new DuplicateItemException( x.toString( ) );

    return t;
}
```

recursive implementation

# Insert

## example:

- In the given order, insert these objects into an initially empty binary search tree:

31 45 36 14 52 42 6 21 73 47 26 37 33 8

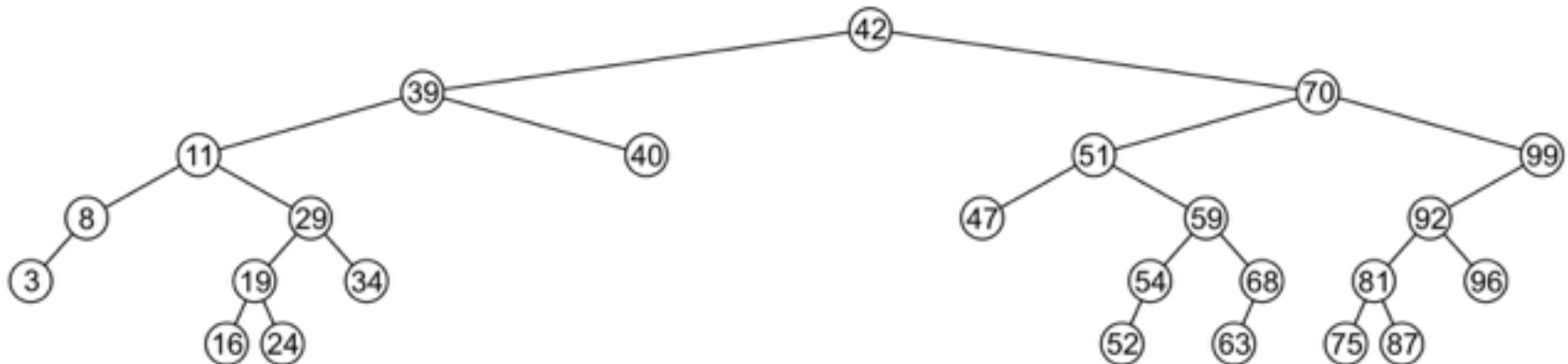
- What values could be placed:
  - To the left of 21?
  - To the right of 26?
  - To the left of 47?
- How would we determine if 40 is in this binary search tree?
- Which values could be inserted to increase the height of the tree?

# Remove

A node being removed is not always going to be a leaf node

There are three possible scenarios:

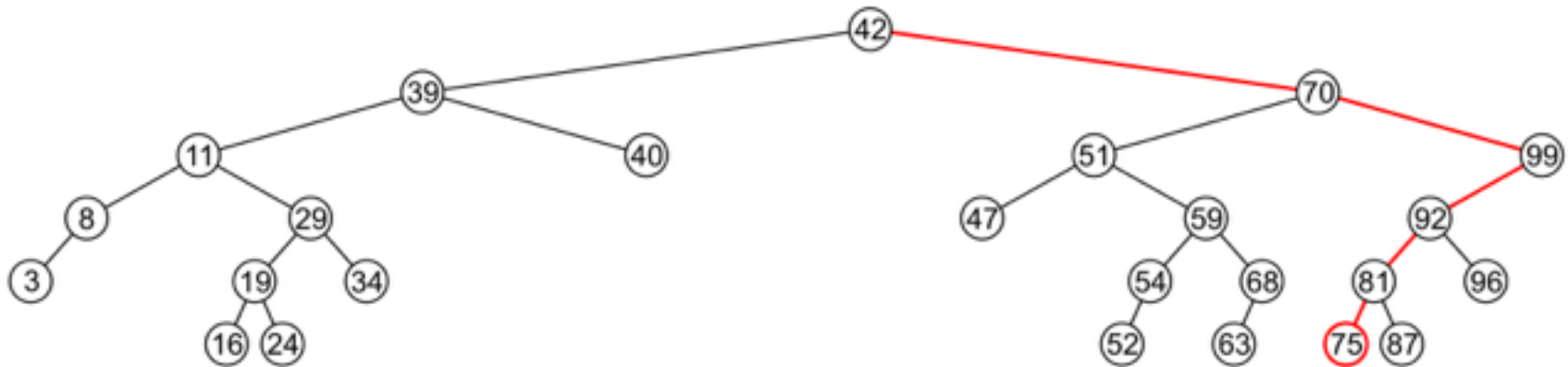
- The node is a leaf node,
- It has exactly one child, or
- It has two children (it is a full node)



# Remove

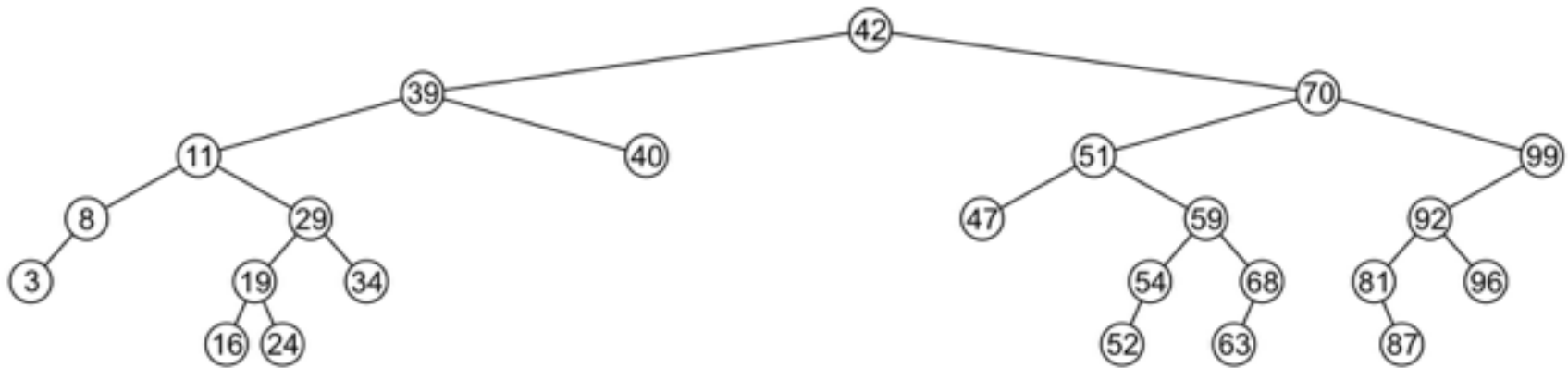
A leaf node simply must be removed and the appropriate field of the parent (`right` or `left` child) is set to `null`

– Consider removing 75



# Remove

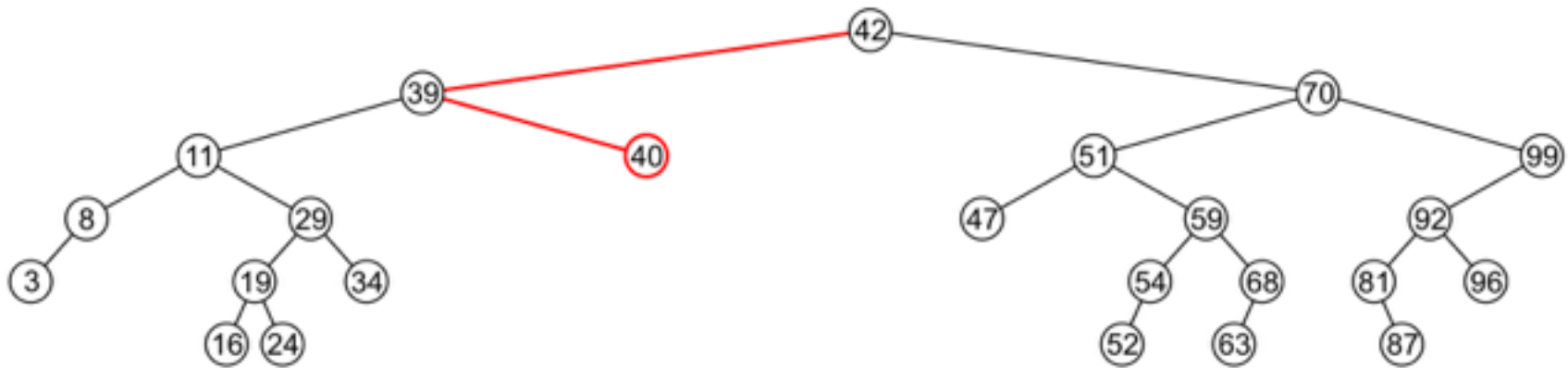
The node is deleted and `left` of 81 is set to `null`





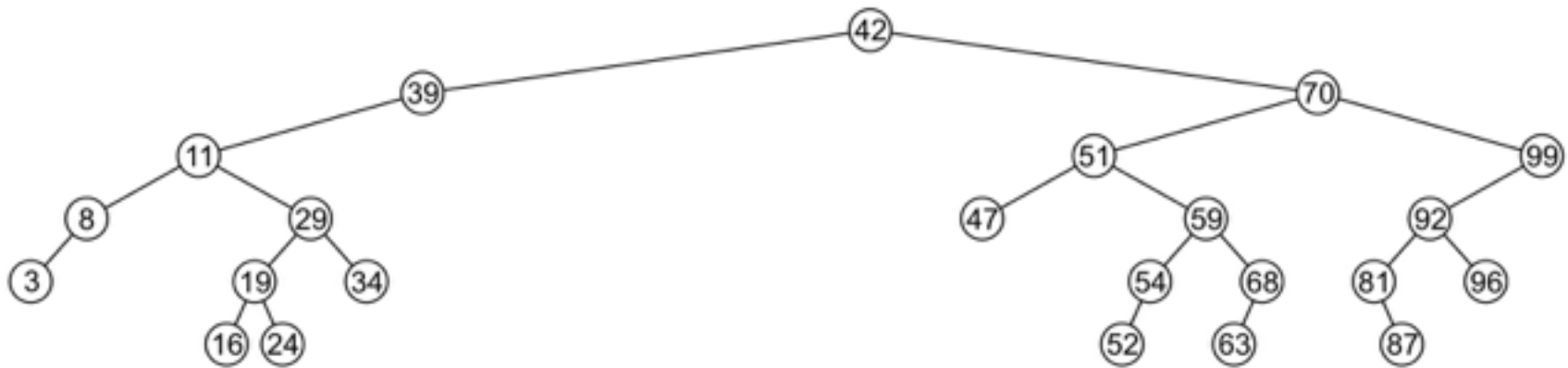
# Remove

Removing the node containing 40 is similar



# Remove

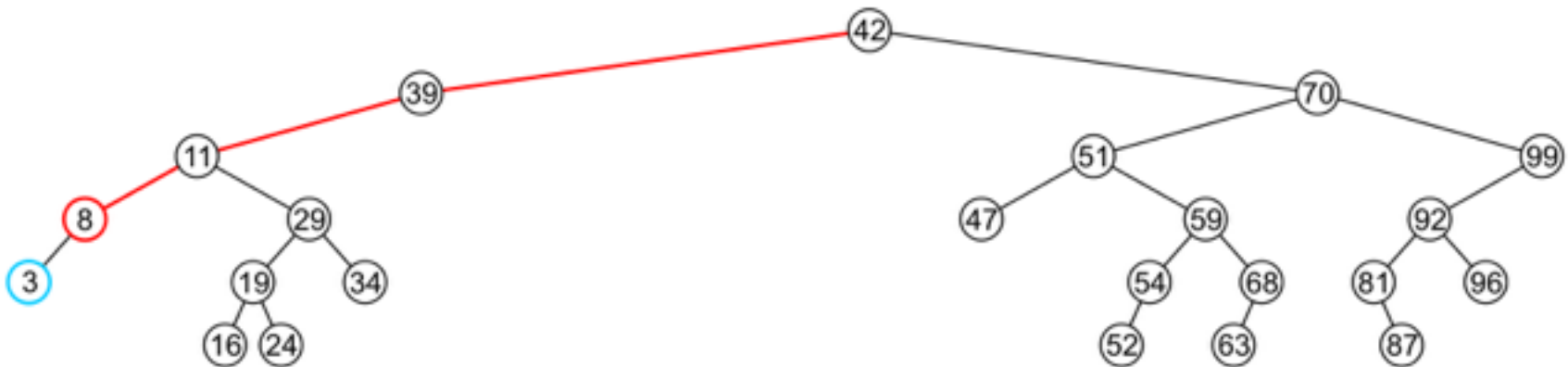
The node is deleted and `right` child of 39 is set to `null`



# Remove

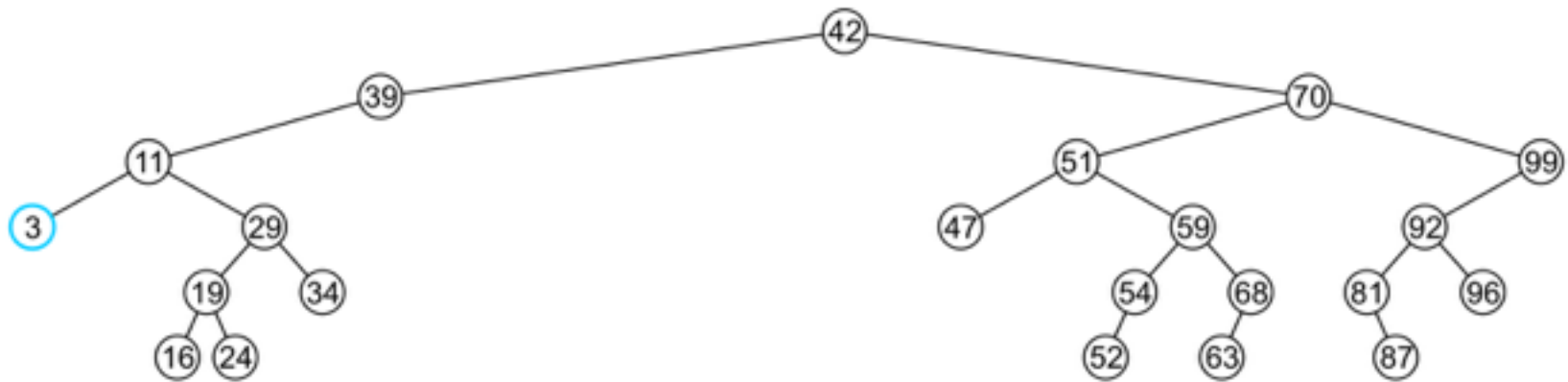
If a node has only one child, we can simply promote the sub-tree associated with the child

- Consider removing 8 which has one left child



# Remove

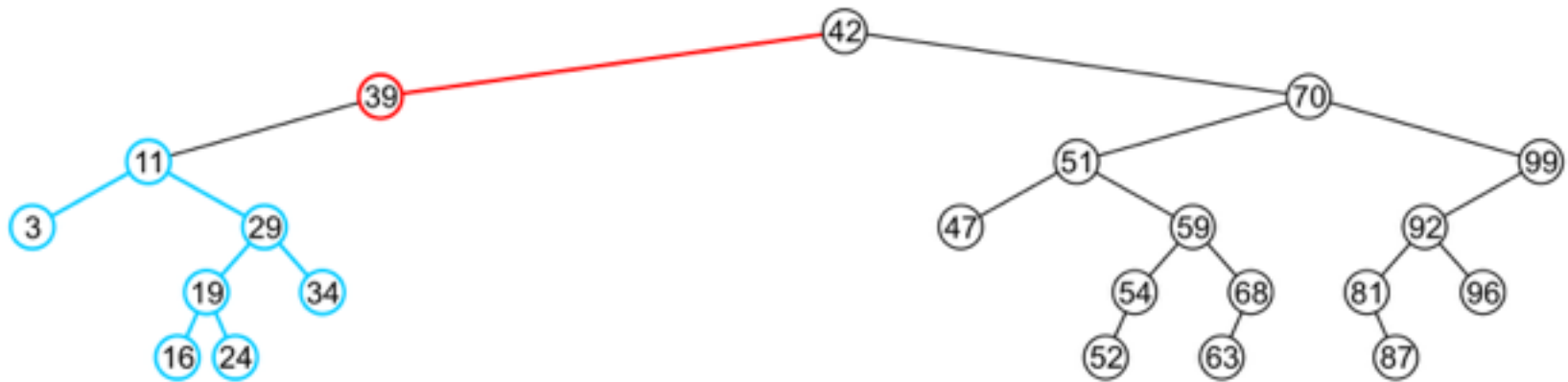
The node 8 is deleted and the `left` child of 11 is updated to point to 3



# Remove

There is no difference in promoting a single node or a sub-tree

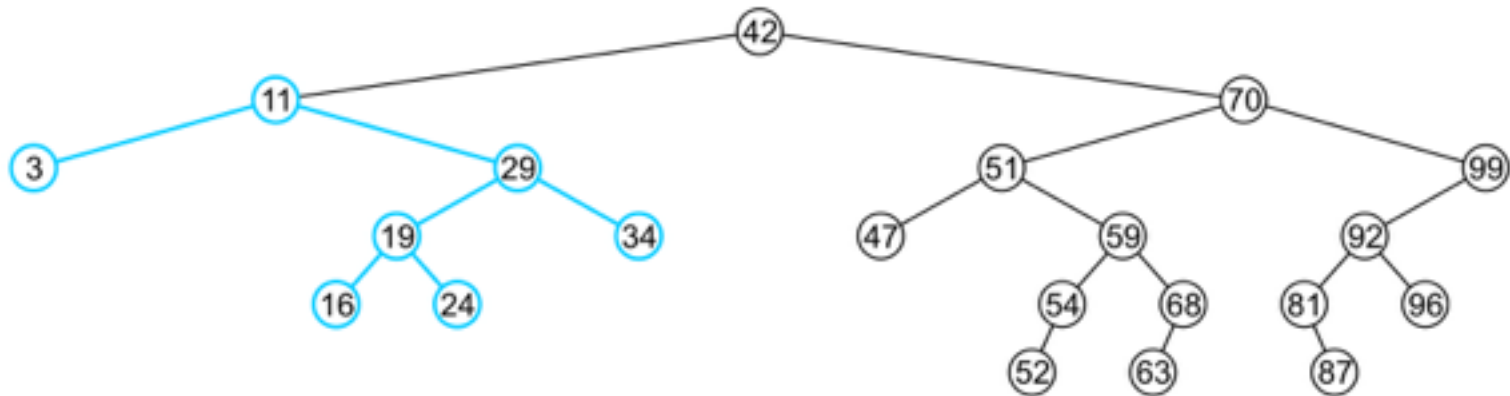
- To remove 39, it has a single child 11



# Remove

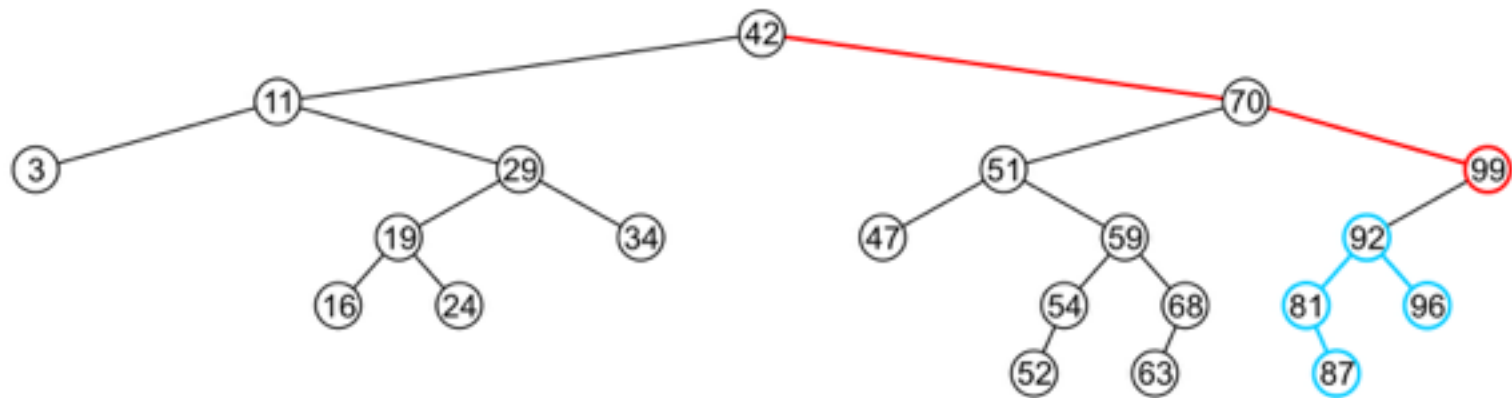
The node containing 39 is deleted and `left` child of 42 is updated to point to the node 11

–Notice that order is still maintained



# Remove

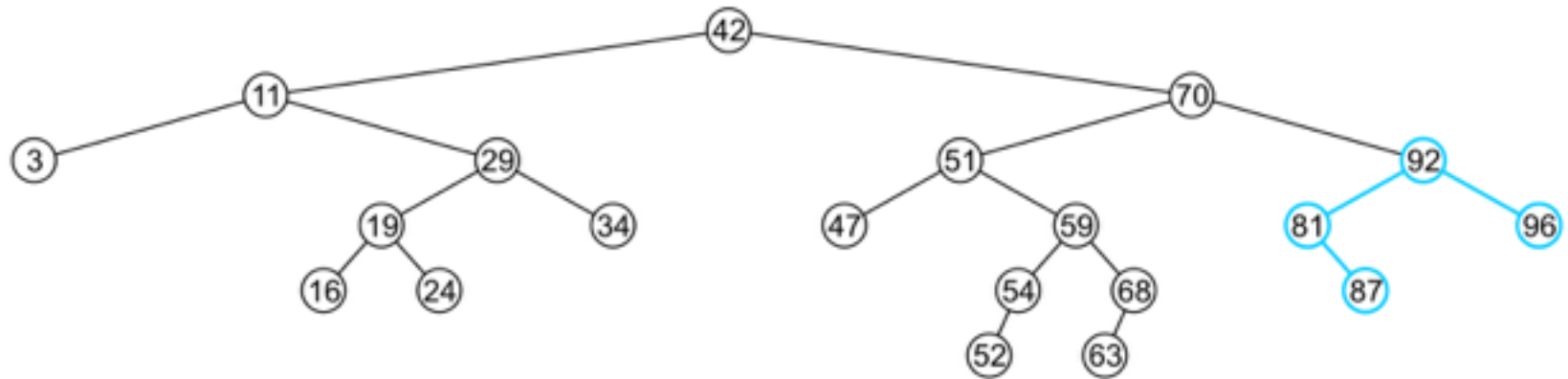
Consider erasing the node containing 99



# Remove

The node is deleted and the left sub-tree is promoted:

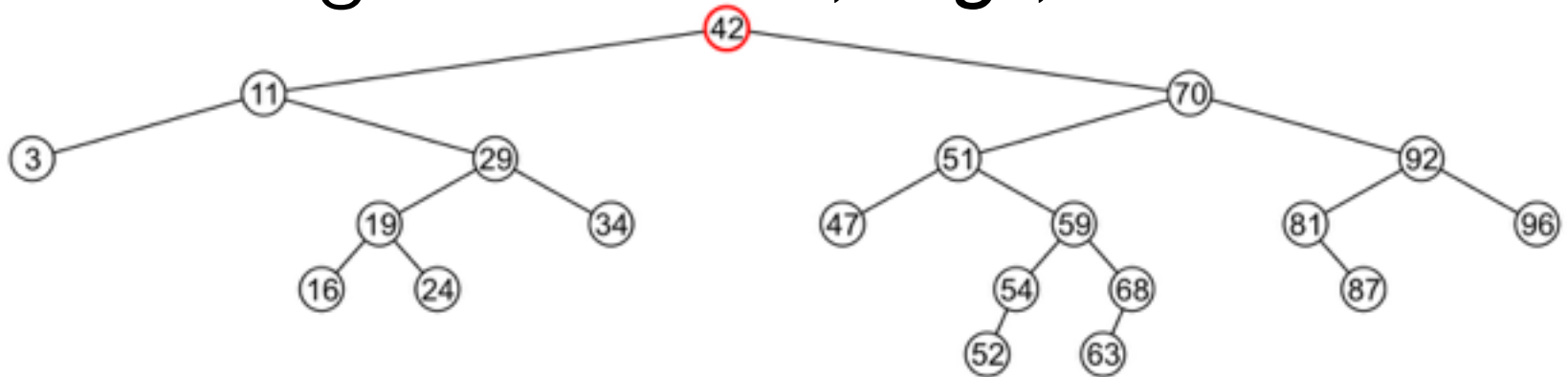
- The **right** child of 70 is set to point to 92
- Again, the order of the tree is maintained





# Remove

Finally, we will consider the problem of erasing a full node, *e.g.*, 42



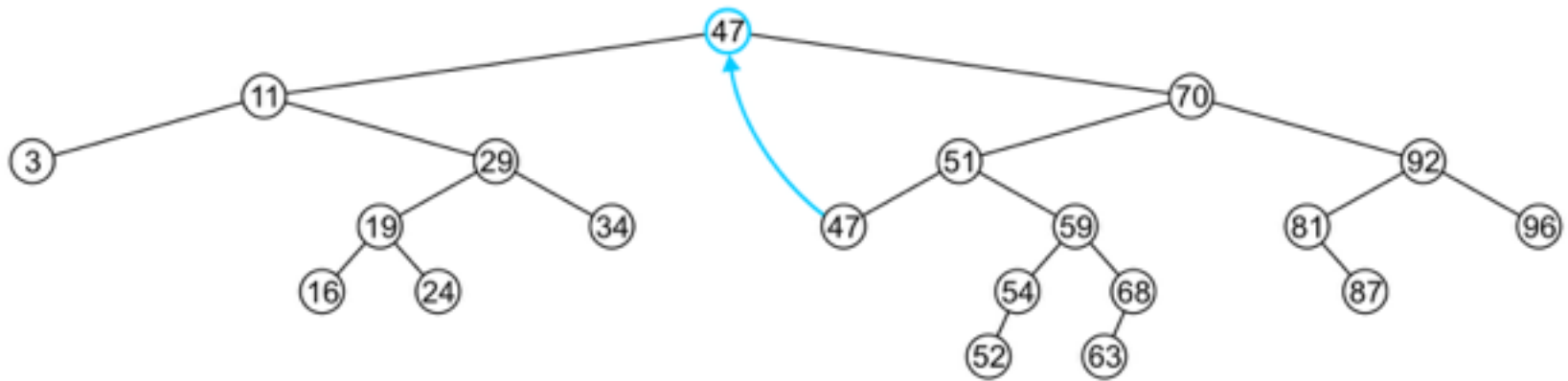
We will perform two operations:

- Replace 42 with the minimum object in the right sub-tree
- Erase that object from the right sub-tree

# Remove

In this case, we replace 42 with 47

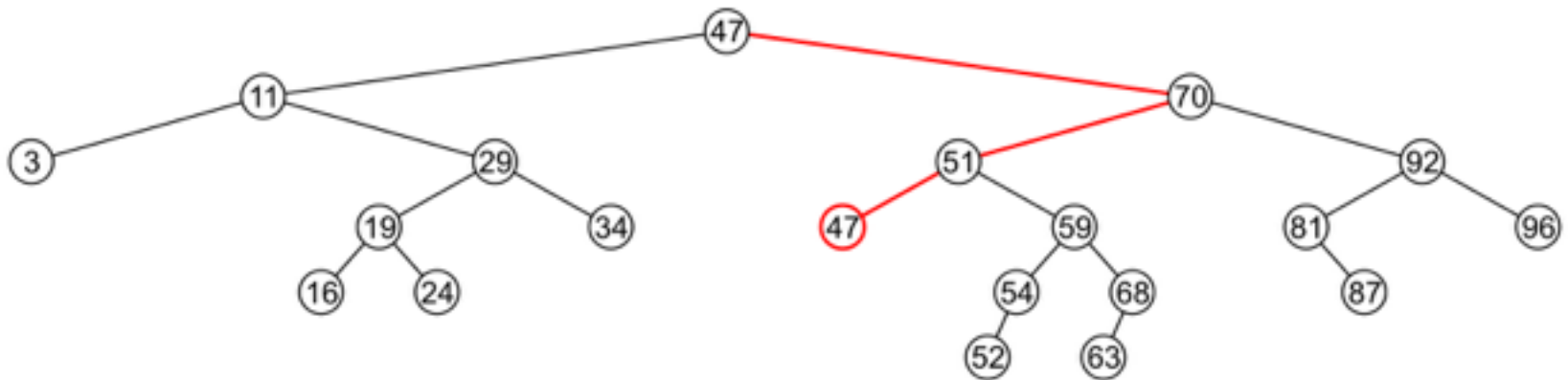
–We temporarily have two copies of 47 in the tree



# Remove

We now recursively erase 47 from the right sub-tree

- We note that 47 is a leaf node in the right sub-tree

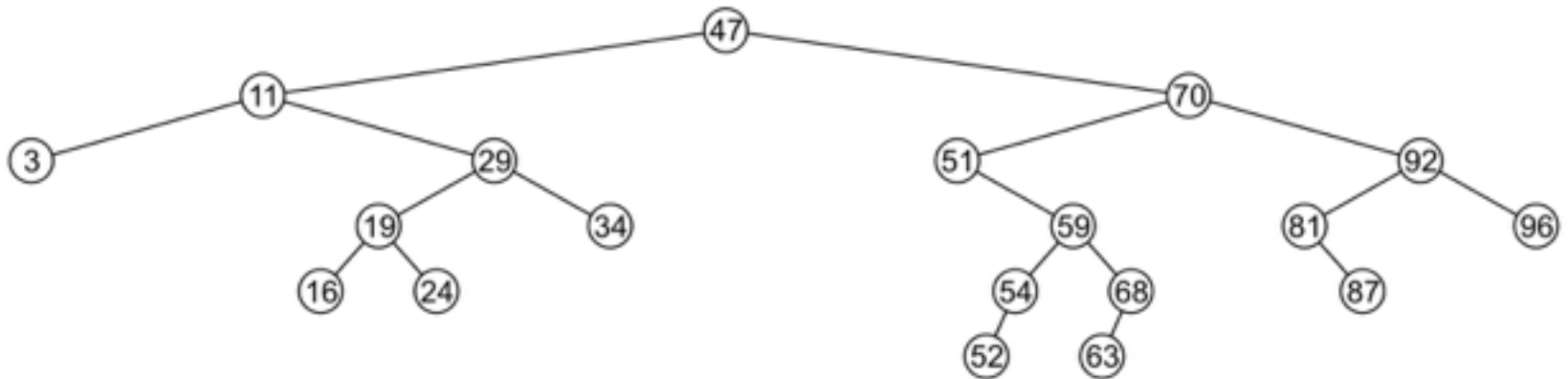


# Remove

Leaf nodes are simply removed (left child of 51 is set to **null**)

–Notice that the tree is still sorted:

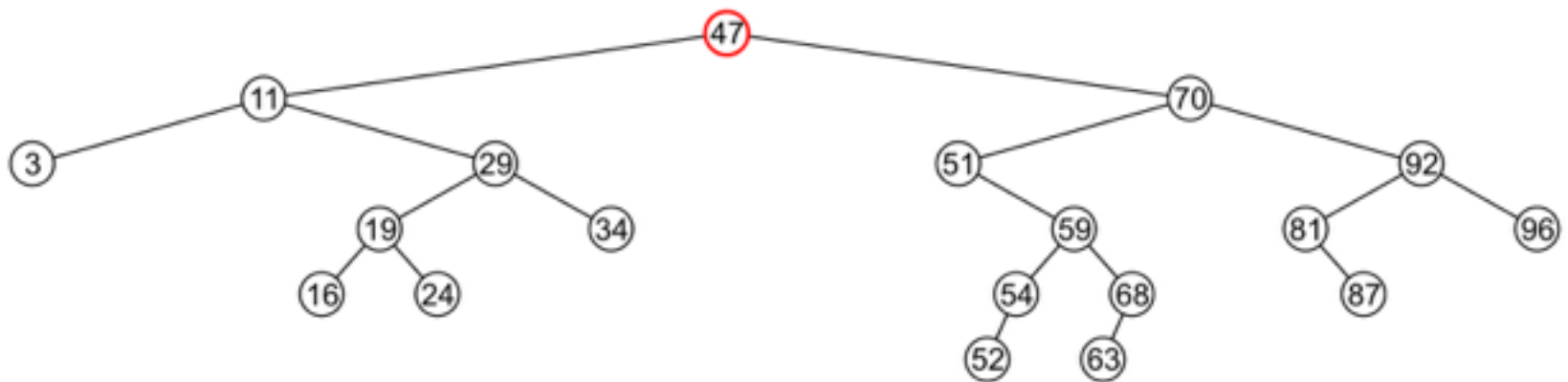
47 was the smallest object in the right sub-tree



# Remove

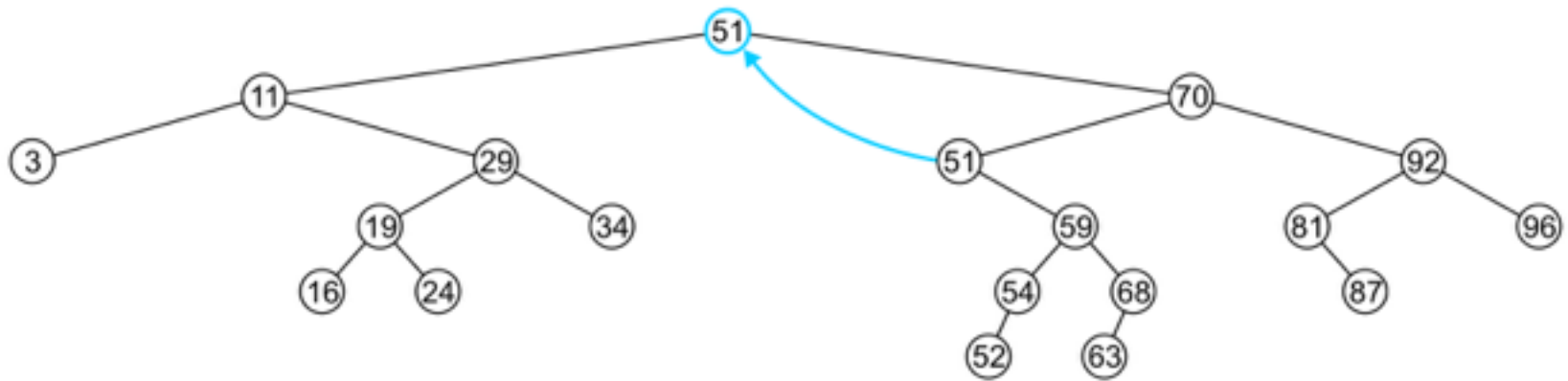
Suppose we want to erase the root 47 again:

- We must copy the minimum of the right sub-tree
- Alternatively we could promote the maximum object in the left sub-tree and achieve correct results



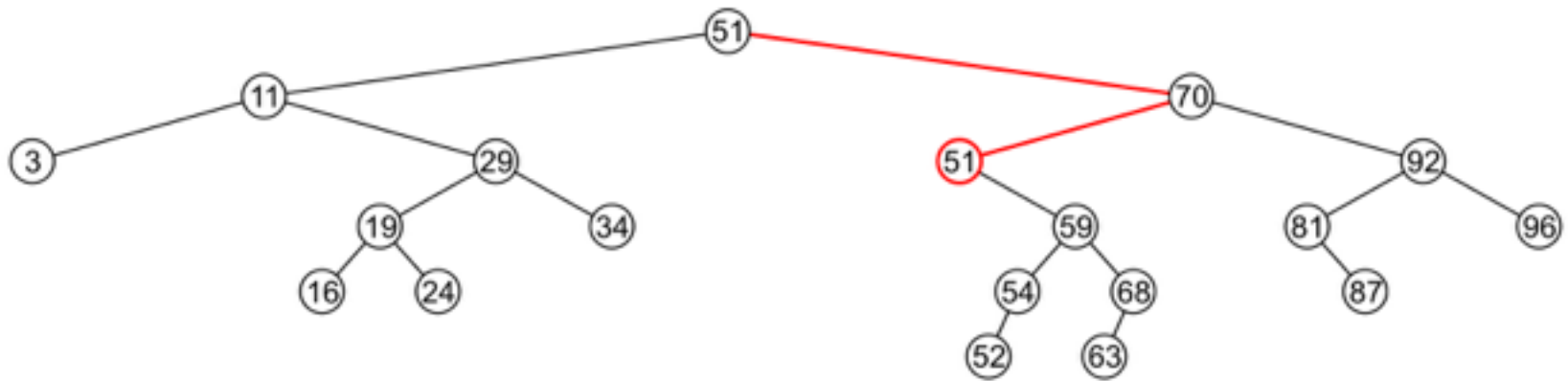
# Remove

We copy 51 from the right sub-tree



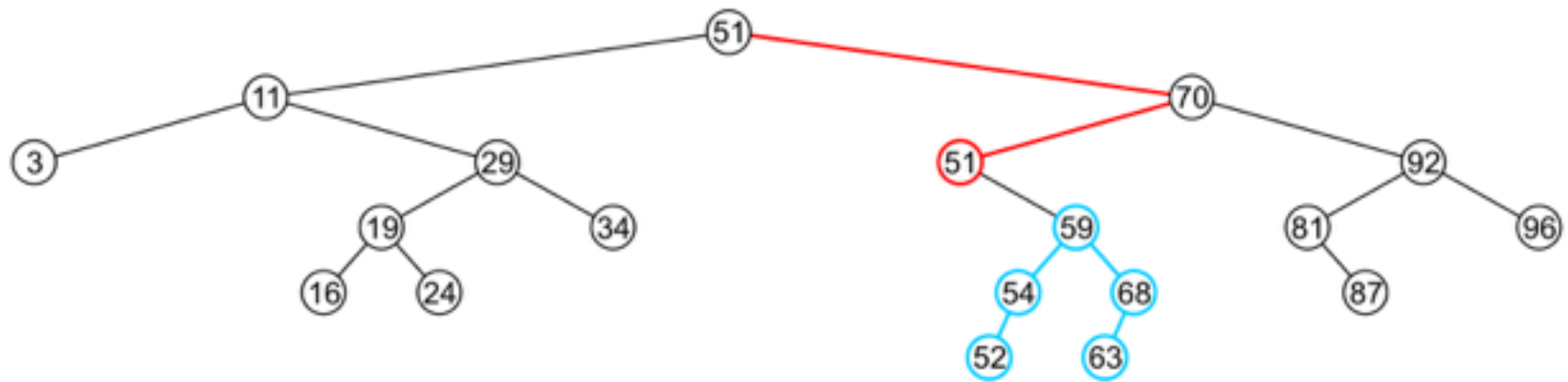
# Remove

We must proceed by deleting 51 from the right sub-tree



# Remove

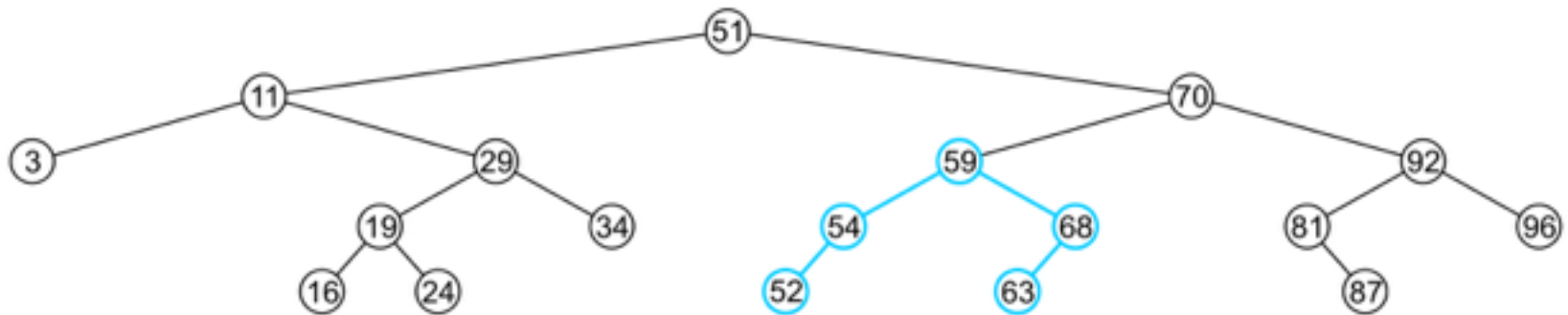
In this case, the node storing 51 has just a single child





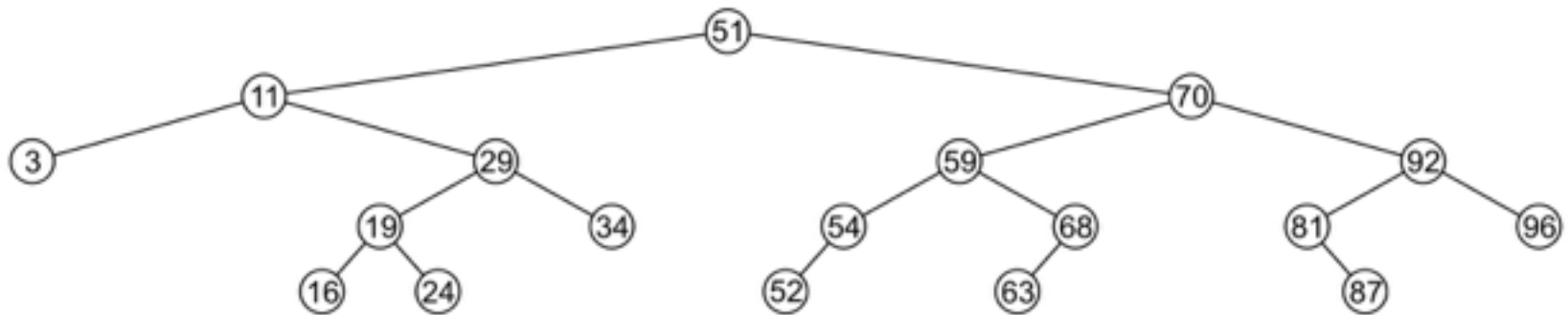
# Remove

We delete the node containing 51 and assign the `left` child of 70 to point to 59



# Remove

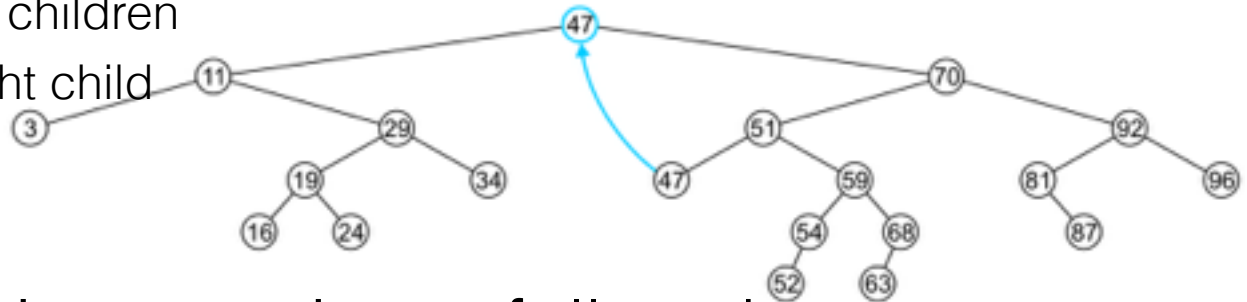
Note that after several removals, the remaining tree is still a BST (correctly sorted)



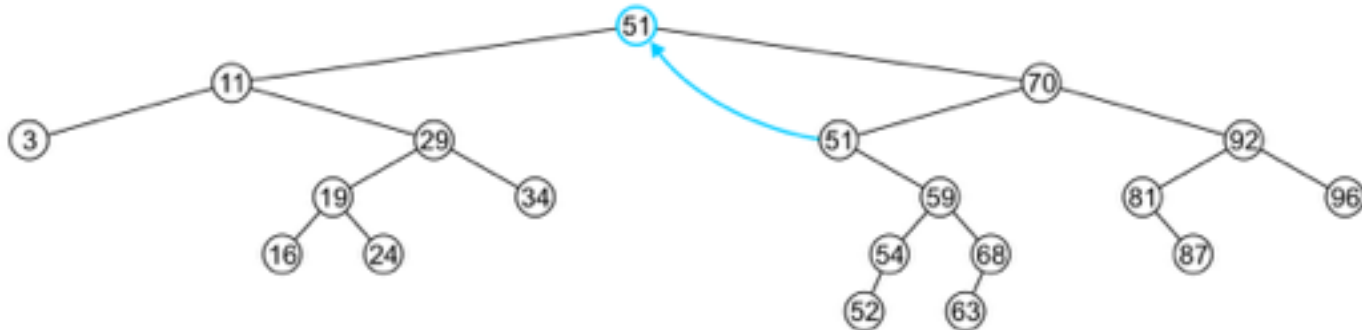
# Remove

In the two examples of removing a full node, we promoted:

- A node with no children
- A node with right child



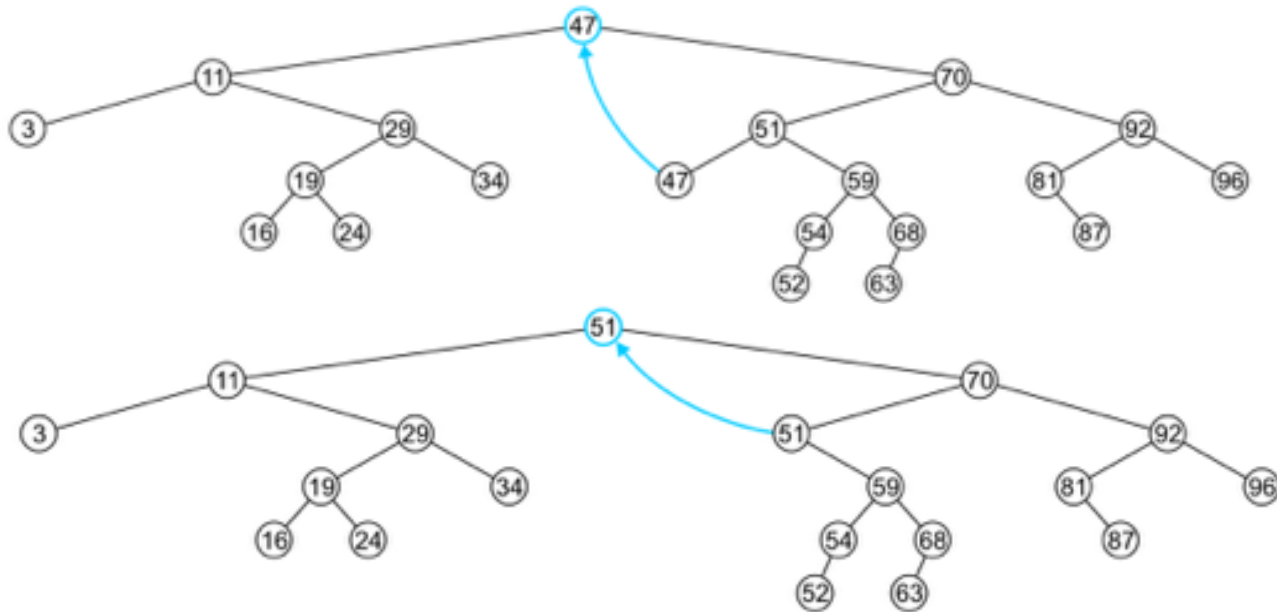
Is it possible, in removing a full node, to promote a node with two children?



# Remove

Recall that we promoted the minimum element in the right sub-tree

- If that node had a left sub-tree, that sub-tree would contain a smaller value! Always the node which we choose to promote has at most one child.



# Remove

```
public void remove( AnyType x ){
    return root = remove( x, root );
}

protected BinaryNode<AnyType> remove(Anytype x, BinaryNode<AnyType> t){
    if( t == null )
        throw new ItemNotFoundException( x.toString( ) );
    else if( x.compareTo( t.element ) < 0 )
        t.left = remove( x, t.left );
    else if( x.compareTo( t.element ) > 0 )
        t.right = remove( x, t.right );
    else if ( t.left != null && t.right != null ){ // x is the root of current tree!
        // and the root (t) has two children
        t.element = findMin(t.right).element;
        t.right = removeMin( t.right );
    }
    else // x is the root of current tree!
        // and the root (t) has at most one child
        t = (t.left != null) ? t.left : t.right;

    return t;
}
```

# removeMin ( )

```
public void removeMin( ){
    return root = removeMin( root );
}

protected BinaryNode<AnyType> removeMin(BinaryNode<AnyType> t){
    if( t == null )
        throw new ItemNotFoundException( );
    else if ( t.left != null ){
        t.left = removeMin( t.left );
        return t;
    }
    else
        return t.right;
}
```

# removeMax ( )

```
public void removeMax( ){  
    return root = remove( root );  
}  
  
protected BinaryNode<AnyType> removeMax(BinaryNode<AnyType> t){  
    if( t == null )  
        throw new ItemNotFoundException( );  
    else if ( t.right != null ){  
        t.right = removeMax( t.right );  
        return t;  
    }  
    else  
        return t.left;  
}
```

# Remove

## Example:

- In the binary search tree generated previously:
  - Erase 47
  - Erase 21
  - Erase 45
  - Erase 31
  - Erase 36



# Other Methods

- We can add more basic methods
  - `clear()`
  - `isEmpty()`
  - `size()`
  - `height()`
  - `count()`
- The implementation would similar to corresponding methods in `BinaryTree` class.

# Run Time: $O(h)$

Almost all of the relevant operations on a binary search tree are  $O(h)$

- If the tree is *close* to a linked list, the run times is  $O(n)$ 
  - Insert 1, 2, 3, 4, 5, 6, 7, ...,  $n$  into a empty binary search tree
- The best we can do is if the tree is perfect:  $O(\log(n))$
- Our goal will be to find tree structures where we can maintain a height of  $\Theta(\log(n))$

We will need to fix this issue and to make sure all the operations run in  $O(\log(n))$