

Data Structures

Binary Search Trees

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November 12, 2016

Outline

- 1 Introduction
 - Basic Concepts
- 2 BST Representation
- 3 Operations
 - Get
 - Put
 - Minimum and Maximum
 - Remove
 - Tree Delete
 - Examples of Deletion

Why Linked Representation of Binary Trees?

Complexity Of Search and Insert: They are used many operations

Data Structure	Worst		Expected	
	Search	Insert	Search	Insert
Sorted List (Array)	$O(\log n)$	$O(n)$	$O(\log n)$	$O(n)$
Sorted List (Chain)	$O(n)$	$O(n)$	$O(n)$	$O(n)$

Challenge

Efficient implementations of `get()` and `put()` and ordered iteration.

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Basic Concepts

Def

A BINARY SEARCH TREE is a binary tree in symmetric order.

Basically,

A binary tree is either:

- Empty
- A key-value pair and two binary trees.

Basic Concepts

Def

A BINARY SEARCH TREE is a binary tree in symmetric order.

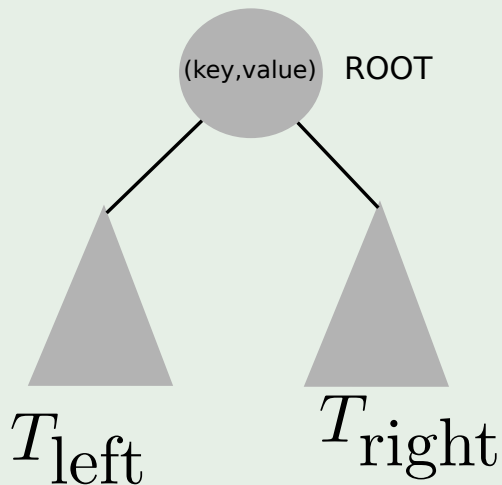
Basically

A binary tree is either:

- Empty
- A key-value pair and two binary trees.

Example

Thus



Symmetric Order

Meaning

- Every node has a key
- Every node's key
 - ▶ It is larger than all keys in its left subtree
 - ▶ It is smaller than all keys in its right subtree

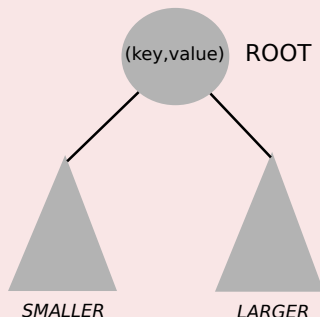
This

Symmetric Order

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Thus



BST Representation

A BST is a reference to a Node

A Node is comprised of four fields:

- A key and a value.
- A reference to the left and right subtree.

Code

Properties

- Key and Value are generic types;
- Key is Comparable

BST Representation

A BST is a reference to a Node

A Node is comprised of four fields:

- A key and a value.
- A reference to the left and right subtree.

Code

```
private class Node{  
    Key key;  
    Value val;  
    Node left , right;  
}
```

Properties

- Key and Value are generic types;
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BST Representation

A BST is a reference to a Node

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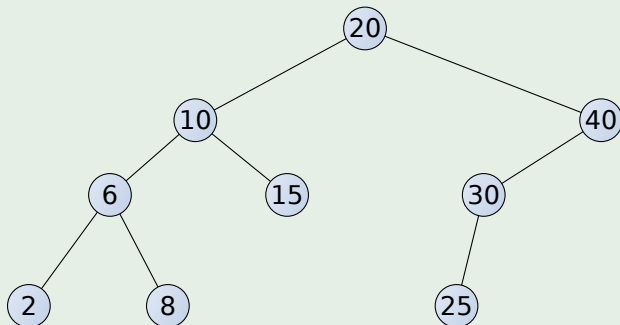
```
private class Node{  
    Key key;  
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    Node left , right;  
}
```

Properties

- Key and Value are generic types;
- Key is Comparable

Example

Only keys are shown



Code For the Class

We have this

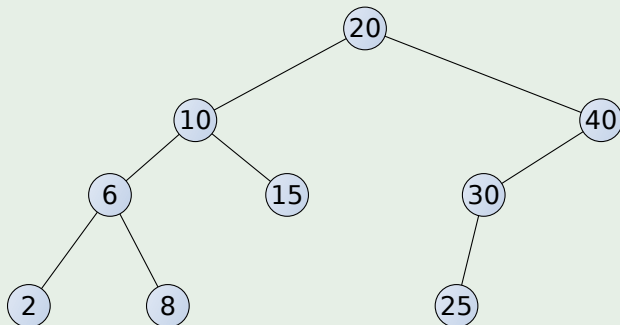
```
public class BST<Key extends Comparable<Key>, Value> {  
    private BinaryTreeNode root;  
    private class BinaryTreeNode  
    {  
        Key key;  
        Value val;  
        BinaryTreeNode left , right;  
        BinaryTreeNode(Key key, Value val)  
        {  
            this.key = key;  
            this.val = val;  
        }  
    }  
    public void put(Key key, Value val)...  
    public Val get(Key key)...  
}
```

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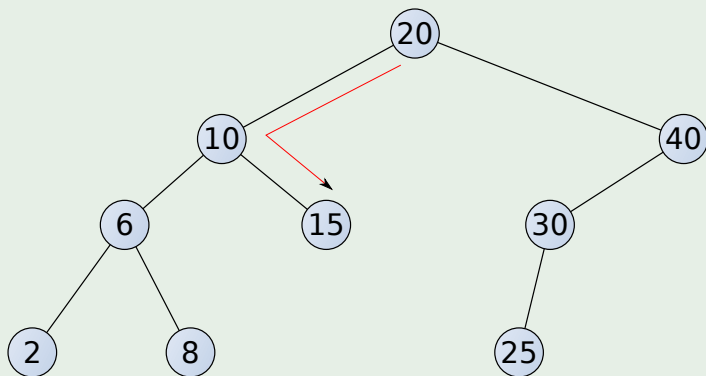
Operations: Get

We have the following



Operations: Get

Binary Search



Operations: Get

We have the following

```
public Value get(Key key)
{
    BinaryTreeNode x = root;
    while (x != null)
    {
        int cmp = key.compareTo(x.key);
        if (cmp == 0)
            return x.val;
        else if (cmp < 0) x = x.left;
        else if (cmp > 0) x = x.right;
    }
    return null;
}
```

Complexity

We have the following

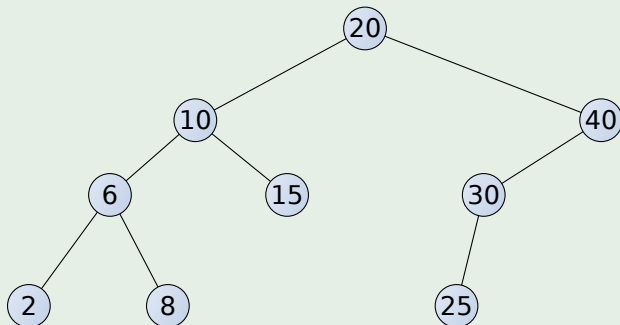
Complexity is $O(h) = O(n)$, where n is number of nodes/elements.

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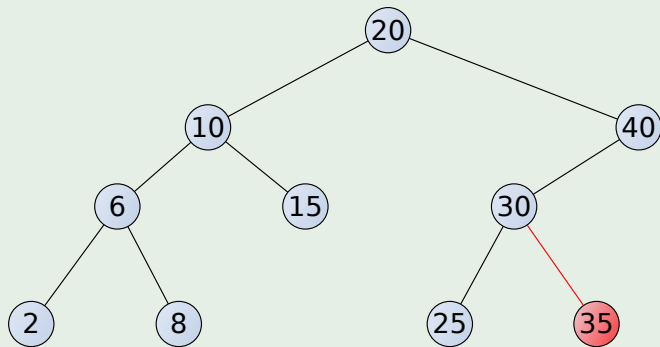
What about the operation put?

Put a pair whose key is 35



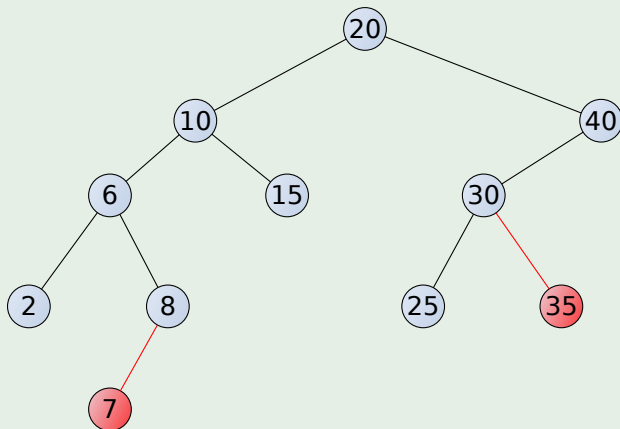
What about the operation put?

Put a pair whose key is 7



What about the operation put?

Thus...



Operations: Put

Code

```
public void put(Key key, Value val)
{
    BinaryTreeNode x = this.root;
    BinaryTreeNode temp;
    int cmp;
    while (x != null)
    {
        temp = x;
        cmp = key.compareTo(x.key);
        if (cmp == 0)
            break;
        else if (cmp < 0) x = x.left;
        else if (cmp > 0) x = x.right;
    }
    if (x == null)
        this.root = new BinaryTreeNode(Key key, Value val);
    else
        if (cmp==0)
            x.val = val;
        else if (temp.key<key)
            temp.right = new BinaryTreeNode(Key key, Value val);
        else
            temp.left = new BinaryTreeNode(Key key, Value val);
}
```

Complexity: Tree Shape

Something Notable

- Many BSTs correspond to same input data.
- Cost of search/insert is proportional to depth of node.

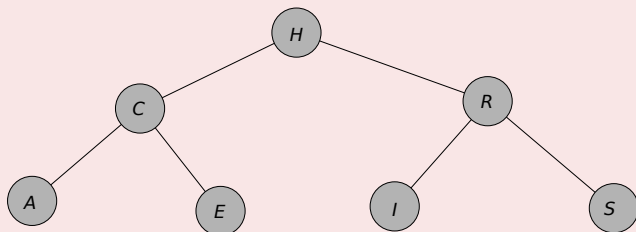
For example: Full Binary Trees

Complexity: Tree Shape

Something Notable

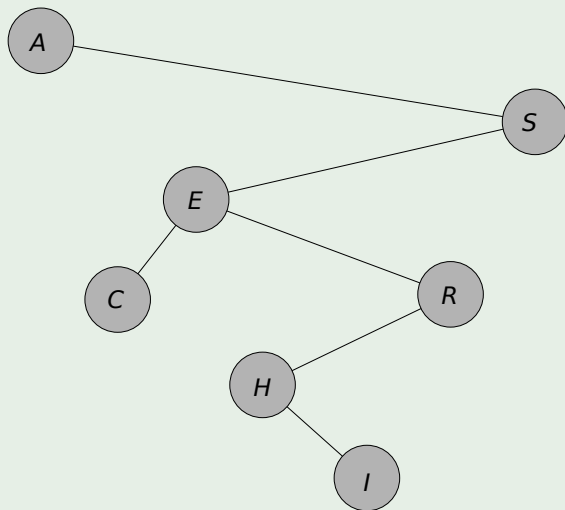
- Many BSTs correspond to same input data.
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For example: Full Binary Tree



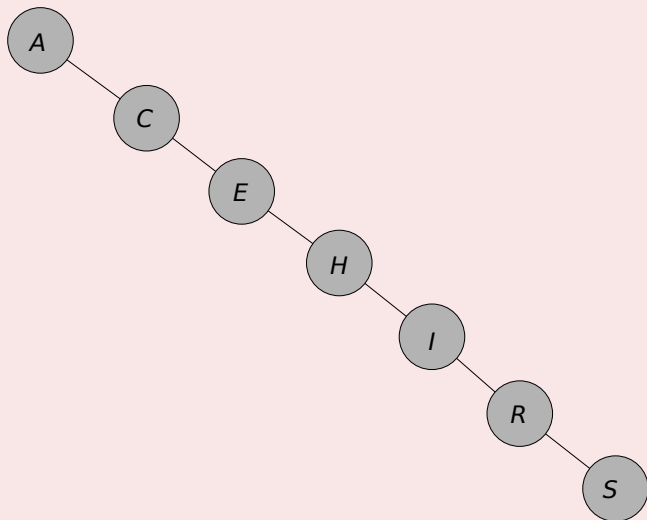
Other Examples

Example: Typical Tree



Other Examples

Example: Worst Case



Then, we want self-balancing trees

We depend on the height of the tree

Important, we want well balanced trees or near to the full tree structure... because going down the tree cost $O(h)$

We will look Next Class

- At a way to keep the binary trees well balanced...
- Examples of these techniques:
 - ▶ 2-3 trees
 - ▶ AA trees
 - ▶ **AVL trees**
 - ▶ Red-Black Trees
 - ▶ Splay Trees

Then, we want self-balancing trees

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Operations: Minimum

Minimum

Minimum(x)

- 1 while $x.left \neq \text{NIL}$
- 2 $x = x.left$
- 3 return x

Complexity:

$$O(h)$$

(1)

where h is the height of the tree \Rightarrow we look for well balanced trees.

Operations: Minimum

Minimum

Minimum(x)

- ① while $x.left \neq \text{NIL}$
- ② $x = x.left$
- ③ return x

Complexity

$$O(h) \quad (1)$$

where h is the height of the tree \Rightarrow **we look for well balanced trees.**

Operations: Maximum

Maximum

Maximum(x)

- 1 while $x.right \neq \text{NIL}$
- 2 $x = x.right$
- 3 return x

Complexity:

$$O(h)$$

(2)

where h is the height of the tree \Rightarrow we look for well balanced trees.

Operations: Maximum

Maximum

Maximum(x)

- 1 while $x.right \neq \text{NIL}$
- 2 $x = x.right$
- 3 return x

Complexity

$$O(h) \quad (2)$$

where h is the height of the tree \Rightarrow **we look for well balanced trees.**

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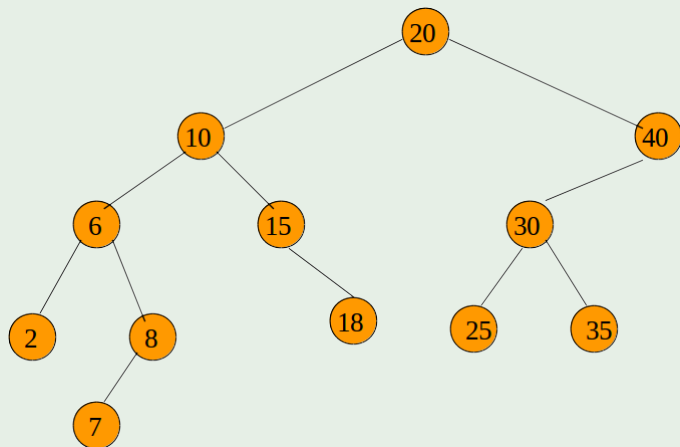
Operation: Remove

We have the following cases

- Element is in a leaf.
- Element is in a degree 1 node.
- Element is in a degree 2 node.

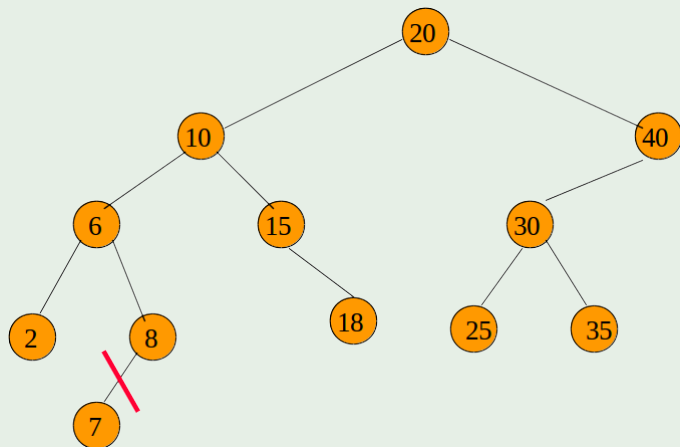
Remove from a Leaf

Remove a leaf element key = 7



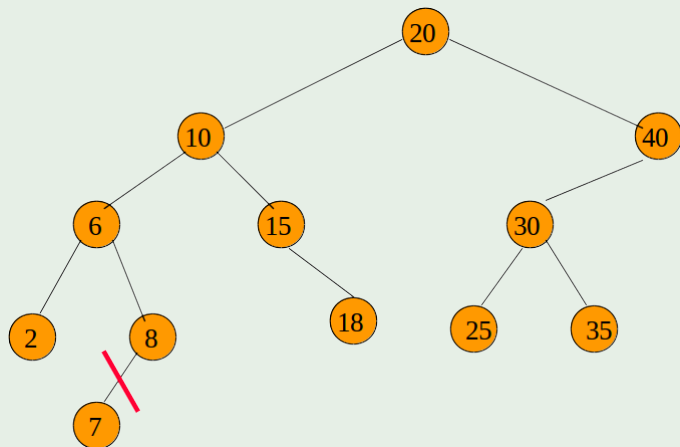
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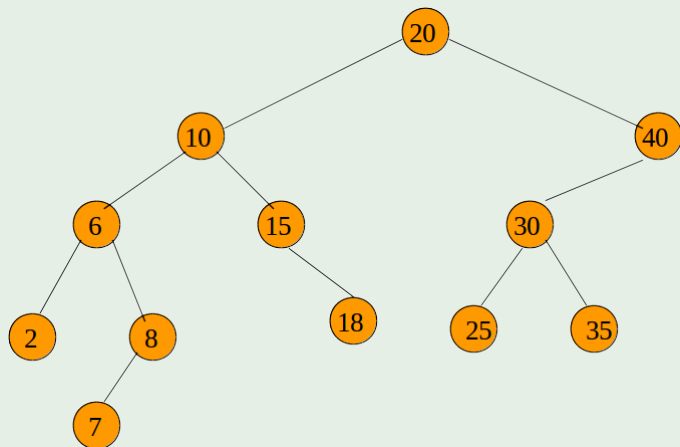
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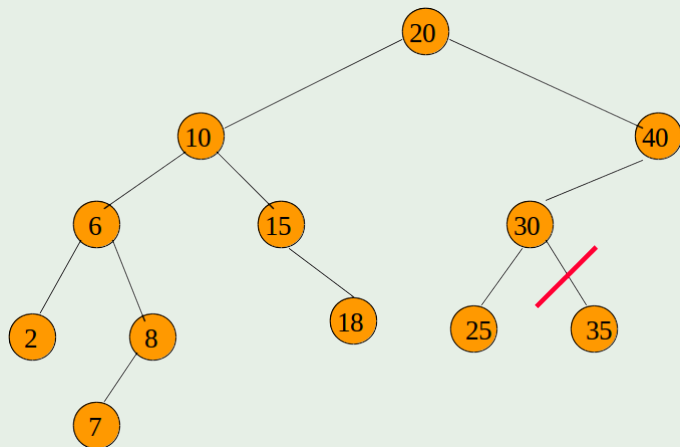
Remove from a Leaf

Remove a leaf element key = 35



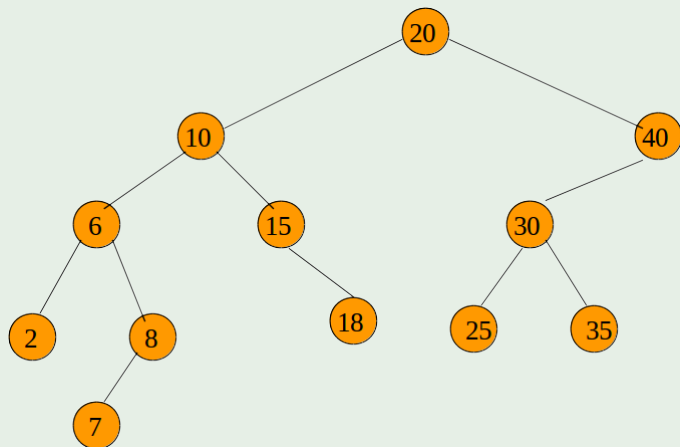
Remove from a Leaf

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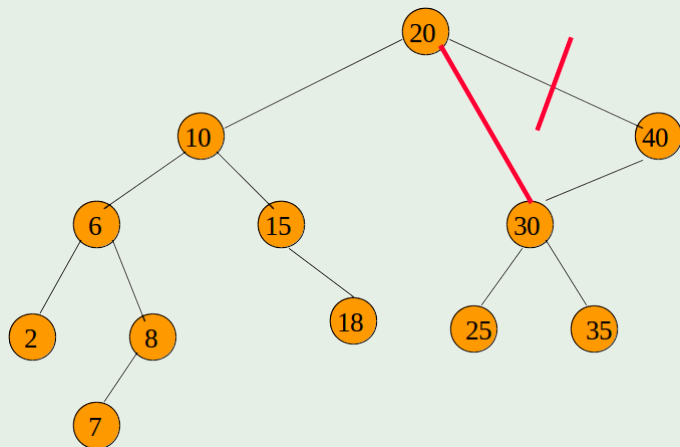
Remove From A Degree 1 Node

Remove from a degree 1 node key = 40



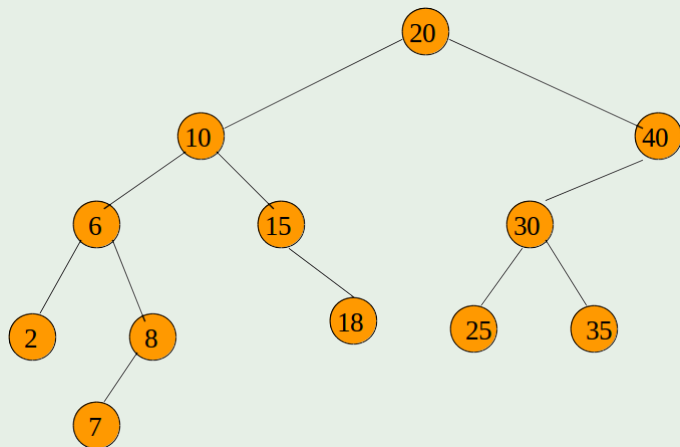
Remove From A Degree 1 Node

Remove from a degree 1 node key = 40



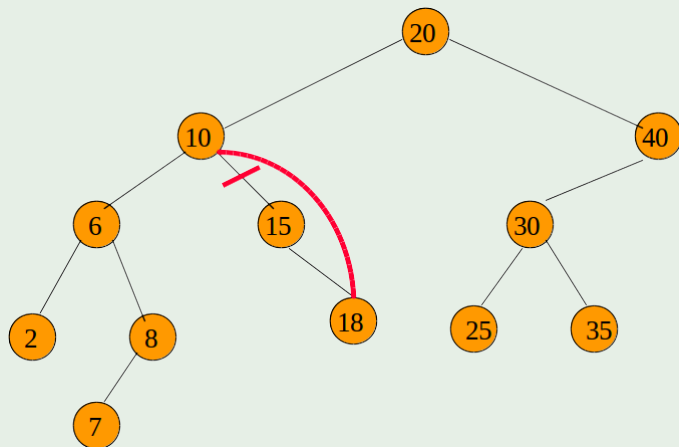
Remove From A Degree 1 Node

Remove from a degree 1 node key = 15



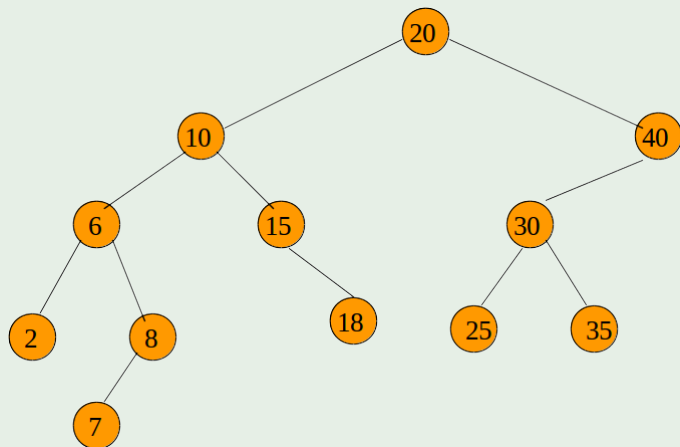
Remove From A Degree 1 Node

Remove from a degree 1 node key = 15



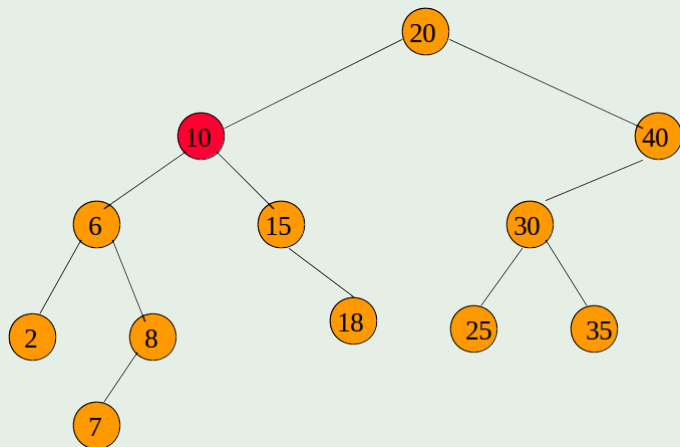
Remove From A Degree 2 Node

Remove from a degree 2 node key = 10



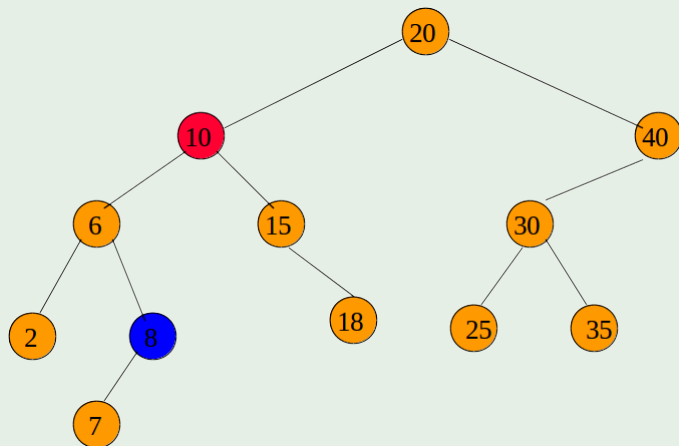
Remove From A Degree 2 Node

Remove from a degree 2 node key = 10



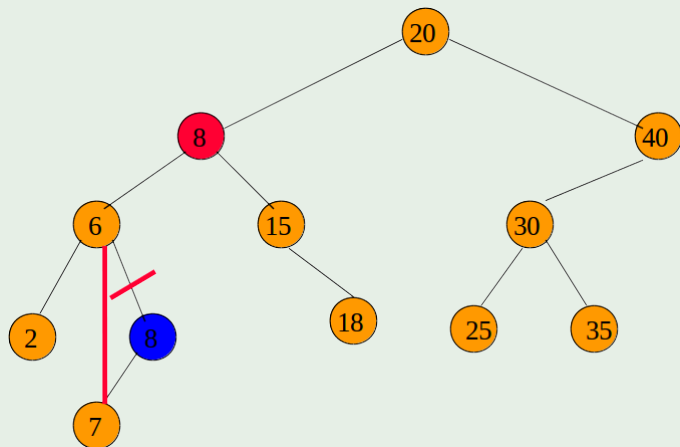
Remove From A Degree 2 Node

Replace with largest key in left subtree (or smallest in right subtree)



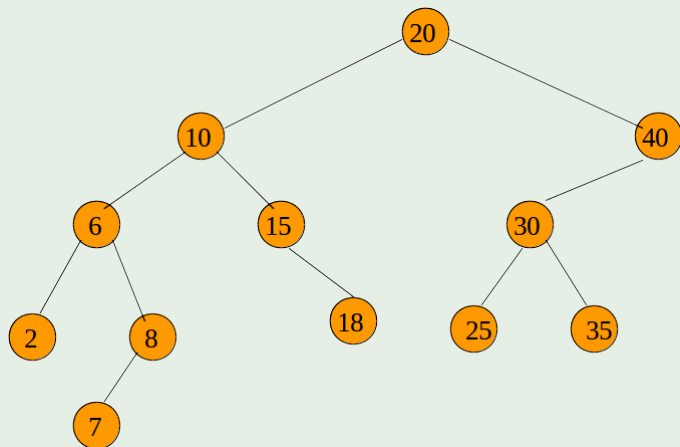
Remove From A Degree 2 Node

Largest key must be in a leaf or degree 1 node



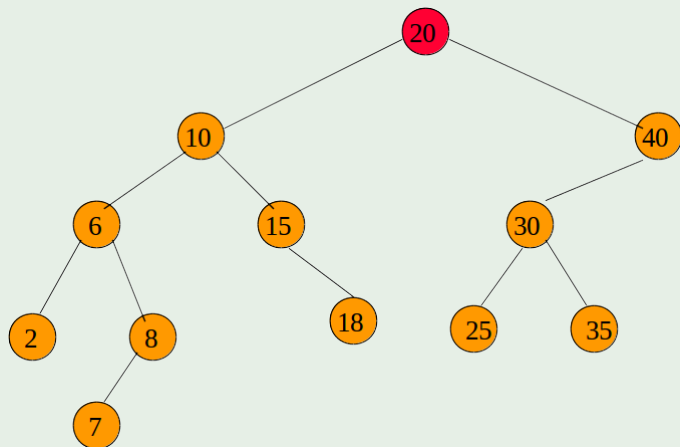
Another Example

Remove from a degree 2 node key = 20



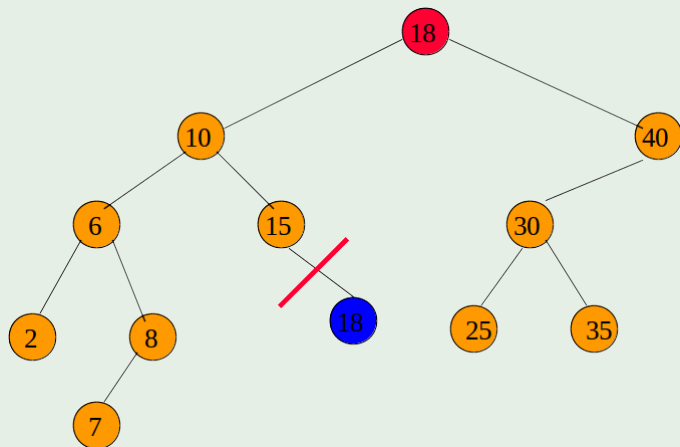
Another Example

Replace with largest in left subtree



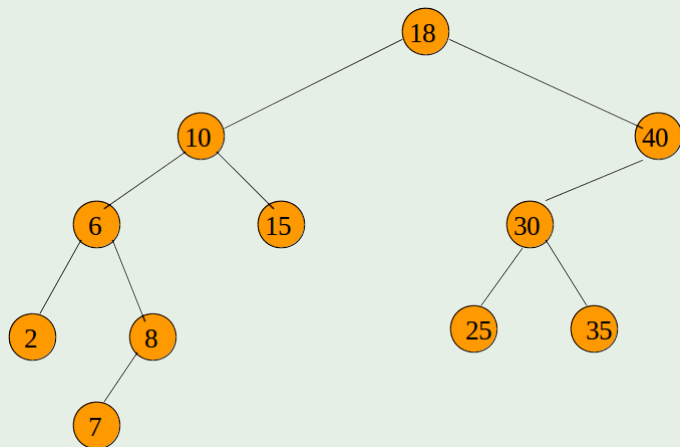
Another Example

Replace with largest in left subtree



Another Example

Replace with largest in left subtree



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TREE-DELETE

TREE-DELETE(z)

```
1 if  $z.left == NIL$ 
2   Transplant( $z, z.right$ )
3 elseif  $z.right == NIL$ 
4   Transplant( $z, z.left$ )
5 else
6    $y = \text{Tree-minimum}(z.right)$ 
7   if  $y.p \neq z$ 
8     Transplant( $y, y.right$ )
9      $y.right = z.right$ 
10     $y.right.p = y$ 
11   Transplant( $z, y$ )
12    $y.left = z.left$ 
13    $y.left.p = y$ 
```

Case 1

- Basically if the element z to be deleted has a NIL left child simply replace z with that child!!!

TREE-DELETE

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7     if  $y.p \neq z$ 
8         Transplant( $y, y.right$ )
9          $y.right = z.right$ 
10         $y.right.p = y$ 
11    Transplant( $z, y$ )
12     $y.left = z.left$ 
13     $y.left.p = y$ 
```

Case 2

- Basically if the element z to be deleted has a NIL right child simply replace z with that child!!!

TREE-DELETE

TREE-DELETE(z)

```
1 if  $z.left == NIL$ 
2     Transplant( $z, z.right$ )
3 elseif  $z.right == NIL$ 
4     Transplant( $z, z.left$ )
5 else
6      $y = \text{Tree-minimum}(z.right)$ 
7     if  $y.p \neq z$ 
8         Transplant( $y, y.right$ )
9          $y.right = z.right$ 
10         $y.right.p = y$ 
11    Transplant( $z, y$ )
12     $y.left = z.left$ 
13     $y.left.p = y$ 
```

Case 3

- The z element has not empty children you need to find the successor of it.

TREE-DELETE

TREE-DELETE(z)

- 1 if $z.left == \text{NIL}$
- 2 $\text{Transplant}(z, z.right)$
- 3 elseif $z.right == \text{NIL}$
- 4 $\text{Transplant}(z, z.left)$
- 5 else
- 6 $y = \text{Tree-minimum}(z.right)$
- 7 if $y.p \neq z$
- 8 $\text{Transplant}(y, y.right)$
- 9 $y.right = z.right$
- 10 $y.right.p = y$
- 11 $\text{Transplant}(z, y)$
- 12 $y.left = z.left$
- 13 $y.left.p = y$

Case 4

- if $y.p \neq z$ then $y.right$ takes the position of y after all $y.left == \text{NIL}$
 - ▶ take $z.right$ and make it the new $right$ of y
 - ▶ make the $(y.right == z.right).p$ equal to y

TREE-DELETE

TREE-DELETE(z)

- 1 if $z.left == \text{NIL}$
- 2 $\text{Transplant}(z, z.right)$
- 3 elseif $z.right == \text{NIL}$
- 4 $\text{Transplant}(z, z.left)$
- 5 else
- 6 $y = \text{Tree-minimum}(z.right)$
- 7 if $y.p \neq z$
- 8 $\text{Transplant}(y, y.right)$
- 9 $y.right = z.right$
- 10 $y.right.p = y$
- 11 $\text{Transplant}(z, y)$
- 12 $y.left = z.left$
- 13 $y.left.p = y$

Case 4

- put y in the position of z
- make $y.left$ equal to $z.left$
- make the $(y.left == z.left).p$ equal to y

Support Operations

Transplant(u, v)

- 1 if $u.p == \text{NIL}$
- 2 $\text{root} = v$
- 3 elseif $u == u.p.\text{left}$
- 4 $u.p.\text{left} = v$
- 5 else $u.p.\text{right} = v$
- 6 if $v \neq \text{NIL}$
- 7 $v.p = u.p$

Case 1

- If u is the root then make the root equal to v

Support Operations

Transplant(u, v)

- 1 if $u.p == \text{NIL}$
- 2 $root = v$
- 3 elseif $u == u.p.left$
- 4 $u.p.left = v$
- 5 else $u.p.right = v$
- 6 if $v \neq \text{NIL}$
- 7 $v.p = u.p$

Case 2

- if u is the left child make the left child of the parent of u equal to v

Support Operations

Transplant(u, v)

- 1 if $u.p == \text{NIL}$
- 2 $root = v$
- 3 elseif $u == u.p.left$
- 4 $u.p.left = v$
- 5 else $u.p.right = v$
- 6 if $v \neq \text{NIL}$
- 7 $v.p = u.p$

Case 3

- Similar to the second case, but for right child

Support Operations

Transplant(u, v)

- 1 if $u.p == \text{NIL}$
- 2 $root = v$
- 3 elseif $u == u.p.left$
- 4 $u.p.left = v$
- 5 else $u.p.right = v$
- 6 if $v \neq \text{NIL}$
- 7 $v.p = u.p$

Case 4

- If $v \neq \text{NIL}$ then make the parent of v the parent of u

Complexity

Height of the BT

$$O(\textit{height})$$

Outline

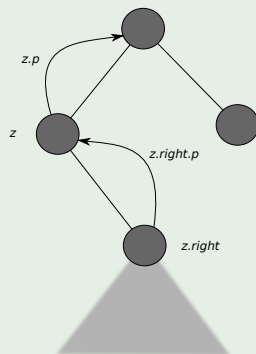
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Example: Deletion in BST

Case $z.left == NIL$

- if $z.left == NIL$
- $\text{Transplant}(T, z, z.right) \dots$

CASE $z.left == NIL$

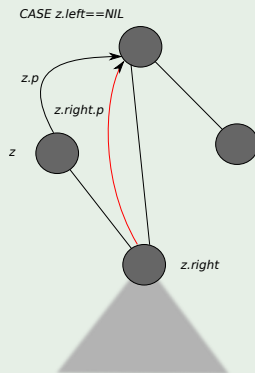


Example: Deletion in BST

Case $z.left == NIL$

Transplant($T, z, z.right$)

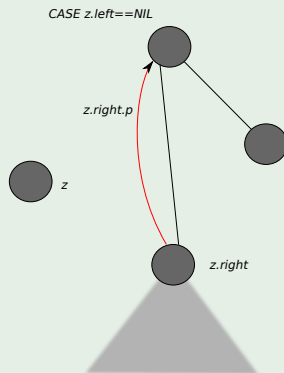
- elseif $z == z.p.left$
- $z.p.left = z.right$
- if $z.right \neq NIL$
- $z.right.p = z.p$



Example: Deletion in BST

Case $z.left == NIL$

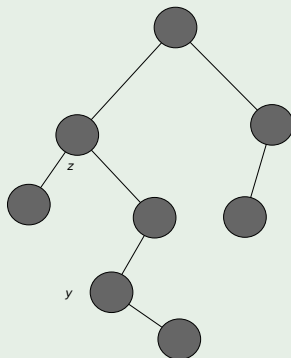
Remove the node z once
you get out of the procedure



Another Example: Deletion in BST

Case $z.left \neq NIL$ and $z.right \neq NIL$

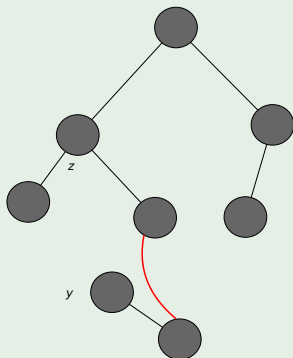
- $y = \text{Tree-minimum}(z.right)$



Another Example: Deletion in BST

Case $z.left \neq NIL$ and $z.right \neq NIL$

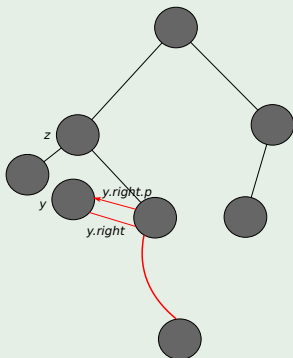
- if $y.p \neq z$
- $\text{Transplant}(T, y, y.right)$



Another Example: Deletion in BST

Case $z.left \neq NIL$ and $z.right \neq NIL$

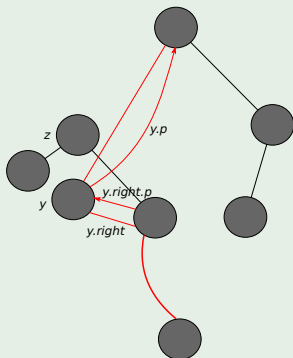
- $y.right = z.right$
- $y.right.p = y$



Another Example: Deletion in BST

Case $z.left \neq NIL$ and $z.right \neq NIL$

- $Transplant(T, z, y)$
- $y.left = z.left$
- $y.left.p = y$



Another Example: Deletion in BST

Case $z.left \neq NIL$ and $z.right \neq NIL$

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