

AST20105 Data Structures & Algorithms

CHAPTER 6 – TREES I

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Before Start

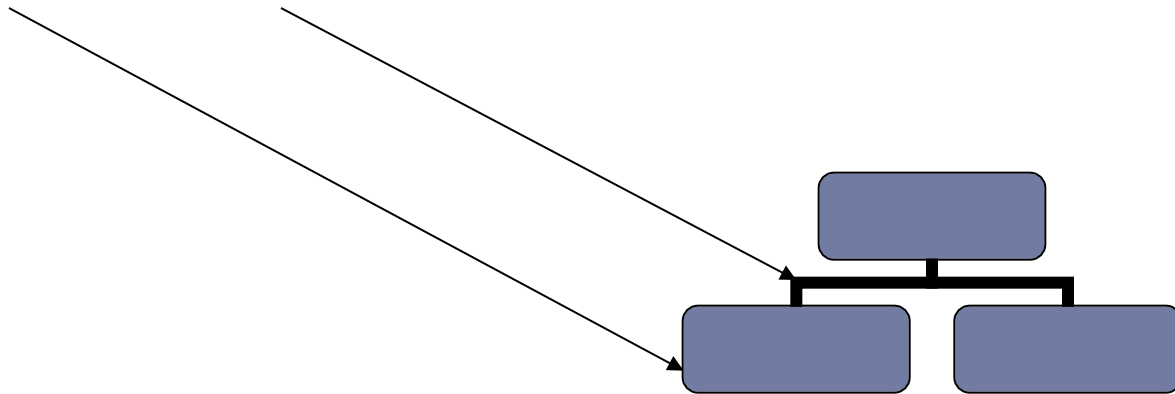
- ▶ Linked lists usually provide **greater flexibility than arrays**,
- ▶ but they are **linear structures** and
- ▶ it is **difficult** to use them to **organize a hierarchical** representation of objects.

Before Start

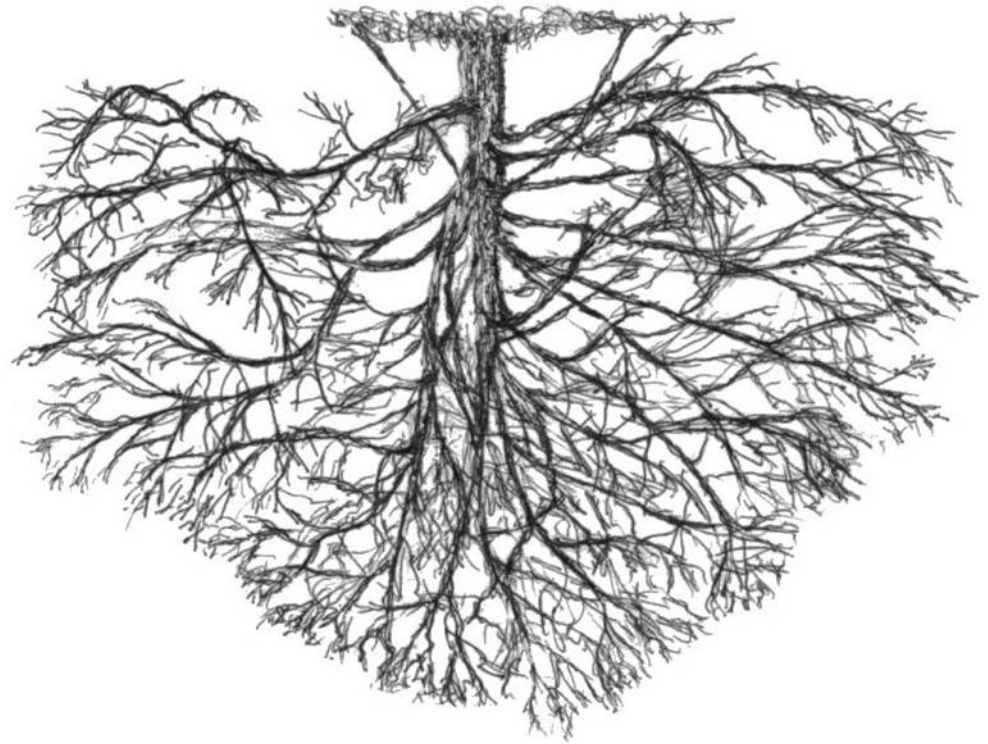
- ▶ Although **stacks and queues** reflect some hierarchy
- ▶ They are limited to **only one dimension**.

Before Start

- ▶ To overcome this limitation
- ▶ We create a new data type called a **tree** that consists of **nodes** and **arcs**.

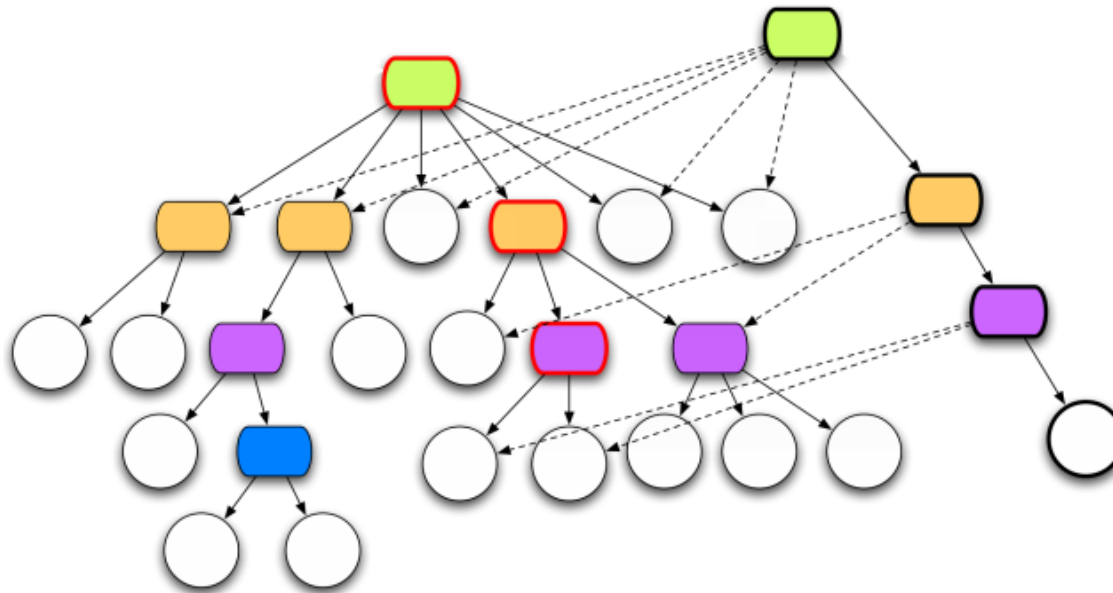


Trees



Definition

- ▶ A tree is a way to store data in **hierarchical manner**
- ▶ It contains a **collection of nodes** with **no node cycle**

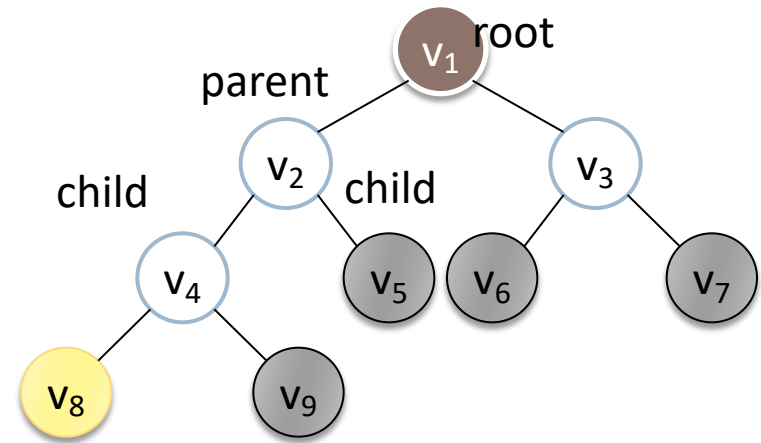


Definition

- ▶ Unlike natural trees, these trees are depicted **upside down** with
 - ▶ the root at the top and
 - ▶ the leaves (terminal nodes) at the bottom

Terminology

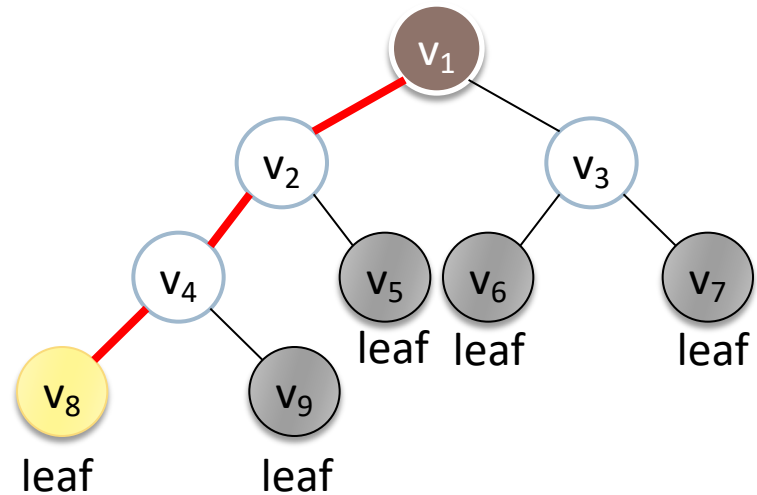
- ▶ **Node / Vertex:**
 - ▶ **Basic element** of a tree that used to store data and pointer(s) to other nodes / vertices
- ▶ **Root:**
 - ▶ The **top node / starting node** of the tree
- ▶ **Parent and child:**
 - ▶ **Every node** except the root **has one parent**
 - ▶ A node can have **any number of children**
- ▶ **Sibling:**
 - ▶ Nodes with **same parent**



- Root: v_1
- Parent and child: v_2 is the parent and v_4 and v_5 are the children
- Sibling: v_2 and v_3 are sibling, v_4 and v_5 are sibling, v_6 and v_7 are sibling, v_8 and v_9 are sibling

Terminology

- ▶ Leaf:
 - ▶ Node that with **no children**
- ▶ Edge / Link:
 - ▶ A link **from parent node to a child node**
- ▶ Path:
 - ▶ **A sequence of nodes**, i.e. $v_0, v_1, v_2, \dots, v_n$, where there is an edge from one node to the next
- ▶ Length:
 - ▶ **Number of edges** on the path



- Leaf: v_5, v_6, v_7, v_8, v_9 are leaves
- Edge: All the lines are edge
- Path: (v_1, v_2, v_4, v_8) is a path from v_1 to v_8
- Length: The length of the path (v_1, v_2, v_4, v_8) is 3

Terminology

- ▶ **Level:**

- ▶ Root is level 0, the children of root is level 1, etc.

- ▶ **Node depth:**

- ▶ **Length** of the unique **path from the root to the node**

- ▶ **Tree depth:**

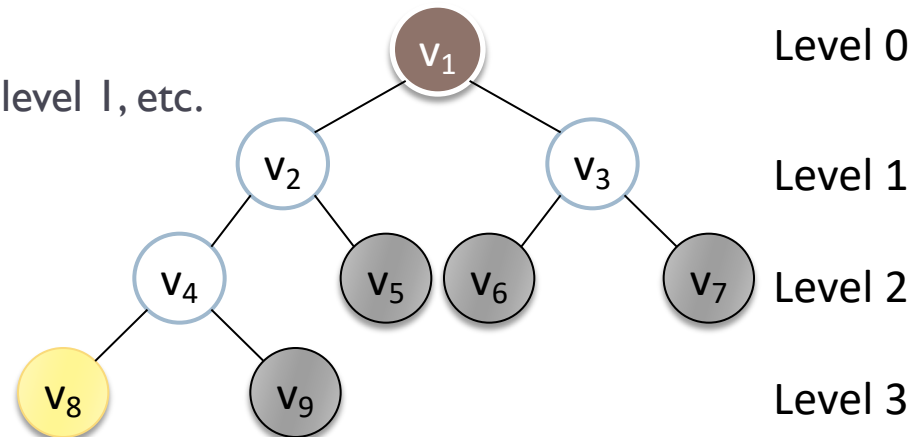
- ▶ **Depth** of the **deepest leaf**

- ▶ **Node height:**

- ▶ **Length of the longest path** from the **node to a leaf**
- ▶ All leaves are at height 0

- ▶ **Tree height:**

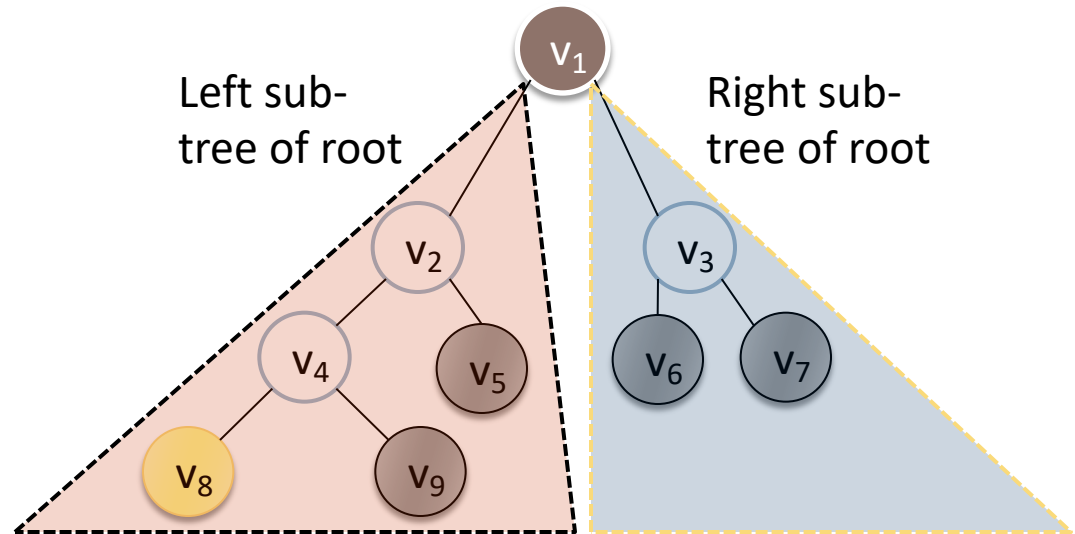
- ▶ **Height of the root**



- Level: v_1 is at level 0, v_2 & v_3 are at level 1, v_4 , v_5 , v_6 & v_7 are at level 2, v_8 & v_9 are at level 3
- Node depth of v_4 : 2 (Since $v_1 \rightarrow v_2 \rightarrow v_4$)
- Tree depth: 3
- Node height of v_2 : 2 (Since $v_2 \rightarrow v_4 \rightarrow v_9$)
- Tree height: 3 (Since $v_1 \rightarrow v_2 \rightarrow v_4 \rightarrow v_8$)

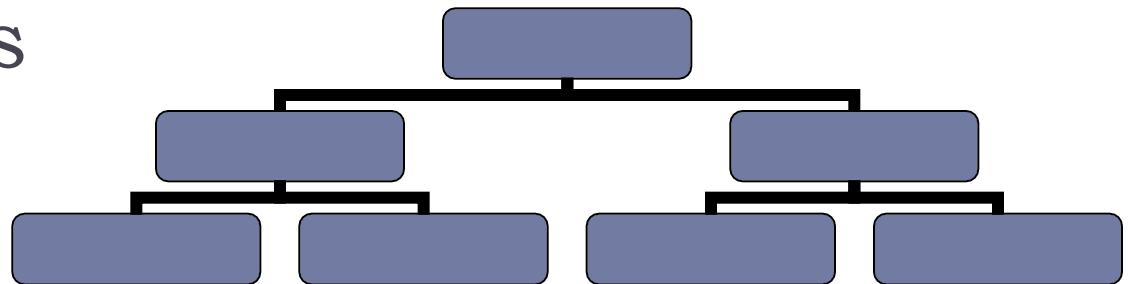
Terminology

- ▶ Ancestor:
 - ▶ The **parent, grand parent, grand grand parent, ...** of a node
- ▶ Descendant:
 - ▶ The **children, grand children, grand grand children, ...** of a node
- ▶ Left sub-tree and right sub-tree
 - ▶ **Smaller tree** consisting of a node and all its descendants



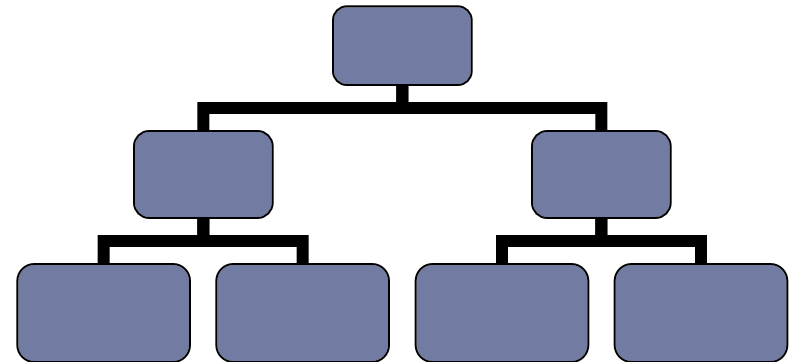
- Ancestor of v_9 : v_4, v_2, v_1
- Descendant of v_2 : v_4, v_5, v_8, v_9
- Left sub-tree of v_1 : Purple triangle
- Right sub-tree of v_1 : Blue triangle

Binary Trees



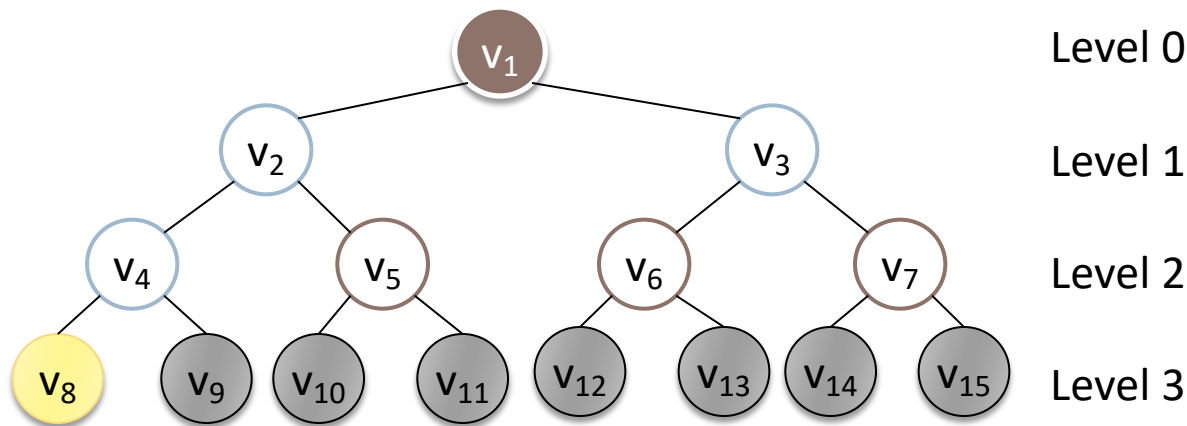
Binary Tree

- ▶ The simplest form of tree is a **binary tree**.
- ▶ A **binary tree** is a tree in which **every node in the tree** can have **AT MOST two children**
- ▶ A binary tree consists of
 - ▶ a **node** (called the **root** node) and
 - ▶ **left and right sub-trees**.
 - ▶ Both the sub-trees are themselves binary trees.



Full Binary Tree

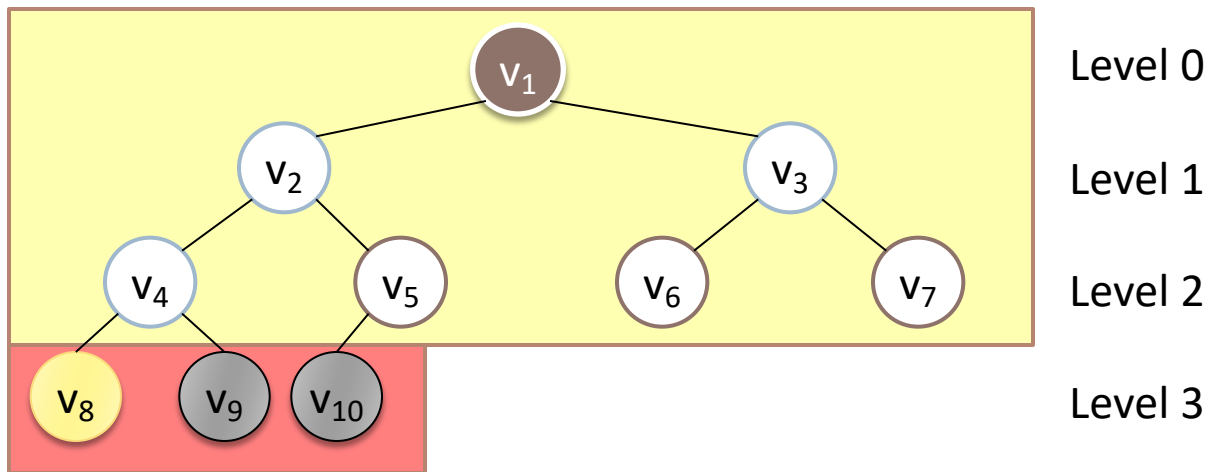
- ▶ A binary tree with 2^i nodes at level i
- ▶ Properties:
 - ▶ Total number of node in the tree = $2^{h+1} - 1$, where h is the tree height



- Total no. of nodes at level 0 = $2^0 = 1$
- Total no. of nodes at level 1 = $2^1 = 2$
- Total no. of nodes at level 2 = $2^2 = 4$
- Total no. of nodes at level 3 = $2^3 = 8$
- Total no. of nodes in the tree ($h = 3$) = $2^{(3+1)} - 1 = 15$

Complete Binary Tree

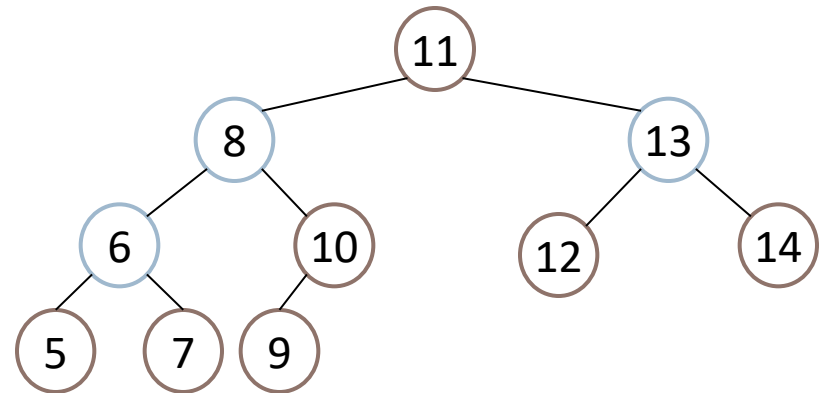
- ▶ A binary tree of height h having **complete filled to depth $h-1$** and **at depth h , filled nodes are on the left**



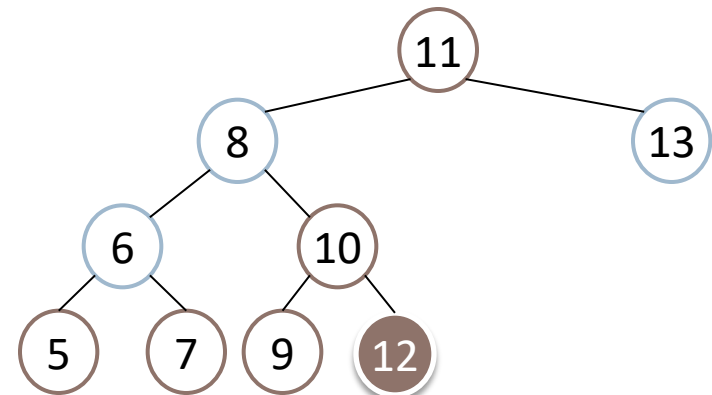
- A binary tree of height 3
- Complete filled to depth $3 - 1 = 2$
- At depth 3, filled nodes are on the left

Binary Search Tree (BST)

- ▶ Binary Search Tree is a **binary tree** that stores values / keys in a way such that **insertion, deletion and searching** could be done **efficiently**
- ▶ Properties:
 - ▶ For **every node** v , all the values in its **left sub-tree** are **SMALLER** than the value in v , and all the values in its **right sub-tree** are **LARGER** than the value in v

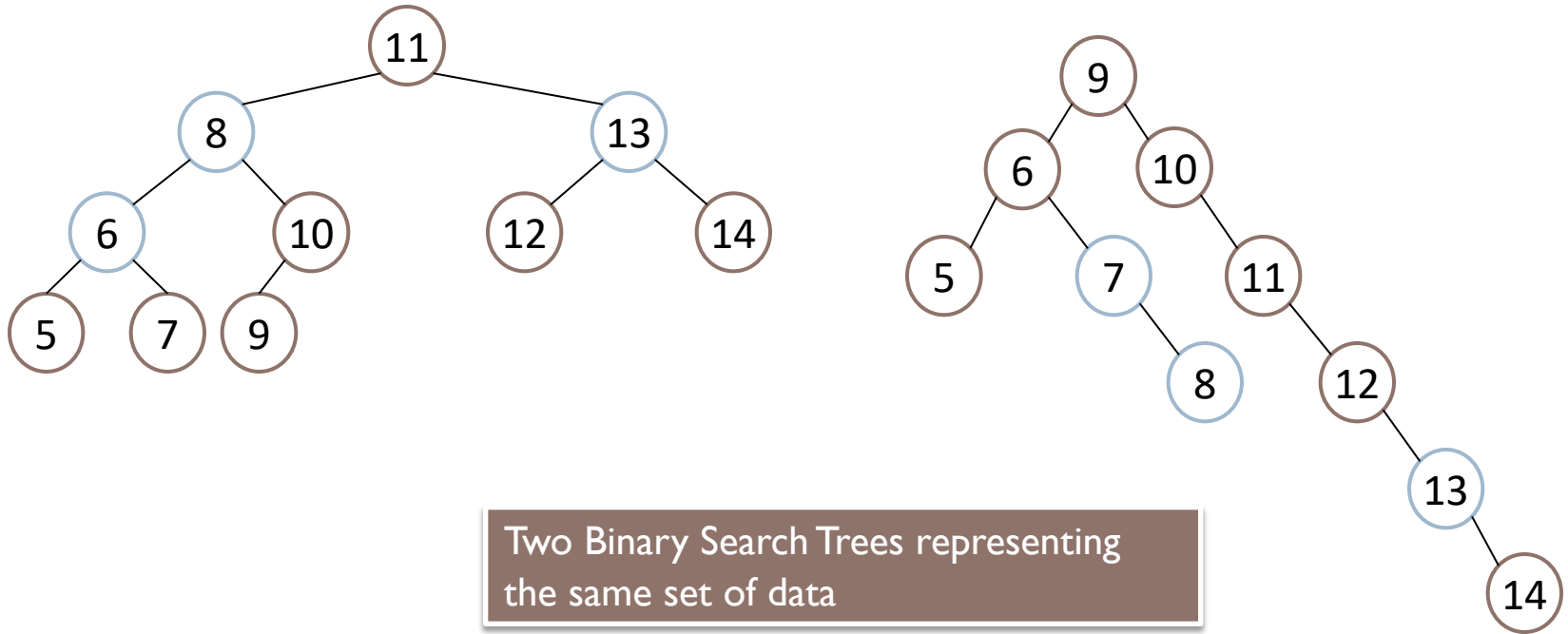


A Binary Search Tree



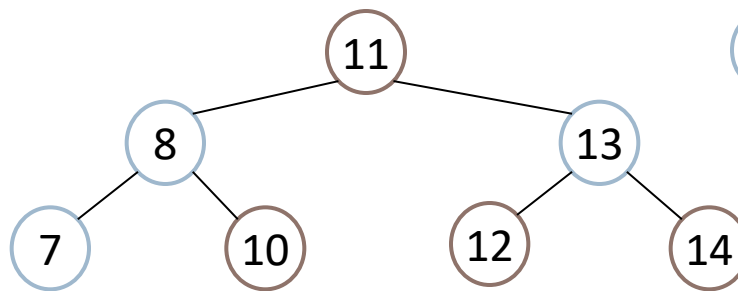
NOT a Binary Search Tree

Binary Search Tree (BST) - Example



Height of Binary Search Tree

- ▶ From the last slide, it is easy to observe that a same set of data could be stored as different Binary Search Tree
- ▶ The **height of a Binary Search Tree** could **vary depending on the order of insertion**
- ▶ Say, we got **n data** to store in a Binary Search Tree



Best Case: Balanced Tree

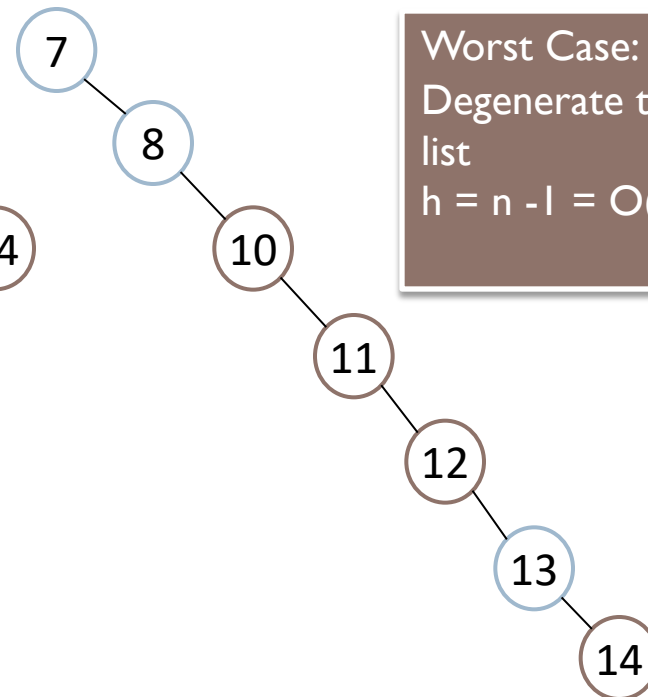
$$2^{h+1} - 1 = n$$

$$2^{h+1} = n + 1$$

$$\log_2(2^{h+1}) = \log_2(n+1)$$

$$h+1 = \log_2(n+1)$$

$$h = \log_2(n+1) - 1 = O(\log n)$$



Worst Case:
Degenerate to a linked
list
 $h = n - 1 = O(n)$

Implementing Binary Search Trees

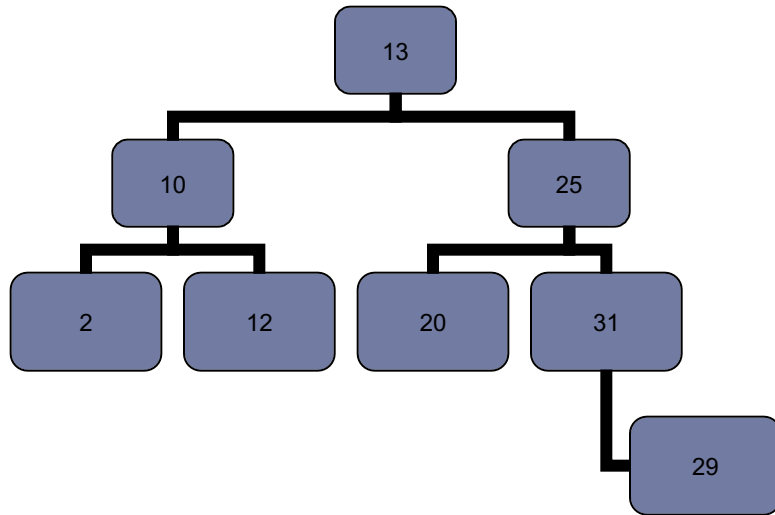
Implementing Binary Search Trees

- ▶ Binary trees can be implemented in at least two ways:
 - ▶ As **arrays** and
 - ▶ As **linked structures**.

Implementing Binary Search Trees

- ▶ To implement a tree as an array,
 - ▶ A node is declared as a structure with an **information field** and **two “pointer” fields**
 - ▶ These pointer fields contain the **indexes** of the array cells in which the left and right children are stored, if there are any.
 - ▶ The **root** is always located in the **first cell**, cell 0, and **-1** indicates a **null child**.

Implementing Binary Search Trees



Index	Info	Left	Right
0	13	4	2
1	31	6	-1
2	25	7	1
3	12	-1	-1
4	10	5	3
5	2	-1	-1
6	29	-1	-1
7	20	-1	-1

Implementing Binary Search Trees

- ▶ However, this implementation may be **inconvenient**, even if the array is flexible
- ▶ Locations of children must be known to **insert a new node**, and these locations may need to be located sequentially.

Implementing Binary Search Trees

- ▶ However, this implementation may be **inconvenient**, even if the array is flexible
- ▶ After **deleting a node** from the tree, a hole in the array would have to be eliminated.
 - ▶ This can be done either by using a special marker for an unused cell, which may lead to populating the array with many unused cells, or
 - ▶ By moving elements by one position, which also requires updating references to the elements that have been moved.

Implementing Binary Search Trees

- ▶ A Binary Search Tree is constructed using nodes, similar to linked list
- ▶ A Binary Search Tree node / vertex should contain
 - ▶ **Data**
 - ▶ **Two pointers** (left pointer to the left sub-tree and right pointer to the right sub-tree)
- ▶ A **leaf node** has both **left and right pointers point to NULL**

```
class BSTNode
{
    public:
        BSTNode(const int value)
        {
            left = right = NULL;
            data = value;
        }

        int data;
        BSTNode* left;
        BSTNode* right;
};
```

Binary Search Tree Operations

- ▶ **BSTNode* insertNode(BSTNode*& n, const int v)**
 - ▶ Insert a node to the Binary Search Tree
- ▶ **BSTNode* deleteNode(BSTNode*& n, const int v)**
 - ▶ Delete a node from the Binary Search Tree
- ▶ **BSTNode* findNode(BSTNode* n, const int v)**
 - ▶ Find the node with value v
- ▶ **BSTNode* findMin(BSTNode* n)**
 - ▶ Find the node with the smallest key
- ▶ **BSTNode* findMax(BSTNode* n)**
 - ▶ Find the node with the largest key
- ▶ **void preOrder(BSTNode* n)**
 - ▶ Print all the keys using pre-order traversal
- ▶ **void inOrder(BSTNode* n)**
 - ▶ Print all the keys using in-order traversal
- ▶ **void postOrder(BSTNode* n)**
 - ▶ Print all the keys using post-order traversal

Implementing Binary Search Trees

BSTree.h

```
class BSTree
{
    public:
        BSTNode* root;
        BSTNode* temp;

        BSTree();
        ~BSTree();
        BSTNode* insertNode(BSTNode*& n, const int v);
        BSTNode* deleteNode(BSTNode*& n, const int v);
        BSTNode* findNode(BSTNode* n, const int v);
        BSTNode* findMin(BSTNode* n);
        BSTNode* findMax(BSTNode* n);
        void preOrder(BSTNode* n);
        void inOrder(BSTNode* n);
        void postOrder(BSTNode* n);
};
```

```
BSTree::BSTree()
{
    root = NULL;
    temp = NULL;
}
```

```
BSTree::~~BSTree()
{
}
```

BSTree.cpp

Searching a Binary Search Tree

Searching in BST

- ▶ Search algorithm **traverses** the tree "in-depth", choosing appropriate way to go, following binary search tree property and **compares value** of each visited node with the one, we are looking for.
- ▶ Algorithm **stops** in two cases:
 - ▶ a node with necessary value is **found**;
 - ▶ algorithm has **no way to go**.

Searching in BST

- ▶ Search algorithm in detail
 - ▶ Search algorithm utilizes **recursion**.
 - ▶ Starting from the **root**,

Searching in BST

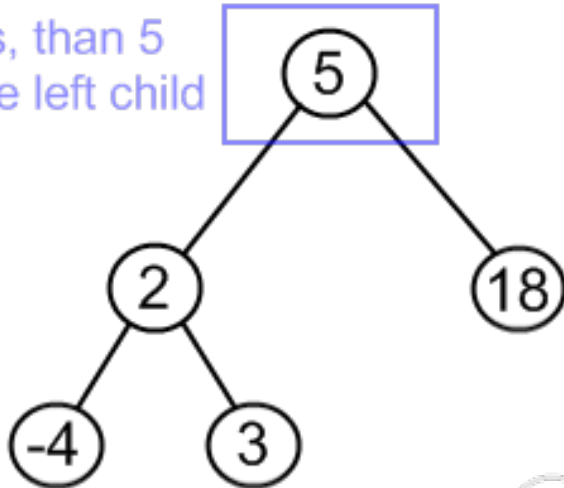
▶ Search algorithm in detail

1. check, whether value in current node and searched value are equal.
If so, **value is found**. Otherwise,
 2. if searched value is less than the node's value:
 - ▶ if current node has no left child,
searched value doesn't exist in the BST;
 - ▶ otherwise, handle the left child with the same algorithm.
 3. if searched value is greater than the node's value:
 - if current node has no right child,
searched value doesn't exist in the BST;
 - otherwise, handle the right child with the same algorithm.
- Running time: $O(h)$

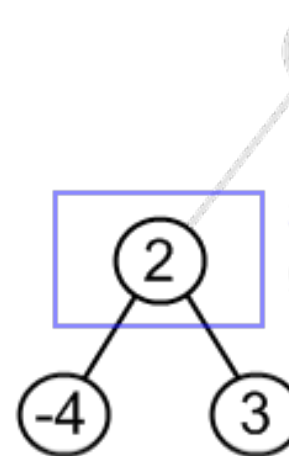
Searching in BST

► Search for 3 in the tree

3 is less, than 5
go to the left child



3 is more, than 2
go to the right child



searched value
has been found



Find Min / Max

▶ findMin

▶ Algorithm:

- ▶ Start at the root and keep going left if there is a left child. The ending point is the smallest element

- ▶ Running time: $O(h)$

▶ findMax

▶ Algorithm:

- ▶ Start at the root and keep going right if there is a right child. The ending point is the largest element

- ▶ Running time: $O(h)$

```

BSTNode* BSTree::findNode(BSTNode* n, const int v) {
    if(n == NULL)
        return NULL;
    if(v < n->data)
        return findNode(n->left, v);
    else if(v > n->data)
        return findNode(n->right, v);
    else
        return n;
}

BSTNode* BSTree::findMin(BSTNode* n) {
    if(n == NULL)
        return NULL;
    else if(n->left == NULL)
        return n;
    else
        return findMin(n->left);
}

BSTNode* BSTree::findMax(BSTNode* n) {
    if(n == NULL)
        return NULL;
    else if(n->right == NULL)
        return n;
    else
        return findMax(n->right);
}

```

Tree Traversal

Tree Traversal

- ▶ Tree traversal is the process of **visiting each node** in the tree exactly one time.
- ▶ Traversal may be interpreted as putting all nodes on **one line** or **linearizing** a tree.

Tree Traversal

- ▶ The definition of traversal specifies only **one condition**
- ▶ Visiting each node only one time
- ▶ But it **does not specify the order** in which the nodes are visited

Tree Traversal

- ▶ Hence, there are as **many tree traversals** as there are permutations of nodes
- ▶ For a tree with n nodes, there are **$n!$ different traversals**.
- ▶ Most of them, however, are rather chaotic and do not indicate much regularity so that implementing such traversals **lacks generality**.

Tree Traversal

- ▶ In the face of such an abundance of traversals and the apparent **uselessness of most of them**
- ▶ We would like to **restrict our attention to two classes** only, namely
 - ▶ **Breadth-first traversals** and
 - ▶ **Depth-first traversals**

Breadth-first Traversal

- ▶ Breadth-first traversal is visiting each node
 - ▶ starting from the **highest** (or lowest) level and
 - ▶ moving **down** (or up) level by level,
 - ▶ visiting nodes on each level from **left to right** (or from right to left).

Breadth-first Traversal

```
void BSTree::BreadthFirstTraversal(BSTNode *root) {
    if (root == NULL)
        return;

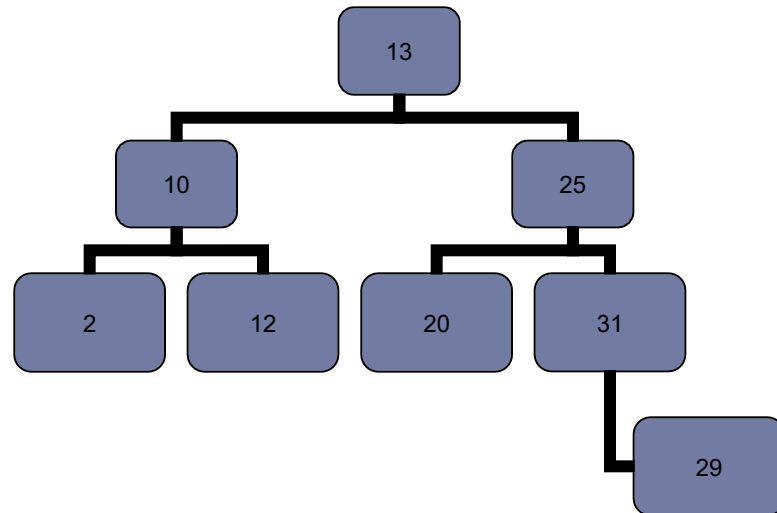
    deque <BSTNode *> queue;
    queue.push_back(root); //push element at the back of the queue

    while (!queue.empty()) {
        BSTNode *p = queue.front();
        cout << p->data << "\t";
        queue.pop_front();

        if (p->left != NULL)
            queue.push_back(p->left);
        if (p->right != NULL)
            queue.push_back(p->right);
    }
    cout << endl;
}
```

Breadth-first Traversal

- ▶ A top-down, left-to-right breadth-first traversal of the tree results in the sequence
- ▶ 13, 10, 25, 2, 12, 20, 31, 29



Depth-first Traversal

- ▶ Depth-first traversal
 - ▶ proceeds **as far as possible to the left** (or right),
 - ▶ then backs up until the **first crossroad**, goes **one step to the right** (or left), and
 - ▶ **again** as far as possible to the left (or right).
 - ▶ We **repeat** this process until all nodes are visited.

Depth-first Traversal

- ▶ This definition, however, does not clearly specify exactly **when nodes are visited**:
 - ▶ Before proceeding down the tree or after backing up?
 - ▶ There are **some variations** of the depth-first traversal.

Depth-first Traversal

- ▶ There are three tasks of interest in this type of traversal:
 - ▶ V – **visiting** a node
 - ▶ L – traversing the **left** subtree
 - ▶ R – traversing the **right** subtree

Depth-first Traversal

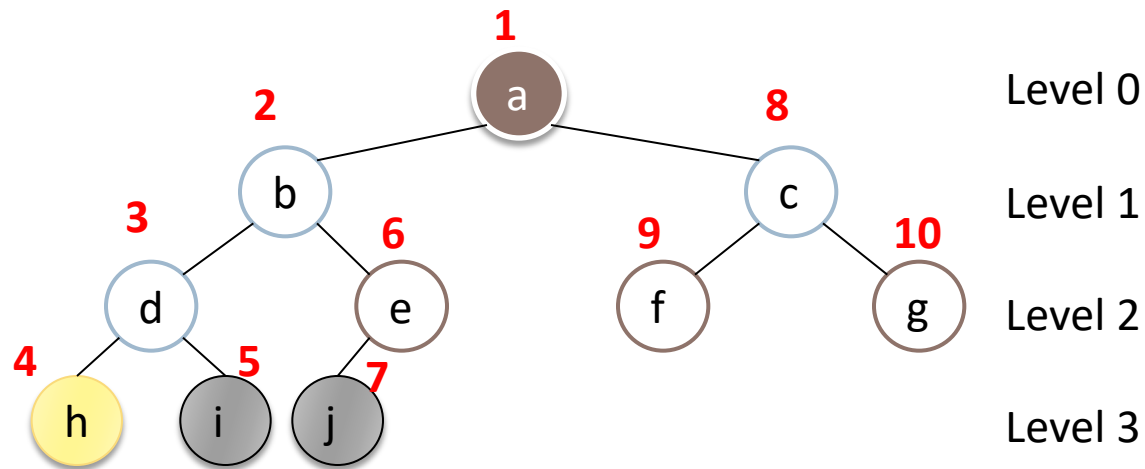
- ▶ An orderly traversal takes place if these tasks are performed in the same order for each node.
- ▶ The three tasks can themselves be ordered in $3! = 6$ ways, so there are **six possible ordered depth-first traversals**:
 - ▶ VLR VRL
 - ▶ LVR RVL
 - ▶ LRV RLV

Depth-first Traversal

- ▶ It can be reduced to **three traversals** where the move is always from **left to right** and attention is focused on the following three traversals:
 - ▶ VLR – preorder tree traversal
 - ▶ LVR – inorder tree traversal
 - ▶ LRV – postorder tree traversal

Pre-order Traversal

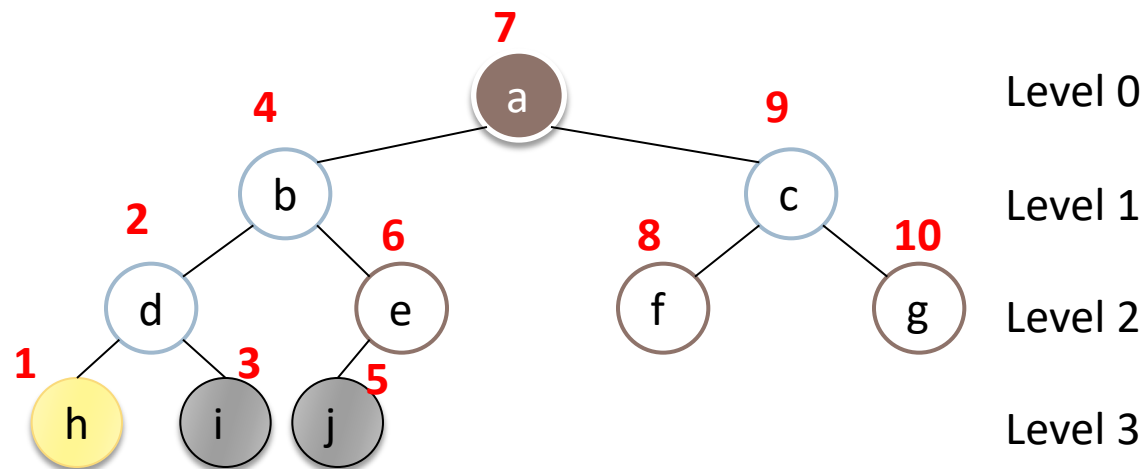
- ▶ Visit the node
- ▶ Recursively visit all nodes in the left sub-tree
- ▶ Recursively visit all nodes in the right sub-tree



Order to visit: a, b, d, h, i, e, j, c, f, g

In-order Traversal

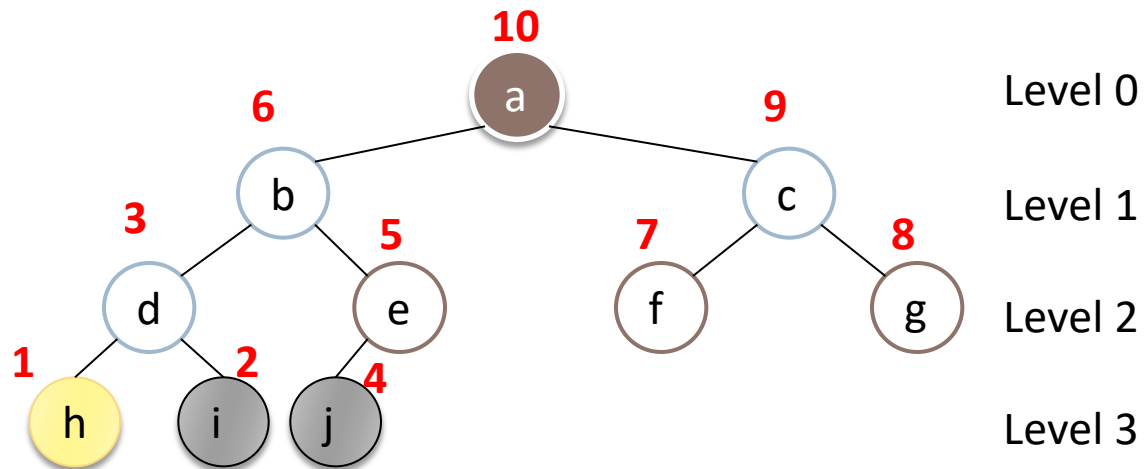
- ▶ Recursively visit all nodes in the left sub-tree
- ▶ Visit the node
- ▶ Recursively visit all nodes in the right sub-tree



Order to visit: h, d, i, b, j, e, a, f, c, g

Post-order Traversal

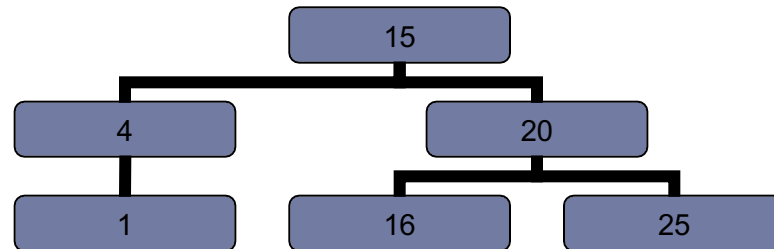
- ▶ Recursively visit all nodes in the left sub-tree
- ▶ Recursively visit all nodes in the right sub-tree
- ▶ Visit the node



Order to visit: h, i, d, j, e, b, f, g, c, a

Depth-first Traversal

- ▶ **Exercise:**
 - ▶ Pre-order:
 - ▶ In-order:
 - ▶ Post-order:



```

void BSTree::preOrder(BSTNode* n) {
    if(n != NULL) {
        cout << n->data << "\\t";
        preOrder(n->left);
        preOrder(n->right);
    }
}

void BSTree::inOrder(BSTNode* n) {
    if(n != NULL) {
        inOrder(n->left);
        cout << n->data << "\\t";
        inOrder(n->right);
    }
}

void BSTree::postOrder(BSTNode* n) {
    if(n != NULL) {
        postOrder(n->left);
        postOrder(n->right);
        cout << n->data << "\\t";
    }
}

```

Insertion

Insertion

- ▶ Adding a value to BST can be divided into two stages:
 - ▶ **search for a place** to put a new element;
 - ▶ **insert** the new element to this place.

Insertion

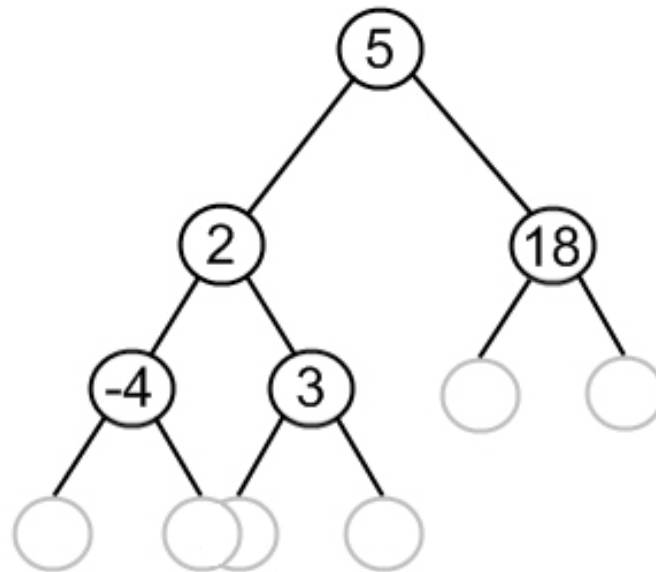
- ▶ **Search for a place**
- ▶ At this stage an algorithm should follow binary search tree property.
 - ▶ If a new value is less than the current node's value, go to the left subtree, else go to the right subtree.
 - ▶ Following this simple rule, the algorithm reaches a node, which has **no left or right subtree**.
 - ▶ By the moment a **place for insertion is found**, we can say for sure, that a new value has **no duplicate** in the tree.
 - ▶ Initially, a new node has no children, so it is a leaf.

Insertion

- ▶ **Search for a place**

- ▶ Let us see it at the picture.

Gray circles indicate possible places for a new node



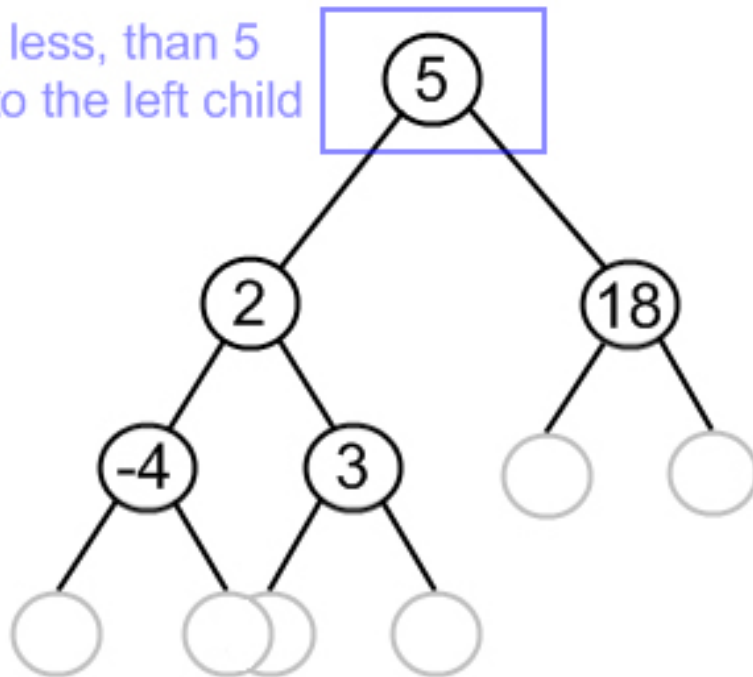
Insertion

- ▶ Let's go down to algorithm itself. Starting from the root,
 1. **check**, whether value in current node and a new value are equal. If so, **duplicate** is found. Otherwise,
 2. if a new value is **less** than the node's value:
 - ▶ if a current node has **no left child**, place for **insertion** has been found;
 - ▶ otherwise, **handle the left child** with the same algorithm.
 3. if a new value is **greater** than the node's value:
 - ▶ if a current node has **no right child**, place for **insertion** has been found;
 - ▶ otherwise, **handle the right child** with the same algorithm.
- ▶ Running time: $O(h)$

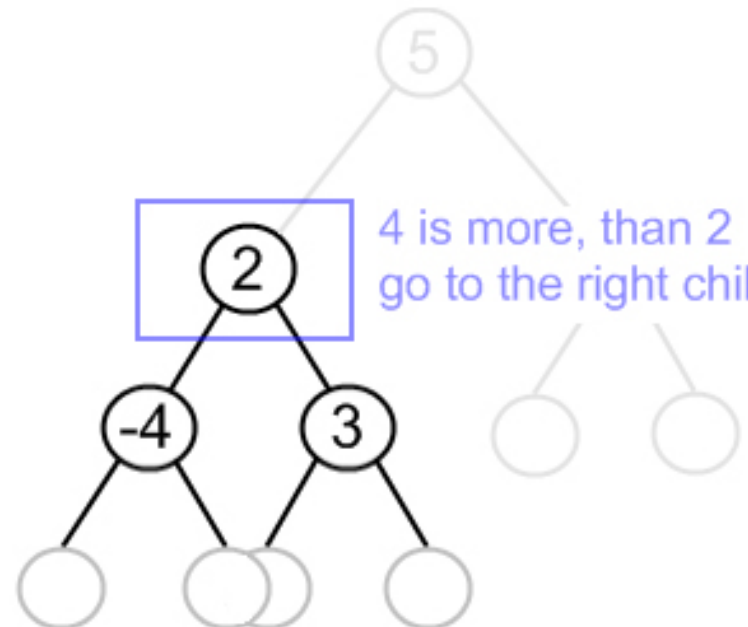
Insertion

- Insert 4 to the tree, shown above

4 is less, than 5
go to the left child

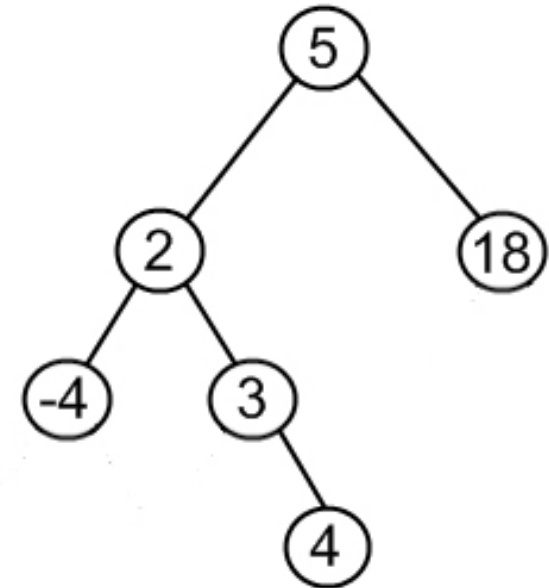
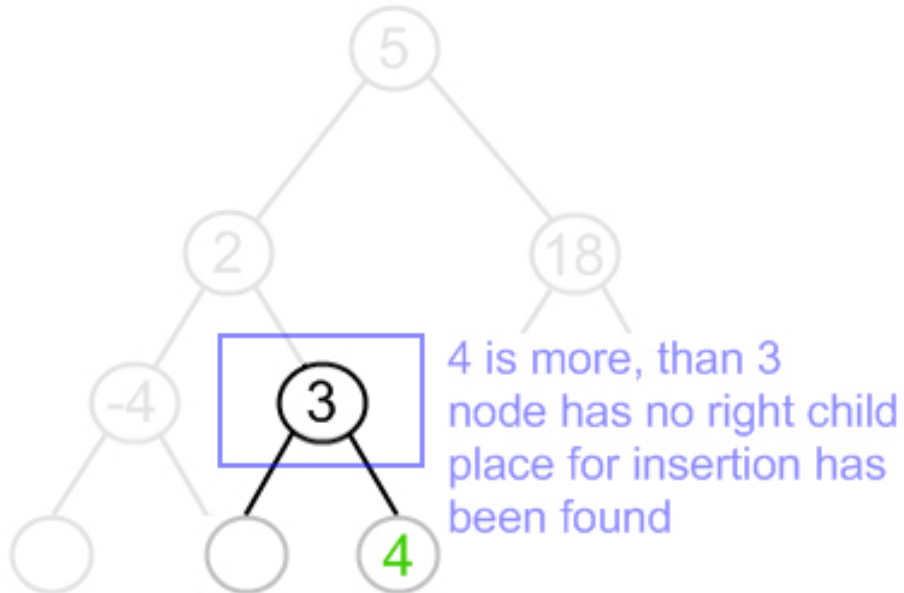


4 is more, than 2
go to the right child



Insertion

- Insert 4 to the tree, shown above



Insertion

```
BSTNode* BSTree::insertNode(BSTNode*& n, const int v)
{
    if (n == NULL)
    {
        BSTNode* item = new BSTNode(v);
        n = item;
    }
    else
    {
        if (v < n->data)
            n->left = insertNode(n->left, v);
        else if (v > n->data)
            n->right = insertNode(n->right, v);
    }
    return n;
}
```

BSTree.cpp

Deletion

Deletion

- ▶ Remove operation on binary search tree is more complicated, than add and search.
- ▶ Basically, it can be divided into two stages:
 - ▶ **search** for a node to remove;
 - ▶ if the node is found, run **remove** algorithm.

Deletion

- ▶ **Remove algorithm in detail**
 - ▶ First stage is identical to algorithm for **lookup**, except we should **track the parent** of the current node.
 - ▶ Second part is more tricky.
There are **three cases**, which are described below.

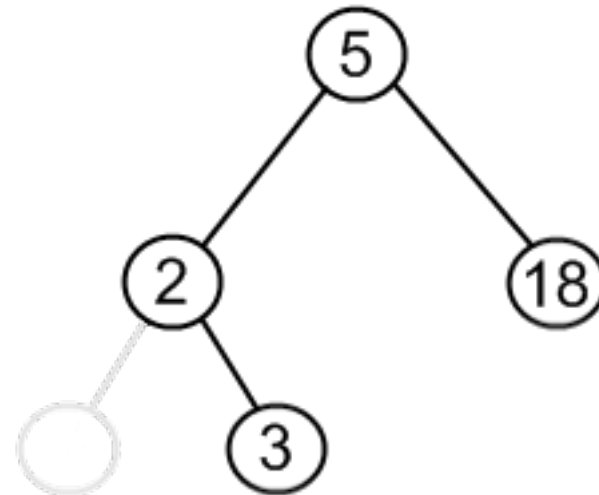
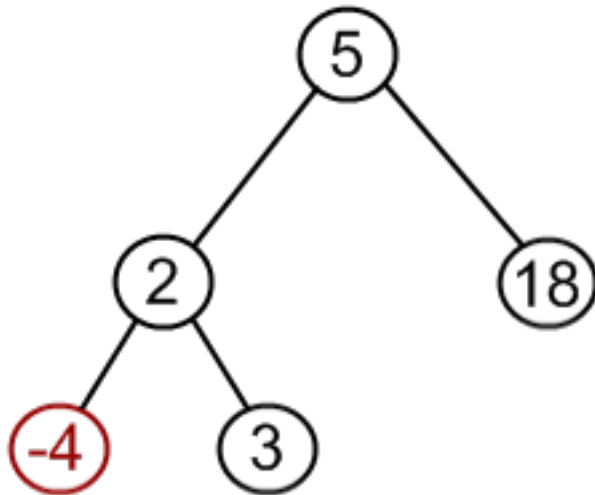
Deletion

- ▶ Case I: Node to be removed has **no children**.
 - ▶ This case is quite simple.
 - ▶ Algorithm sets corresponding link of the **parent to NULL** and disposes the node.

Deletion

- ▶ Case I: Node to be removed has **no children**.

- ▶ **Example.** Remove -4 from a BST.



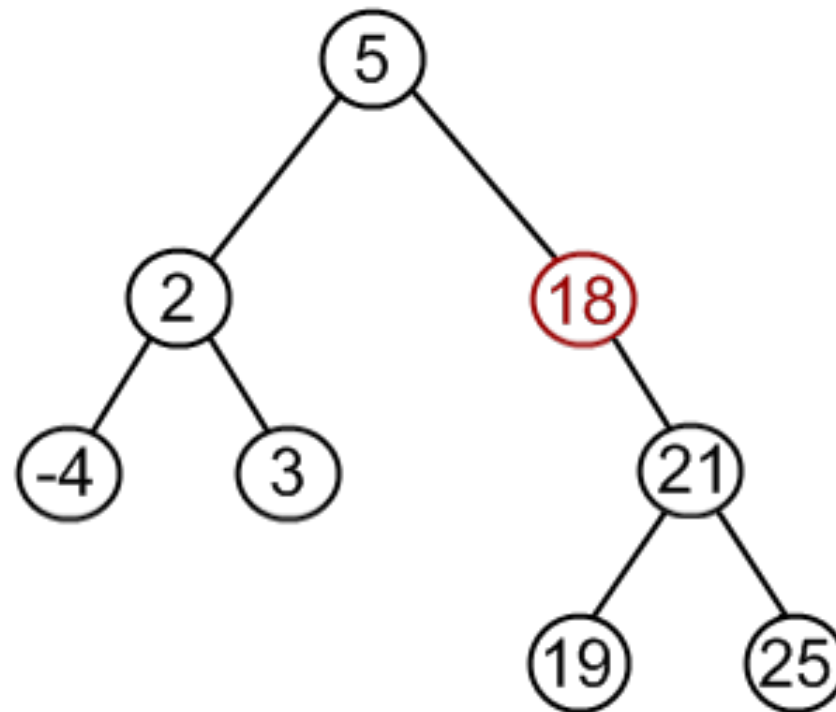
Deletion

- ▶ Case 2: Node to be removed has **one child**.
 - ▶ In this case, node is **cut** from the tree and algorithm **links** single child (with its subtree) **directly to the parent** of the removed node.

Deletion

- ▶ Case 2: Node to be removed has **one child**.

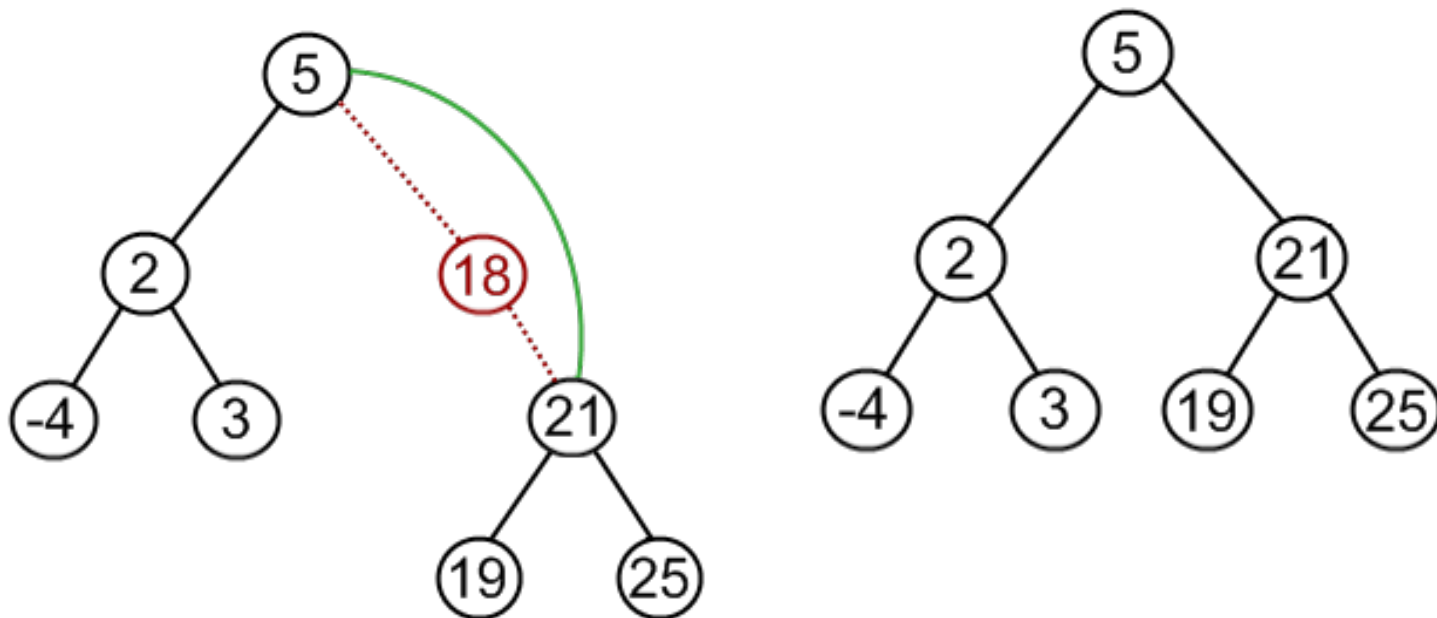
- ▶ **Example.** Remove 18 from a BST.



Deletion

- ▶ Case 2: Node to be removed has **one child**.

- ▶ **Example.** Remove 18 from a BST.

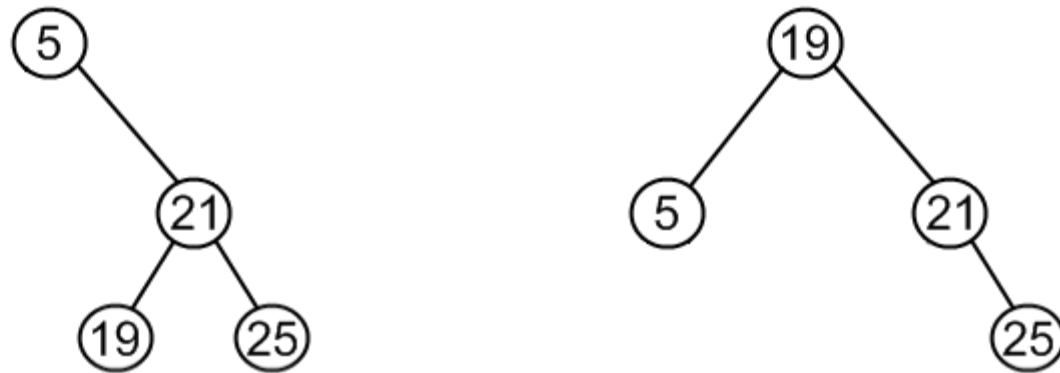


Deletion

- ▶ Case 3: Node to be removed has **two children**.
 - ▶ This is the most **complex** case.
 - ▶ To solve it, let us see one useful BST property first.

Deletion

- ▶ Case 3: Node to be removed has **two children**.
- ▶ We are going to use the idea, that the **same set** of values may be represented as **different binary-search trees**. For example those BSTs:



Deletion

- ▶ Case 3: Node to be removed has **two children**.
 - ▶ The above trees contain the same values {5, 19, 21, 25}.
To **transform** first tree into second one, we can do following:
 - ▶ choose minimum element from the right subtree (19 in the example);
 - ▶ replace 5 by 19;
 - ▶ hang 5 as a left child.

Deletion

- ▶ The **same approach** can be utilized to remove a node, which has two children:
 - ▶ find a **minimum value** in the right subtree;
 - ▶ **replace** value of the node to be removed with found minimum. Now, right subtree contains a duplicate!
 - ▶ apply remove to the right subtree to **remove a duplicate**.

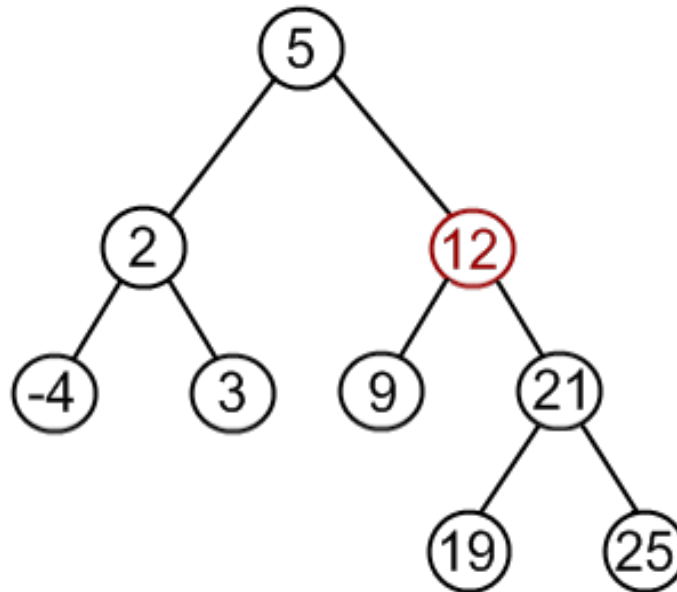
Deletion

- ▶ Notice, that the node with **minimum value** has no **left child** and, therefore, it's removal may result in **first or second cases** only.

Deletion

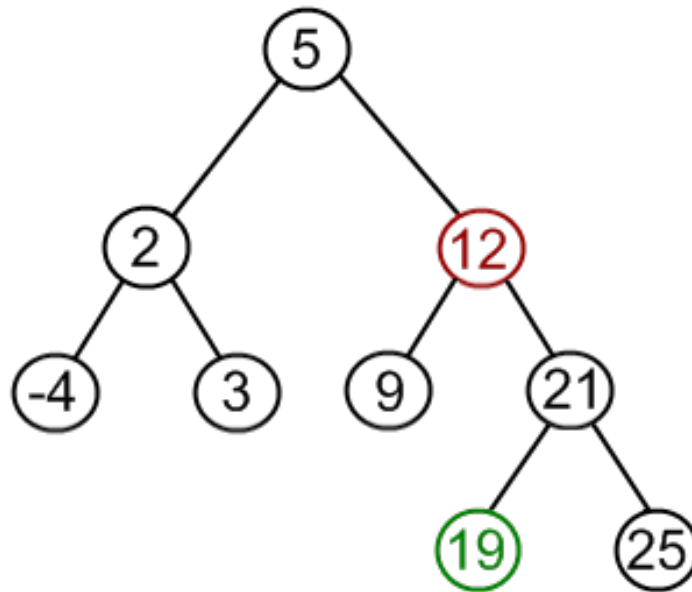
- ▶ Case 3: Node to be removed has **two children**.

- ▶ **Example.** Remove 12 from a BST.



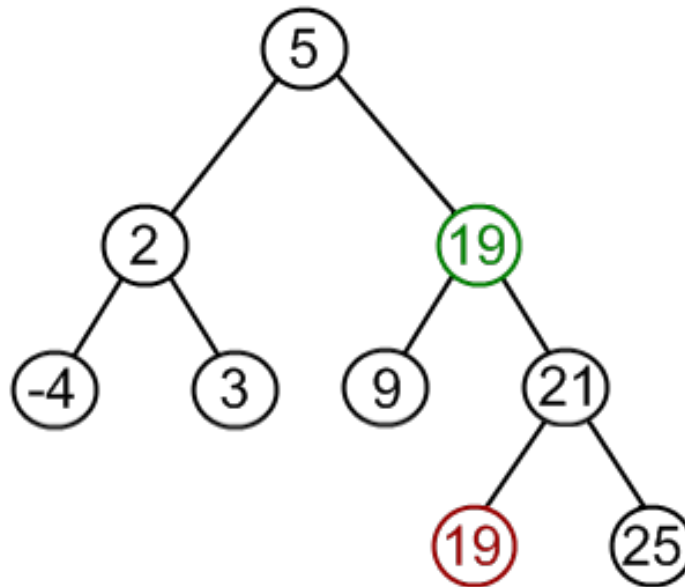
Deletion

- ▶ Case 3: Node to be removed has **two children**.
- ▶ Find **minimum element** in the right subtree of the node to be removed. In current example it is 19.



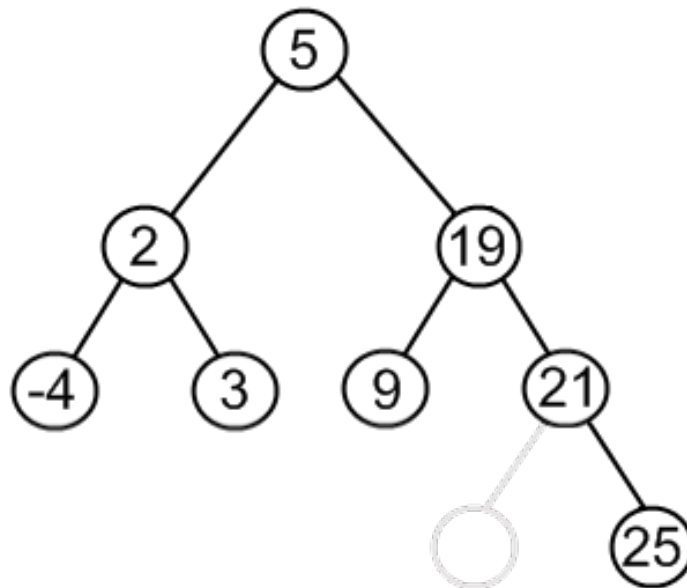
Deletion

- ▶ Case 3: Node to be removed has **two children**.
- ▶ **Replace 12 with 19**. Notice, that only values are replaced, not nodes. Now we have two nodes with the same value.



Deletion

- ▶ Case 3: Node to be removed has **two children**.
- ▶ **Remove 19** from the left sub-tree.



```

BSTNode* BSTree::deleteNode(BSTNode*& n, const int v) {
    BSTNode* min, *temp;
    if(n == NULL)
        return NULL;
    else if(v < n->data)
        return deleteNode(n->left, v);
    else if(v > n->data)
        return deleteNode(n->right, v);
    else {
        if(n->left && n->right) {
            min = findMin(n->right);
            n->data = min->data;
            deleteNode(n->right, n->data);
        }
        else {
            temp = n;
            if(n->left == NULL)
                n = n->right;
            else if(n->right == NULL)
                n = n->left;
            delete temp;
        }
        return n;
    }
}

```

Chapter 6 End