

# Binary Trees

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Algoritmos e Estruturas de Dados

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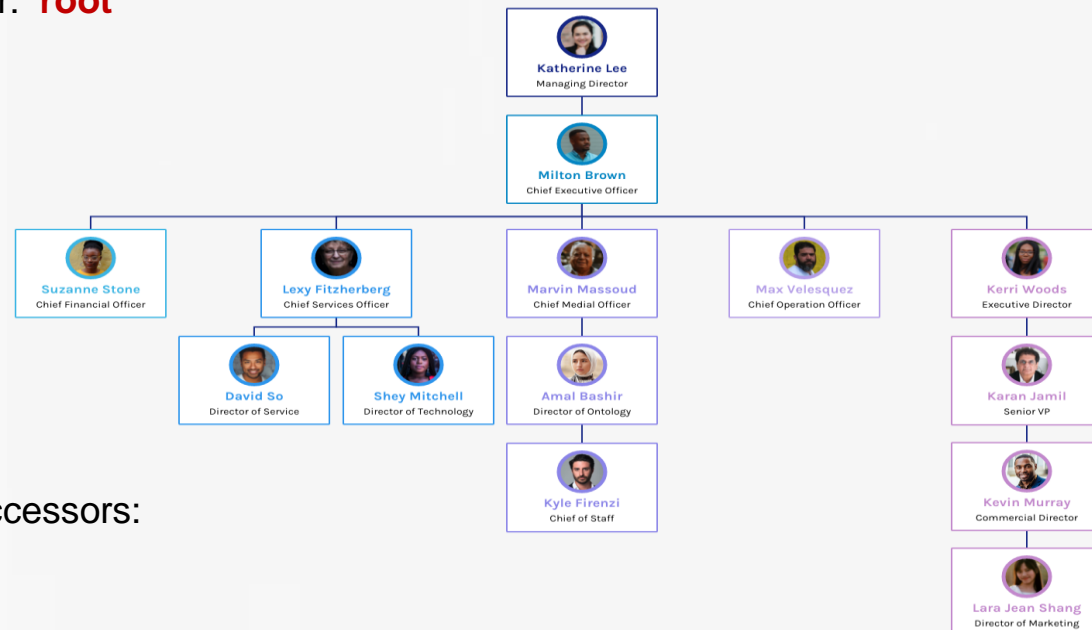
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# Tree

- **Tree**: set of nodes and set of edges connecting pairs of nodes
  - each node may have 0 or more successors (children)
  - each node has exactly one predecessor (parent)
    - except the starting node, called the **root**
  - There is a unique path from the root to each node; the **path length** for a node is the number of edges to traverse

Node without predecessor: **root**

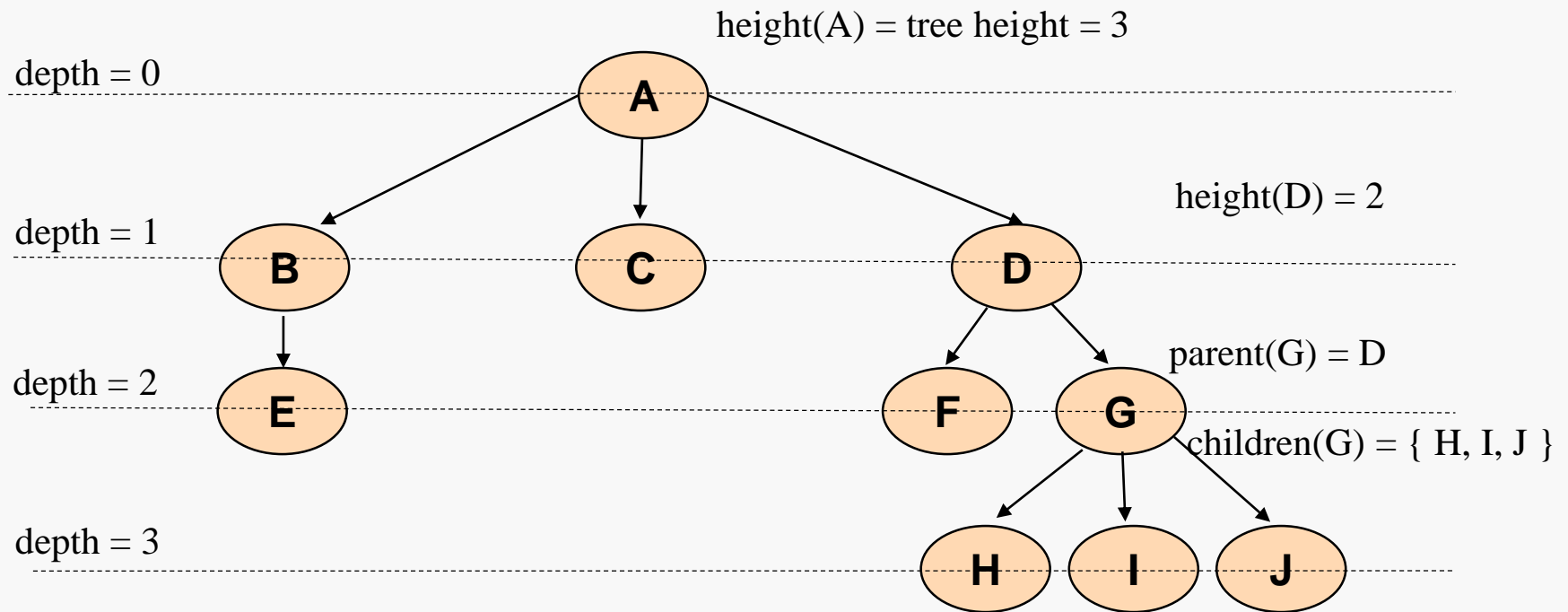


Nodes without successors:  
**leaves**

# Tree terminology

- Tree **branches**
  - links from nodes to its children: tree of  $n$  nodes has  $n - 1$  branches (max)
- **Depth** of a node
  - Length of path from root to node
    - depth of root is 0
    - depth of a node = 1 + depth of its parent
- **Height** of a node
  - Length of path from node to its deepest leaf (descendent)
    - height of a leaf is 0
    - height of a node = 1 + height of children of greatest height
  - Height of the tree: height of the root
- If there is a path from node  $u$  to node  $v$ 
  - $u$  is ancestor of  $v$
  - $v$  is descendent of  $u$
- **Size** of a node: number of descendents

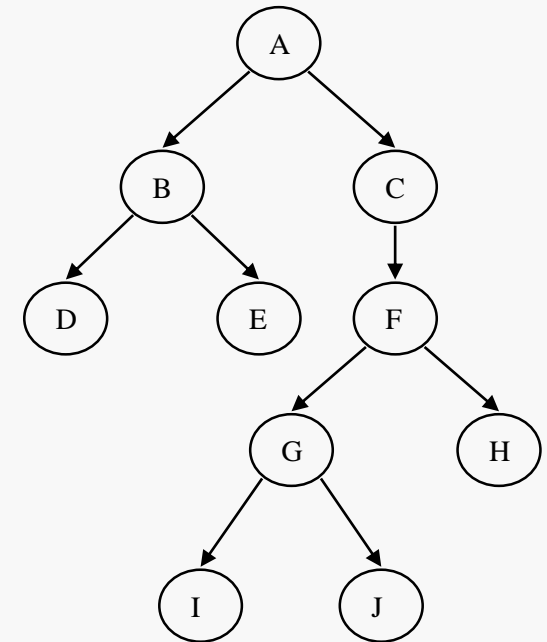
# Tree terminology



# Binary Tree

A **binary tree** is a tree where each node has **at most two children**

- Some properties:
  - A non-empty binary tree **with depth  $h$  has**:
    - at least  $h + 1$  nodes
    - at most  $2^{h+1} - 1$  nodes
  - The **depth** of a binary tree **with  $n$  elements** ( $n > 0$ ) is:
    - at least  $\log_2 n$
    - at most  $n - 1$
  - The average depth of a tree of  $n$  nodes is  $\sqrt{n}$

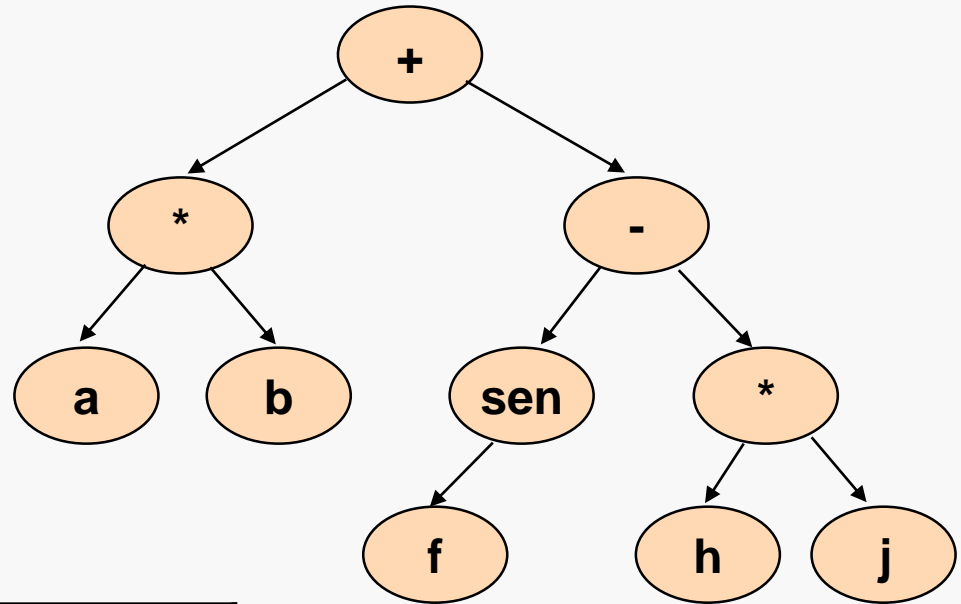


# Binary Tree

- Tree traversals
  - To traverse the binary tree is to visit each node in the binary tree exactly once
  - There are four different ways to traverse the binary tree, the first three are defined recursively:
- **Preorder:** visit the **root** first, then the **left** subtree, and finally the **right** subtree
- **Inorder:** visit the **left** subtree first, then the **root**, and finally the **right** subtree
- **Postorder:** visit the **left** subtree first, then the **right** subtree, and finally the **root**
- **By level:** nodes are visited by increasing level (depth), and within each level, from left to right

# Binary Tree

Tree traversal - example



Preorder	$+ * a b - \text{sen } f * h j$
Inorder	$a * b + f \text{sen} - h * j$
Postorder	$a b * f \text{sen } h j * - +$
Level	$+ * - a b \text{sen } * f h j$

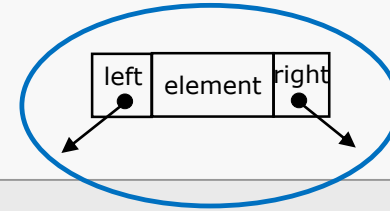
# Binary Tree

- **Binary Tree**
  - most usual **operations**:
    - create an empty tree
    - determine if the tree is empty
    - create a tree from two subtrees
    - remove the elements of the tree (clear the tree)
    - traversal the tree
    - print the tree



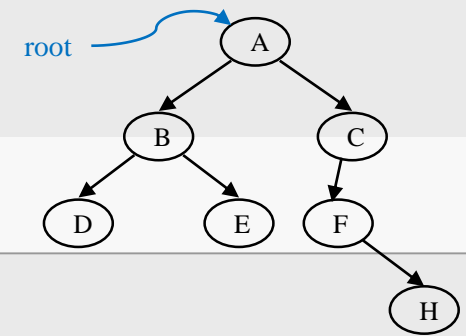
# Binary Tree: a possible implementation

*Node* of the binary tree



```
template <class T> class BTNode {  
    T element;  
    BTNode<T>* left,* right;  
    //...  
  
public:  
    BTNode(const T& el, BTNode<T>* l = 0, BTNode<T>* r = 0)  
        : element(el), left(l), right(r) {}  
};
```

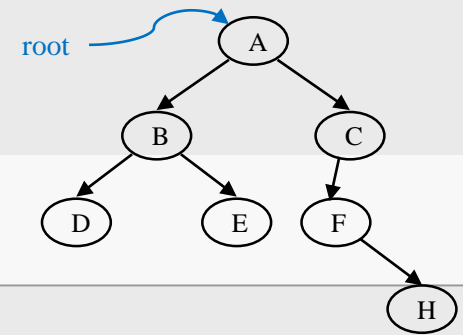
# Binary Tree: a possible implementation



## *Binary tree*

```
template <class T> class BinaryTree {  
    BTNode<T>* root;  
    // ...  
public:  
    BinaryTree() { root = 0; }  
    BinaryTree(const BinaryTree & t);  
    BinaryTree(const T& el);  
    BinaryTree(const T& el, const BinaryTree<T>& l,  
                const BinaryTree<T>& r);  
    ~BinaryTree { makeEmpty(); }  
    bool isEmpty() const;  
    T& getRoot() const;  
    void makeEmpty();  
    void output(ostream& out) const;  
};
```

# Binary Tree: a possible implementation



## *Binary tree:* traversal

```
template <class T>
void BinaryTree<T>::output(ostream& out) const {
    output(out, root);
}

template <class T>
void BinaryTree<T>::output(ostream& out, const BTreeNode<T>* n) const {
    if (n) {
        out << n->element << ' ';
        output(out, n->left);
        output(out, n->right);
    }
}
```

Tree traversal?

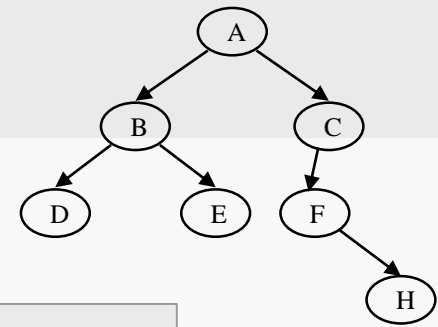
# Binary Tree: iterators

What about *iterators*?

Implementation:

- **Constructor** has the tree to iterate as a parameter; iterator is referencing the first element.
- methods:
  - void **advance()** //go to the next element
  - T& **retrieve()** //return the element referenced by the iterator
  - bool **isAtEnd()** //check if have reached the end
- An implementation for each possible tree traversal:
  - preorder, **BTIterPre** (let's see this implementation)
  - inorder, **BTIterIn**
  - postorder, **BTIterPos**
  - by level, **BTIterLevel**

# Preorder iterator: a possible implementation



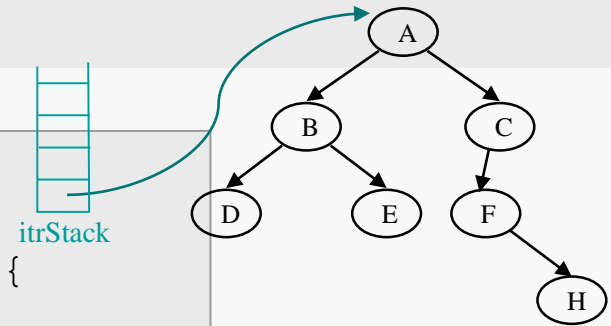
```
template <class T> class BTIterPre {  
    stack<BTNode<T>*> itrStack;  
public:  
    BTIterPre(const BinaryTree<T>& t);  
    void advance();  
    T& retrieve();  
    bool isAtEnd() const;  
};  
  
template <class T>  
BTIterPre<T>::BTIterPre(const BinaryTree<T>& t) {  
    if ( !t.isEmpty() )  
        itrStack.push(t.root);  
}
```

# Preorder iterator: a possible implementation

```
template <class T>
BTIterPre<T>::BTIterPre(const BinaryTree<T>& t) {
    if ( !t.isEmpty() )
        itrStack.push(t.root);
}

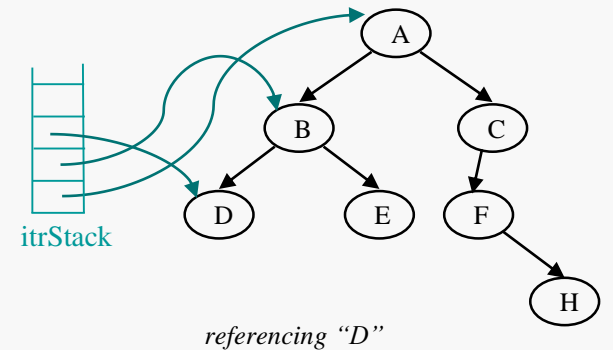
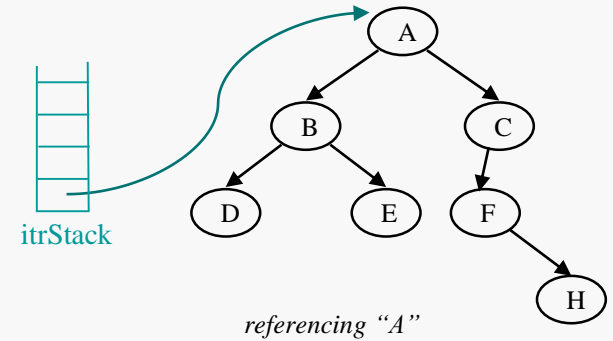
template <class T>
bool BTIterPre<T>::isAtEnd() const {
    return itrStack.empty();
}

template <class T>
T& BTIterPre<T>::retrieve() {
    return itrStack.top()->element;
}
```



# Preorder iterator: a possible implementation

```
template <class T>
void BTIterPre<T>::advance() {
    BTreeNode<T>* actual = itrStack.top();
    BTreeNode<T>* next = actual->left;
    if (next)
        itrStack.push(next);
    else {
        while ( ! itrStack.empty() ) {
            actual = itrStack.top();
            itrStack.pop();
            next = actual->right;
            if (next) {
                itrStack.push(next);
                break;
            }
        }
    }
}
```



# Binary Search Trees

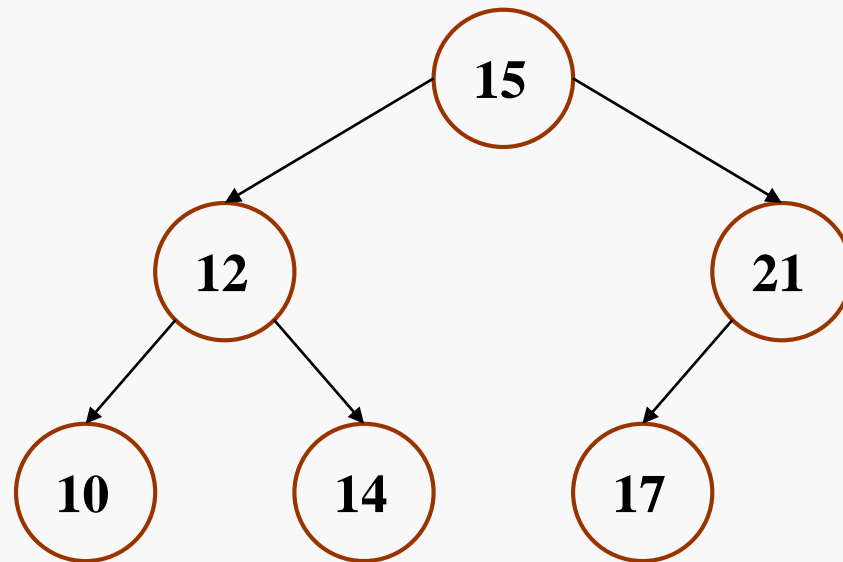


# Binary Search Tree (BST)

- **Binary Search Tree**

Binary tree, without duplicates. For every node (X):

- The values of all the items in its left subtree are smaller than the item in X
- The values of all the items in its right subtree are larger than the item in X



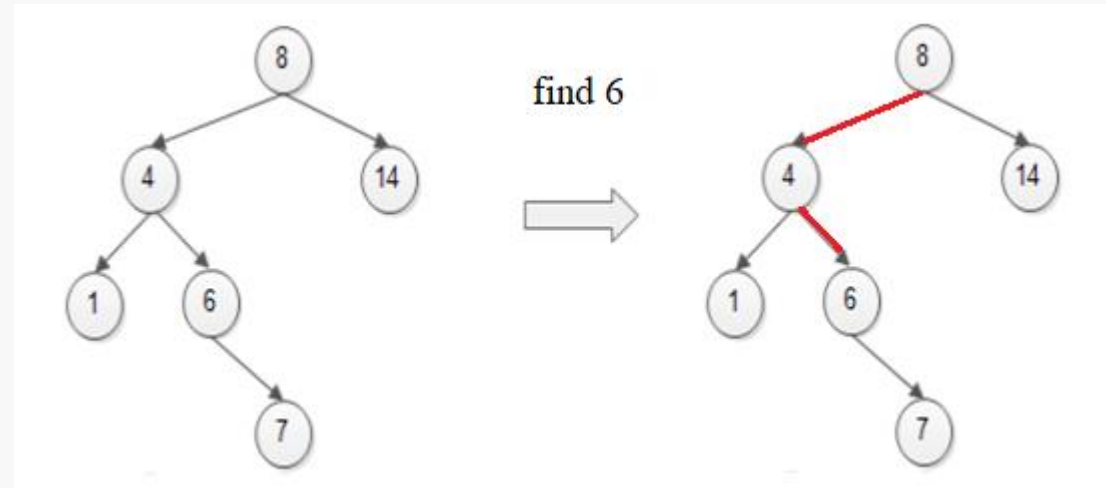
# Binary Search Tree

- In *Linear Data Structures* with sorted elements:
  - Search for elements can be achieved in  $O(\log n)$
  - ...but not insertion or deletion of elements
- In a *Binary Tree* structure:
  - Logarithmic running time *can be* guaranteed for insertion and deletion operations (if balanced tree)
  - A *Binary Search Tree*:
    - Supports more operations compared to the basic Binary Tree structure, namely: search, insertion and deletion
    - Elements in nodes must be comparable (*Comparable*)

# Binary Search Tree

- **Search**

- Takes advantage of the order property of the tree to select a search path. A subtree is ignored with each comparison.  
*can be  $O(\log n)$*



- **Maximum** and **Minimum**

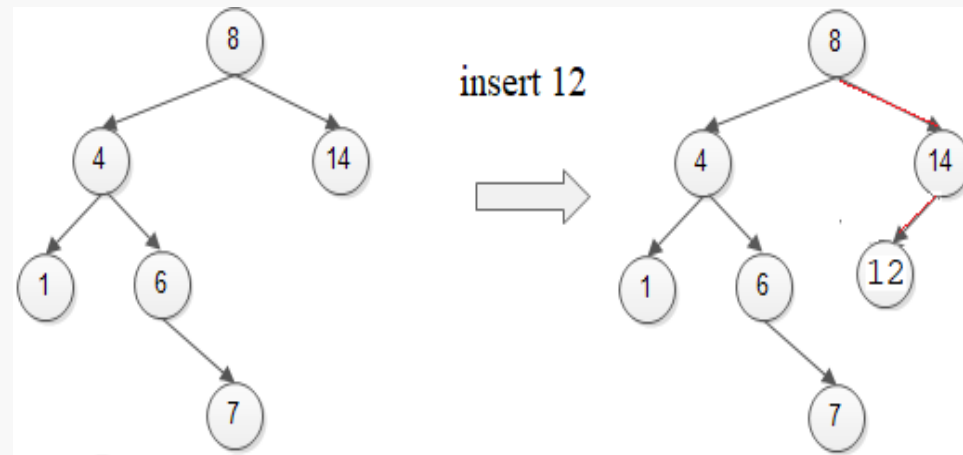
- When looking for the maximum: consistently choose the right subtree.
- When looking for the minimum: consistently choose the left subtree.

# Binary Search Tree

- **Insertion**

- Follows the logic behind the search operation. The new node is inserted where the search fails.

*can be  $O(\log n)$*



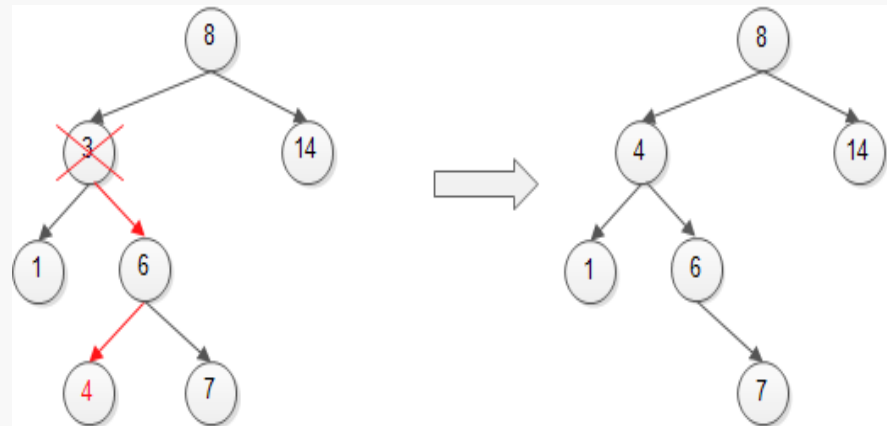
see animation in [VisuAlgo](#)

# Binary Search Tree

- **Deletion**

- Leaf Node: delete the node
- Node with only one child: child node replaces the parent node
- Node with two children: element is replaced by the smallest element in the right subtree (or the largest element in the left subtree); its node has at most one child node that replaces the parent node.

*can be  $O(\log n)$*



see animation in [VisuAlgo](#)

# Binary Search Tree: a possible implementation

- Declaration of the **BST** class (private section)

```
template <class Comparable> class BST {
    BinaryNode<Comparable> *root;
    const Comparable ITEM_NOT_FOUND;

    const Comparable & elementAt(BinaryNode<Comparable> *t) const;
    bool insert(const Comparable & x, BinaryNode<Comparable>* & t);
    bool remove(const Comparable & x, BinaryNode<Comparable>* & t);
    BinaryNode<Comparable> * findMin(BinaryNode<Comparable>*t) const;
    BinaryNode<Comparable> * findMax(BinaryNode<Comparable>*t) const;
    BinaryNode<Comparable> * find( const Comparable & x,
                                   BinaryNode<Comparable>*t) const;

    void makeEmpty( BinaryNode<Comparable>* & t );
    void printTree( BinaryNode<Comparable>*t ) const;
    BinaryNode<Comparable>* copySubTree(BinaryNode<Comparable>* t);

    // continue...
```

# Binary Search Tree: a possible implementation

- Declaration of the **BST** class (public section)

```
public:
    explicit BST(const Comparable& notFound) { }
    BST(const BST & t);
    ~BST();
    const Comparable& findMin() const;
    const Comparable& findMax() const;
    const Comparable& find(const Comparable& x) const;
    bool isEmpty() const;
    void printTree() const;
    void makeEmpty();
    bool insert(const Comparable& x);
    bool remove(const Comparable& x);
    const BST& operator =(const BST& rhs);
};
```

*constructor*

# Binary Search Tree: a possible implementation

- BST Class: constructor and destructor

```
template <class Comparable>
BST<Comparable>::BST(const Comparable& notFound):
    root(NULL), ITEM_NOT_FOUND(notFound)
{ }

template <class Comparable>
BST<Comparable>::~~BST( ){
    makeEmpty( );
}
```



# Binary Search Tree: a possible implementation

- BST Class: *find*

```
template <class Comparable>
const Comparable & BST<Comparable>::find(const Comparable& x) const {
    return elementAt( find(x, root) );
}
```

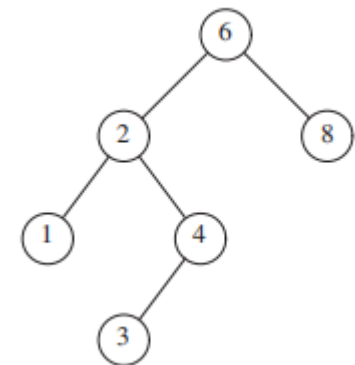
```
template <class Comparable>
const Comparable&
BST<Comparable>::elementAt(BinaryNode<Comparable>* t) const{
    if( t == NULL ) return ITEM_NOT_FOUND;
    else return t->element;
}
```

# Binary Search Tree: Implementation

- BST Class: *find*

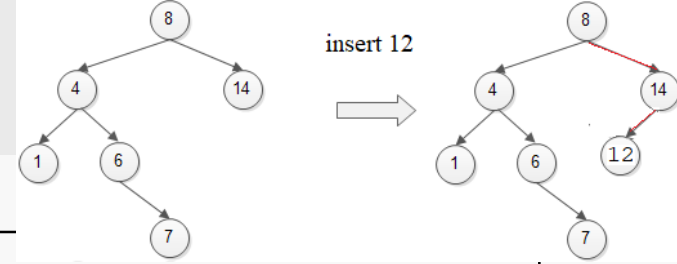
```
template <class Comparable>
BinaryNode<Comparable> * BST<Comparable>::find(const Comparable& x,
                                                BinaryNode<Comparable>* t) const
{
    if ( t == NULL )
        return NULL;
    else if ( x < t->element )
        return find(x, t->left);
    else if ( t->element < x )
        return find(x, t->right);
    else return t;
}
```

**Note:** we only need the < operator



# Binary Search Tree: Implementation

- BST Class: *insert*



```
template <class Comparable>
bool BST<Comparable>::insert(const Comparable& x) {
    return insert (x,root);
}

template <class Comparable>
bool BST<Comparable>::insert(const Comparable& x,
                             BinaryNode<Comparable>* & t) {

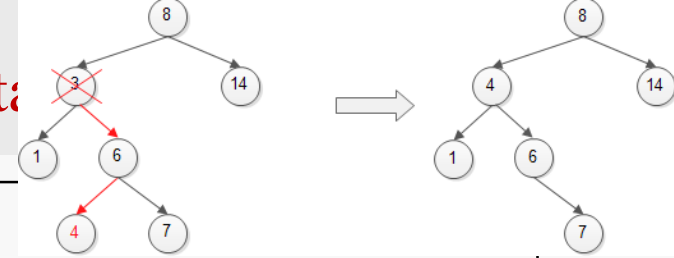
    if ( t == NULL ) {
        t = new BinaryNode<Comparable>(x, NULL, NULL);
        return true;
    }
    else if ( x < t->element)
        return insert(x, t->left);
    else if (t->element < x)
        return insert(x, t->right);
    else
        return false;      // duplicate; do nothing
}
```

# Binary Search Tree: a possible implementation

- BST Class: *remove*

```
template <class Comparable>
bool BST<Comparable>:: remove (const Comparable & x,
                               BinaryNode<Comparable> * & t) {

    if ( t == NULL )
        return false;    // item not found; do nothing
    if ( x < t->element )
        return remove(x, t->left);
    else if ( t->element < x )
        return remove(x, t->right);
    else if ( t->left != NULL && t->right != NULL ) {
        t->element = findMin(t->right)->element;
        return remove(t->element, t->right);
    }
    else {
        BinaryNode<Comparable>* oldNode = t;
        t = ( t->left != NULL ) ? t->left : t->right;
        delete oldNode;
        return true;
    }
}
```



# Class *set* (STL)

Class *set* in STL:

*template<Key, Compare> class set*

- *Key*: type of the item in the set
- *Compare*: determines the ordering of the keys; by default is the operator <

- distinct, ordered data stored in a *balanced*\* binary tree
- implemented as a *red black*\* tree
- inorder iterator

[en.cppreference.com/w/cpp/container/set](https://en.cppreference.com/w/cpp/container/set)

\* we will see this later

# Class *set* (STL)

Some methods of *set* (STL)

- iterator **begin()**
- iterator **end()**
- size\_type **size()** const
- bool **empty()** const
- void **clear()**
- std::pair<iterator,bool> **insert**( const value\_type& value )
- iterator **erase**( const\_iterator position );
- iterator **find**( const Key& key )
- ...

# Binary Search Tree: example 1

- Counting word occurrences

We want to write a program that reads a text file and outputs an ordered listing of the words it contains, as well as their number of occurrences.

- Store the words and associated counters in a binary search tree.
- Use alphabetical order to compare nodes.

# Binary Search Tree: example 1

**WordFreq** class : representation of the words and respective frequencies

```
class WordFreq {  
    string word;  
    int frequency;  
public:  
    WordFreq();  
    WordFreq(string w);  
    bool operator < (const WordFreq & w) const;  
    bool operator == (const WordFreq & w) const;  
    void incFrequency();  
    friend ostream& operator <<(ostream& out, const WordFreq& w);  
};
```

wordFreq.h



# Binary Search Tree: example 1

*wordFreq.cpp*

```
WordFreq::WordFreq(): word(""), frequency(0) {};  
  
WordFreq::WordFreq(string w): word(w), frequency(1) {};  
  
bool WordFreq::operator < (const WordFreq & w) const {  
    return word < w.word;  
}  
  
bool WordFreq::operator == (const WordFreq & w) const {  
    return word == w.word;  
}  
  
void WordFreq::incFrequency() {  
    frequency ++;  
}
```

# Binary Search Tree: example 1

```
int main() {
    set<WordFreq> words;
    string word1 = getWord();
    while ( word1 != "" ) {
        set<WordFreq>::iterator it  = words.find(WordFreq(word1));
        if ( it == words.end() )
            words.insert(WordFreq(word1));
        else {
            WordFreq found = *it;
            found.incFrequency();
            words.erase(it);
            words.insert(found);
        }
        word1 = getWord();
    }
    set<WordFreq>::iterator it = words.begin();
    while ( it!=words.end() ) {
        cout << *it;
        it++;
    }
}
```

# Binary Search Tree: example 2

In a library, information about existing books is stored in a binary search tree (books) sorted by author and, for the same author, by title.

```
class Book {
    string title;
    string author;
public:
    // ...
};

class Library {
    set<Book> books;
public:
    Library();
    // ...
};
```

# Binary Search Tree: example 2

- Implement in the **Library** class the member function:

```
void addBooks(const vector<Book> & books1)
```

This function inserts into the BST *books* the books included in the *books1* vector.

```
void Library::addBooks(const vector<Book>& books1) {  
    for (int i=0; i< books1.size(); i++)  
        books.insert(books[i]);  
}
```

```
bool Book::operator < (const Book& l1) const {  
    if (author == l1.author)  
        return (title < l1.title);  
    else  
        return (author < l1.author);  
}
```

# Binary Search Tree: example 2

- Implement in the **Library** class the member function:

```
vector<string> getTitles(string author1, int & nVisits)
```

The function returns a vector with the titles, in alphabetical order, of all the books of author *author1*. And returns in *nVisits* the number of nodes that were visited in this search.

```
vector<string> Library::getTitles(string author1, int& nVisits) {  
    vector<string> vres;  
    nVisits=0;  
    set<Book>::iterator it = books.begin();  
    for(; it!=books.end(); it++) {  
        nVisits++;  
        if (it->getAuthor() > author1)  
            break;  
        if (it->getAuthor() == author1)  
            vres.push_back(it->getTitle());  
    }  
    return vres;  
}
```

# Binary Search Tree: example 2

- Implement in the **Library** class the member function:

```
string removeBook(string author1, string title1)
```

The function removes the book of author *author1* and title *title1* from BST books and returns the string "*removed*".

If the book does not exist, it returns the title of the first book (alphabetically) of that author.

If no book of that author exists, it returns the string "*author nonexistent*".

# Binary Search Tree: example 2

```
string Library::removeBook(string author1, string title1){
    Book l1(title1, author1);
    set<Book>::iterator it = books.find(l1);
    if (it!=books.end()) {
        books.erase(it);
        return "removed";
    }

    set<Book>::iterator it = books.begin();
    for (;it!=books.end(); it++) {
        if (it->getAuthor() == author1)
            return it->getTitle();
        if (it->getAuthor() > author1)
            return "author nonexistent";
    }
    return "author nonexistent";
}
```

# Balanced Binary Search Trees



# Binary Search Tree

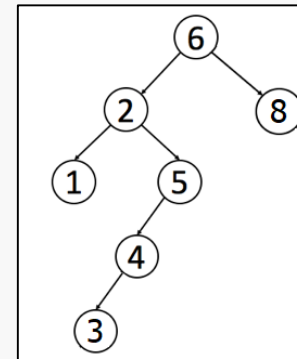
- ***Binary Search Tree***

- tree can be unbalanced
- insertion, removal and searching operations can be  $O(n)$  in the worst case, when tree degenerates into list

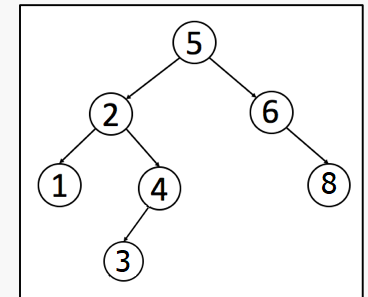
***Balanced tree:*** for each node, the heights of the left and right subtrees differ by at most one unit

- ***Balanced Binary Search Tree***

- avoid degenerate cases
- guarantees  $O(\log n)$  for insertion, removal and searching



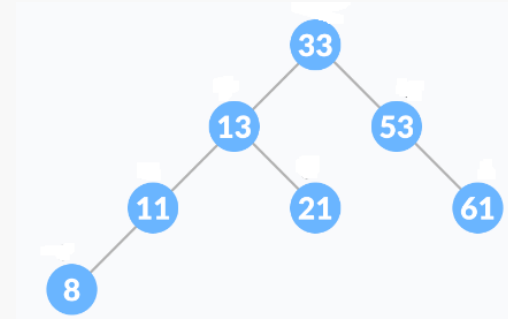
unbalanced BST



balanced BST

# AVL Tree

- AVL Tree
  - Balanced binary search tree



- Insertion and removal identical to BST
  - But the tree might become unbalanced

Apply *rotations* along the path on the unbalanced nodes in order to keep it balanced

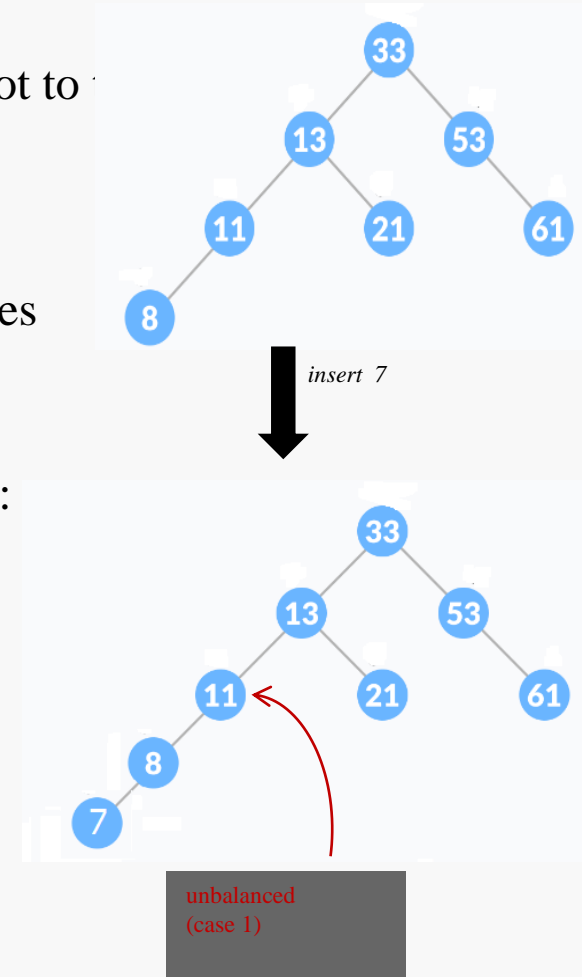
- Searching identical to BST

# AVL: insertion

- **Insertion**

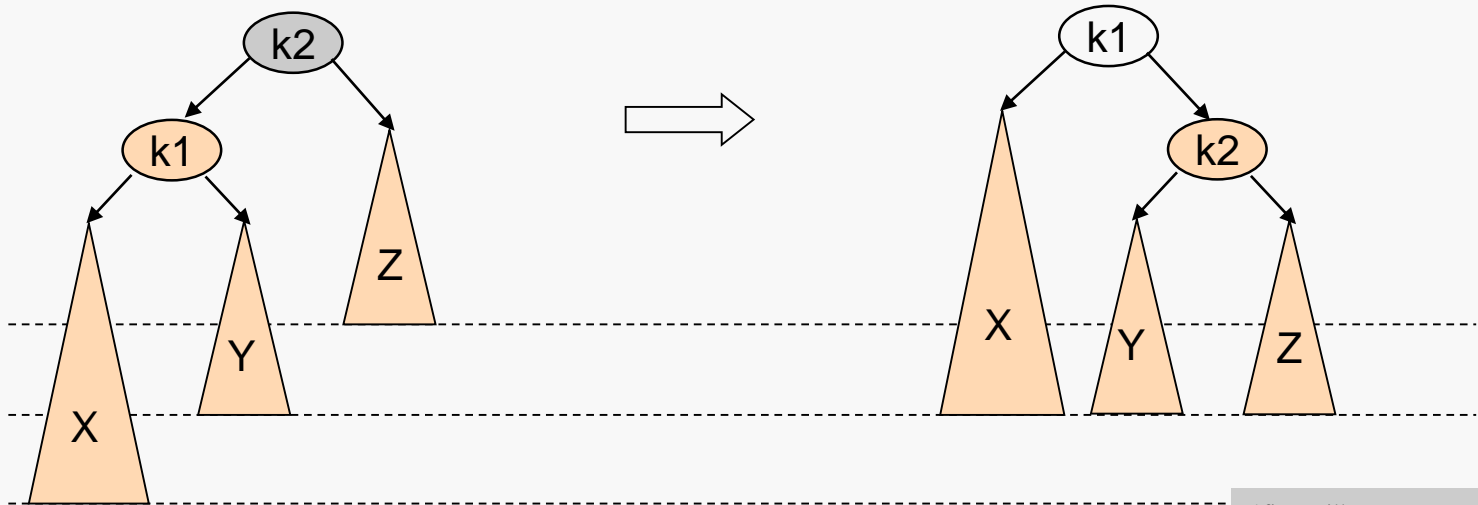
- After an insertion, only nodes on the path from the root to have the balance condition changed.
- If so, it is necessary to rebalance
  - rebalance the deepest node where unbalance arises
  - the whole tree is balanced
- Let K be the node to be rebalanced due to insertion in:
  1. left tree of the left child of K
  2. right tree of the left child of K
  3. left tree of the right child of K
  4. right tree of the right child of K

\*cases 1 and 4 are symmetrical; \* cases 2 and 3 are symmetrical;



# AVL: insertion

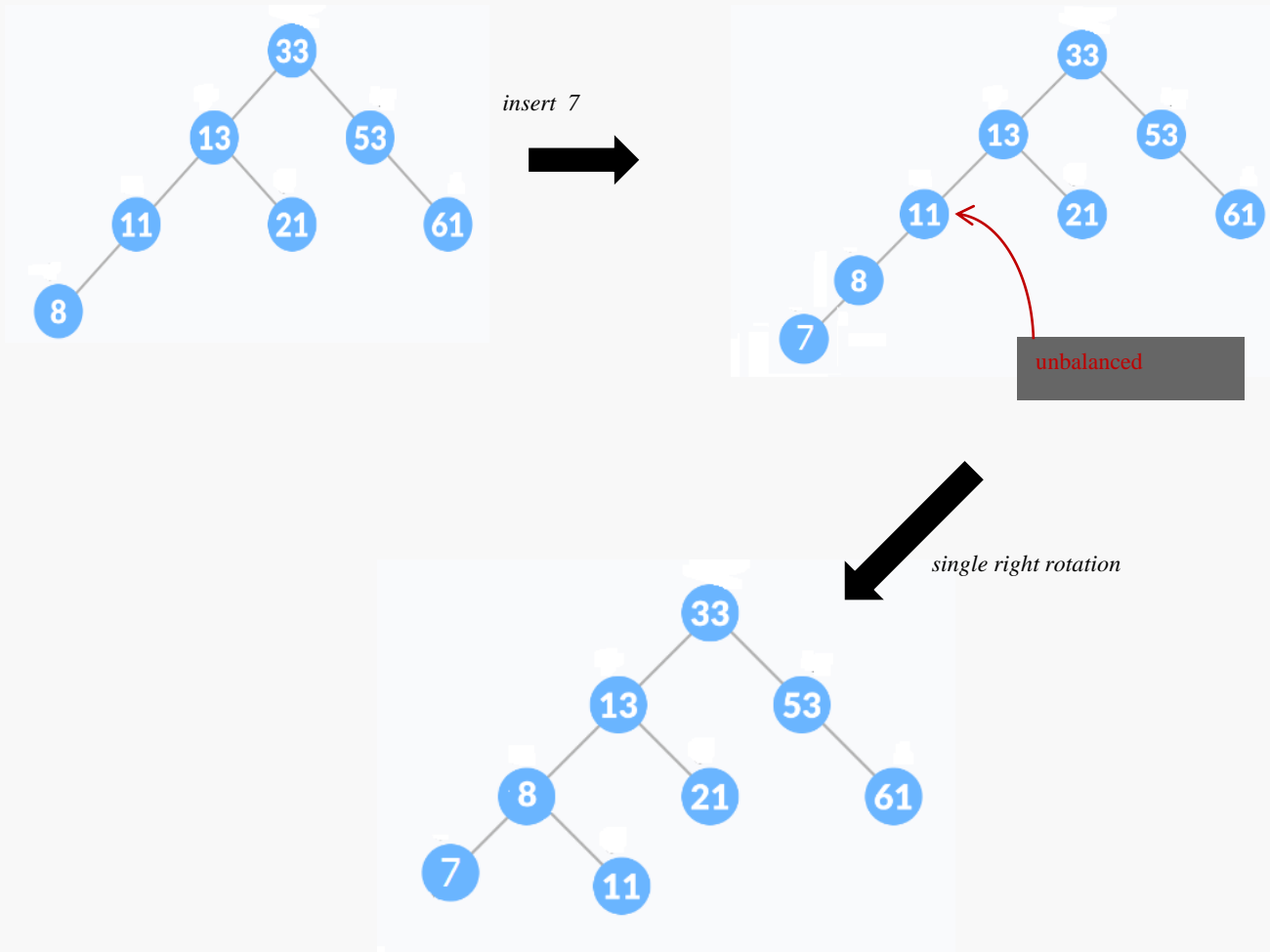
- **Single rotation** (for cases 1 and 4)



\*figure illustrates case 1

- *before rotation:*
  - k2 is the deepest node where balance fails
  - left subtree is 2 levels below the right
- *after rotation:*
  - k1 and k2 now have subtrees of the same height
  - problem is solved with a single operation

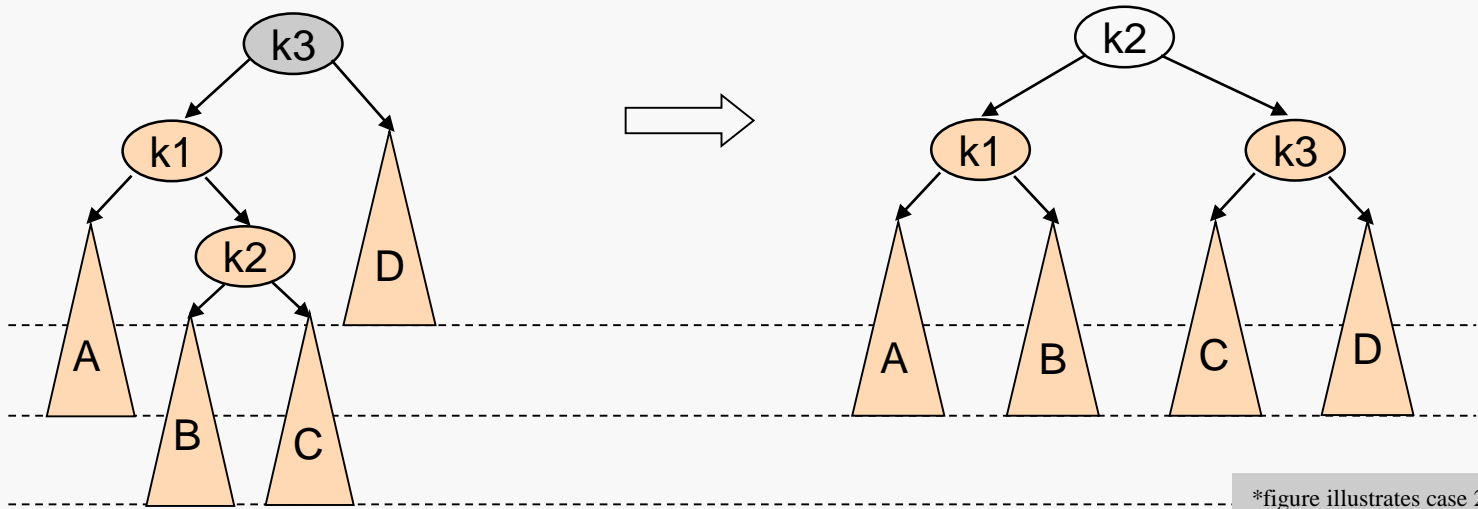
# AVL: insertion



see animation in [VisuAlgo](#)

# AVL: insertion

- **Double rotation** (for cases 2 and 3)



\*figure illustrates case 2

- *before rotation*:
  - one (and only one) of sub-trees B or C is 2 levels apart from D
- *double rotation* can be seen as a sequence of 2 single rotations
  - rotation between the node's child and grandchild
  - rotation between the node and its new child

# AVL: a possible implementation

## AVL Tree Node

```
template <class Comparable>
class AVLNode {
    Comparable element;
    AVLNode *left, *right;
    int height;
public:
    AVLNode(const Comparable &e, AVLNode *esq = 0,
            AVLNode *dir = 0, int h = 0);

    //...
};
```

## AVL Tree

```
template <class Comparabe>
class AVLTree {
    AVLNode<Comparable> *root;

    //...

};
```

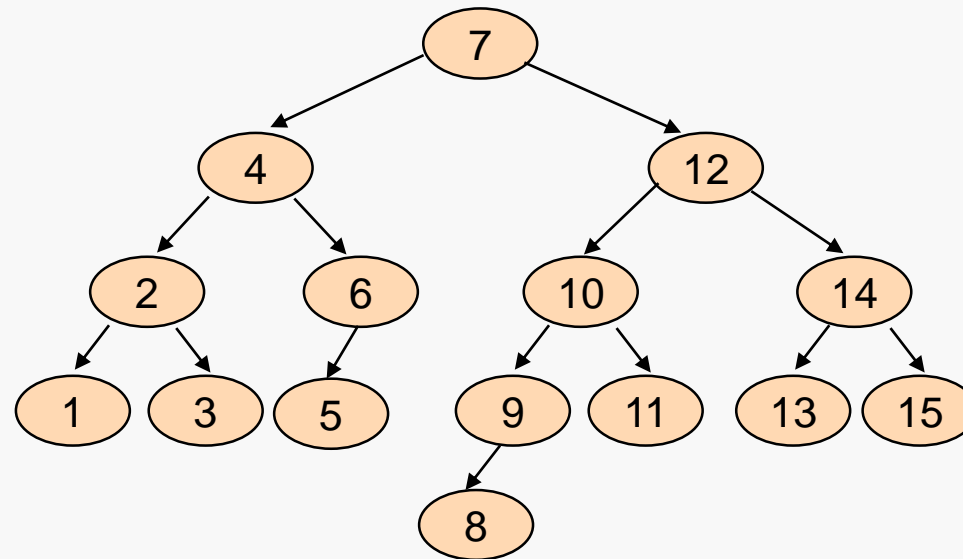
**Insertion** in a AVL tree has complexity  $O(\log n)$  :

- $O(\log n)$  to get the insertion position
- $O(1)$  to eventually rebalance the tree

*Exercise:* build the AVL tree that results from inserting the following sequence of values:

1, 2, 3, 4, 5, 6, 7, 15, 14, 13, 12, 11, 10, 9, 8

*result:*





# AVL: removal

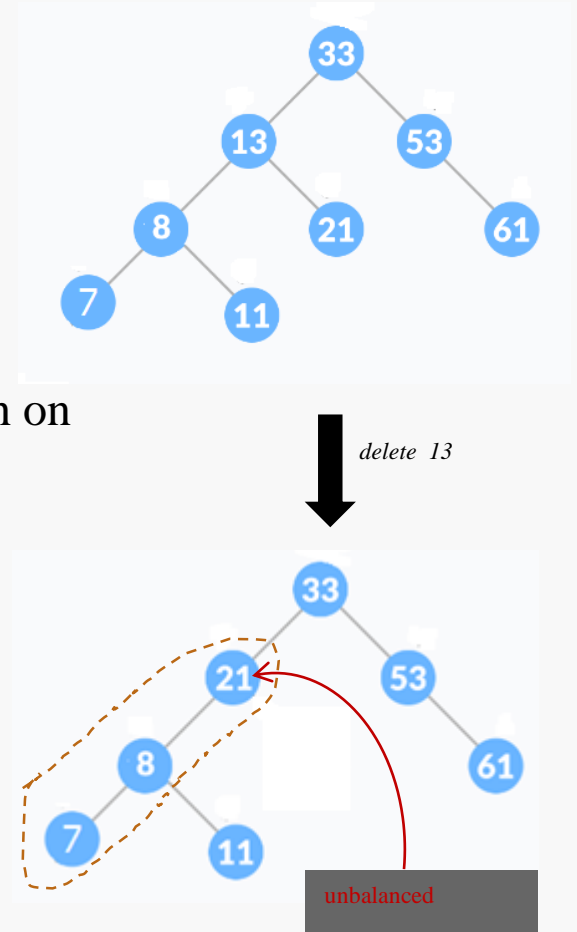
- **Removal**

Same idea as insertion:

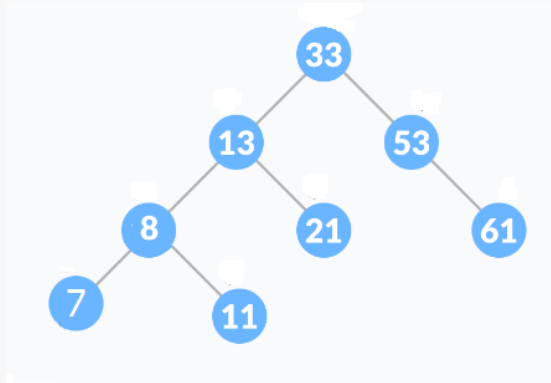
- find the node to remove
- remove the node (same process as in BST)
- apply rotations, as already described, along the path on all unbalanced nodes until reach the root

**Removal** in a AVL tree has complexity  $O(\log n)$  :

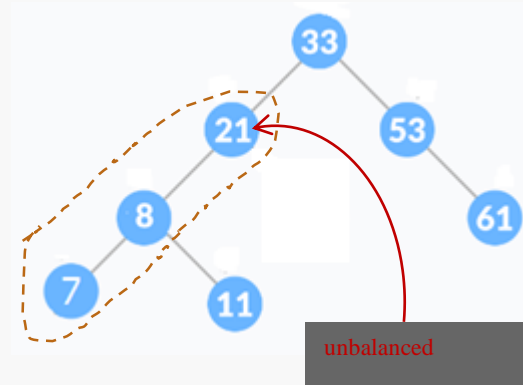
- $O(\log n)$  to find the node to be deleted
- $O(1)$  to eventually rebalance the tree



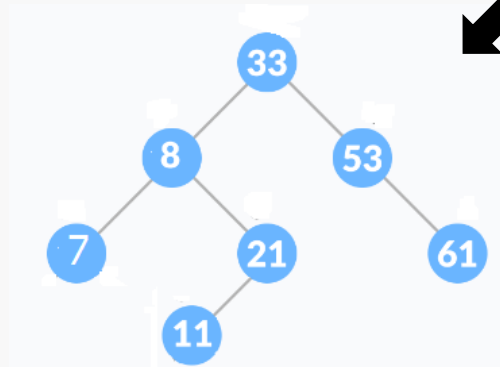
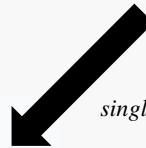
# AVL: removal



*delete 13*



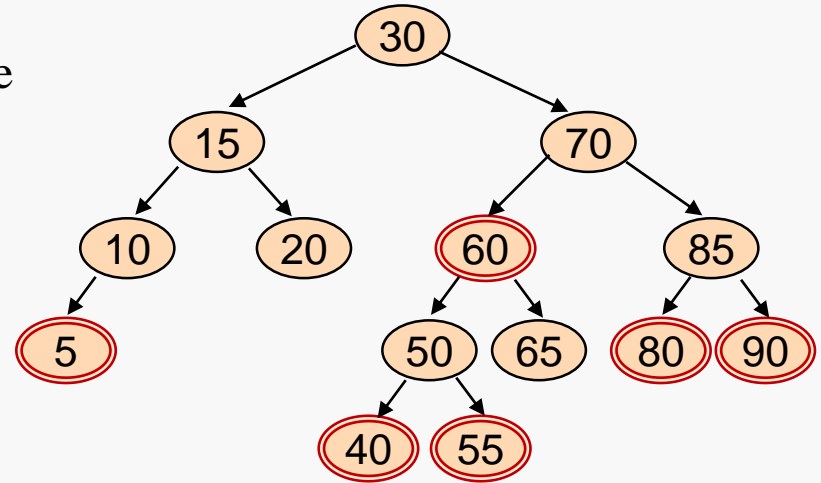
*single right rotation*



# Red-Black Trees

## Red-Black tree

- another type of balanced binary search tree
- operations have complexity  $O(\log n)$
- **Properties** of a Red-Black tree
  - each node is colored as red or black
  - the root is black
  - if a node is red, its children are black
  - any path from a node to an empty subtree contains the same number of black nodes
  - height of a Red Black tree is at most  $= 2 \times \log(n + 1)$ 
    - ensures that search operation is of logarithmic order.



# Class *set* (STL)

Class *set* in STL:

*template<Key, Compare> class set*

- *Key*: type of the item in the set
  - *Compare*: determines the ordering of the keys; by default is the operator <
- implemented as a **red-black tree**