

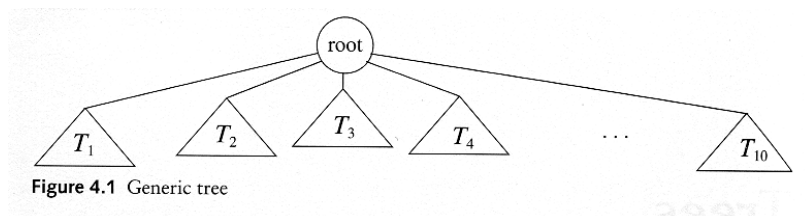
Binary Trees, Binary Search Trees

Trees

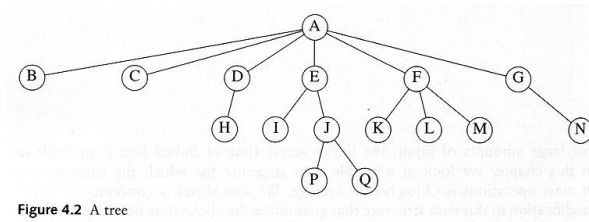
- Linear access time of linked lists is prohibitive
 - Does there exist any simple data structure for which the running time of most operations (search, insert, delete) is $O(\log N)$?
- Trees
 - Basic concepts
 - Tree traversal
 - Binary tree
 - Binary search tree and its operations

Trees

- A tree is a collection of nodes
 - The collection can be empty (the root (T) is NULL)
 - (recursive definition) If not empty, a tree consists of a distinguished node T (the *root*), and zero or more nonempty *subtrees* $T_1, T_2, \dots, T_k$, each of whose roots are connected by a directed *edge* from r



Some Terminologies



- **Child and Parent**
 - Every node except the root has one parent
 - A node can have an zero or more children
- **Leaves**
 - Leaves are nodes with no children
- **Sibling**
 - nodes with same parent

More Terminologies

- **Path**
 - A sequence of edges
 - A path from n_1 to n_k is defined as a sequence of nodes, $n_1, n_2 \dots n_k$, such that n_i is the parent of n_{i+1} for $1 \leq i < k$.
- **Length of a path**
 - number of edges on the path
- **Depth of a node**
 - length of the unique path from the root to that node
- **Height of a node**
 - length of the longest path from that node to the deepest leaf
 - all leaves are at height 0
- **The height of a tree** = the height of the root = the depth of the deepest leaf
- **Ancestor and descendant**
 - If there is a path from n_1 to n_2
 - n_1 is an ancestor of n_2 , n_2 is a descendant of n_1
 - *Proper ancestor and proper descendant*

Example: UNIX Directory

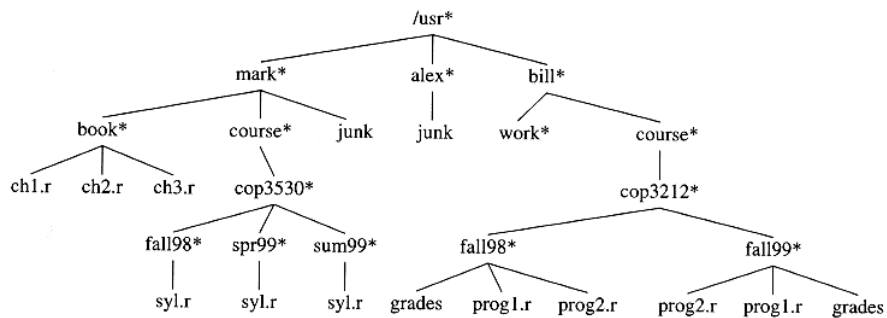


Figure 4.5 UNIX directory

Tree Implementation

```
class TreeNode
{
    Object element;
    TreeNode firstChild;
    TreeNode nextSibling;
}
```

Figure 4.3 Node declarations for trees

```
typedef struct TreeNode *PtrToNode;
struct TreeNode
{
    ElementType Element;
    PtrToNode FirstChild;
    PtrToNode NextSibling;
}
```

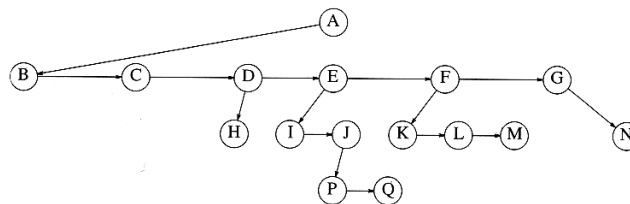


Figure 4.4 First child/next sibling representation of the tree shown in Figure 4.2

Tree Traversal

- Used to print out the data in a tree in a certain order
- **Pre-order traversal**
 - Print the data at the root
 - Recursively print out all data in the left subtree
 - Recursively print out all data in the right subtree
- **In-order traversal**
 - Recursively print out all data in the left subtree
 - Print the data at the root
 - Recursively print out all data in the right subtree
- **Post-order traversal**
 - Recursively print out all data in the left subtree
 - Recursively print out all data in the right subtree
 - Print the data at the root

Preorder, Postorder and Inorder

• Preorder traversal

- root, left, right
- prefix expression
- $++a*bc*+*defg$

• Inorder traversal

- left, root, right
- infix expression
- $a+b*c+d*e+f*g$

• Postorder traversal

- left, right, root
- postfix expression
- $abc*+de*f+g*+$

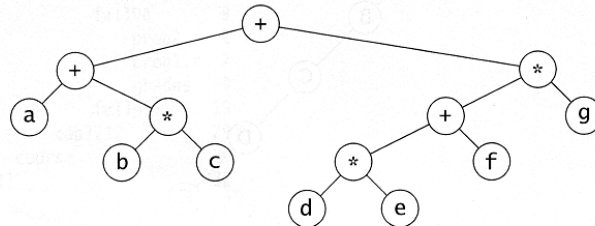


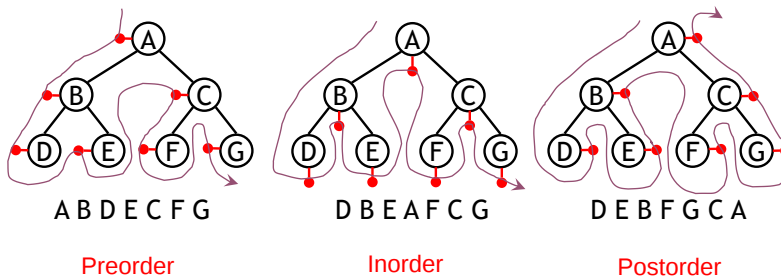
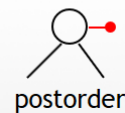
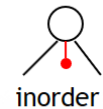
Figure 4.14 Expression tree for $(a + b * c) + ((d * e + f) * g)$

Tree Traversal ... Example

□ Preorder: visits nodes as **root** → left → right

□ Inorder: visits nodes as left → **root** → right

□ Postorder: visits nodes as left → right → **root**



Preorder, Postorder and Inorder Pseudo Code

Algorithm *Preorder*(x)

Input: x is the root of a subtree.

1. **if** $x \neq \text{NULL}$
2. **then** output $\text{key}(x)$;
3. $\text{Preorder}(\text{left}(x))$;
4. $\text{Preorder}(\text{right}(x))$;

Algorithm *Postorder*(x)

Input: x is the root of a subtree.

1. **if** $x \neq \text{NULL}$
2. **then** $\text{Postorder}(\text{left}(x))$;
3. $\text{Postorder}(\text{right}(x))$;
4. output $\text{key}(x)$;

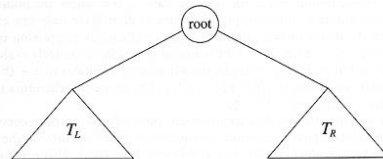
Algorithm *Inorder*(x)

Input: x is the root of a subtree.

1. **if** $x \neq \text{NULL}$
2. **then** $\text{Inorder}(\text{left}(x))$;
3. output $\text{key}(x)$;
4. $\text{Inorder}(\text{right}(x))$;

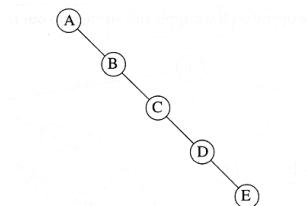
Binary Trees

- A tree in which each node has at most two children (0, 1, or 2)



**Generic
binary tree**

- The depth of an “average” binary tree is considerably smaller than N , even though in the worst case, the depth can be as large as $N - 1$.

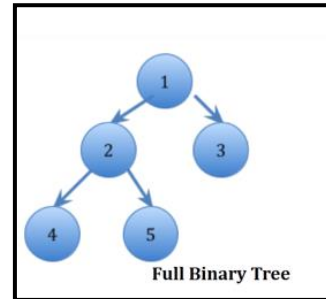
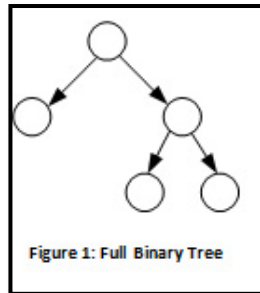


**Worst-case
binary tree**

Full and Complete Binary Tree

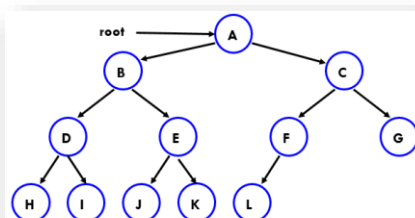
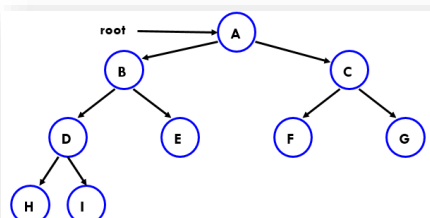
There are two common forms of binary trees:

1. **Full binary tree:** a binary tree T is full if each node is either **a leaf** or possesses **exactly two child nodes**.



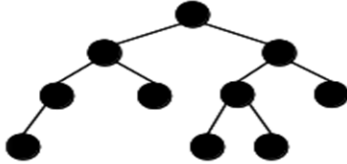
Full and Complete Binary Tree

A complete binary tree: is a binary tree, which is completely filled, with the possible exception of the bottom level, which is filled from left to right.

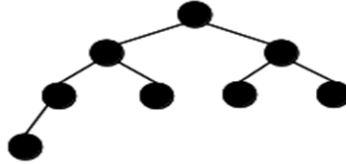


Full and Complete Binary Tree

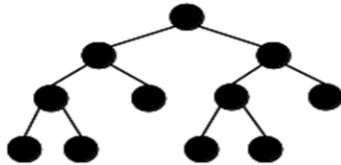
Neither complete nor full



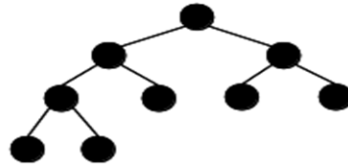
Complete but not full



Full but not complete



Complete and full



Node class/struct of Binary Tree

- Possible operations on the Binary Tree ADT
 - Parent, left_child, right_child, sibling, root, etc
- Implementation
 - Because a binary tree has at most two children, we can keep direct pointers to them

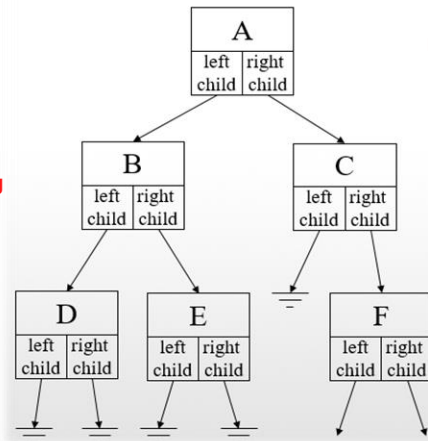
```
class BinaryNode
{
    // Friendly data; accessible by other package
    Object element;    // The data in the node
    BinaryNode left;   // Left child
    BinaryNode right;  // Right child
}
```

```
struct TreeNode
{
    ElementType Element;
    SearchTree Left;
    SearchTree Right;
};
```

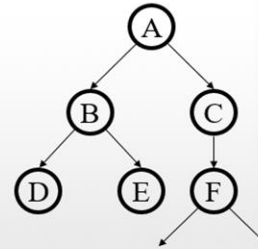
Figure 4.13 Binary tree node class

Binary Tree Representation

Each node is labeled as being either a left child or a right child

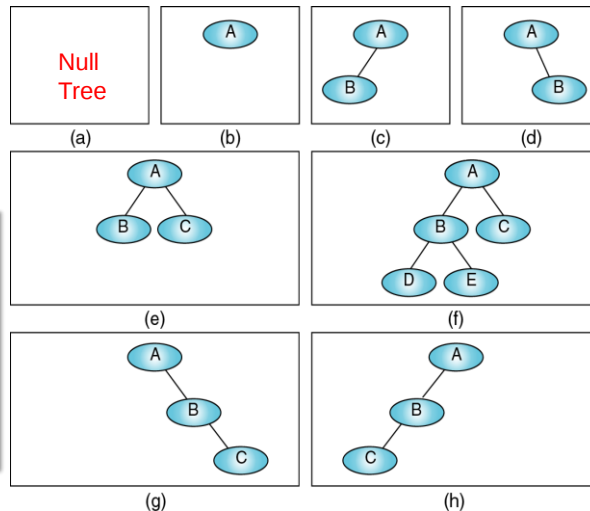
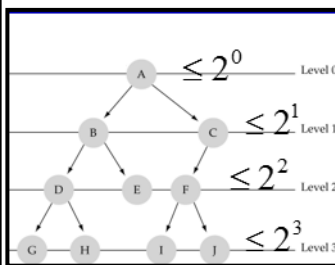


Maximum number of children for each node is 2



Binary Tree Representation

Max number of node in each level $\leq 2^L$ where $L=0,1,2,\dots,L-1$



Example: Expression Trees

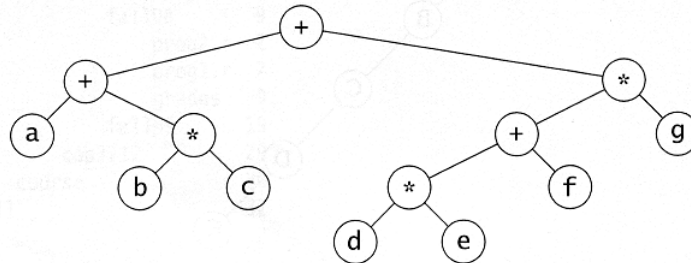


Figure 4.14 Expression tree for $(a + b * c) + ((d * e + f) * g)$

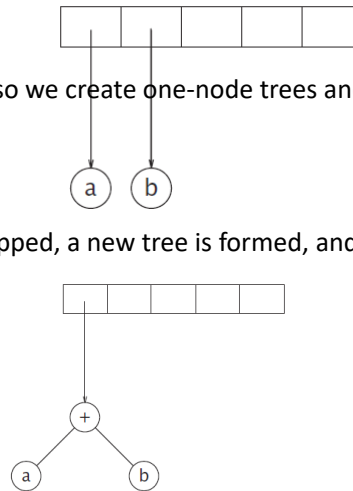
- Leaves are operands (constants or variables)
- The internal nodes contain operators
- Will not be a binary tree if some operators are not binary

Constructing an Expression Tree

- An algorithm to convert a postfix expression into an expression tree
 - Read the expression one symbol at a time.
 - If the symbol is an operand, create a one-node tree and push it onto a stack.
 - If the symbol is an operator, pop two trees T_1 and T_2 from the stack (T_1 is popped first) and
 - Form a new tree whose root is the operator and whose left and right children are T_2 and T_1 , respectively. This new tree is then pushed onto the stack.

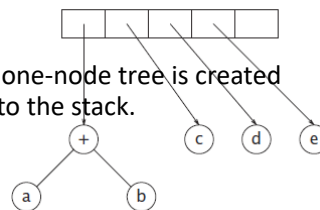
Example

- Suppose the input is
 $a\ b\ +\ c\ d\ e\ +\ * \ *$
- The first two symbols are operands, so we create one-node trees and push them onto a stack.
- Next, a $+$ is read, so two trees are popped, a new tree is formed, and it is pushed onto the stack.

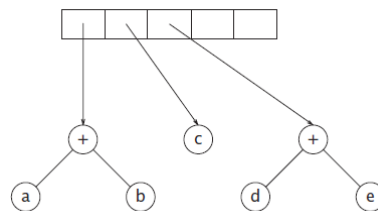


Example cont...

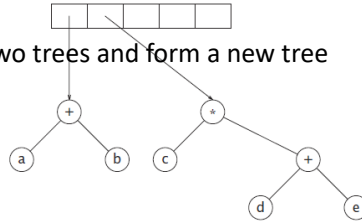
- Next, c, d, and e are read, and for each a one-node tree is created and the corresponding tree is pushed onto the stack.



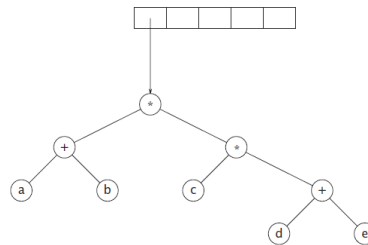
- Now a $+$ is read, so two trees are merged.



- Continuing, a * is read, so we pop two trees and form a new tree with a * as root.



- Finally, the last symbol is read, two trees are merged, and the final tree is left on the stack.

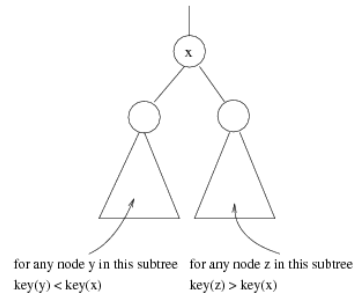


What about the time?

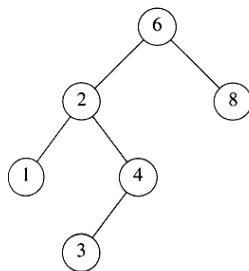
- Search ?
- Insert?
- Delete?
- ...

Binary Search Trees (BST)

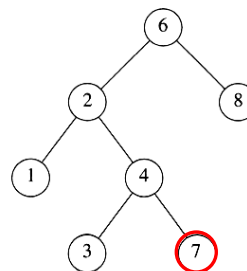
- A data structure for efficient searching, insertion and deletion
- Binary search tree property
 - For every node X
 - All the keys in its left subtree are smaller than the key value in X
 - All the keys in its right subtree are larger than the key value in X



Binary Search Trees



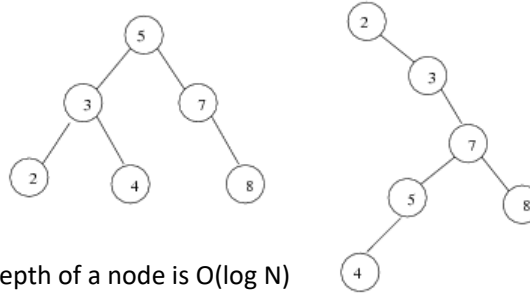
A binary search tree



Not a binary search tree

Binary Search Trees

The same set of keys may have different BSTs

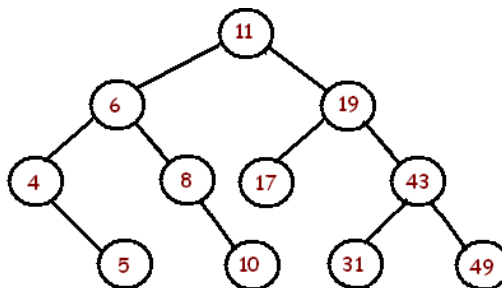


- Average depth of a node is $O(\log N)$
- Maximum depth of a node is $O(N)$

Constructing a Binary Search Tree

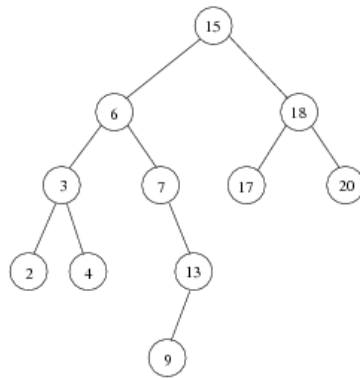
Exercise. Given a sequence of numbers:

11, 6, 8, 19, 4, 10, 5, 17, 43, 49, 31



Inorder Traversal of BST

- Inorder traversal of BST prints out all the keys *in sorted order*



Inorder: 2, 3, 4, 6, 7, 9, 13, 15, 17, 18, 20

BST Implementation

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

```
public void makeEmpty( )
{ root = null; }
```

```
public boolean isEmpty( )
{ return root == null; }
```

BST Implementation

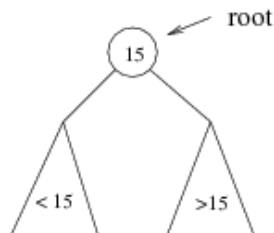
```
struct TreeNode;
typedef struct TreeNode *Position;
typedef struct TreeNode *SearchTree;
```

```
struct TreeNode
{
    ElementType Element;
    SearchTree Left;
    SearchTree Right;
};
```

```
SearchTree
MakeEmpty( SearchTree T )
{
    if( T != NULL )
    {
        MakeEmpty( T->Left );
        MakeEmpty( T->Right );
        free( T );
    }
    return NULL;
}
```

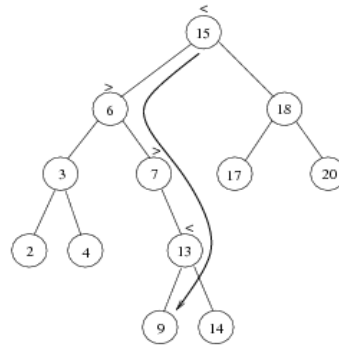
Searching BST

- If we are searching for 15, then we are done.
- If we are searching for a key < 15, then we should search in the left subtree.
- If we are searching for a key > 15, then we should search in the right subtree.



Searching (Find)

Example: Search for 9 ...



Search for 9:

1. compare 9:15(the root), go to left subtree;
2. compare 9:6, go to right subtree;
3. compare 9:7, go to right subtree;
4. compare 9:13, go to left subtree;
5. compare 9:9, found it!

Searching (Find)

- Find X: return a pointer to the node that has key X, or NULL if there is no such node

```
private boolean contains( AnyType x, BinaryNode<AnyType> t )
{
    if( t == null )
        return false;

    int compareResult = x.compareTo( t.element );

    if( compareResult < 0 )
        return contains( x, t.left );
    else if( compareResult > 0 )
        return contains( x, t.right );
    else
        return true;    // Match
}
```

- Time complexity: $O(\text{height of the tree})$

Searching (Find)

```

Position
Find( ElementType X, SearchTree T )
{
    if( T == NULL )
        return NULL;
    if( X < T->Element )
        return Find( X, T->Left );
    else
        if( X > T->Element )
            return Find( X, T->Right );
        else
            return T;
}

```

findMin/ findMax

- Goal: return the node containing the smallest (largest) key in the tree
- Algorithm: Start at the root and go left (right) as long as there is a left (right) child. The stopping point is the smallest (largest) element

Recursive implementation of findMin:

```

private BinaryNode<AnyType> findMin( BinaryNode<AnyType> t )
{
    if( t == null )
        return null;
    else if( t.left == null )
        return t;
    return findMin( t.left );
}

```

Non-recursive implementation of findMax:

```

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

    return t;
}

```

Time complexity = $O(\text{height of the tree})$

findMin/ findMax

- Goal: return the node containing the smallest (largest) key in the tree
- Algorithm: Start at the root and go left (right) as long as there is a left (right) child. The stopping point is the smallest (largest) element

Recursive implementation of findMin:

```
Position
FindMin( SearchTree T )
{
    if( T == NULL )
        return NULL;
    else
        if( T->Left == NULL )
            return T;
        else
            return FindMin( T->Left );
}
```

Non-recursive implementation of findMax:

```
Position
FindMax( SearchTree T )
{
    if( T != NULL )
        while( T->Right != NULL )
            T = T->Right;

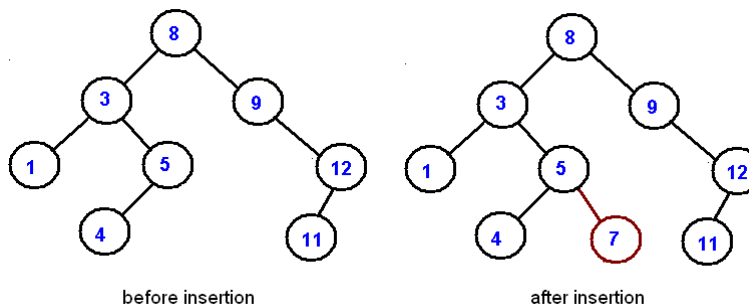
    return T;
}
```

Time complexity = $O(\text{height of the tree})$

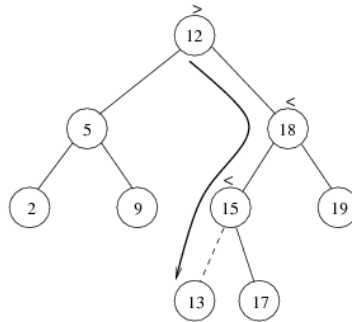
Insert

- The insertion procedure is quite similar to searching.
 - Start at the root and recursively go down the tree searching for a location in a BST to insert a new node.
 - If the element to be inserted is already in the tree, we are done (we do not insert duplicates). The new node will always replace a NULL reference.

Example: insert (7)



Insertion ... Example



Time complexity = $O(\text{height of the tree})$

```
private BinaryNode<AnyType> insert( AnyType x, BinaryNode<AnyType> t )
{
    if( t == null )
        return new BinaryNode<>( x, null, null );

    int compareResult = x.compareTo( t.element );

    if( compareResult < 0 )
        t.left = insert( x, t.left );
    else if( compareResult > 0 )
        t.right = insert( x, t.right );
    else
        ; // Duplicate; do nothing
    return t;
}
```

```

SearchTree
Insert( ElementType X, SearchTree T )
{
    if( T == NULL )
    {
        /* Create and return a one-node tree */
        T = malloc( sizeof( struct TreeNode ) );
        if( T == NULL )
            FatalError( "Out of space!!!" );
        else
        {
            T->Element = X;
            T->Left = T->Right = NULL;
        }
    }
    else
        if( X < T->Element )
            T->Left = Insert( X, T->Left );
        else
            if( X > T->Element )
                T->Right = Insert( X, T->Right );
            /* Else X is in the tree already; we'll do nothing */
    return T; /* Do not forget this line!! */
}

```

Deletion

- When we delete a node, we need to consider how we take care of the children of the deleted node.
 - This has to be done such that the property of the search tree is maintained.
- Deletion is somewhat more tricky than insertion.
- There are several cases to consider. A node to be deleted may be:
 1. not in a tree;
 2. is a leaf;
 3. has only one child;
 4. has two children.

Deletion under Different Cases

- Case 1: the node is a leaf
 - Delete it immediately
- Case 2: the node has one child
 - The procedure of deletion is identical to deleting a node from a linked list - Adjust a pointer from the parent to bypass that node

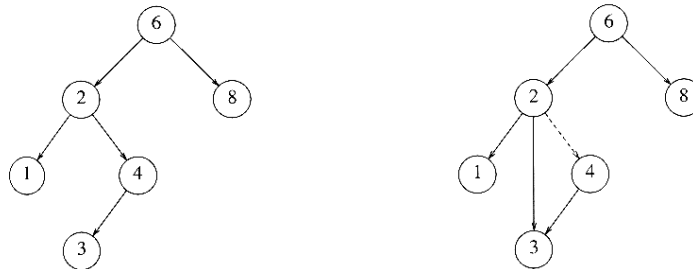
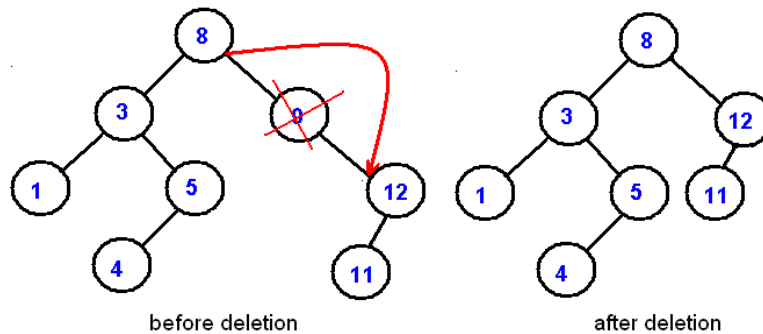


Figure 4.24 Deletion of a node (4) with one child, before and after

Case 2: Example



Deletion Case 3

- Case 3: the node has 2 children
 - Replace the key of that node with the minimum element at the right subtree
 - Delete that minimum element
 - Has either no child or only right child because if it has a left child, that left child would be smaller and would have been chosen. So invoke case 1 or 2.

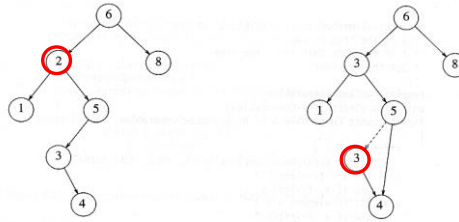
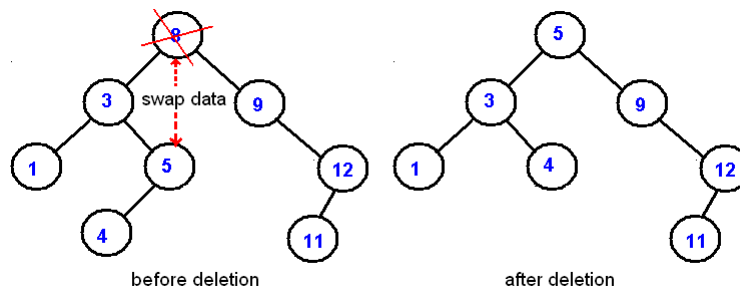


Figure 4.25 Deletion of a node (2) with two children, before and after

- Time complexity = $O(\text{height of the tree})$

Case 3: Example



Delete implementation

```
private Node<T> delete(Node<T> p, T toDelete)
{
    if (p == null) throw new RuntimeException("cannot delete.");
    else
        if (compare(toDelete, p.data) < 0)
            p.left = delete(p.left, toDelete);
        else
            if (compare(toDelete, p.data) > 0)
                p.right = delete(p.right, toDelete);
            else
                {
                    if (p.left == null) return p.right;
                    else
                        if (p.right == null) return p.left;
                        else
                            {
                                // get data from the rightmost node in the left subtree
                                p.data = retrieveData(p.left);
                                // delete the rightmost node in the left subtree
                                p.left = delete(p.left, p.data) ;
                            }
                }
    return p;
}
```

```
SearchTree
Delete( ElementType X, SearchTree T )
{
    Position TmpCell;

    if( T == NULL )
        Error( "Element not found" );
    else
        if( X < T->Element ) /* Go left */
            T->Left = Delete( X, T->Left );
        else
            if( X > T->Element ) /* Go right */
                T->Right = Delete( X, T->Right );
            else /* Found element to be deleted */
                if( T->Left && T->Right ) /* Two children */
                {
                    /* Replace with smallest in right subtree */
                    TmpCell = FindMin( T->Right );
                    T->Element = TmpCell->Element;
                    T->Right = Delete( T->Element, T->Right );
                }
                else /* One or zero children */
                {
                    TmpCell = T;
                    if( T->Left == NULL ) /* Also handles 0 children */
                        T = T->Right;
                    else if( T->Right == NULL )
                        T = T->Left;
                    free( TmpCell );
                }
    return T;
}
```