

BACS2063 Data Structures and Algorithms

BINARY TREES

Chapter 9

Learning Outcomes

At the end of this lecture, you should be able to

- Describe applications of binary trees such as expression trees and decision trees.
- Implement binary trees and binary search trees
- Discuss the factors that affect the efficiency of the binary search tree operations

Tree Concepts

- Previous ADTs place data in *linear order*.
- Some data organizations require categorizing data into groups, subgroups
 - This is **hierarchical** classification
 - Data items appear at various levels within the organization
- A tree provides a hierarchical organization in which data items have **ancestors** and **descendants**
 - This organization is richer and more varied than any other ADT

Hierarchical Organization

- Example: Family trees

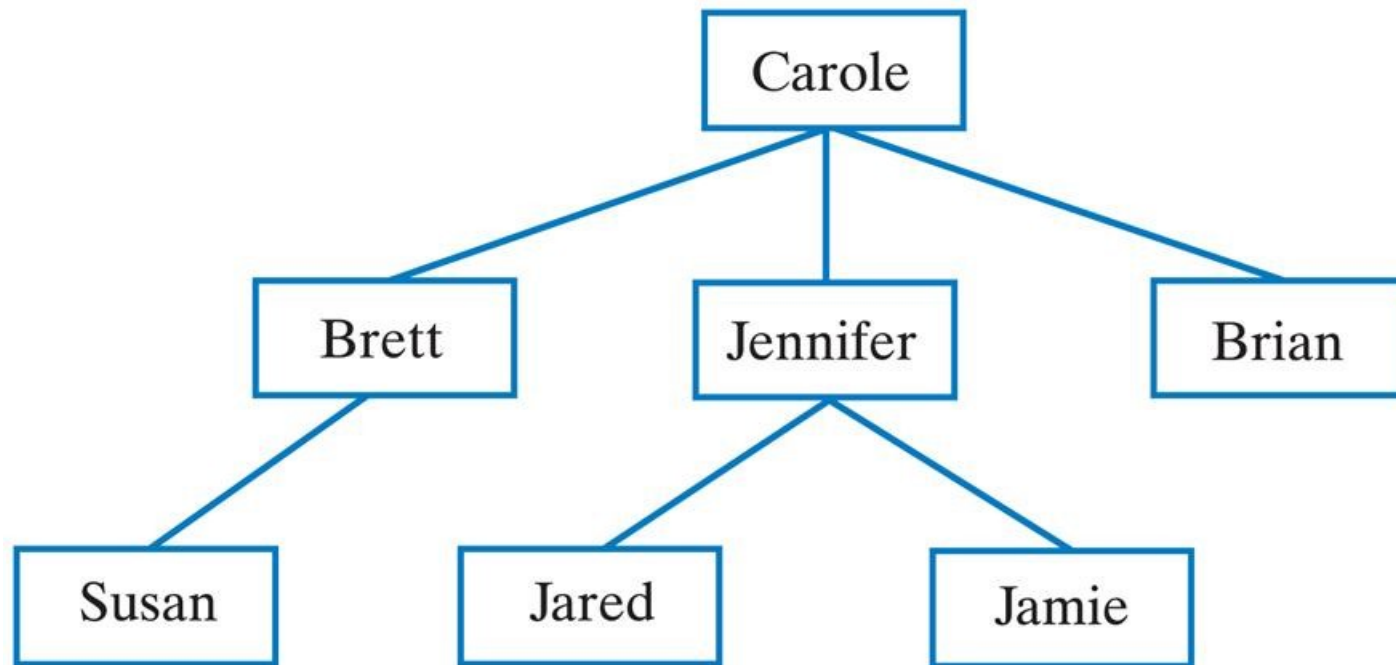


Fig. 25-1 Carole's children and grandchildren.

Hierarchical Organization

- Example: Organization Charts

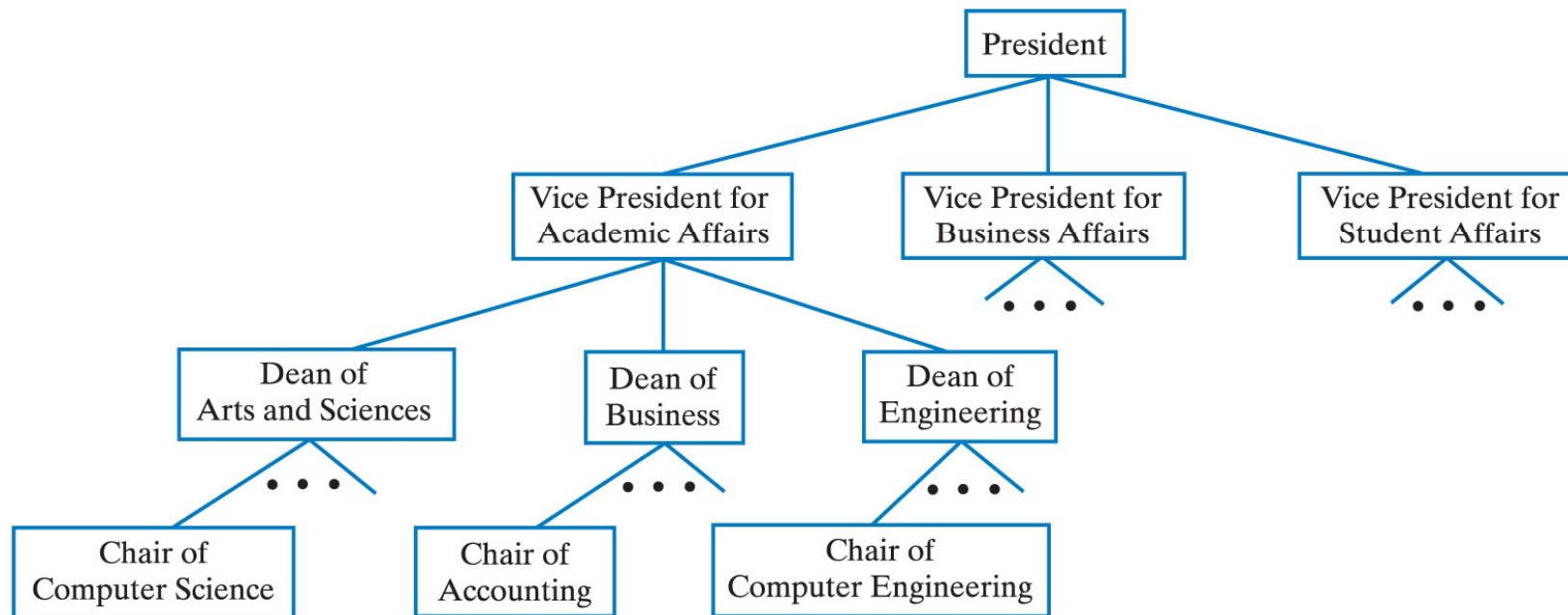


Fig. 25-3 A university's administrative structure.

Hierarchical Organization

- Example: File Directories

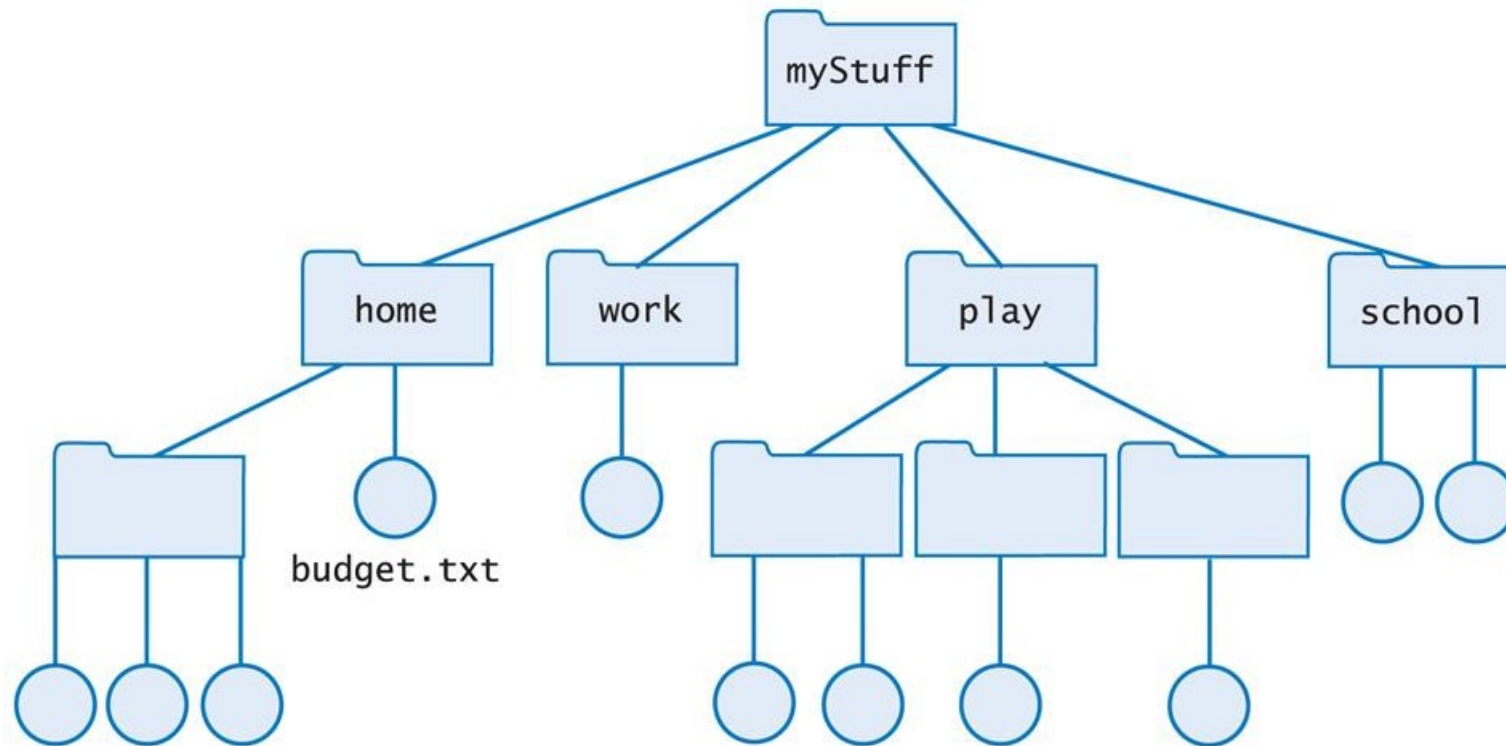


Fig. 25-4 Computer files organized into folders

Tree Terminology

- A tree is a *set of nodes connected by edges*.
- The edges indicate relationships among nodes.
- Nodes are arranged in *levels*.
 - Indicate the nodes' hierarchy
 - Top level is a single node called the *root*

Tree Terminology

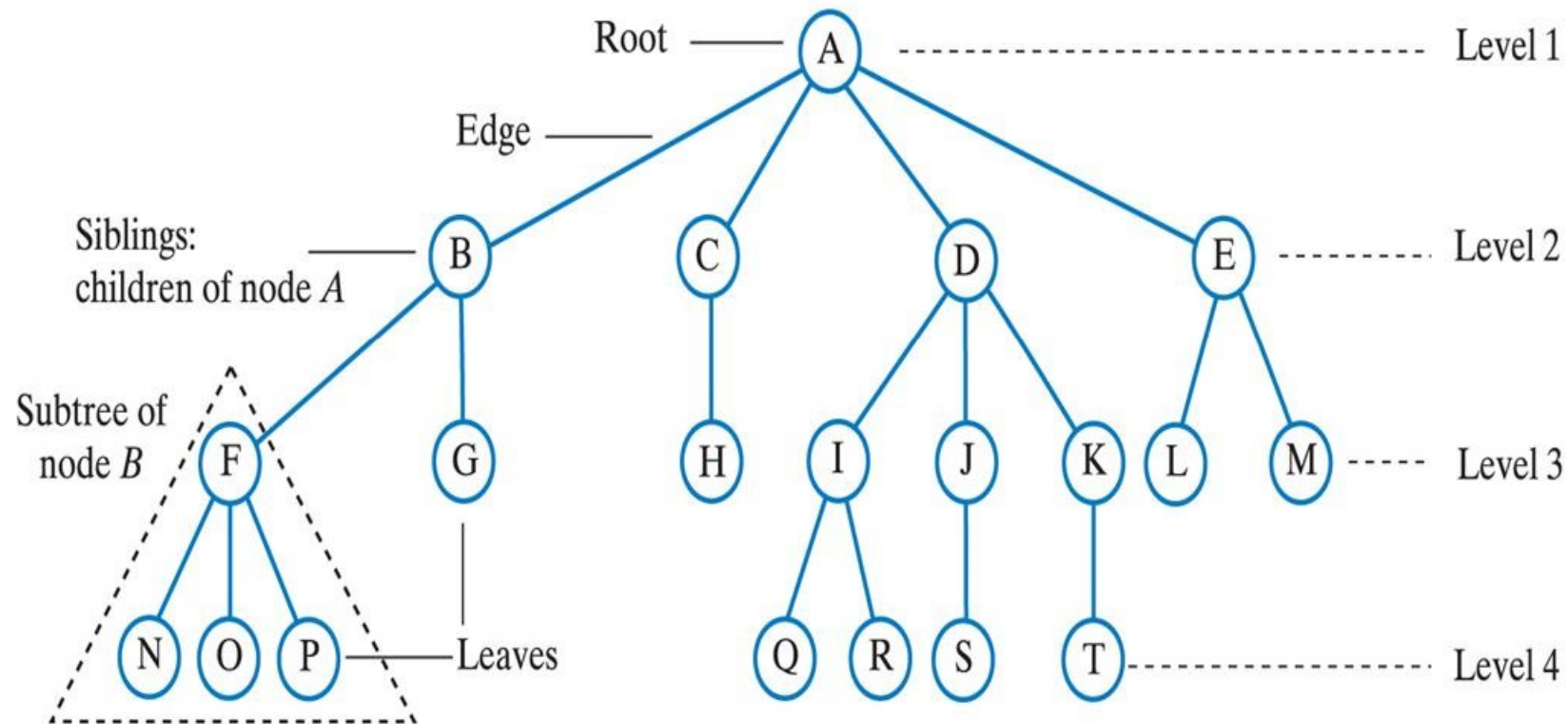


Fig. 25-5 A tree equivalent to the tree in Fig. 25-4

Tree Terminology

- Nodes at a given level are *children* of nodes of the previous level
- A node with children is the *parent* node of those children – node *A* is the parent of nodes *B*, *C*, *D* and *E*.
- Nodes with the same parent are *siblings* - nodes *B*, *C*, *D* and *E* have the same parent *A*.
- A node with no children is a *leaf node* – e.g. nodes *N*, *O* and *P*.
- The only node with no parent is the root node
 - All others have one parent each

Tree Terminology

- A node is reached from the root by a *path*.
 - The length of the path is the number of edges that compose it
- The *height* of a tree is the number of levels in the tree.
 - Height of tree $T = 1 + \text{height of the tallest subtree of } T$.
- The *subtree* of a node is a tree rooted at a child of that node.

Binary Trees

- A tree in which each node has at most two children.

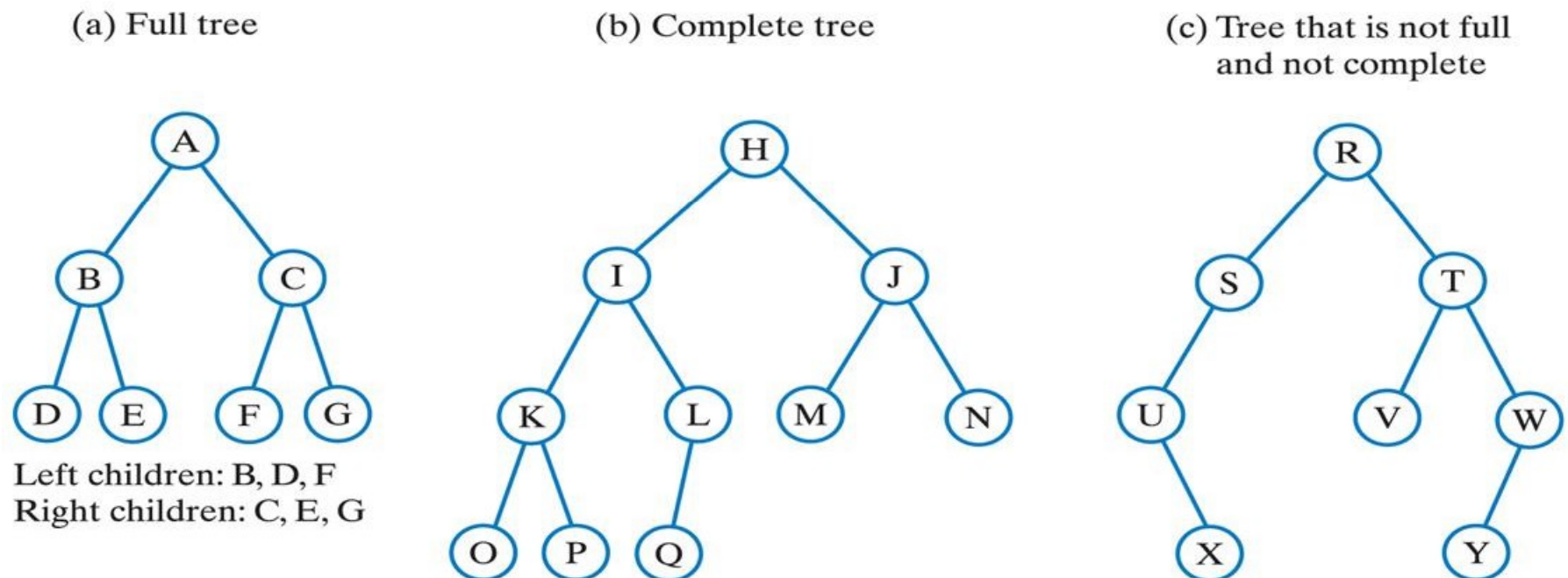
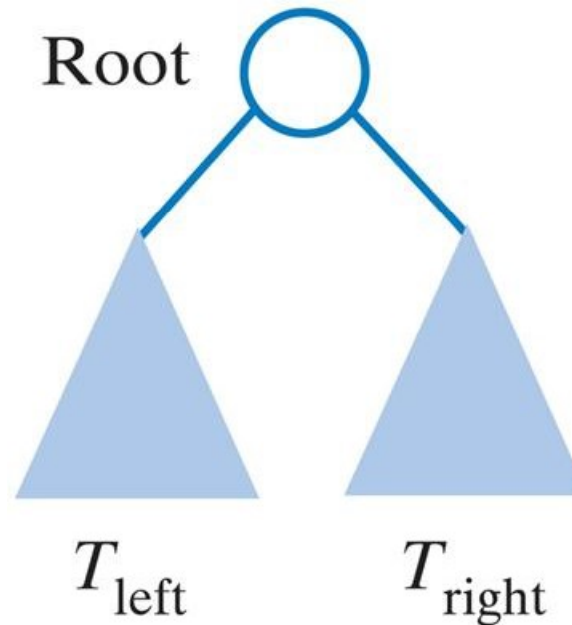


Fig. 25-6 Three binary trees.

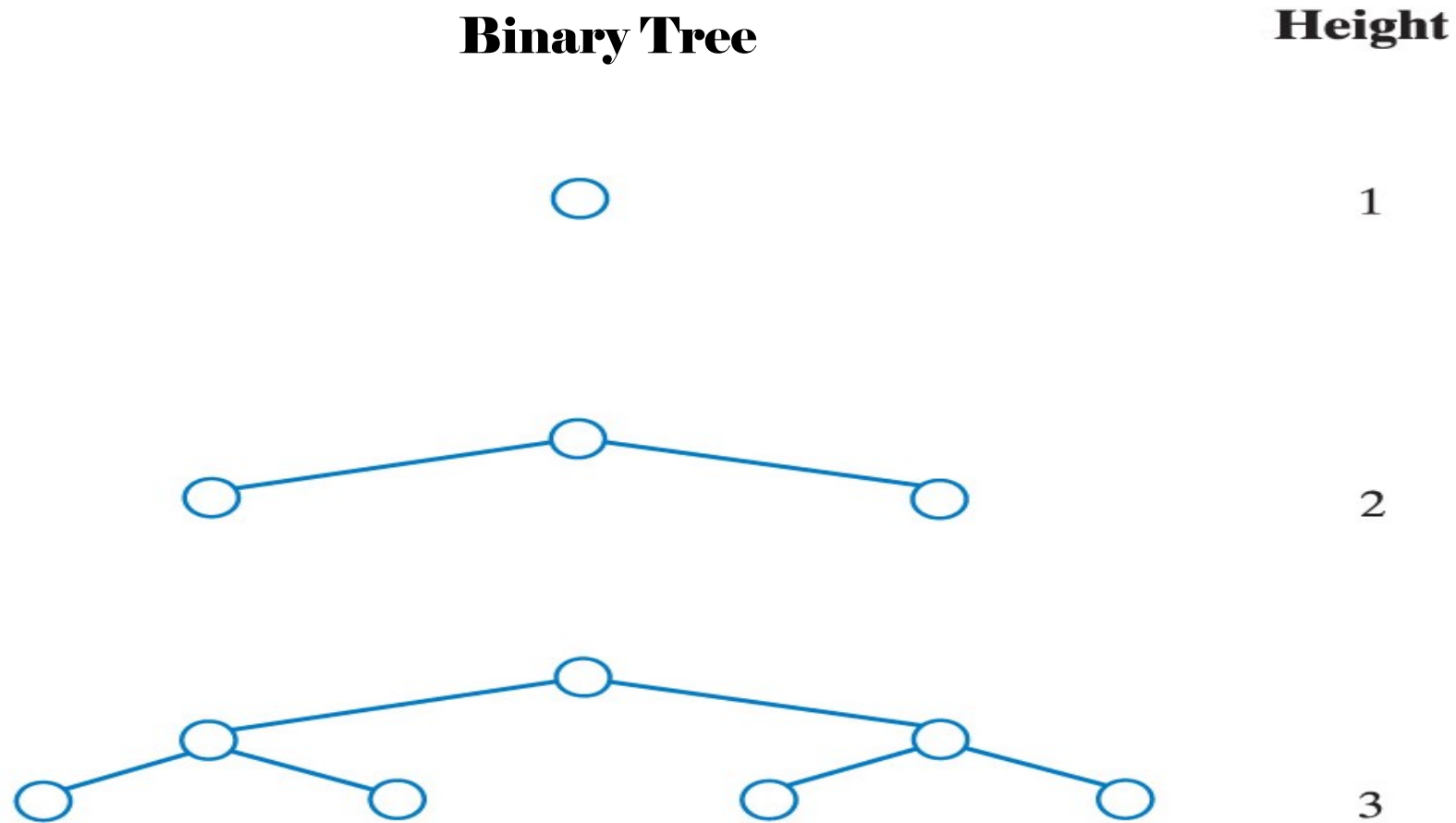
Binary Trees

- A binary tree is either empty or has the following form



– Where T_{left} and T_{right} are binary trees

Height of Binary Trees

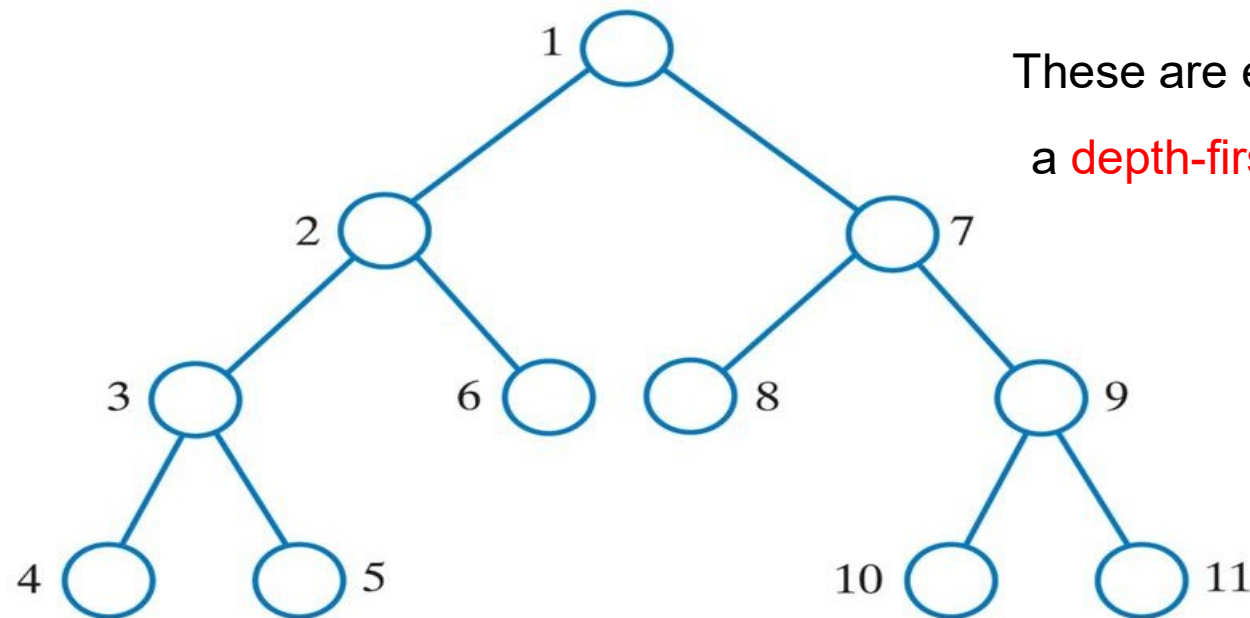


Traversals of a Tree

- Tree **traversal**
 - The process of stepping through / visiting all the nodes in the tree.
 - Each node is visited / processed exactly once during a traversal.
- Visiting a node
 - Processing the data within a node
- A traversal can pass through a node without visiting it at that moment

Preorder Traversal

- Visit root **before** the subtrees.
 - Visit the root
 - Visit all the nodes in the root's left subtree
 - Visit all the nodes in the root's right subtree



These are examples of
a **depth-first traversal**.

Fig. 25-8 The visitation order of a preorder traversal. ¹⁵

Inorder Traversal

- Visit root **between** visiting the subtrees.
 - Visit all the nodes in the root's left subtree
 - Visit the root
 - Visit all the nodes in the root's right subtree

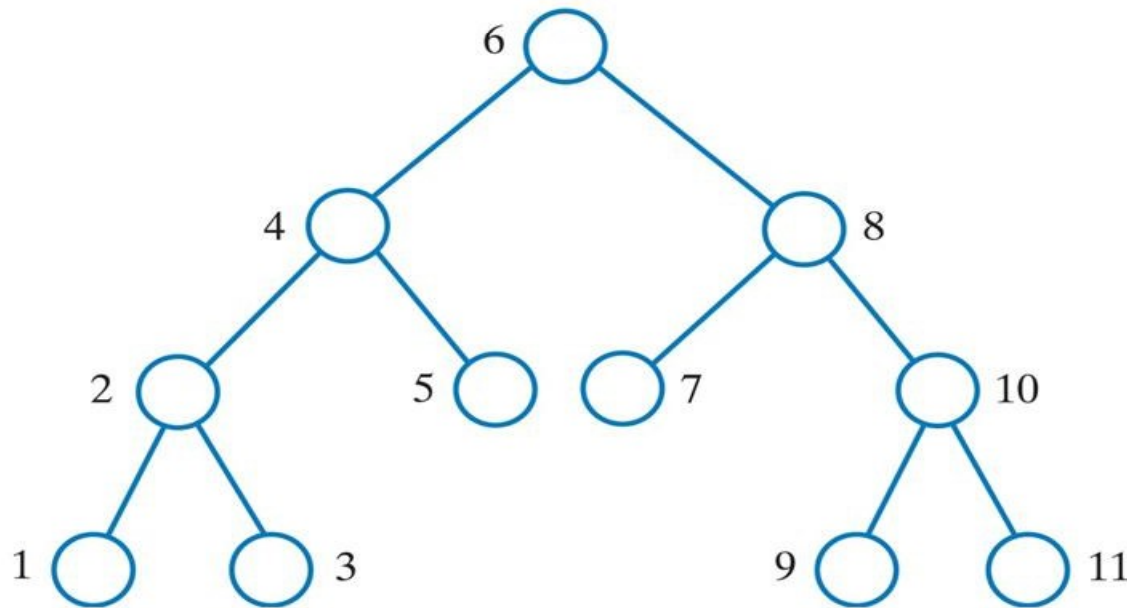


Fig. 25-9 The visitation order of an inorder traversal.

Postorder Traversal

- Visit root **after** visiting the subtrees.
 - Visit all the nodes in the root's left subtree
 - Visit all the nodes in the root's right subtree.
 - Visit the root

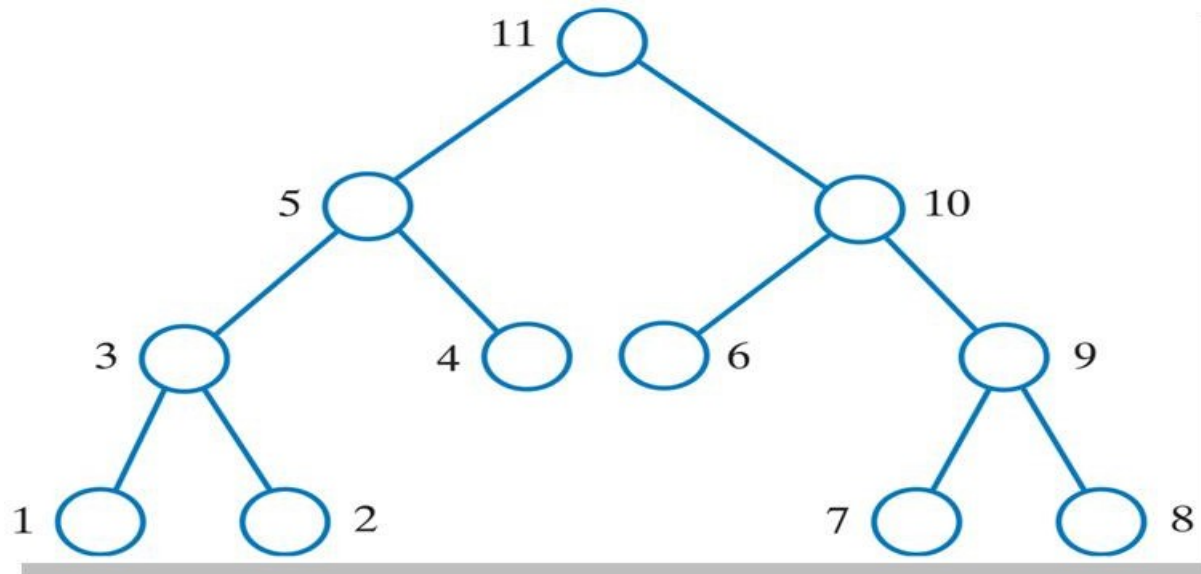
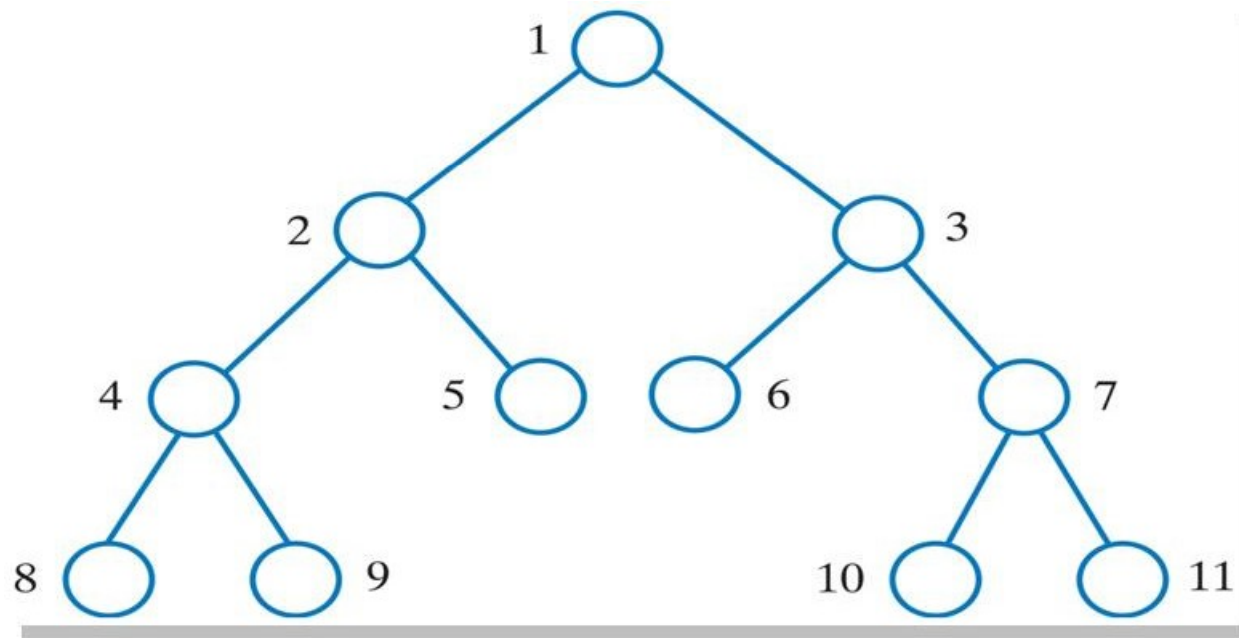


Fig. 25-10 The visitation order of a postorder traversal. ¹⁷

Level-order Traversal *[Optional]*

- Begin at the root, visit nodes one level at a time



This is an example of
a **breadth-first traversal**.

Fig. 25-11 The visitation order of a level-order traversal.

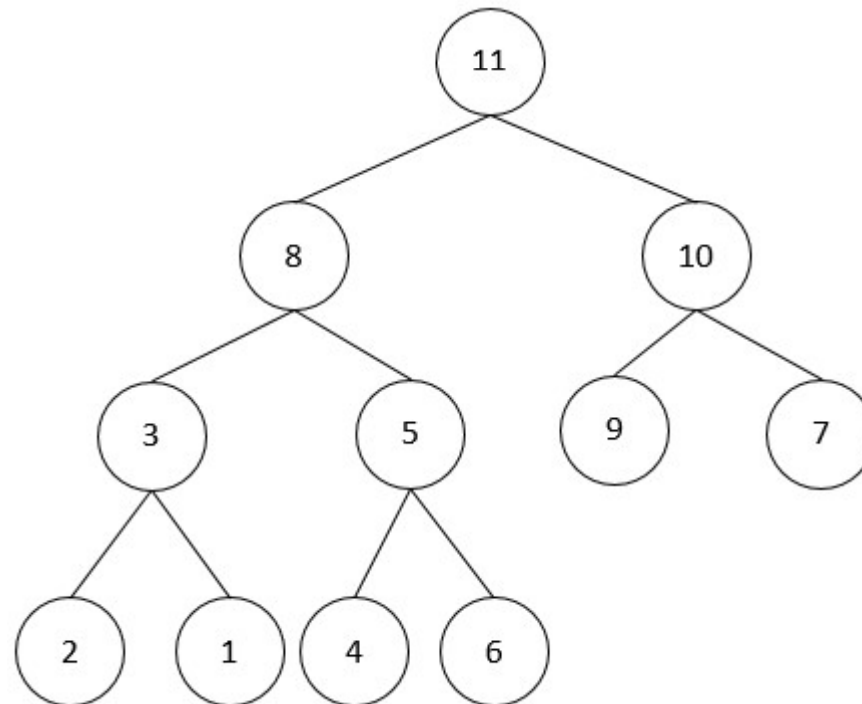


Exercise

- Reconstruct a unique *binary tree* for the following traversal outputs

(i) Preorder: 11, 8, 3, 2, 1, 5, 4, 6, 10, 9, 7

Inorder: 2, 3, 1, 8, 4, 5, 6, 11, 9, 10, 7



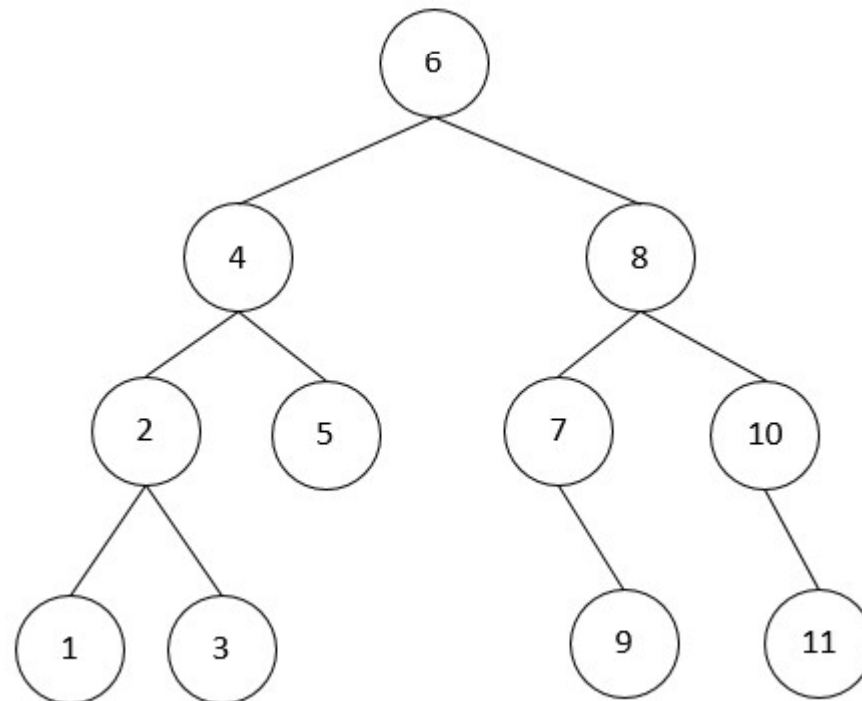


Exercise

- Reconstruct a unique *binary tree* for the following traversal outputs

(i) Preorder: 6,4,2,1,3,5,8,7,9,10,11

Inorder: 1,2,3,4,5,6,7,9,8,10,11



An Interface for Binary Trees

- **BinaryTreeInterface.java**

```
public interface BinaryTreeInterface<T>    {  
    public T getRootData();  
    public boolean isEmpty();  
    public void clear();  
    public void setTree(T rootData);  
    public void setTree(T rootData,  
        BinaryTreeInterface<T> leftTree,  
        BinaryTreeInterface<T> rightTree);  
}
```

Building a binary tree

Consider a client program to build the following binary tree:

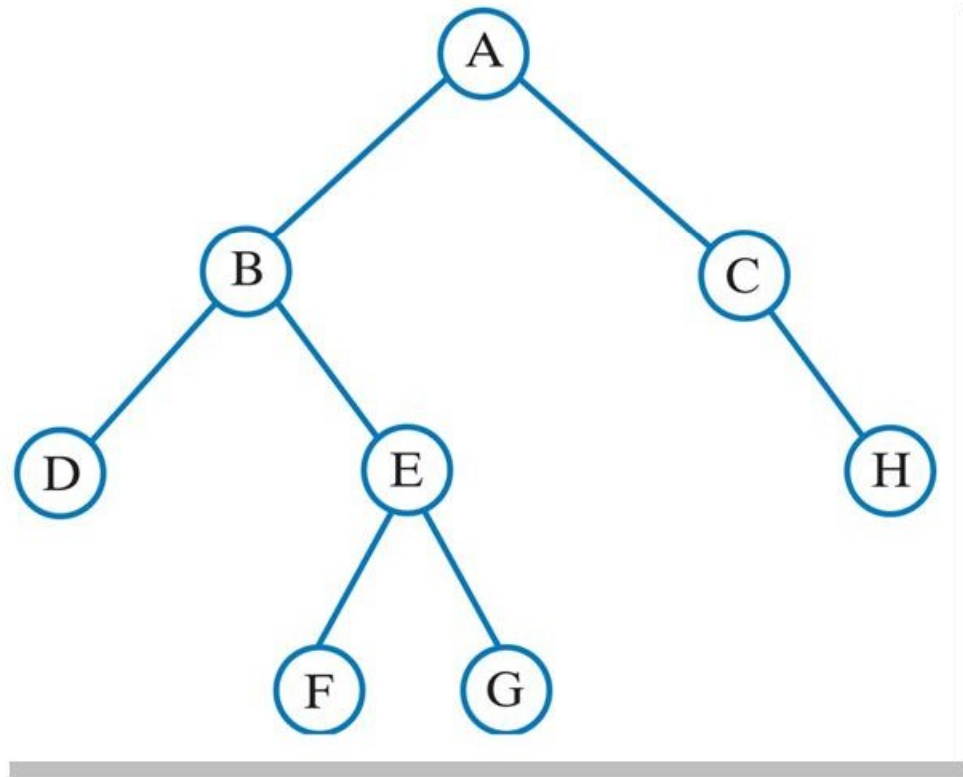


Fig. 25-13 A binary tree whose nodes contain one-letter strings

Building a binary tree

Given that the class **BinaryTree** implements the interface **BinaryTreeInterface**, we can build the given binary tree in Figure 25-13 (of previous slide) as follows:

- Represent each of its leaves (D, F, G, H) as a one-node tree each.
- Moving up the tree from its leaves,
 - Use method **setTree()** to form the next level of subtrees (i.e. subtree E, B, C)
 - Use method **setTree()** to form the final tree (A)

Sample Code

In Chapter9\binarytree folder:

- **BinaryTreeInterface.java**
- **BinaryTree.java**
- **BinaryTreeDriver.java**

Binary Tree Example: *Expression Trees*

An expression tree represents an algebraic expression whose operators are binary.

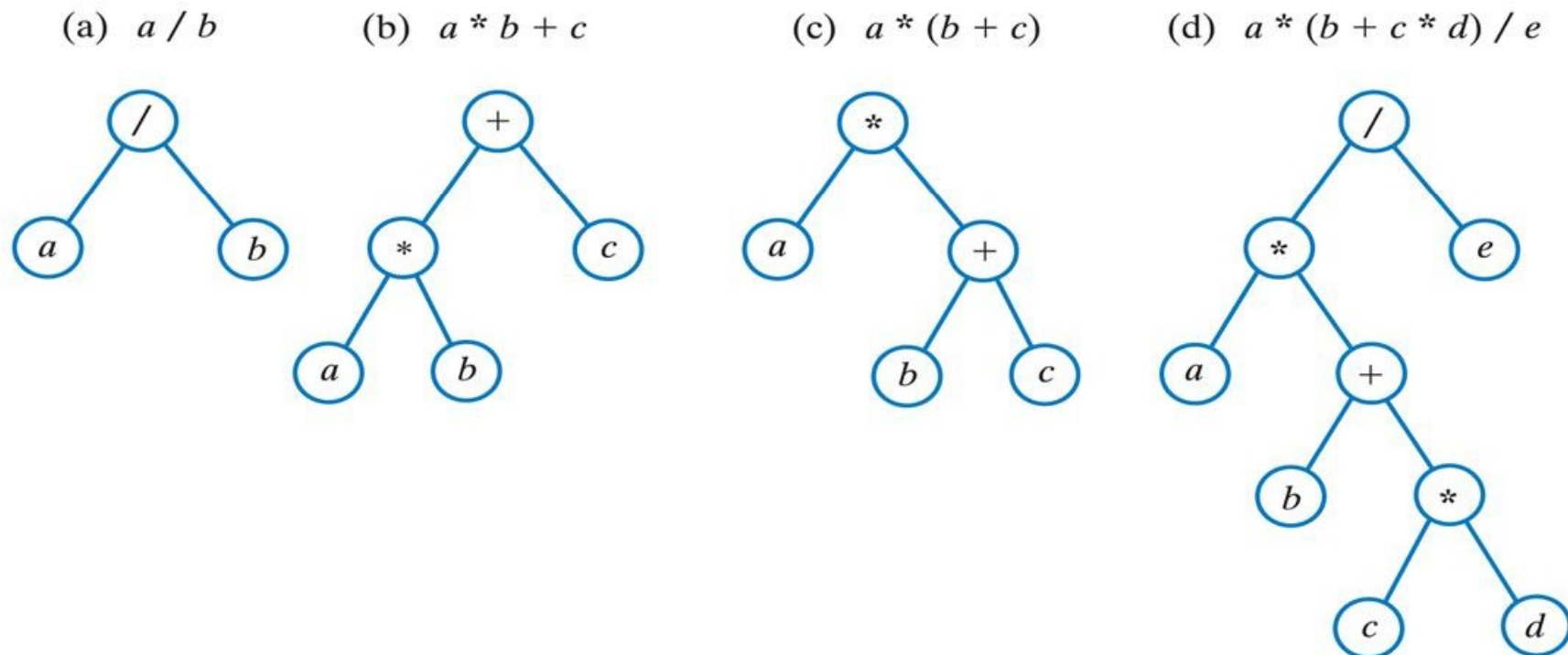


Fig. 25-14 Expression trees for four algebraic expressions.

Traversal of Expression Trees

- An **inorder traversal** of an expression tree visits variables and operators in the tree in the order in which they appear in the original **infix expression**.
- A **preorder traversal** produces the **prefix form** of the expression.
- A **postorder traversal** produces the **postfix form** of the expression.

Algorithm evaluate

```
Algorithm evaluate(expressionTree)
if (expressionTree is empty)
    return 0
else {
    firstOperand = evaluate(left subtree of
                             expressionTree)
    secondOperand = evaluate(right subtree of
                             expressionTree)
    operator = the root of expressionTree
    return the result of the operation operator
           and its operands firstOperand and
           secondOperand
}
```

Binary Tree Example: *Decision Trees*

A decision tree can be the basis of an expert system

- Helps users solve problems, make decisions

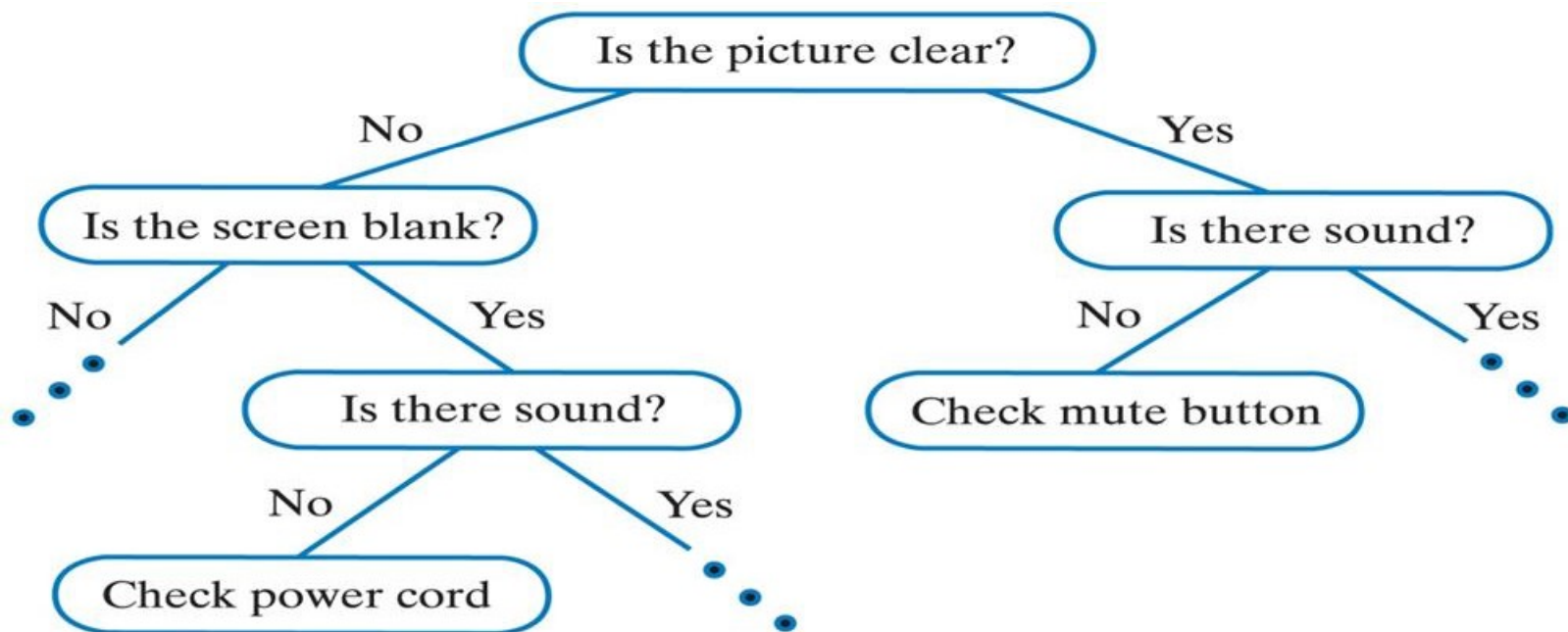


Fig. 25-15 A portion of a binary decision tree.

Decision Tree for a Guessing Game (1)

- Example: Guess-the-Country

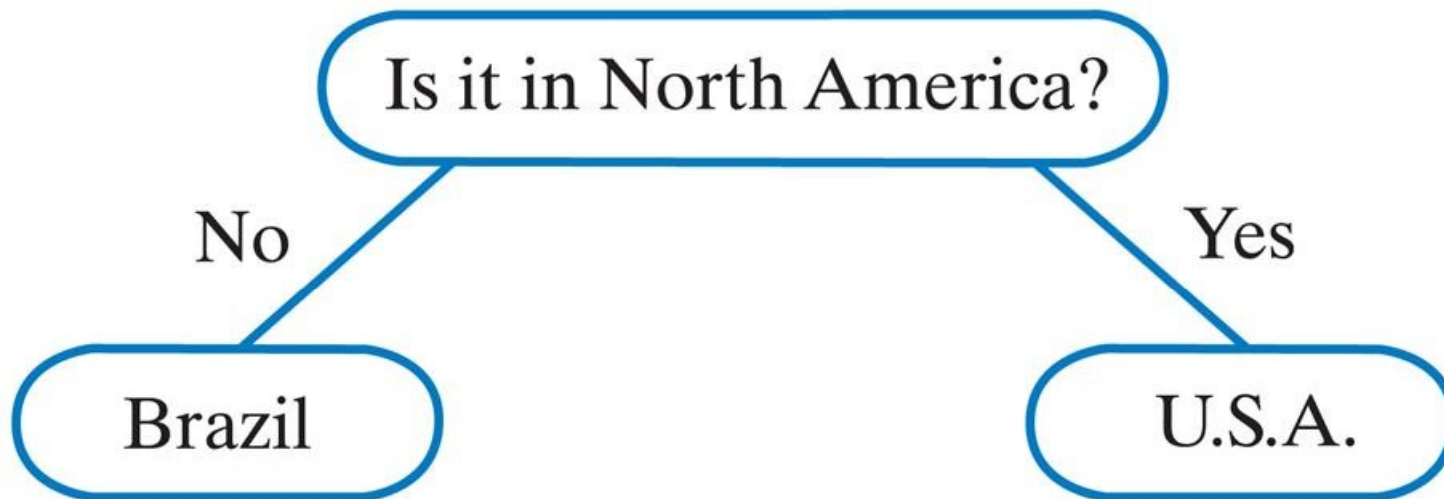


Fig. 25-16 An initial decision tree for a guessing game.

Decision Tree for a Guessing Game (2)

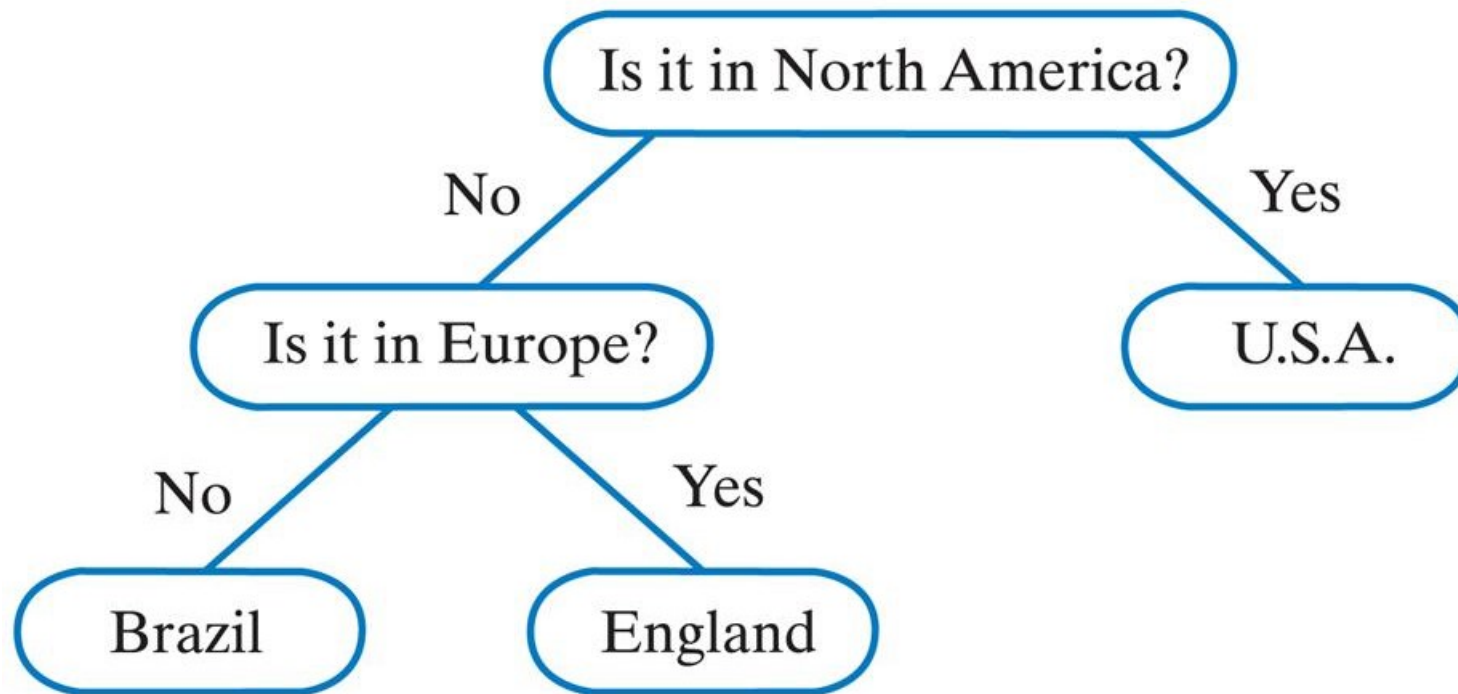


Fig. 25-17 The decision tree for a guessing game after acquiring another fact.

Traversing Recursively

- Postorder traversal
 - Public method for user, calls private method

```
public void postorderTraverse() {  
    postorderTraverse(root);  
}  
  
private void  
    postorderTraverse(BinaryNodeInterface<T> node){  
    if (node != null) {  
        postorderTraverse(node.getLeft());  
        postorderTraverse(node.getRight());  
        System.out.print(node.getData() + " ");  
    }  
}
```

Implementing Tree Traversals

- In the **BinaryTree** class, the method **postorderTraverse()** carried out a postorder traversal of the tree.
- However, this method can only display the data during traversal.
- To provide the client with more flexibility, we should define the traversals as *iterators*.
 - In this way, the client can do more than simply display data during a visit and we can control when each visit takes place.

Tree traversals using iterators

- Use an *iterator* that has the methods **hasNext()** and **next()**, as given in the interface **java.util.Iterator**.
- As illustrate with lists, we can define a method that returns such an iterator.
- Since we can have several kinds of tree traversals, a tree class could have several methods that each return a different kind of iterator.

Tree Implementation

- The most common implementation of a tree uses a linked structure.
- Nodes similar to those used in linked lists represent each element in the tree.

Nodes in a Binary Tree

- A node object that represents a node in a tree references both the data and the node's children.
- It contains a *reference to a data object* and *references to its left child and right child*, which are other nodes in the tree.
 - Either reference to a child could be **null**.
 - If both of them are **null**, the node is a leaf node.



Fig. 26-1 A node in a binary tree.

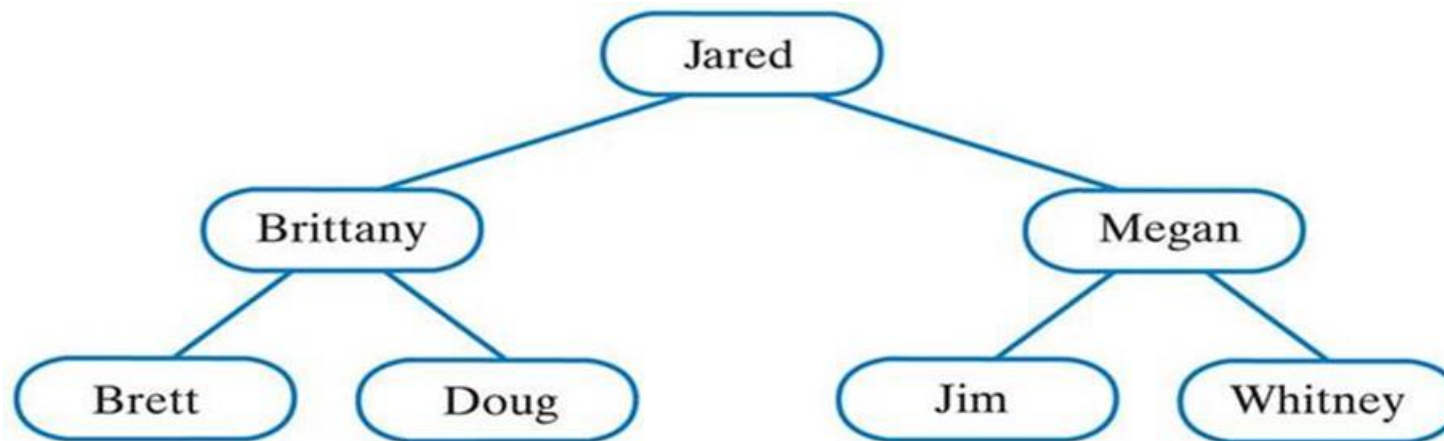
Node for Binary Trees

```
private class Node {  
    private T data;  
    private Node left;  
    private Node right;  
    . . .  
}
```

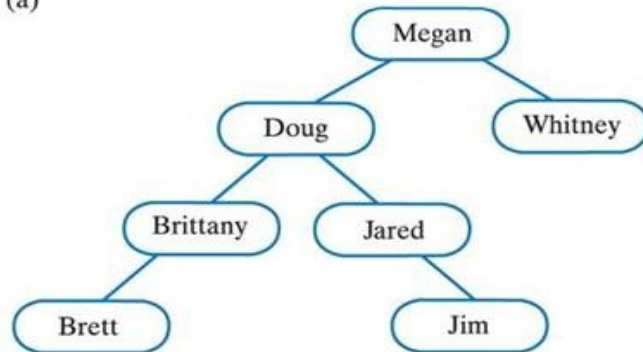
Binary Search Trees

- A search tree organizes its data so that a search is more efficient
- Binary search tree
 - Nodes contain **Comparable** objects
 - A node's data is greater than the data in the node's *left subtree*
 - A node's data is less than the data in the node's *right subtree*

Binary Search Trees



(a)



(b)

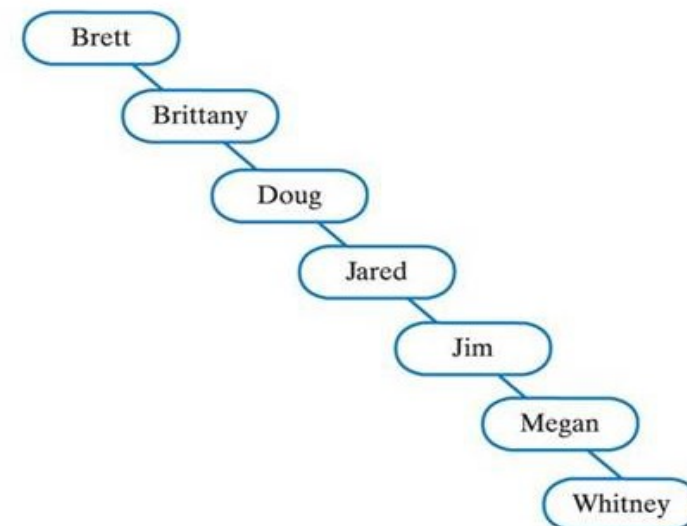


Fig. 25-18 A binary search tree of names.

Binary Search Trees

- The *efficiency of a search* depends on the *number of comparisons that a successful search requires*, i.e. the number of nodes along the path from the root to the node that contains the desired item.
- The height of a tree directly affects the length of the longest path from the root to a leaf. Hence, the height affects the efficiency of a worst-case search.
- Searching a binary search tree of *height h* is $O(h)$.

Search Tree Characteristics

- A search tree stores data in a way that facilitates efficient searching.
- The nature of a binary search tree enables us to search it using a simple recursive algorithm

Searching in Search Trees

Like performing a binary search on a (sorted) array:

- For a **sorted array**
 - Search one of *two halves* of the array
- For the **binary search tree**
 - Search one of two subtrees of the binary search tree

Implementation of Tree Search

- Due to the recursive nature of the binary search tree structure, it is easier to implement its operations using *recursion*.
- *Note:*
 - The **add**, **contains**, **getEntry** and **remove** operations need to search through the binary search tree in their implementation.

Recursive Search Algorithm

Algorithm bstSearch(binarySearchTree, desiredObject)

// Searches a binary search tree for a given object.

// Returns true if the object is found.

if (binarySearchTree *is empty*)

return false

else if (desiredObject == *object in the root of* binarySearchTree)

return true

else if (desiredObject < *object in the root of* binarySearchTree)

return bstSearch(*left subtree of* binarySearchTree, desiredObject)

else

return bstSearch(*right subtree of* binarySearchTree,
desiredObject)

Sample Code

In Chapter9\binarytree folder:

- `BinarySearchTreeInterface.java`
- `BinarySearchTree.java`
- `BinarySearchTreeDriver.java`
- `QueueInterface.java`
- `ArrayQueue.java`

Binary Search Tree Implementation

Source code:

- **BinarySearchTreeInterface.java**
 - Operations: **contains**, **getEntry**, **add**, **remove**, **isEmpty**, **clear**, **getPreorderIterator**, **getInorderIterator**, **getPostorderIterator**
- **BinarySearchTree.java**
 - Implements the interface **BinarySearchTreeInterface**
 - Contains private inner classes:
 - **Node** - to represent a binary search tree node
 - **ReturnObject** – required for the private **removeEntry** method to return the removed node's data object

Iterators for Tree Traversals

- Provides the creation of iterator objects to perform tree traversals.

```
import java.util.Iterator;  
  
...  
public Iterator<T> getPreorderIterator();  
public Iterator<T> getPostorderIterator();  
public Iterator<T> getInorderIterator();
```

getInorderIterator() method

```
public Iterator<T> getInorderIterator() {  
    return new InorderIterator();  
}
```

Inner class **InorderIterator**

- Define the class **InorderIterator** as a *private inner class* of **BinarySearchTree**.
- Has a queue object as a data field.

```
private class InorderIterator implements Iterator<T> {  
    private QueueInterface<T> queue = new ArrayQueue<T>();  
    public InorderIterator() {  
        inorder(root);  
    }  
    private void inorder(BinaryNodeInterface<T> treeNode) {  
        . . .  
    }  
    . . .  
}
```


Inner class **InorderIterator**

- The constructor invokes method **inorder()**.
- In method **inorder()**, the “visit” results in the current node’s data being enqueued into the queue.

```
public InorderIterator() {  
    inorder(root);  
}  
  
private void inorder(BinaryNodeInterface<T> treeNode) {  
    if (treeNode != null) {  
        inorder(treeNode.getLeft());  
        queue.enqueue(treeNode.getData());  
        inorder(treeNode.getRight());  
    }  
}
```

Method **next()**

- Removes and returns the next entry in the queue.

```
public T next() {  
    if (!queue.isEmpty())  
        return queue.dequeue();  
    else  
        throw new NoSuchElementException();  
}
```

Methods **getEntry** and **findEntry**

- Method **getEntry** returns the located data object.
- Usual strategy for methods with recursive algorithms is applied throughout the class **BinarySearchTree**, i.e.:
 - Implement the actual recursive search as a private method **findEntry** that the public method **getEntry** invokes.

The method **getEntry**

```
public T getEntry(T entry) {  
    return findEntry(root, entry);  
}  
  
private T findEntry(BinaryNode rootNode, T entry) {  
    T result = null;  
    if (rootNode != null) {  
        T rootEntry = rootNode.data;  
  
        if (entry.equals(rootEntry))  
            result = rootEntry;  
        else if (entry.compareTo(rootEntry) < 0)  
            result = findEntry(rootNode.left, entry);  
        else  
            result = findEntry(rootNode.right, entry);  
    }  
    return result;  
}
```

The method **contains**

- Method **contains** simply calls **getEntry** to see whether a given entry is in the tree

```
public boolean contains(T entry) {  
    return getEntry(entry) != null;  
}
```

Adding an Entry

- Every addition to a binary search tree adds a new leaf to the tree.

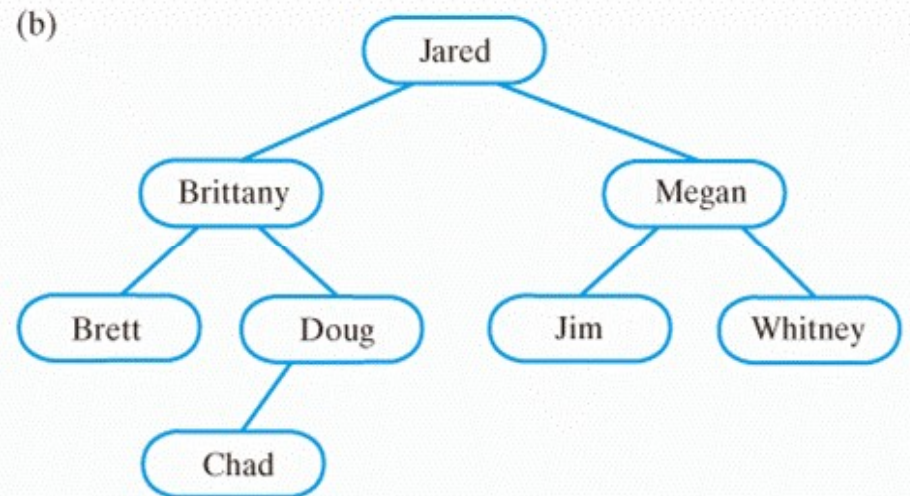
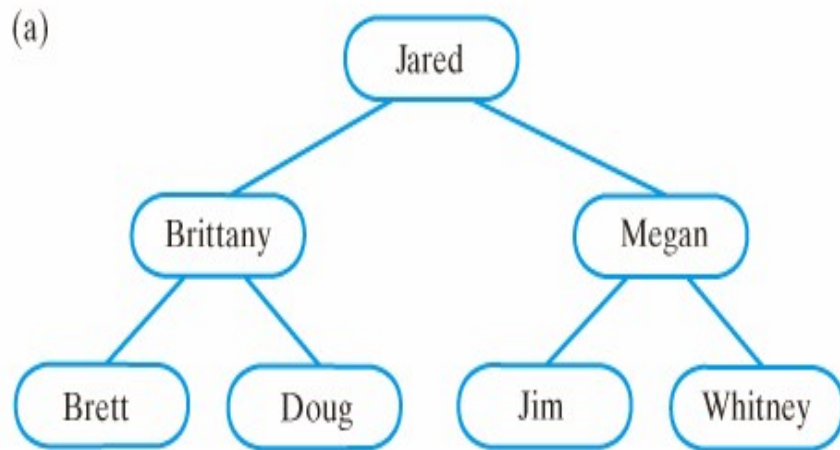


Fig. 27-4 (a) A binary search tree; (b) the same tree after adding *Chad*.

Adding an Entry Recursively

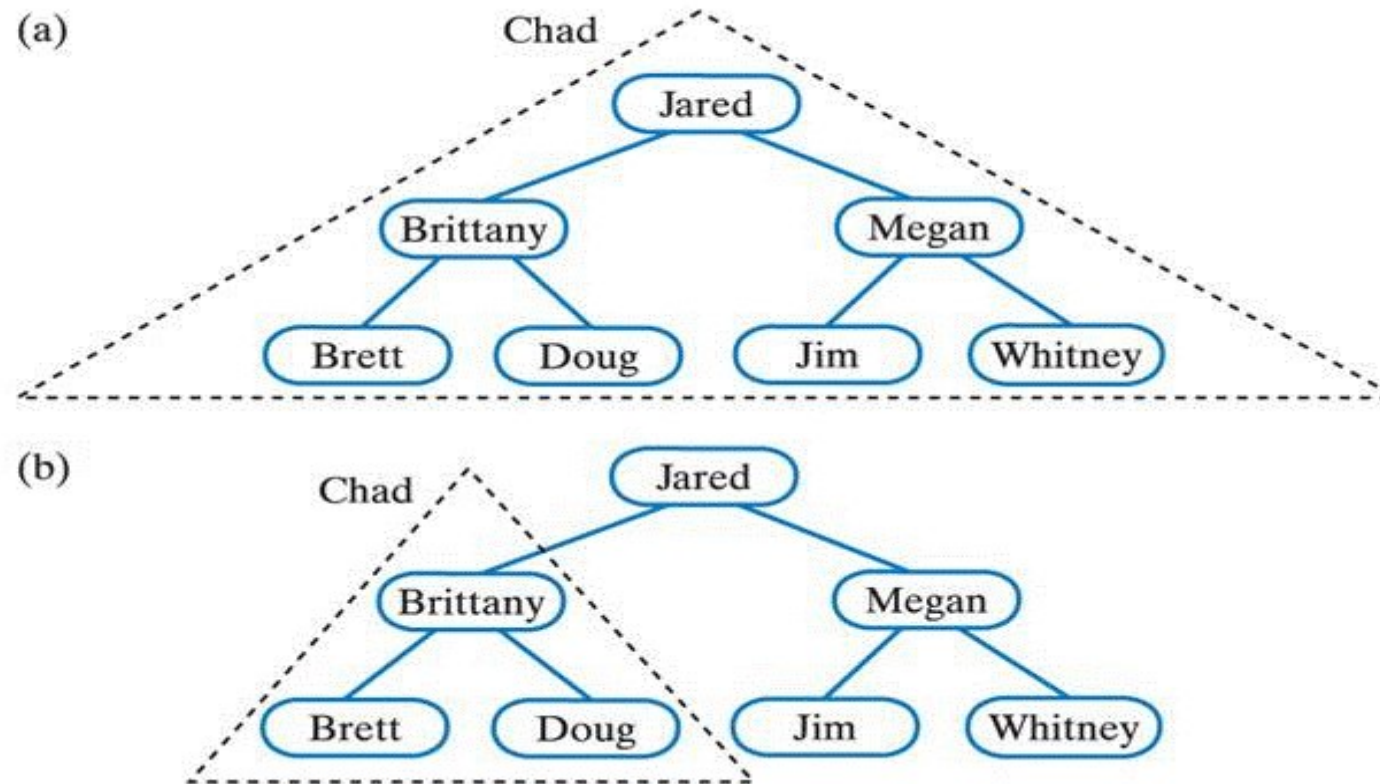


Fig. 27-5 Recursively adding *Chad* to smaller subtrees of a binary search tree ... continued →

Adding an Entry Recursively

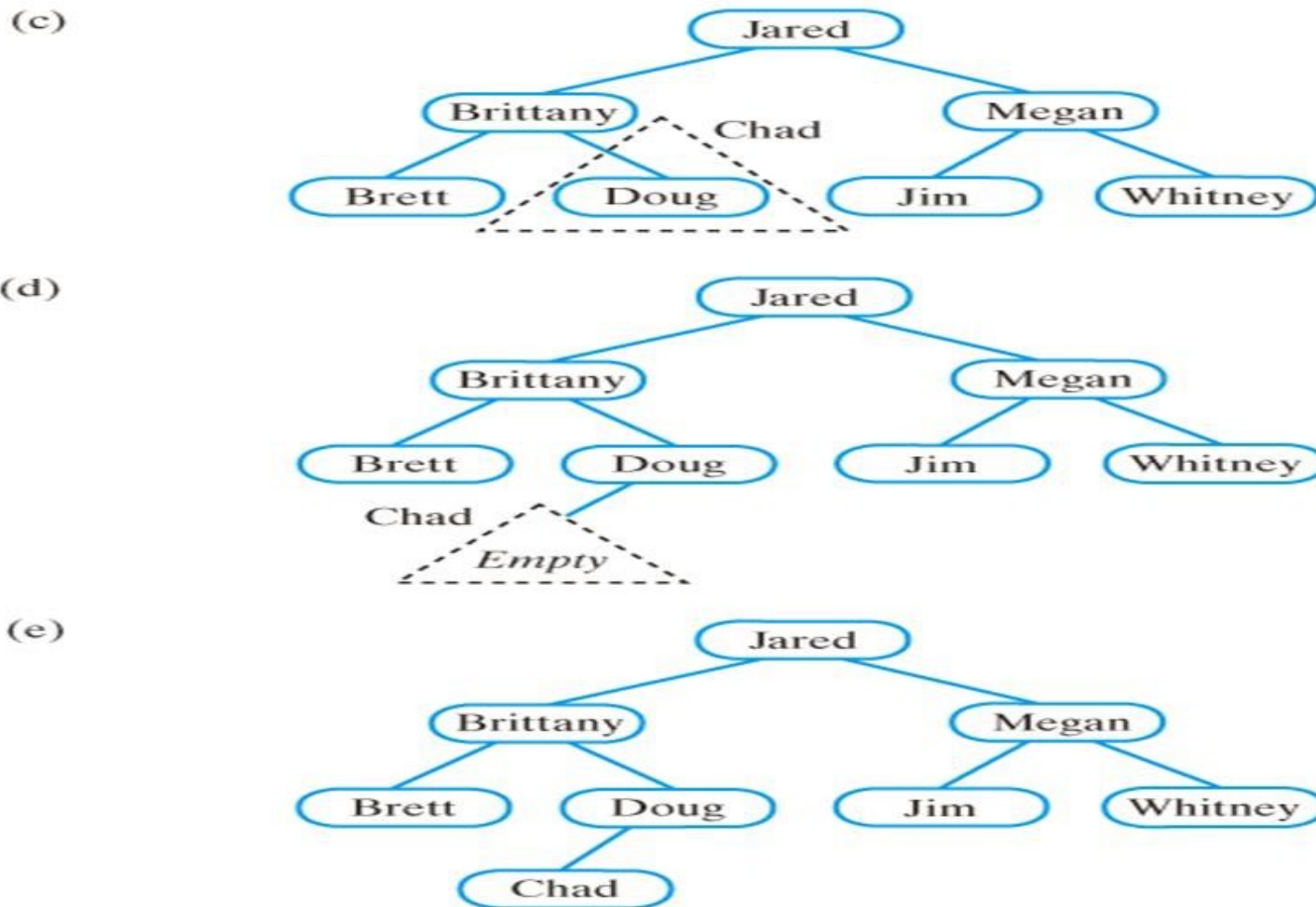


Fig. 27-5 (ctd.) Recursively adding *Chad* to smaller subtrees of a binary search tree.

Methods **add** and **addEntry**

- The public method **add** calls the private recursive method **addEntry**, if the tree is not empty.
- Like **findEntry**, **addEntry** has a node as a parameter that is initially the root node of the tree.
- When **addEntry** is called recursively, this parameter is either the left child or the right child of the current root.

Methods **add** and **addEntry**

```
public T add(T newEntry) {  
    T result = null;  
    if (isEmpty())  
        root = new BinaryNode(newEntry);  
    else  
        result = addEntry(root, newEntry);  
    return result;  
}
```

```
private T addEntry(BinaryNode rootNode, T newEntry) {  
    T result = null;  
    int comparison = newEntry.compareTo(rootNode.data);  
    if (comparison == 0) {  
        result = rootNode.data;  
        rootNode.data = newEntry;  
    }  
    else if (comparison < 0) {  
        if (rootNode.left != null)  
            result = addEntry(rootNode.left, newEntry);  
        else  
            rootNode.left = new BinaryNode(newEntry);  
    }  
    else {  
        if (rootNode.right != null)  
            result = addEntry(rootNode.right, newEntry);  
        else  
            rootNode.right = new BinaryNode(newEntry);  
    }  
    return result;  
}
```

Duplicate Entries

For each node in a binary search tree,

- The data in a node is *greater than* the data in the node's left subtree,
- The data in a node is *less than or equal* to the data in the node's right subtree.
 - If duplicates are allowed, place the duplicate in the entry's right subtree.

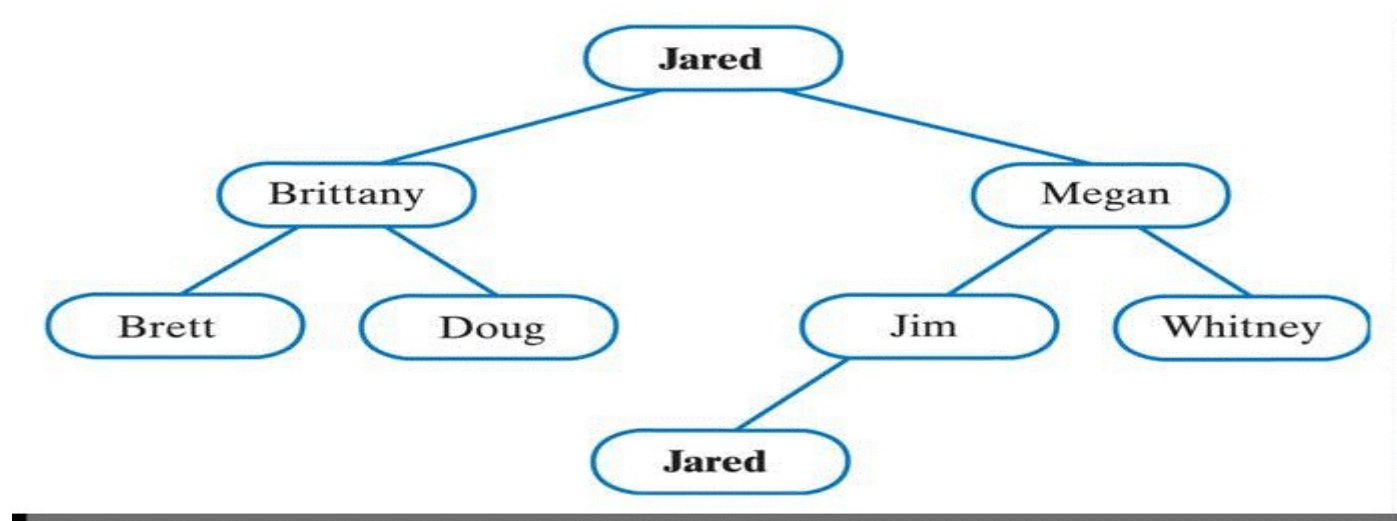
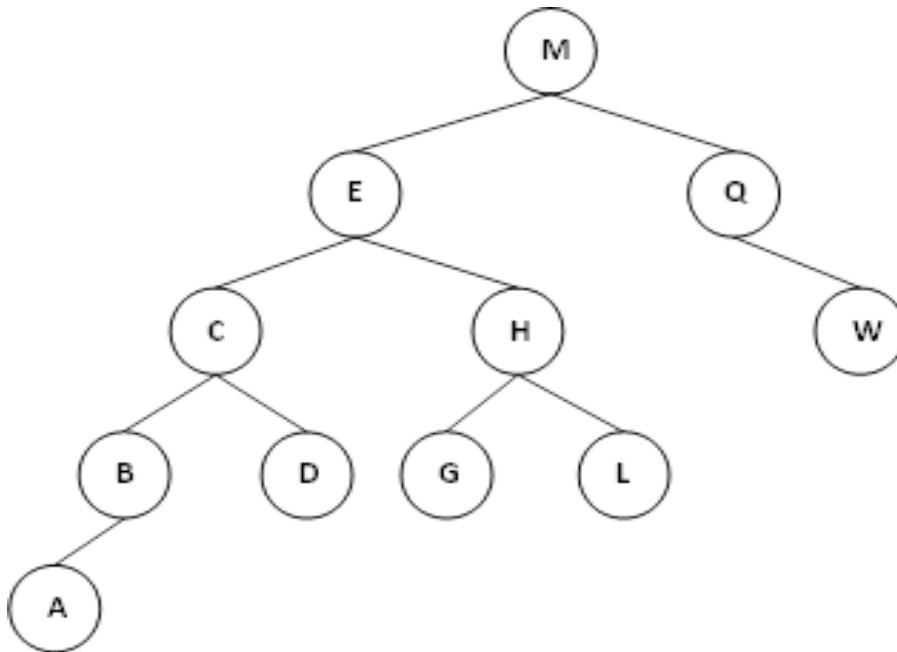


Fig. 27-3 A binary search tree with duplicate entries.



Exercise

- Construct a binary search tree using the following sequence of values: **M, E, Q, W, C, H, B, D, G, L, A**
- Identify the values for **preorder traversal, inorder & postorder traversal**



Removing an Entry

- The **remove** method must receive an entry to be matched in the tree
 - If found, it is removed
 - Otherwise the method returns **null**
- 3 possible cases:
 - The node has no children, it is a leaf (simplest case)
 - The node has one child
 - The node has two children

1. Removing a Leaf Node

If the node is a left child of its parent, then the left reference of its parent is set to **null**. Otherwise, if the node is a right child of its parent, then the right reference of its parent is set to **null**.

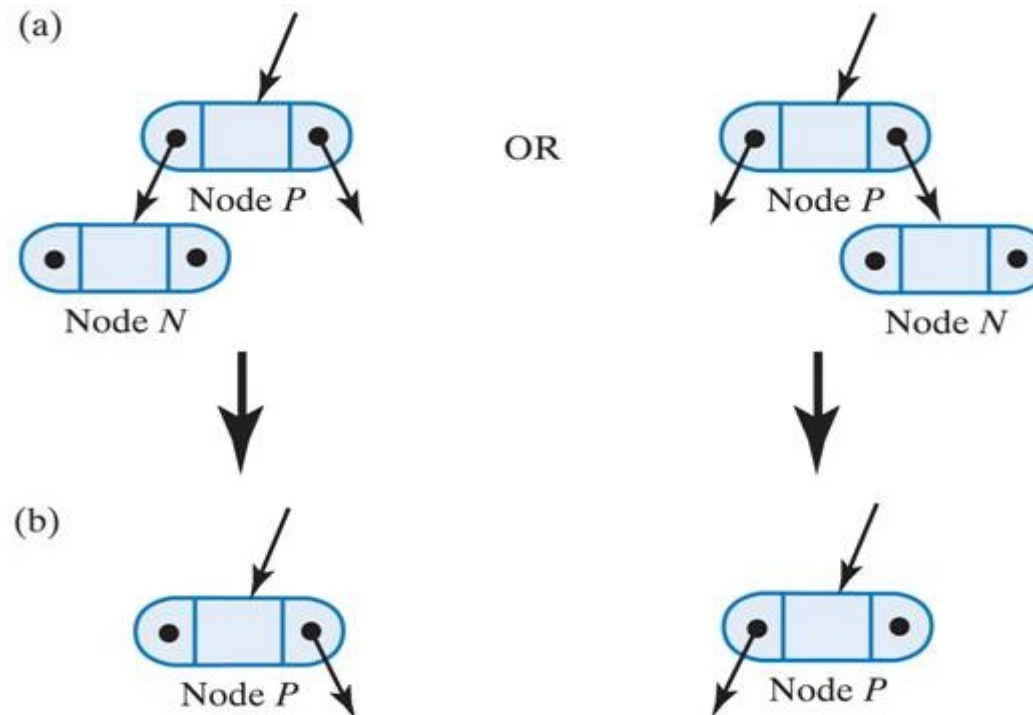
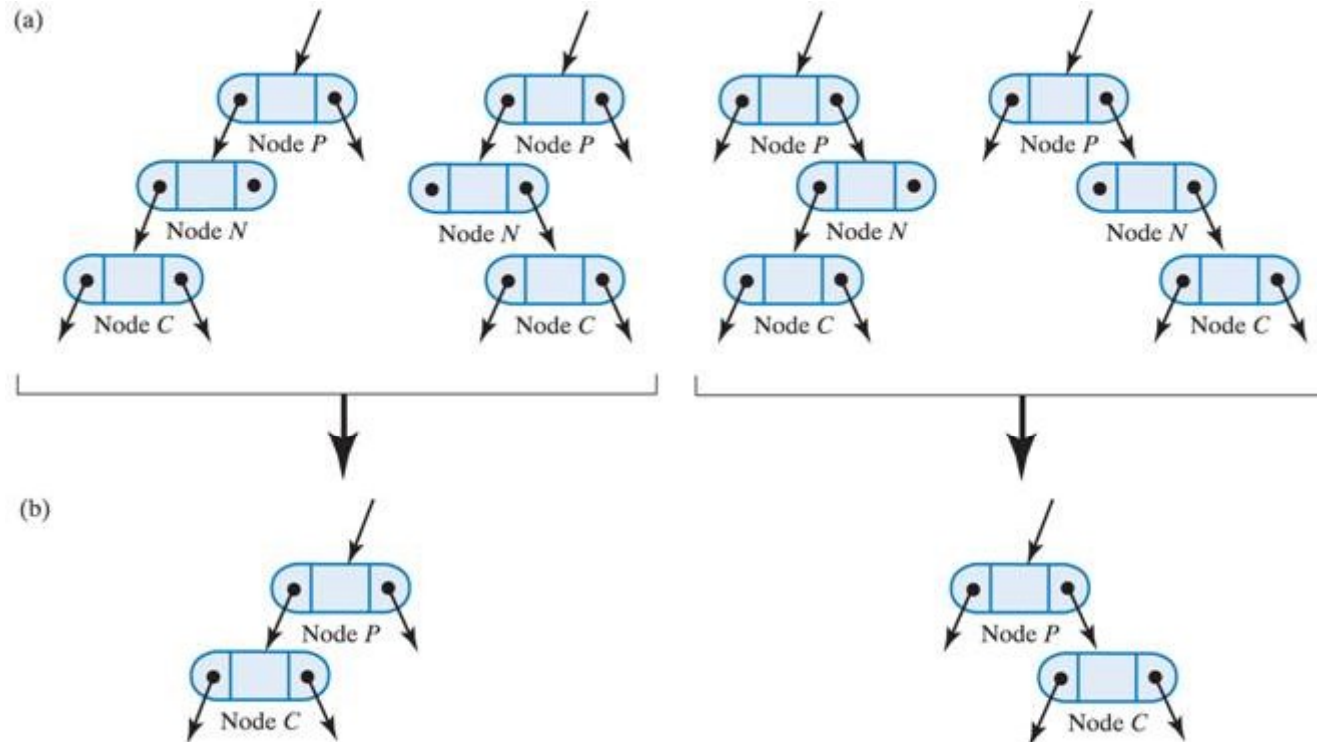


Fig. 27-6 (a) Two possible configurations of leaf node *N*;
(b) the resulting two possible configurations after removing node *N* by **setting the child reference of *P* to null**.

2. Removing a Node with 1 Child



make C a child of P instead of N

Fig. 27-6 (a) Two possible configurations of leaf node *N*; (b) the resulting two possible configurations after removing node *N*.

3. Removing a Node with 2 Children

If we remove N , left with two orphans, P can only accept one of them, no room for both. Thus, **removing N** is not a option. We do not want to remove node N to remove its entry. Find a node A that is easy to remove and replace N 's entry, then remove node A .

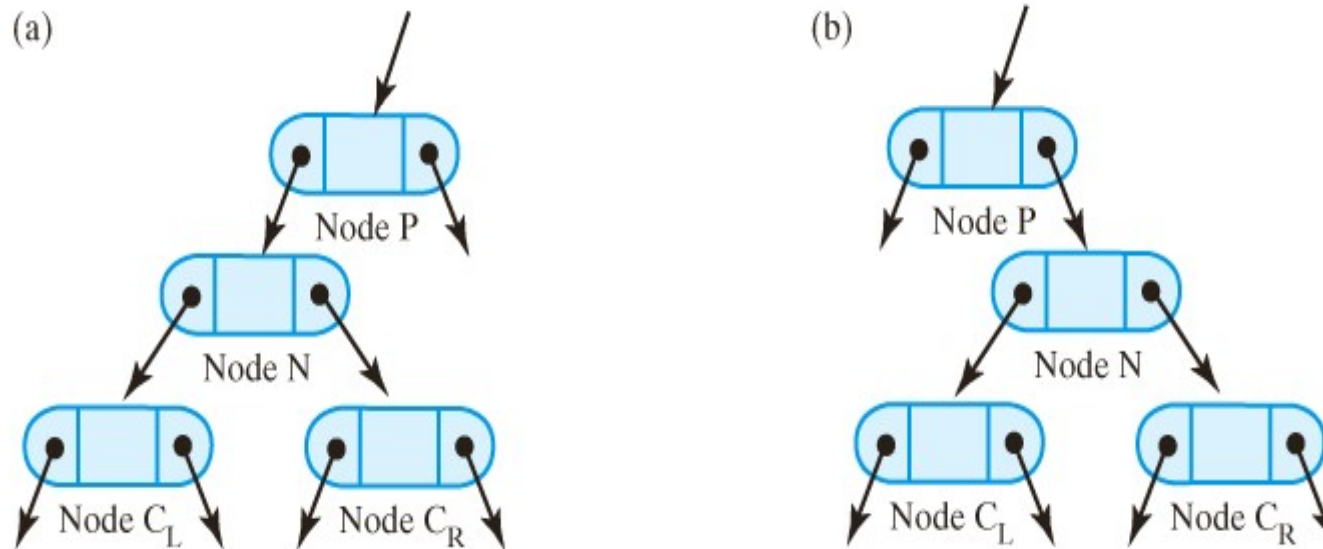


Fig. 27-8 Two possible configurations of node N that has two children.

3. Removing a Node with 2 Children

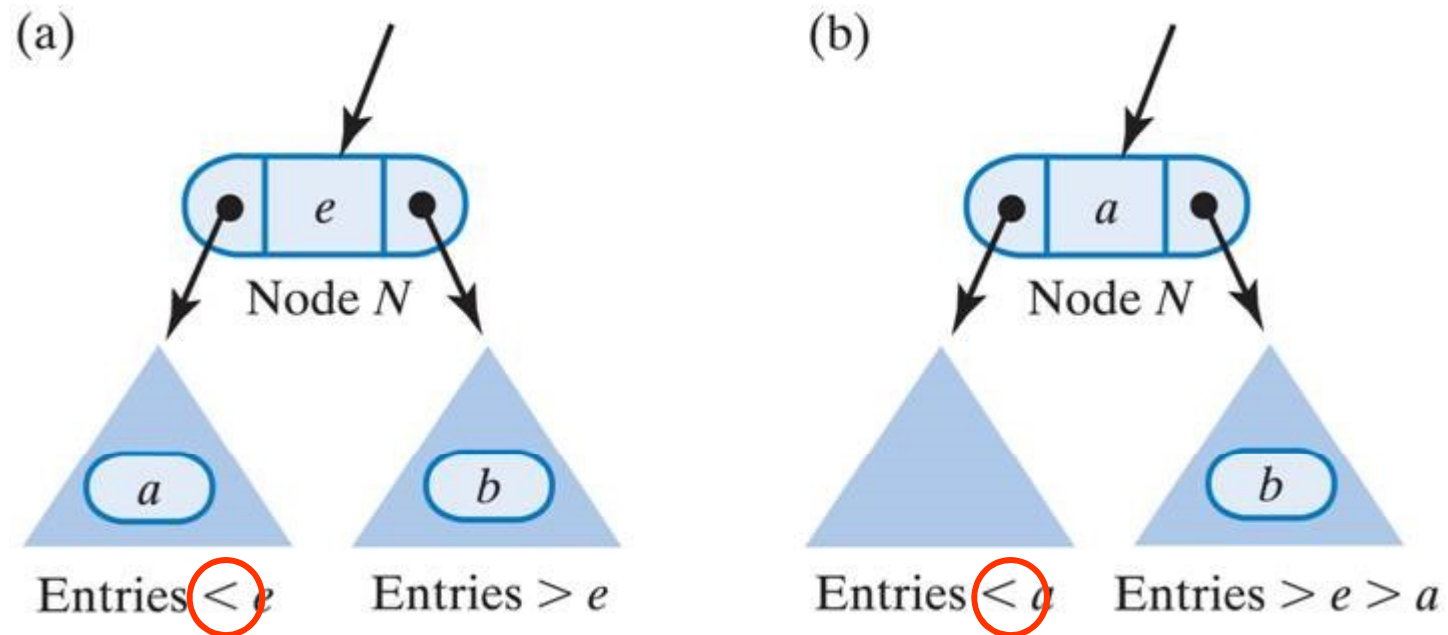


Fig. 27-9 Node N and its subtrees;

(a) entry a is immediately before e , b is immediately after e ;

(b) after deleting the node that contained a and replacing e with a .

3. Removing a Node with 2 Children

- Delete the entry e from a node N that has two children
 - Find the rightmost node R in N 's left subtree
 - Replace the entry in node N with the entry that is in node R
 - Delete node R
 - *Note: This will be either deleting a leaf node or a node with only 1 child.*

3. Removing a Node with 2 Children

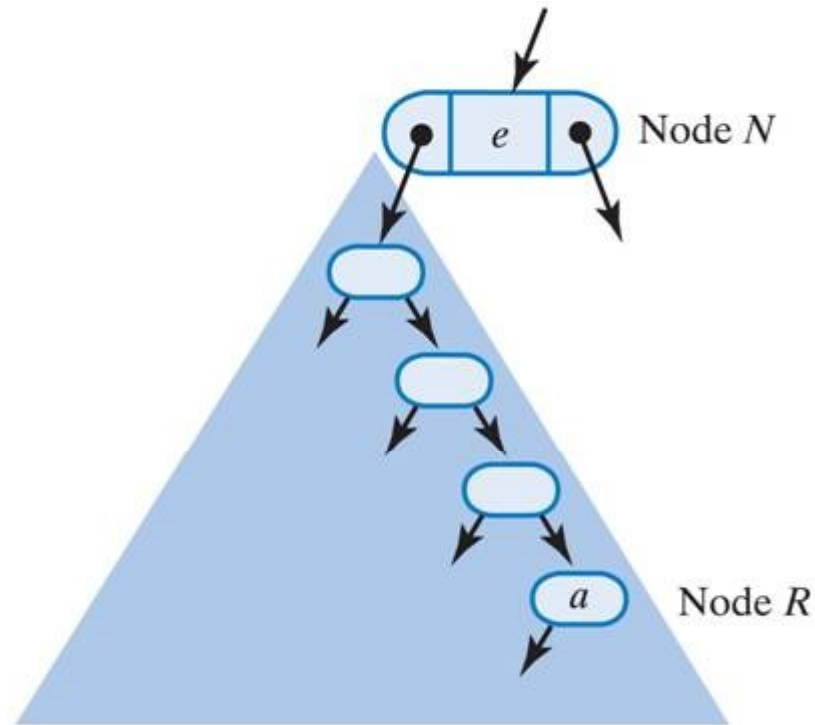


Fig. 27-10 The largest entry a in node N 's left subtree occurs in the subtree's rightmost node R .

3. Removing a Node with 2 Children

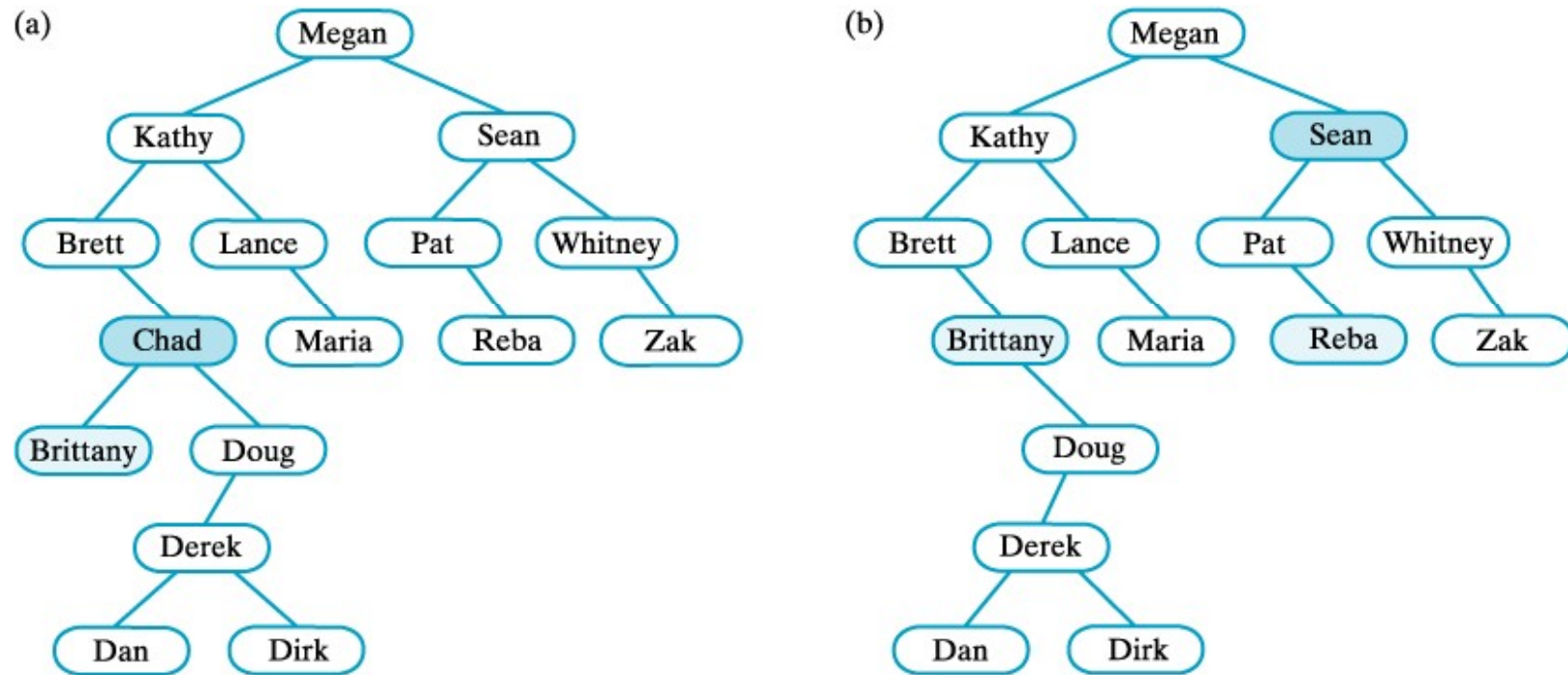


Fig. 27-11 (a) A binary search tree; (b) after removing *Chad*;

3. Removing a Node with 2 Children

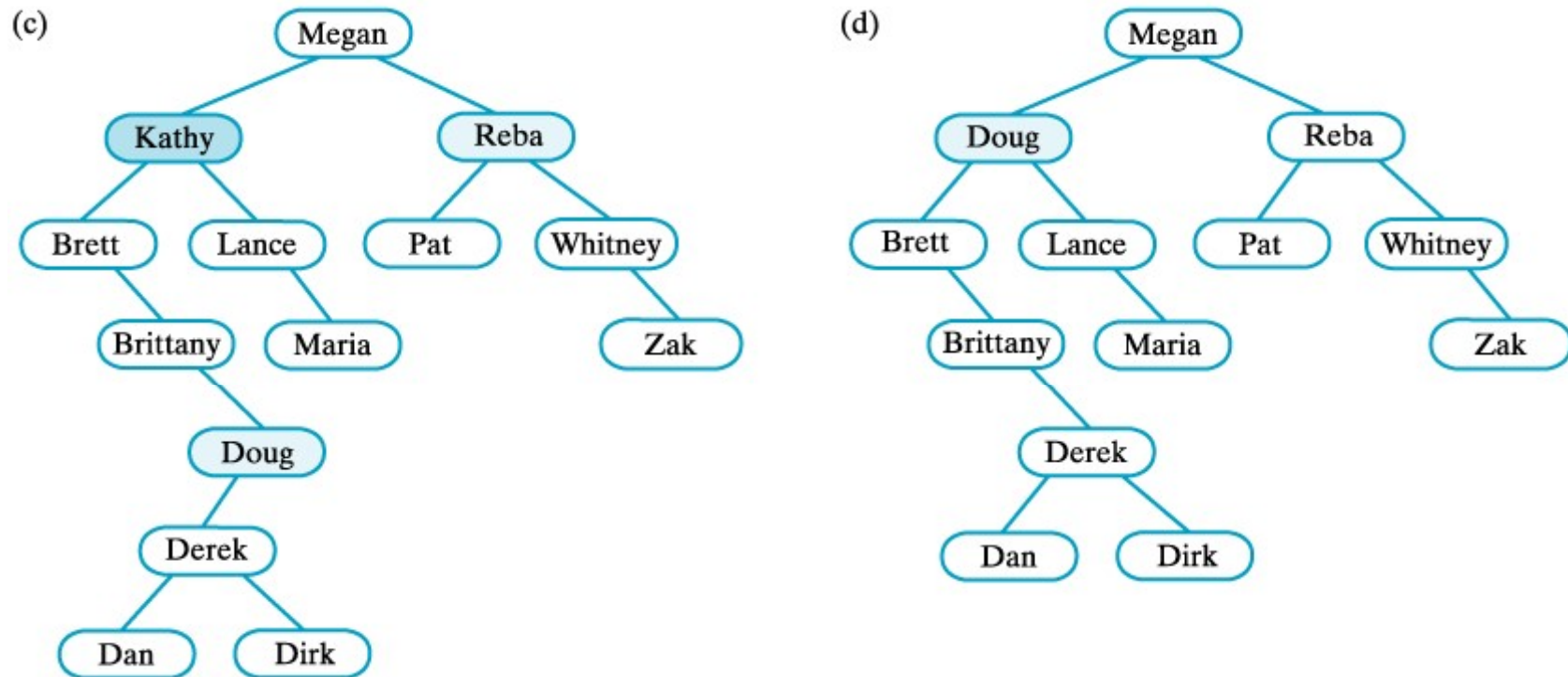
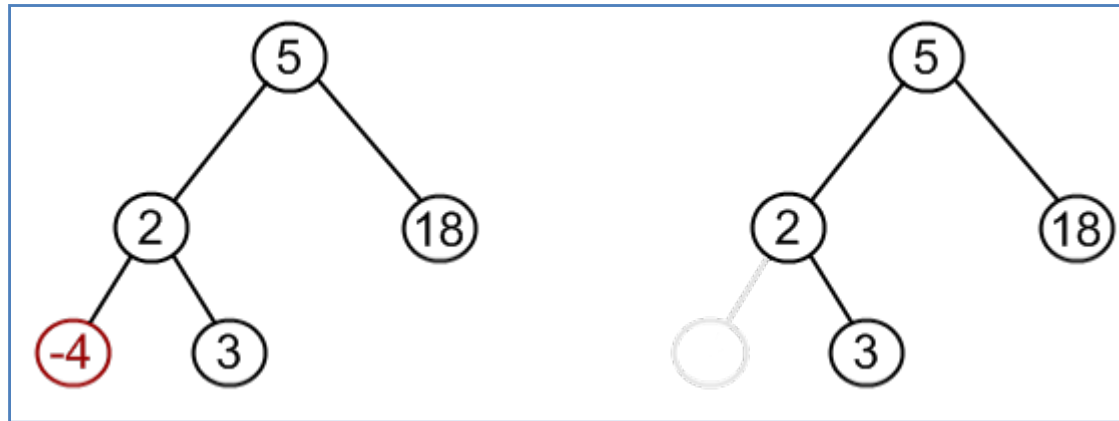


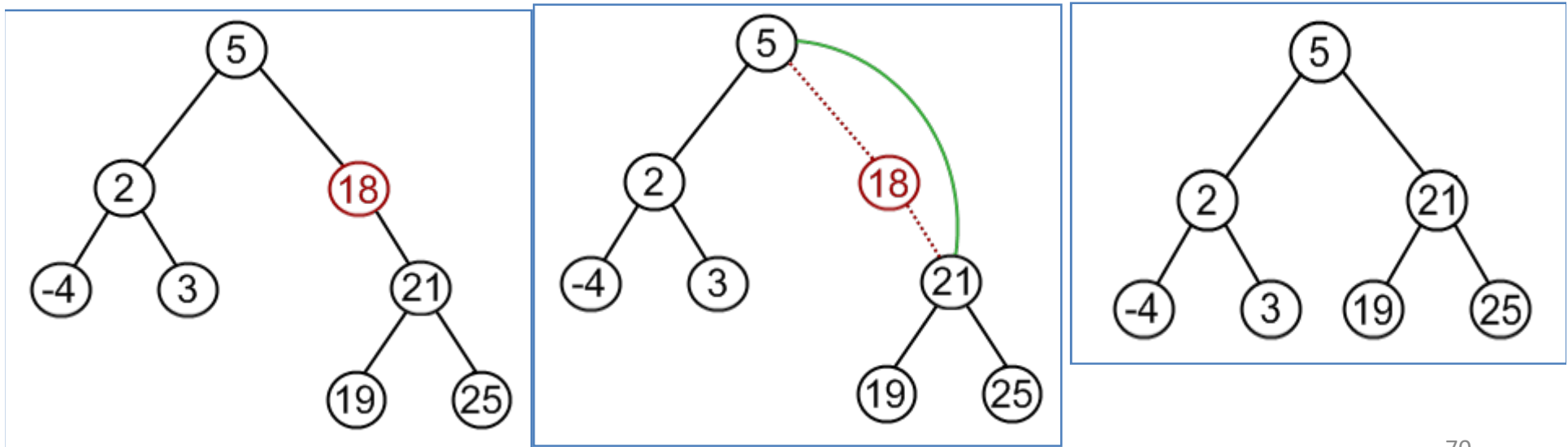
Fig. 27-11 (c) after removing *Sean*; (d) after removing *Kathy*.

Example

- Case 1: remove -4

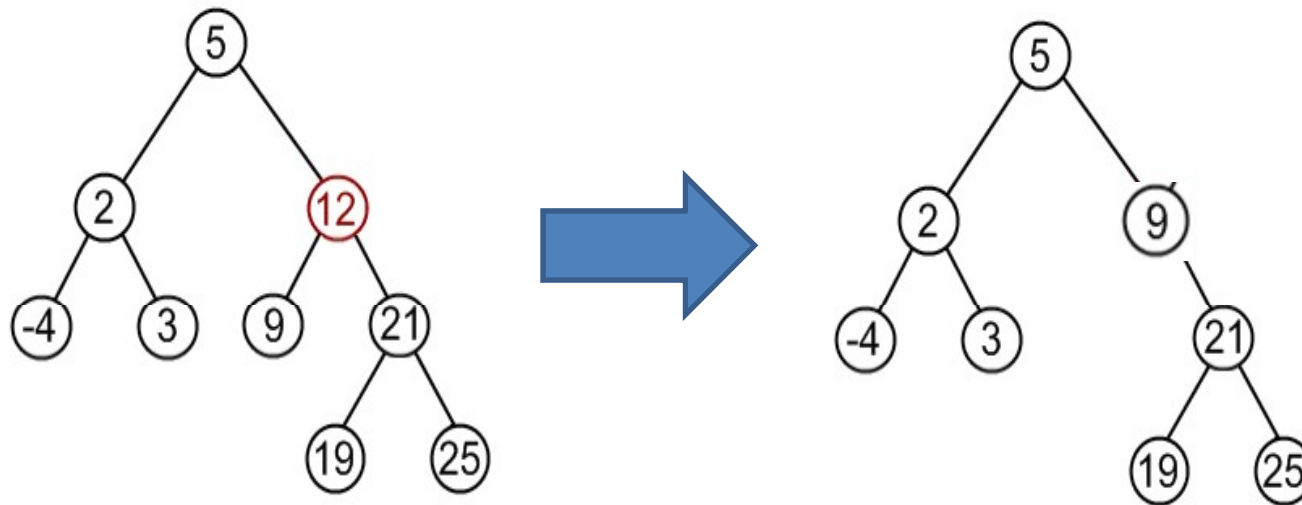


- Case 2: remove 18



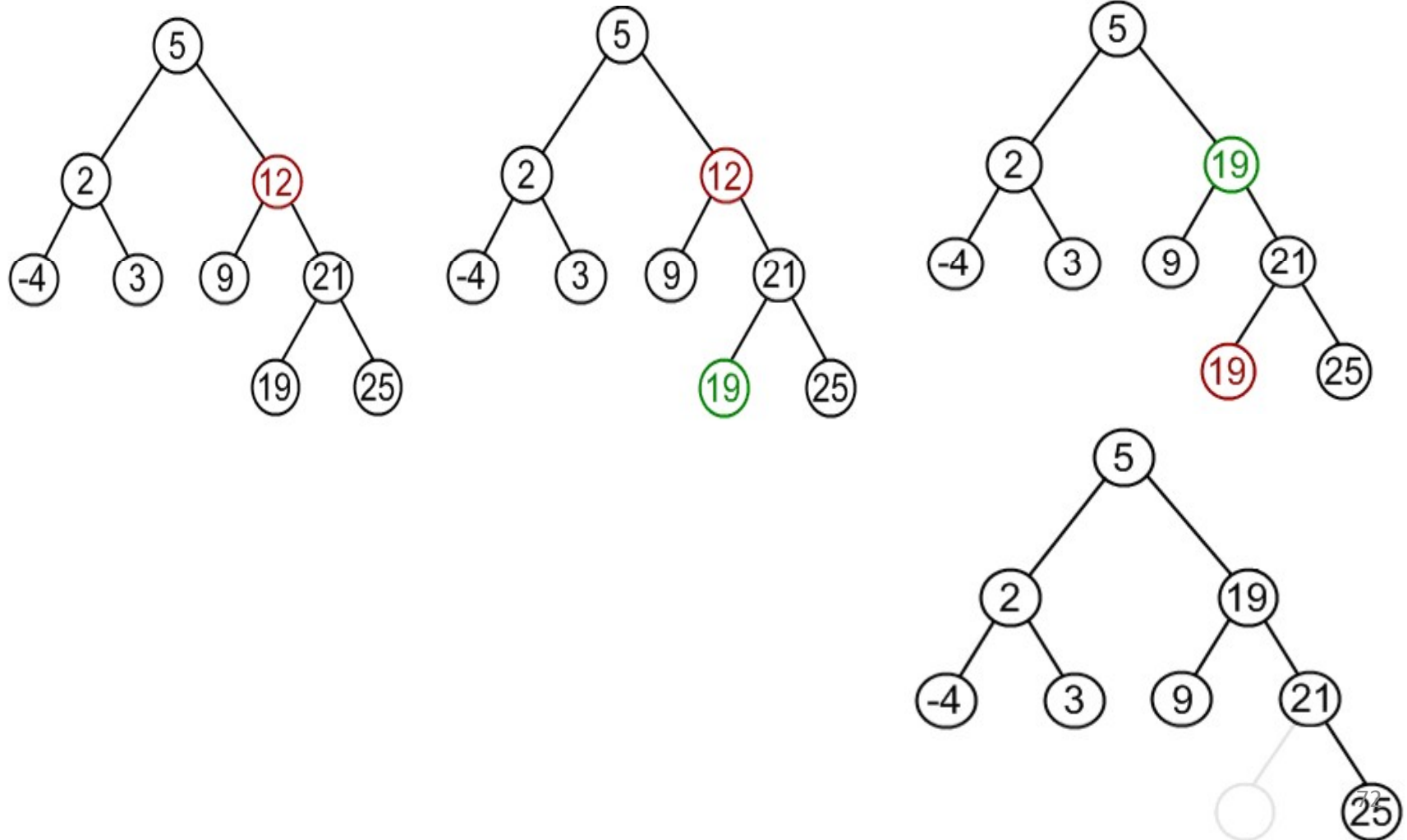
Example

- Case 3: remove 12
- Go to the left subtree of the node 12 with largest value is 9.



Example

- Case 3: remove 12
- (Alternative way) Go to the right subtree of the leftmost node 12 with smallest value is 19.



Removing an Entry in the Root

- The public method **remove** calls a private recursive method **removeEntry**
 - Method **remove** passes the root of the tree to method **removeEntry**
 - Since method **removeEntry** might remove the root node from the tree, we must ensure a reference to the tree's root is always retained.
 - ➔ **removeEntry** returns a reference to the root of the revised tree, which **remove** can use to update root
 - However, **removeEntry** must also give to **remove** the entry it removes
 - ➔ An additional parameter - **oldEntry** – is passed to **removeEntry** for the method to change its value to the removed entry.

Removing an Entry in the Root

- To enable the additional parameter **oldEntry**'s value to be changed to the removed entry's value, the inner class **ReturnObject** is defined.
- **ReturnObject**
 - An inner class that has a single data field and simple **set** and **get** methods
 - Used as the type for **oldEntry**

Methods **remove** and **removeEntry**

```
public T remove(T entry) {
    ReturnObject oldEntry =
        new ReturnObject(null);

    BinaryNode newRoot =
        removeEntry(root, entry,
            oldEntry);

    root = newRoot;

    return oldEntry.get();
}
```

```
private BinaryNode removeEntry(BinaryNode rootNode, T entry,
    ReturnObject oldEntry) {
    if (rootNode != null) {
        T rootData = rootNode.data;
        int comparison = entry.compareTo(rootData);
        if (comparison == 0) {
            oldEntry.set(rootData);
            rootNode = removeFromRoot(rootNode);
        }
        else if (comparison < 0) {
            BinaryNode leftChild = rootNode.left;
            BinaryNode subtreeRoot = removeEntry(leftChild, entry,
                oldEntry);
            rootNode.left = subtreeRoot;
        }
        else {
            BinaryNode rightChild = rootNode.right;
            rootNode.right = removeEntry(rightChild, entry, oldEntry);
        } // end if
    } // end if
    return rootNode;
}
```

Removing an Entry in the Root

It will be a **special case** only if we actually remove the root node. It occurs when the root has at most **one child**

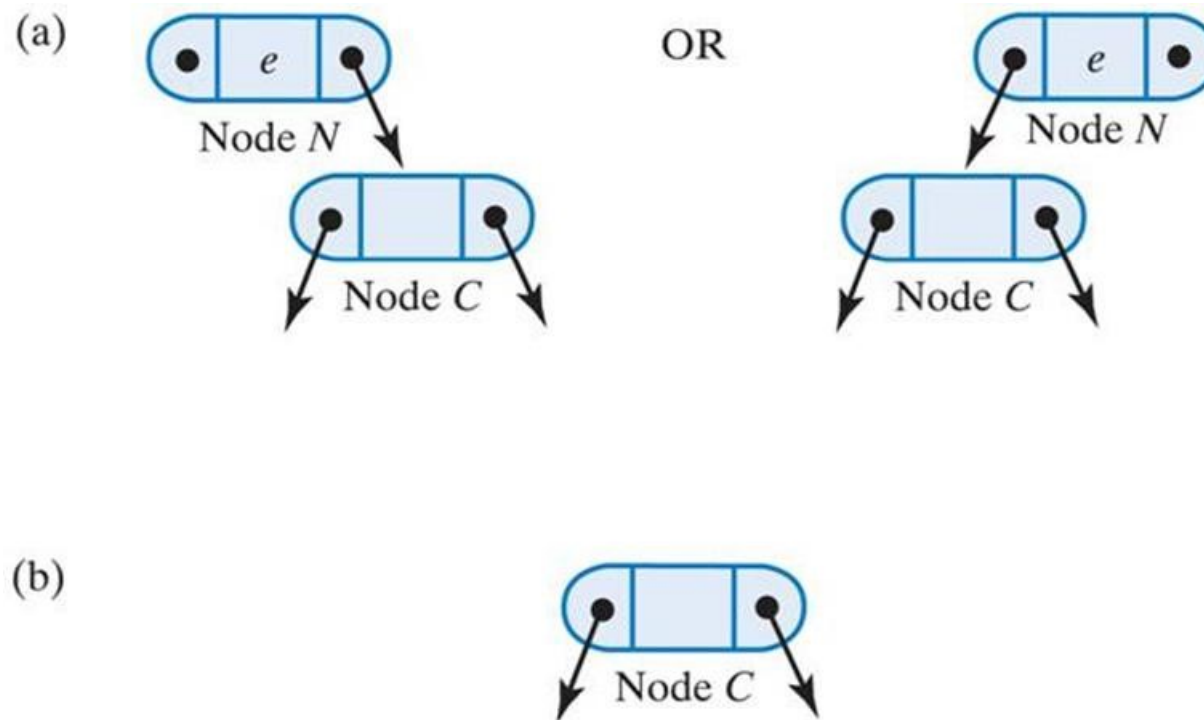
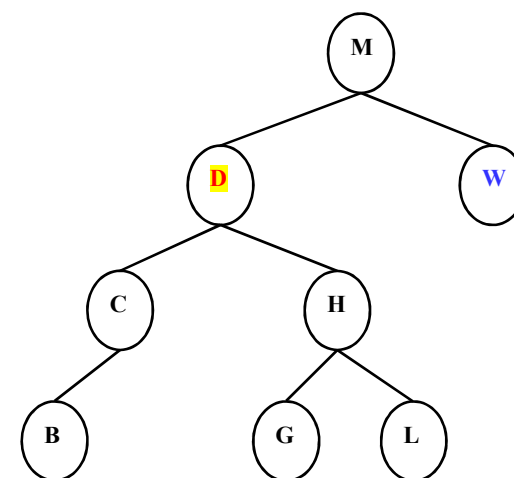
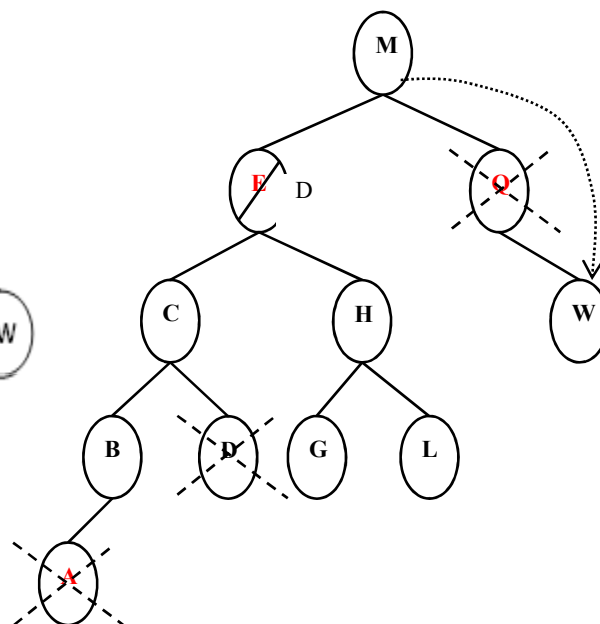
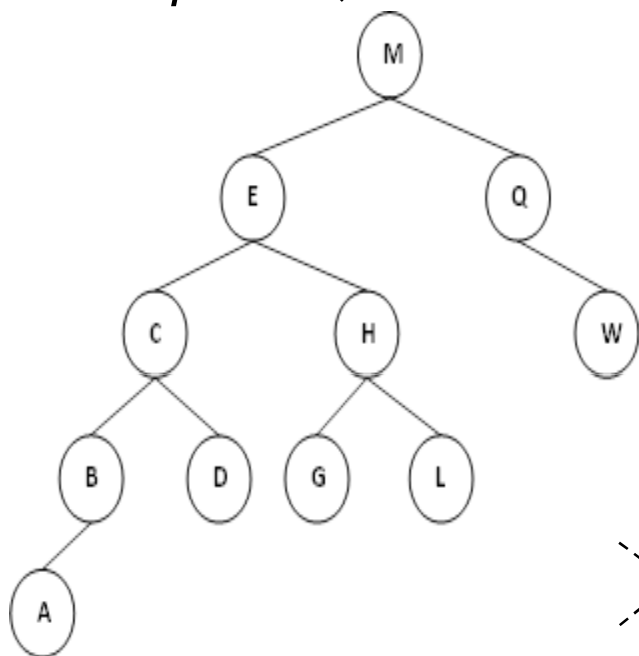


Fig. 27-12 (a) Two possible configurations of a root that has one child; (b) after removing the root.



Exercise

- Explain the steps to remove the values **A**, **Q** and **E** (*in the given sequence*) from the tree. Show the resulting binary search tree.



Resulting binary search tree

Efficiency of Operations (1)

- Operations **add**, **remove** and **getEntry** require a search that begins at the root
- In the worse case, searches begins at root and examine each node on a path and ends at a leaf.
- Maximum number of comparisons is directly proportional to the height, h of the tree. These operations are $O(h)$.

Efficiency of Operations (2)

- The tallest tree has height n if it contains n nodes. The tree looks like a linked chain, and the searching is like searching a linked chain, $O(n)$.
- The shortest tree is full. The height of a full tree containing n nodes is $\log_2(n+1)$. Thus, in the worst case, searching a full binary search tree is an $O(\log_2 n)$.
- Both full and complete binary search tree can give us $O(\log_2 n)$ performance.

Efficiency of Operations

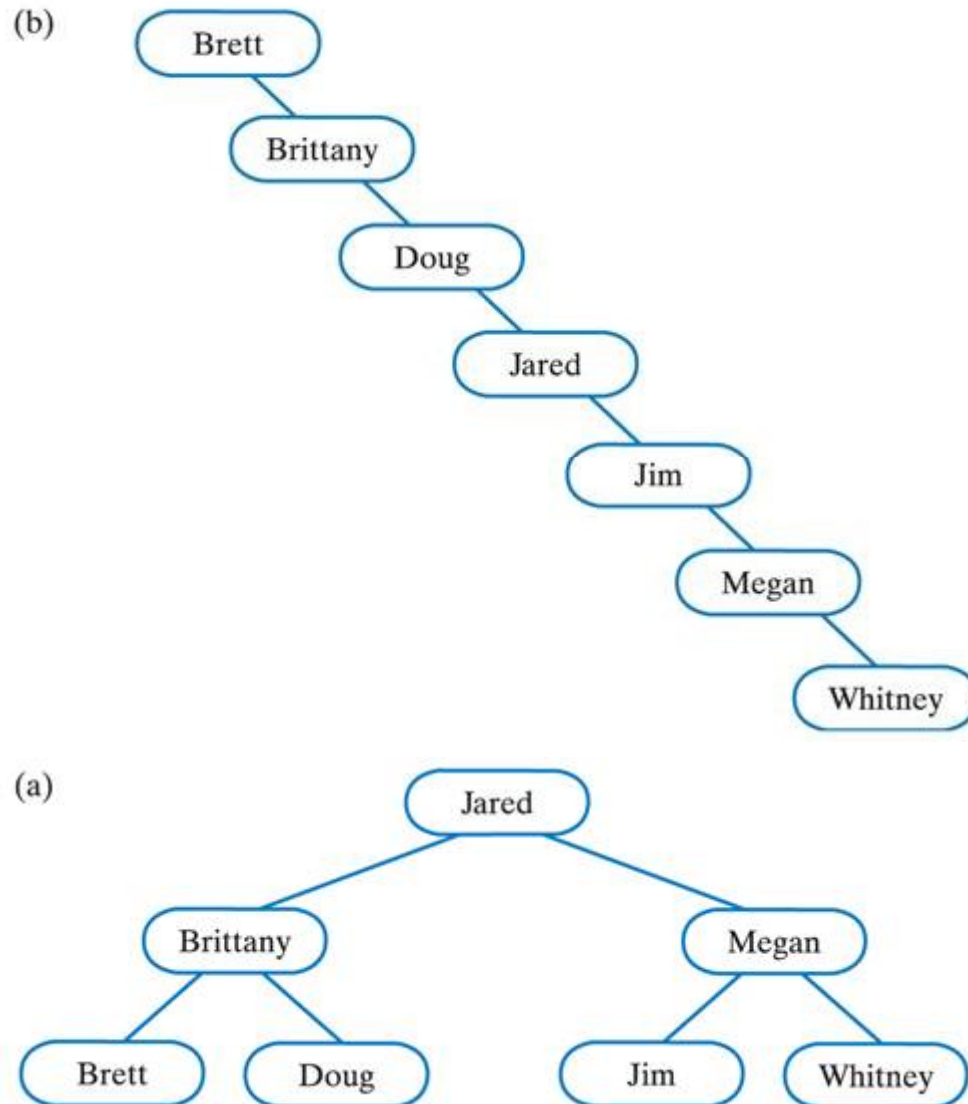


Fig. 27-13 Two binary search trees that contain the same data.

Shorter tree has efficiency $O(\log n)$

Importance of Balance

- Balance of the tree affects the performance of the search process
- *Completely balanced*
 - Subtrees of each node have exactly same height
- *Height balanced*
 - Subtrees of each node in the tree differ in height by no more than 1
- Completely balanced or height balanced trees are balanced

Importance of Balance

- If entries are added to an empty binary tree
 - Best not to have them sorted first
 - Tree is more balanced if entries are in random order

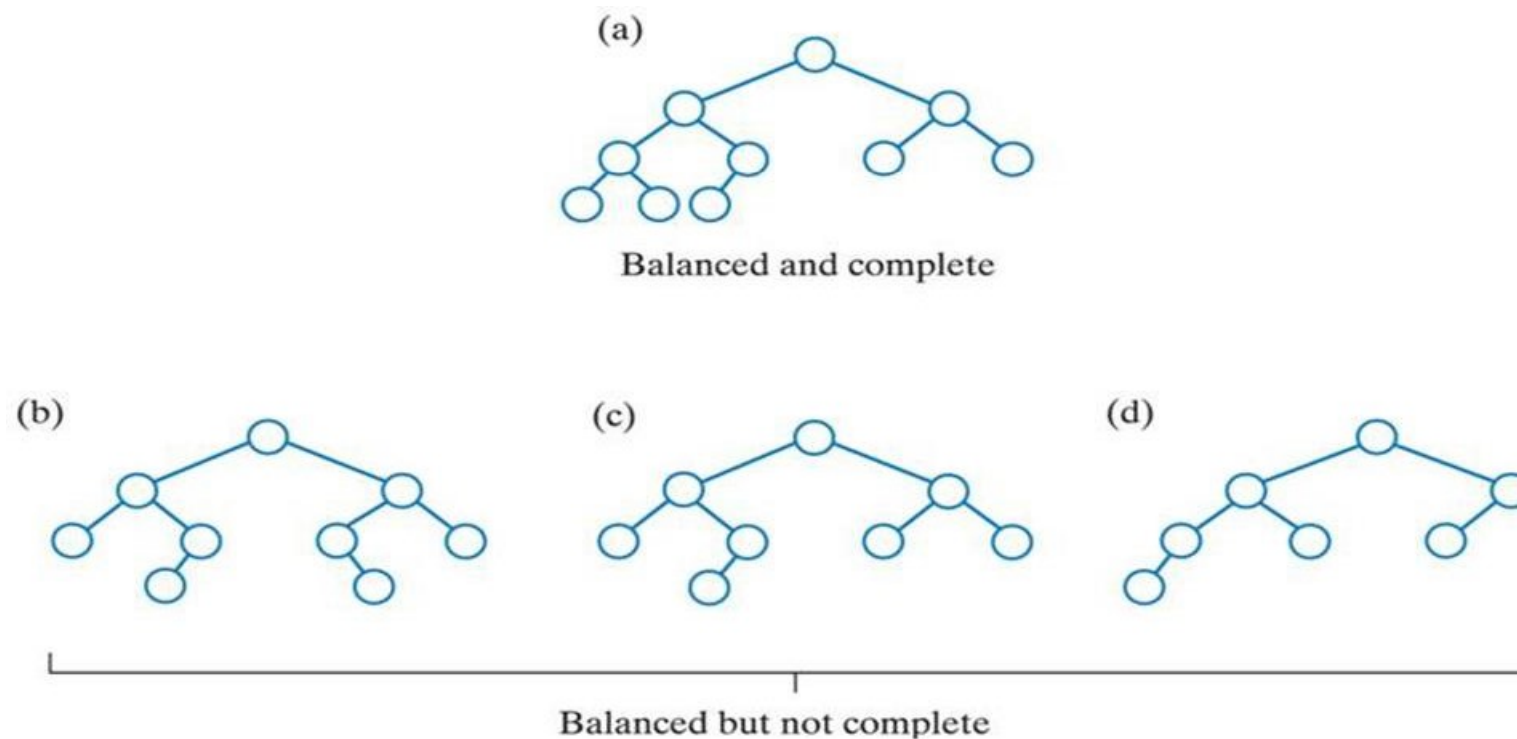


Fig. 27-14 Some binary trees that are height balanced.

Balanced Search Trees (Optional)

- The operations on a binary search tree are $O(\log n)$ if the tree is balanced. However, the add and remove operations do not ensure that a binary search tree remains balanced.
- *Balanced search trees* carries out rearrangement of nodes whenever it becomes unbalanced. Types of balanced search trees include:
 - AVL Trees
 - 2-3 Trees
 - B-Trees

Review of learning outcomes

You should now be able to

- Describe applications of binary trees such as expression trees and decision trees.
- Implement binary trees and binary search trees
- Discuss the factors that affect the efficiency of the binary search tree operations

References

- Carrano, F. M., 2019, Data Structures and Abstractions with Java, 5th edn, Pearson
- Liang, Y.D., 2018. Introduction to Java Programming and Data Structures.11th ed.United Kingdom:Pearson