

Trees

Based on Chapter 8,
Koffmann and Wolfgang

Chapter Outline

- How trees organize information hierarchically
- Using recursion to process trees
- The different ways of traversing a tree
- Binary trees, Binary Search trees, and Heaps
- Implementing binary trees, binary search trees, heaps
 - Using linked data structures and arrays
- Using binary search trees for efficient data lookup
- Using Huffman trees for compact character storage

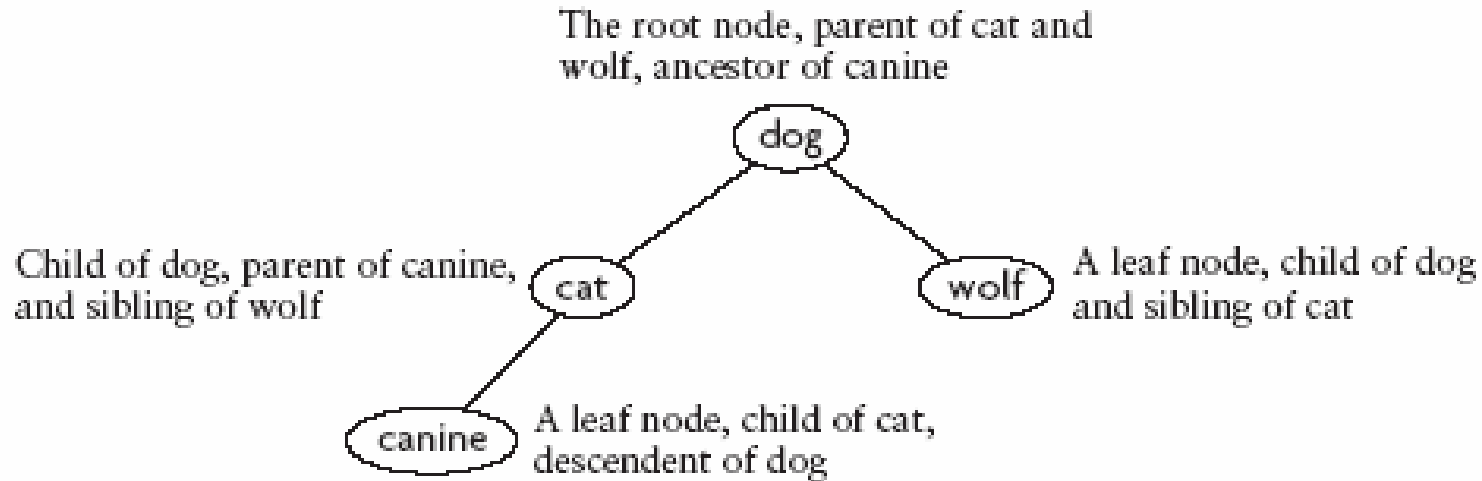
Tree Terminology

- A tree is a collection of elements (nodes)
- Each node may have 0 or more successors
 - (Unlike a list, which has 0 or 1 successor)
- Each node has exactly one predecessor
 - Except the starting / top node, called the root
- Links from node to its successors are called branches
- Successors of a node are called its children
- Predecessor of a node is called its parent
- Nodes with same parent are siblings
- Nodes with no children are called leaves

Tree Terminology (2)

- We also use words like ancestor and descendent

FIGURE 8.2
A Tree of Words

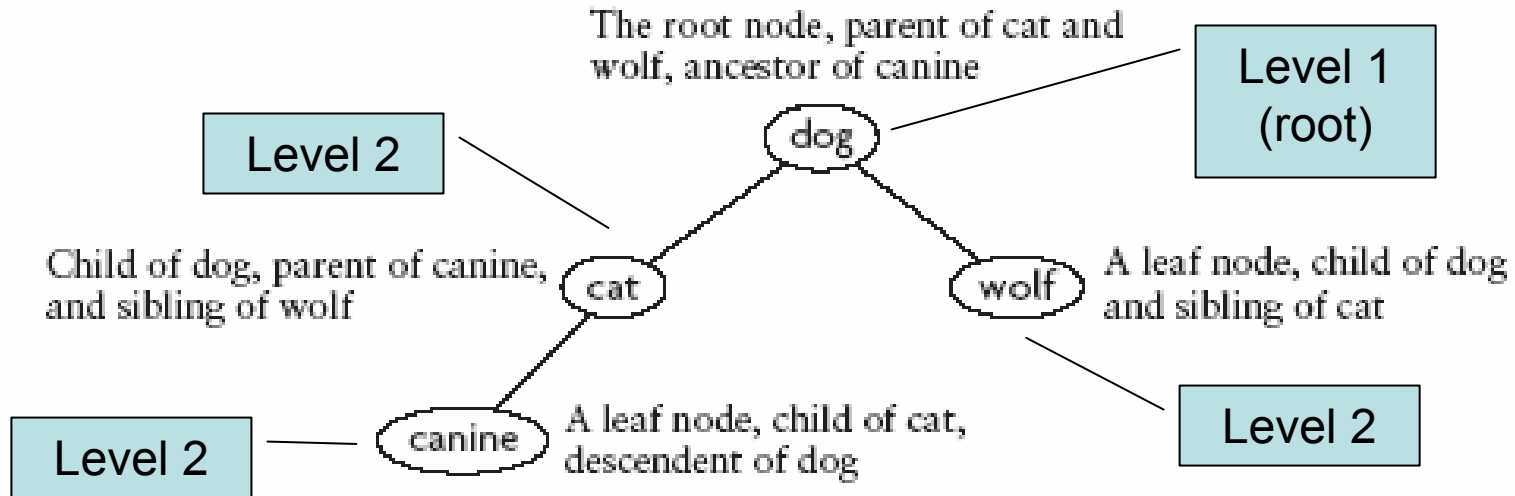


Tree Terminology (3)

- Subtree of a node:
A tree whose root is a child of that node
- Level of a node:
A measure of its distance from the root:
Level of the root = 1
Level of other nodes = 1 + level of parent

Tree Terminology (4)

FIGURE 8.2
A Tree of Words



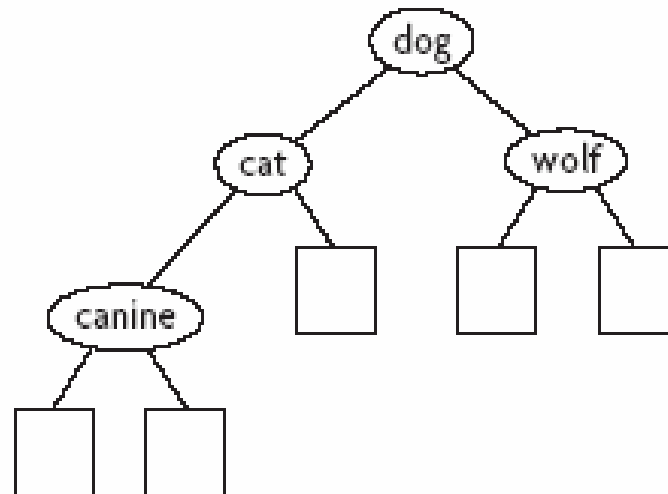
Binary Trees

- Binary tree: a node has at most 2 non-empty subtrees
- Set of nodes T is a binary tree if either of these is true:
 - T is empty
 - Root of T has two subtrees, both binary trees
 - (Notice that this is a recursive definition)

FIGURE 8.3

A Tree of Words with
Null Subtrees Indicated

This is a
binary tree



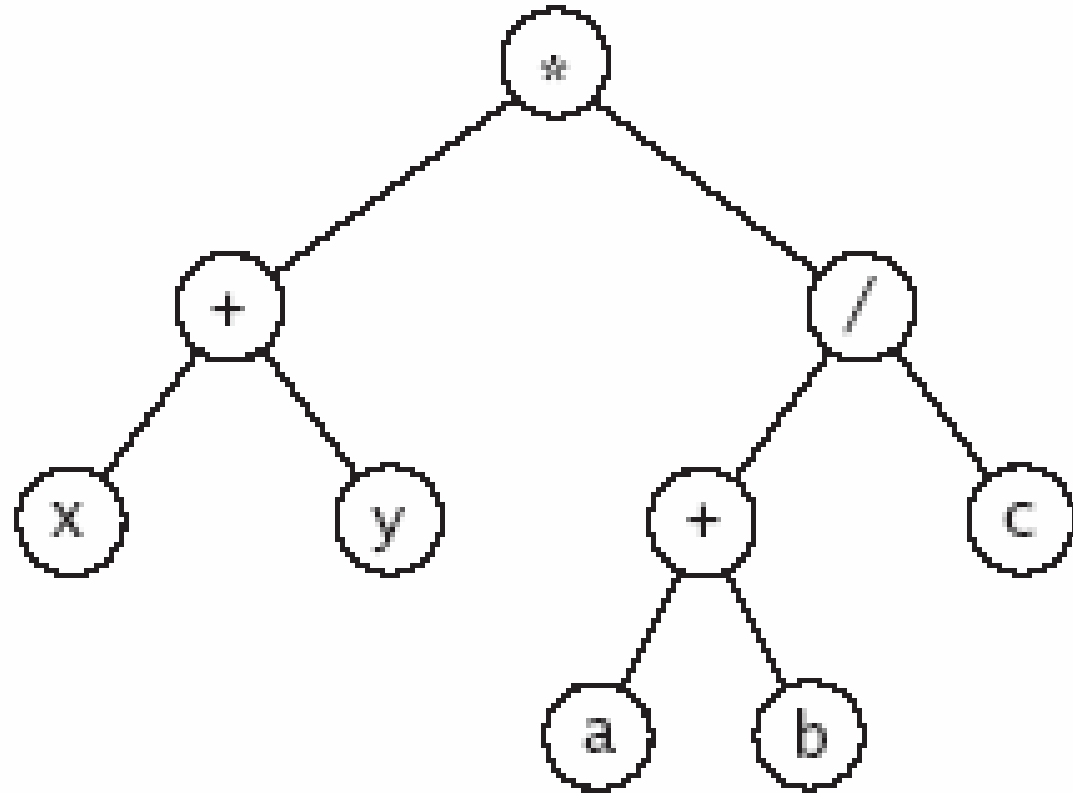
Examples of Binary Trees

- Expression tree
 - Non-leaf (*internal*) nodes contain operators
 - Leaf nodes contain operands
- Huffman tree
 - Represents *Huffman codes* for characters appearing in a file or stream
 - Huffman code may use different numbers of bits to encode different characters
 - ASCII or Unicode uses a *fixed number* of bits for each character

Examples of Binary Trees (2)

FIGURE 8.4

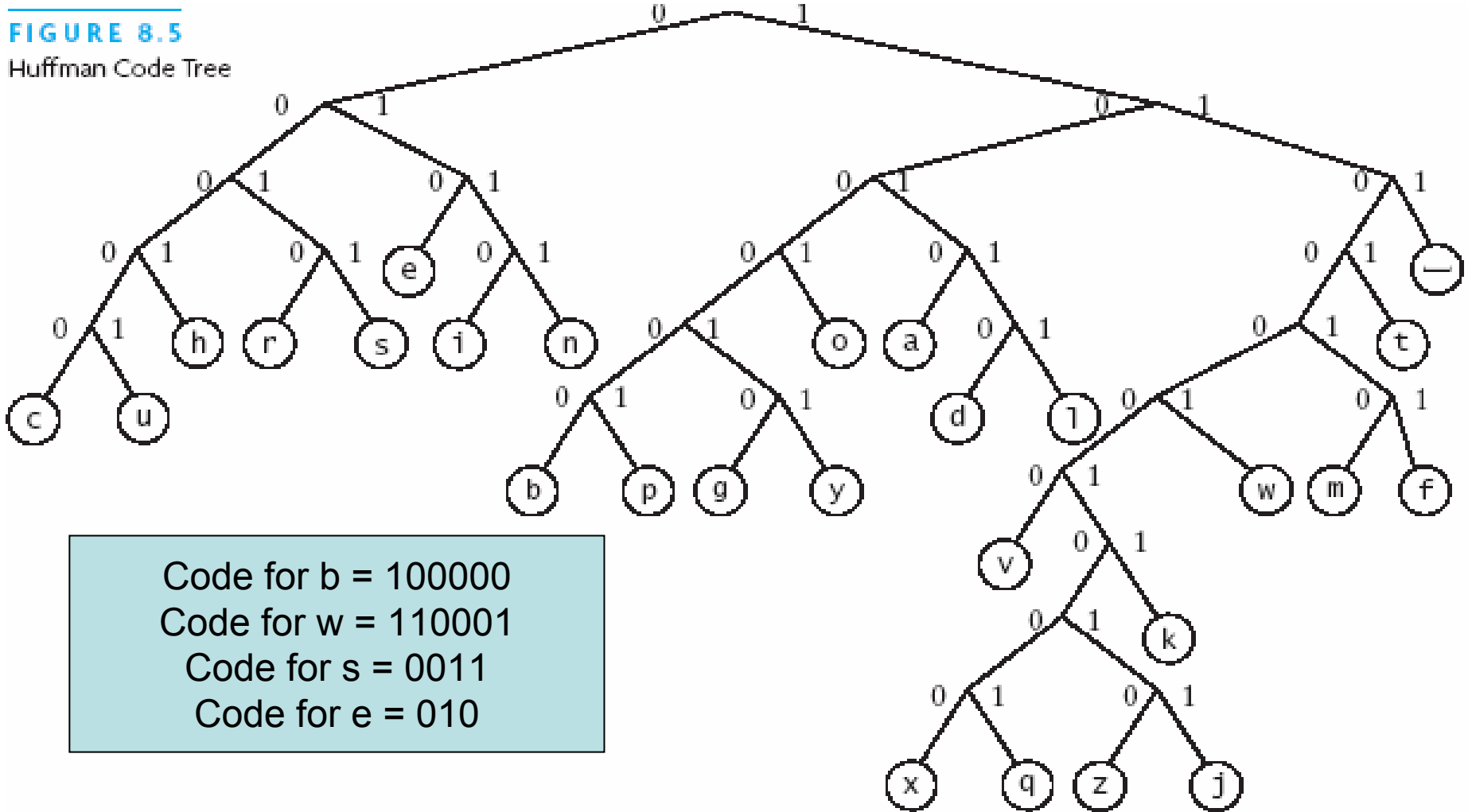
Expression Tree



Examples of Binary Trees (3)

FIGURE 8.5

Huffman Code Tree



Examples of Binary Trees (4)

- Binary search trees
 - Elements in left subtree $<$ element in subtree root
 - Elements in right subtree $>$ element in subtree root

Search algorithm:

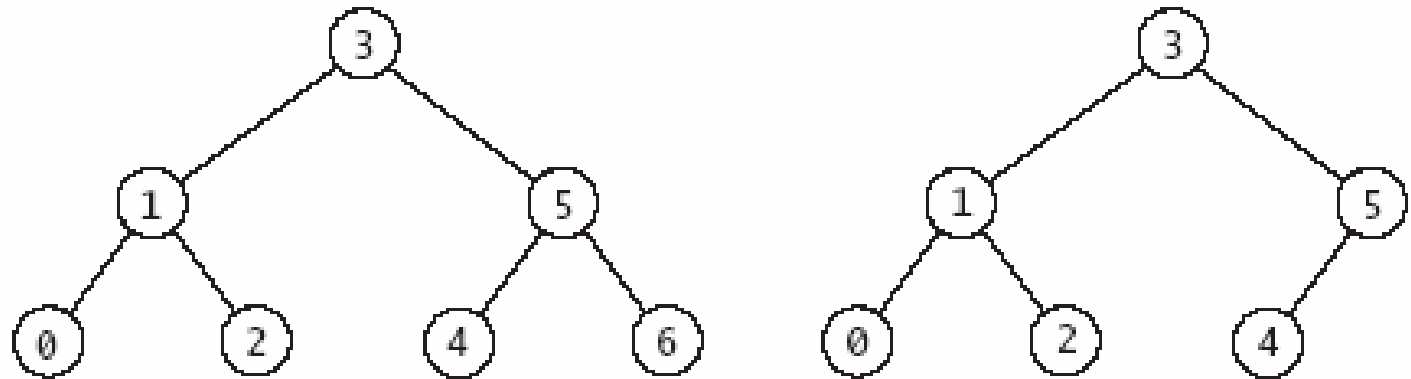
1. if the tree is empty, return **null**
2. if target equals to root node's data, return that data
3. if target $<$ root node data, return search(left subtree)
4. otherwise return search(right subtree)

Fullness and Completeness

- (In computer science) trees grow from the *top down*
- New values inserted in new leaf nodes
- A binary tree is full if all leaves are at the same level
- In a full tree, every node has 0 or 2 non-null children

FIGURE 8.6

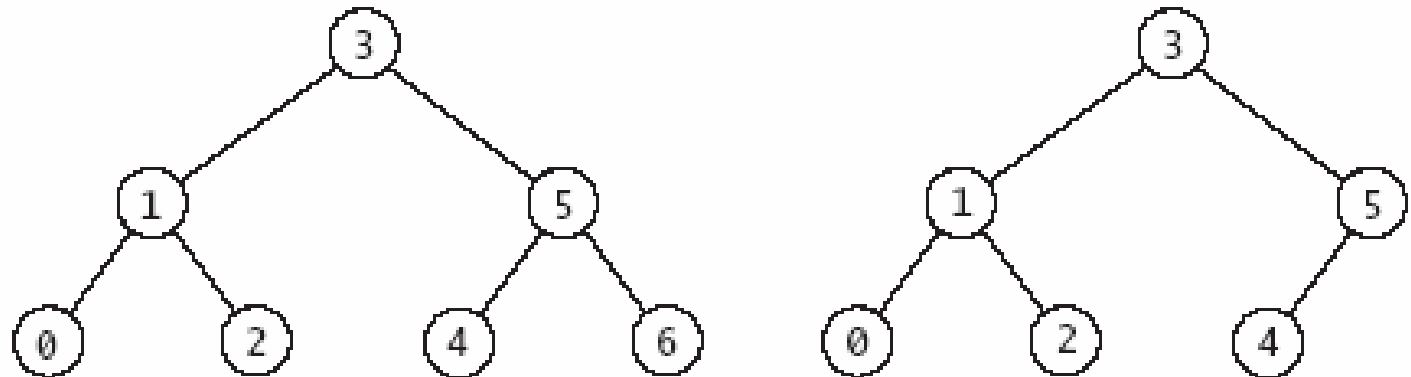
Full Binary Tree (Left) and
Complete Binary Tree
(Right) of Height 3



Fullness and Completeness (2)

- A binary tree is complete if:
 - All leaves are at level h or level $h-1$ (for some h)
 - All level $h-1$ leaves are to the right

.....
FIGURE 8.6
Full Binary Tree (Left) and
Complete Binary Tree
(Right) of Height 3

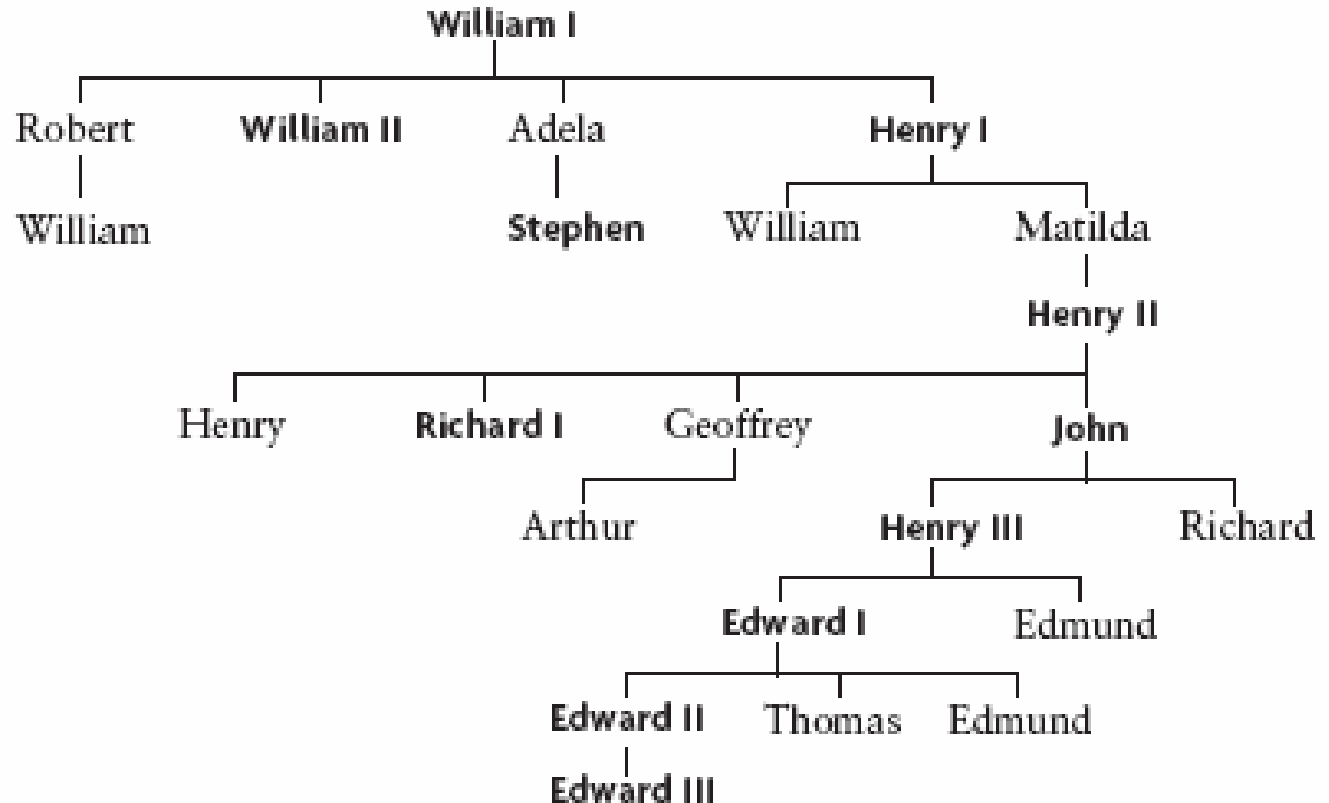


General (Non-Binary) Trees

- Nodes can have any number of children

FIGURE 8.7

Family Tree for the Descendants of William I of England

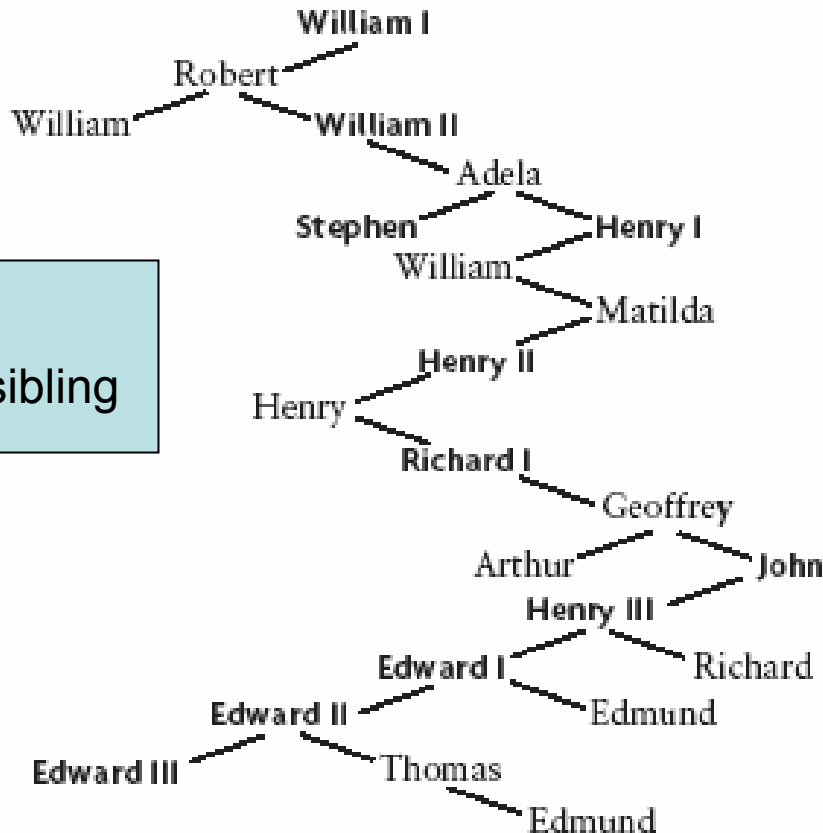


General (Non-Binary) Trees (2)

- A general tree can be represented using a binary tree

FIGURE 8.8

Binary Tree Equivalent
of King William's Family
Tree



Left link is to first child
Right link is to next younger sibling

Traversals of Binary Trees

- Often want iterate over and process nodes of a tree
 - Can walk the tree and visit the nodes in order
 - This process is called **tree traversal**
- Three kinds of binary tree traversal:
 - **Pre**order
 - **In**order
 - **Post**order
- According to order of subtree **root** w.r.t. its **children**

Binary Tree Traversals (2)

- Preorder: Visit root, traverse left, traverse right
- Inorder: Traverse left, visit root, traverse right
- Postorder: Traverse left, traverse right, visit root

Algorithm for Preorder Traversal

1. if the tree is empty
2. Return.
- else
3. Visit the root.
4. Preorder traverse the left subtree.
5. Preorder traverse the right subtree.

Algorithm for Inorder Traversal

1. if the tree is empty
2. Return.
- else
3. Inorder traverse the left subtree.
4. Visit the root.
5. Inorder traverse the right subtree.

Algorithm for Postorder Traversal

1. if the tree is empty
2. Return.
- else
3. Postorder traverse the left subtree.
4. Postorder traverse the right subtree.
5. Visit the root.

Visualizing Tree Traversals

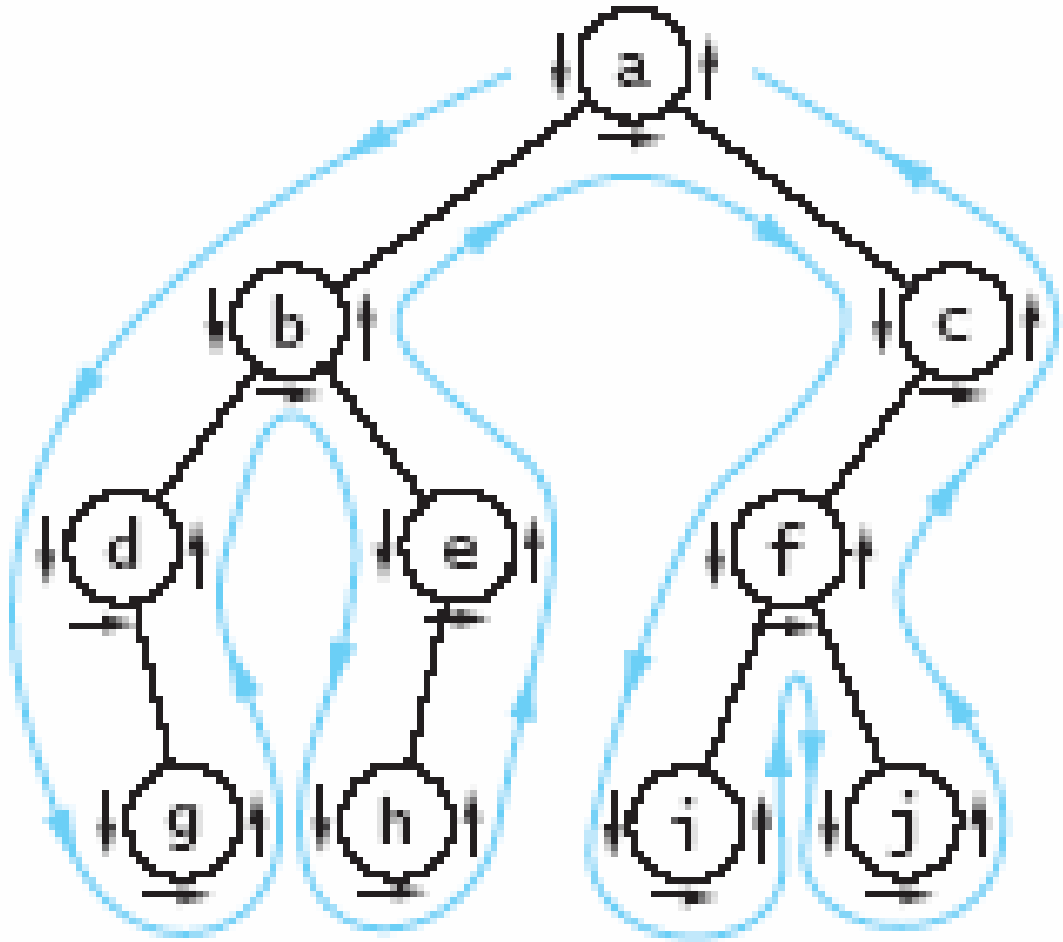
- Can visualize traversal by imagining a mouse that walks along outside the tree
- If mouse keeps the tree on its left, it traces a route called *the Euler tour*:
- *Preorder*: record node first time mouse is there
- *Inorder*: record after mouse traverses left subtree
- *Postorder*: record node last time mouse is there

Visualizing Tree Traversals (2)

FIGURE 8.9

Traversal of a Binary Tree

Preorder:
a, b, d, g, e,
h, c, f, i, j

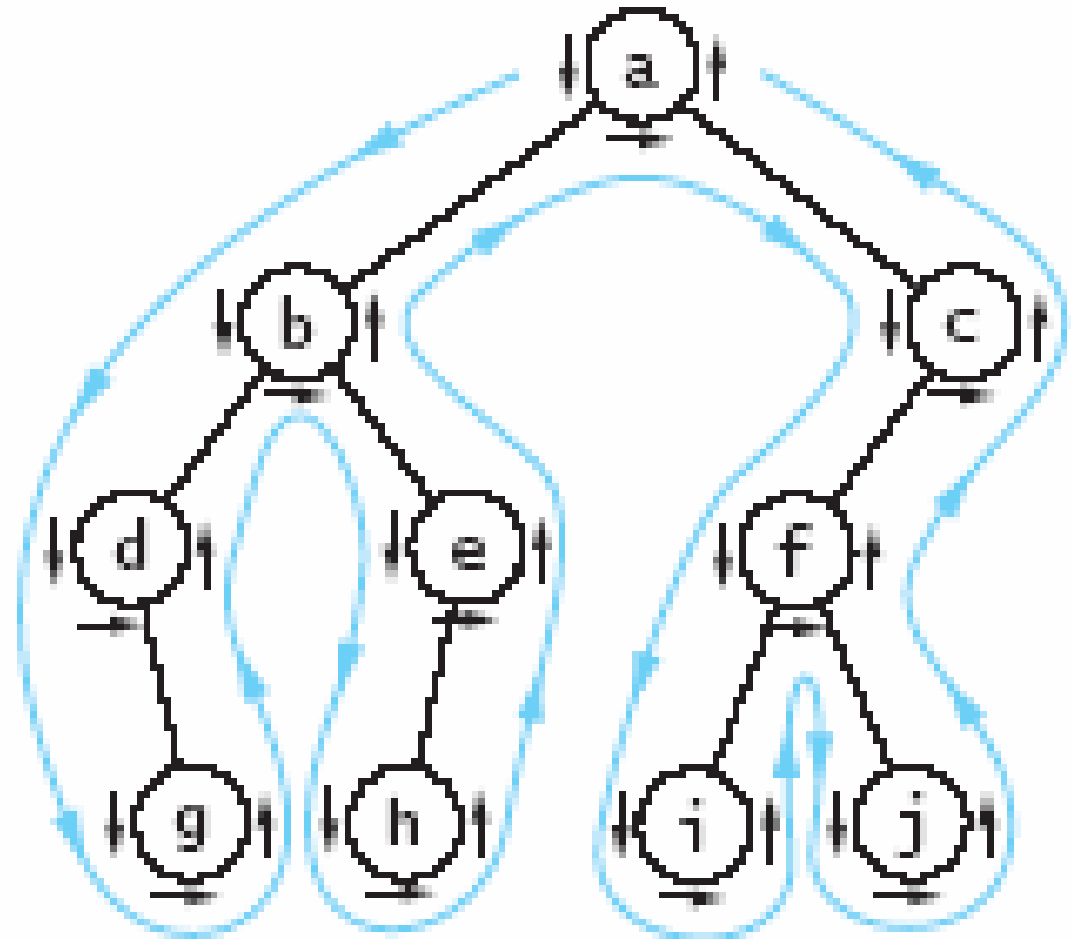


Visualizing Tree Traversals (3)

FIGURE 8.9

Traversal of a Binary Tree

Inorder:
d, g, b, h, e,
a, i, f, j, c

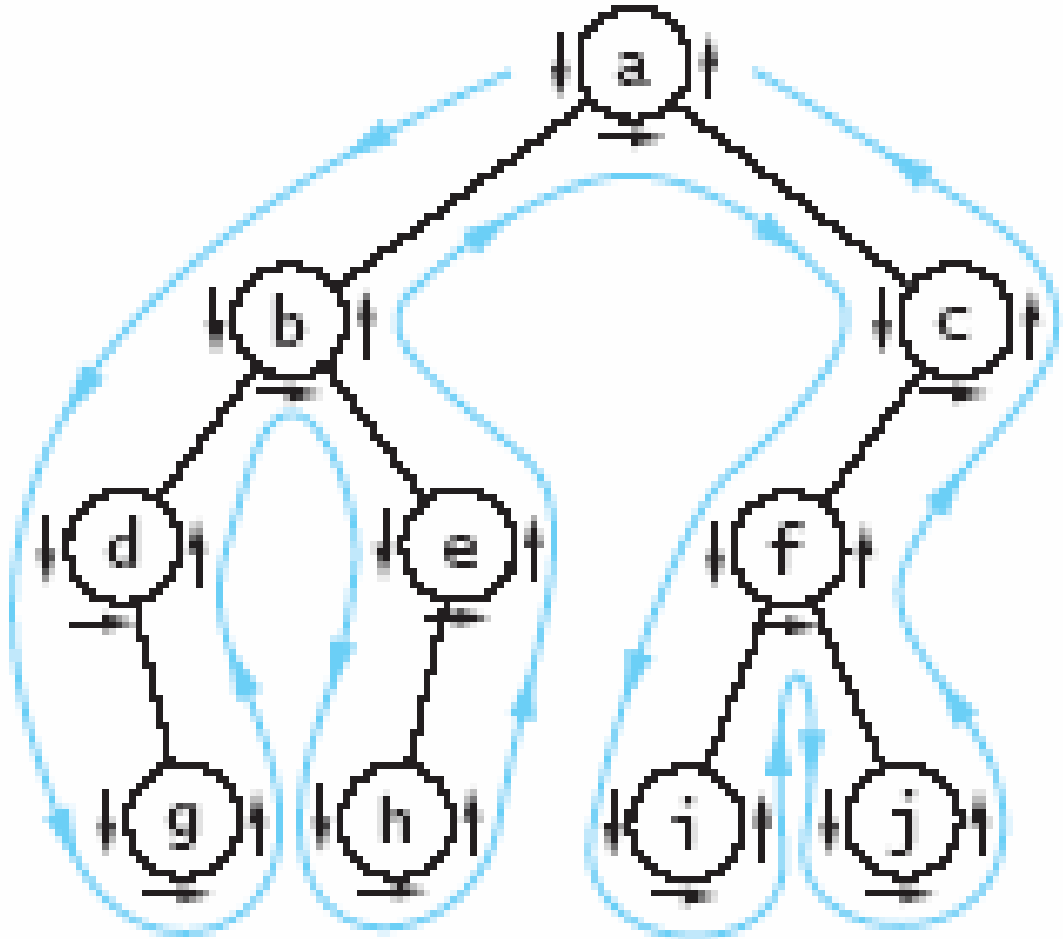


Visualizing Tree Traversals (4)

FIGURE 8.9

Traversal of a Binary Tree

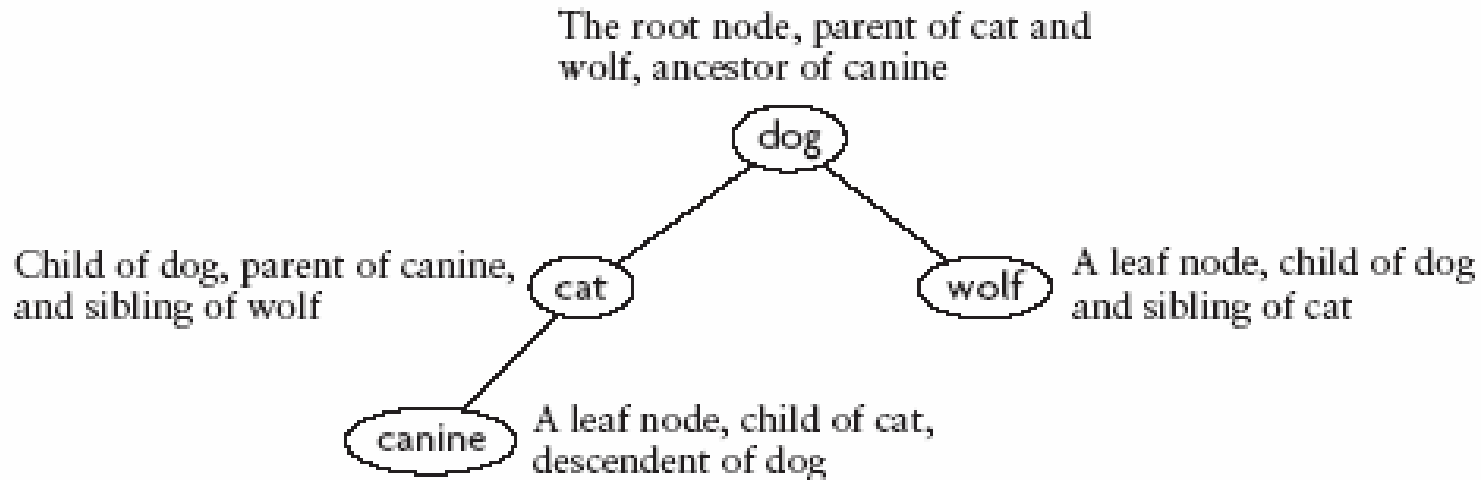
Postorder:
g, d, h, e, b,
i, j, f, c, a



Traversals of Binary Search Trees

- Inorder traversal of a binary search tree →
Nodes are visited in order of increasing data value

FIGURE 8.2
A Tree of Words



Inorder traversal visits in this order: canine, cat, dog, wolf

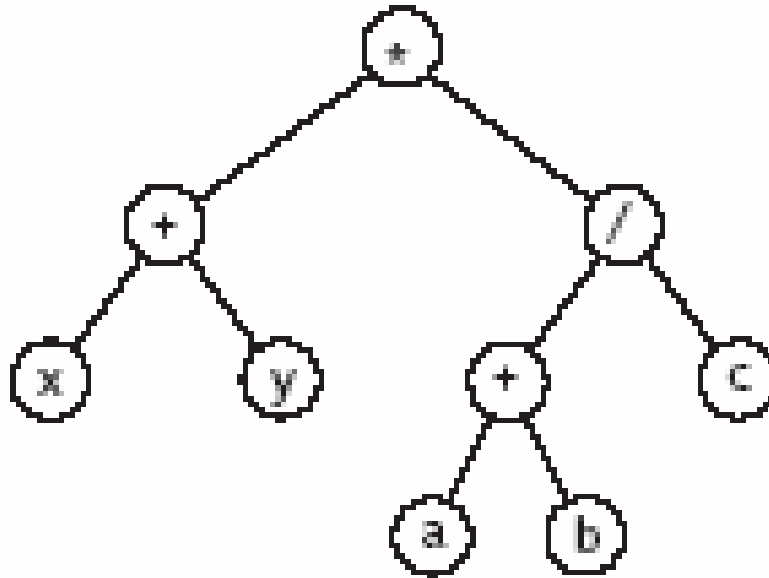
Traversals of Expression Trees

- *Inorder traversal* can insert parentheses where they belong for infix form
- *Postorder traversal* results in postfix form
- *Prefix traversal* results in prefix form

Infix form

$(x + y) * ((a + b) / c)$

Postfix form: $x y + a b + c / *$
Prefix form: $* + x y / + a b c$

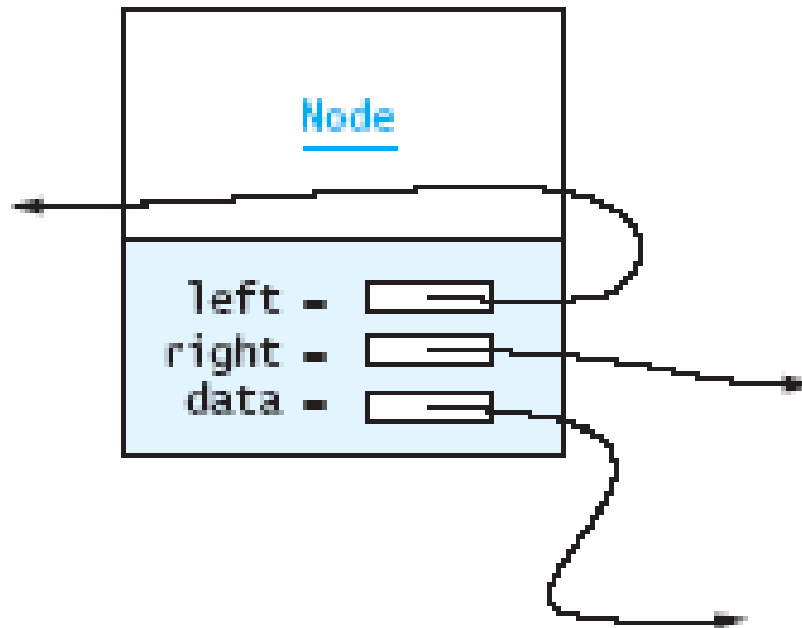


The Node<E> Class

- Like linked list, a node has data + links to successors
- Data is reference to object of type E
- Binary tree node has links for left and right subtrees

FIGURE 8.10

Linked Structure to Represent a Node

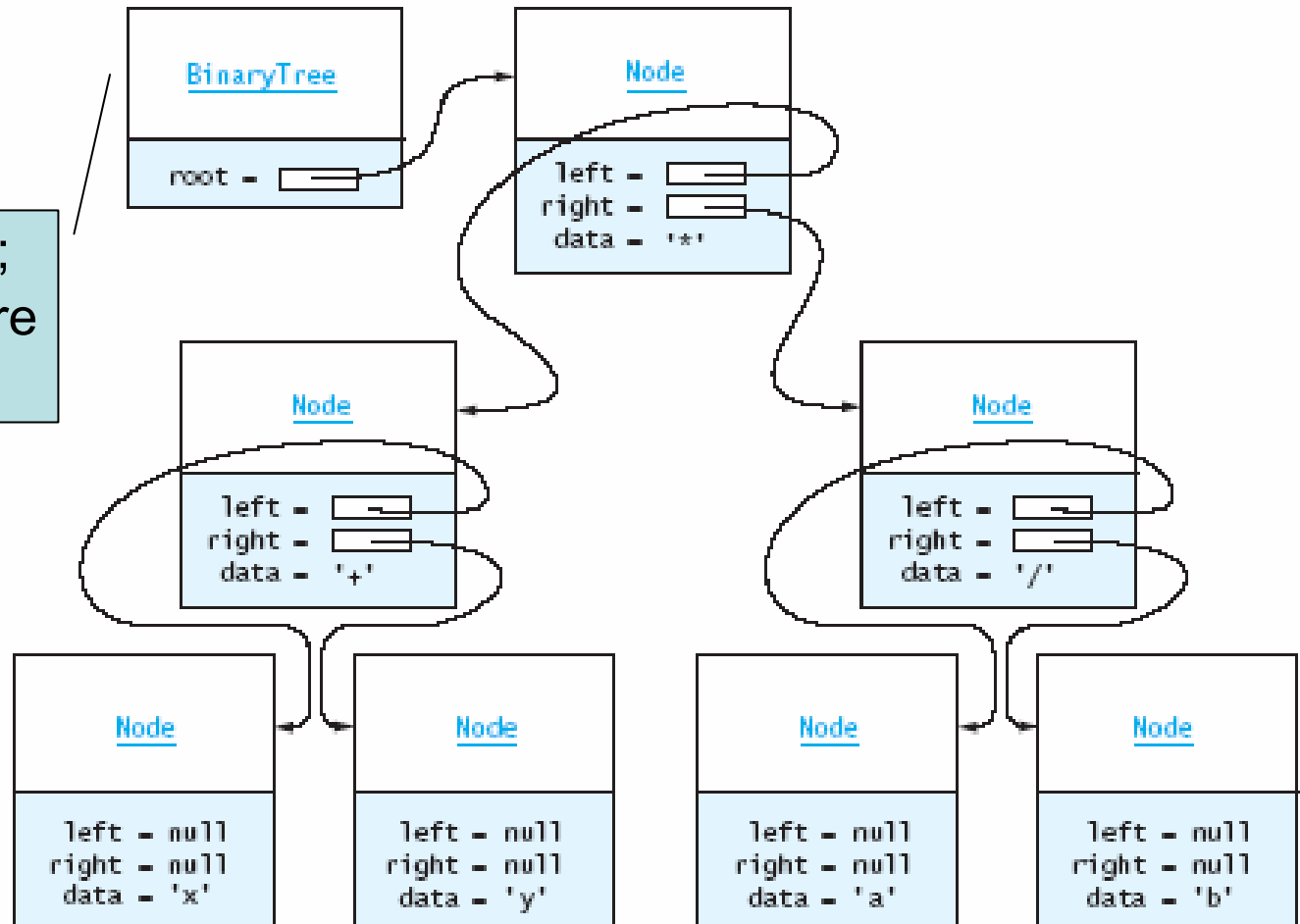


The BinaryTree<E> Class

FIGURE 8.11

Linked Representation
of Expression Tree
($(x + y) * (a / b)$)

BinaryTree<E>;
remaining nodes are
Node<E>



Code for Node<E>

```
protected static class Node<E>
    implements Serializable {

    protected E data;
    protected Node<E> left;
    protected Node<E> right;

    public Node (E e,
                Node<E> l, Node<E> r) {
        this.data = e;
        this.left = l;
        this.right = r;
    }
}
```

Code for Node<E> (2)

```
public Node (E e) {  
    this(e, null, null);  
}  
  
public String toString () {  
    return data.toString();  
}  
  
}
```

Code for BinaryTree<E>

```
import java.io.*;
public class BinaryTree<E>
    implements Serializable {

    protected Node<E> root;

    protected static class Node<E> ...{...}

    public BinaryTree () { root = null; }

    protected BinaryTree (Node<E> root) {
        this.root = root;
    }
}
```

Code for BinaryTree<E> (2)

```
public BinaryTree (E data,  
                  BinaryTree<E> left,  
                  BinaryTree<E> right) {  
    root = new Node<E>  
        (e,  
         (left == null) ? null : left .root,  
         (right == null) ? null : right.root);  
}
```

Code for BinaryTree<E> (3)

```
public BinaryTree<E> getLeftSubtree () {  
    if (root == null || root.left == null)  
        return null;  
    return new BinaryTree<E>(root.left);  
}
```

```
public BinaryTree<E> getRightSubtree () {  
    if (root == null || root.right == null)  
        return null;  
    return new BinaryTree<E>(root.right);  
}
```

Code for BinaryTree<E> (4)

```
public boolean isLeaf () {
    return root.left == null &&
           root.right == null;
}

public String toString () {
    StringBuilder sb = new StringBuilder();
    preOrderTraverse(root, 1, sb);
    return sb.toString();
}
```

Code for BinaryTree<E> (5)

```
private void preOrderTraverse (Node<E> n,
    int d, StringBuilder sb) {
    for (int i = 1; i < d; ++i)
        sb.append(" ");
    if (node == null)
        sb.append("null\n");
    else {
        sb.append(node.toString());
        sb.append("\n");
        preOrderTraverse(node.left , d+1, sb);
        preOrderTraverse(node.right, d+1, sb);
    }
}
```


Code for BinaryTree<E> (6)

```
public static BinaryTree<String>
    readBinaryTree (BufferedReader bR)
        throws IOException {
    String data = bR.readLine().trim();
    if (data.equals("null"))
        return null;
    BinaryTree<String> l =
        readBinaryTree(bR);
    BinaryTree<String> r =
        readBinaryTree(bR);
    return new BinaryTree<String>(
        data, l, r);
}
```

Overview of Binary Search Tree

Binary search tree definition:

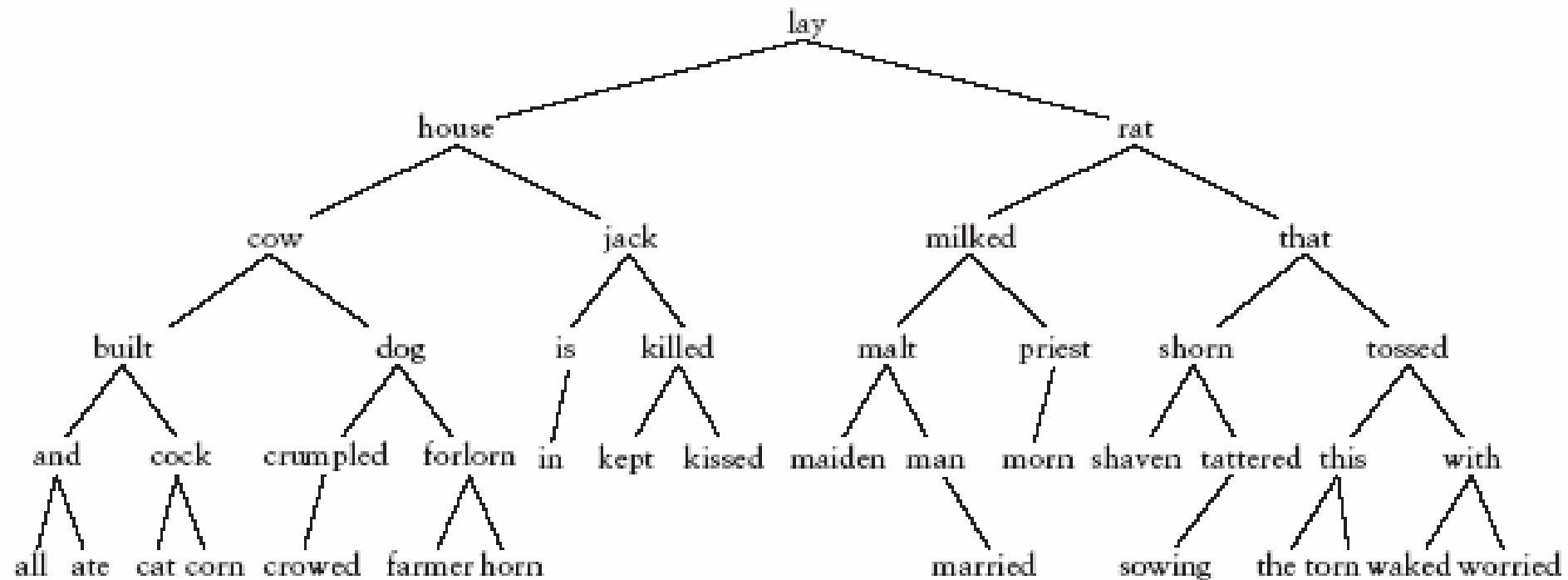
T is a binary search tree if either of these is true

- T is empty; or
- Root has two subtrees:
 - Each is a binary search tree
 - Value in root $>$ all values of the left subtree
 - Value in root $<$ all values in the right subtree

Binary Search Tree Example

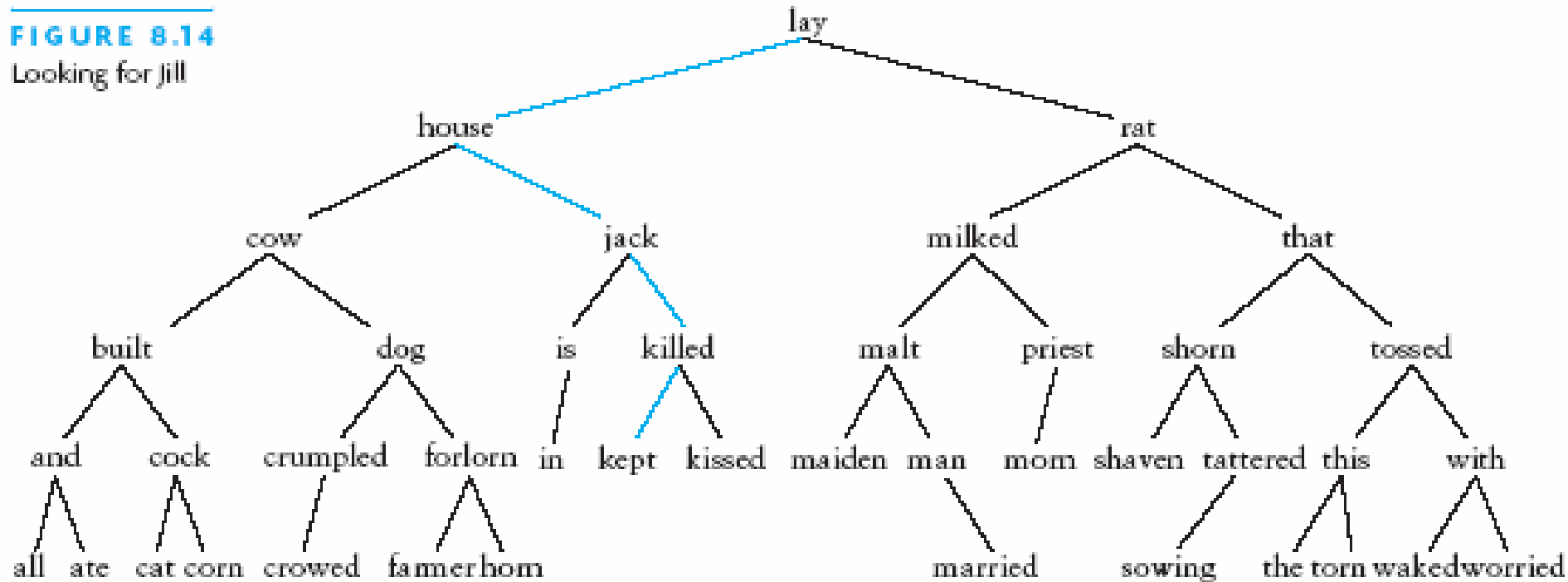
FIGURE 8.13

Binary Search Tree Containing All of the Words from "The House That Jack Built"



Searching a Binary Tree

FIGURE 8.14
Looking for Jill



Searching a Binary Tree: Algorithm

1. if root is **null**
2. item not in tree: return **null**
3. compare **target** and **root.data**
4. if they are *equal*
5. **target** is found, return **root.data**
6. else if **target < root.data**
7. return search(left subtree)
8. else
9. return search(right subtree)

Class `TreeSet<E>` and Interface `SearchTree<E>`

- Java API offers `TreeSet<E>`
 - Implements binary search trees
 - Has operations such as `add`, `contains`, `remove`
- We define `SearchTree<E>`, offering some of these

Code for Interface SearchTree<E>

```
public interface SearchTree<E> {  
    // add/remove say whether tree changed  
    public boolean add (E e);  
    boolean remove (E e);  
    // contains tests whether e is in tree  
    public boolean contains (E e);  
    // find and delete return e if present,  
    //     or null if it is not present  
    public E find (E e);  
    public E delete (E e);  
}
```

Code for BinarySearchTree<E>

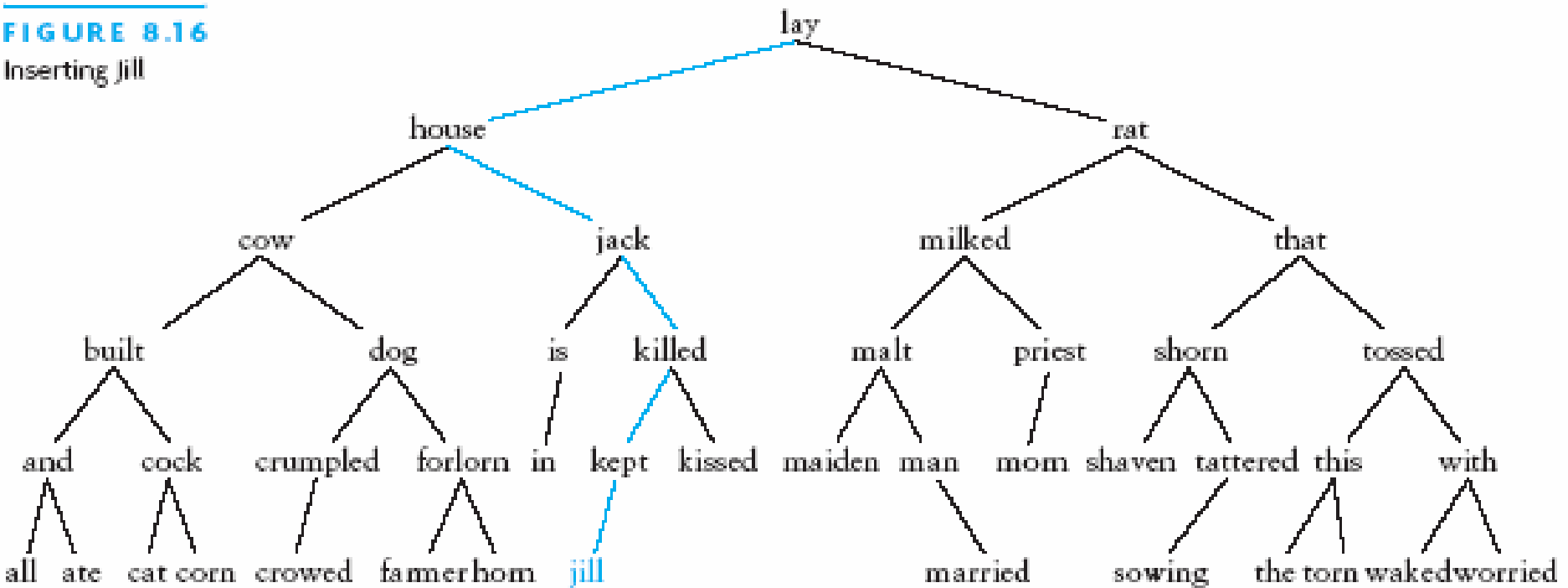
```
public class BinarySearchTree<
    E extends Comparable<E>>
    extends BinaryTree<E>
    implements SearchTree<E> {
protected boolean addReturn;
protected E      deleteReturn;
// these two hold the "extra" return
// values from the SearchTree adding
// and deleting methods
    ...
}
```


BinarySearchTree.find(E e)

```
public E find (E e) {
    return find(root, e);
}
private E find (Node<E> n, E e) {
    if (n == null) return null;
    int comp = e.compareTo(n.data);
    if (comp == 0) return n.data;
    if (comp < 0)
        return find(n.left , e);
    else
        return find(n.right, e);
}
```

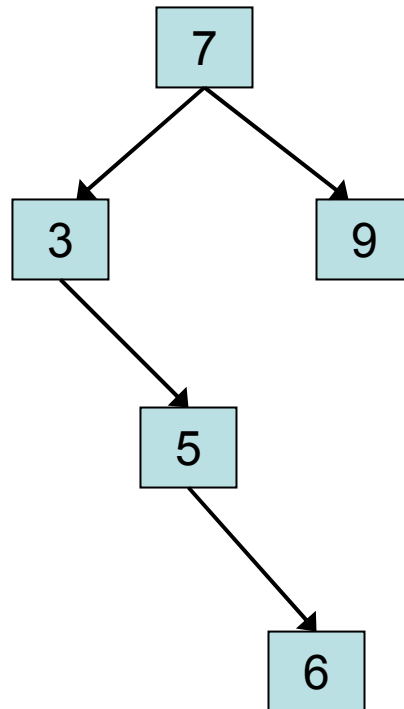
Insertion into a Binary Search Tree

FIGURE 8.16
Inserting Jill



Example Growing a Binary Search Tree

1. insert 7
2. insert 3
3. insert 9
4. insert 5
5. insert 6



Binary Search Tree Add Algorithm

1. if root is **null**
2. replace empty tree with new data leaf; return **true**
3. if **item equals root.data**
4. return **false**
5. if **item < root.data**
6. return insert(left subtree, item)
7. else
8. return insert(right subtree, item)

BinarySearchTree.add(E e)

```
public boolean add (E e) {  
    root = add(root, item);  
    return addReturn;  
}
```

BinarySearchTree.add(E e) (2)

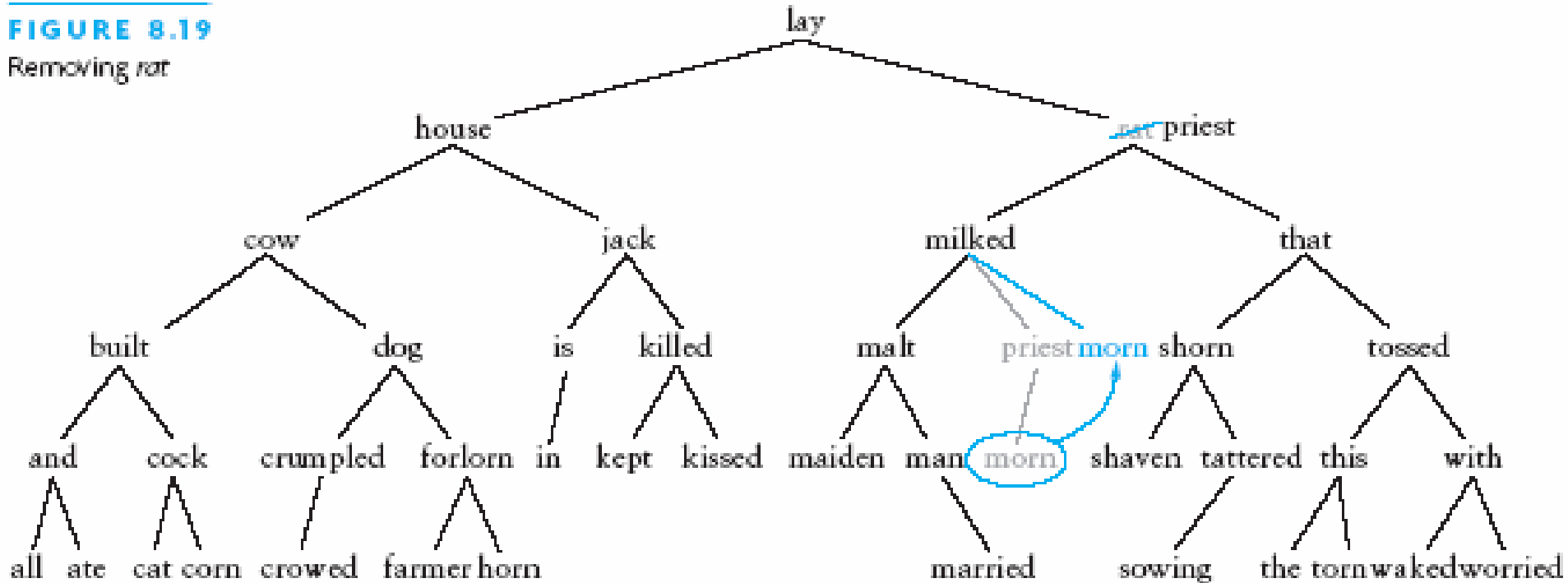
```
private Node<E> add (Node<E> n, E e) {  
    if (n == null) { addReturn = true;  
        return new Node<E>(e);  
    }  
    int comp = e.compareTo(n.data);  
    if (comp == 0)  
        addReturn = false;  
    else if (comp < 0)  
        n.left = add(n.left , e);  
    else  
        n.right = add(n.right, e);  
    return n;  
}
```

Removing from a Binary Search Tree

- Item not present: do nothing
- Item present in leaf: remove leaf (change to null)
- Item in non-leaf with one child:
Replace current node with that child
- Item in non-leaf with two children?
 - Find largest item in the left subtree
 - Recursively remove it
 - Use it as the parent of the two subtrees
 - (Could use smallest item in right subtree)

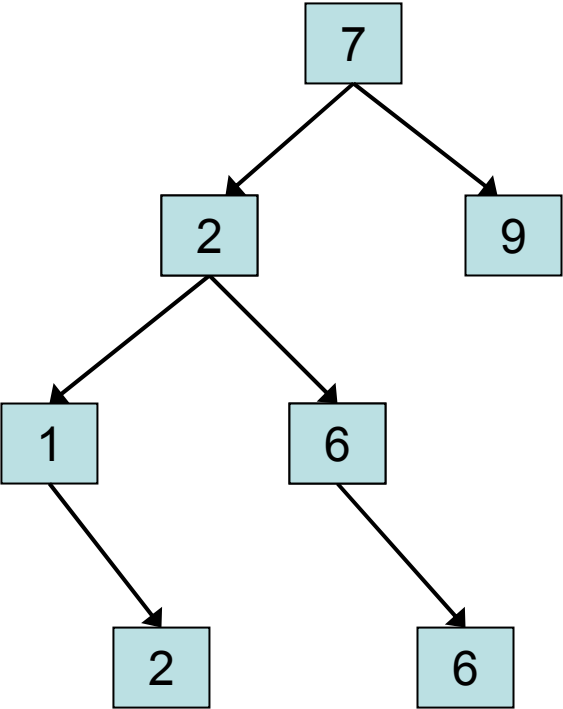
Removing from a Binary Search Tree (2)

FIGURE 8.19
Removing rat



Example Shrinking a Binary Search Tree

- 1. delete 9
- 2. delete 5
- 3. delete 3



BinarySearchTree.delete(E e)

```
public E delete (E e) {
    root = delete(root, item);
    return deleteReturn;
}
private Node<E> delete (Node<E> n E e) {
    if (n == null) {
        deleteReturn = null;
        return null;
    }
    int comp = e.compareTo(n.data);
    ...
}
```

BinarySearchTree.delete(E e) (2)

```
if (comp < 0) {
    n.left = delete(n.left, e);
    return n;
} else if (comp > 0) {
    n.right = delete(n.right, e);
    return n;
} else {
    // item is in n.data
    deleteReturn = n.data;
    ...
}
}
```

BinarySearchTree.delete(E e) (3)

```
// deleting value in n: adjust tree
if (n.left == null) {
    return n.right; // ok if also null
} else if (n.right == null) {
    return n.left;
} else {
    // case where node has two children
    ...
}
```

BinarySearchTree.delete(E e) (4)

```
// case where node has two children
if (n.left.right == null) {
    // largest to left is in left child
    n.data = n.left.data;
    n.left = n.left.left;
    return n;
} else {
    n.data = findLargestChild(n.left);
    return n;
}
```

findLargestChild

```
// finds and removes largest value under n
private E findLargestChild (Node<E> n) {
    // Note: called only for n.right != null
    if (n.right.right == null) {
        // no right child: this value largest
        E e = n.right.data;
        n.right = n.right.left; // ok if null
        return e;
    }
    return findLargestChild(n.right);
}
```

Using Binary Search Trees

- Want an index of words in a paper, by line #
- Put word/line # strings into a binary search tree
 - “java, 0005”, “a, 0013”, and so on
- Performance?
 - Average BST performance is $O(\log n)$
 - Its rare worst case is $O(n)$
 - Happens (for example) with sorted input
 - Ordered list performance is $O(n)$
- Later consider *guaranteeing* $O(\log n)$ trees

Using Binary Search Trees: Code

```
public class IndexGen {
    private TreeSet<String> index;
    public IndexGen () {
        index = new TreeSet<String>();
    }

    public void showIndex () {
        for (String next : index)
            System.out.println(next);
    }
    ...
}
```


Using Binary Search Trees: Code (2)

```
public void build (BufferedReader bR)
    throws IOException {
    int lineNum = 0;
    String line;
    while ((line = bR.readLine()) != null) {
        // process line
    }
}
```

Using Binary Search Trees: Code (3)

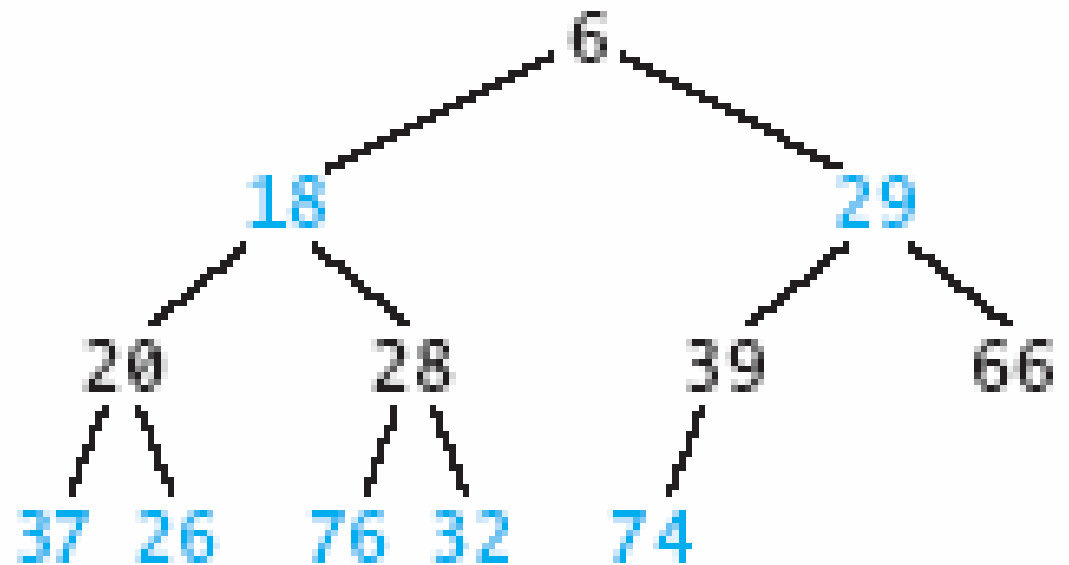
```
// processing a line:
StringTokenizer tokens =
    new StringTokenizer(line, ...);
while (tokens.hasNextToken()) {
    String tok =
        tokens.nextToken().toLowerCase();
    index.add(
        String.format("%s, %04d",
                      tok, lineNumber));
}
```

Heaps

- A **heap** orders its nodes, but in a way different from a binary search tree
- A complete tree is a heap if
 - The value in the root is the smallest of the tree
 - Every subtree is also a heap
- Equivalently, a complete tree is a heap if
 - Node value $<$ child value, for each child of the node
- **Note:** This use of the word “heap” is entirely different from the heap that is the allocation area in Java

Example of a Heap

FIGURE 8.20
Example of a Heap



Inserting an Item into a Heap

1. Insert the item in the next position across the bottom of the complete tree: preserve completeness
2. Restore “heap-ness”:
 1. **while** new item not root and $<$ parent
 2. swap new item with parent

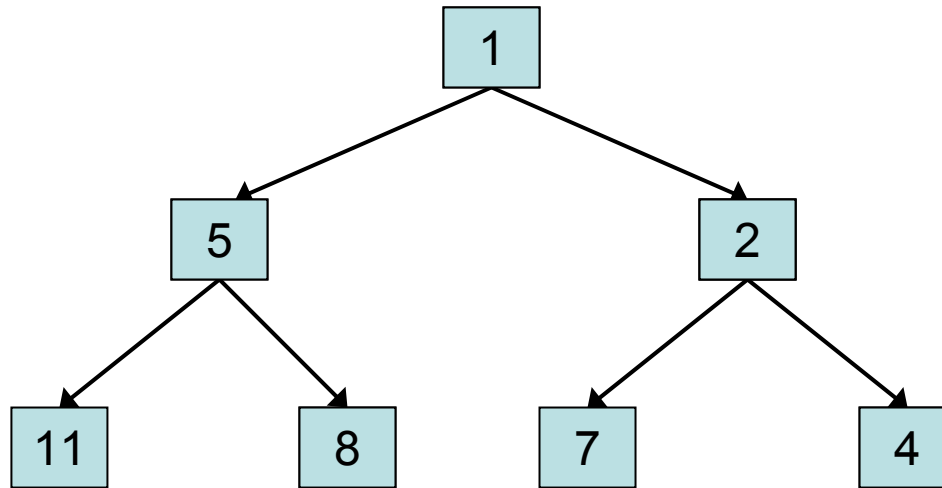
Example Inserting into a Heap

Insert 1

Add as leaf

Swap up

Swap up



Removing an Item from a Heap

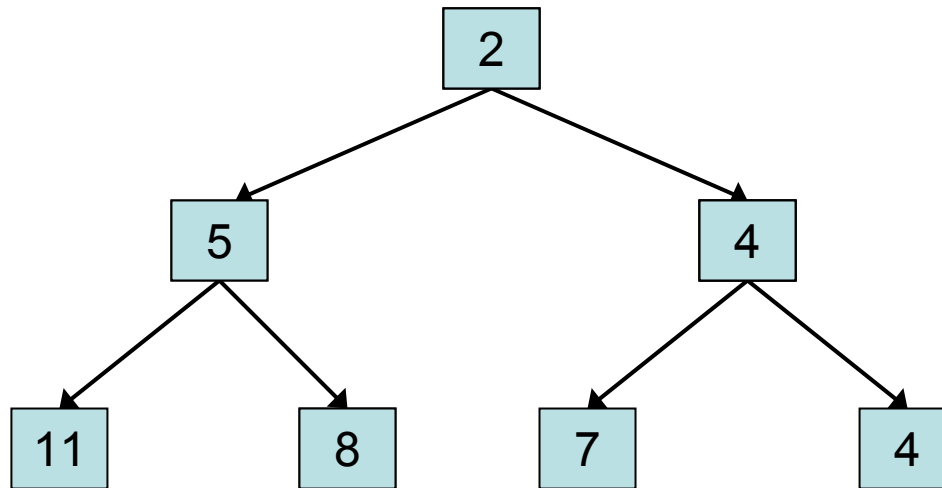
- Removing an item is always from the top:
 - Remove the root (minimum element):
 - Leaves a “hole”:
 - Fill the “hole” with the last item (lower right-hand) L
 - Preserve completeness
 - Swap L with smallest child, as necessary
 - Restore “heap-ness”

Example Removing From a Heap

Remove: returns 1

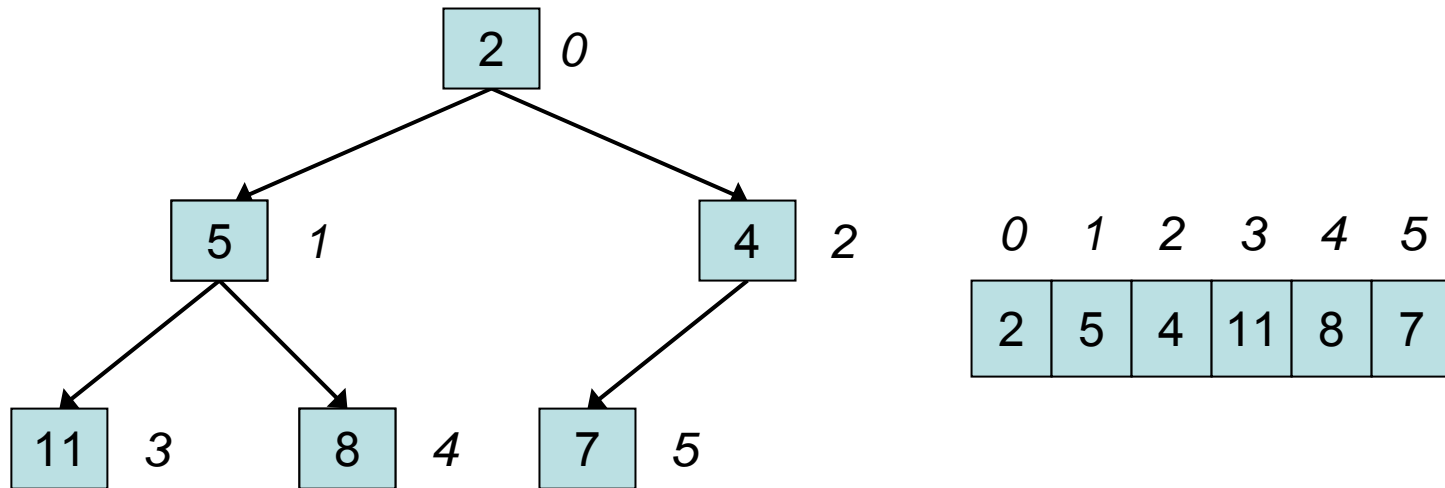
Move 4 to root

Swap down



Implementing a Heap

- Recall: a heap is a complete binary tree
 - (plus the heap ordering property)
- A complete binary tree fits nicely in an array:
 - The root is at index 0
 - Children of node at index i are at indices $2i+1$, $2i+2$



Inserting into an Array(List) Heap

1. Insert new item at end; set **child** to size-1
2. Set **parent** to $(\mathbf{child} - 1)/2$
3. **while** (**parent** ≥ 0 and $a[\mathbf{parent}] > a[\mathbf{child}]$)
4. Swap $a[\mathbf{parent}]$ and $a[\mathbf{child}]$
5. Set **child** equal to **parent**
6. Set **parent** to $(\mathbf{child} - 1) / 2$

Deleting from an Array(List) Heap

1. Set $a[0]$ to $a[\text{size}-1]$, and shrink size by 1
2. Set **parent** to 0
3. **while (true)**
4. Set **lc** to $2 * \text{parent} + 1$, and **rc** to **lc** + 1
5. If **lc** \geq size, break out of **while** (we're done)
6. Set **minc** to **lc**
7. If **rc** < size and $a[\text{rc}] < a[\text{lc}]$, set **minc** to **rc**
8. If $a[\text{parent}] \leq a[\text{minc}]$, break (we're done)
9. Swap $a[\text{parent}]$ and $a[\text{minc}]$; set **parent** to **minc**

Performance of Array(List) Heap

- A complete tree of height h has:
 - Less than 2^h nodes
 - At least 2^{h-1} nodes
- Thus complete tree of n nodes has height $O(\log n)$
- Insertion and deletion at most do constant amount of work at each level
- Thus these operations are $O(\log n)$, always
- Heap forms the basis of *heapsort* algorithm (Ch. 10)
- Heap also useful for priority queues

Priority Queues

- A priority queue de-queues items in priority order
 - Not in order of entry into the queue (not FIFO)
- Heap is an efficient implementation of priority queue
 - Operations cost at most $O(\log n)$

```
public boolean offer (E e); // insert
public E remove (); // return smallest
public E poll (); // smallest or null
public E peek (); // smallest or null
public E element (); // smallest
```

Design of Class PriQueue<E>

```
ArrayList<E> data; // holds the data

PriQueue () // uses natural order of E
PriQueue (int n, Comparator<E> comp)
    // uses size n, uses comp to order

private int compare (E left, E right)
    // compares two E objects: -1, 0, 1
private void swap (int i, int j)
    // swaps elements at positions i and j
```

Implementing PriQueue<E>

```
public class PriQueue<E>
    extends AbstractQueue<E>
    implements Queue<E> {
private ArrayList<E> data;
Comparator<E> comparator = null;

public PriQueue () {
    data = new ArrayList<E>();
}
...
}
```

Implementing PriQueue<E> (2)

```
public PriQueue (int n,  
                 Comparator<E> comp) {  
    if (n < 1)  
        throw new IllegalArgumentException();  
    data = new ArrayList<E>(n);  
    this.comp = comp;  
}
```


Implementing PriQueue<E> (3)

```
private int compare (E lft, E rt) {  
    if (comp != null)  
        return comp.compare(lft, rt);  
    else  
        return  
            ((Comparable<E>)lft).compareTo(rt);  
}
```

Implementing PriQueue<E> (4)

```
public boolean offer (E e) {
    data.add(e);
    int child = data.size() - 1;
    int parent = (child - 1) / 2;
    while (parent >= 0 &&
           compare(data.get(parent),
                  data.get(child)) > 0) {
        swap(parent, child);
        child = parent;
        parent = (child - 1) / 2;
    }
    return true;
}
```

Implementing PriQueue<E> (5)

```
public E poll () {
    if (isEmpty()) return null;
    E result = data.get(0);
    if (data.size() == 1) {
        data.remove(0);
        return result;
    }
    // remove last item and store in posn 0
    data.set(0, data.remove(data.size()-1));
    int parent = 0;
    while (true)
        ... swap down as necessary ...
    return result;
}
```

Implementing PriQueue<E> (6)

```
// swapping down
int lc = 2 * parent + 1;
if (lc >= data.size()) break;
int rc = lc + 1;
int minc = lc;
if (rc < data.size() &&
    compare(data.get(lc),
            data.get(rc)) > 0)
    minc = rc;
if (compare(data.get(parent),
            data.get(minc)) <= 0) break;
swap(parent, minc);
parent = minc;
```

Huffman Trees

Problem Input: A set of symbols, each with a frequency of occurrence.

Desired output: A Huffman tree giving a code that minimizes the bit length of strings consisting of those symbols with that frequency of occurrence.

Strategy: Starting with single-symbol trees, repeatedly combine the two lowest-frequency trees, giving one new tree of frequency = sum of the two frequencies. Stop when we have a single tree.

Huffman Trees (2)

Implementation approach:

- Use a priority queue to find lowest frequency trees
- Use binary trees to represent the Huffman (de)coding trees

Example: $b=13$, $c=22$, $d=32$ $a=64$ $e=103$

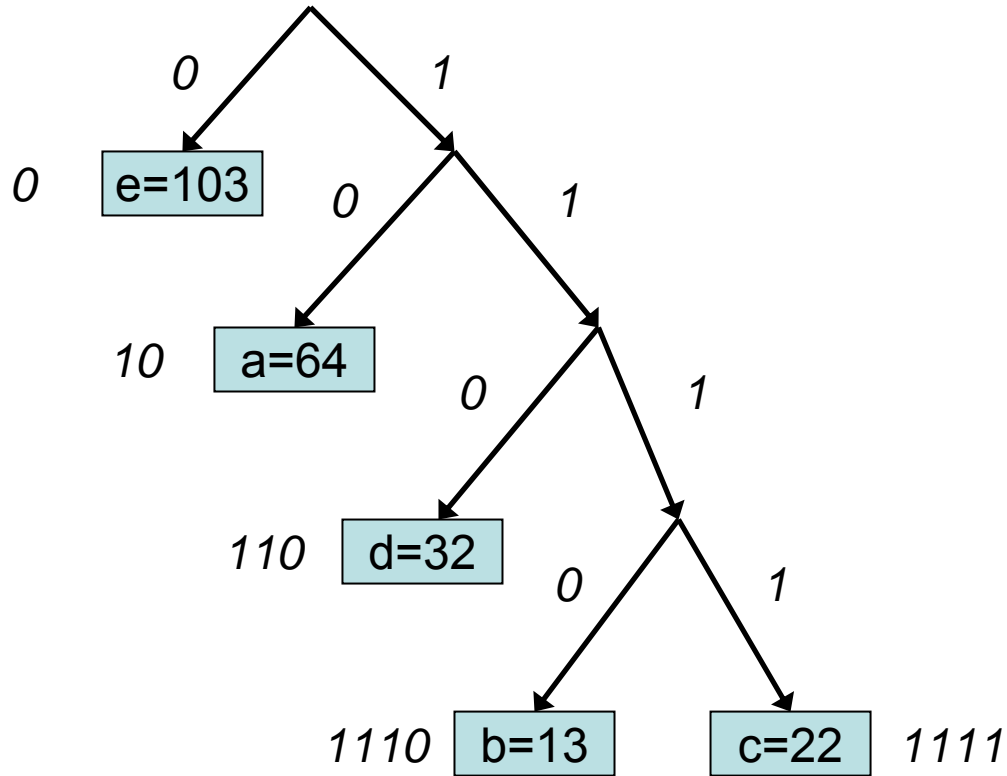
Combine b and c : $bc=35$

Combine d and bc : $d(bc)=67$

Combine a and $d(bc)$: $a(d(bc))=131$

Combine e and $a(d(bc))$: $e(a(d(bc)))=234$... done

Huffman Tree Example



Design of Class HuffTree

```
private BinaryTree<HuffData> huffTree;  
    // HuffData are pairs: weight, symbol  
  
buildTree (HuffData[] input)  
String decode (String message)  
printcode (Printstream out)
```


Implementing HuffTree

```
public class HuffTree
    implements Serializable {
    public static class HuffData
        implements Serializable {
        private double weight;
        private Character symbol;
        public HuffData (double weight,
                        Character symbol) {
            this.weight = weight;
            this.symbol = symbol;
        }
    }
}
```

Implementing HuffTree (2)

```
private BinaryTree<HuffData> tree;

private static class CompHuff
    implements
        Comparator<BinaryTree<HuffData>> {
public int compare (
    BinaryTree<HuffData> lft,
    BinaryTree<HuffData> rt) {
double wL = lft.getData().weight;
double wR = rt .getdata().weight;
return Double.compare(wL, wR);
}
}
```

Implementing HuffTree (3)

```
public void buildTree (HuffData[] syms) {
    Queue<BinaryTree<HuffData>> q =
        new PriorityQueue<BinaryTree<HuffData>>(
            syms.length, new CompHuffTree());
    for (HuffData sym : syms) {
        BinaryTree<HuffData> tree =
            new BinaryTree<HuffData>(sym);
        q.offer(tree);
    }
    ... on to second half ...
}
```

Implementing HuffTree (4)

```
while (q.size() > 1) {
    BinaryTree<HuffData> lft = q.poll();
    BinaryTree<HuffData> rt  = q.poll();
    double wl = lft.getData().weight;
    double wr = rt .getData().weight;
    HuffData sum =
        new HuffData(wl+wr, null);
    BinaryTree<HuffData> nTree =
        new BinaryTree<HuffData>
            (sum, lft, rt);
    q.offer(nTree);
}
this.tree = q.poll();
```

Implementing HuffTree (5)

```
private void printCode
    (PrintStream out, String code,
     BinaryTree<HuffData> tree) {
HuffData data = tree.getData;
if (data.symbol != null) {
    if (data.symbols.equals(" "))
        out.println("space: " + code);
    else
        out.println(data.symbol+"": "+code);
} else {
    printCode(out,code+"0", tree.left ());
    printCode(out,code+"1", tree.right ());
} }
```

Implementing HuffTree (6)

```
public string decode (String msg) {
    StringBuilder res = new StringBuilder();
    BinaryTree<HuffData> curr = tree;
    for (int i = 0; i < msg.length(); ++i) {
        if (msg.charAt(i) == '1')
            curr = curr.getRightSubtree();
        else
            curr = curr.getLeftSubtree();
        if (curr.isLeaf()) {
            HuffData data = curr.getData();
            res.append(data.symbol);
            curr = tree;
        }
    } return res.toString();
}
```