

# Hierarchical Data Representation

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# Trees

- ❑ **Nonlinear** and **Hierarchical** data structure

- ✓ Tree **nodes** can have **multiple successors**, but **only one predecessor**
  - E.g.) class hierarchy, disk directory and subdirectories, family tree



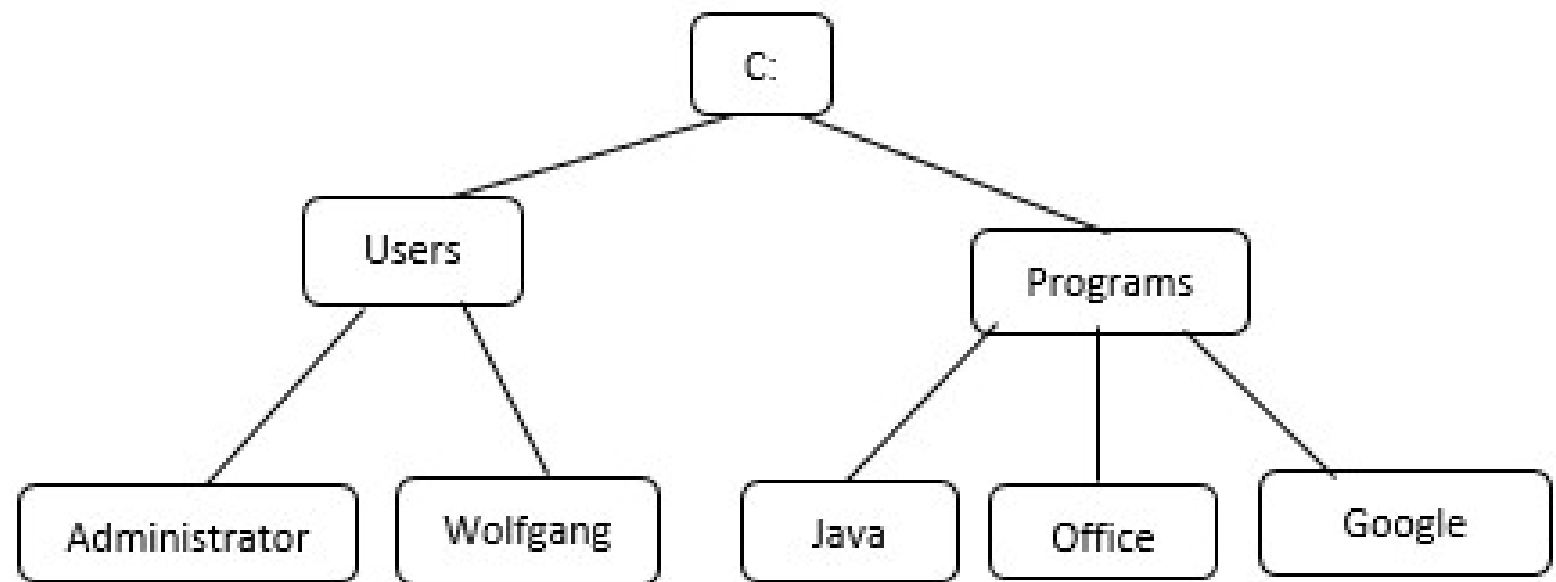
- ❑ **Linear** data structure

- ✓ Each element can have **only one predecessor** and **successor**
- ✓ **Accessing all elements** in a linear sequence is  **$O(n)$**

- ❑ **Recursive** data structures because they can be defined recursively

# List and Tree Form of a Directory

C:  
Users  
  Administrator  
  Wolfgang  
Programs  
  Java  
  Office  
  Google

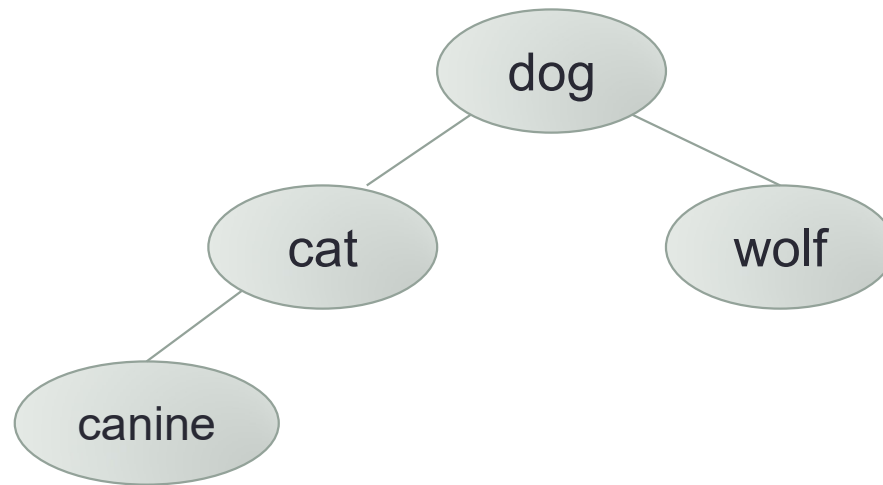


# TREE TERMINOLOGY AND APPLICATIONS

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# Tree Terminology

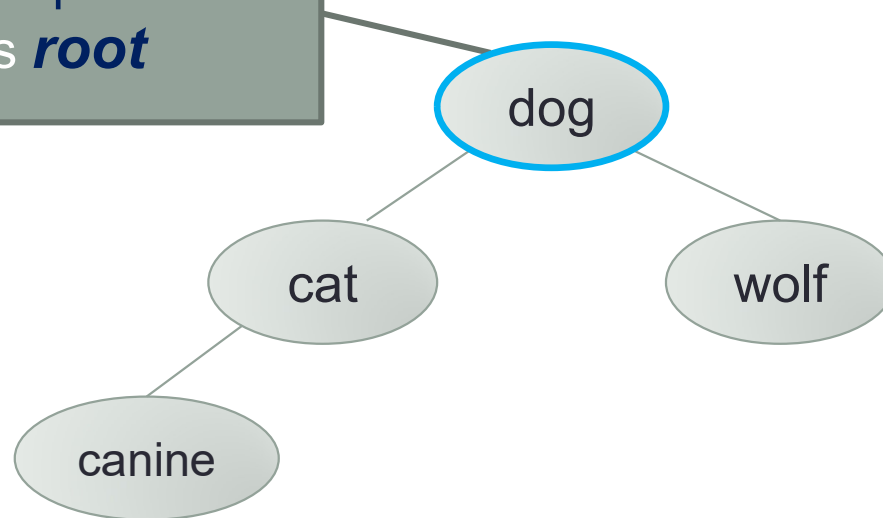
A **tree** consists of a **collection of elements** or **nodes**, with **each node linked** to its **successors**



# Tree Terminology (cont.)

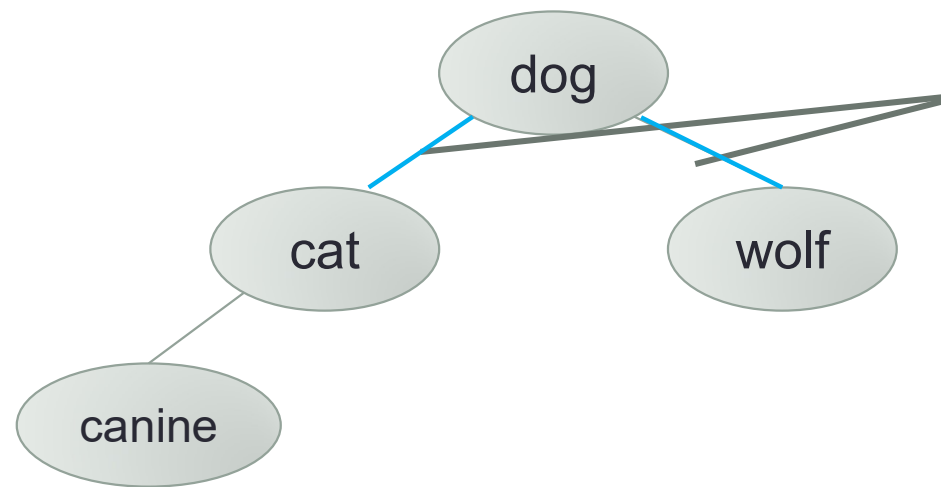
A tree consists of a collection of elements or nodes, with each node linked to its successors

The **node** at the top of a tree is called its **root**



# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors

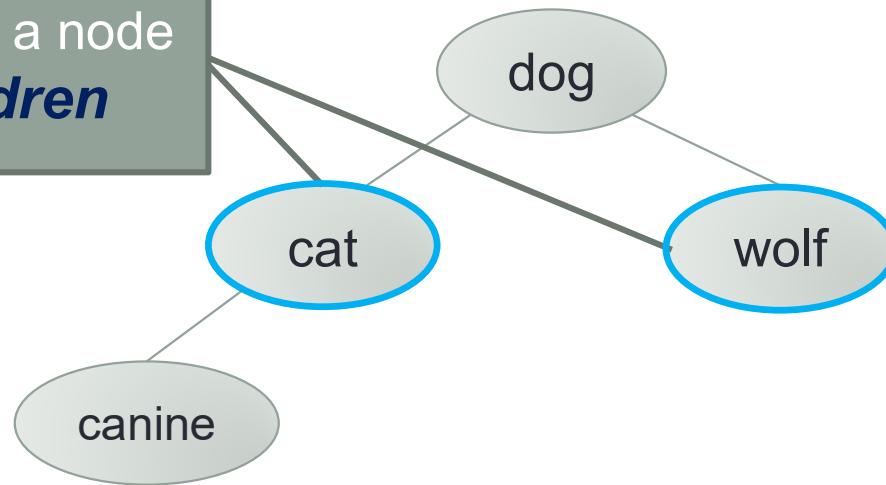


The **links** from a **node** to its successors are called ***branches***

# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors

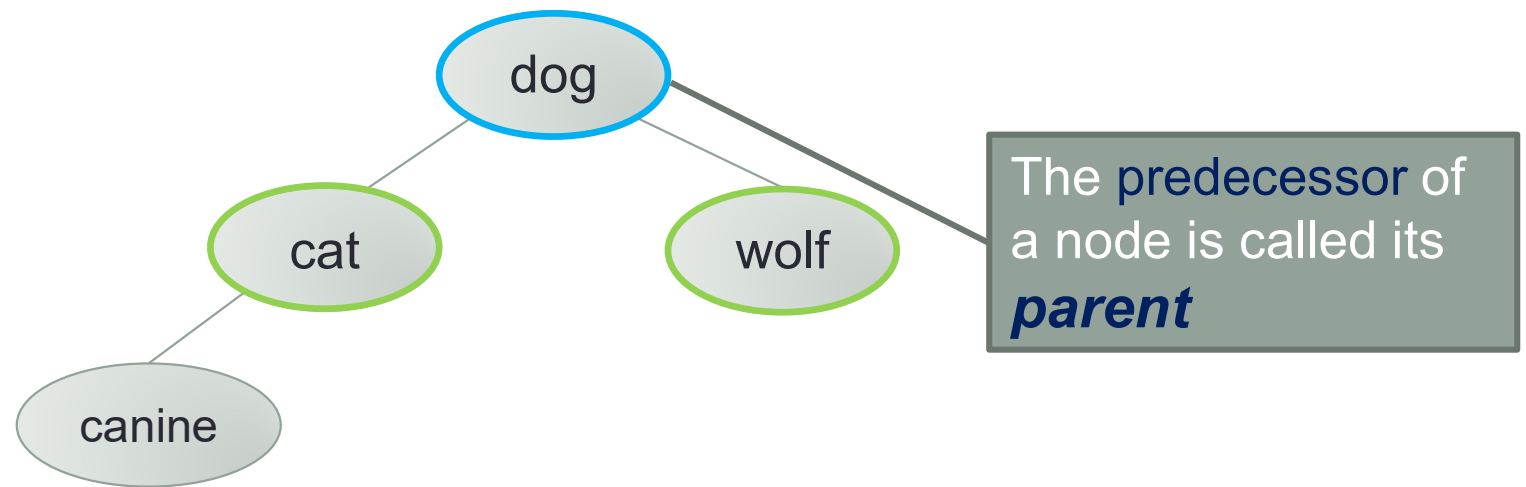
The **successors** of a node are called its **children**





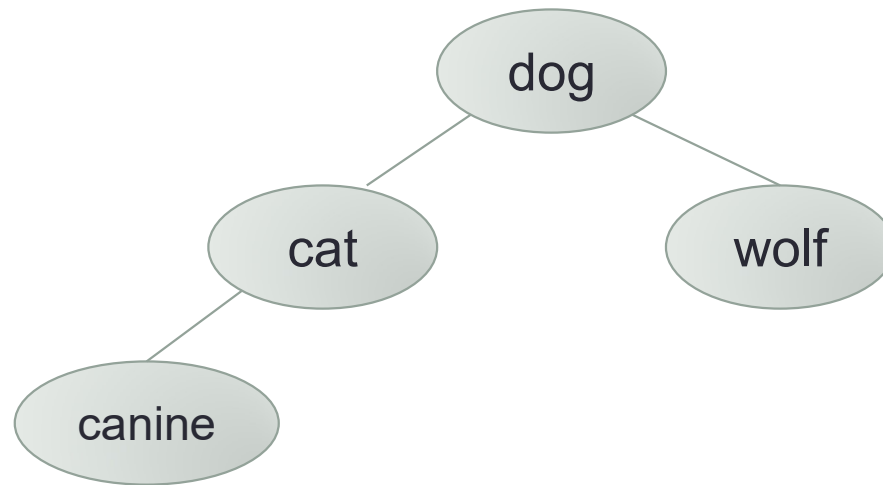
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# Tree Terminology (cont.)

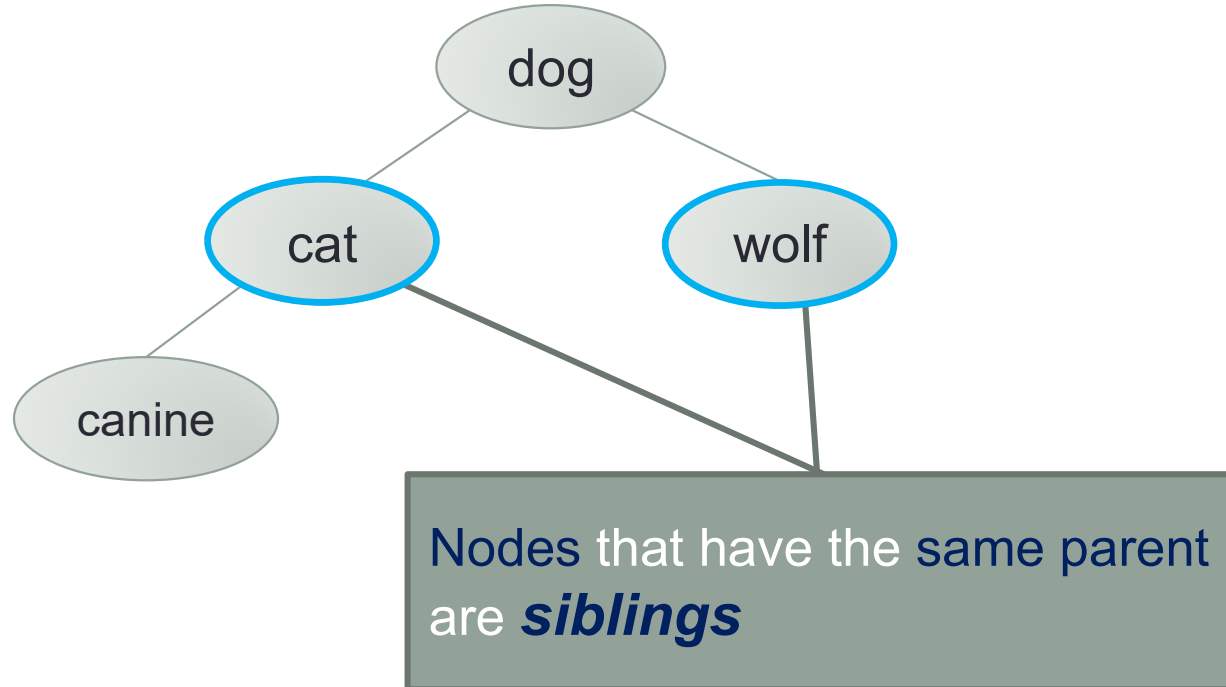
A tree consists of a collection of elements or nodes, with each node linked to its successors



Each **node** in a tree has **exactly one parent** except for the **root** node, which has **no parent**

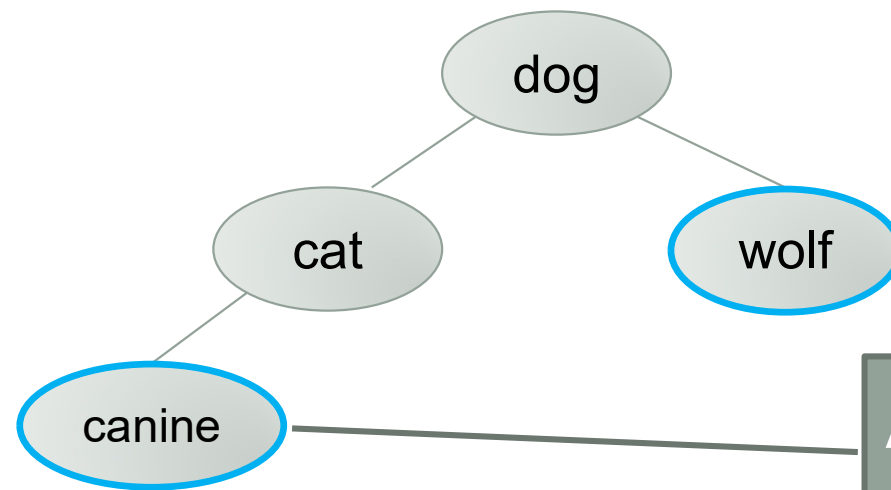
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# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors

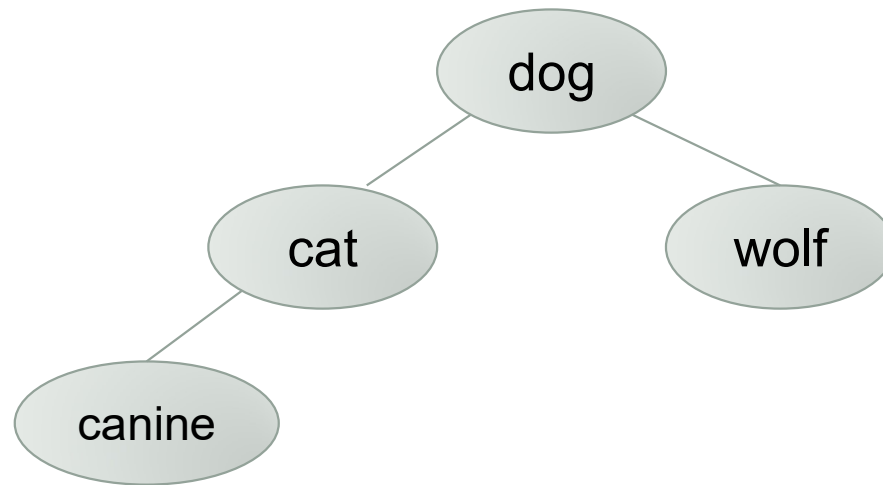


A node that has **no children** is called a **leaf node**

**Leaf nodes** also are known as **external nodes**, and **nonleaf nodes** are known as **internal nodes**

# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors

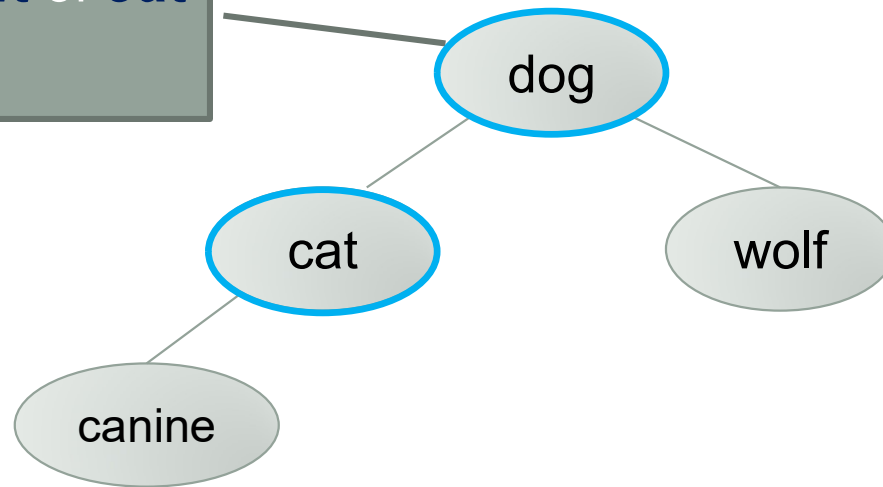


A generalization of the **parent-child** relationship is the **ancestor-descendant** relationship

# Tree Terminology (cont.)

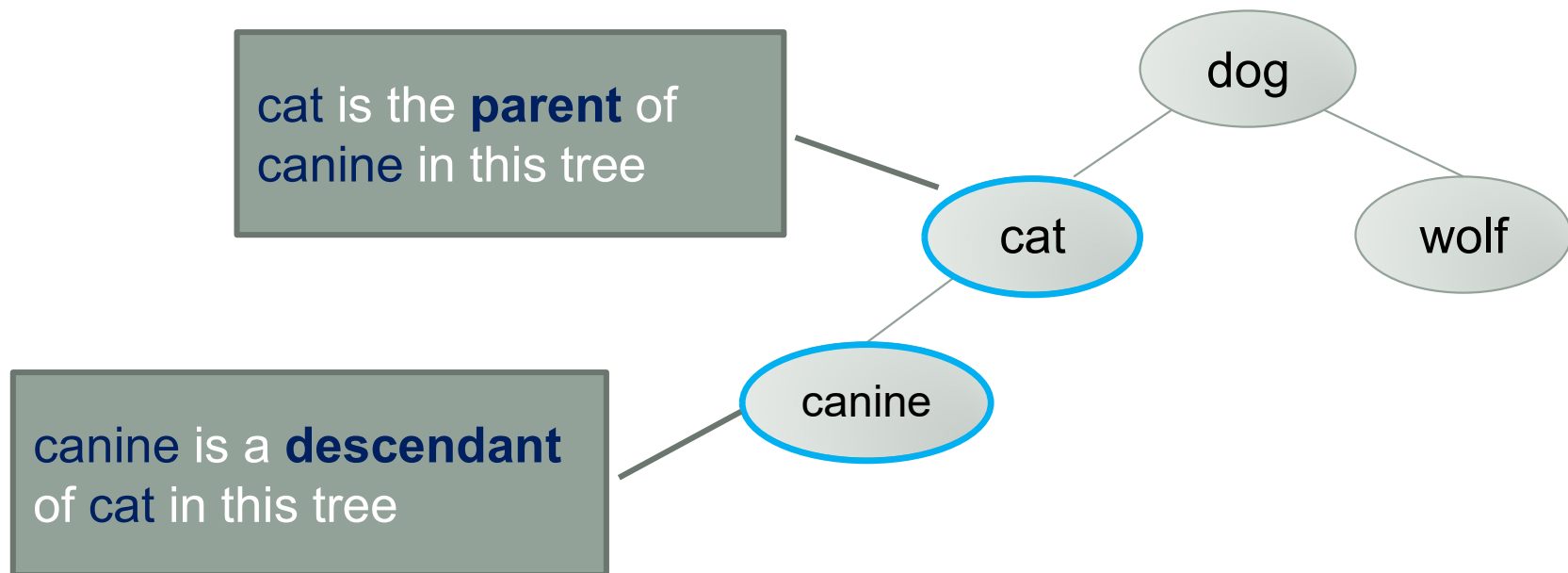
A tree consists of a collection of elements or nodes, with each node linked to its successors

*dog* is the *parent* of *cat*  
in this tree



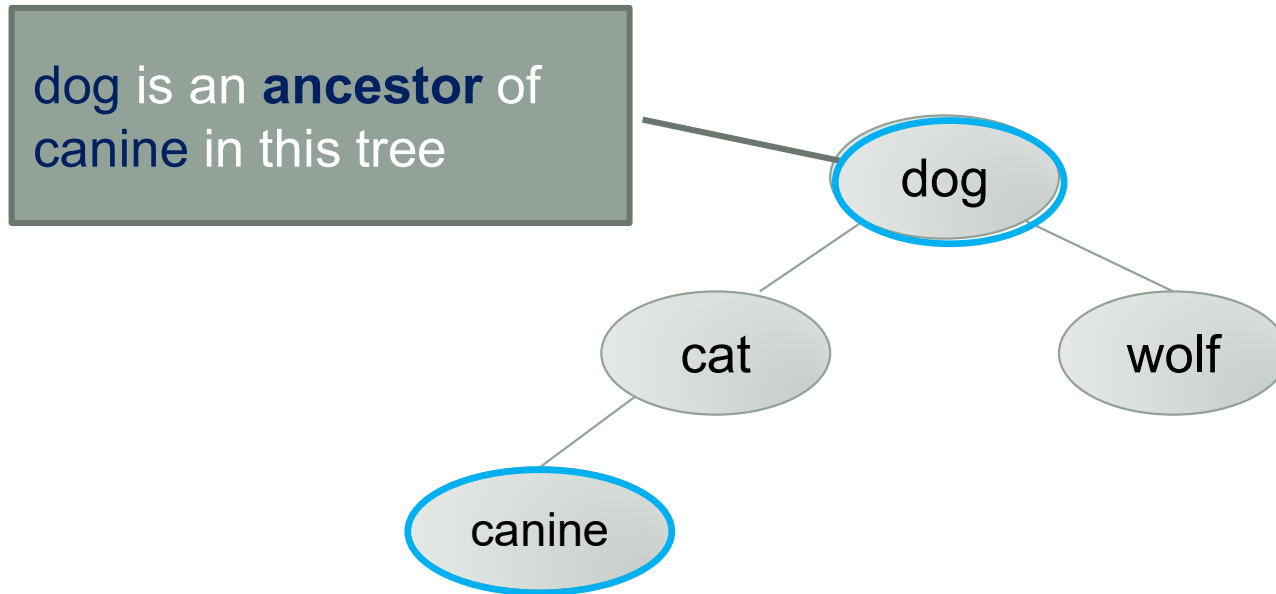
# Tree Terminology (cont.)

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# Tree Terminology (cont.)

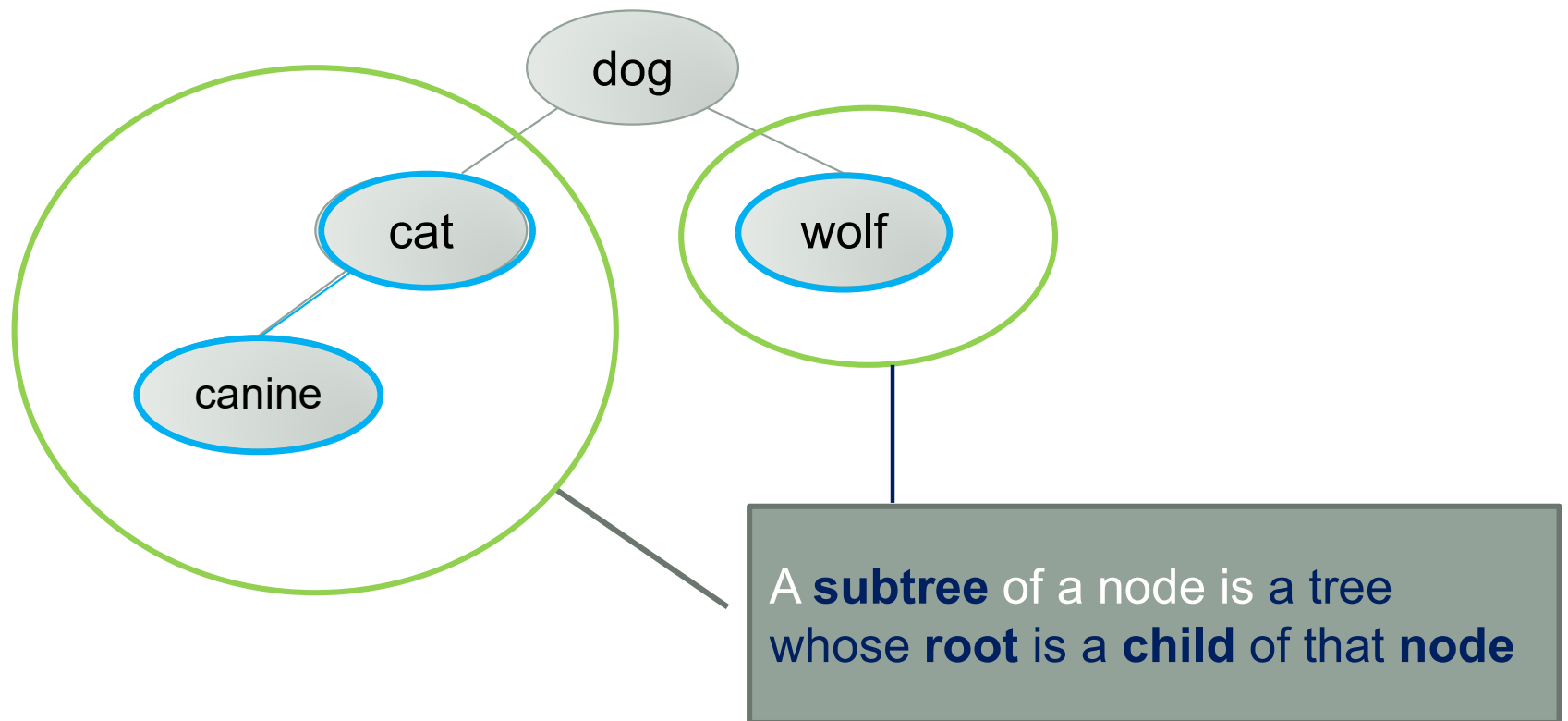
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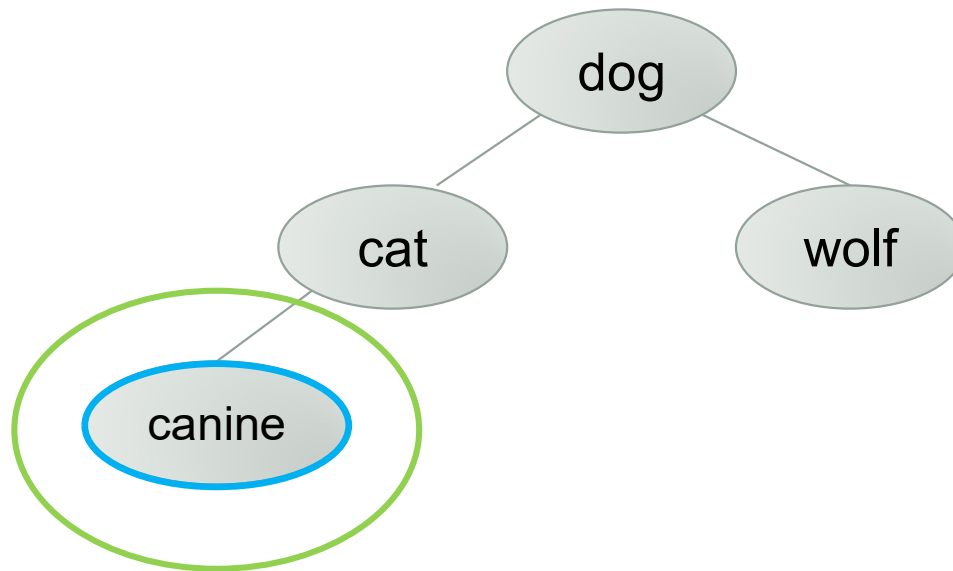
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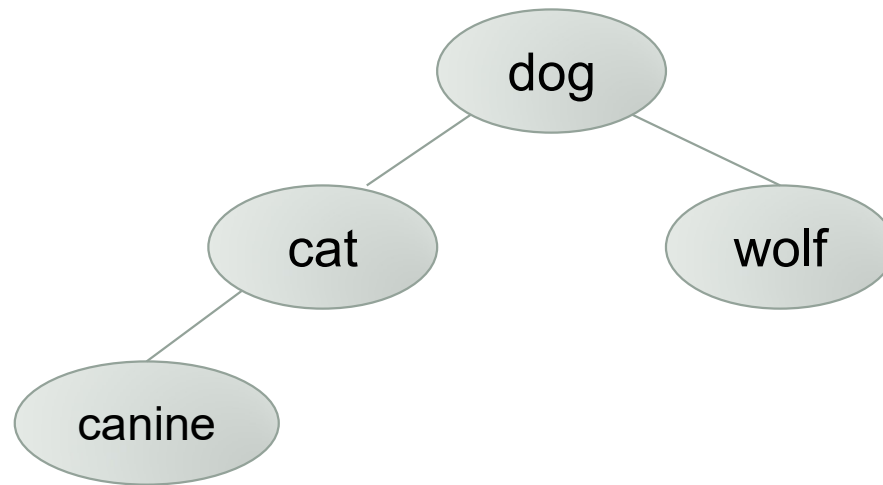
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# Tree Terminology (cont.)

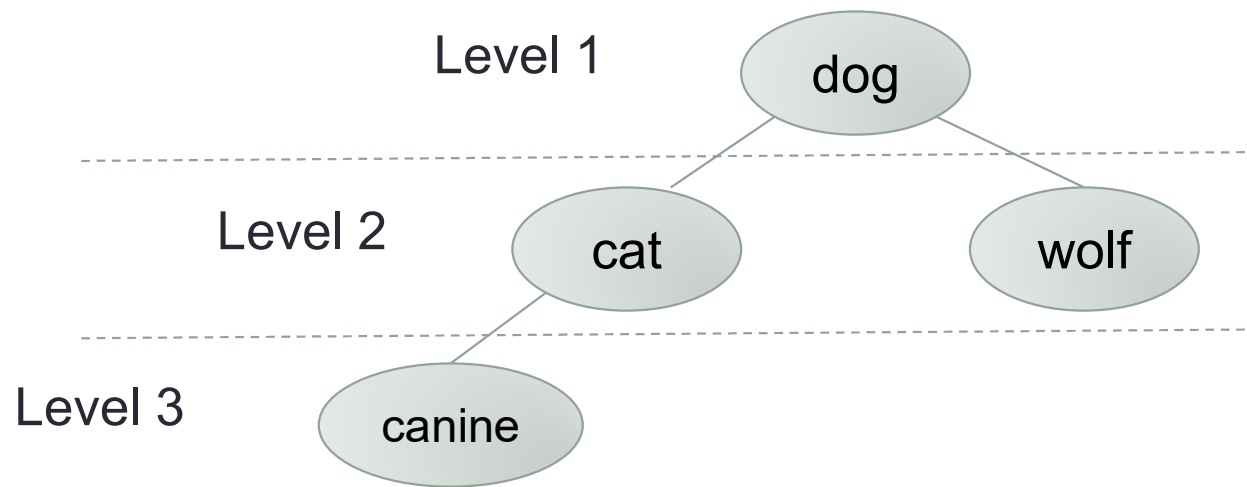
A tree consists of a collection of elements or nodes, with each node linked to its successors



The **level** of a **node** is determined by **its distance from the root**

# Tree Terminology (cont.)

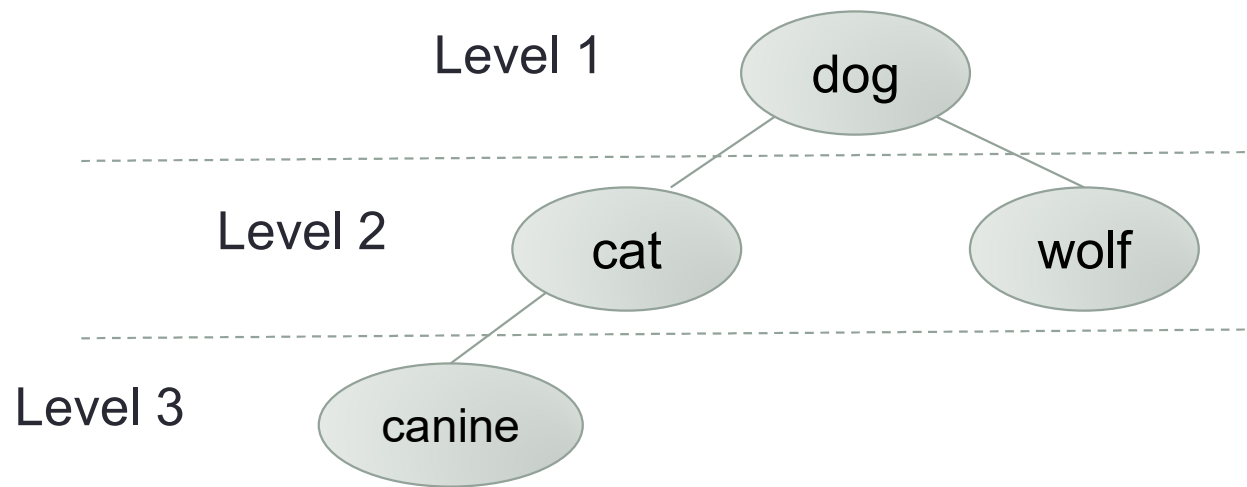
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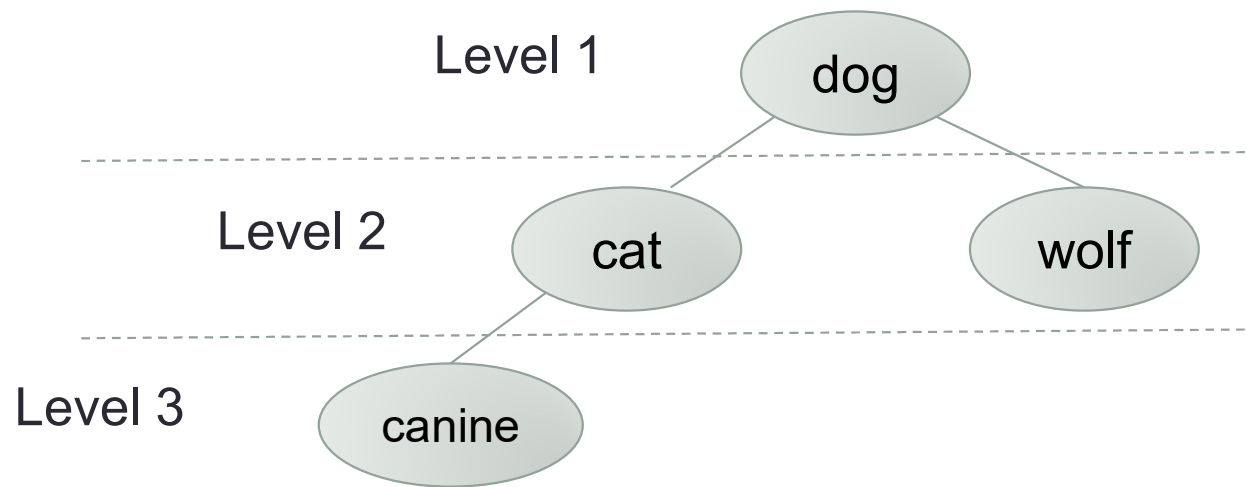
A tree consists of a collection of elements or nodes, with each node linked to its successors



The **level** of a node is defined **recursively**

# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors

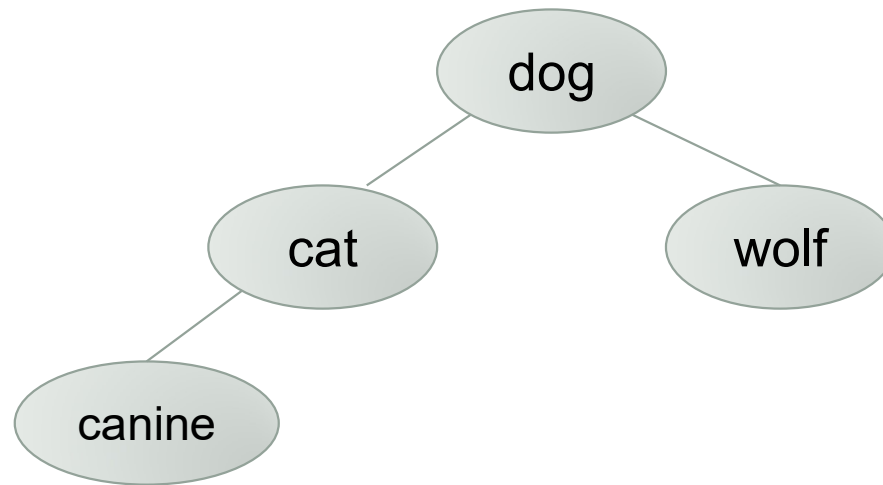


The **level** of a node is defined recursively

- If **node  $n$**  is the **root** of tree **T**, its **level** is **1** (Base)
- If node  $n$  is **not the root** of tree **T**, its **level** is **1 + the level of its parent** (Recursive)

# Tree Terminology (cont.)

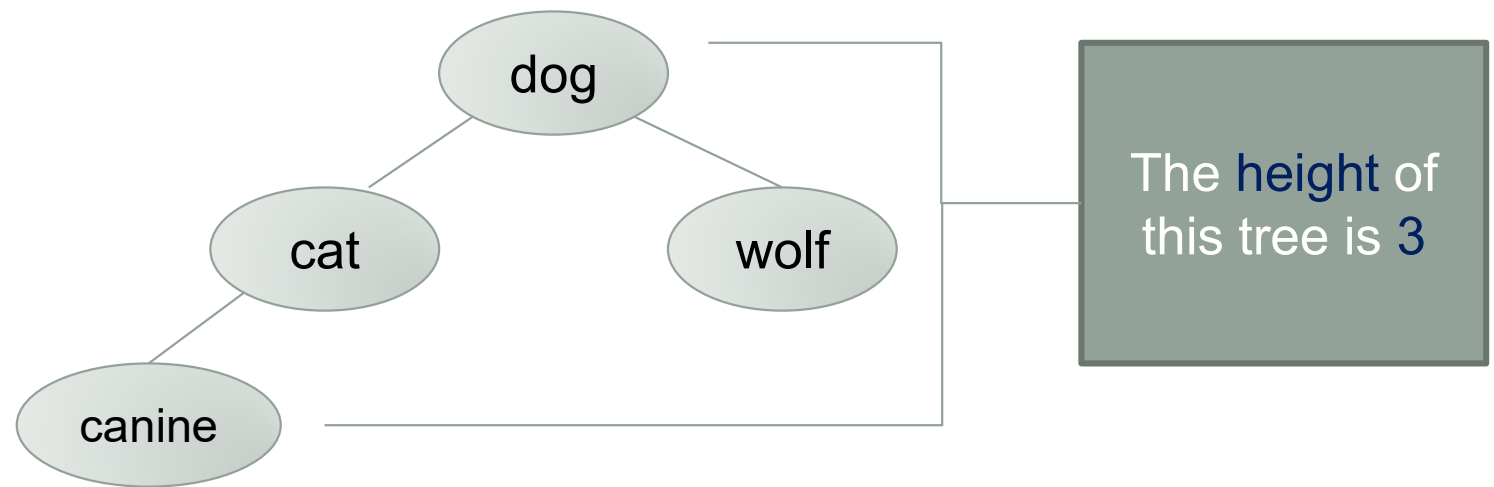
A tree consists of a collection of elements or nodes, with each node linked to its successors



The **height** of a tree is **the number of nodes in the longest path** from the **root** node to a **leaf** node

# Tree Terminology (cont.)

A tree consists of a collection of elements or nodes, with each node linked to its successors



The **height** of a tree is **the number of nodes in the longest path** from the **root** node to a **leaf** node



# Binary Trees

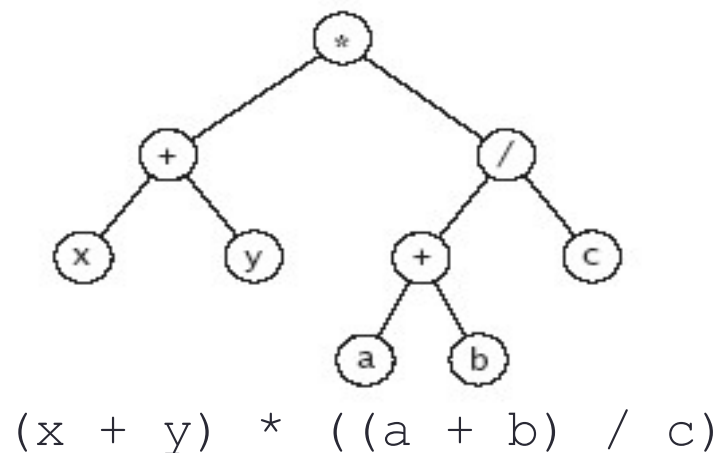
- ❑ Each node has 2 subtrees

A set of nodes  $T$  is a **binary tree** if **either** of the following is **true**

- ✓  $T$  is **empty**
- ✓ Its **root** node has **two** subtrees,  $T_L$  (left subtree) and  $T_R$  (right subtree), such that  $T_L$  and  $T_R$  are **binary trees**

# An Infix Expression as a Tree

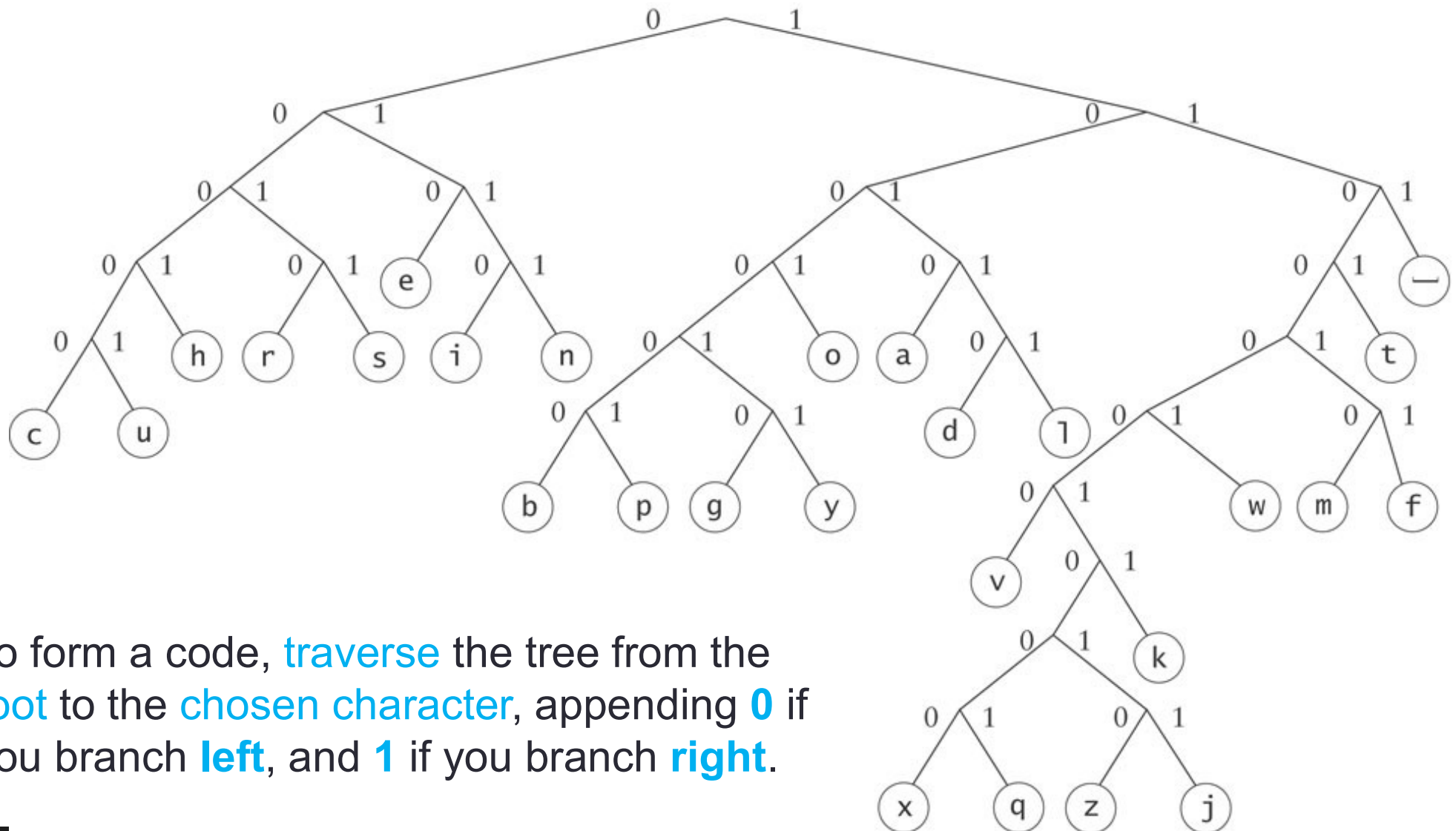
- ❑ Each **node** contains an **operator** or an **operand**
  - ✓ **Operands** are stored in **leaf** nodes
- ❑ **Parentheses** are **not stored**
  - ✓ **Tree** structure dictates the **order of operand evaluation**
    - **Operators** in nodes **at higher tree levels** are **evaluated after** operators in nodes **at lower tree levels**



# Huffman Tree

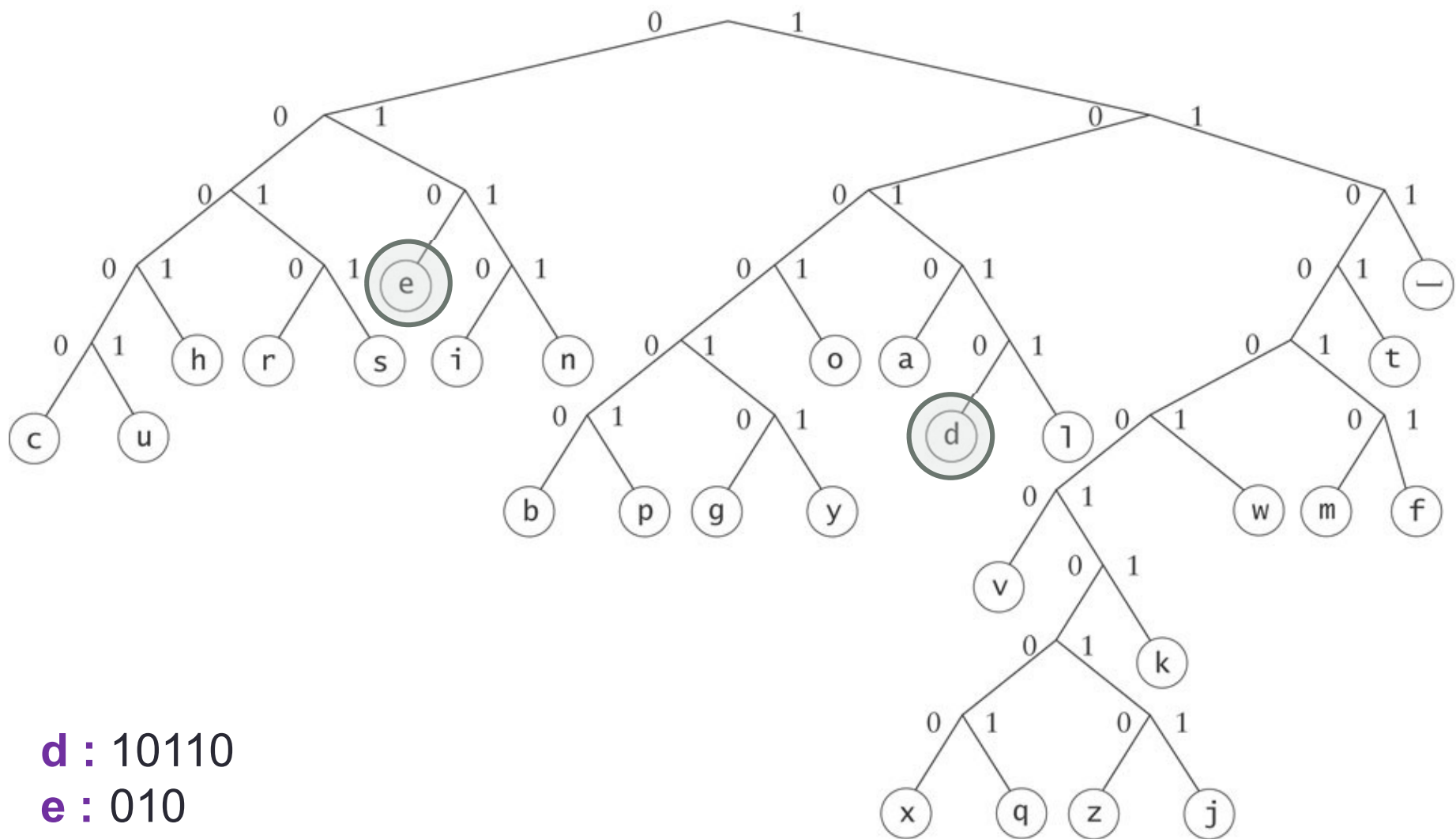
- ❑ represents **Huffman codes** for characters
  - ✓ uses **different numbers of bits** to encode **letters**
    - As **opposed to ASCII** or **Unicode** (**Same numbers of bits**)
  - ✓ **more common** characters use **fewer bits**
  
- ❑ **Many programs** that **compress files** use **Huffman codes**

# Huffman Tree (cont.)



To form a code, **traverse** the tree from the **root** to the **chosen character**, appending **0** if you branch **left**, and **1** if you branch **right**.

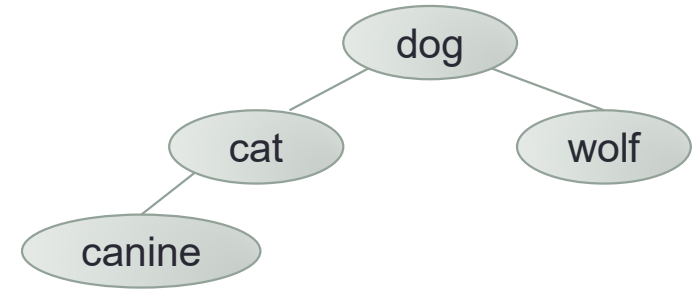
# Huffman Tree (cont.)



**d** : 10110

**e** : 010

# Binary Search Tree



- ❑ A **Binary Tree** AND all **elements** in the **left** subtree **precede** those in the **right** subtree
  - ✓ ➔ **Binary Tree** AND  $T_L < \text{Middle} < T_R$

A set of nodes **T** is a **binary search tree** if **either** of the following is **true**

- ✓ **T** is **empty**
- ✓ If **T** is **not empty**, its **root** node has **two subtrees**,  $T_L$  and  $T_R$ , such that
  - $T_L$  and  $T_R$  are **binary search trees** and
  - the value in the **root** node of **T** is **greater than** all values in  $T_L$  and is **less than** all values in  $T_R$

# Binary Search Tree

- ❑ When **new** elements are **inserted** (or **removed**) properly, the BST **maintains its order**
  - ✓ In contrast, a **sorted array** must be **expanded** whenever new elements are **added**, and **compacted** whenever elements are **removed**—expanding and contracting are both  **$O(n)$**
- ❑ When **searching** a BST, each probe has the potential to **eliminate half the elements** in the tree, so searching can be  **$O(\log n)$** 
  - ✓ In **the worst case**, searching is  **$O(n)$**

*What would be the worst case of searching in BST?*

# Recursive Algorithm for Searching a BT

*Base 1*

1. **if** the tree is **empty**
2.       return **null** (*target is not found*)

*Base 2*

3.       **else if** the target **matches** the **root** node's data  
      **return** the **data** stored at the **root** node
- else if** the target is **less than** the **root** node's data

*Recursive 1*

4.       return the **result** of **searching** the **left subtree** of the root
- else**

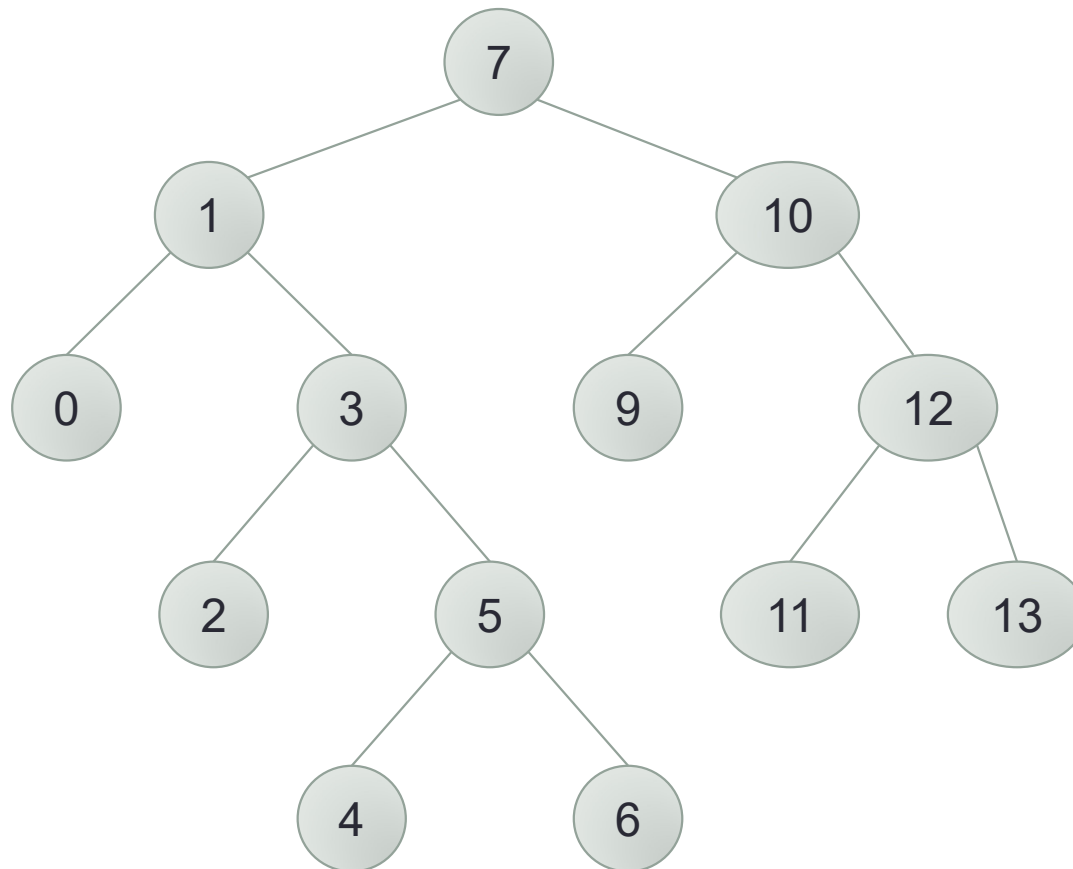
*Recursive 2*

5.       return the **result** of **searching** the **right subtree** of the root



# Full BT

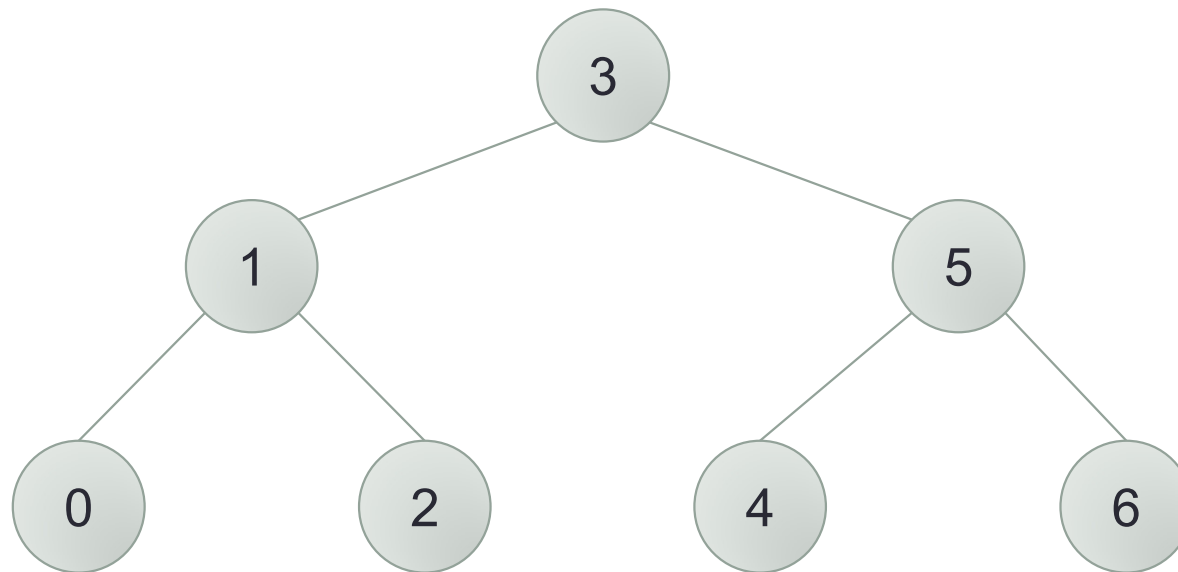
- A **full binary tree** is a **binary tree** where **all** nodes have **either 2 children or 0 children** (the leaf nodes)



# Perfect BT

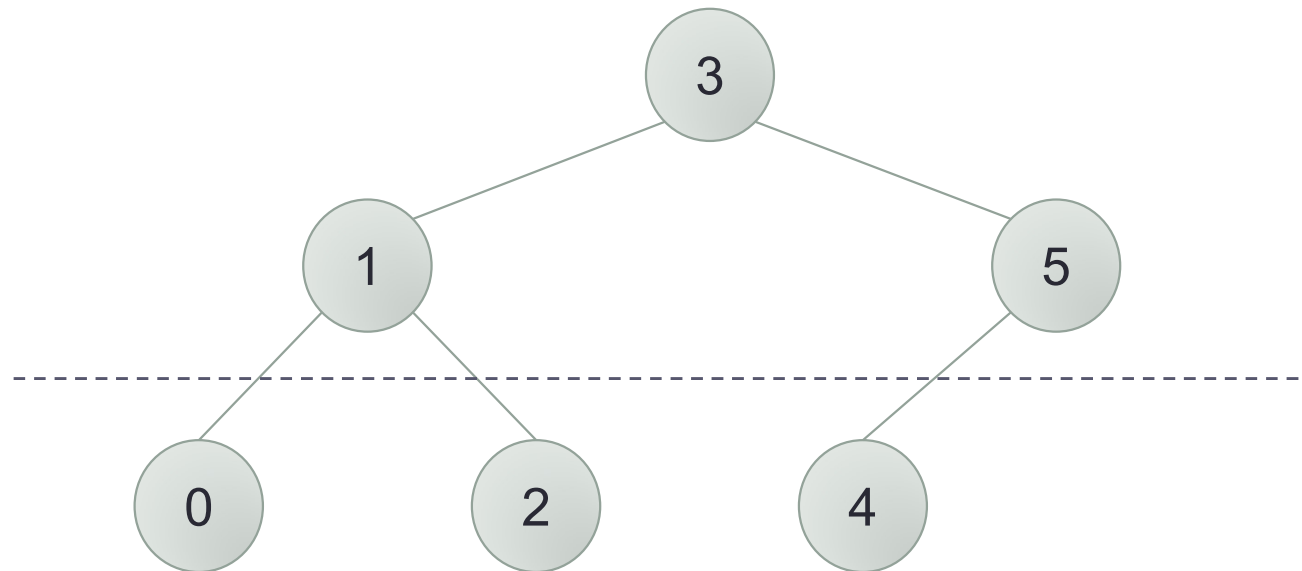
□ A **perfect** binary tree is a **full binary tree** of **height  $n$**  with **exactly  $2^n - 1$  nodes**

✓ In this case,  $n = 3$  and  $2^n - 1 = 7$



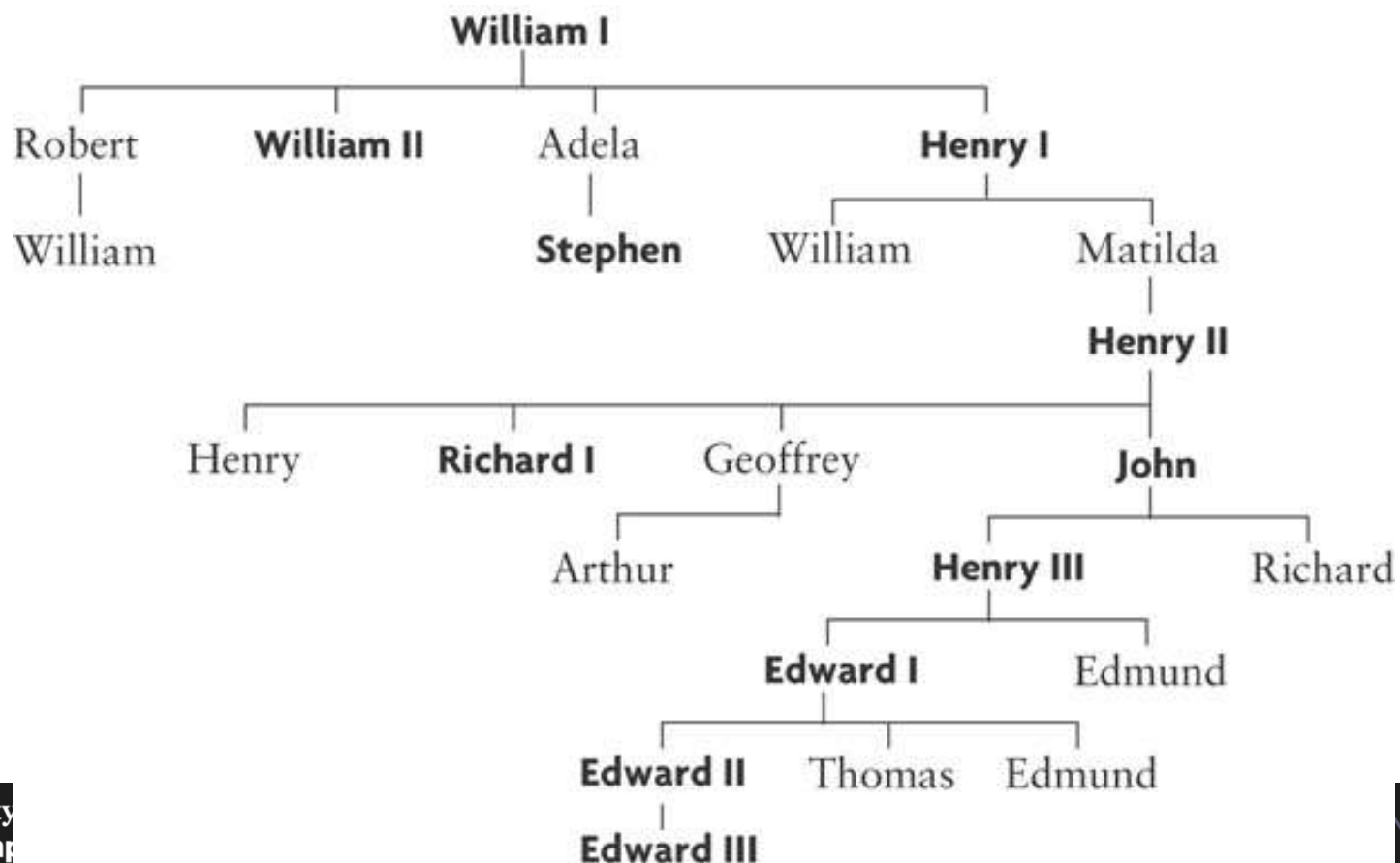
# Complete BT

- A **complete** binary tree is a **perfect binary tree** through **level  $n - 1$**  with **some extra leaf nodes** at **level  $n$**  (the tree height), **all toward the left**



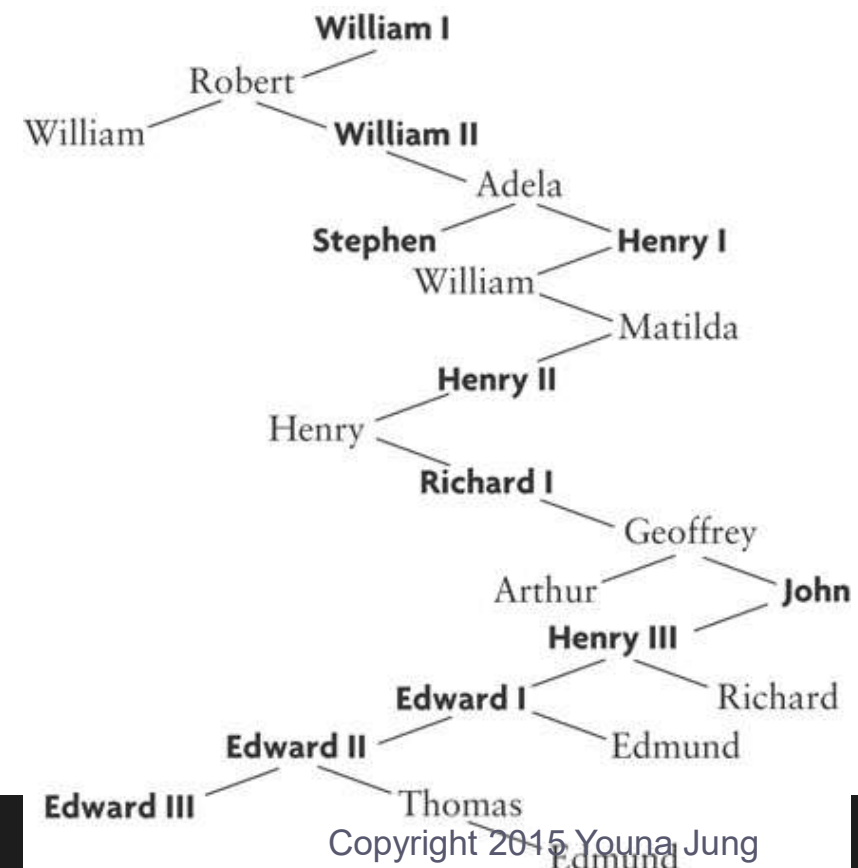
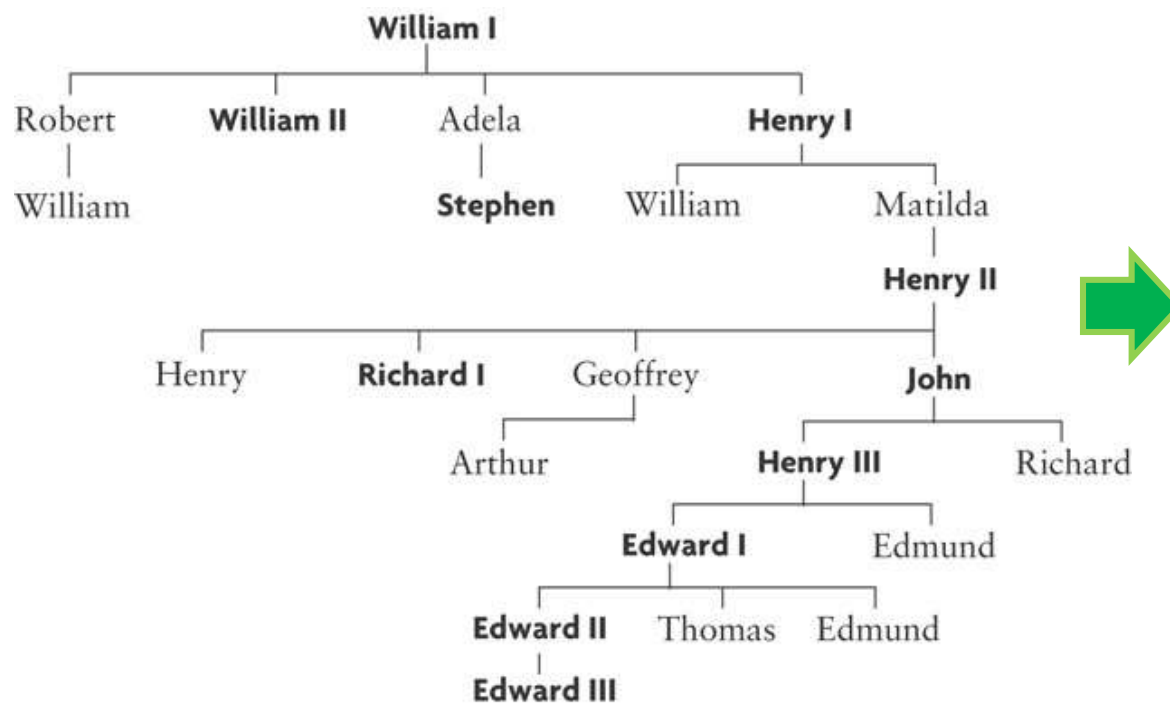
# General Trees

- ❑ We do not discuss general trees in this chapter, but **nodes** of a **general tree** can have **any number of subtrees**



# General Trees

- A general tree can be represented using a BT
  - ✓ The **left branch** of a node is the **oldest child**, and each **right branch** is connected to the **next younger sibling** (if any)



# TREE TRAVERSALS

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# Tree Traversals

- ❑ **Walking through** the tree in a prescribed **order** and **visiting the nodes**
  
- ❑ **3 Types** of Tree Traversal
  - ✓ **Inorder**
    - traverse  $T_L \rightarrow \text{Root} \rightarrow T_R$
  - ✓ **Preorder**
    - traverse  $\text{Root} \rightarrow T_L \rightarrow T_R$
  - ✓ **Postorder**
    - traverse  $T_L \rightarrow T_R \rightarrow \text{Root}$

# Tree Traversals (cont.)

## 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

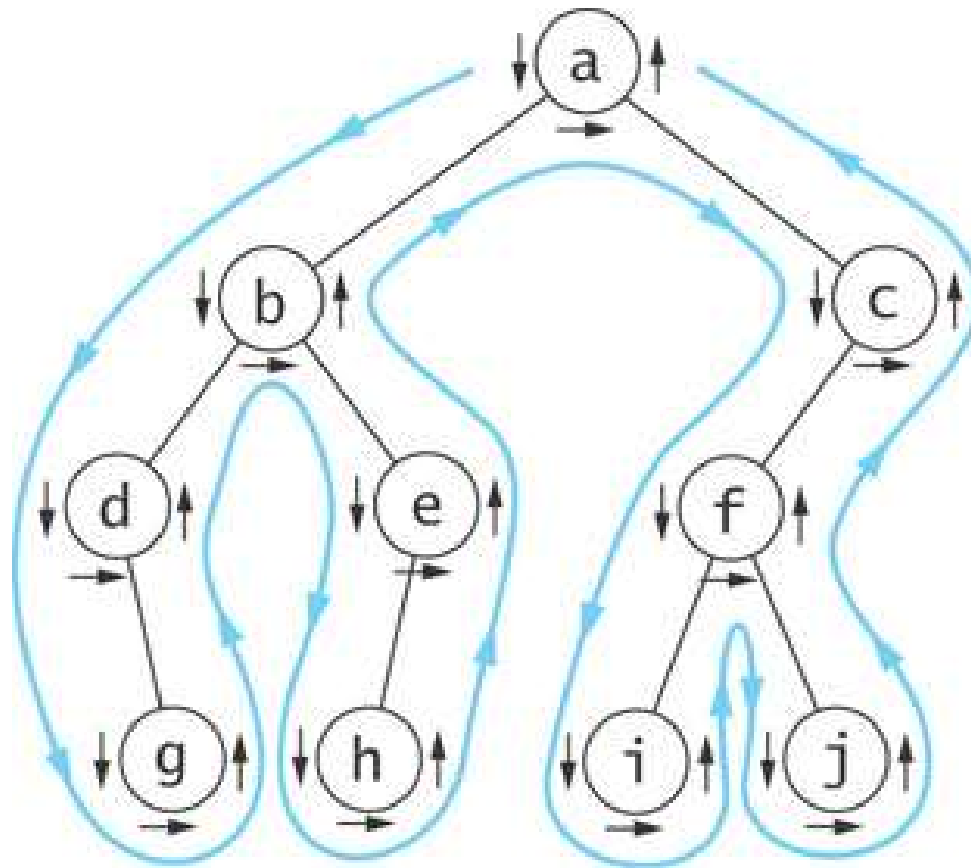
1. if the tree is empty
2.     Return.
- else
3.     Inorder traverse the left subtree.
4.     Visit the root.
5.     Inorder traverse the right subtree.

## 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.



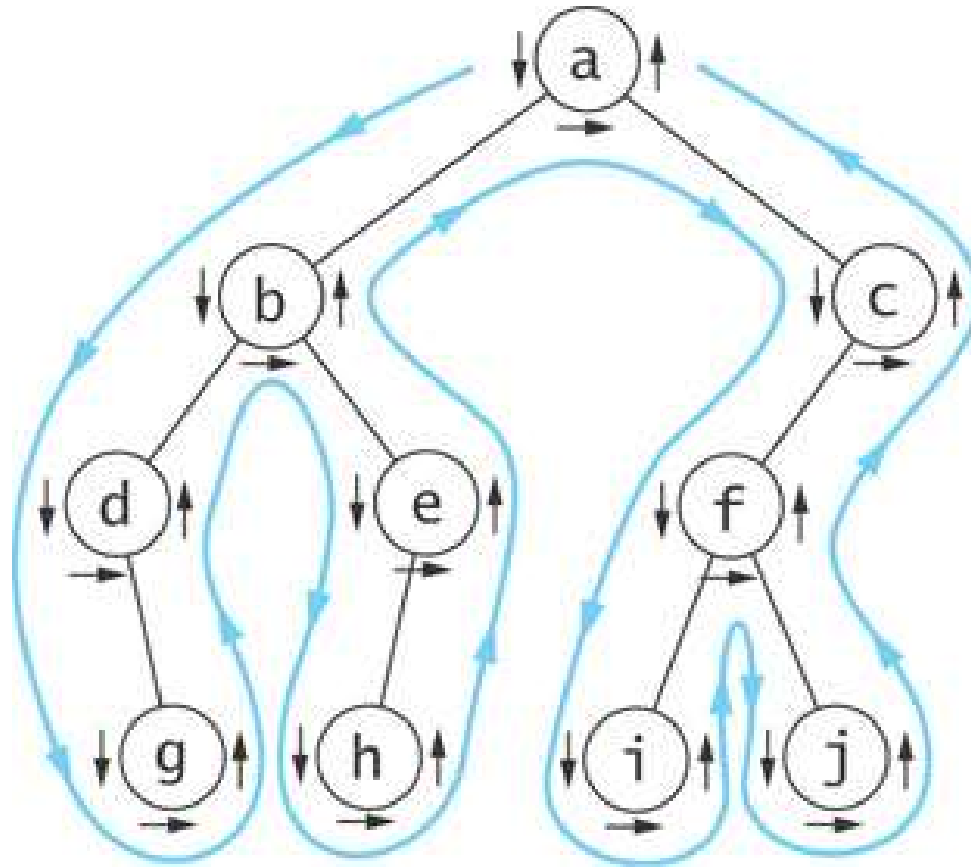
# Visualizing Tree Traversals



*Inorder? Preorder? Postorder?*

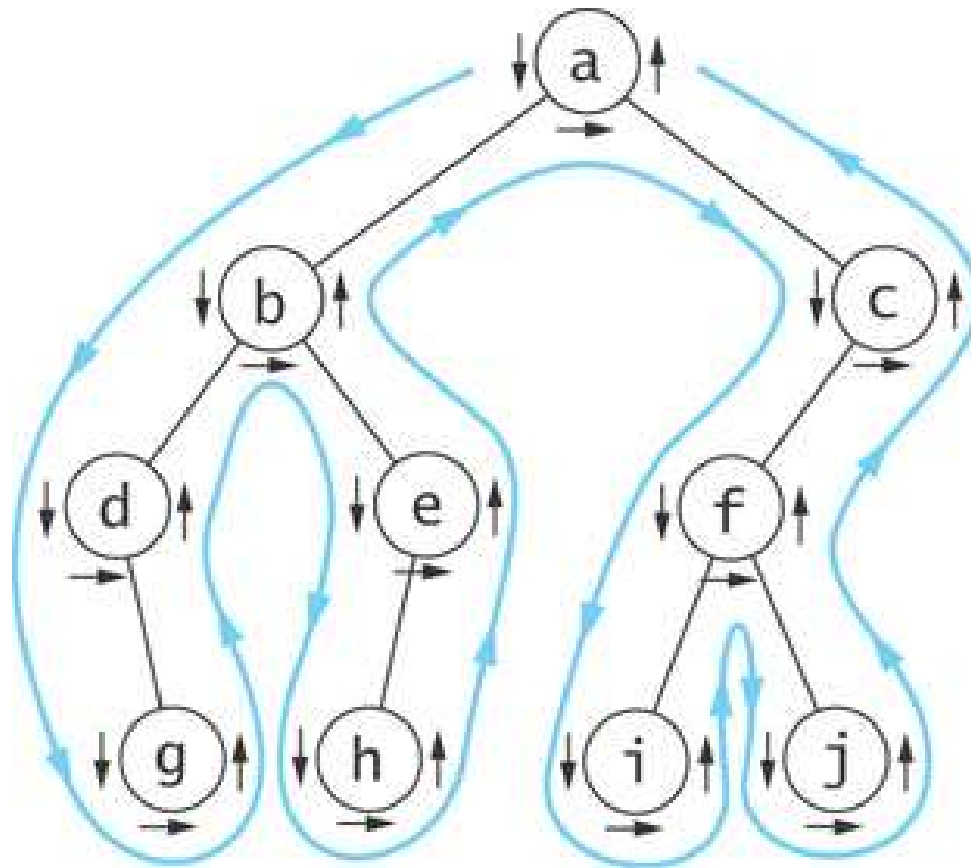
**Preorder** traversal :  $a \rightarrow b \rightarrow d \rightarrow g \rightarrow e \rightarrow h \rightarrow c \rightarrow f \rightarrow i \rightarrow j$

# Visualizing Inorder Tree Traversals



**Inorder** traversal :  $d \rightarrow g \rightarrow b \rightarrow h \rightarrow e \rightarrow a \rightarrow i \rightarrow f \rightarrow j \rightarrow c$

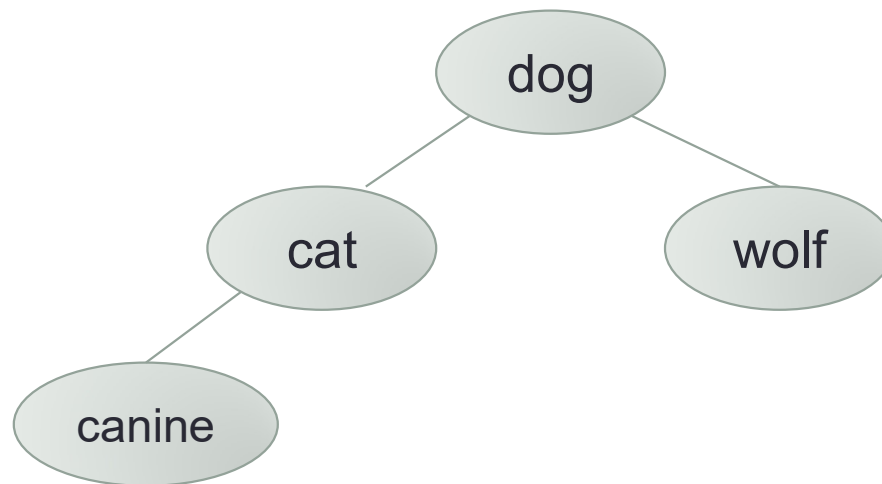
# Visualizing Postorder Tree Traversals



**Postorder** traversal :  $g \rightarrow d \rightarrow h \rightarrow e \rightarrow b \rightarrow i \rightarrow j \rightarrow f \rightarrow c \rightarrow a$

# Traversals of BST and Expression Trees

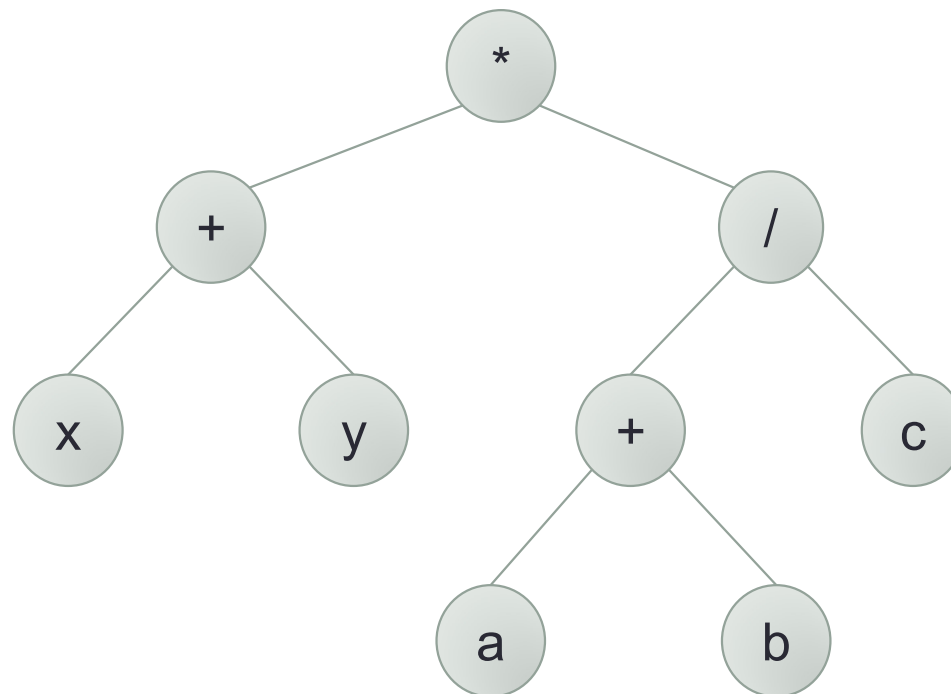
- ❑ An **inorder** traversal of a **BST** results in the nodes being visited in **sequence** by **increasing data value**



*canine → cat → dog → wolf*

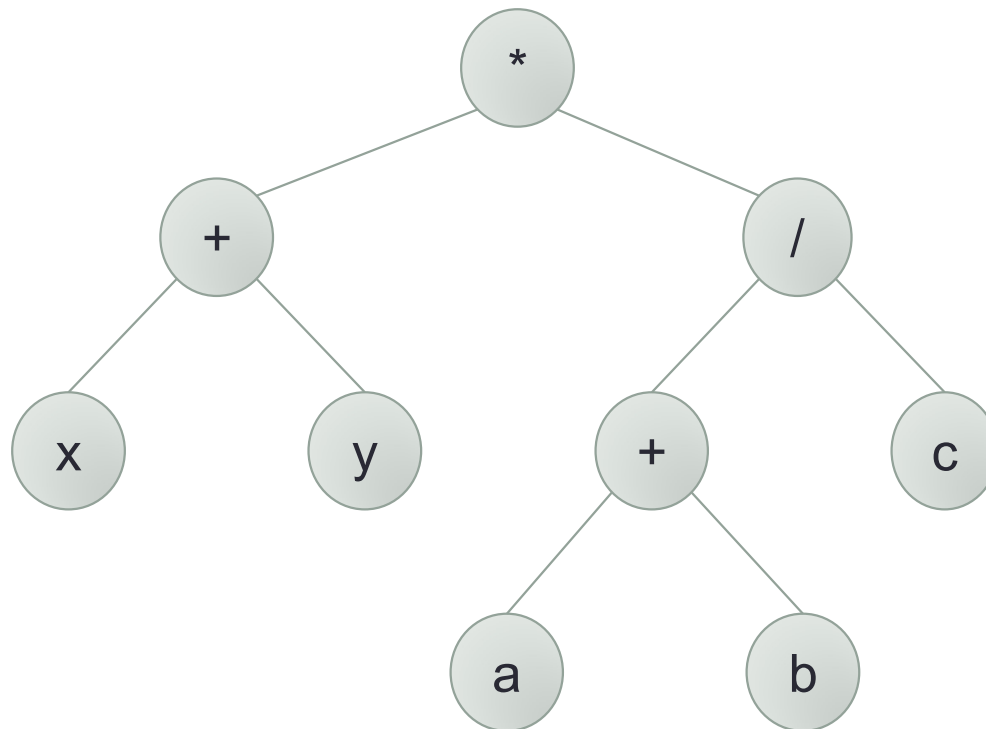
# Traversals of BST and Expression Trees

- ❑ An **inorder** traversal of this **expression tree** results in the sequence:  **$x + y * a + b / c$**
- ❑ If we insert **parentheses** where they belong, we get the **infix** form:  **$(x + y) * ((a + b) / c)$**



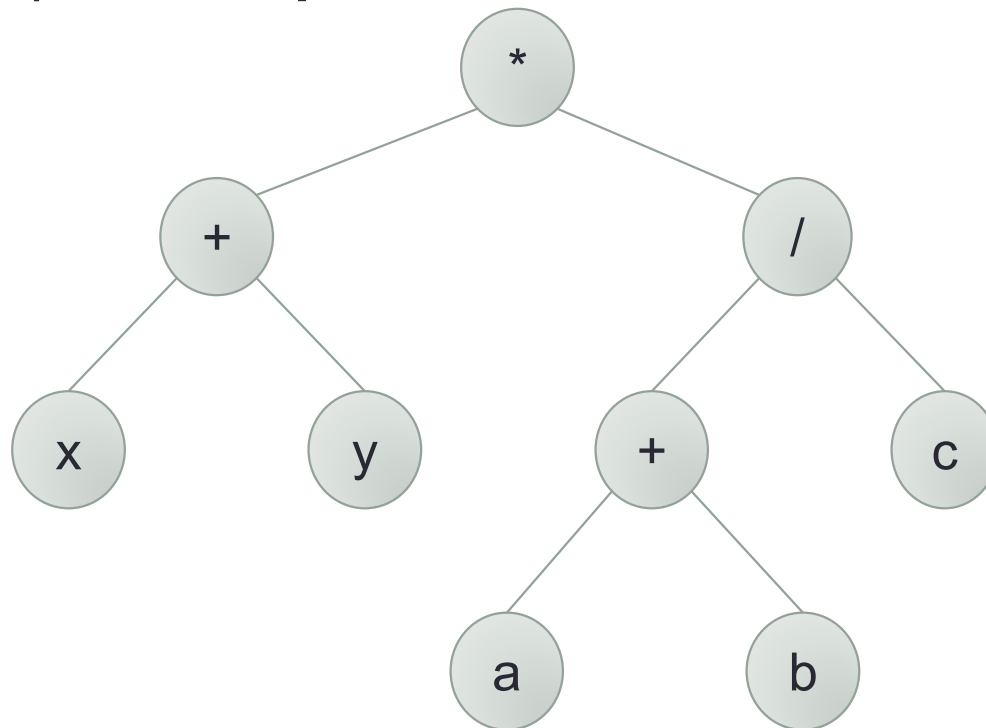
# Traversals of BST and Expression Trees

- ❑ A **postorder traversal** of this expression tree results in the sequence: **x y + a b + c / \***
- ❑ This is the **postfix or reverse form** of the expression
  - ✓ **Operators follow operands**



# Traversals of BST and Expression Trees

- ❑ A **preorder traversal** of this expression tree results in the sequence: **\* + x y / + a b c**
- ❑ This is the **prefix** or **forward form** of the **expression**
  - ✓ **Operators** precede **operands**



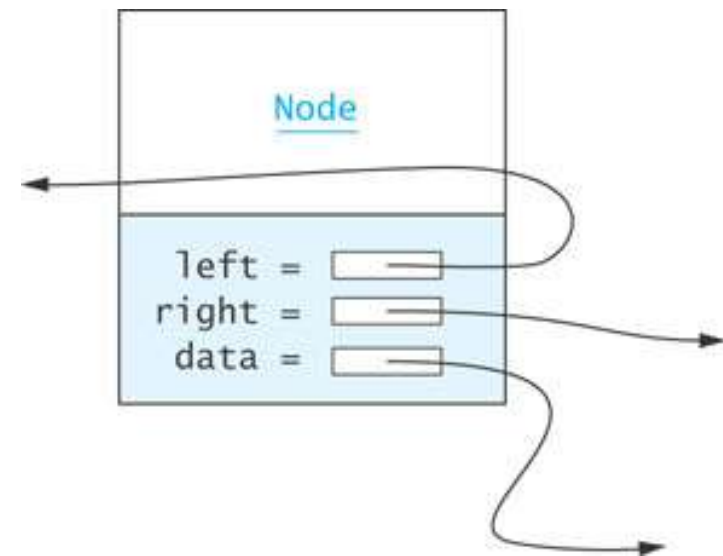
# IMPLEMENTING BINARYTREE CLASS

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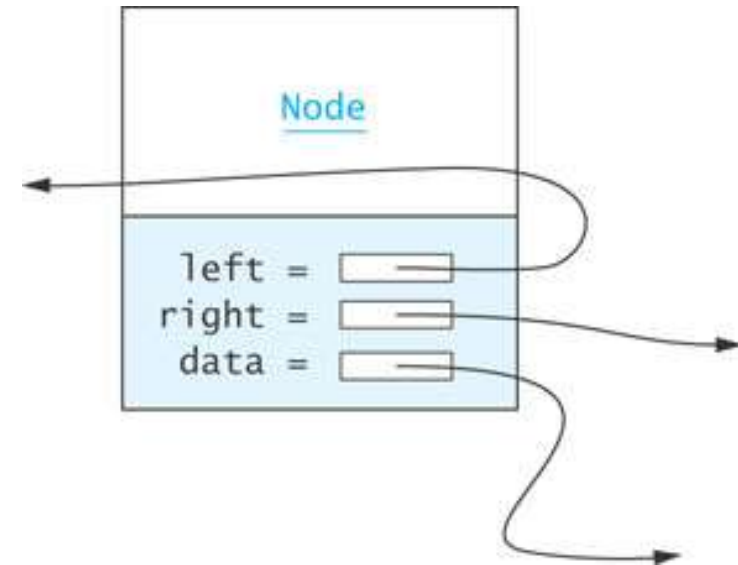
# Node<E> Class

- ❑ Just as for a linked list, a **node** consists of a **data** part and **links to successor nodes**
  - ✓ The **data** part is a **reference** to type **E**
  - ✓ A binary tree node must have **links** to both its **left** and **right** subtrees



# Node<E> Class (cont.)

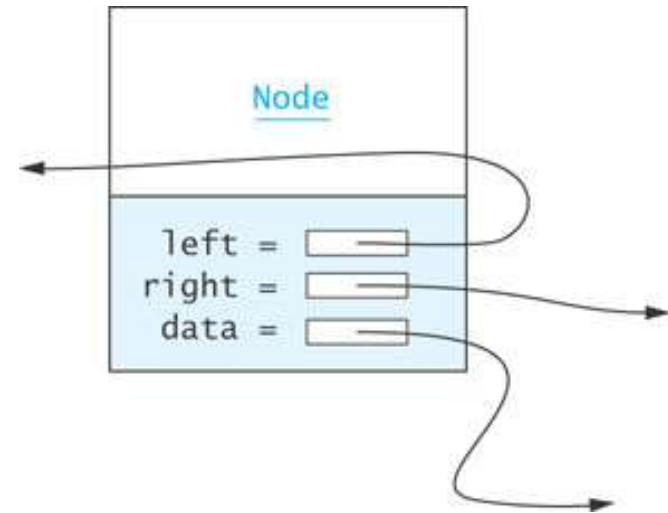
```
protected static class Node<E> {  
    protected E data;  
    protected Node<E> left;  
    protected Node<E> right;  
  
    public Node(E data) {  
        this.data = data;  
        left = null;  
        right = null;  
    }  
  
    public String toString() {  
        return data.toString();  
    }  
}
```



`Node<E>` is declared as an **inner class** within `BinaryTree<E>`

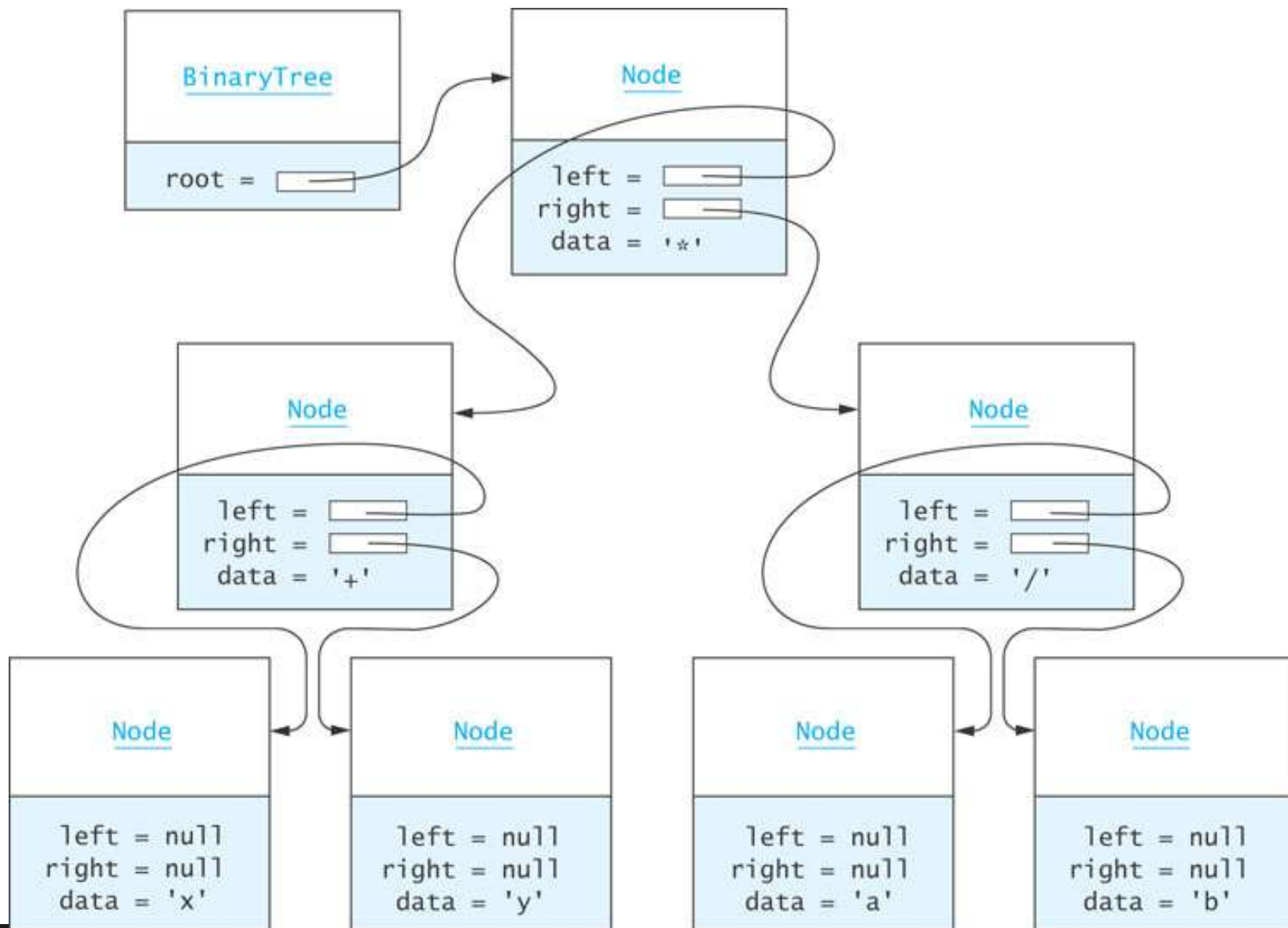
# Node<E> Class (cont.)

```
protected static class Node<E> {  
    protected E data;  
    protected Node<E> left;  
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    public Node(E data) {  
        this.data = data;  
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    }  
  
    public String toString() {  
        return data.toString();  
    }  
}
```

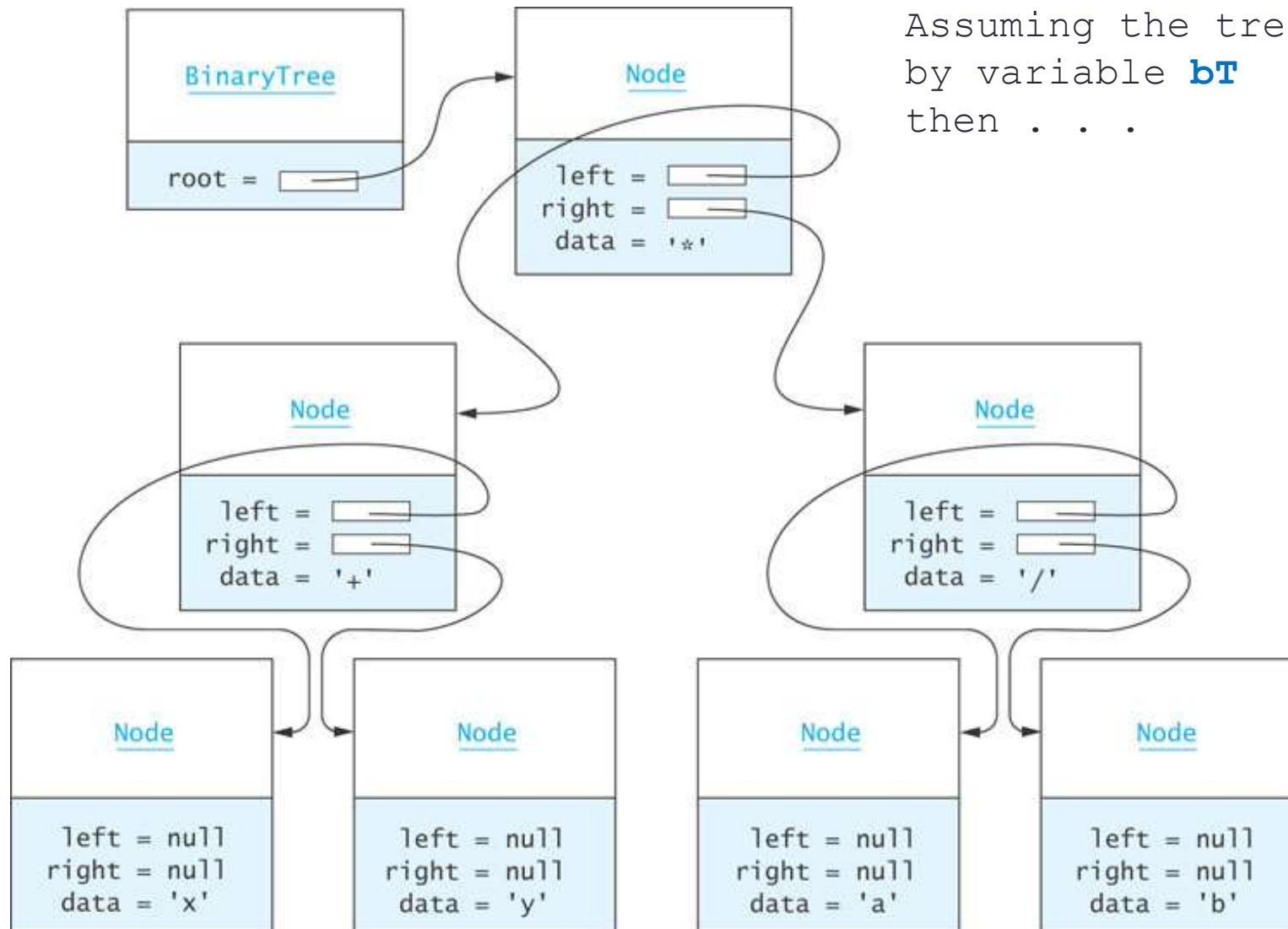


**Node<E>** is declared **protected**. This way we can use it as a superclass.

# BinaryTree<E> Class

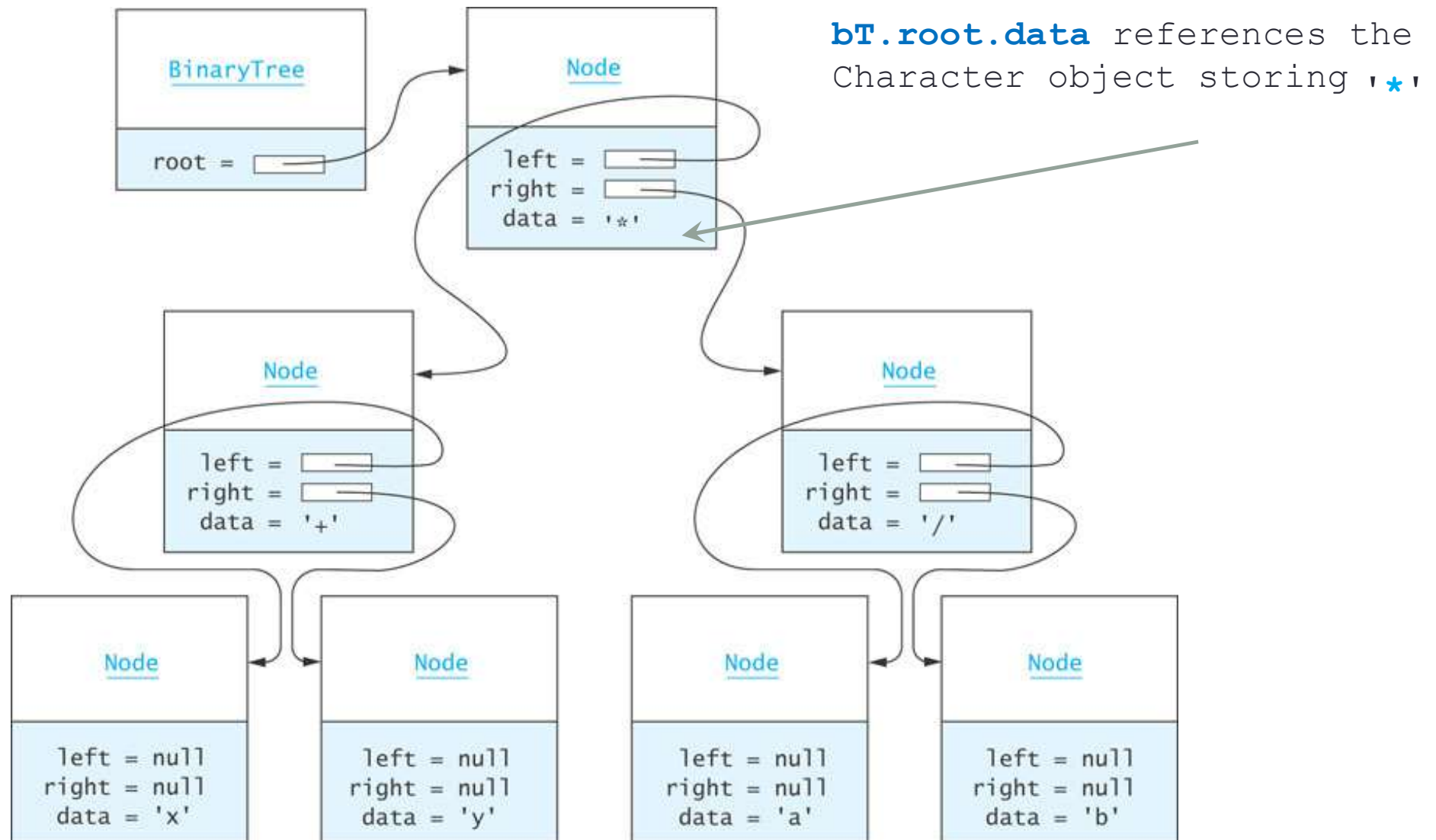


# BinaryTree<E> Class (cont.)

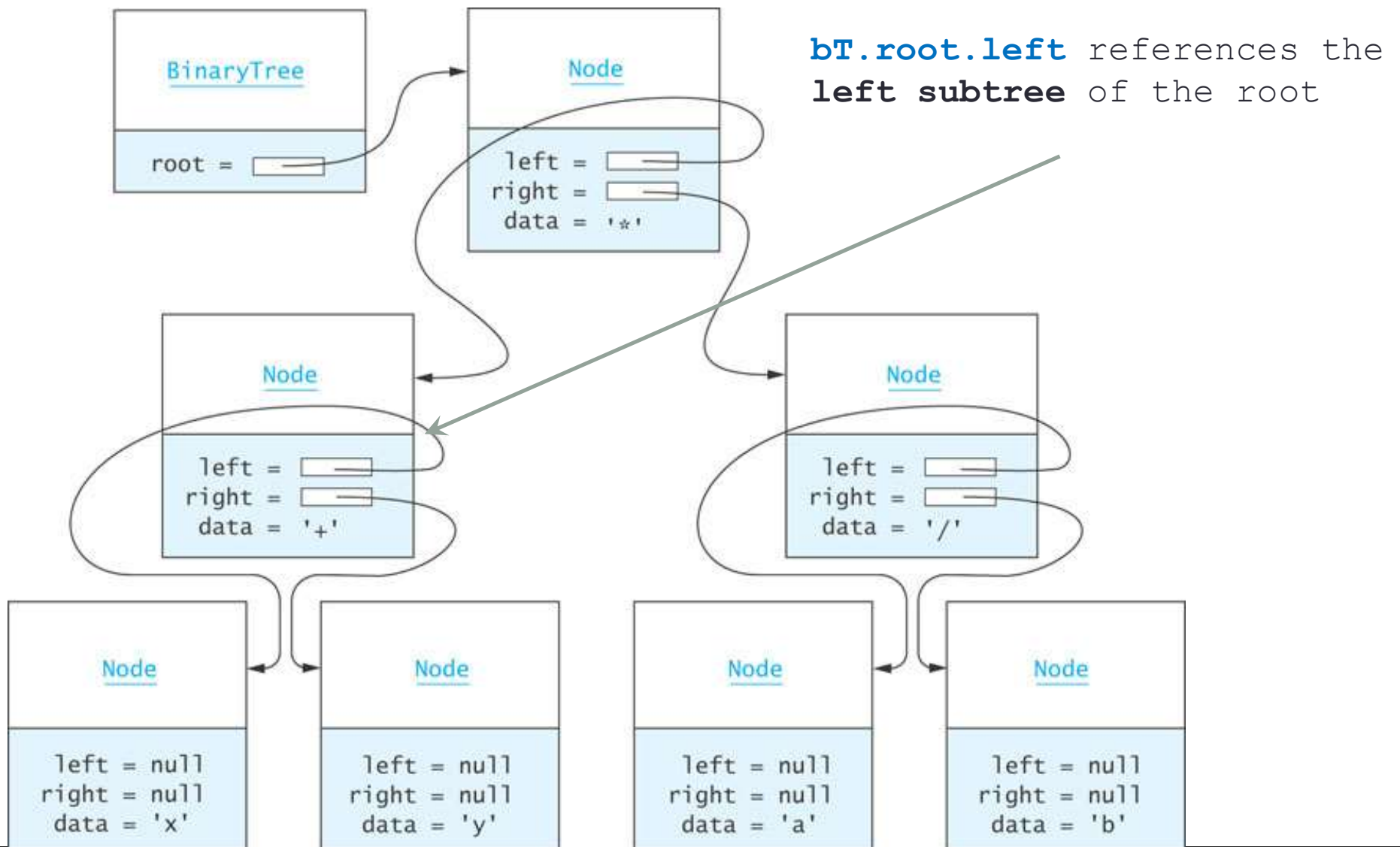


Assuming the tree is referenced by variable **bT** (type **BinaryTree**) then . . .

# BinaryTree<E> Class (cont.)

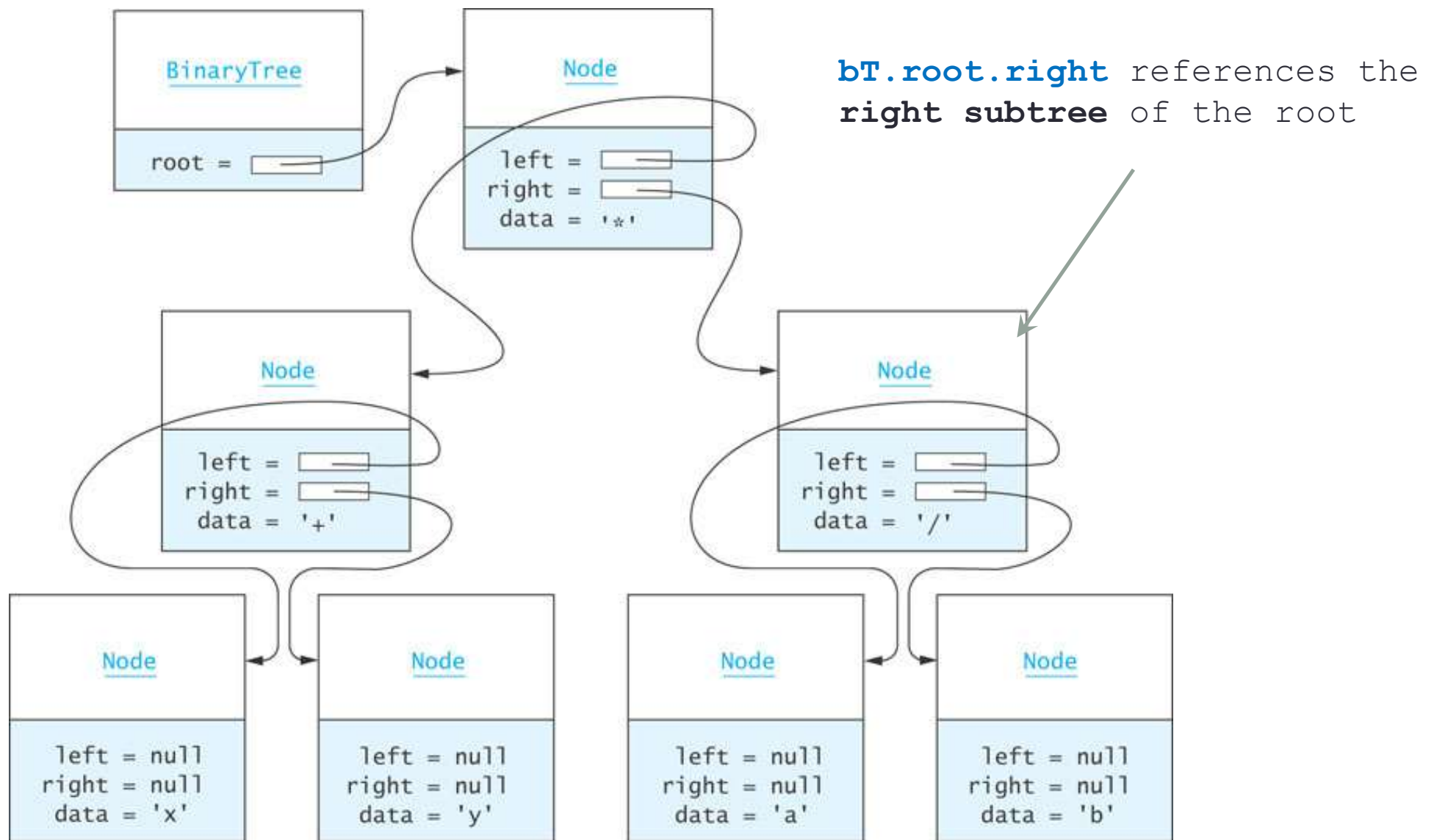


# BinaryTree<E> Class (cont.)



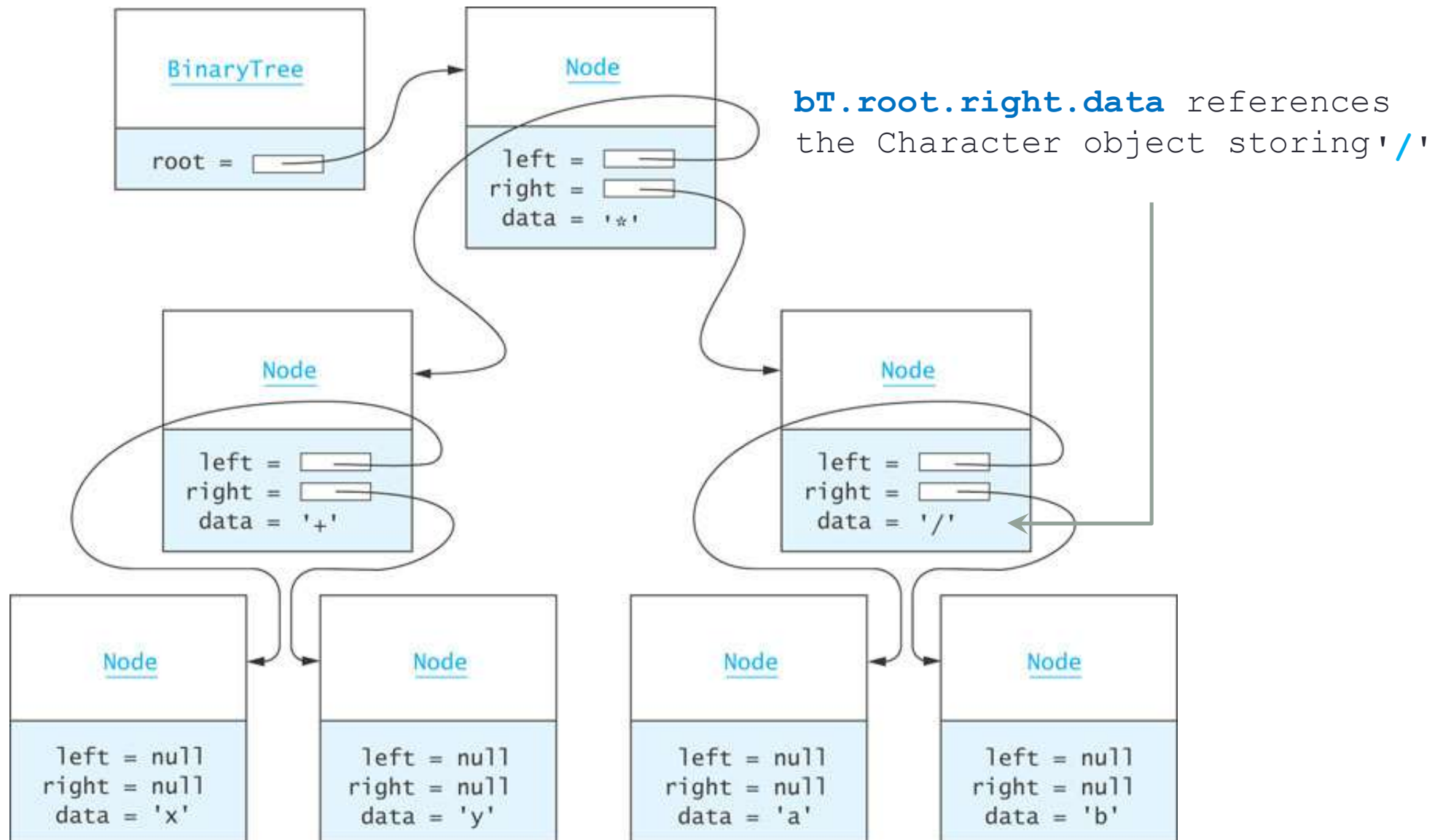


# BinaryTree<E> Class (cont.)





# BinaryTree<E> Class (cont.)



# Design of `BinaryTree<E>` Class

Data Field	Attribute
protected <code>Node&lt;E&gt; root</code>	Reference to the root of the tree.
Constructor	Behavior
<code>public BinaryTree()</code>	Constructs an empty binary tree.
<code>protected BinaryTree(Node&lt;E&gt; root)</code>	Constructs a binary tree with the given node as the root.
<code>public BinaryTree(E data, BinaryTree&lt;E&gt; leftTree, BinaryTree&lt;E&gt; rightTree)</code>	Constructs a binary tree with the given data at the root and the two given subtrees.
Method	Behavior
<code>public BinaryTree&lt;E&gt; getLeftSubtree()</code>	Returns the left subtree.
<code>public BinaryTree&lt;E&gt; getRightSubtree()</code>	Returns the right subtree.
<code>public E getData()</code>	Returns the data in the root.
<code>public boolean isLeaf()</code>	Returns <b>true</b> if this tree is a leaf, <b>false</b> otherwise.
<code>public String toString()</code>	Returns a <code>String</code> representation of the tree.
<code>private void preOrderTraverse(BiConsumer&lt;E, Integer&gt; consumer)</code>	Performs a preorder traversal of the tree. Each node and its depth are passed to the consumer function. <code>BiConsumer</code> will be discussed in the next section.
<code>public static BinaryTree&lt;E&gt; readBinaryTree(Scanner scan)</code>	Constructs a binary tree by reading its data using <code>Scanner scan</code> .

# BinaryTree<E> Class (cont.)

- ❑ Class heading and data field declarations:

```
import java.io.*;

public class BinaryTree<E> {
    // Insert inner class Node<E> here

    // The root of the tree
    protected Node<E> root;

    . . .
}
```

# Constructors

- ❑ The **no-parameter constructor** creates a **null tree**.

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

- ❑ The **constructor** that creates a tree with a **given node** at the **root**:

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

# Constructors (cont.)

- ❑ The **constructor** that builds a **tree** from a **data** value and **two trees**:

```
public BinaryTree(E data, BinaryTree<E> leftTree,
                 BinaryTree<E> rightTree) {

    root = new Node<E>(data);
    if (leftTree != null) {
        root.left = leftTree.root;
    } else {
        root.left = null;
    }

    if (rightTree != null) {
        root.right = rightTree.root;
    } else {
        root.right = null;
    }
}
```

# getLeftSubtree and getRightSubtree

```
/** Return the left subtree.  
    @return The left subtree or null if either the root  
    or  
           the left subtree is null  
    */  
public BinaryTree<E> getLeftSubtree() {  
    if (root != null && root.left != null) {  
        return new BinaryTree<E>(root.left);  
    } else {  
        return null;  
    }  
}
```

□ **getRightSubtree** method is symmetric

# toString ( ) Method

- ❑ Generates a **string** representing a **preorder traversal** in which **each local root** is **indented** a distance proportional to **its depth**.

```
public String toString() {  
    var sb = new StringBuilder();  
    toString(root, 1, sb); // call recursive toString  
    return sb.toString();  
}
```

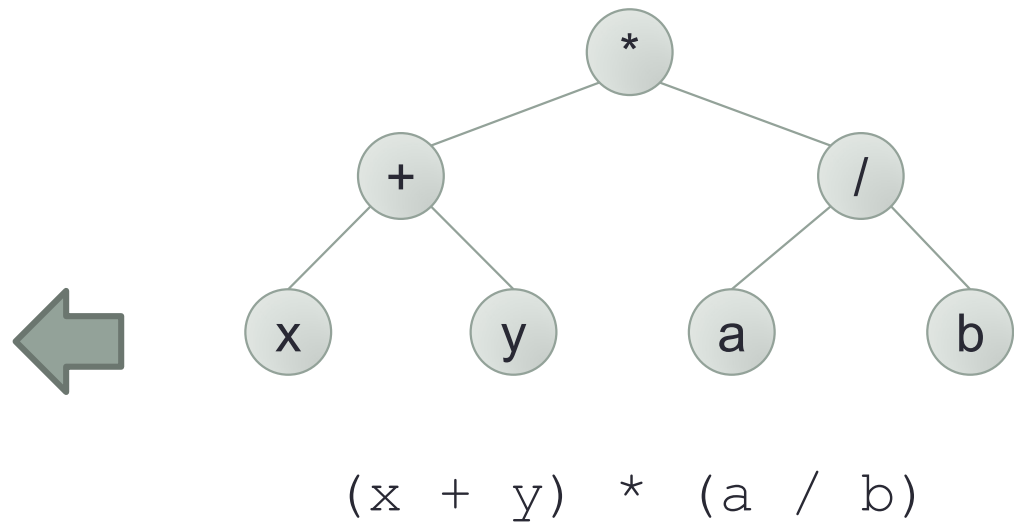
# Recursive toString()

```
/** Converts a sub-tree to a string with a preorder traversal.  
@param node The local root  
@param depth The depth  
@param sb The StringBuilder to save the output  
*/  
private void toString(Node<E> node, int depth, StringBuilder sb) {  
    for (int i = 1; i < depth; i++) sb.append(" ");  
    if (node == null) {  
        sb.append("null\n");  
    } else {  
        sb.append(node.toString());  
        sb.append("\n");  
        toString(node.left, depth + 1, sb);  
        toString(node.right, depth + 1, sb);  
    }  
}
```



# Method toString Output

```
*
  +
    x
      null
      null
    y
      null
      null
  /
    a
      null
      null
    b
      null
      null
```



# BINARY SEARCH TREES

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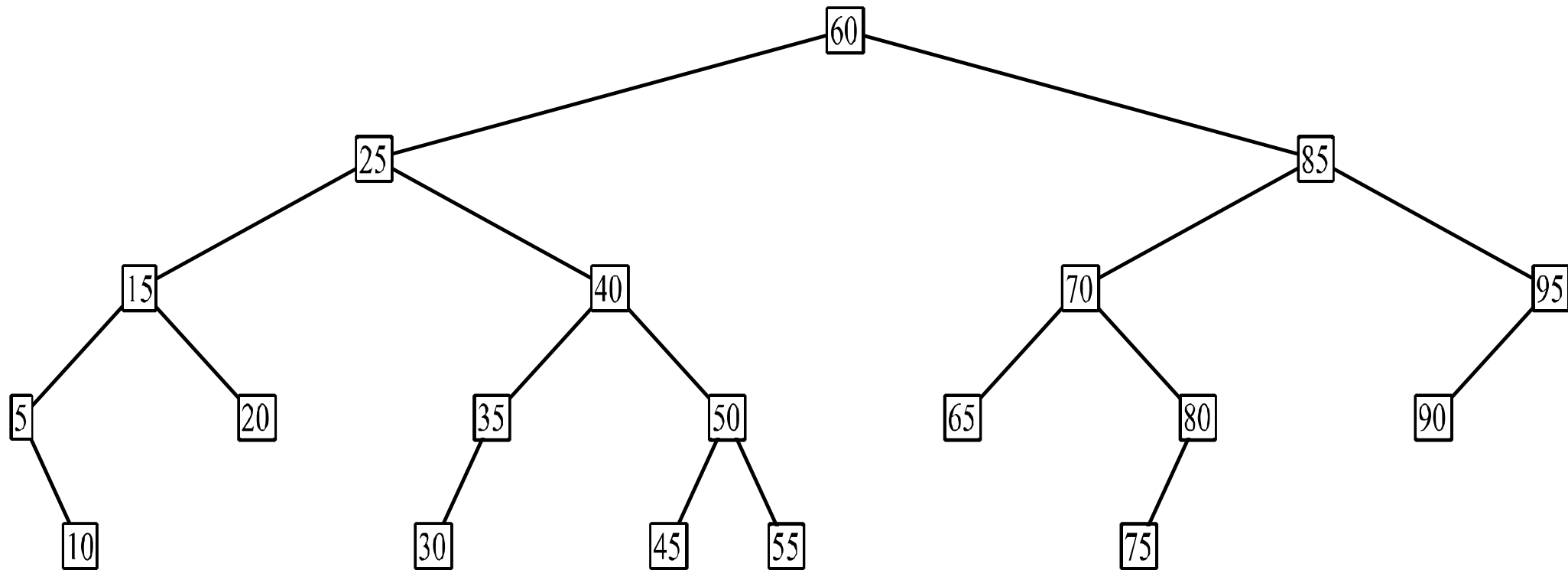
# Overview of a Binary Search Tree

- A Binary Tree and all elements in the left subtree precede those in the right subtree
  - Binary Tree and  $T_L < \text{Middle} < T_R$

A set of nodes  $T$  is a binary search tree if either of the following is true

- $T$  is empty
- If  $T$  is not empty, its root node has two subtrees,  $T_L$  and  $T_R$ , such that  $T_L$  and  $T_R$  are binary search trees and the value in the root node of  $T$  is greater than all values in  $T_L$  and is less than all values in  $T_R$

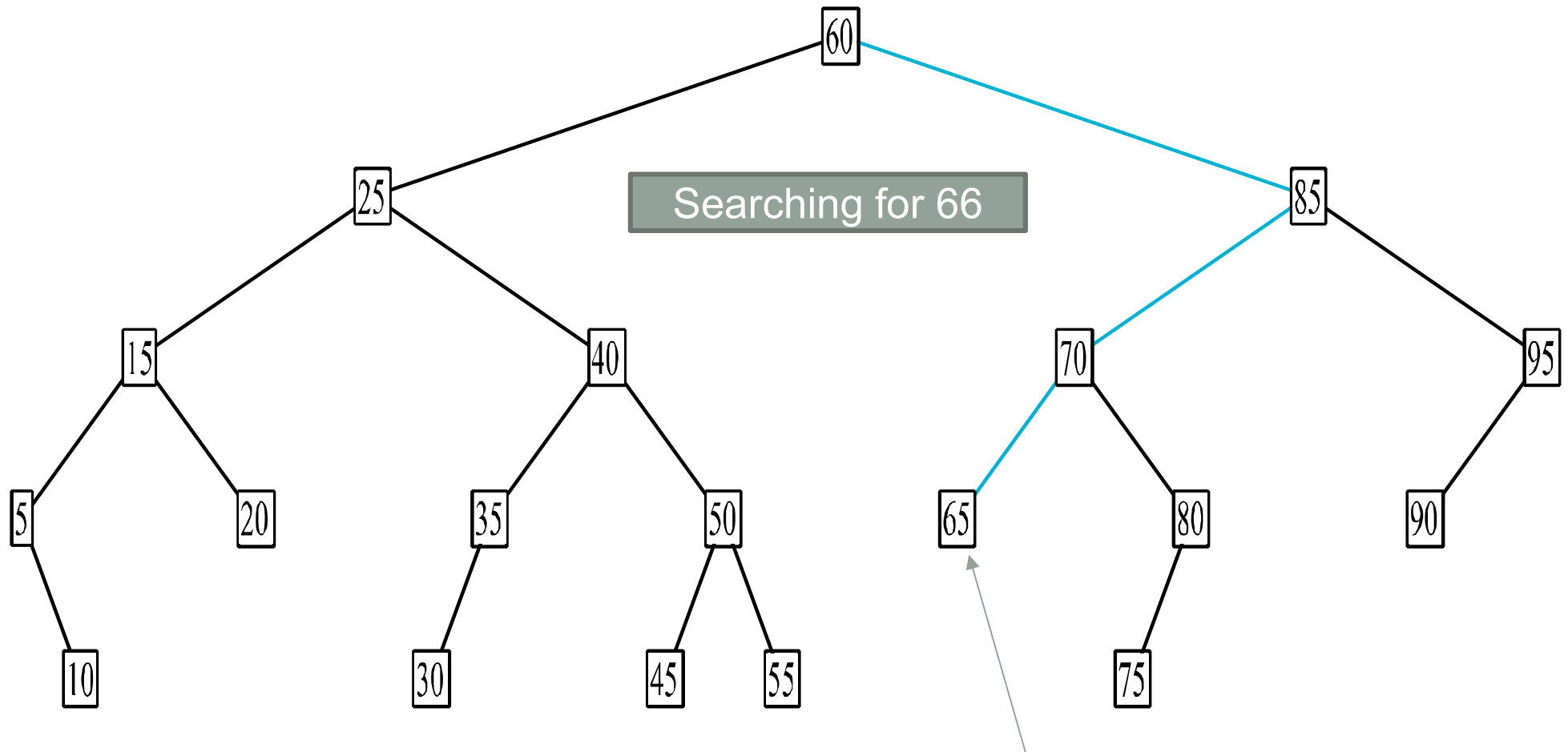
# Overview of a Binary Search Tree (cont.)



# Recursive Algorithm for Searching a BST

1. **if** the root is **null** *Base case 1*
2.       the item is not in the tree; return **null**
3.   **Compare** the value of **target** with **root.data**
4.   **if** they are **equal** *Base case 2*
5.       the target has been found; return the data at the root
6.   **else if** the target is **less than** **root.data**  
      return the result of **searching the left subtree** *Recursive case 1*
7.   **else**  
      return the result of **searching the right subtree** *Recursive case 2*

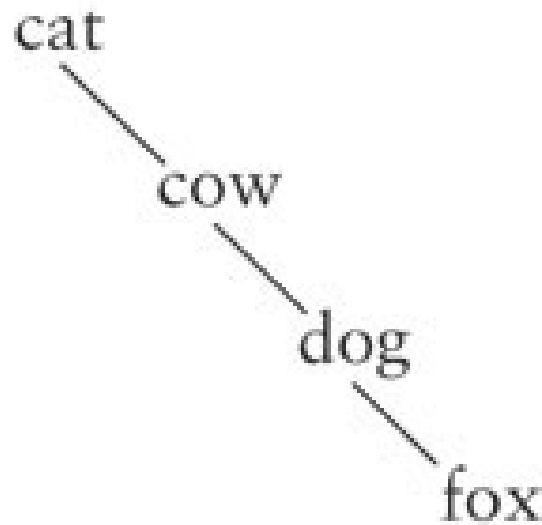
# Searching for 66 in a Binary Search Tree



root of right subtree is **null**—**66** is  
**not in the tree**

# Performance

- ❑ Searching a tree is generally  $O(\log n)$
- ❑ If a **tree** is **not very full**, performance will be **worse**
  - ✓ Searching a tree with only right subtrees, for example, is  $O(n)$



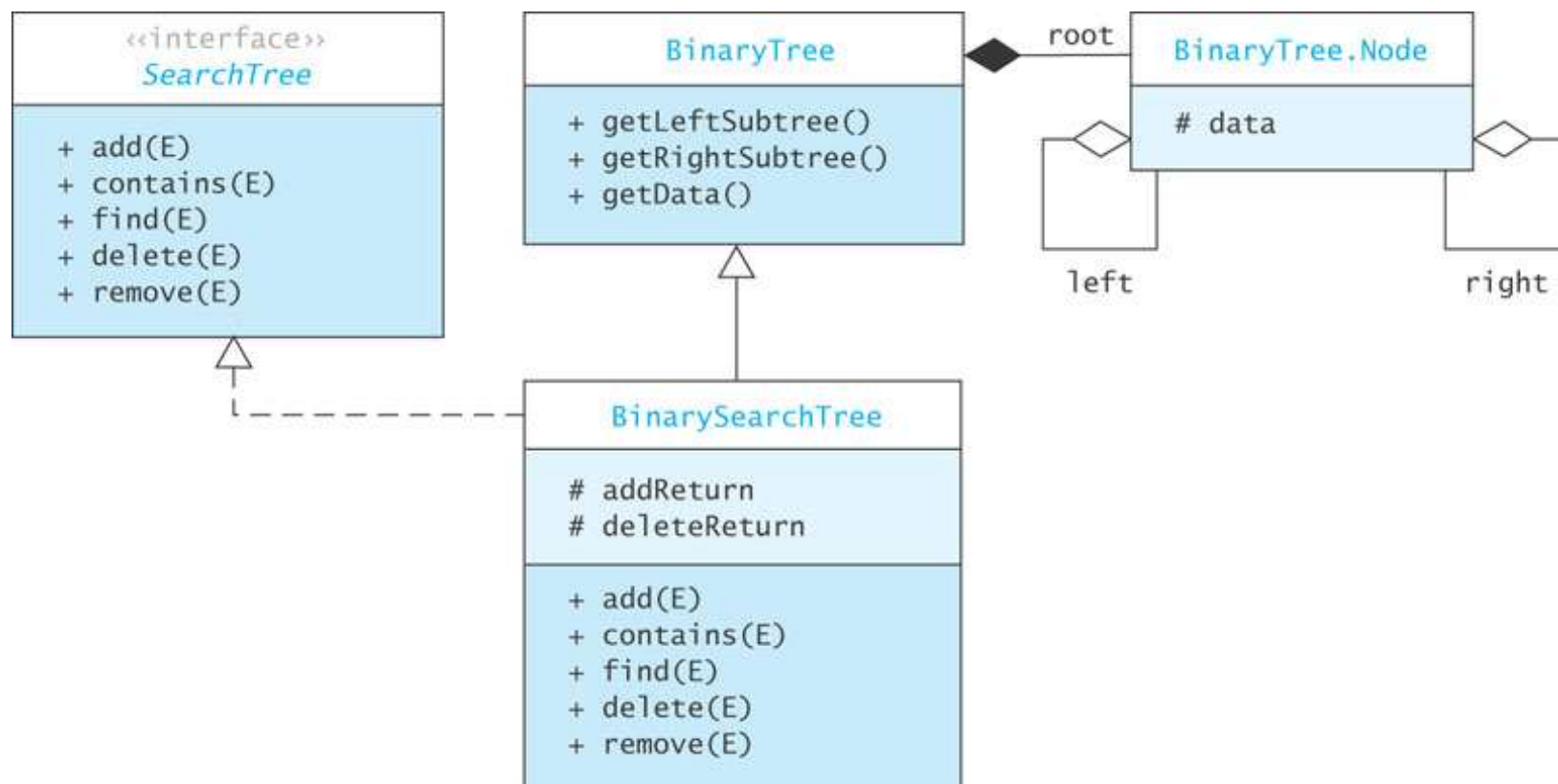
# SearchTree<E> Interface

Method	Behavior
<code>boolean add(E item)</code>	Inserts <code>item</code> where it belongs in the tree. Returns <b>true</b> if item is inserted; <b>false</b> if it isn't (already in tree).
<code>boolean contains(E target)</code>	Returns <b>true</b> if <code>target</code> is found in the tree.
<code>E find(E target)</code>	Returns a reference to the data in the node that is equal to <code>target</code> . If no such node is found, returns <b>null</b> .
<code>E delete(E target)</code>	Removes <code>target</code> (if found) from tree and returns it; otherwise, returns <b>null</b> .
<code>boolean remove(E target)</code>	Removes <code>target</code> (if found) from tree and returns <b>true</b> ; otherwise, returns <b>false</b> .



# BinarySearchTree<E> Class

Data Field	Attribute
protected boolean addReturn	Stores a second return value from the recursive add method that indicates whether the item has been inserted.
protected E deleteReturn	Stores a second return value from the recursive delete method that references the item that was stored in the tree.



# Recursive `find()` Methods

BinarySearchTree find Method

```
/** Starter method find.
    pre: The target object must implement
        the Comparable interface.
    @param target The Comparable object being sought
    @return The object, if found, otherwise null
*/
public E find(E target) {
    return find(root, target);
}

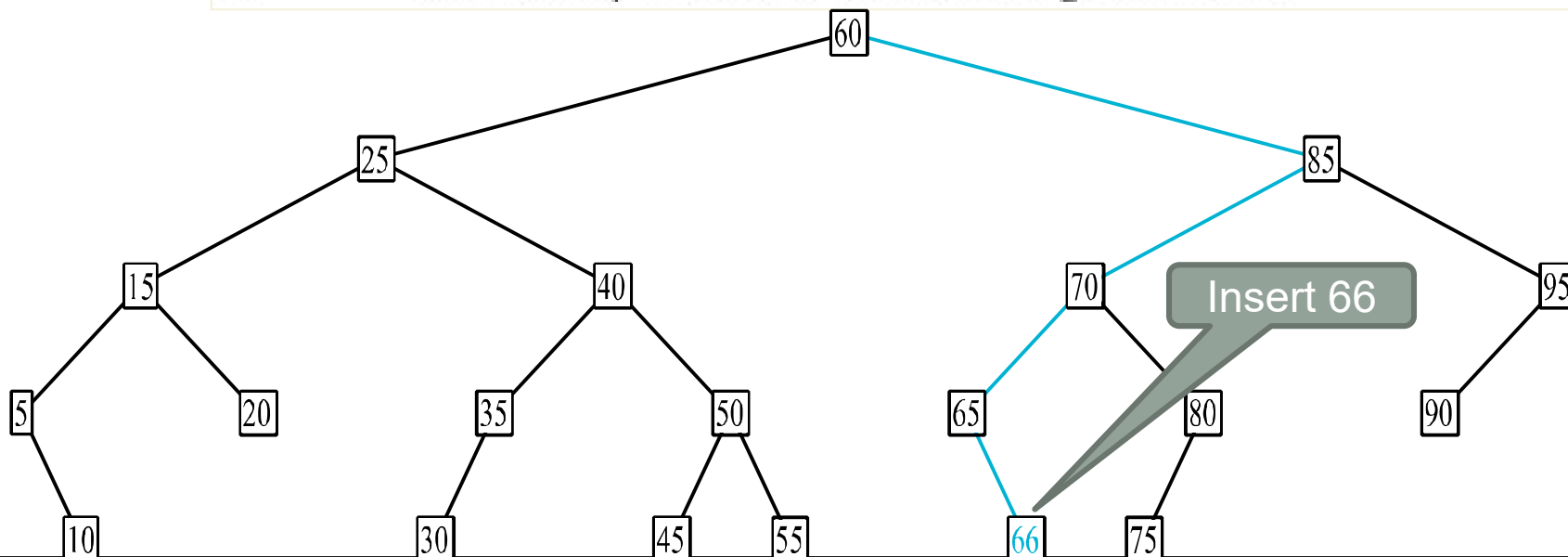
/** Recursive find method.
    @param localRoot The local subtree's root
    @param target The object being sought
    @return The object, if found, otherwise null
*/
private E find(Node<E> localRoot, E target) {
    if (localRoot == null)
        return null;

    // Compare the target with the data field at the root.
    int compResult = target.compareTo(localRoot.data);
    if (compResult == 0)
        return localRoot.data;
    else if (compResult < 0)
        return find(localRoot.left, target);
    else
        return find(localRoot.right, target);
}
```

# Recursive Insertion into a BST

## Recursive Algorithm for Insertion in a Binary Search Tree

- Base case 1* 1. if the root is null
2. Replace empty tree with a new tree with the item at the root and return true.
- Base case 2* 3. else if the item is equal to root.data
4. The item is already in the tree; return false.
- Recursive case 1* 5. else if the item is less than root.data
6. Recursively insert the item in the left subtree.
- Recursive case 2* 7. else
8. Recursively insert the item in the right subtree.



# Recursive add ()

```
/** Starter method add.  
pre: The object to insert must implement the Comparable interface.  
@param item The object being inserted  
@return true if the object is inserted,  
false if the object already exists in the tree*/  
public boolean add(E item) {  
    root = add(root, item);  
    return addReturn;  
}
```

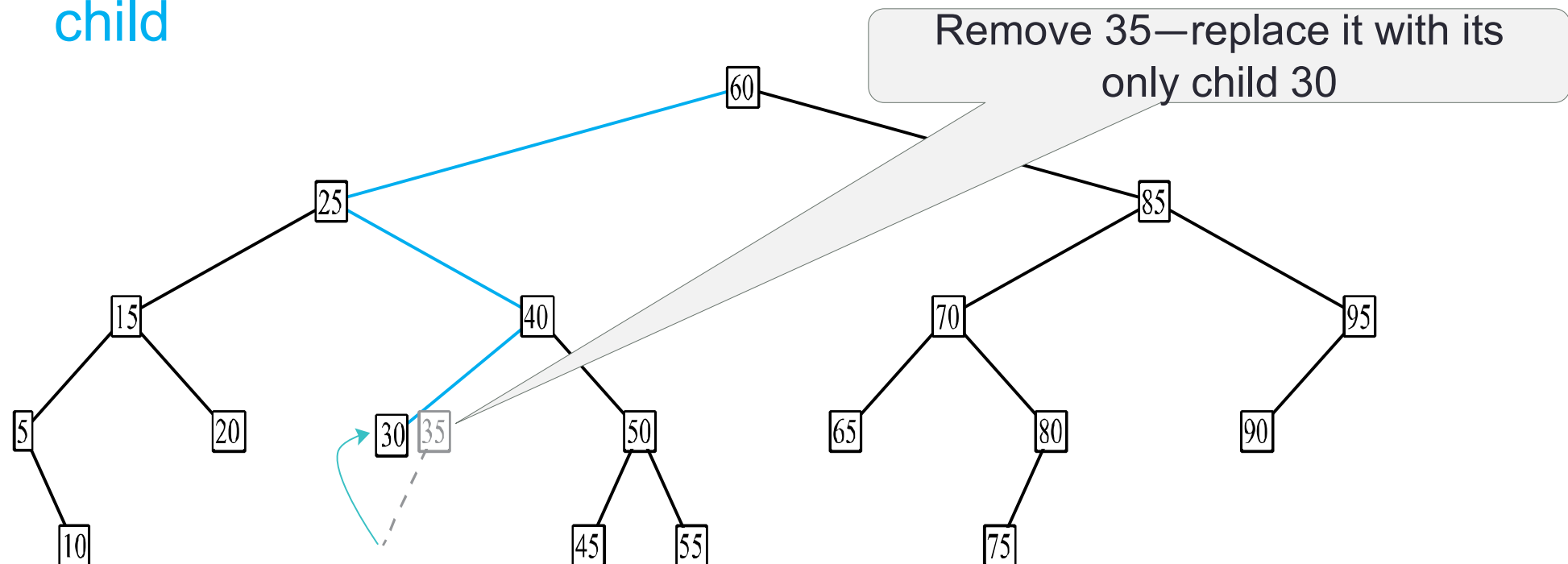
*/\*\* Recursive add method.  
post: The data field addReturn is set true if the item is added to  
the tree, false if the item is already in the tree.  
@param localRoot The local root of the subtree  
@param item The object to be inserted  
@return The new local root that now contains the inserted item\*/*

```
private Node<E> add(Node<E> localRoot, E item) {  
    if (localRoot == null) {  
        // item is not in the tree - insert it.  
        addReturn = true;  
        return new Node<>(item);  
    } else if (item.compareTo(localRoot.data) == 0) {  
        addReturn = false;  
        return localRoot;  
    } else if (item.compareTo(localRoot.data) < 0) {  
        // item is less than localRoot.data  
        localRoot.left = add(localRoot.left, item);  
        return localRoot;  
    } else {  
        // item is greater than localRoot.data  
        localRoot.right = add(localRoot.right, item);  
        return localRoot;  
    }  
}
```

}

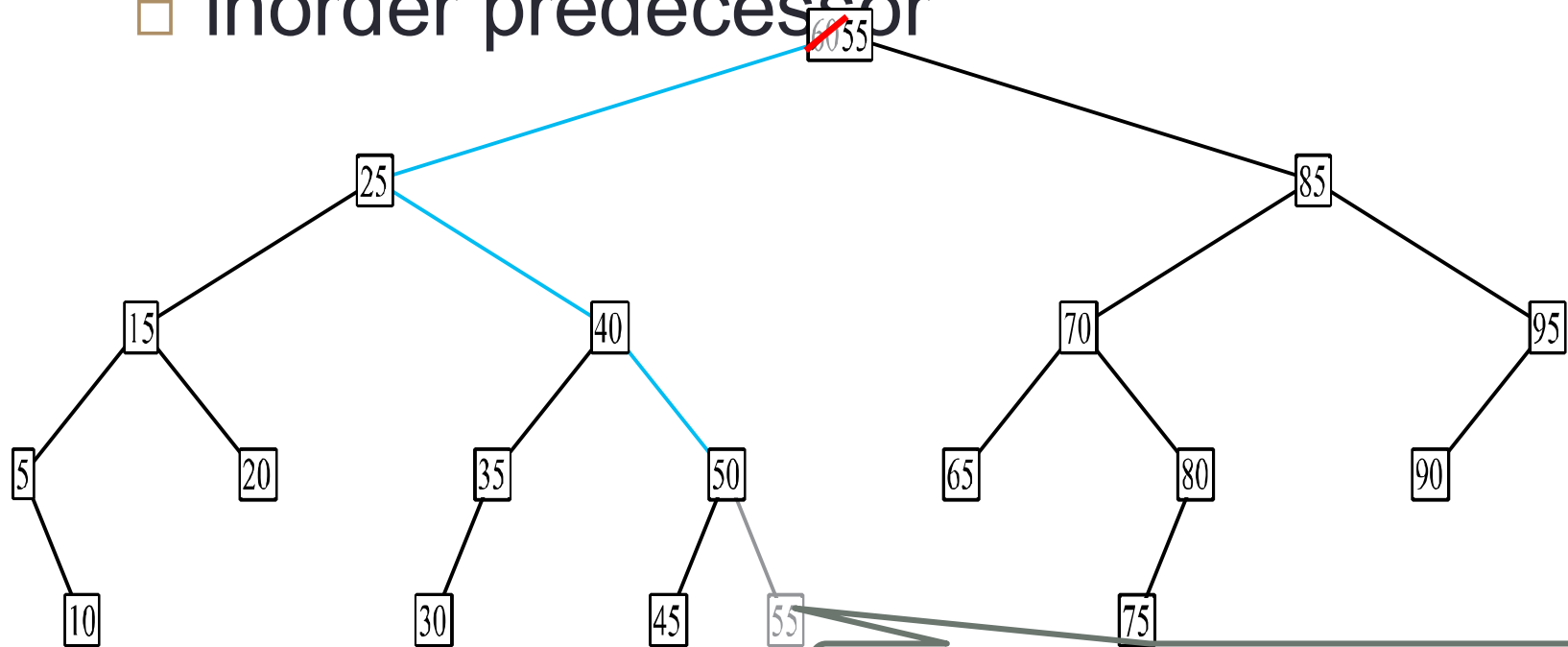
# Removal from a BST

- ❑ If the **item** to be removed has **no children**, simply delete the **reference** to the **item**
- ❑ If the item to be removed has **only one child**, change the **reference** to the item so that it references the **item's only child**



# Removal from a BST

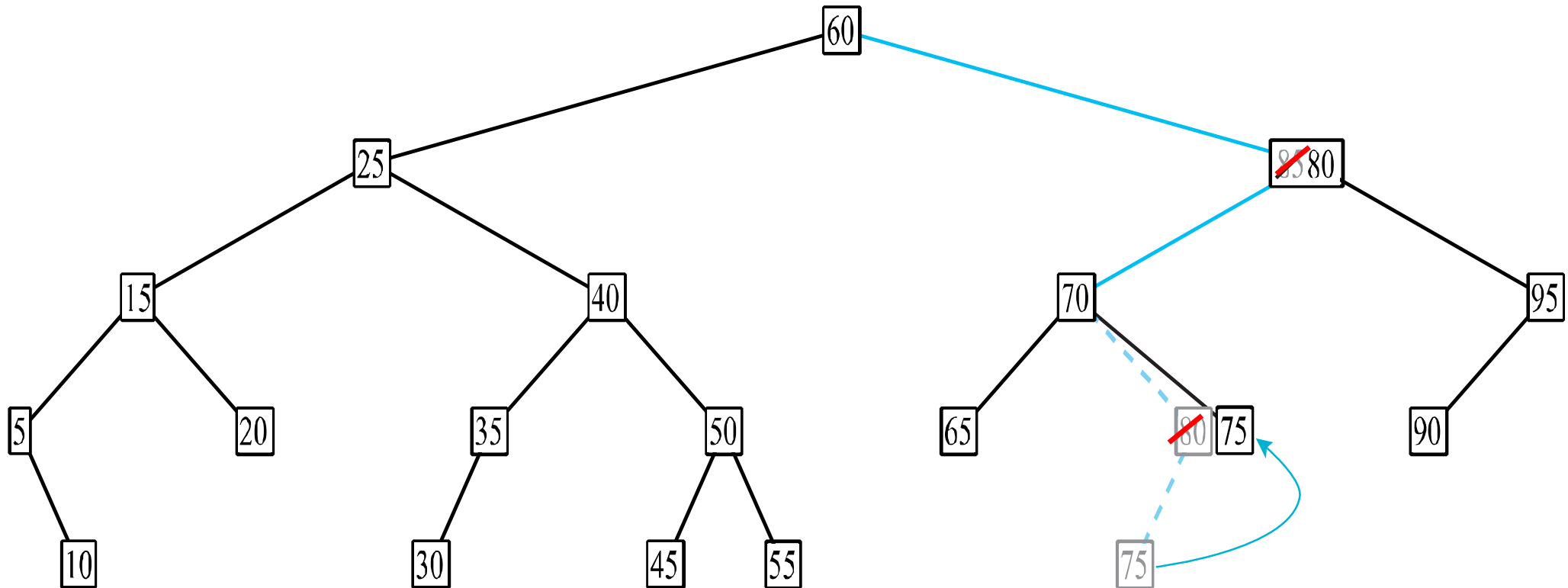
- If the **item** to be removed has **2 children**,  
**replace** it **with** the **largest item** in its **left**  
**subtree**
- inorder predecessor



Remove 60 → replace it with 55

# Removal from a BST

- Remove 85
  - Its inorder predecessor 80 has a child 75. Replace 85 with 80 and reset the right subtree of 80's parent to reference 75.





# Algorithm for Binary Search Tree Removal

1. if the root is null
2.     The item is not in tree—return null.
3. Compare the item to the data at the local root.
4. if the item is less than the data at the local root
5.     Return the result of deleting from the left subtree.
6. else if the item is greater than the local root
7.     Return the result of deleting from the right subtree.
8. else *// The item is in the local root*
9.     Store the data in the local root in deleteReturn.
10.    if the local root has no children
11.       Set the parent of the local root to reference null.
12.    else if the local root has one child
13.       Set the parent of the local root to reference that child.
14.    else *// Find the inorder predecessor*
15.       if the left child has no right child it is the inorder predecessor
16.          Set the parent of the local root to reference the left child.
17.       else
18.          Find the rightmost node in the right subtree of the left child.
19.          Copy its data into the local root's data—remove it by setting its  
parent to reference its left child.

# Method findLargestChild()

BinarySearchTree findLargestChild Method

```
/** Find the node that is the  
    inorder predecessor and replace it  
    with its left child (if any).  
    post: The inorder predecessor is removed from the tree.  
    @param parent The parent of possible inorder  
            predecessor (ip)  
    @return The data in the ip  
    */  
private E findLargestChild(Node<E> parent) {  
    // If the right child has no right child, it is  
    // the inorder predecessor.  
    if (parent.right.right == null) {  
        E returnValue = parent.right.data;  
        parent.right = parent.right.left;  
        return returnValue;  
    } else {  
        return findLargestChild(parent.right);  
    }  
}
```

# Testing a Binary Search Tree

- ❑ To test a binary search tree, **verify** that an **inorder traversal** will **display** the **tree contents in ascending order** after a series of insertions and deletions are performed