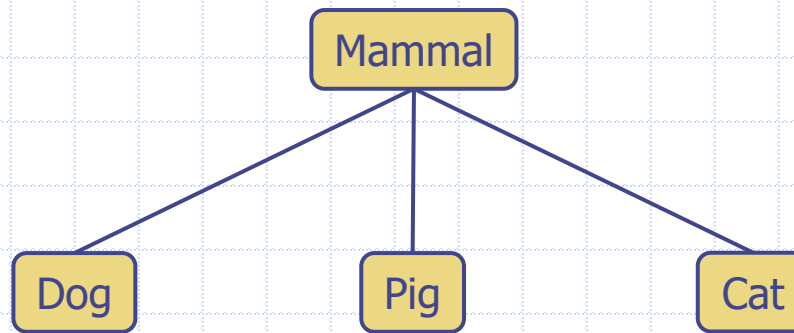


Presentation for use with the textbook **Data Structures and Algorithms in Java, 6<sup>th</sup> edition**, by M. T. Goodrich, R. Tamassia, and M. H. Goldwasser, Wiley, 2014

# Trees



# Trees

- General Trees
- Binary Trees
- Implementing Trees
- Tree Traversal Algorithms

# Lists and Iterators - Review

- ❑ Lists represent a linear sequence of elements, with **more general support for adding or removing elements at arbitrary positions.**
- ❑ Java defines a general interface, `java.util.List`, that includes also index-based methods
- ❑ An array list can be implemented using arrays
  - **Add** and **remove** operations run in  **$O(n)$**  time

# Dynamic Array-based Array List

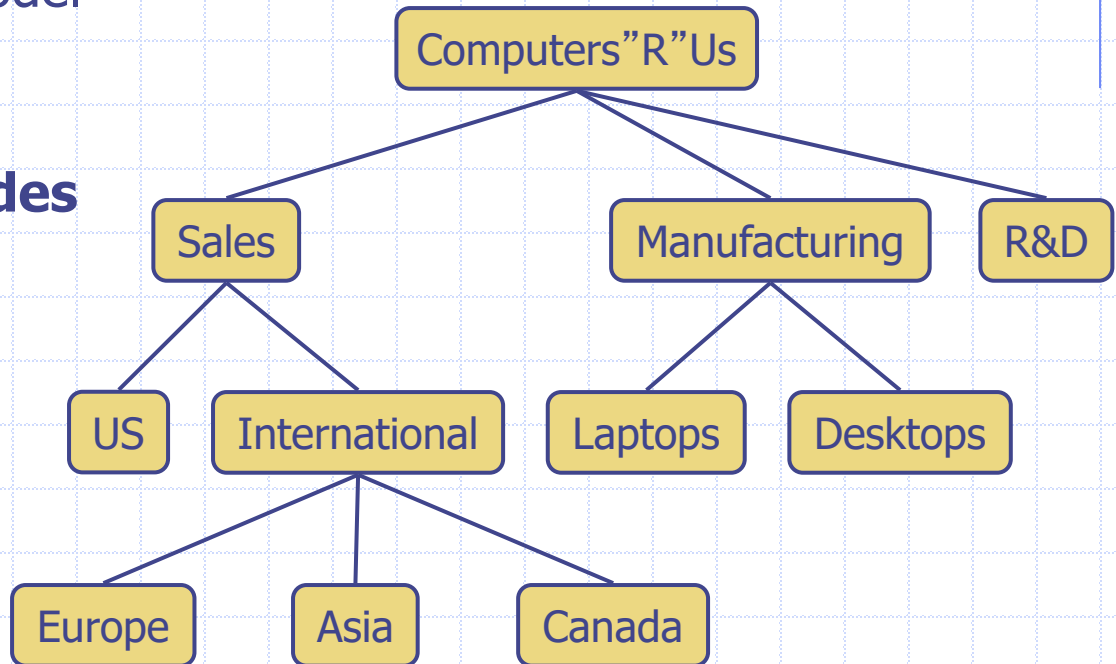
- A **dynamic array list** can be also implemented using arrays
- When the array is full, we replace the array with a larger one
  - **Incremental strategy**: increase the size by a constant  $c$ 
    - The amortized time of a push operation is  $O(n)$
  - **Doubling strategy**: double the size
    - The amortized time of a push operation is  $O(1)$

# Positional Lists

- ❑ **Positional list** ADT uses a **position element that acts as a marker** or token within the broader positional list.
- ❑ A position  **$p$**  is **unaffected by changes elsewhere in a list**.
- ❑ A position instance  $p$  is a simple object, supporting only ***getElement()*** method returning the element stored at position  $p$ .
- ❑ Use a **doubly linked list to implement a positional list**

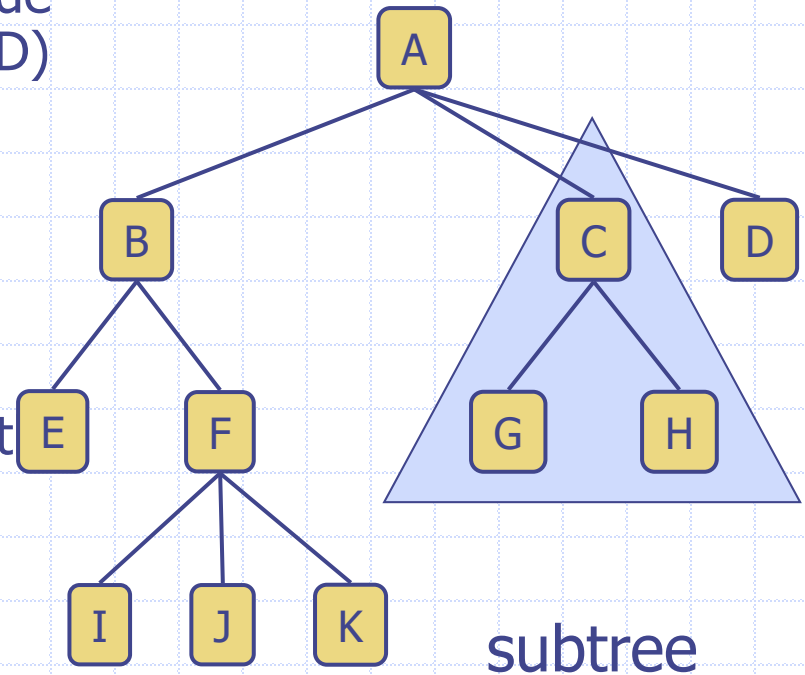
# What is a Tree

- ❑ In computer science, a tree is an abstract model of a **hierarchical structure**
- ❑ A tree consists of **nodes** with a **parent-child relation**
- ❑ Applications:
  - Organization charts
  - File systems
  - Programming environments



# Tree Terminology

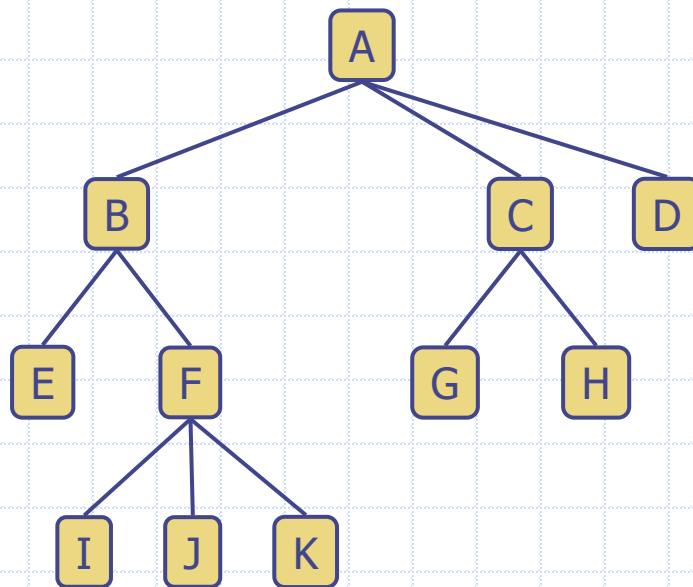
- ❑ **Root:** node **without parent** (A)
- ❑ **Internal node:** node with **at least one child** (A, B, C, F)
- ❑ **External node** (a.k.a. **leaf**): node without children (E, I, J, K, G, H, D)
- ❑ **Ancestors** of a node: parent, grandparent, grand-grandparent, etc.
- ❑ **Depth of a node:** number of ancestors
- ❑ **Height of a tree:** maximum depth of any node (3)
- ❑ **Descendant of a node:** child, grandchild, grand-grandchild, etc.
- ❑ **Subtree:** tree consisting of a node and its descendants



# Tree Terminology

## ■ Edges and Paths in Trees

- An **edge** of tree  $T$  is a pair of nodes  $(u, v)$  such that  $u$  is the parent of  $v$ , or vice versa. Example:  $(C, G)$
- A **path** of  $T$  is a sequence of nodes such that any two consecutive nodes in the sequence form an edge. Example  $(B, F, J)$ .

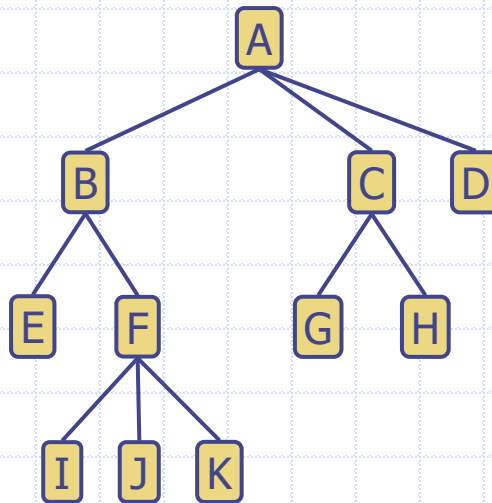




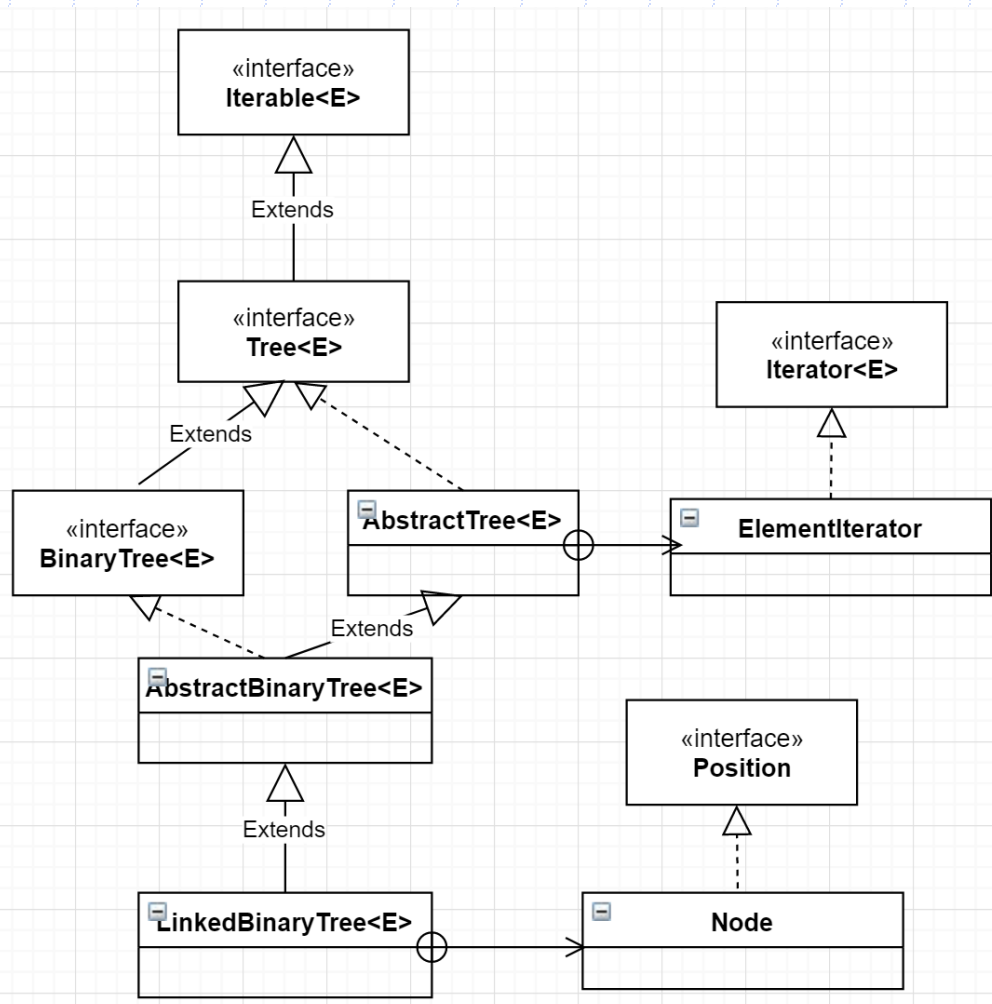
# Tree Terminology

## ■ Ordered Trees

- A tree is **ordered** if there is a **meaningful linear order among the children of each node**; that is, we purposefully identify the children of a node as being the first, second, third, and so on.
- Such an order is usually visualized by arranging siblings left to right, according to their order.



# Tree ADT



# Tree ADT

- We **use positions** to abstract nodes
- Generic methods:
  - integer **size()**
  - boolean **isEmpty()**
  - Iterator **iterator()**
  - Iterable **positions()**
- **Accessor** methods:
  - position **root()**
  - position **parent(p)**
  - Iterable **children(p)**
  - Integer **numChildren(p)**

## ◆ **Query** methods:

- boolean **isInternal(p)**
- boolean **isExternal(p)**
- boolean **isRoot(p)**

◆ Additional update methods may be defined by data structures implementing the Tree ADT

# Java Interface

## Methods for a Tree interface:

```
1  /** An interface for a tree where nodes can have an arbitrary number of children. */
2  public interface Tree<E> extends Iterable<E> {
3      Position<E> root();
4      Position<E> parent(Position<E> p) throws IllegalArgumentException;
5      Iterable<Position<E>> children(Position<E> p)
6          throws IllegalArgumentException;
7      int numChildren(Position<E> p) throws IllegalArgumentException;
8      boolean isInternal(Position<E> p) throws IllegalArgumentException;
9      boolean isExternal(Position<E> p) throws IllegalArgumentException;
10     boolean isRoot(Position<E> p) throws IllegalArgumentException;
11     int size();
12     boolean isEmpty();
13     Iterator<E> iterator();
14     Iterable<Position<E>> positions();
15 }
```

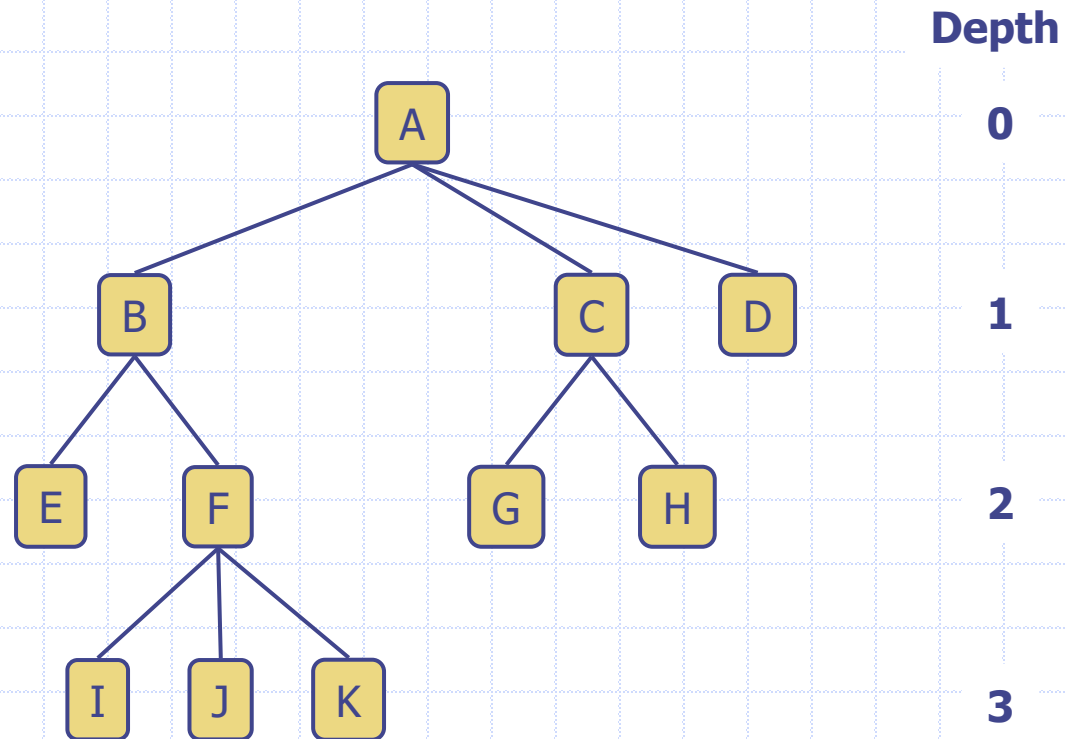
# An AbstractTree Base Class in Java

```
/** An abstract base class providing some functionality of the Tree  
interface. */
```

```
public abstract class AbstractTree<E> implements Tree<E>  
{  
    public boolean isInternal(Position<E> p) { return numChildren(p) > 0; }  
    public boolean isExternal(Position<E> p) { return numChildren(p) == 0; }  
    public boolean isRoot(Position<E> p) { return p == root( ); }  
    public boolean isEmpty( ) { return size( ) == 0; }  
    .....  
}
```

# Computing depth

- Let  $p$  be a position within tree  $T$ . The **depth** of  $p$  is the number of ancestors of  $p$ , other than  $p$  itself.



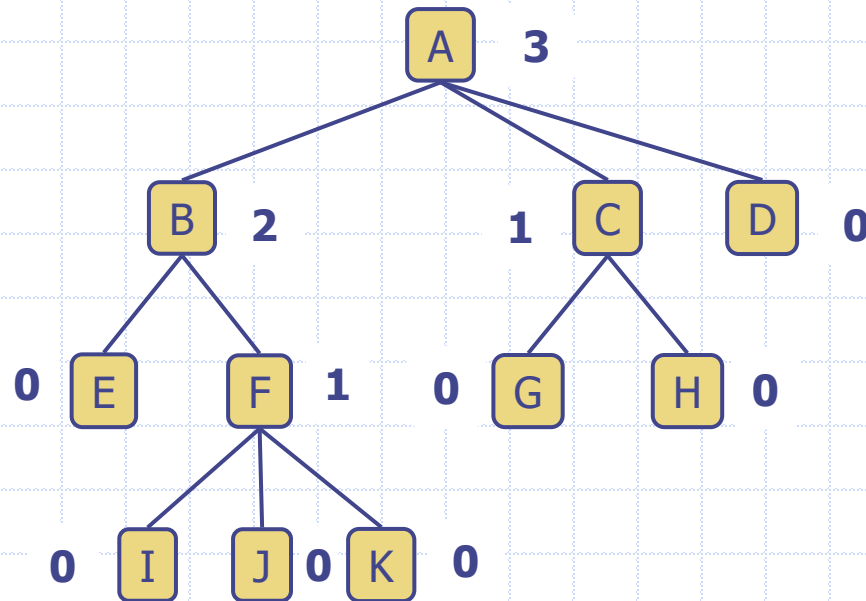
# Computing depth

- The depth of  $p$  can also be recursively defined as follows:
  - If  $p$  is the root, then the depth of  $p$  is 0.
  - Otherwise, the depth of  $p$  is one plus the depth of the parent of  $p$ .

```
1  /** Returns the number of levels separating Position p from the root. */  
2  public int depth(Position<E> p) {  
3      if (isRoot(p))  
4          return 0;  
5      else  
6          return 1 + depth(parent(p));  
7  }
```

# Computing height

- Formally, we define the **height** of a position  $p$  in a tree  $T$  as follows:
  - If  $p$  is a leaf, then the height of  $p$  is 0.
  - Otherwise, the height of  $p$  is **one more than the maximum of the heights of  $p$ 's children**.





# Computing height

- ❑ The following method computes the height of a subtree rooted at position  $p$  using the recursive definition.
- ❑ The base case is would be when  $p$  is an external position, hence the height is 0:

```
1  /** Returns the height of the subtree rooted at Position p. */
2  public int height(Position<E> p) {
3      int h = 0;                                // base case if p is external
4      for (Position<E> c : children(p))
5          h = Math.max(h, 1 + height(c));
6      return h;
7  }
```

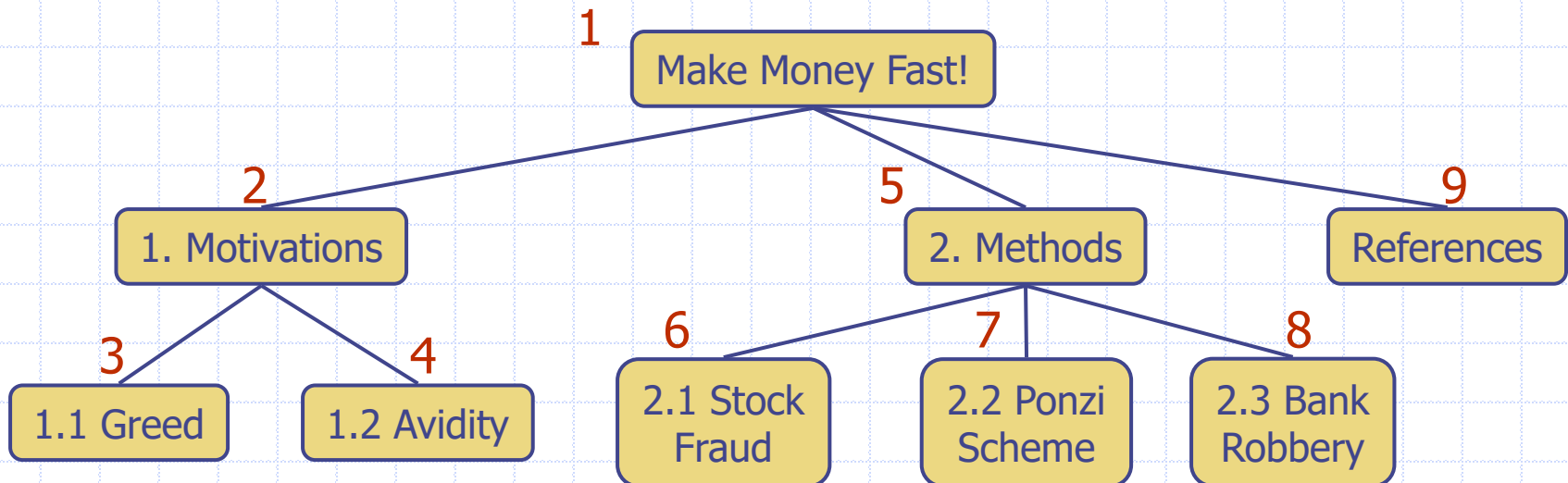
# Tree Traversal

- A ***traversal*** of a tree  $T$  is a systematic way of accessing, or “visiting,” all the positions of  $T$
- In a ***preorder traversal*** of a tree  $T$ , the **root of  $T$  is visited first and then the subtrees rooted at its children are traversed recursively.**
  - If the tree is ordered, then the subtrees are traversed according to the order of the children.
- In **postorder traversal** of a tree it recursively **traverses the subtrees rooted at the children of the root first, and then visits the root.**
  - In some sense, this algorithm can be viewed as the opposite of the preorder traversal(hence, the name “postorder”)

# Preorder Traversal

- A **traversal** visits the nodes of a tree in a systematic manner
- In a **preorder traversal**, a node is visited before its descendants
- Application: print a structured document

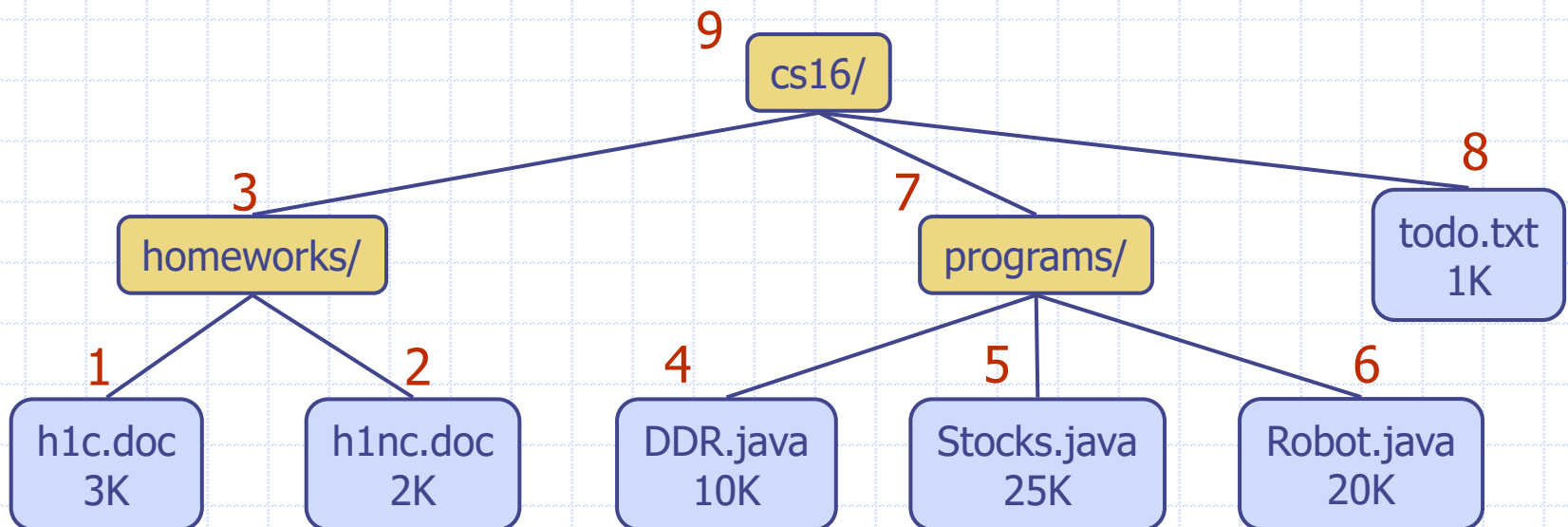
**Algorithm** *preOrder*( $v$ )  
*visit*( $v$ )  
**for each** child  $w$  of  $v$   
*preorder* ( $w$ )



# Postorder Traversal

- ❑ In a **postorder traversal**, a node is visited after its descendants
- ❑ Application: compute space used by files in a directory and its subdirectories

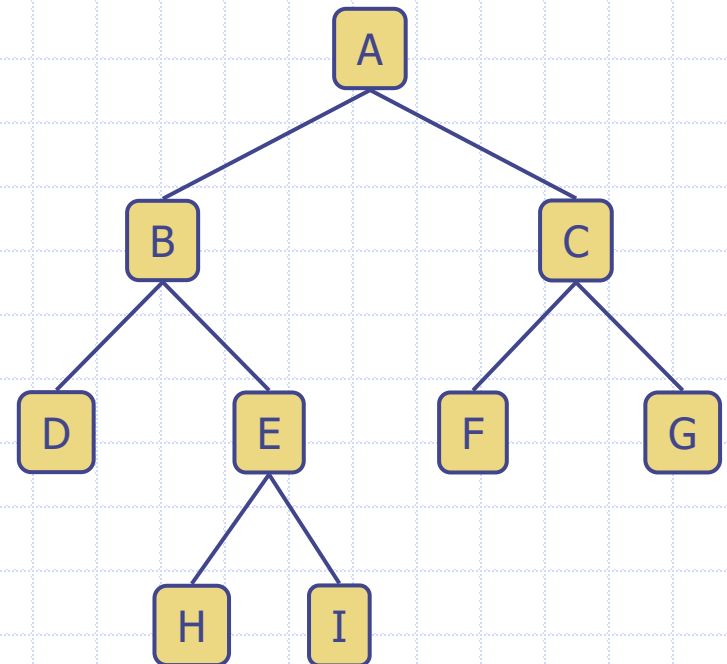
**Algorithm** *postOrder*(*v*)  
  **for each** child *w* of *v*  
    *postOrder* (*w*)  
  *visit*(*v*)



# Binary Trees

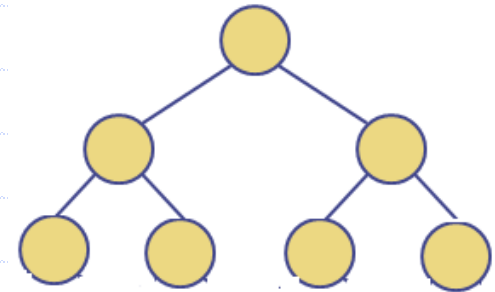
- A **binary tree** is an ordered tree with the following properties:
  - Each internal node has **at most two children** (exactly two for **proper** binary trees).
  - Each child node is labeled as being either a **left child** or a **right child**.
  - A **left child precedes a right child** in the order of children of a node.
- The subtree rooted at a left or right child of an internal node  $v$  is called a **left subtree** or **right subtree**, respectively, of  $v$ .

- Applications:
  - arithmetic expressions
  - decision processes
  - searching



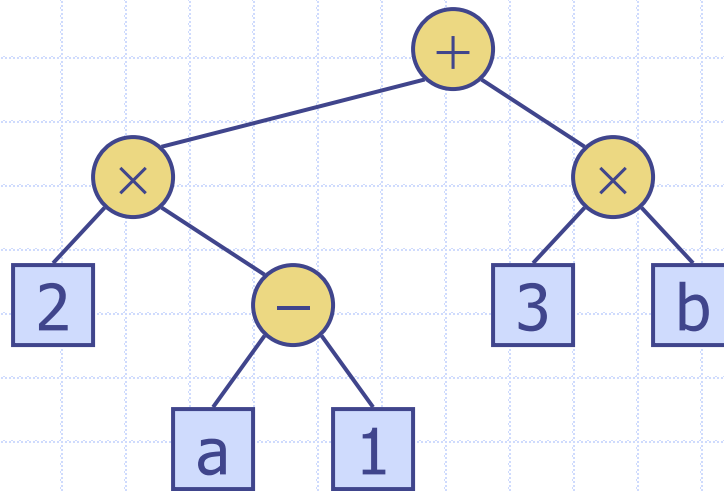
# Binary Trees

- Alternative **recursive definition**: a binary tree is either
  - a tree consisting of a single node, or
  - a tree whose root has an ordered pair of children, each of which is a binary tree
- A binary tree is **proper** if each node has either zero or two children.
  - Some people also refer to such trees as being **full** binary trees.
  - In a proper binary tree, every internal node has exactly two children.
- A binary tree that is not proper is **improper**.



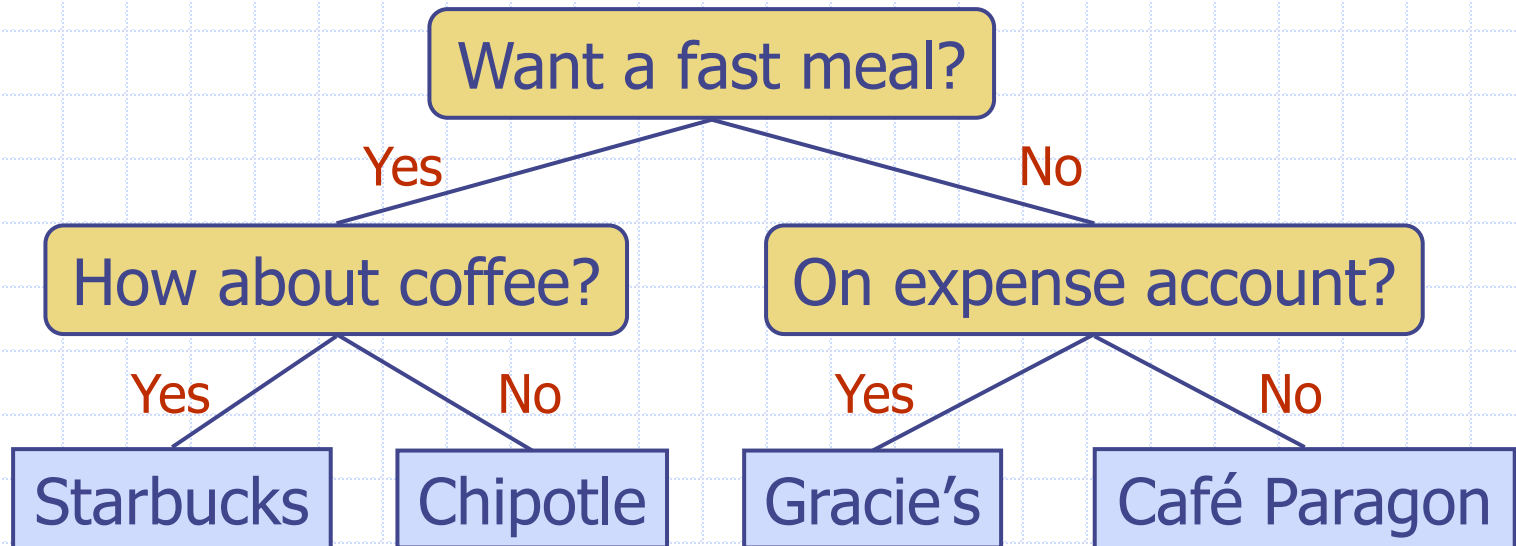
# Arithmetic Expression Tree

- Binary tree associated with an arithmetic expression
  - internal nodes: operators
  - external nodes: operands
- Example: arithmetic expression tree for the expression  $(2 \times (a - 1) + (3 \times b))$



# Decision Tree

- Binary tree associated with a decision process
  - internal nodes: questions with yes/no answer
  - external nodes: decisions
- Example: dining decision





# Properties of Proper Binary Trees

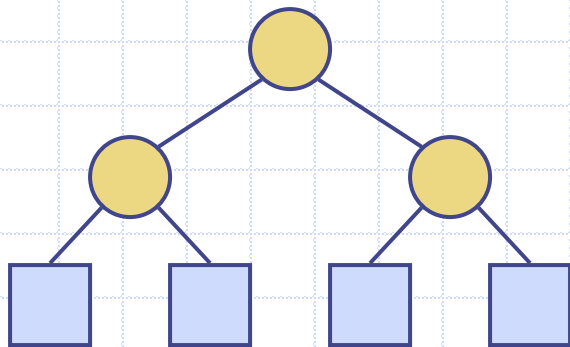
## □ Notation

$n$  number of nodes

$e$  number of  
external nodes

$i$  number of internal  
nodes

$h$  height



## ◆ Properties:

■  $e = i + 1$

■  $n = 2e - 1$

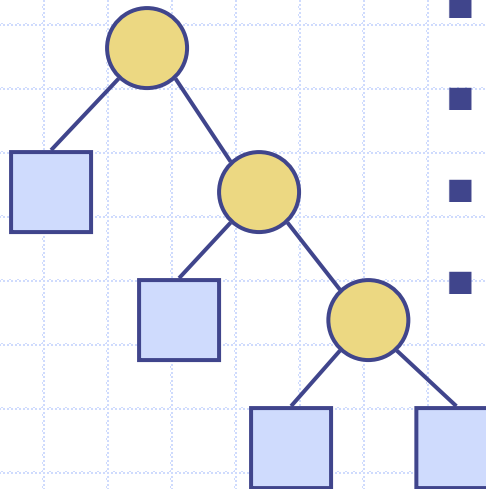
■  $h \leq i$

■  $h \leq (n - 1)/2$

■  $e \leq 2^h$

■  $h \geq \log_2 e$

■  $h \geq \log_2 (n + 1) - 1$



# BinaryTree ADT

- The **BinaryTree** ADT extends the Tree ADT, i.e., it inherits all the methods of the Tree ADT
- Additional methods:
  - position **left**(p)
  - position **right**(p)
  - position **sibling**(p)
- The above methods return **null** when there is no **left**, **right**, or **sibling** of  $p$ , respectively
- Update methods may be defined by data structures implementing the BinaryTree ADT

# Defining a BinaryTree Interface

- ❑ **Extends the Tree interface to add the three new behaviors.**
  - In this way, a binary tree is expected to support all the functionality that was defined for general trees

```
1  /** An interface for a binary tree, in which each node has at most two children. */
2  public interface BinaryTree<E> extends Tree<E> {
3      /** Returns the Position of p's left child (or null if no child exists). */
4      Position<E> left(Position<E> p) throws IllegalArgumentException;
5      /** Returns the Position of p's right child (or null if no child exists). */
6      Position<E> right(Position<E> p) throws IllegalArgumentException;
7      /** Returns the Position of p's sibling (or null if no sibling exists). */
8      Position<E> sibling(Position<E> p) throws IllegalArgumentException;
9  }
```

# Defining an AbstractBinaryTree Base Class

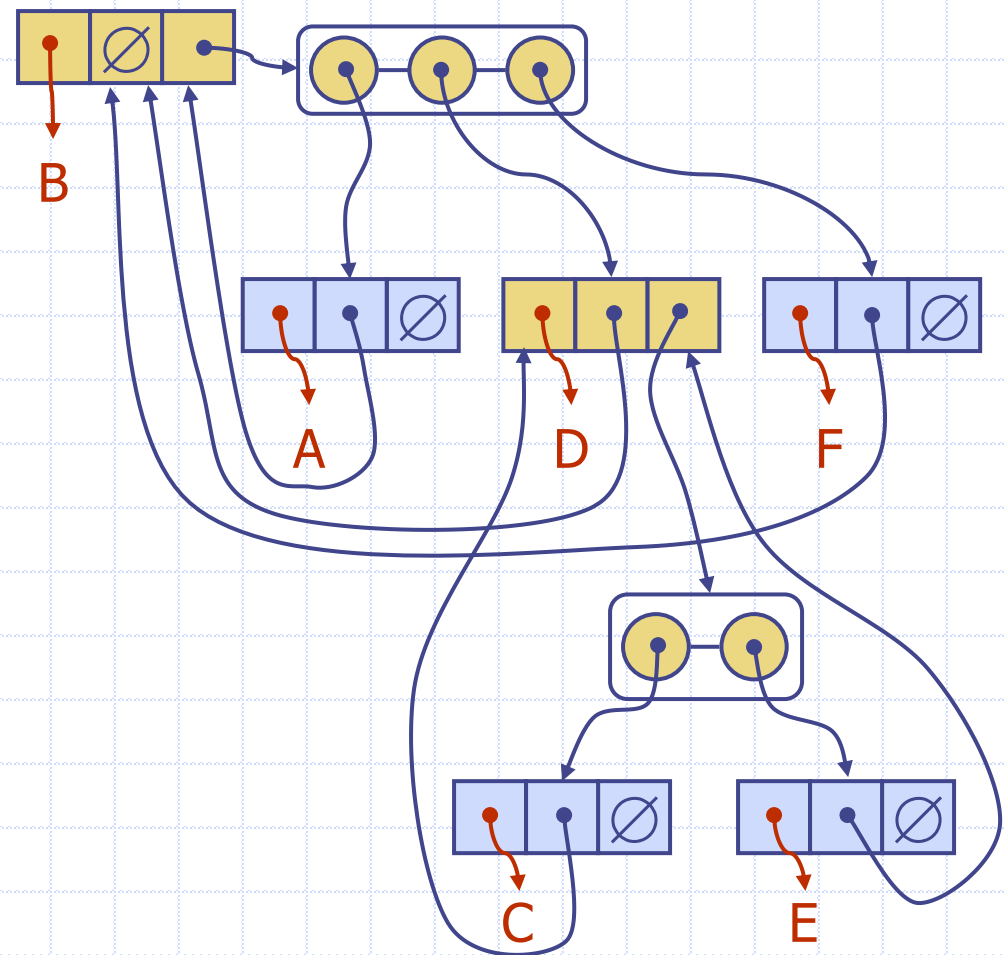
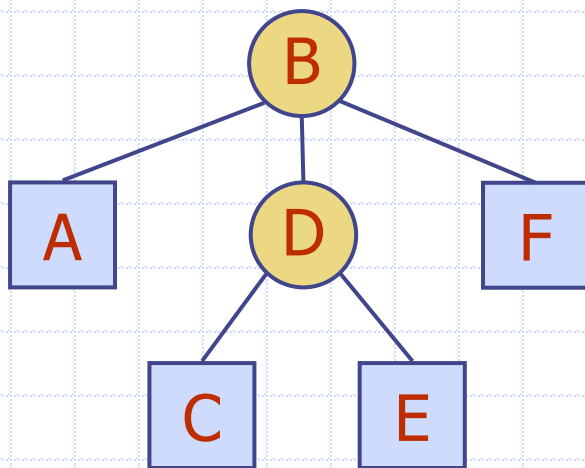
```
1  /** An abstract base class providing some functionality of the BinaryTree interface. */
2  public abstract class AbstractBinaryTree<E> extends AbstractTree<E>
3                                     implements BinaryTree<E> {
4      /** Returns the Position of p's sibling (or null if no sibling exists). */
5      public Position<E> sibling(Position<E> p) {
6          Position<E> parent = parent(p);
7          if (parent == null) return null;           // p must be the root
8          if (p == left(parent))                    // p is a left child
9              return right(parent);                 // (right child might be null)
10         else                                       // p is a right child
11             return left(parent);                  // (left child might be null)
12     }
13     /** Returns the number of children of Position p. */
14     public int numChildren(Position<E> p) {
15         int count=0;
16         if (left(p) != null)
17             count++;
18         if (right(p) != null)
19             count++;
20         return count;
21     }
22     /** Returns an iterable collection of the Positions representing p's children. */
23     public Iterable<Position<E>> children(Position<E> p) {
24         List<Position<E>> snapshot = new ArrayList<>(2); // max capacity of 2
25         if (left(p) != null)
26             snapshot.add(left(p));
27         if (right(p) != null)
28             snapshot.add(right(p));
29         return snapshot;
30     }
31 }
```

# Implementing Trees

- A natural way to realize a **binary tree**  $T$  is to use a ***linked structure***, with a node that maintains references to the element stored at a position  $p$  and to the nodes associated with the children and parent of  $p$ .
  - If  $p$  is the root of  $T$ , then the parent field of  $p$  is null.
  - Likewise, if  $p$  does not have a left child (respectively, right child), the associated field is null.
- The tree itself maintains an instance variable, called *root*, storing a reference to the root node (if any), and a variable, called *size*, that represents the overall number of nodes of  $T$ .

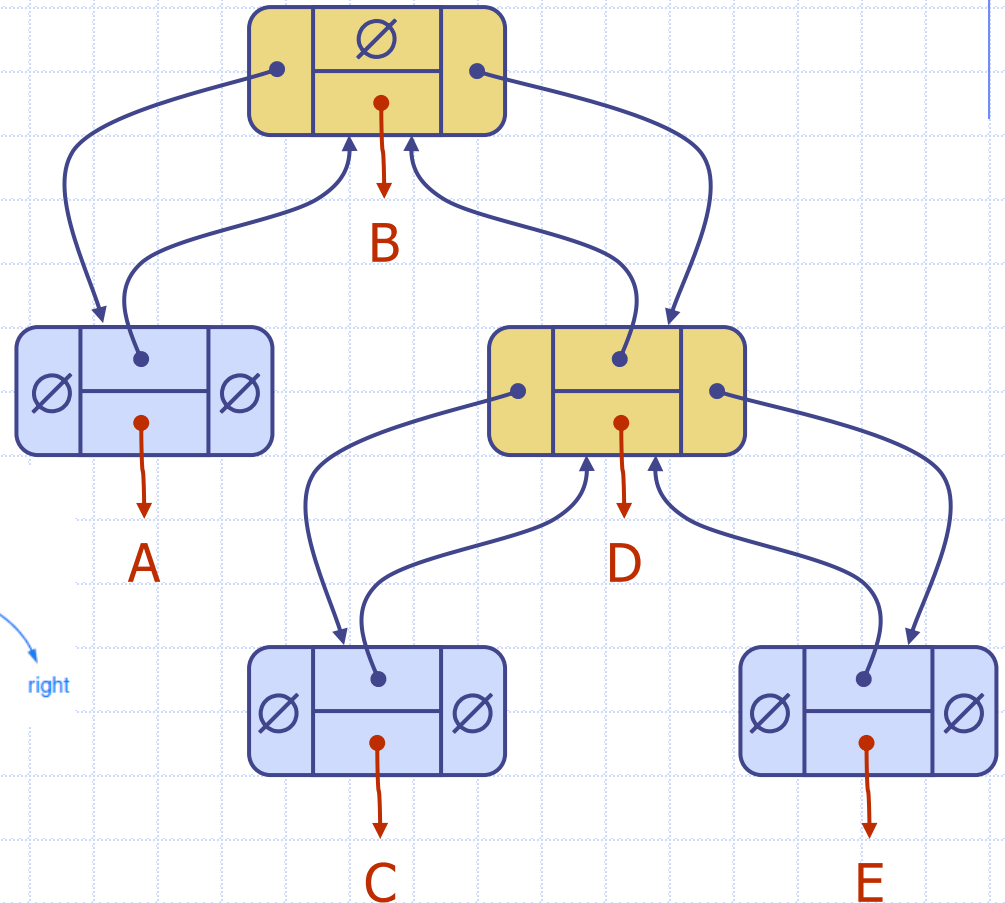
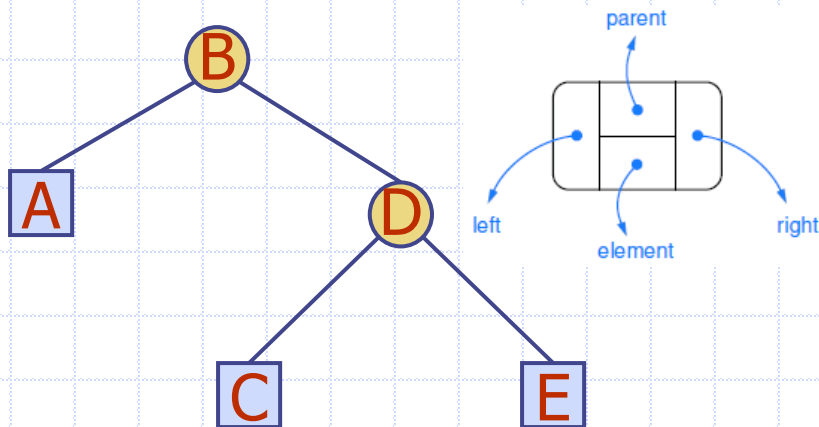
# Linked Structure for General Trees

- A node is represented by an object storing
  - **Element**
  - **Parent** node
  - **Sequence of children** nodes
- Node objects implement the Position ADT



# Linked Structure for Binary Trees

- A node is represented by an object storing
  - **Element**
  - **Parent node**
  - **Left child node**
  - **Right child node**
- Node objects implement the Position ADT



# Java Implementation

- **LinkedBinaryTree** class:
  - Inner **Node** class, which implements the **Position** interface.
    - ◆ Instance variables: **element**, *parent*, *left*, *right*
    - ◆ **createNode** method that returns a new node instance (factory pattern).
  - Two instance variables: *root* and *size*
  - The **validate(p)** method, followed by the accessors **size**, **root**, **left**, and **right**.
  - six update methods for a linked binary tree:
    - ◆ **addRoot**, **addLeft**, **addRight**, **set**, **attach**, **remove**



# Java Implementation

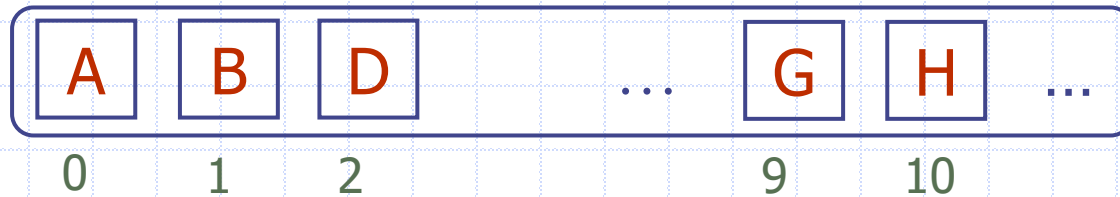
- Running times of the `LinkedBinaryTree` methods, including derived methods that are inherited from the `AbstractTree` and `AbstractBinaryTree` classes:

Method	Running Time
size, isEmpty	$O(1)$
root, parent, isRoot, isInternal, isExternal	$O(1)$
numChildren( $p$ )	$O(1)$
children( $p$ )	$O(c_p + 1)$
depth( $p$ )	$O(d_p + 1)$
height	$O(n)$

**Table 8.2:** Running times of the accessor methods of an  $n$ -node general tree implemented with a linked structure. We let  $c_p$  denote the number of children of a position  $p$ , and  $d_p$  its depth. The space usage is  $O(n)$ .

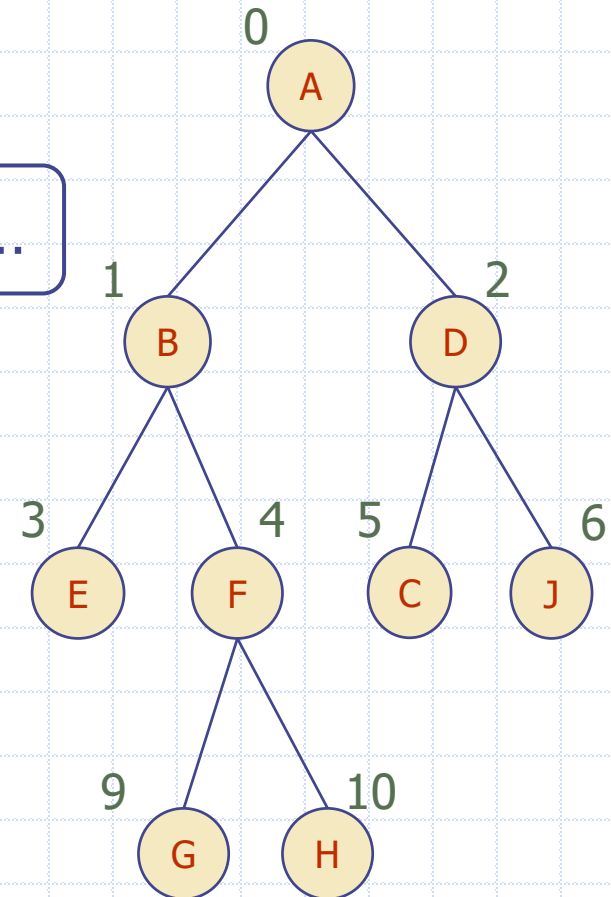
# Array-Based Representation of Binary Trees

- Nodes are stored in an array  $A$



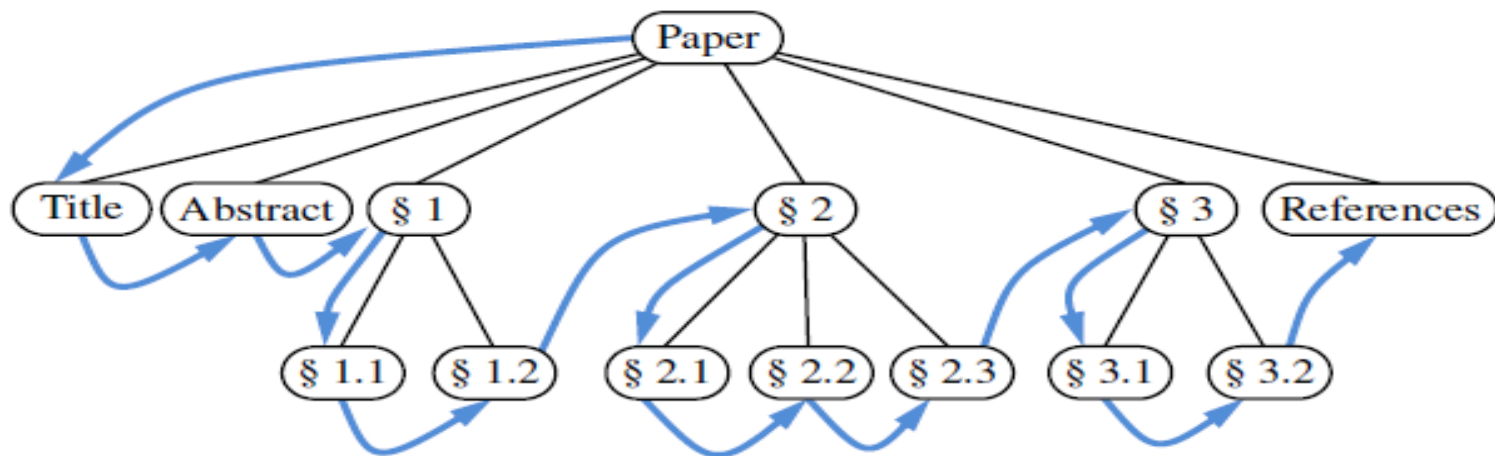
Node  $v$  is stored at  $A[\text{rank}(v)]$ , where:

- $\text{rank}(\text{root}) = 0$
- if node is the left child of  $\text{parent}(\text{node})$ ,  
 $\text{rank}(\text{node}) = 2 \cdot \text{rank}(\text{parent}(\text{node})) + 1$
- if node is the right child of  $\text{parent}(\text{node})$ ,  
 $\text{rank}(\text{node}) = 2 \cdot \text{rank}(\text{parent}(\text{node})) + 2$



# Preorder Tree Traversal Algorithm

- A traversal of a tree  $T$  is a systematic way of accessing, or “visiting,” all the positions of  $T$ .
- In the tree below the **preorder** algorithm:
  - Visits the **root**
  - Recursively traverses the **subtree for each child of root**



**Figure 8.13:** Preorder traversal of an ordered tree, where the children of each position are ordered from left to right.

# Preorder Tree Traversal Algorithm

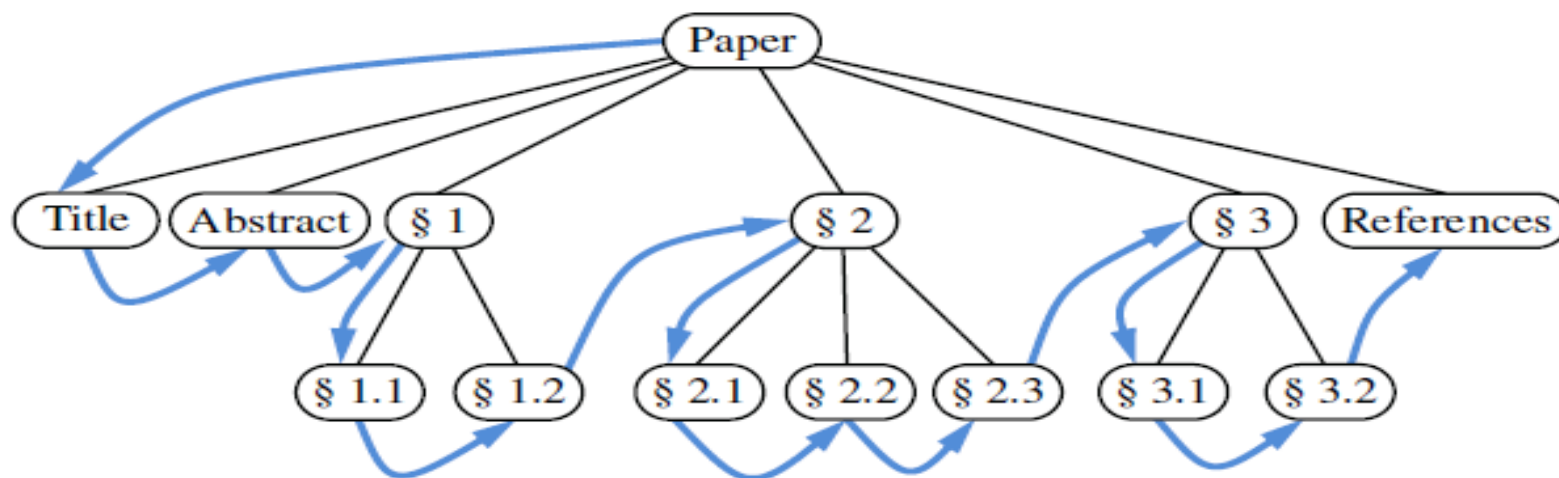
**Algorithm** preorder( $p$ ):

perform the “visit” action for position  $p$  { this happens before any recursion }

for each child  $c$  in children( $p$ ) do

preorder( $c$ )

{ recursively traverse the subtree rooted at  $c$  }



**Figure 8.13:** Preorder traversal of an ordered tree, where the children of each position are ordered from left to right.

- ```

Algorithm postorder( $p$ ):
    for each child  $c$  in children( $p$ ) do
        postorder( $c$ )           { recursively traverse the subtree rooted at  $c$  }
    perform the “visit” action for position  $p$    { this happens after any recursion }

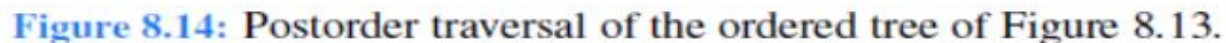
```
- Code Fragment 8.13:** Algorithm postorder for performing the postorder traversal of a subtree rooted at position  $p$  of a tree.

```
for each child  $c$  in children( $p$ ) do
```

- { recursively traverse the subtree rooted at  $c$  }

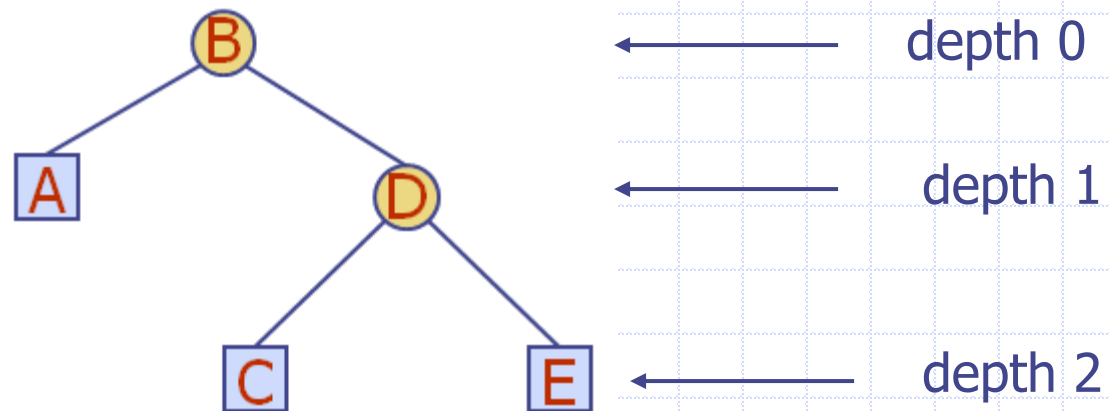
{ this happens after any recursion }

**Code Fragment 8.13:** Algorithm postorder for performing the postorder traversal of a subtree rooted at position  $p$  of a tree.



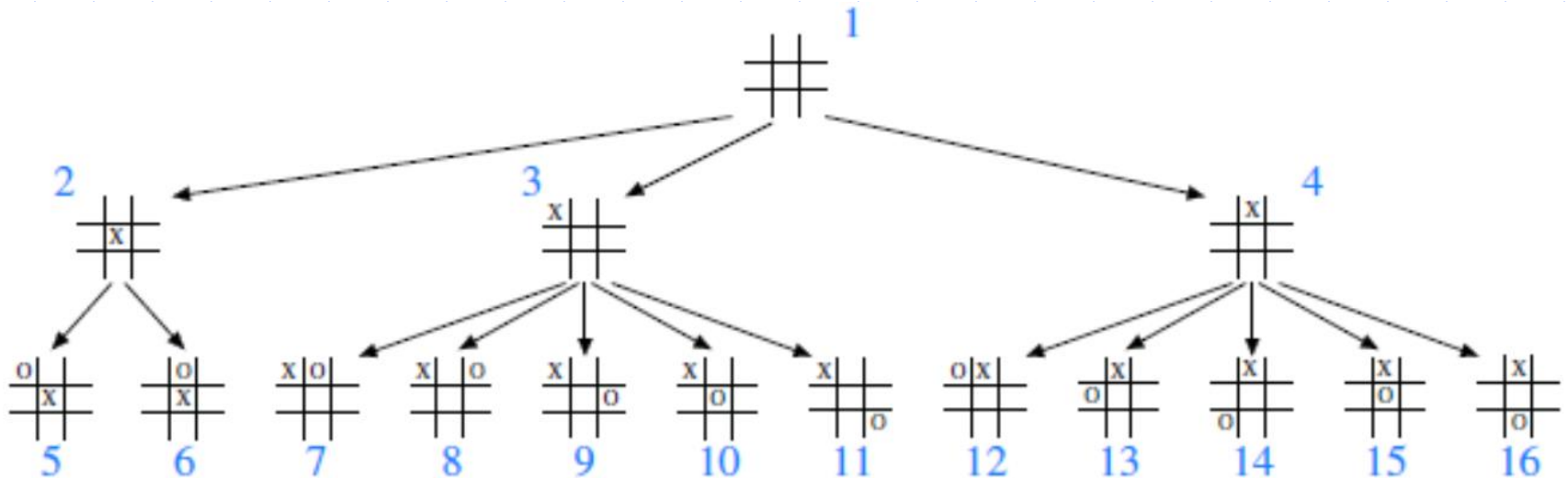
# Breadth-First Tree Traversal Algorithm

- A **breadth-first** traversal is a common approach used in software for playing games.
  - traverse a tree so that we visit all the positions at depth  **$d$**  before we visit the positions at depth  **$d+1$** .



# Breadth-First Tree Traversal Algorithm

- A game tree represents the **possible choices of moves** that might be made by a player (or computer) during a game, with the root of the tree being the initial configuration for the game.

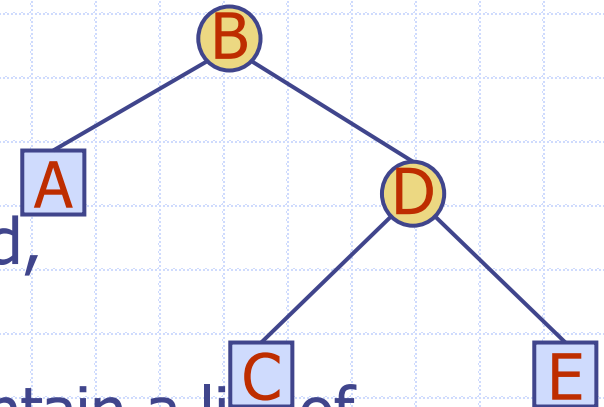


**Figure 8.15:** Partial game tree for Tic-Tac-Toe when ignoring symmetries; annotations denote the order in which positions are visited in a breadth-first tree traversal.



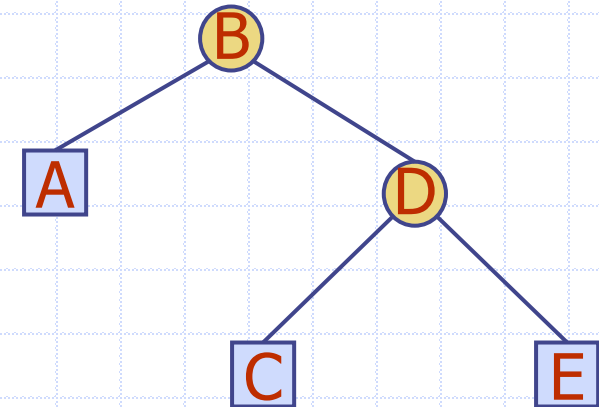
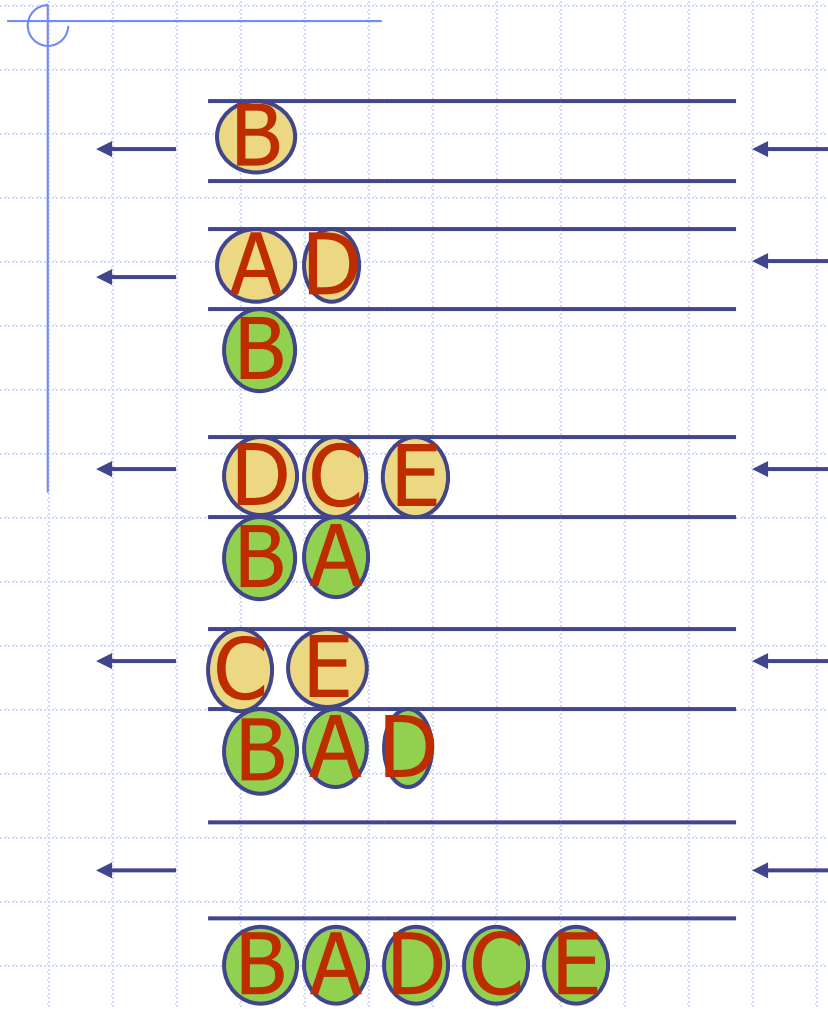
# Breadth-First Tree Traversal Algorithm

- ❑ Visit the root (perform an action)
- ❑ Visit the left child
- ❑ Next, we need to visit the right child,  
But there is no link from A to D!
- ❑ So, for each node, we need to maintain a list of references to children nodes, known as discovered nodes, not visited yet.
- ❑ We can remove the node, then process its children
- ❑ A **queue** is a FIFO data structure and can do that.
  - Just initialize the queue to contain the root.





# Breadth-First Tree Traversal Algorithm



1. visit the node
2. add references to its children (enqueue)
3. remove the node (dequeue)

# Breadth-First Tree Traversal Algorithm

- We use a queue to produce a FIFO (i.e., first-in first-out) semantics for the order in which we visit nodes.
- The overall running time is  $O(n)$ , due to the  $n$  calls to *enqueue* and  $n$  calls to *dequeue*.

**Algorithm** breadthfirst():

Initialize queue  $Q$  to contain root()

while  $Q$  not empty do

$p = Q.dequeue()$

    {  $p$  is the oldest entry in the queue }

    perform the “visit” action for position  $p$

    for each child  $c$  in children( $p$ ) do

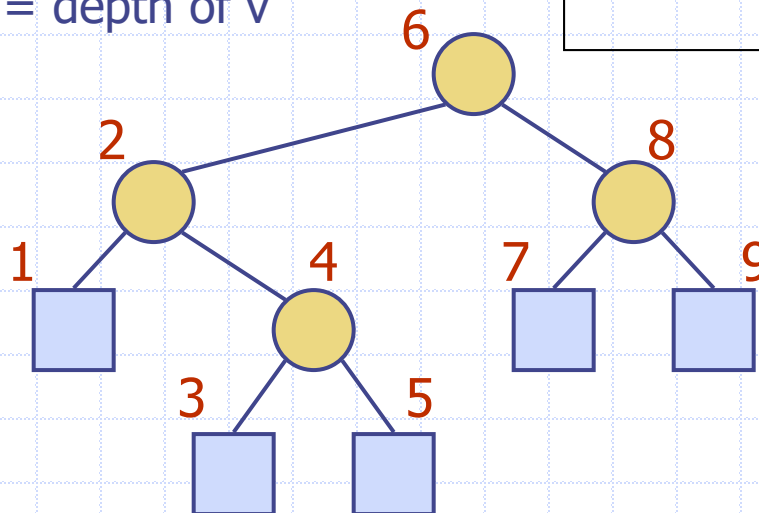
$Q.enqueue(c)$     { add  $p$ ’s children to the end of the queue for later visits }

**Code Fragment 8.14:** Algorithm for performing a breadth-first traversal of a tree.

# Inorder Traversal

- In an **inorder traversal** a node is visited after its left subtree and before its right subtree
- Application: draw a binary tree
  - $x(v)$  = inorder rank of  $v$
  - $y(v)$  = depth of  $v$

```
Algorithm inOrder( $v$ )  
  if  $left(v) \neq \text{null}$   
    inOrder( $left(v)$ )  
  visit( $v$ )  
  if  $right(v) \neq \text{null}$   
    inOrder( $right(v)$ )
```



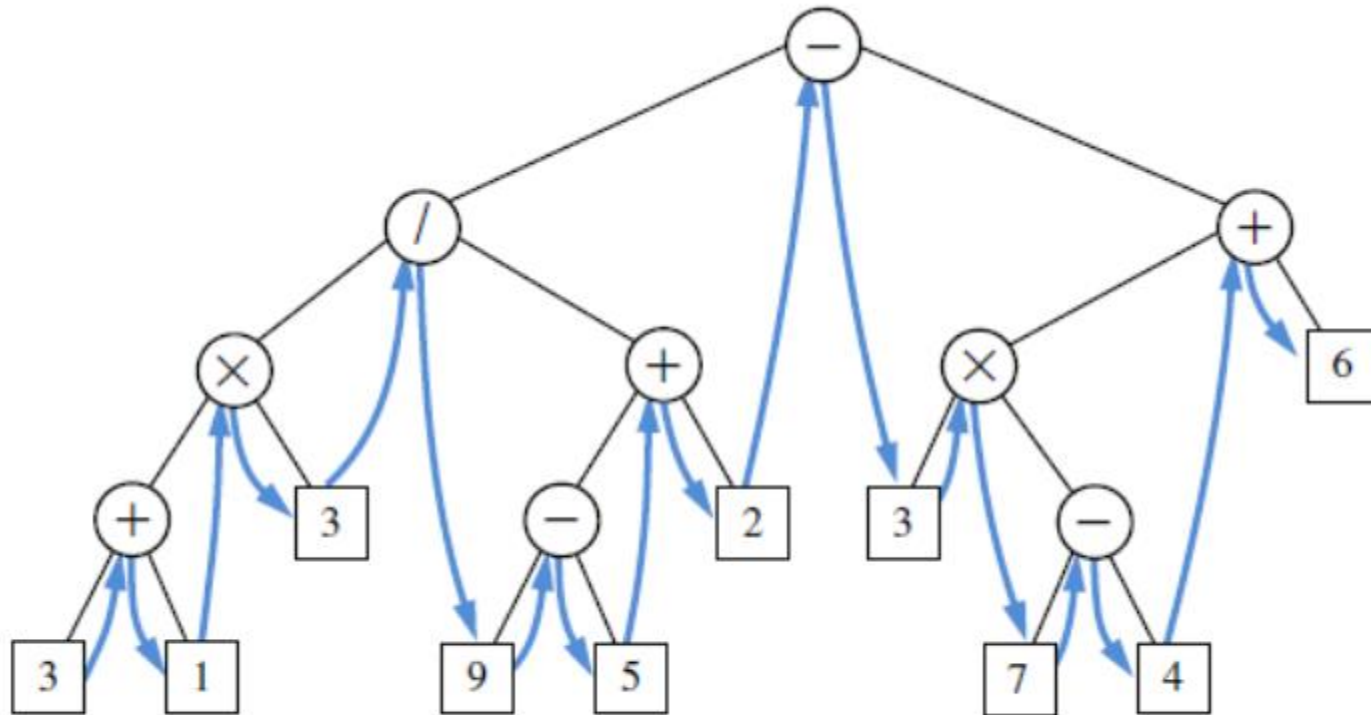
- ```

Algorithm inorder( $p$ ):
    if  $p$  has a left child  $lc$  then
        inorder( $lc$ )                { recursively traverse the left subtree of  $p$  }
    perform the “visit” action for position  $p$ 
    if  $p$  has a right child  $rc$  then
        inorder( $rc$ )                { recursively traverse the right subtree of  $p$  }

```

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# Inorder Traversal of a Binary Tree



**Figure 8.16:** Inorder traversal of a binary tree.

Using a binary tree to represent an arithmetic expression:

$$3 + 1 \times 3 / 9 - 5 + 2 - 3 \times 7 - 4 + 6.$$

# Implementing Tree Traversals in Java - *preorder*

- ❑ `iterator( )`: Returns an iterator for all elements in the tree.
- ❑ `positions( )`: Returns an iterable collection of all positions of the tree.

```
1  /** Adds positions of the subtree rooted at Position p to the given snapshot. */
2  private void preorderSubtree(Position<E> p, List<Position<E>> snapshot) {
3      snapshot.add(p);          // for preorder, we add position p before exploring subtrees
4      for (Position<E> c : children(p))
5          preorderSubtree(c, snapshot);
6  }
```

```
1  /** Returns an iterable collection of positions of the tree, reported in preorder. */
2  public Iterable<Position<E>> preorder() {
3      List<Position<E>> snapshot = new ArrayList<>();
4      if (!isEmpty())
5          preorderSubtree(root(), snapshot);    // fill the snapshot recursively
6      return snapshot;
7  }
```

# Implementing Tree Traversals in Java - *postorder*

```
1  /** Adds positions of the subtree rooted at Position p to the given snapshot. */
2  private void postorderSubtree(Position<E> p, List<Position<E>> snapshot) {
3      for (Position<E> c : children(p))
4          postorderSubtree(c, snapshot);
5      snapshot.add(p);    // for postorder, we add position p after exploring subtrees
6  }
7  /** Returns an iterable collection of positions of the tree, reported in postorder. */
8  public Iterable<Position<E>> postorder() {
9      List<Position<E>> snapshot = new ArrayList<>();
10     if (!isEmpty())
11         postorderSubtree(root(), snapshot);    // fill the snapshot recursively
12     return snapshot;
13 }
```

# Implementing Tree Traversals in Java - *breadthfirst*

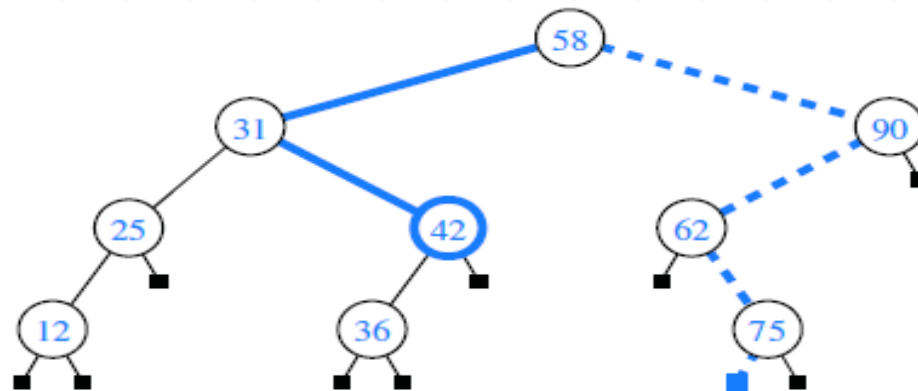
```
1  /** Returns an iterable collection of positions of the tree in breadth-first order. */
2  public Iterable<Position<E>> breadthfirst() {
3      List<Position<E>> snapshot = new ArrayList<>();
4      if (!isEmpty()) {
5          Queue<Position<E>> fringe = new LinkedList<>();
6          fringe.enqueue(root());           // start with the root
7          while (!fringe.isEmpty()) {
8              Position<E> p = fringe.dequeue(); // remove from front of the queue
9              snapshot.add(p);                 // report this position
10             for (Position<E> c : children(p))
11                 fringe.enqueue(c);           // add children to back of queue
12         }
13     }
14     return snapshot;
15 }
```

**Code Fragment 8.21:** An implementation of a breadth-first traversal of a tree. This code should be included within the body of the `AbstractTree` class.



# Binary Search Trees

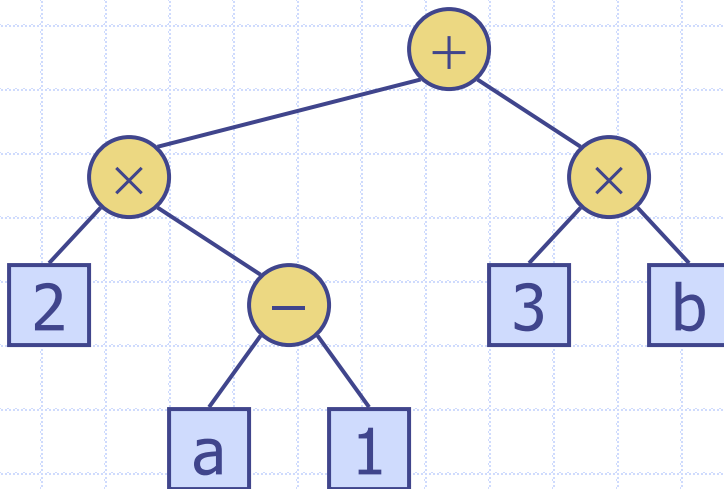
- A binary search tree  $S$  is a proper binary tree  $T$  such that, for each internal position  $p$  of  $T$ :
  - Position  $p$  stores an element of  $S$ , denoted as  $e(p)$ .
  - Elements stored in the left subtree of  $p$  (if any) are less than  $e(p)$ .
  - Elements stored in the right subtree of  $p$  (if any) are greater than  $e(p)$ .



**Figure 8.17:** A binary search tree storing integers. The solid path is traversed when searching (successfully) for 42. The dashed path is traversed when searching (unsuccessfully) for 70.

# Applications of Tree Traversals - Print Arithmetic Expressions

- Specialization of an inorder traversal
  - print operand or operator when visiting node
  - print “(“ before traversing left subtree
  - print “)” after traversing right subtree



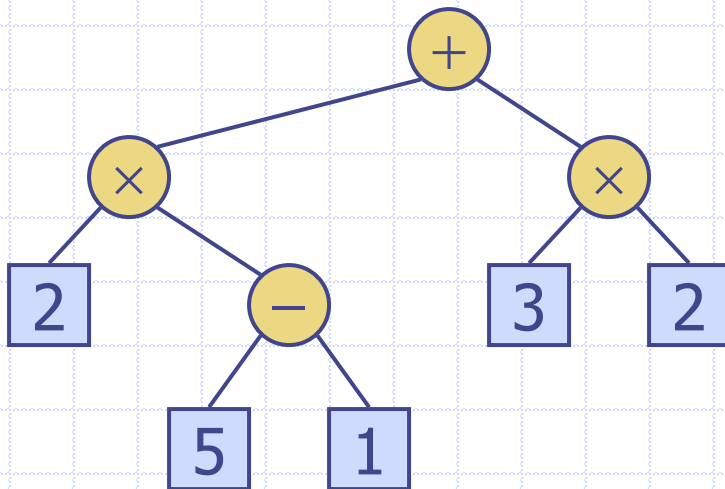
**Algorithm** *printExpression(v)*

```
if left(v) ≠ null
    print("(")
    inOrder(left(v))
    print(v.element())
if right(v) ≠ null
    inOrder(right(v))
    print(")")
```

$((2 \times (a - 1)) + (3 \times b))$

# Applications of Tree Traversals - Evaluate Arithmetic Expressions

- Specialization of a **postorder traversal**
  - recursive method returning the value of a subtree
  - when visiting an internal node, combine the values of the subtrees



**Algorithm** *evalExpr(v)*

if *isExternal* (v)

return *v.element* ()

else

$x \leftarrow evalExpr(left(v))$

$y \leftarrow evalExpr(right(v))$

$\diamond \leftarrow$  operator stored at *v*

return  $x \diamond y$

# Applications of Tree Traversals – Euler Tour Traversal

- ❑ **Generic traversal** of a binary tree
- ❑ Includes special cases: the preorder, postorder and inorder traversals
- ❑ Walk around the tree and visit each node three times:
  - on the left (**preorder**)
  - from below (**inorder**)
  - on the right (**postorder**)

