A light-colored puppy, possibly a French Bulldog, is sitting on a wooden floor. The puppy is looking up and to the left, with its head tilted back and its large, upright ears visible. The background shows a wooden floor and a dark wooden piece of furniture.

CSI2110

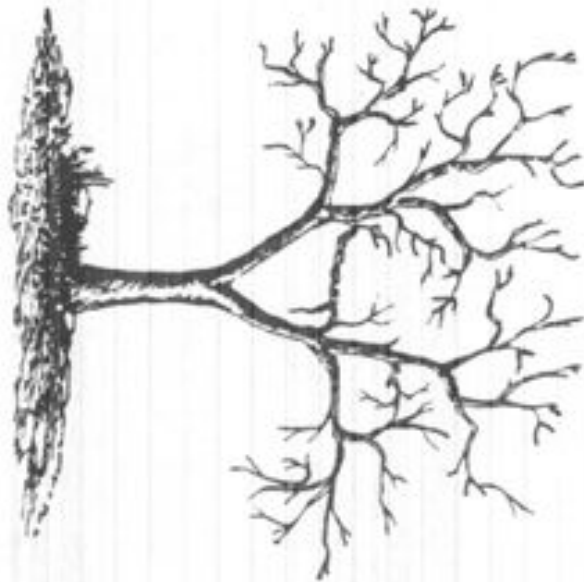
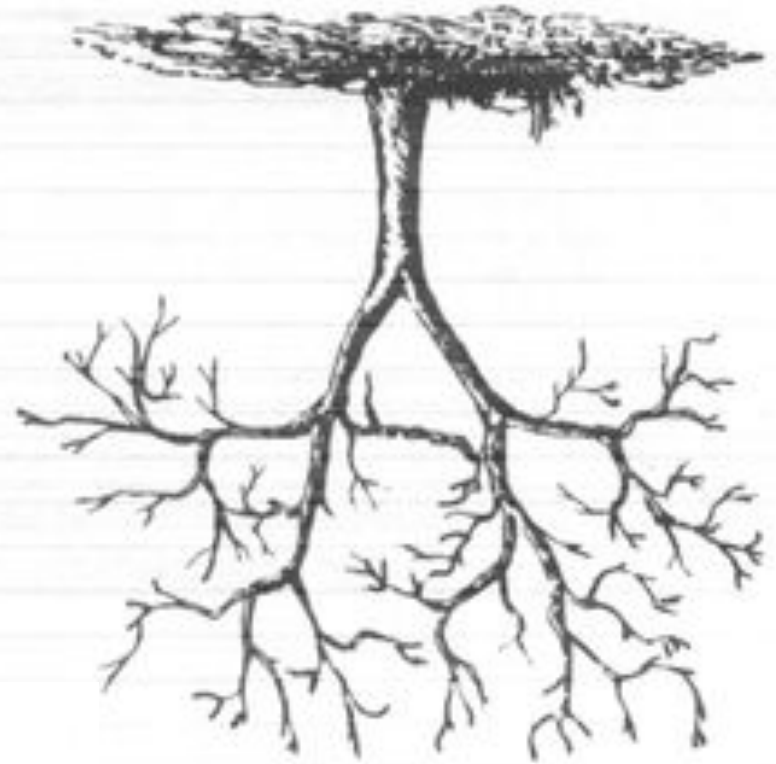
# Data Structures and Algorithms

Prof. WonSook Lee

# Trees

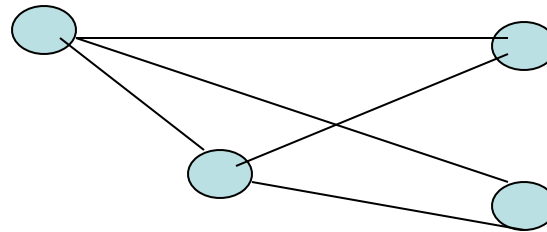
- Trees
- Binary Trees
- Properties of Binary Trees
- Traversals of Trees
- Data Structures for Trees

# a Tree



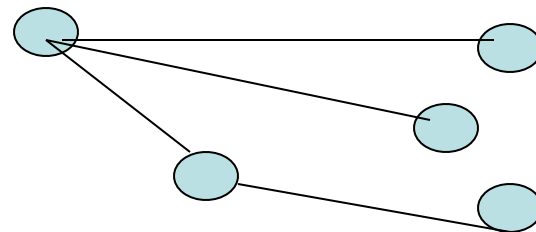
# Trees

A **graph**  $G = (V, E)$  consists of an set  $V$  of VERTICES  
and a set  $E$  of edges, with  $E = \{(u, v): u, v \in V, u \neq v\}$



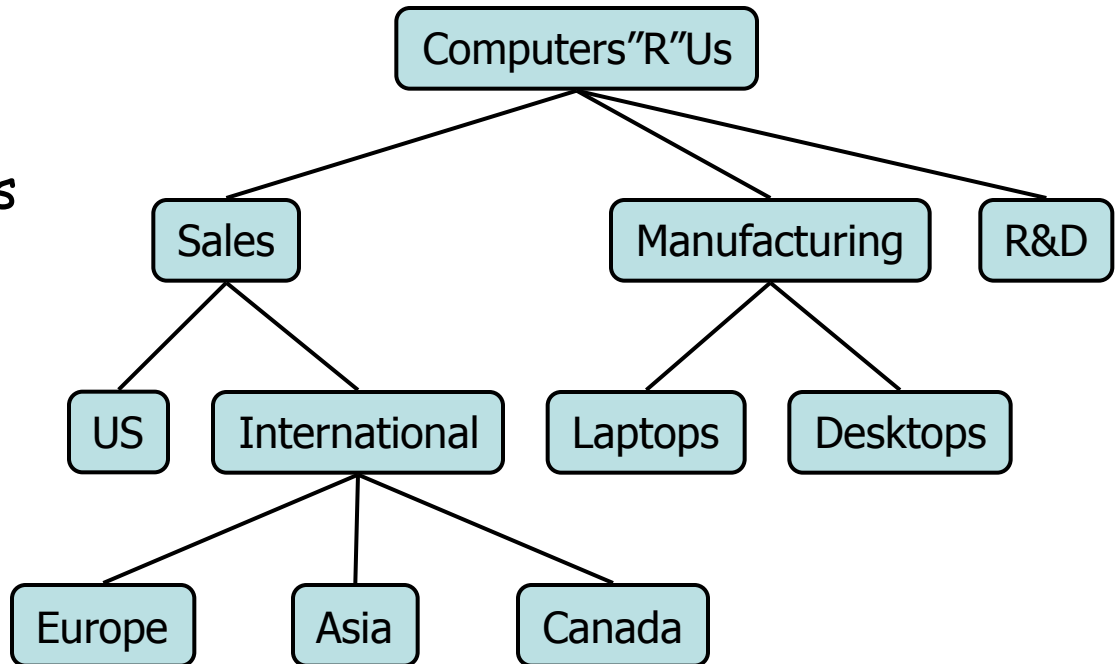
A **tree** is a connected graph with no cycles.

→  $\exists$  a path between each pair of vertices.

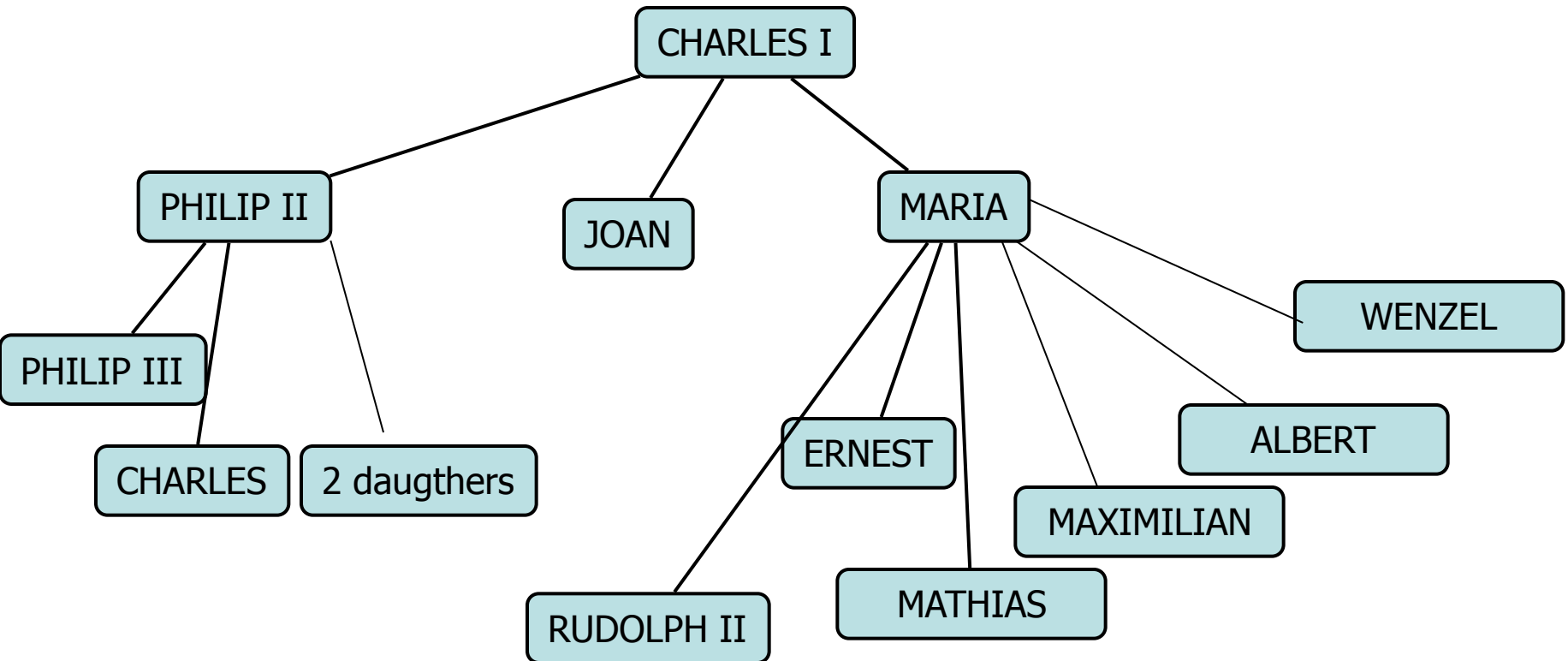


# What is a Tree

- Abstract model of a hierarchical structure
- A tree consists of nodes with a parent-child relation
- Applications:
  - Organization charts
  - File systems
  - Programming environments



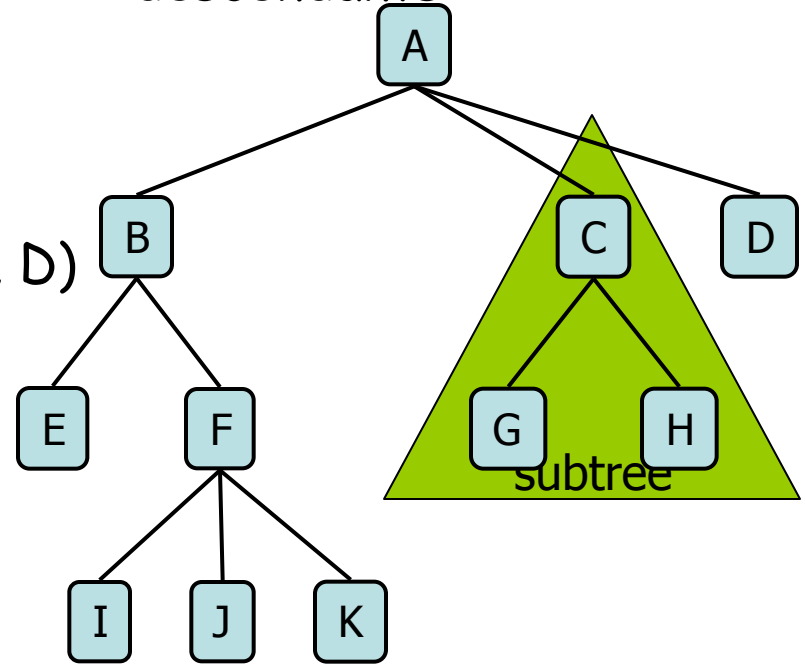
# Example: Genealogical Tree



Hasburg Family

# 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.
- **Subtree**: tree consisting of a node and its descendants
- **Descendant** of a node: child, grandchild, grand-grandchild, etc.

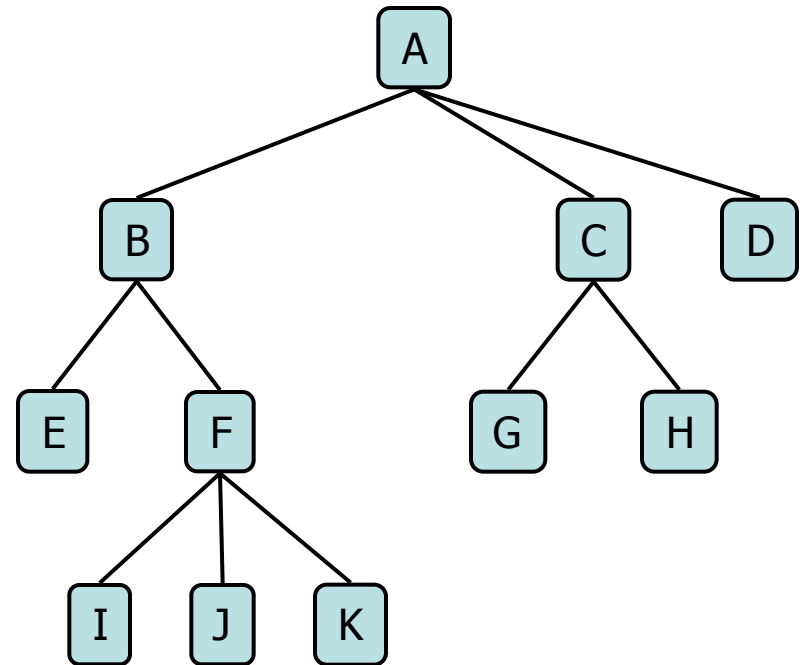


# Tree Terminology

**Distance** between two nodes: number of "edges" between them

• **Depth** of a node: number of ancestors (= distance from the root)

• **Height** of a tree: maximum depth of any node (3)





# ADTs for Trees

- generic container methods
  - `size()`, `isEmpty()`, `elements()`
- positional container methods
  - `positions()`, `swapElements(p,q)`, `replaceElement(p,e)`
- query methods
  - `isRoot(p)`, `isInternal(p)`, `isExternal(p)`
- accessor methods
  - `root()`, `parent(p)`, `children(p)`
- update methods
  - application specific

# Computing the depth of a node

If  $v$  is the root the depth is 0

If  $v$  is an internal node the depth is  $1 +$  the depth of its parent

**Algorithm**  $\text{depth}(T, v)$

if  $T.\text{isRoot}(v)$  then

    return 0

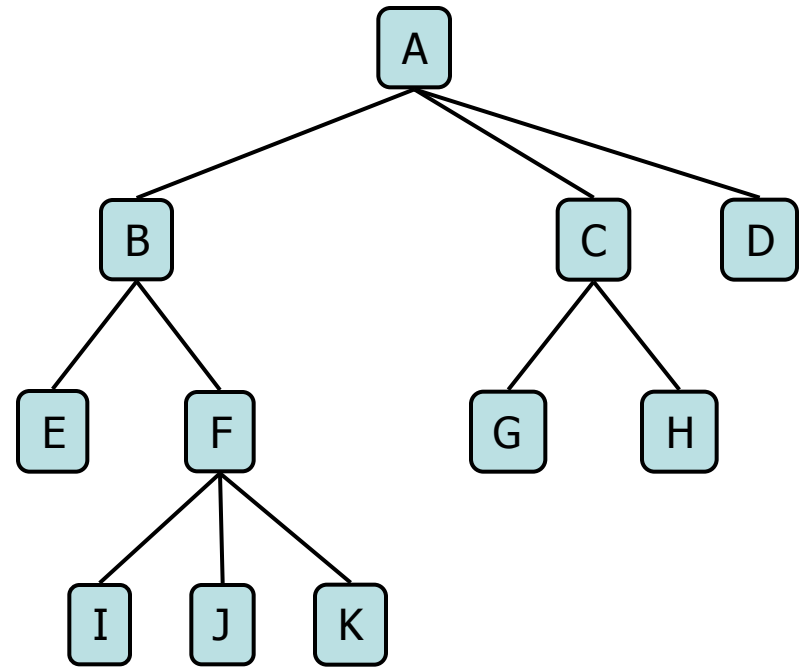
else

    return  $1 + \text{depth}(T, T.\text{parent}(v))$

Complexity ?

**Now, Traversing a tree!**

**How to visit all the nodes in a tree?**

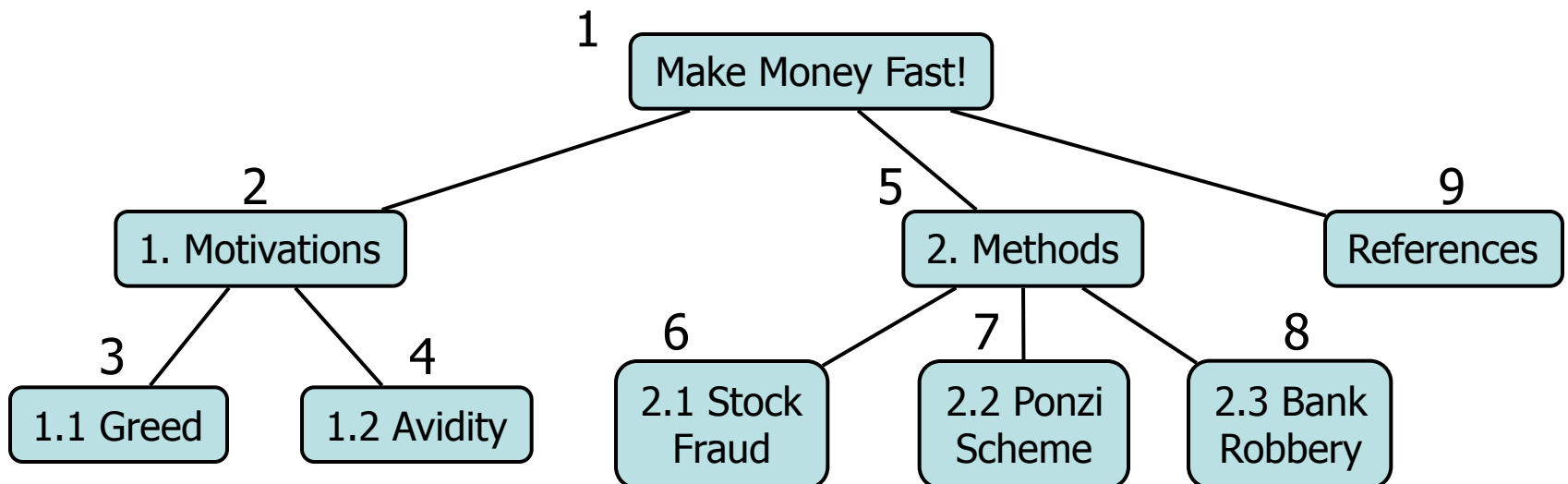


# Traversing Trees

## 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

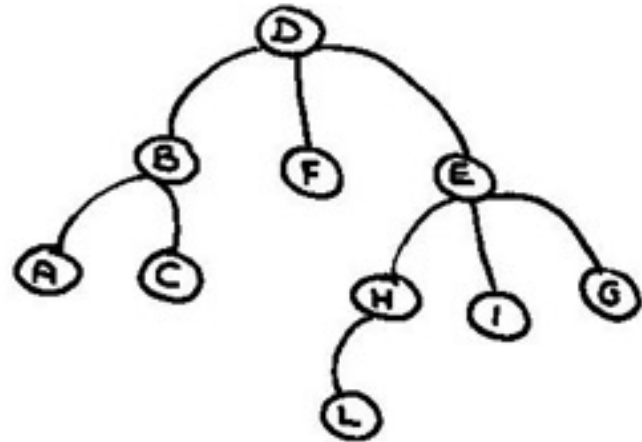
```
Algorithm preOrder(v)
    visit(v)
    for each child w of v
        preorder (w)
```



# Traversing Trees

## Preorder Traversal

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



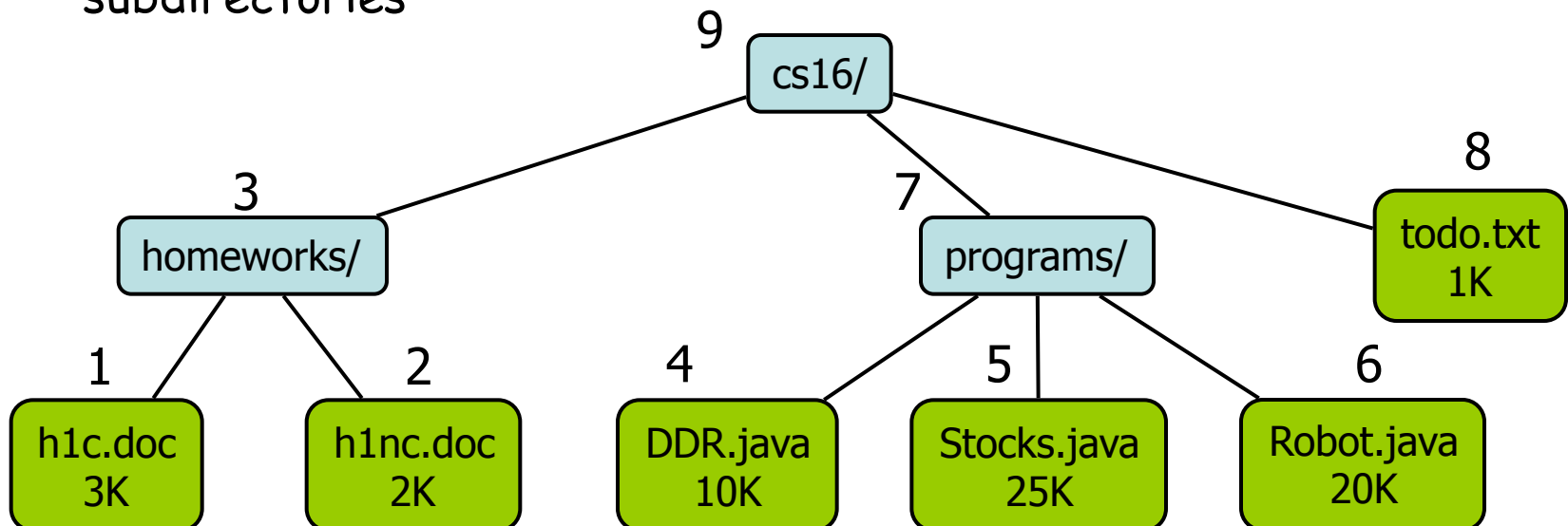
D B A C F E H L I G

# Traversing Trees

## 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)
```

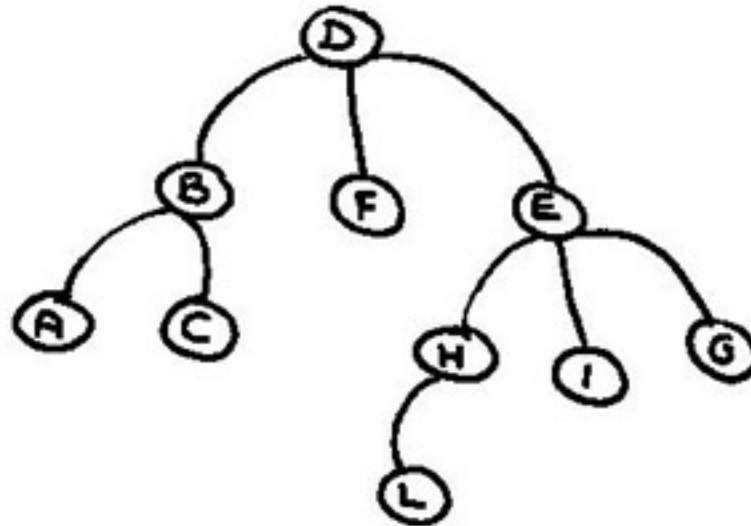


# Traversing Trees

## Postorder Traversal

**Algorithm** `postOrder(v)`  
  **for each** child `w` of `v` **do**  
    recursively perform `postOrder(w)`  
  “visit” node `v`

A C B F L H I G E D



# Traversing Trees

**Inorder** Traversal of a tree (Depth-first)

Let  $d(x)$  be the number  
of sub-trees of node  $x$ .

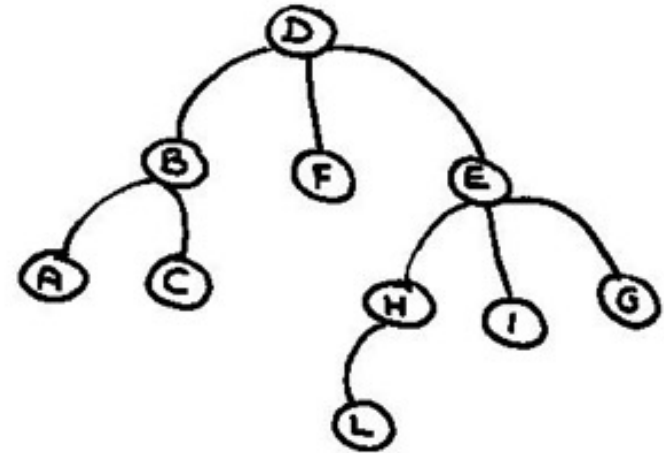
Start:  $x = \text{root}$

IN-ORDER VISIT

1. Visit the first sub-tree (inorder)
2. Visit the root
3. Visit the second sub-tree (inorder)

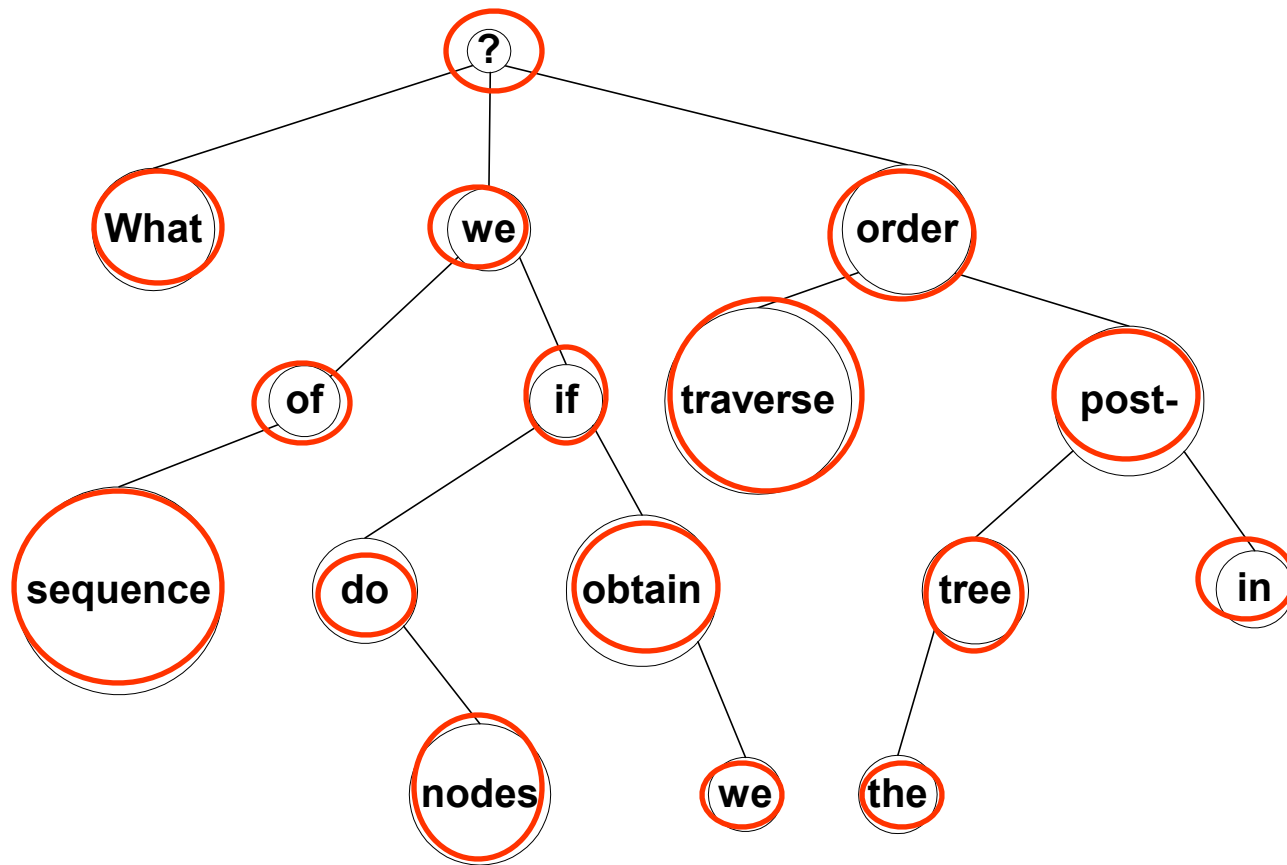
? ?

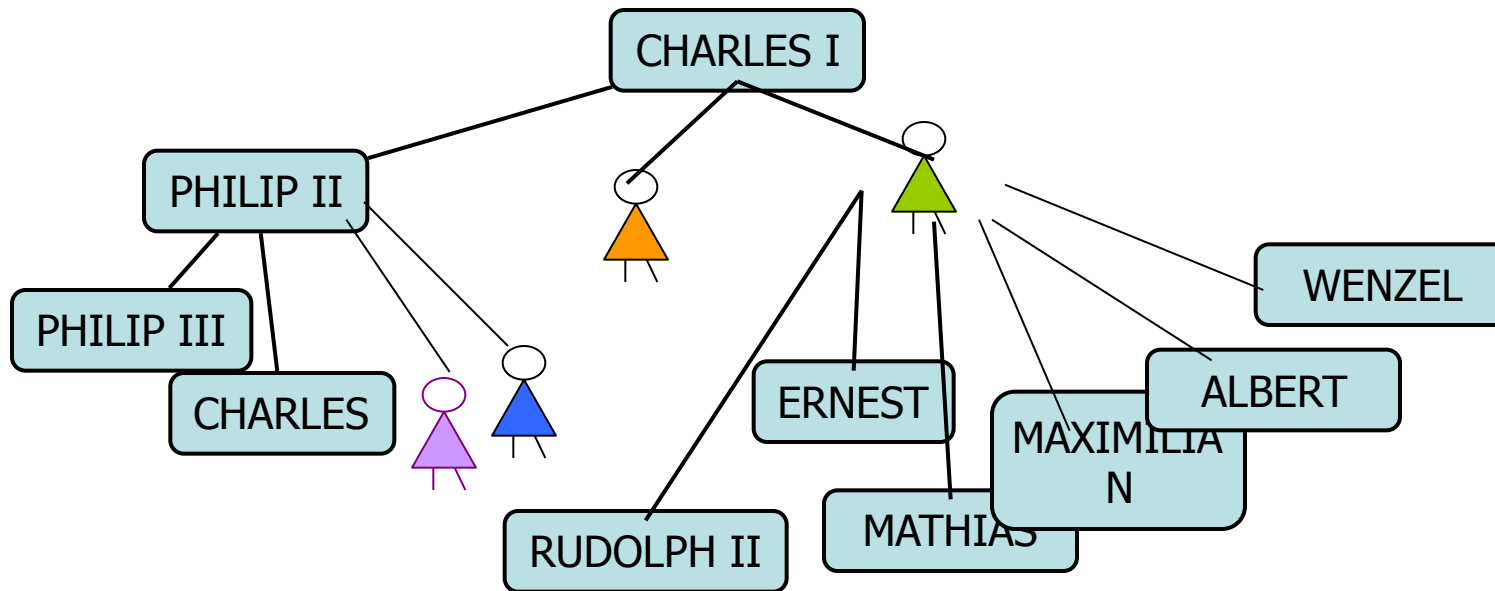
$d(x)+1$ . Visit the  $d(x)^{\text{th}}$  sub-tree (inorder)



A B C D F L H E I G



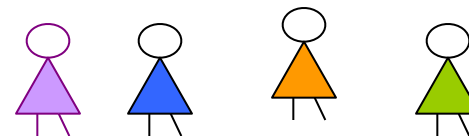




Charles I,  
 Philip II,  
 When Charles dies, Philip II becomes King.  
 If Philip II dies as well ....

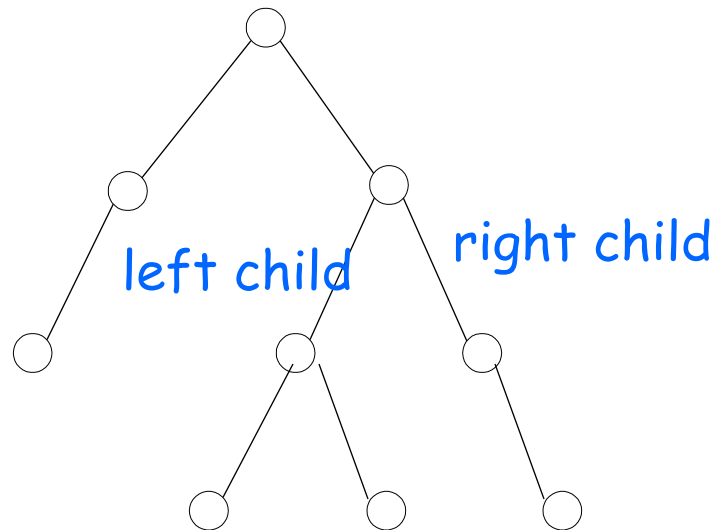
Philip III,

Charles,



Rudolph II, Ernest, Mathias, Max, Albert, Wenzel,

# Binary Trees



Children are ordered

Each node has at most two children:

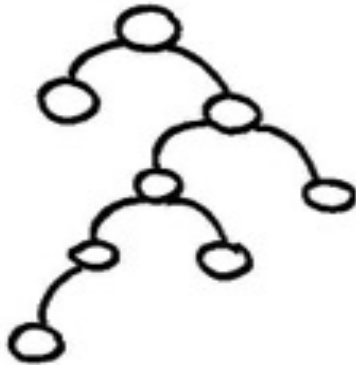
[0, 1, or 2]

# "Full" Binary Trees (or "Proper")

Each node:

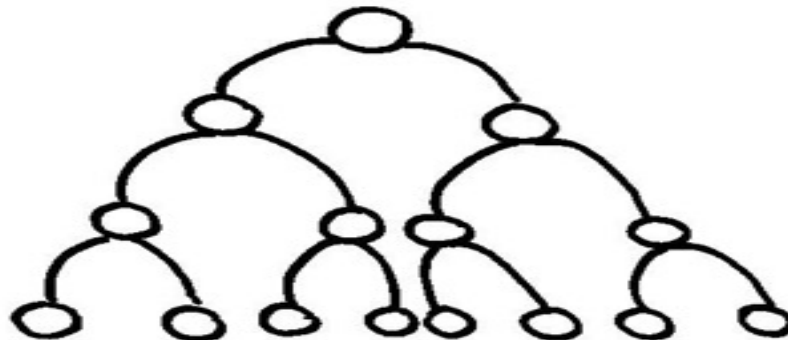


is a leaf, or  
has two children



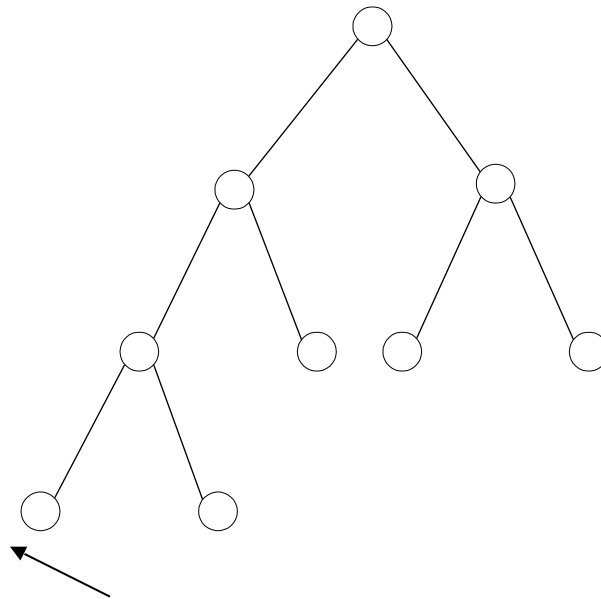
Perfect Binary Trees

Full binary trees with all leaves at the same level:

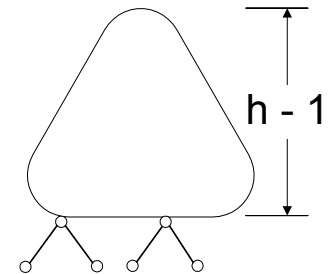


# Complete Binary Trees

of depth  $h$  = Perfect trees of depth  $(h-1)$   
+  
one or more leaves at level  $h$ .



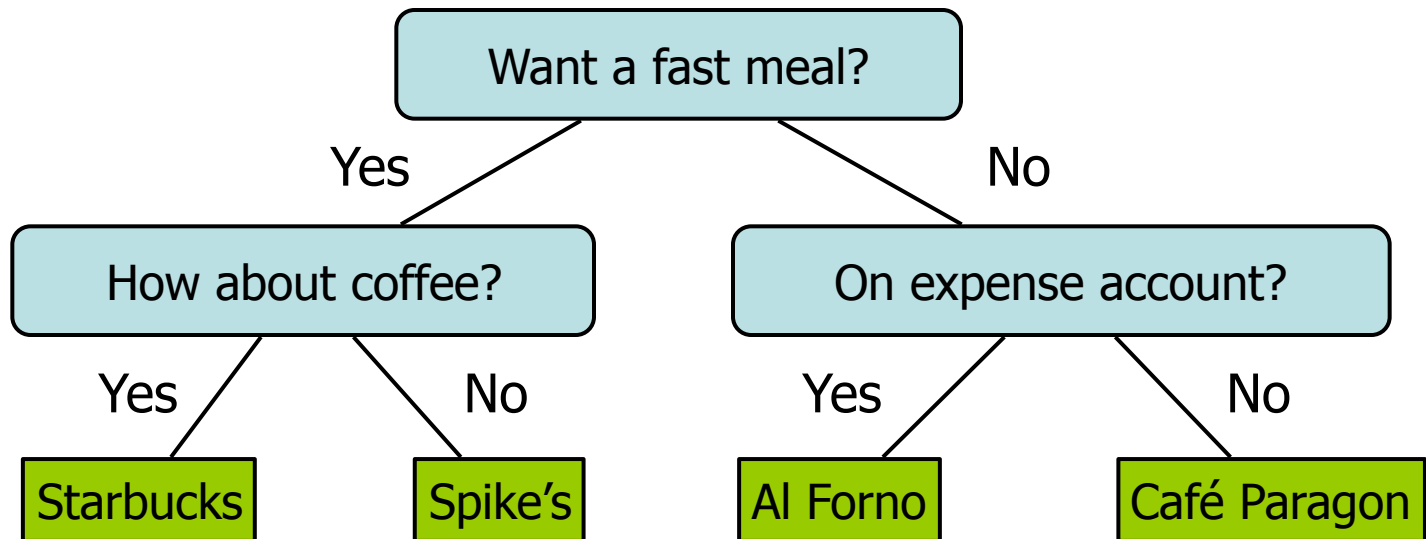
Leaves go at the left



# Examples of Binary Trees

## Decision Tree

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

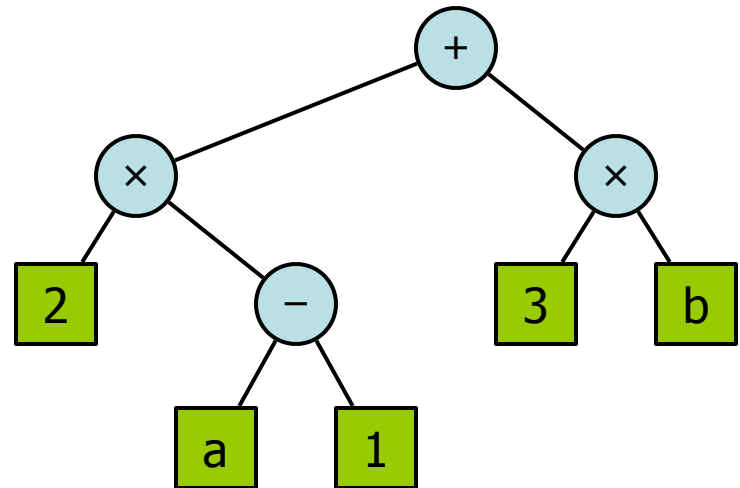


# Examples of Binary Trees

## Arithmetic Expression Tree

- Binary tree associated with an arithmetic expression
  - internal nodes: operators
  - external nodes: operands

Example: arithmetic expression  
tree for the expression  
 $(2 \times (a - 1) + (3 \times b))$



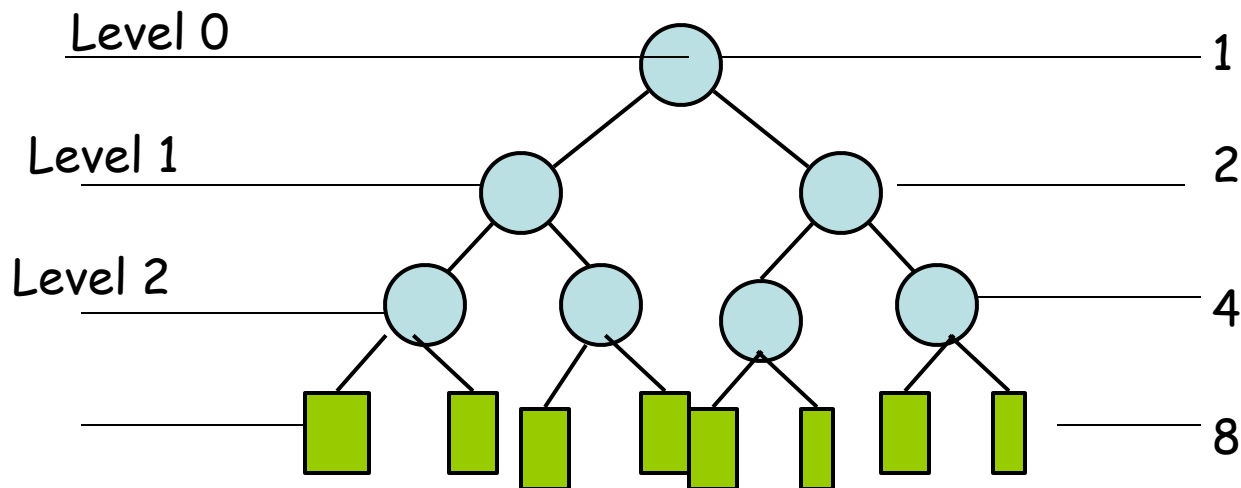
# Properties of Binary Trees

- Notation

$n$     # of nodes     $e$     # of leaves

$i$     # of internal nodes     $h$     height

Maximum number of  
nodes at each level ?



level  $i$  -----  $2^i$  24



# Properties of Full Binary Trees

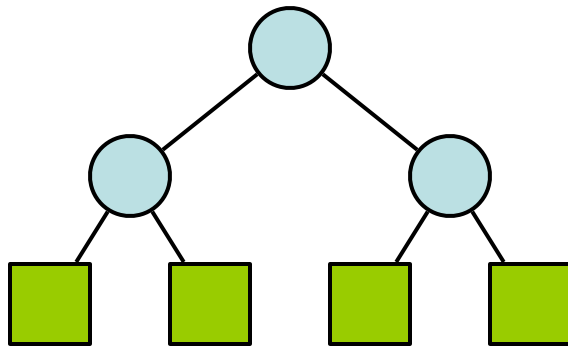
- Notation

$n$  number of nodes

$e$  number of leaves

$i$  number of  
internal nodes

$h$  height



- Properties:

- $e = i + 1$

- $n = 2e - 1$

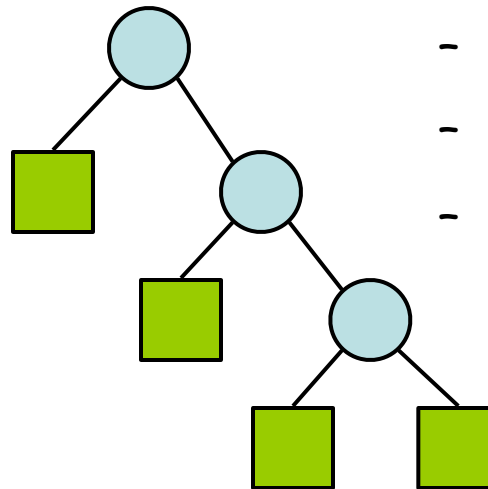
- $h \leq i$

- $h \leq (n - 1)/2$

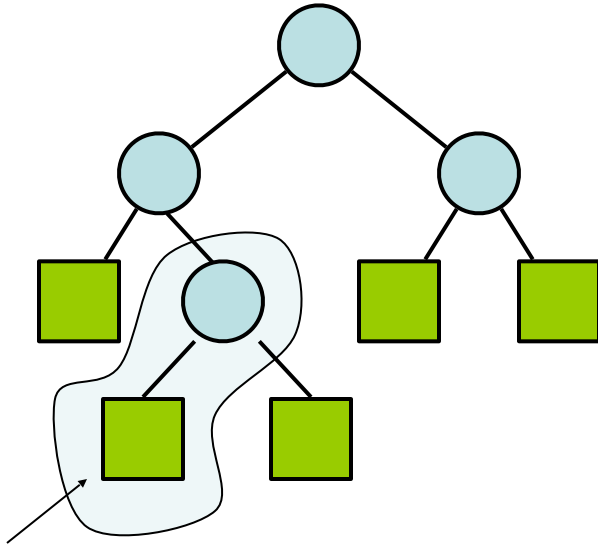
- $e \leq 2^h$

- $h \geq \log_2 e$

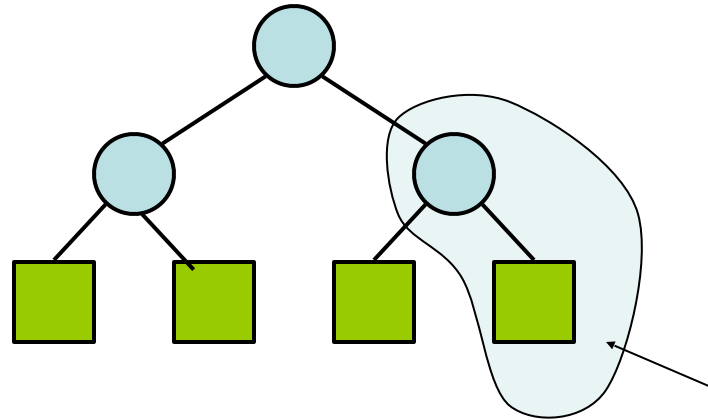
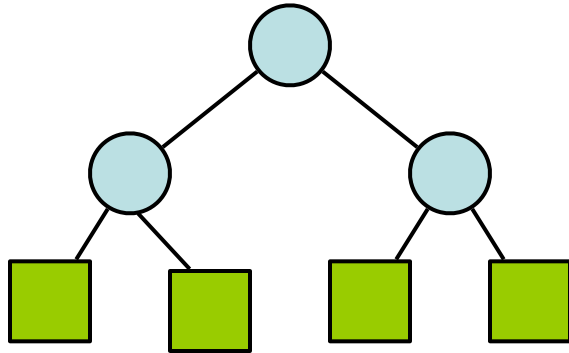
- $h \geq \log_2 (n + 1) - 1$



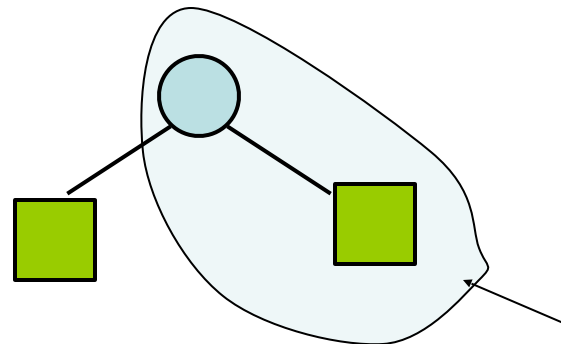
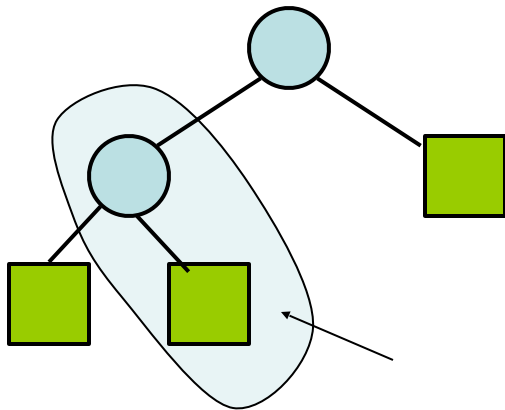
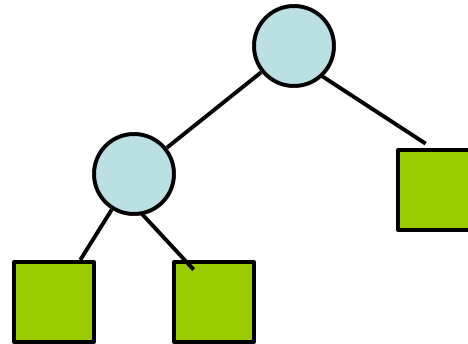
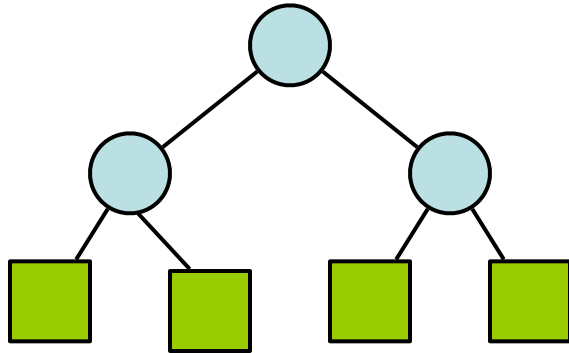
$$e = i + 1$$



$$e = i + 1$$



$$e = i + 1$$



$$n = 2e - 1$$

$$n = i + e$$

$$e = i + 1 \text{ (just proved)}$$

$$i = e - 1$$

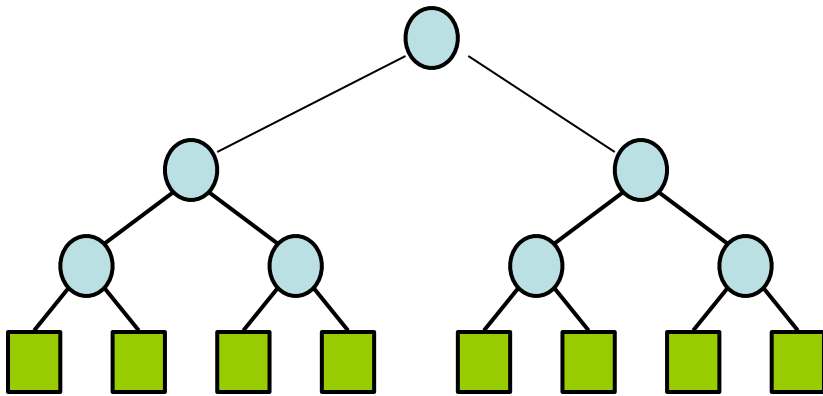
$$n = 2e - 1$$

$$h \leq i$$

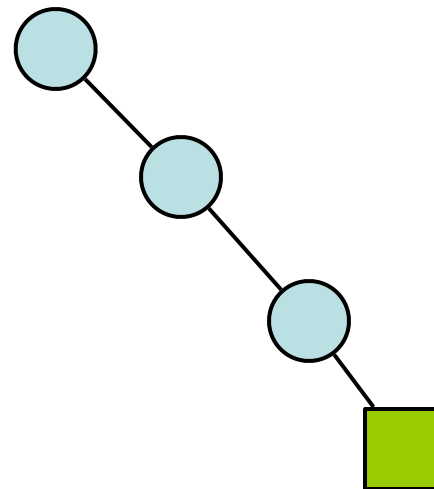
( $h$  = max num of ancestors)

There must be at least one internal node for each level  
(except the last)!

Ex:  $h=3, i=7$



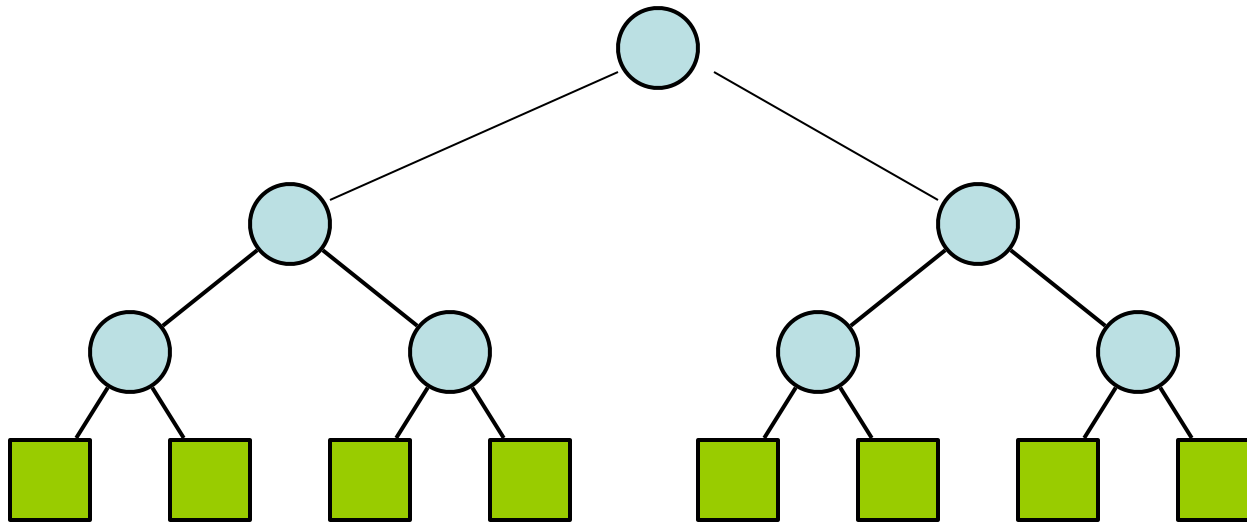
Ex:  $h=3, i=3$



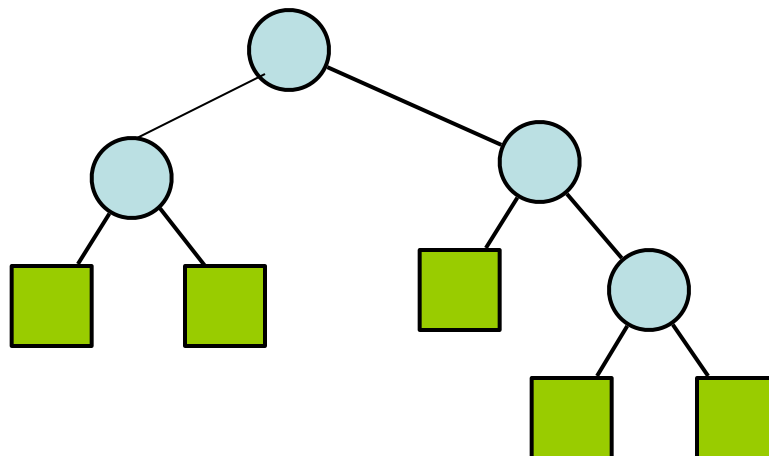
$$e \leq 2^h$$

level  $i$  ----- max num of nodes is  $2^i$

$h = 3$



$2^3$  leaves  
if all at last  
level  $h$



otherwise less

Since  $e \leq 2^h$

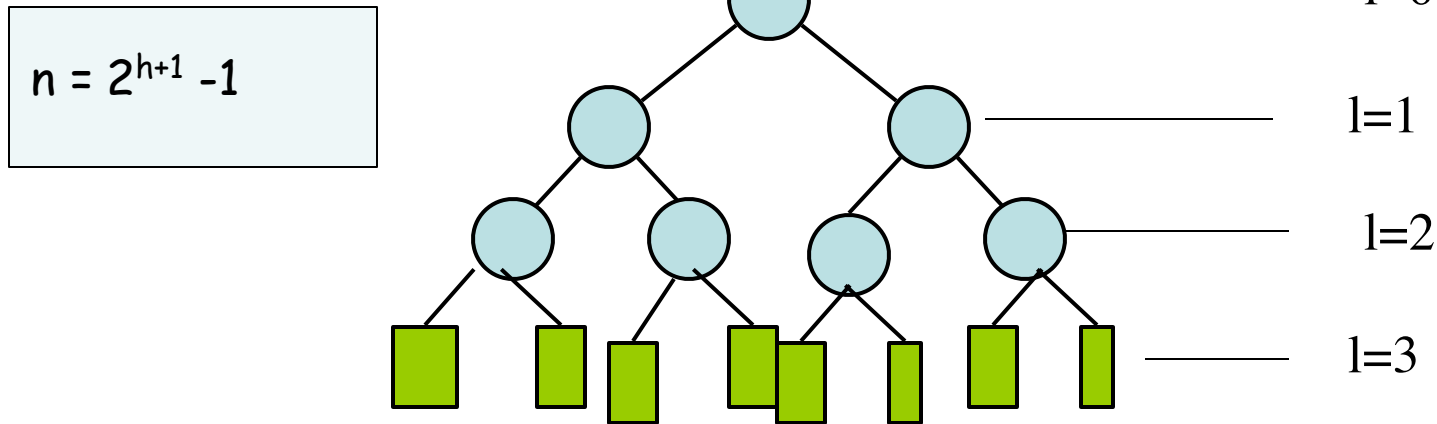
$$\log_2 e \leq \log_2 2^h$$

$$\log_2 e \leq h$$

$$h \geq \log_2 e$$



In Perfect Binary Trees...  
with height  $h$  there are  $2^{h+1} - 1$  nodes



At each level there are  $2^l$  nodes, so the tree has:

$$\sum_{l=0}^h 2^l = 1 + 2 + 4 + \dots + 2^h = 2^{h+1} - 1$$

As a consequence:

In **Binary trees**:

obviously  $n \leq 2^{h+1} - 1$

$$n \leq 2^{h+1} - 1$$

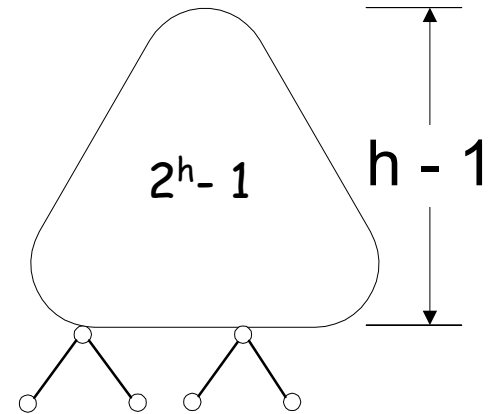
$$n+1 \leq 2^{h+1}$$

$$\log(n+1) \leq h+1$$

$$h \geq \log(n+1) - 1$$

# In Complete Binary Trees ...

with height  $h$        $2^h \leq n \leq 2^{h+1} - 1$



From previous observation:  $n \leq 2^{h+1} - 1$

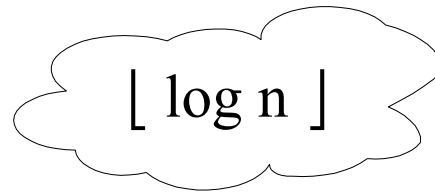
A complete binary tree is a perfect binary tree of height  $h-1$  plus some more leaves ...

$$n \geq 2^h$$

$$n \geq 2^h$$

It follows that:

Height of a complete binary tree with  
n nodes:


$$\lfloor \log n \rfloor$$

# ADTs for Binary Trees

- accessor methods
  - leftChild(p), rightChild(p), sibling(p)
- update methods
  - expandExternal(p), removeAboveExternal(p)

other application specific methods

# Traversing Binary Trees

Pre-, post-, in- (order)

- Refer to the place of the parent relative to the children
- **pre** is before: parent, child, child
- **post** is after: child, child, parent
- **in** is in between: child, parent, child

# Traversing Binary Trees

Preorder, Postorder,

**Algorithm preOrder(T,v)**

visit(v)

if v is internal:

preOrder (T,T.LeftChild(v))

preOrder (T,T.RightChild(v))

**Algorithm postOrder(T,v)**

if v is internal:

postOrder (T,T.LeftChild(v))

postOrder(T,T.RightChild(v))

visit(v)

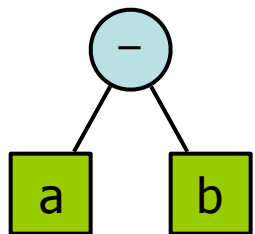
# Traversing Binary Trees

Inorder  
(Depth-first)

```
Algorithm inOrder(T,v)
    if v is internal:
        inOrder (T,T.LeftChild(v))
    visit(v)
    if v is internal:
        inOrder(T,T.RightChild(v))
```



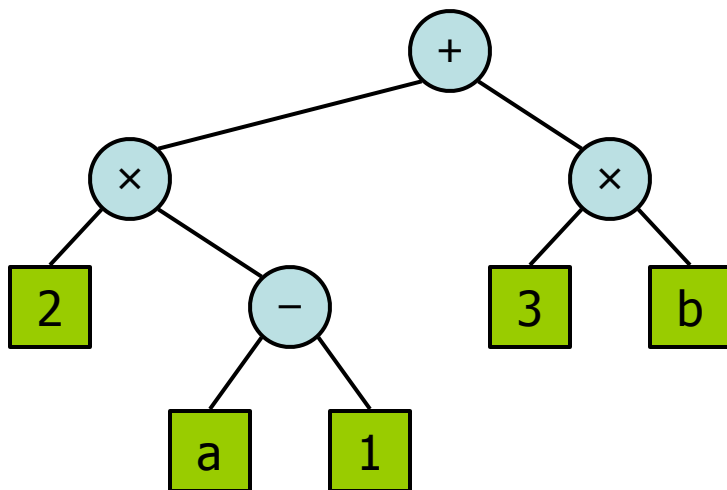
# Arithmetic Expressions



Inorder:  $a - b$

Postorder:  $a b -$

Preorder:  $- a b$



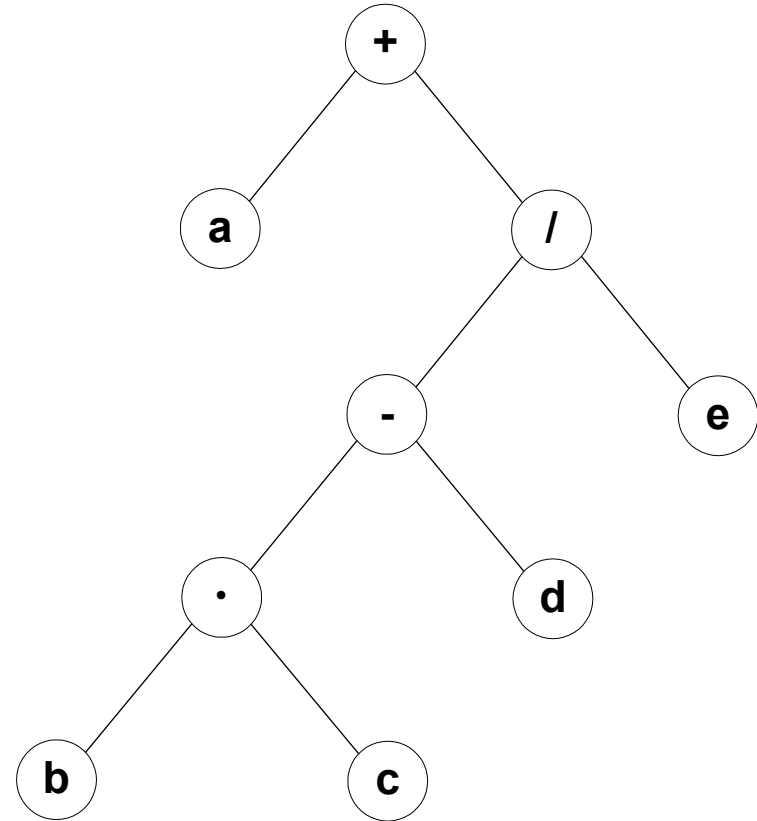
Inorder:

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

Postorder:

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

$$a + (b \cdot c - d) / e$$



PRE-ORDER:

$+ a / - \cdot b c d e$

POST-ORDER:

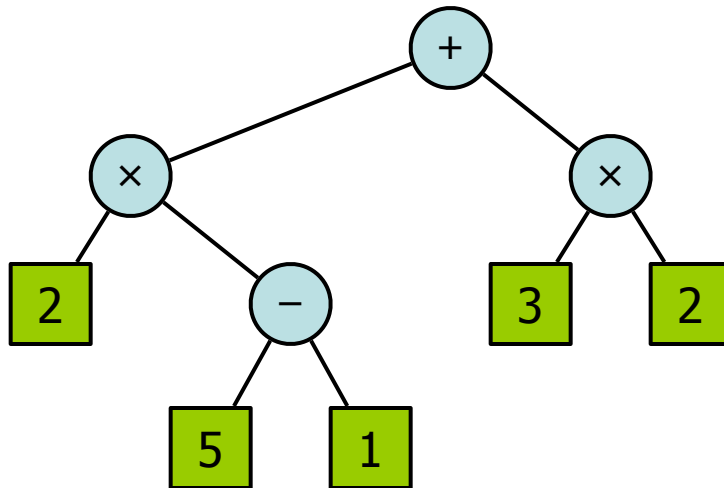
$a b c \cdot d - e / +$

IN-ORDER:

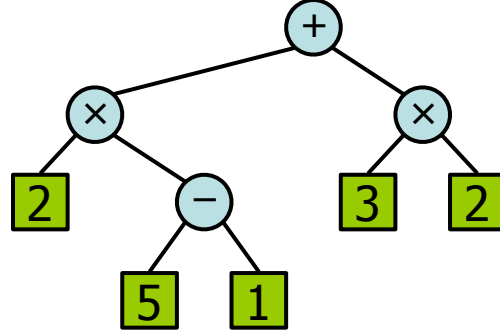
$a + b \cdot c - d / e$

# Evaluate Arithmetic Expressions

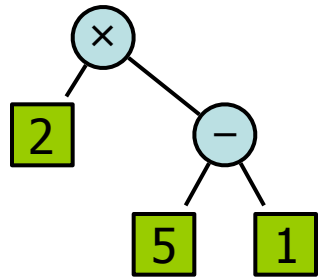
- Specialization of a **postorder** traversal
  - recursive method returning the value of a subtree
  - when visiting an internal node, combine the values of the subtrees



```
Algorithm evalExpr(v)
  if isExternal (v)
    return v.element ()
  else
    x ← evalExpr(leftChild (v))
    y ← evalExpr(rightChild (v))
    ◇ ← operator stored at v
    return x ◇ y
```

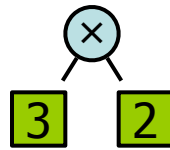


Eval



+

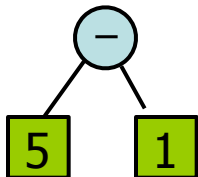
Eval



Eval

2

x



Eval

-

5

1

Eval

3

x

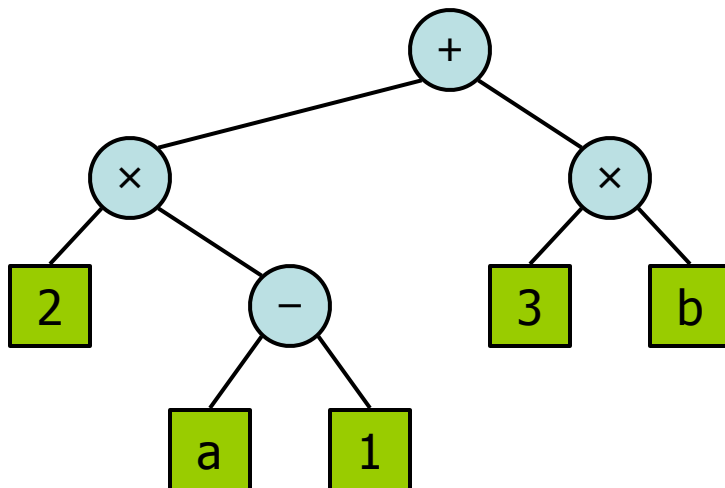
Eval

2

# 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 isInternal (v)
    print("(")
    inOrder (leftChild (v))
    print(v.element ())
  if isInternal (v)
    inOrder (rightChild (v))
    print (")")
```



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

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

## Algorithm preOrderTraversalwithStack(T)

Stack S

TreeNode N

S.push(T) // push the reference to T in the empty stack

While (not S.empty())

    N = S.pop()

    if (N != null) {

        print(N.elem)           // print information

        S.push(N.rightChild) // push the reference to  
  the right child

        S.push(N.leftChild) // push the reference to  
  the left child

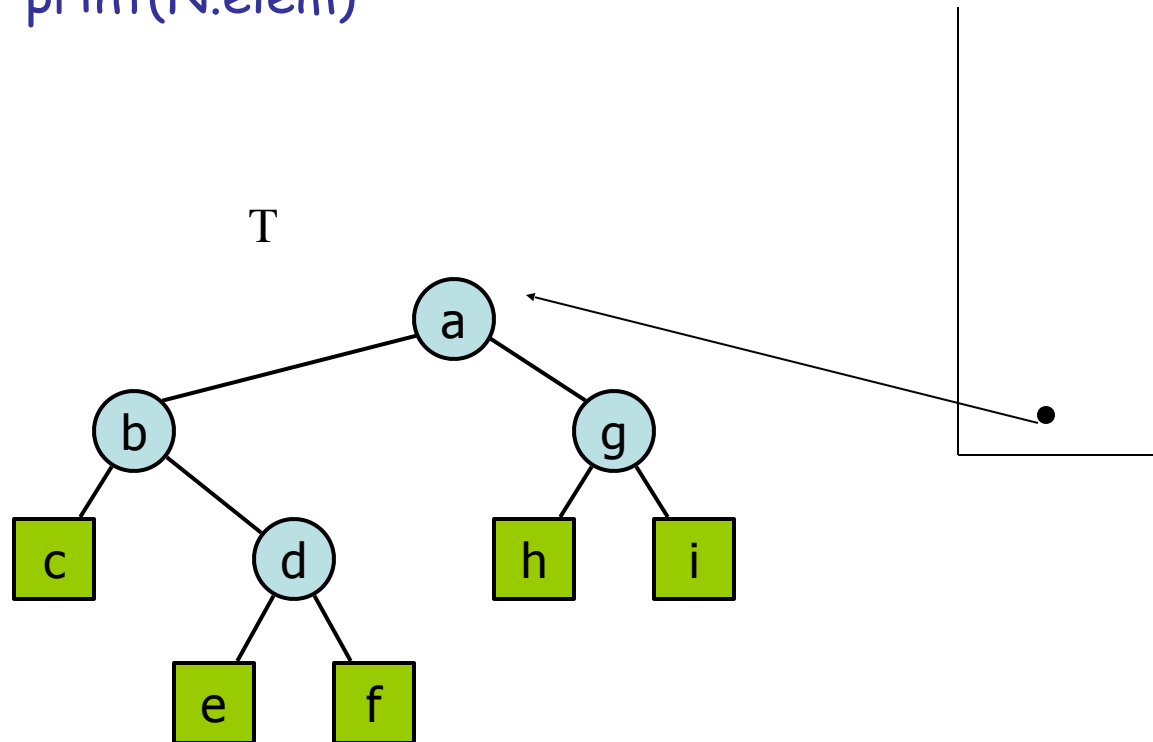
    }

## Algorithm preOrderTraversalwithStack(T)

`S.push(T)` // push the reference to T in the empty stack

`N = S.pop()`

`print(N.elem)`

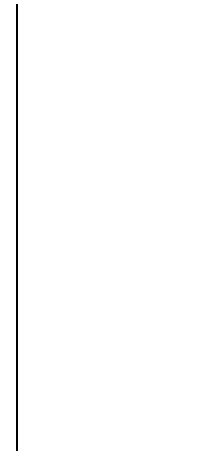
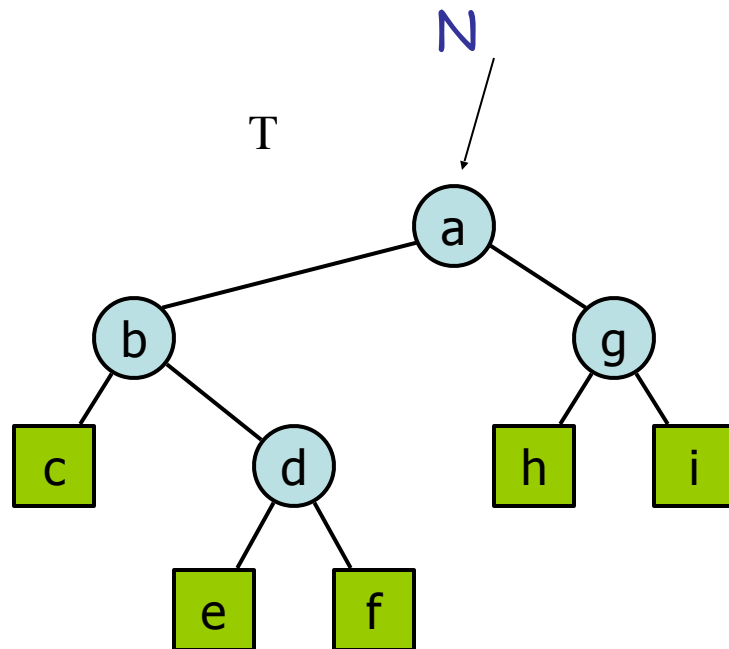


## Algorithm preOrderTraversalwithStack(T)

`S.push(T)` // push the reference to T in the empty stack

`N = S.pop()`

`print(N.elem)`



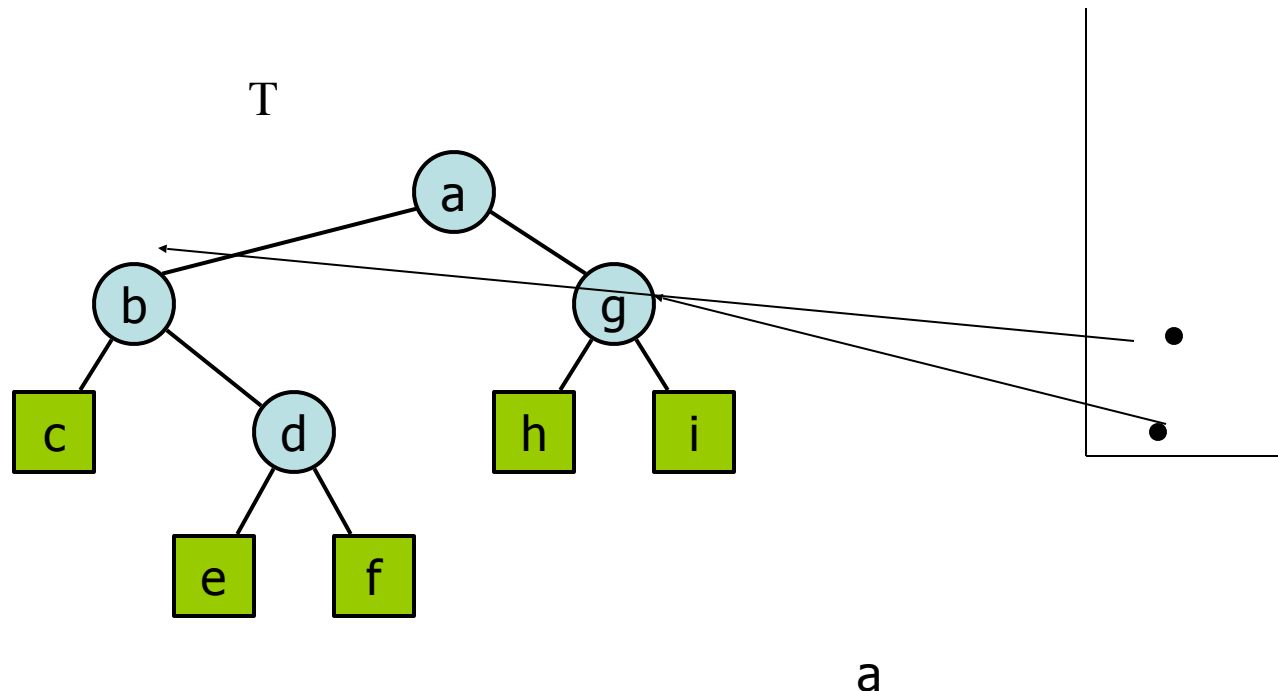
a



## Algorithm preOrderTraversalwithStack(T)

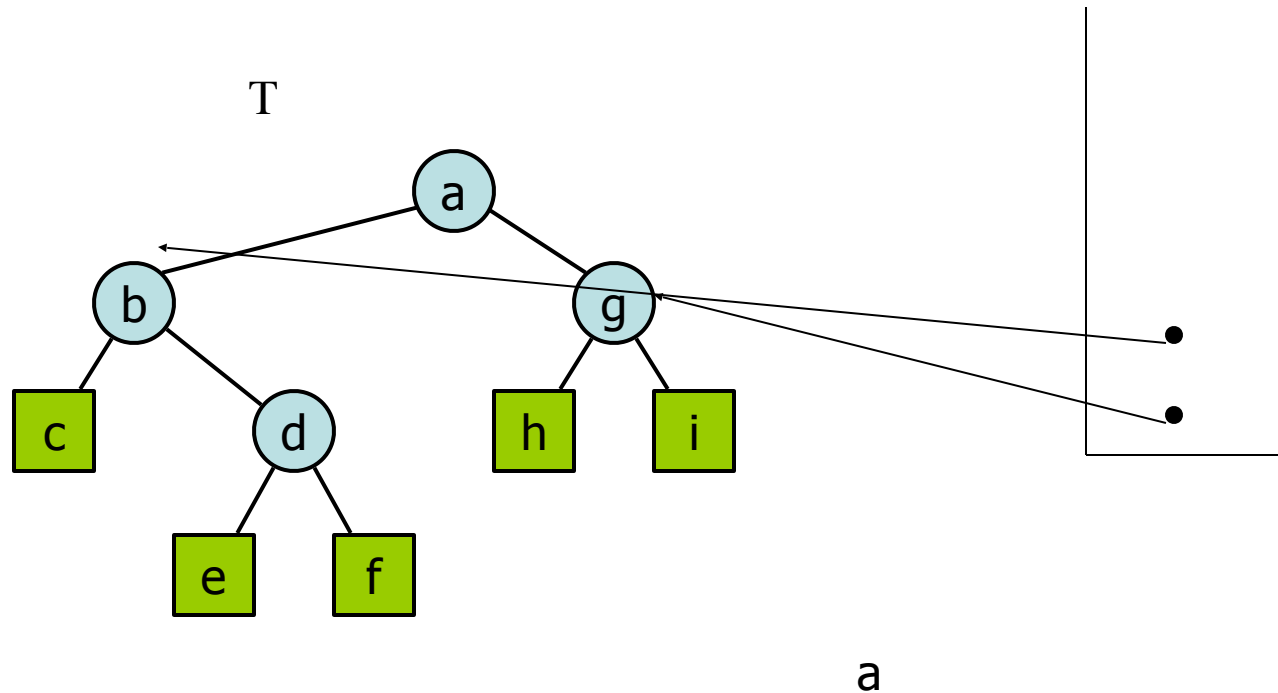
`S.push(N.rightChild)` // push the reference to  
the right child

`S.push(N.leftChild)` // push the reference to  
the left child



## Algorithm preOrderTraversalwithStack(T)

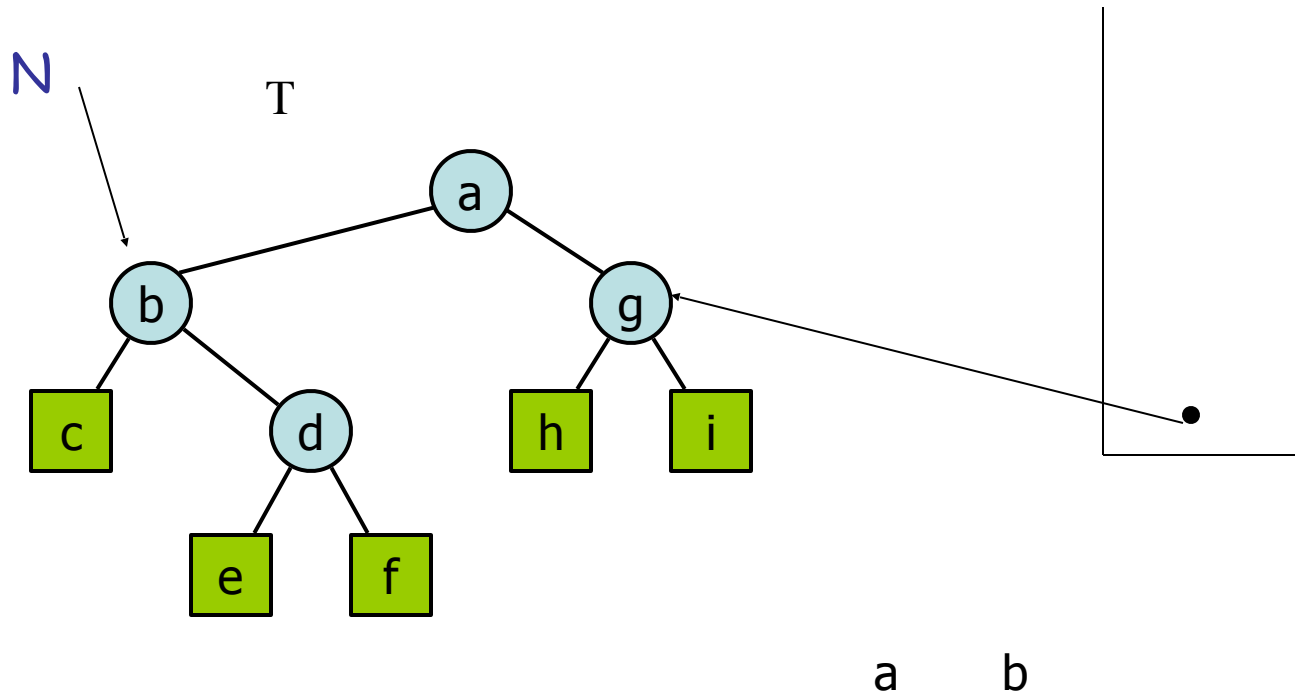
$N = S.pop()$



## Algorithm preOrderTraversalwithStack(T)

`N = S.pop()`

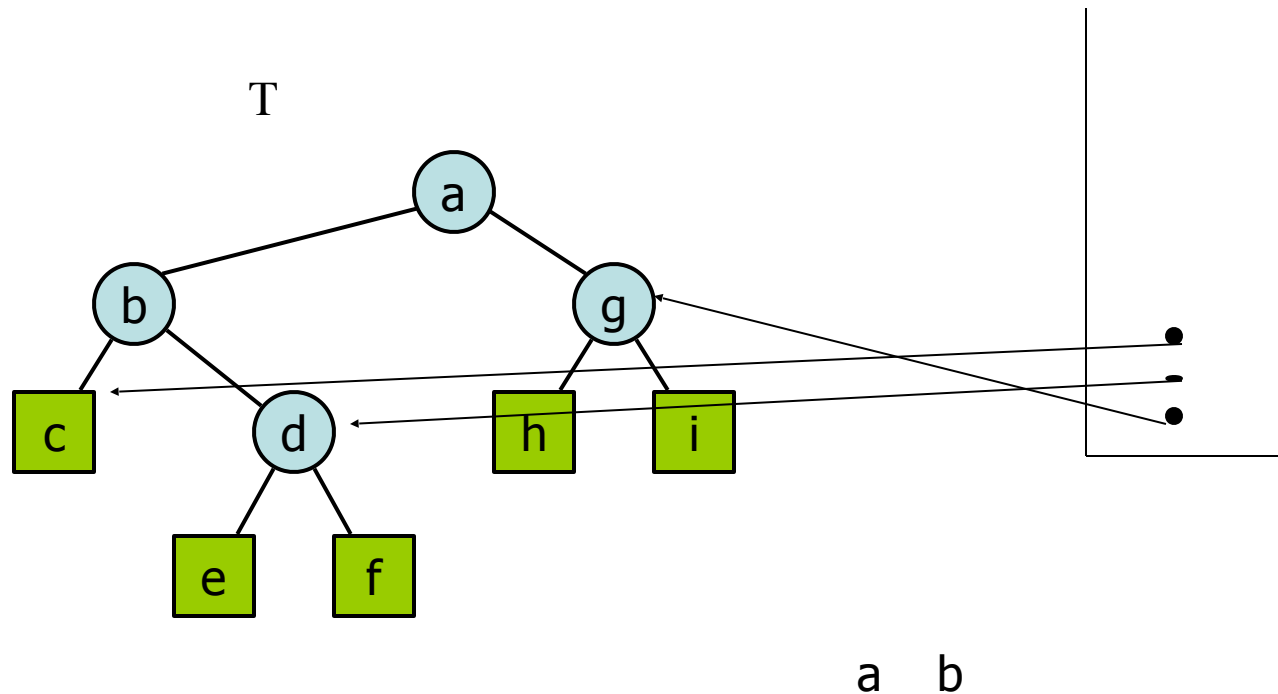
`print(N.elem)`




## Algorithm preOrderTraversalwithStack(T)

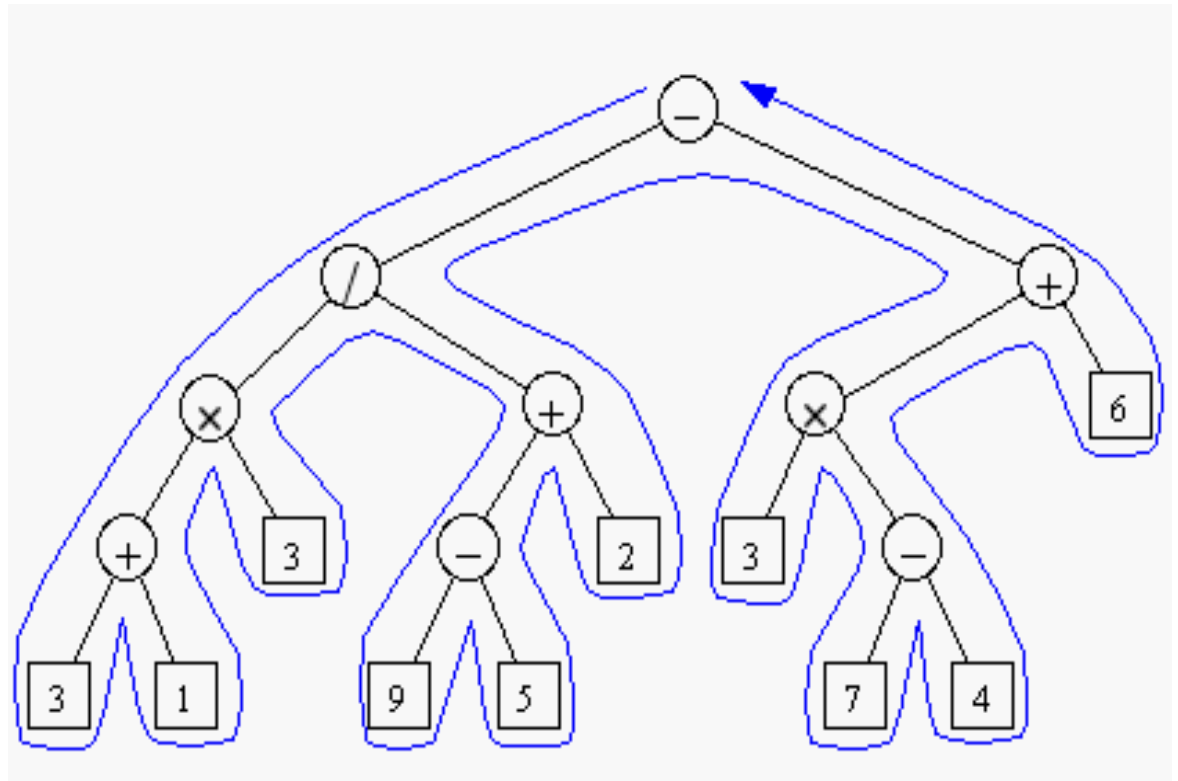
S.push(N.rightChild)

S.push(N.leftChild)



# Euler Tour Traversal

- generic traversal of a binary tree
  - the preorder, inorder, and postorder traversals are special cases of the Euler tour traversal
  - “walk around” the tree and visit each node three times:
    - on the left
    - from below
    - on the right
- 
- A diagram showing a single node of a binary tree, represented by a circle with a horizontal line through its center. Three blue arrows point towards the node: one from the left, one from the bottom, and one from the right, illustrating the three visits required for an Euler tour traversal.



Algorithm eulerTour(T,v)

visit v (from the left)

if v is internal:

eulerTour (T,T.LeftChild(v))

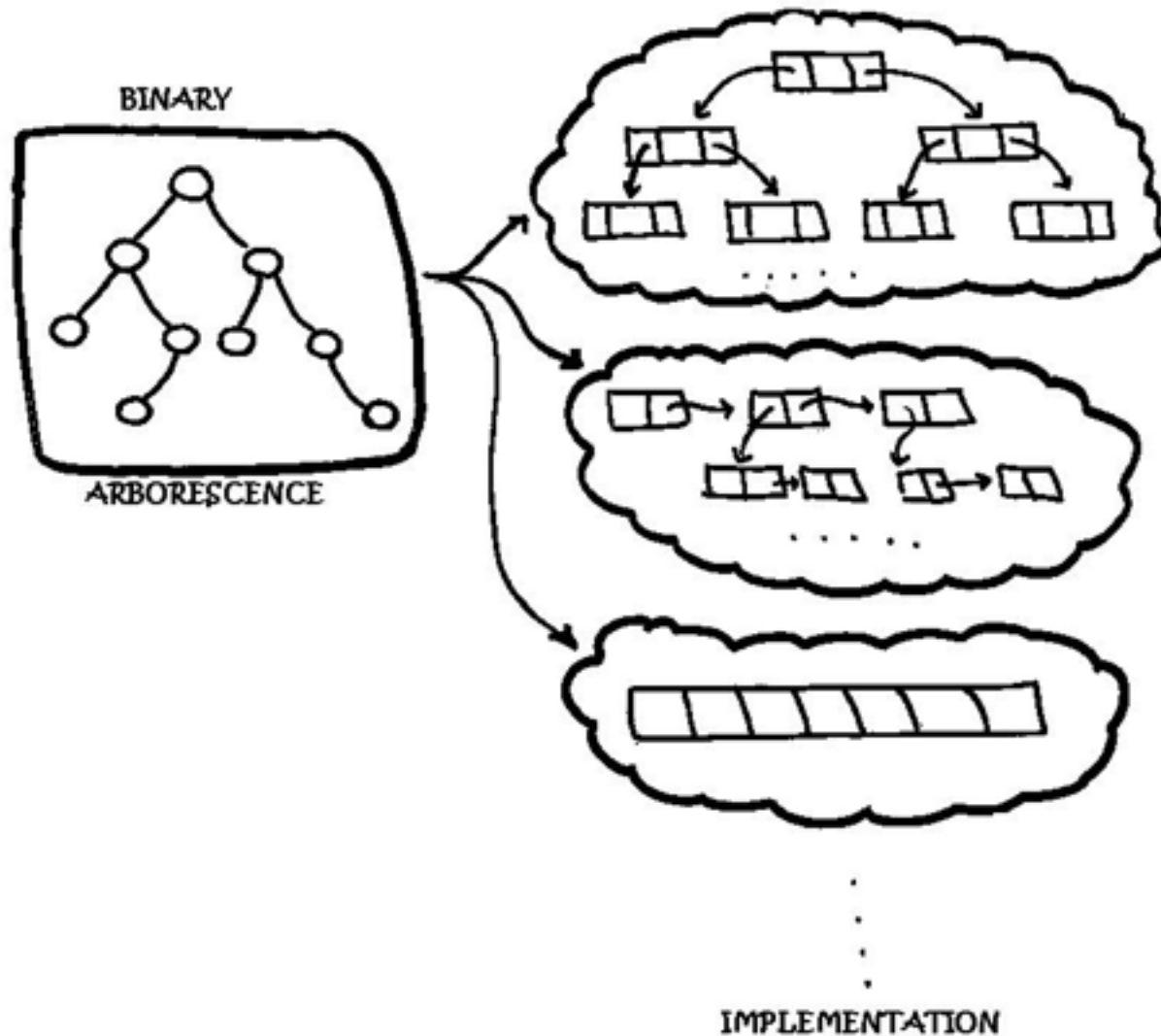
visit v (from below)

if v is internal:

eulerTour(T,T.RightChild(v))

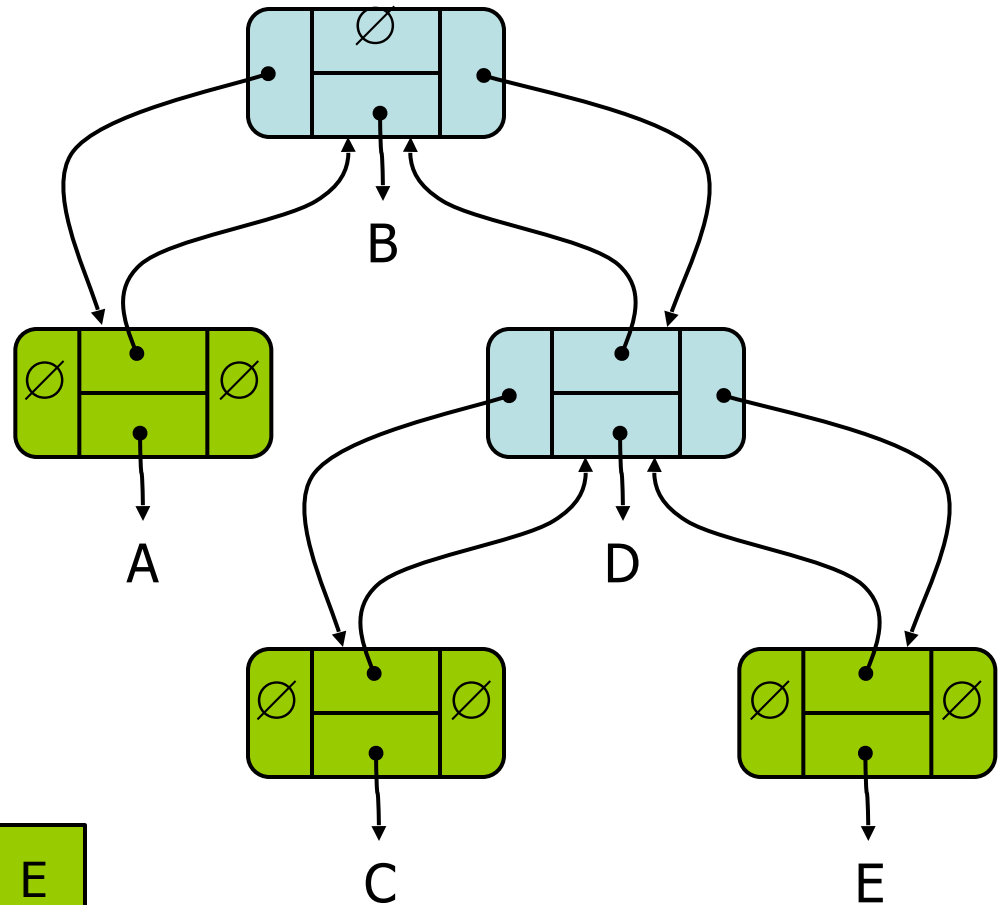
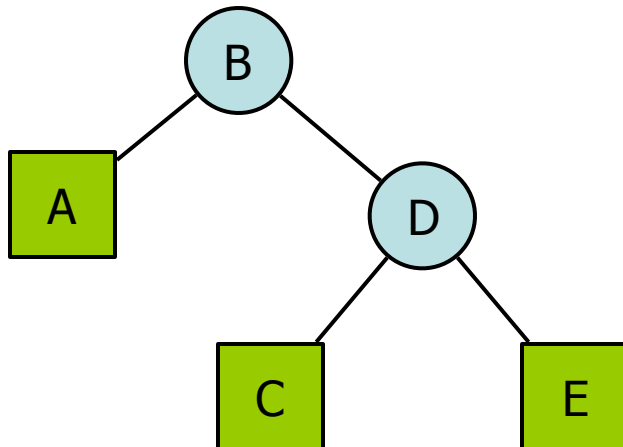
visit v (from the right)

# Implementations of Binary trees....



## Implementing Binary Trees with a Linked Structure

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





leftChild(p), rightChild(p), sibling(p):

Input: Position    Output: Position

swapElements(p,q)    Input: 2 Positions    Output: None

replaceElement(p,e)    Input: Position and an object    Output: Object

isRoot(p)    Input: Position    Output: Boolean

isInternal(p)    Input: Position    Output: Boolean

isExternal(p)    Input: Position    Output: Boolean

BTNode

Object Element

BTNode left, right, parent

`leftChild(v)` return v.left

`rightChild(v)` return v.right

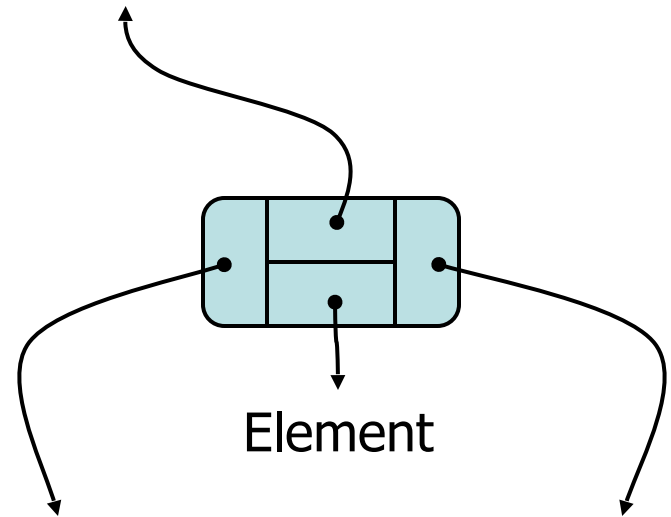
`sibling(v)`

$p \leftarrow \text{parent}(v)$

$q \leftarrow \text{leftChild}(p)$

    if ( $v = q$ ) return `rightChild(p)`

    else return  $q$



replaceElement(v,obj)

temp ← v.element

v.element ← obj

return temp

swapElements(v,w)

temp ← w.element

w.element ← v.element

v.element ← temp

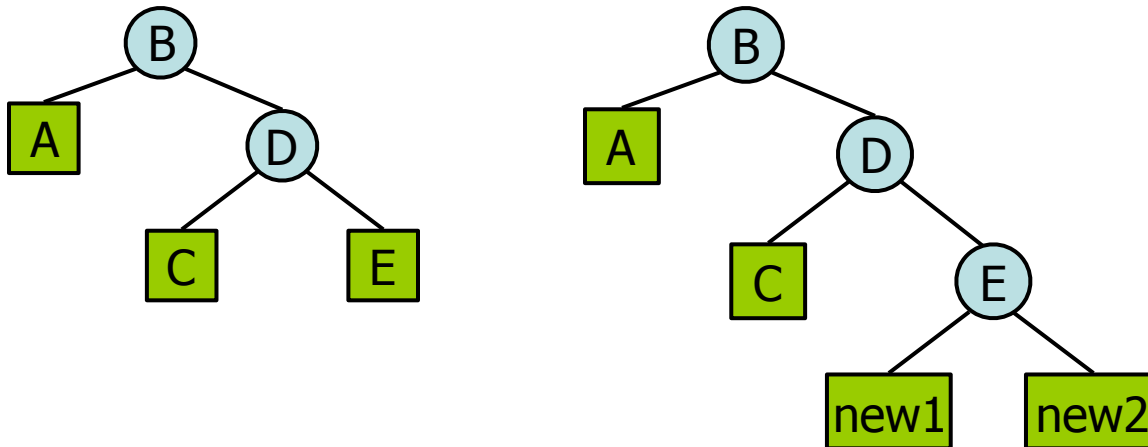
leftChild(p), rightChild(p), sibling(p):

swapElements(p,q),  
replaceElement(p,e)  
isRoot(p), isInternal(p),  
isExternal(p)

They all have  
complexity  $O(1)$

# Other interesting methods for the ADT Binary Tree:

`expandExternal(v)`: Transform  $v$  from an external node into an internal node by creating two new children



`expandExternal(v)`:

new1 and new 2 are the new nodes

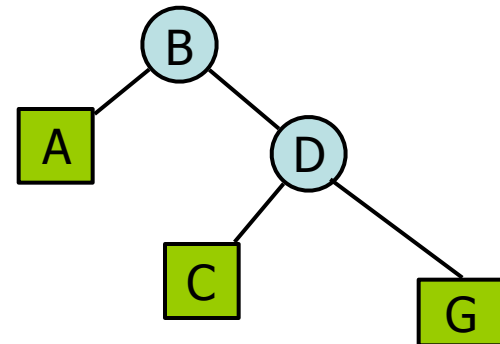
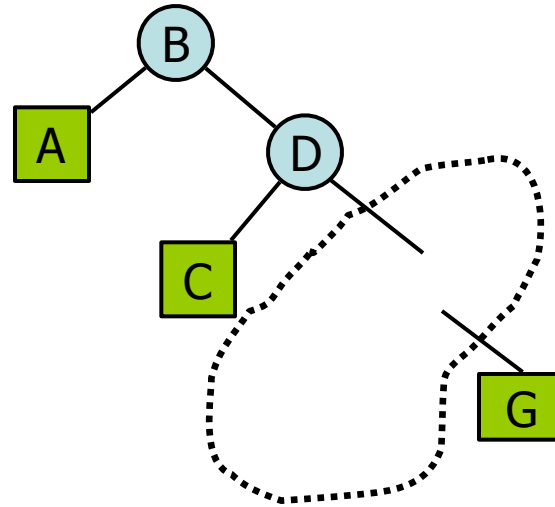
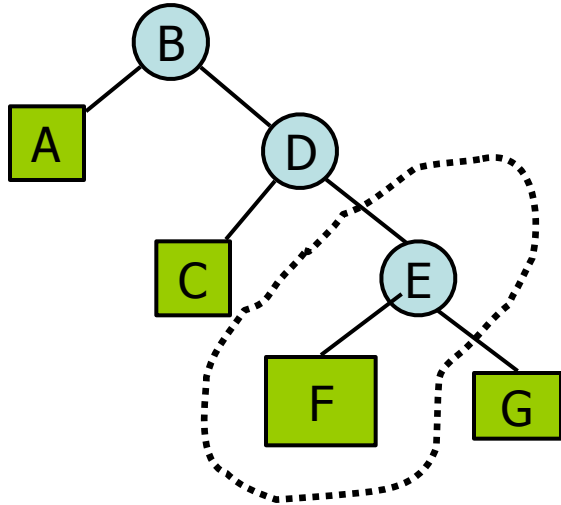
if `isExternal(v)`

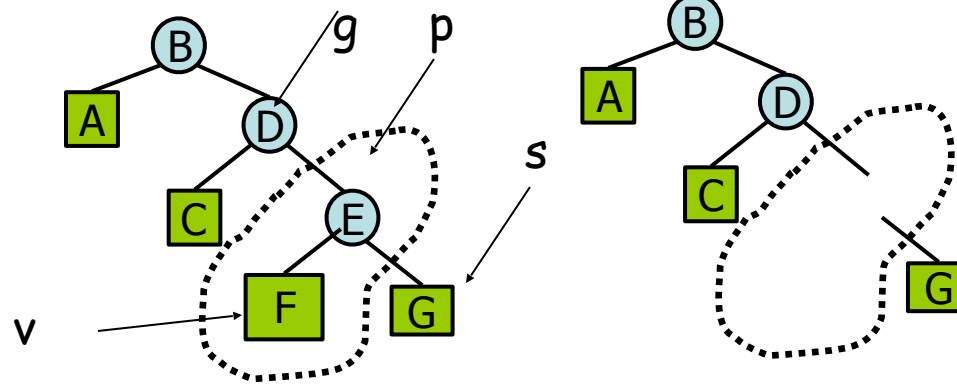
$v.\text{left} \leftarrow \text{new1}$

$v.\text{right} \leftarrow \text{new2}$

$\text{size} \leftarrow \text{size} + 2$

removeAboveExternal(v):





**removeAboveExternal(v):**

if isExternal(v)

{ p ← parent(v)

  s ← sibling(v)

  if isRoot(p) s.parent ← null and root ← s

  else

    { g ← parent(p)

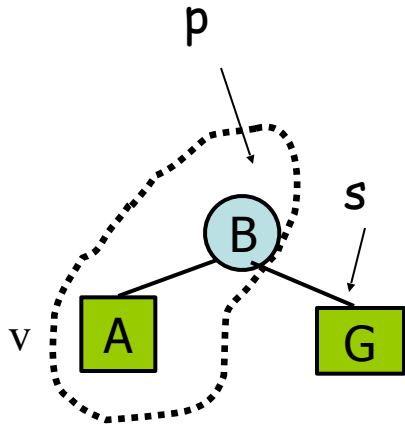
      if p is leftChild(g) g.left ← s

      else g.right ← s

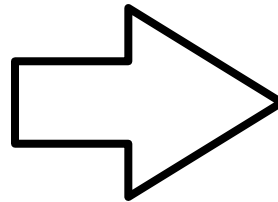
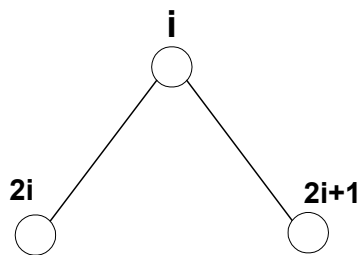
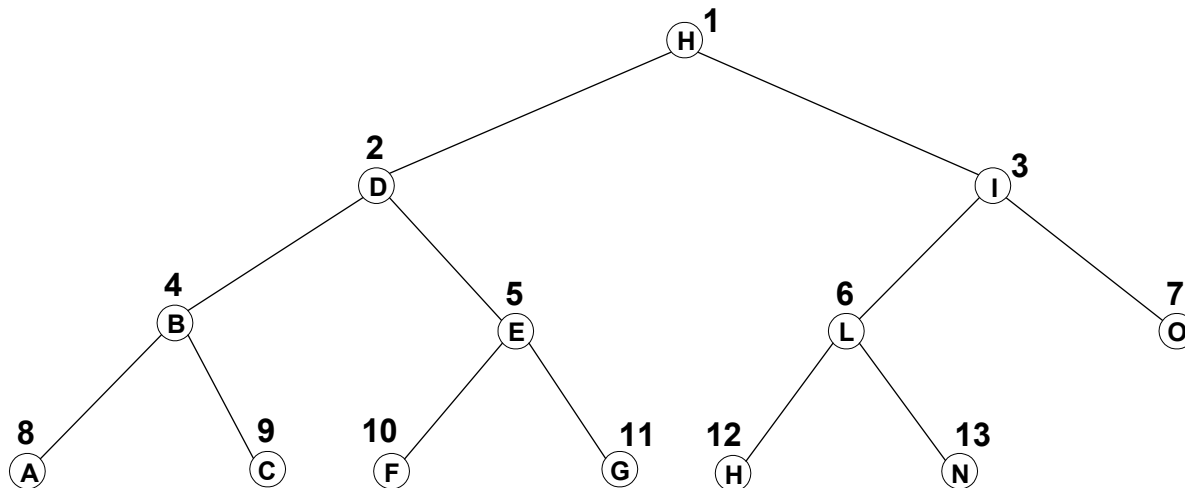
      s.parent ← g

    }

  size ← size - 2 }



# Implementing Complete Binary Trees with Vectors (Array-based)



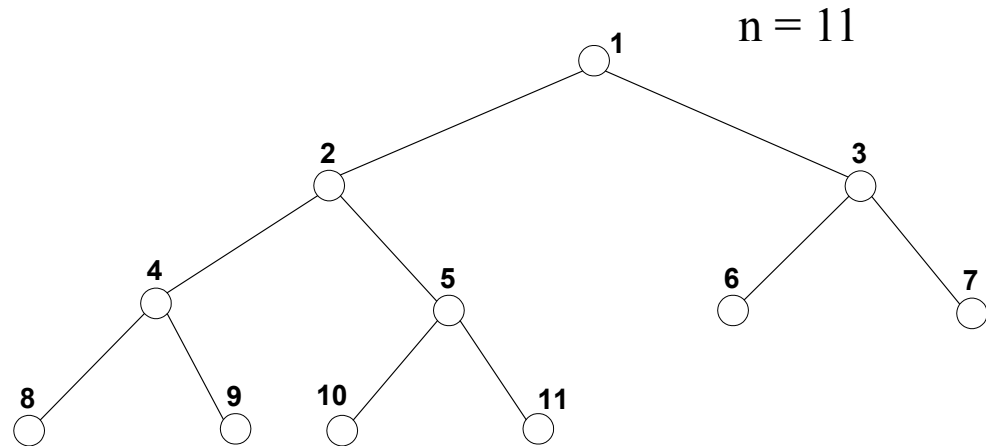
1	2	3	4	5	6	7	8	9	10	11	12	13
H	D	I	B	E	L	O	A	C	F	G	H	N



leftChild(p), rightChild(p), sibling(p):

swapElements(p,q),  
replaceElement(p,e)  
isRoot(p), isInternal(p),  
isExternal(p)

They all have  
complexity  $O(1)$



Left child of $T[i]$	$T[2i]$	if	$2i \leq n$
Right child of $T[i]$	$T[2i+1]$	if	$2i + 1 \leq n$
Parent of $T[i]$	$T[i \text{ div } 2]$	if	$i > 1$
The Root	$T[1]$	if	$T \neq 0$
Leaf? $T[i]$	TRUE	if	$2i > n$

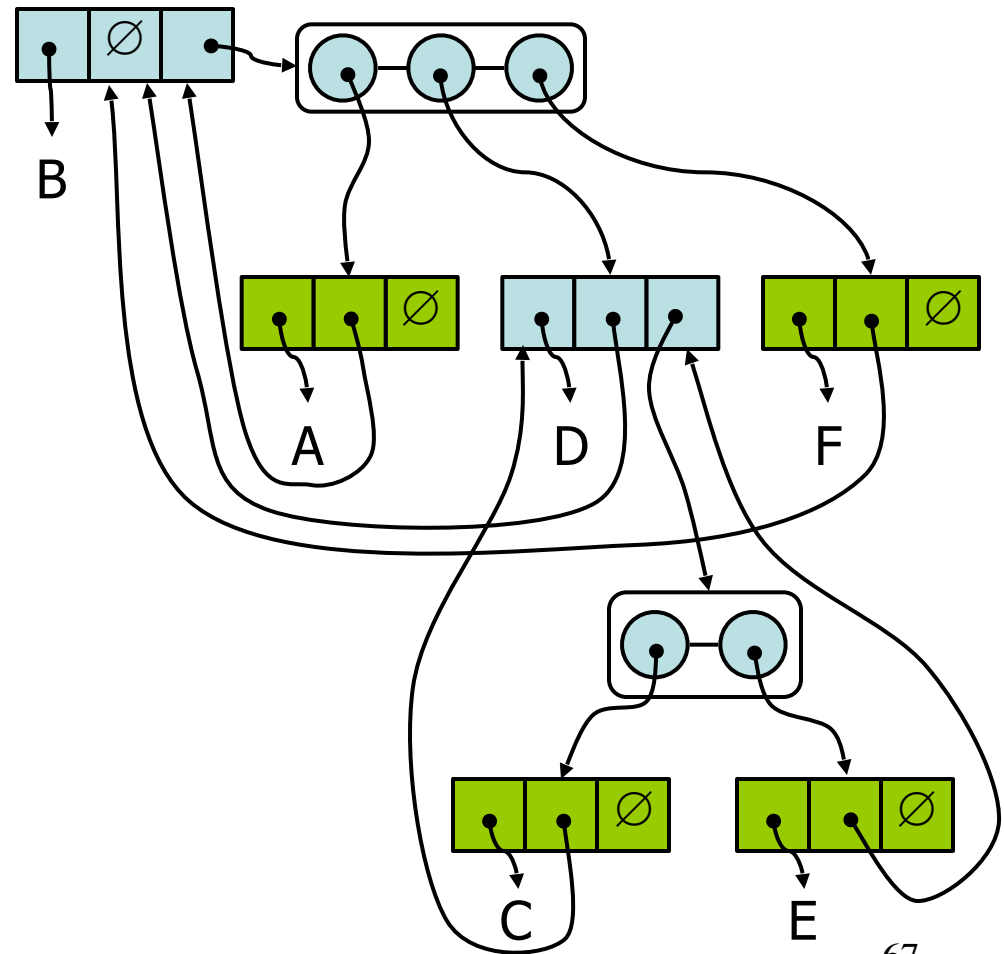
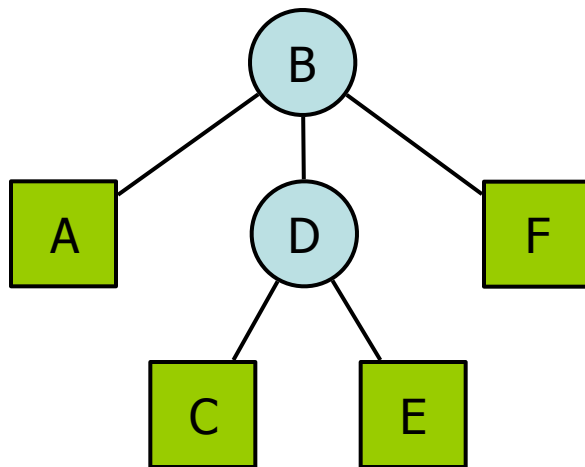
leftChild(p), rightChild(p), sibling(p):

swapElements(p,q),  
replaceElement(p,e)  
isRoot(p), isInternal(p),  
isExternal(p)

They all have  
complexity  $O(1)$

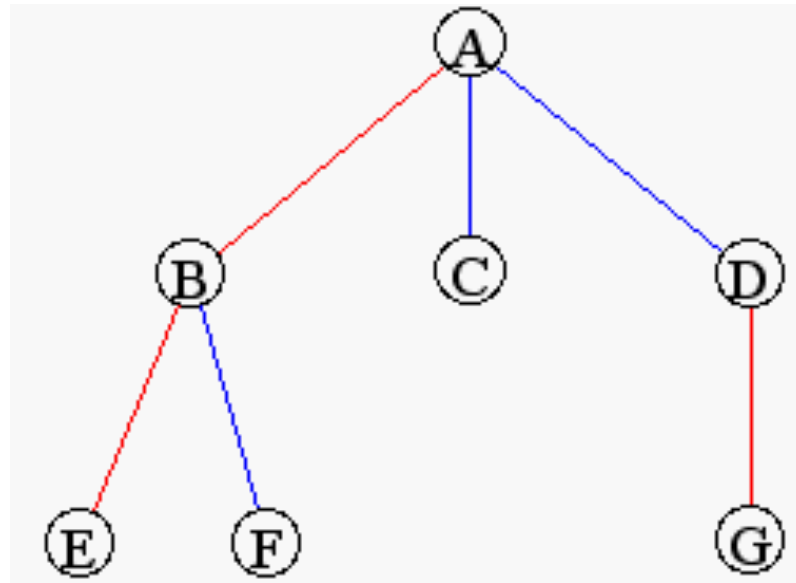
## Implementing General Trees with a Linked Structure

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

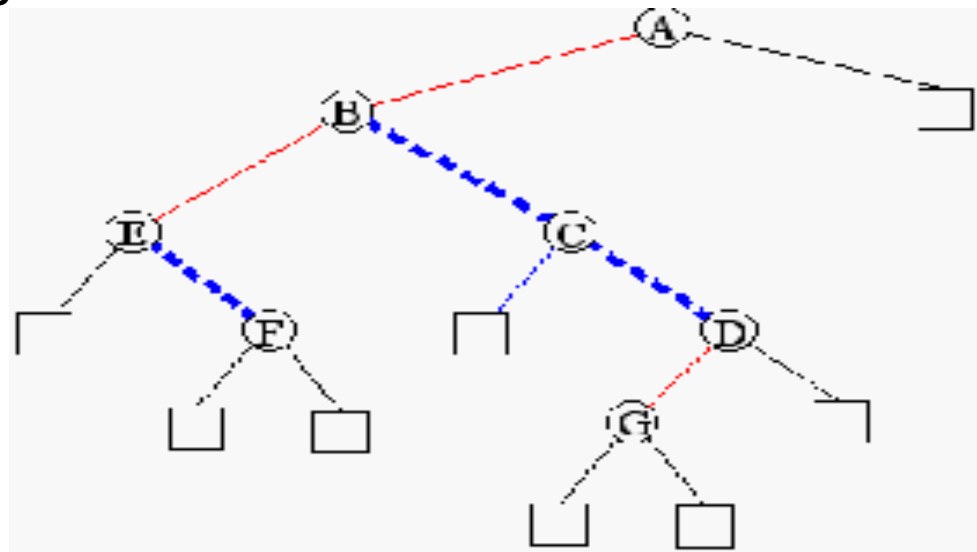


# Representing General Trees

tree T



binary tree T' representing T



## RULES

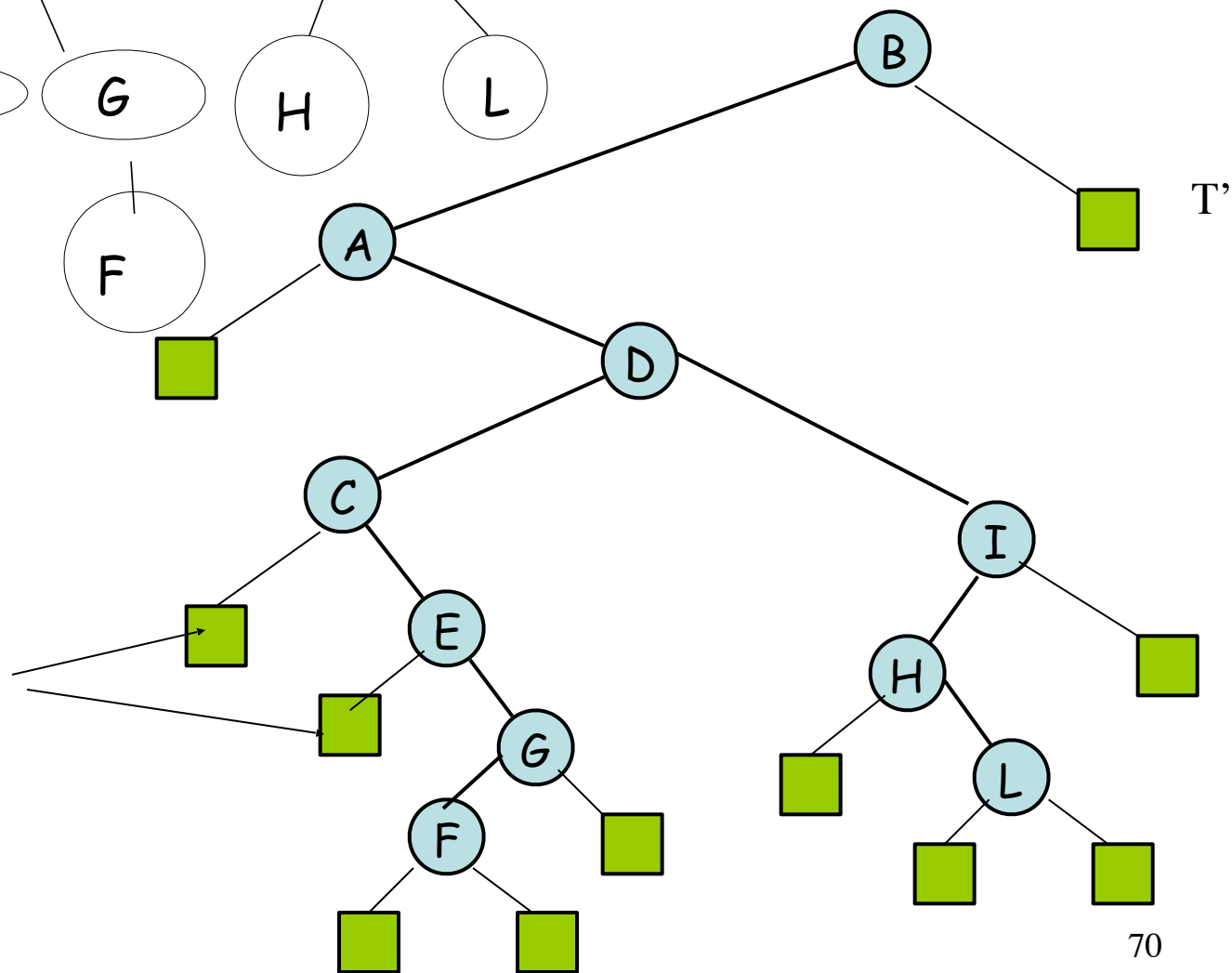
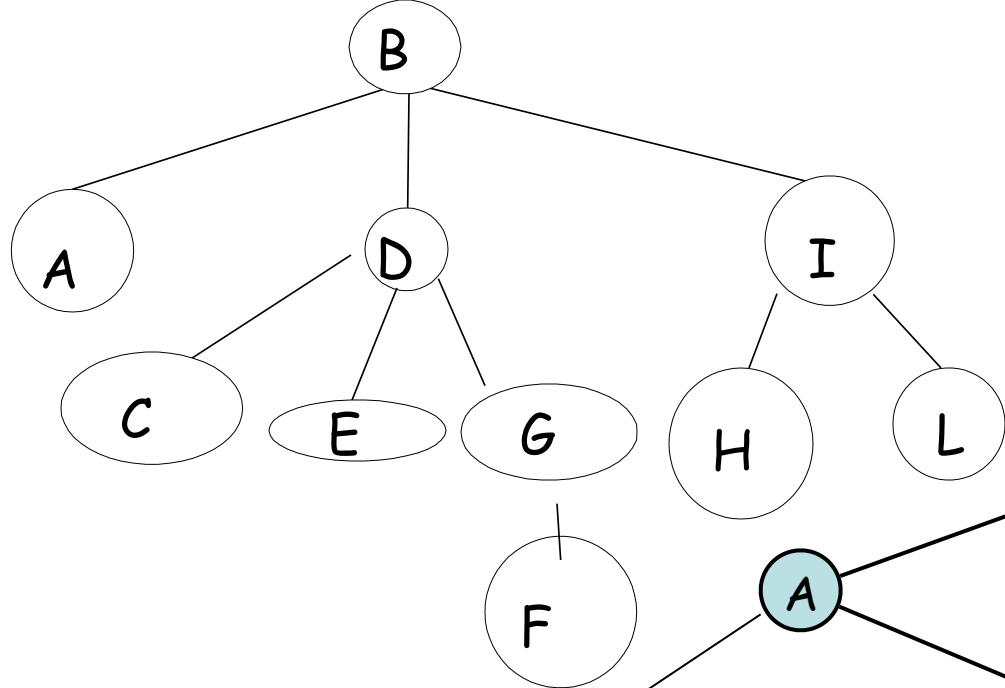
$u$  in  $T$

$u'$  in  $T'$

first child of  $u$  in  $T$  is left child of  $u'$  in  $T'$

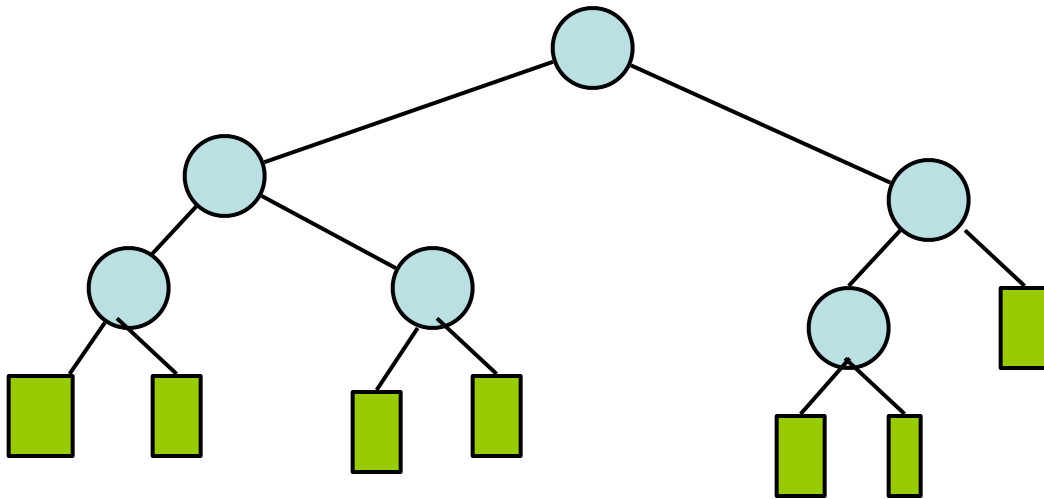
first sibling of  $u$  in  $T$  is right child of  $u'$  in  $T'$

T



Place holder

children are "completed" with "fake" nodes



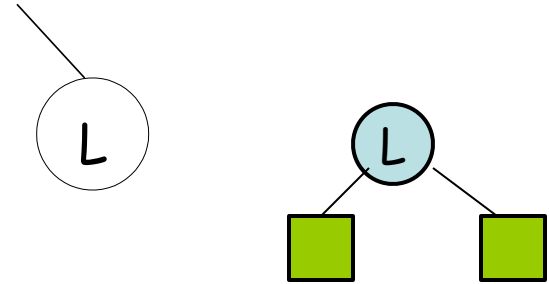
The green squared nodes are the dummy nodes.

In this way ALL the original nodes are internal.  
The leaves are the fake green nodes.

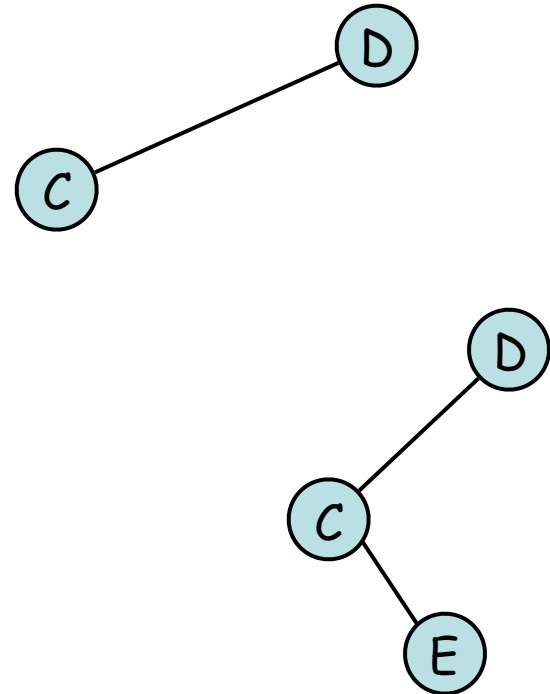
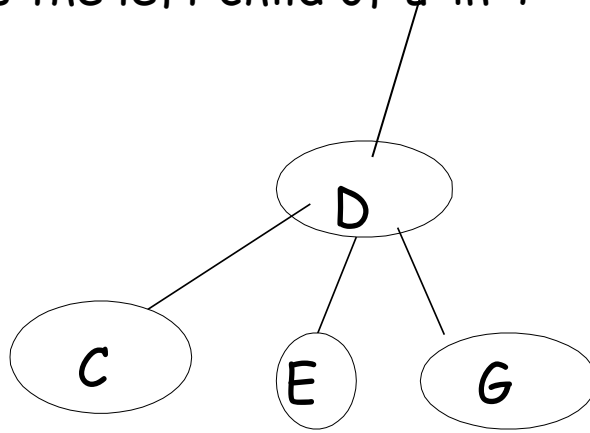
RULE:

to  $u$  in  $T$  corresponds  $u'$  in  $T'$

if  $u$  is a leaf in  $T$  and has no siblings,  
then the children of  $u'$  are leaves



If  $u$  is internal in  $T$  and  $v$  is its first child  
then  $v'$  is the left child of  $u'$  in  $T'$



If  $v$  has a sibling  $w$  immediately following it,  
 $w'$  is the right child of  $v'$  in  $T'$



