

# Trees, Search Trees

---

- Searching
- Tree Data Structures
- Binary Search Trees
- Insertion into BSTs
- Representing BSTs
- Searching in BSTs
- Insertion into BSTs
- Tree Traversal
- Joining Two Trees
- Deletion from BSTs

## ❖ Searching

---

Search is an extremely common application in computing

- given a (large) collection of **items** and a **key** value
- find the item(s) in the collection containing that key
  - item = (**key**, val<sub>1</sub>, val<sub>2</sub>, ...) (i.e. a structured data type)
  - key = value used to distinguish items (e.g. student ID)

Applications: Google, databases, .....

## ❖ ... Searching

Many approaches have been developed for the "search" problem

Different approaches determined by properties of data structures:

- arrays: linear, random-access, in-memory
- linked-lists: linear, sequential access, in-memory
- files: linear, sequential access, external

Search costs:

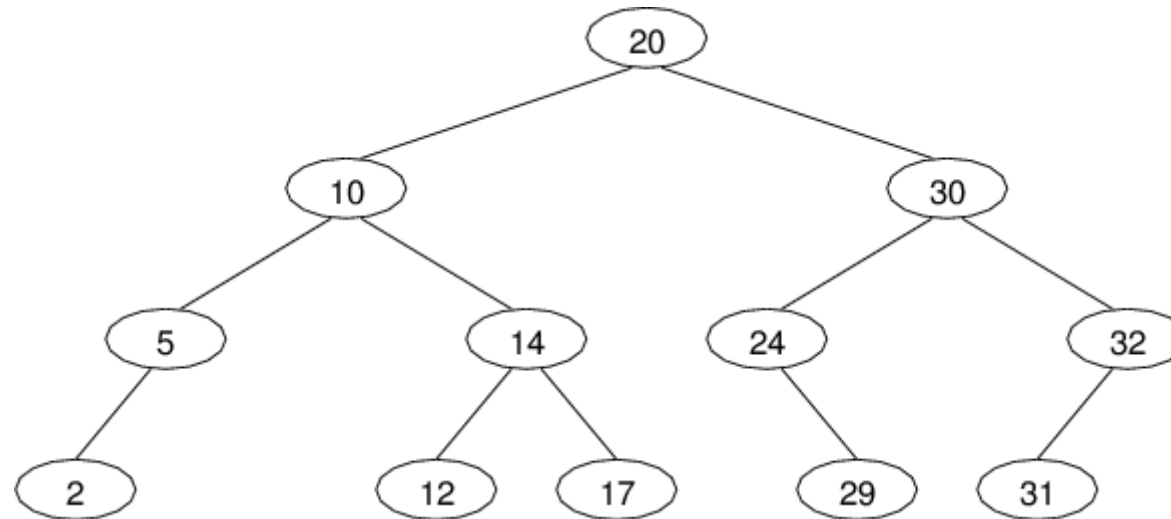
	Array	List	File
Unsorted	$O(n)$ (linear scan)	$O(n)$ (linear scan)	$O(n)$ (linear scan)
Sorted	$O(\log n)$ (binary search)	$O(n)$ (linear scan)	$O(\log n)$ (lseek,lseek,...)

## ❖ ... Searching

Maintaining arrays and files in sorted order is costly.

**Search trees** are efficient to search but also efficient to maintain.

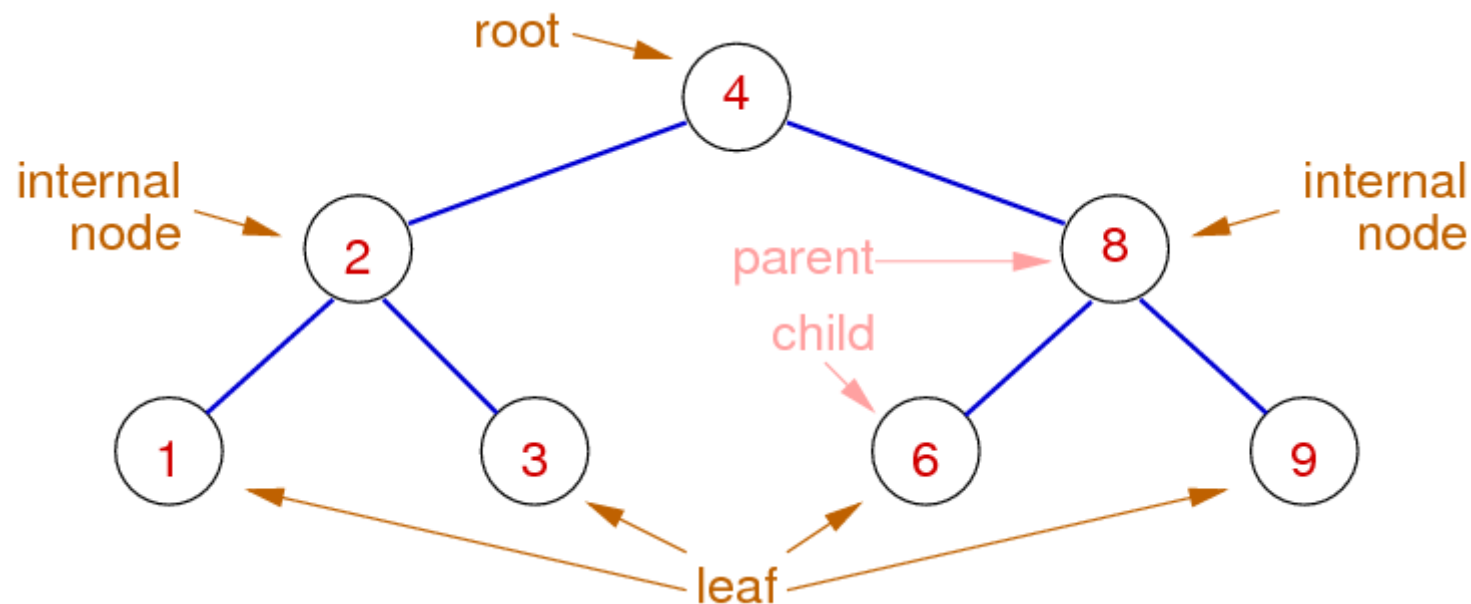
Example: the following tree corresponds to the sorted array  
[2, 5, 10, 12, 14, 17, 20, 24, 29, 30, 31, 32]:



## ❖ Tree Data Structures

Trees are connected graphs

- with nodes and edges (called *links*), but no cycles (no "up-links")
- each node contains a **data** value (or key+data)
- each node has **links** to  $\leq k$  other child nodes ( $k=2$  below)

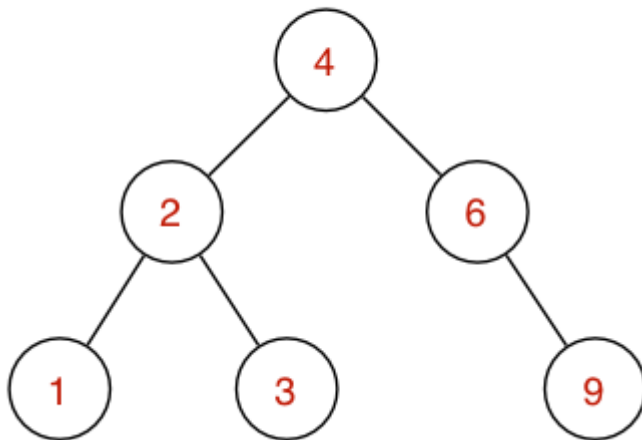


## ❖ ... Tree Data Structures

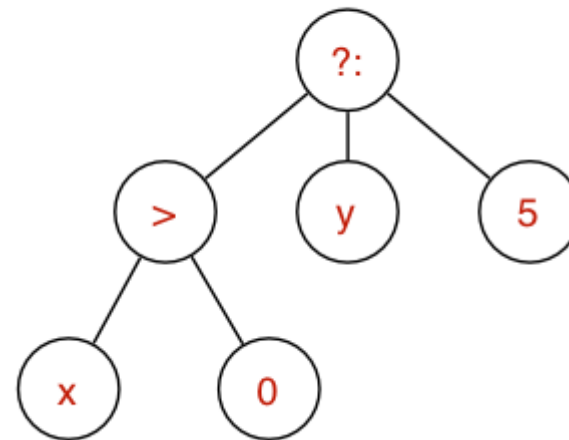
Trees are used in many contexts, e.g.

- representing hierarchical data structures (e.g. expressions)
- efficient searching (e.g. sets, symbol tables, ...)

Search Tree



Expression Tree



## ❖ ... Tree Data Structures

Real-world example: organisational structure

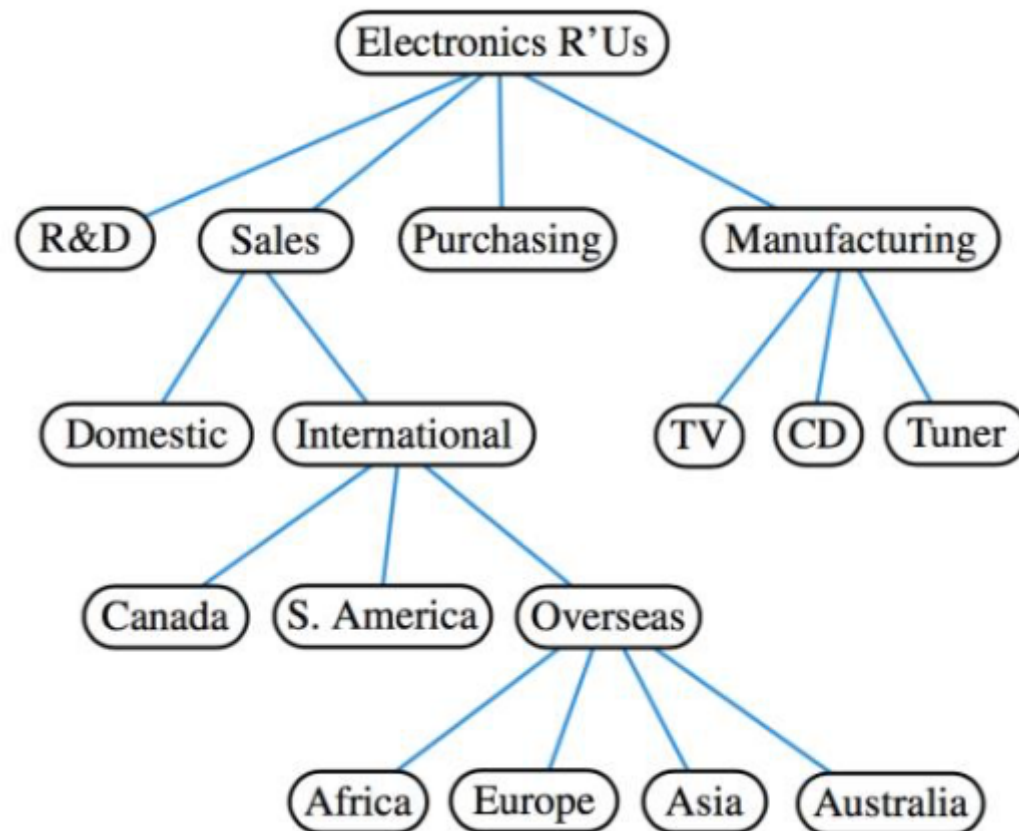


Diagram from "Data Structures and Algorithms in Java" (6th ed) by Goodrich et al

## ❖ ... Tree Data Structures

Real-world example: hierarchical file system (e.g. Linux)

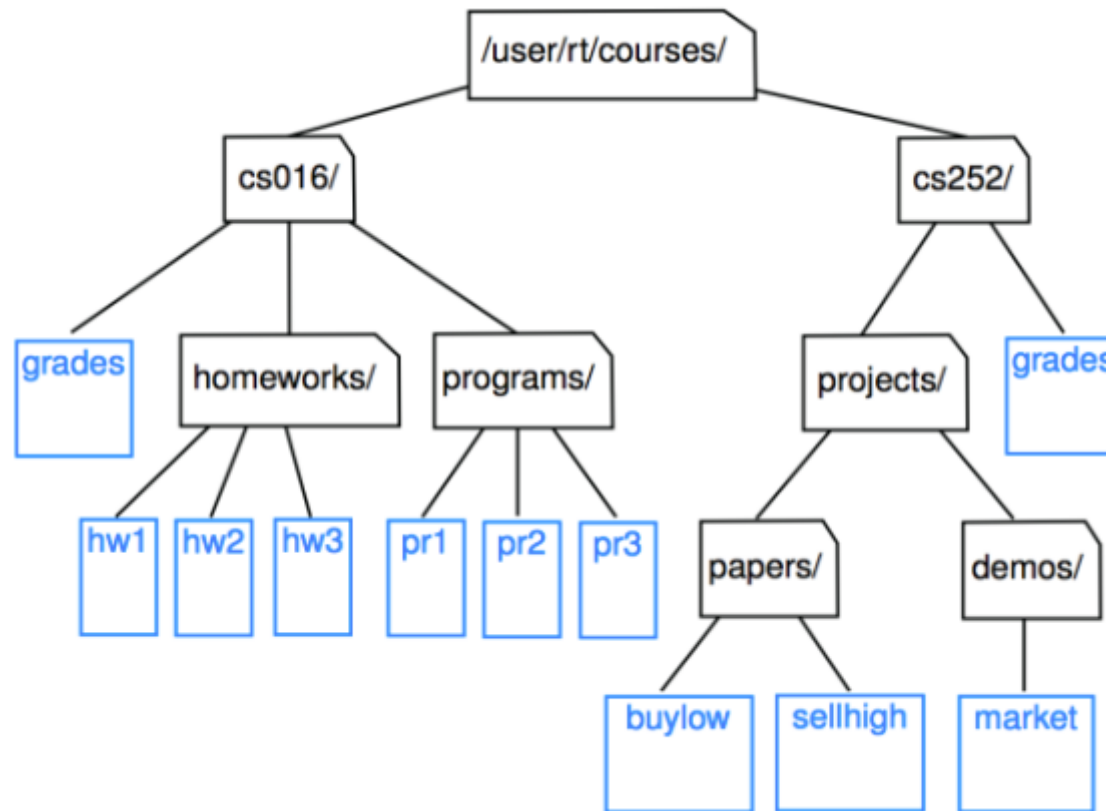


Diagram from "Data Structures and Algorithms in Java" (6th ed) by Goodrich et al



## ❖ ... Tree Data Structures

Real-world example: structure of a typical book

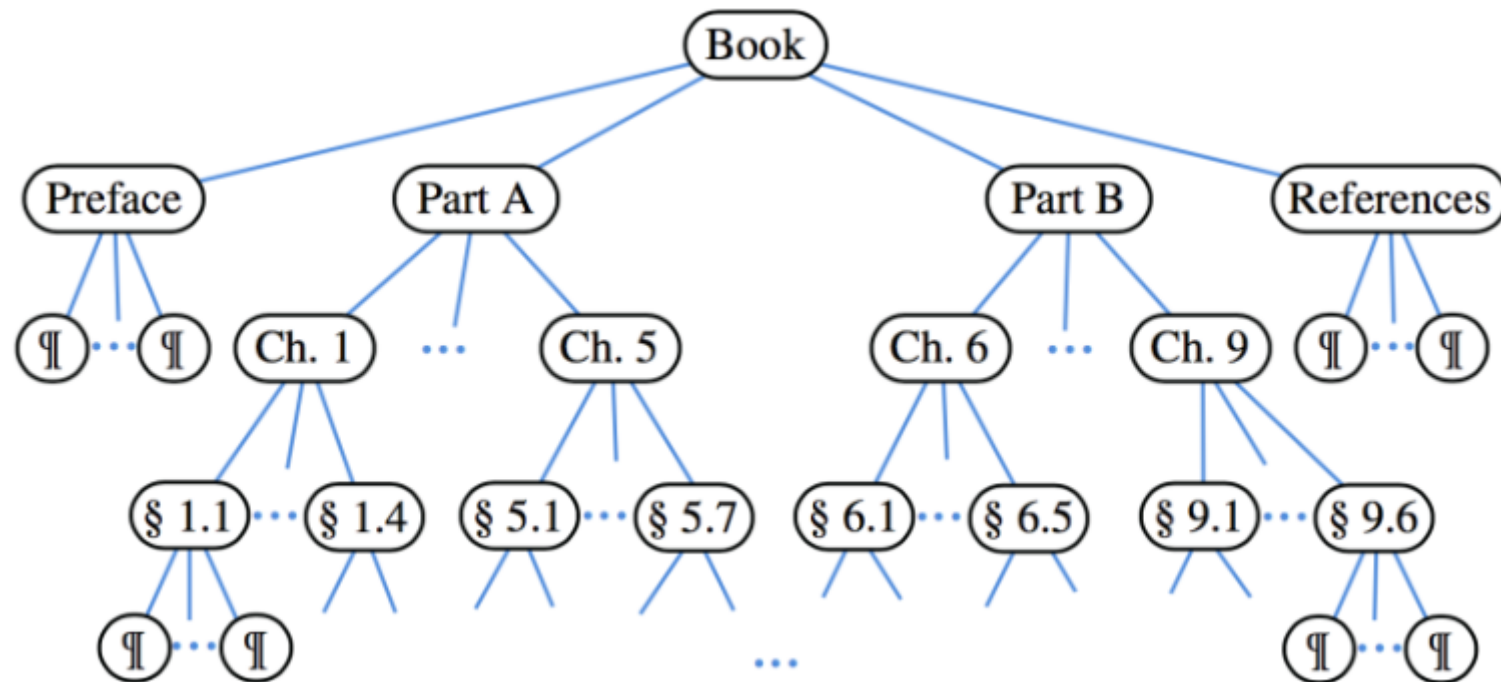


Diagram from "Data Structures and Algorithms in Java" (6th ed) by Goodrich et al

## ❖ ... Tree Data Structures

Real-world example: a decision tree

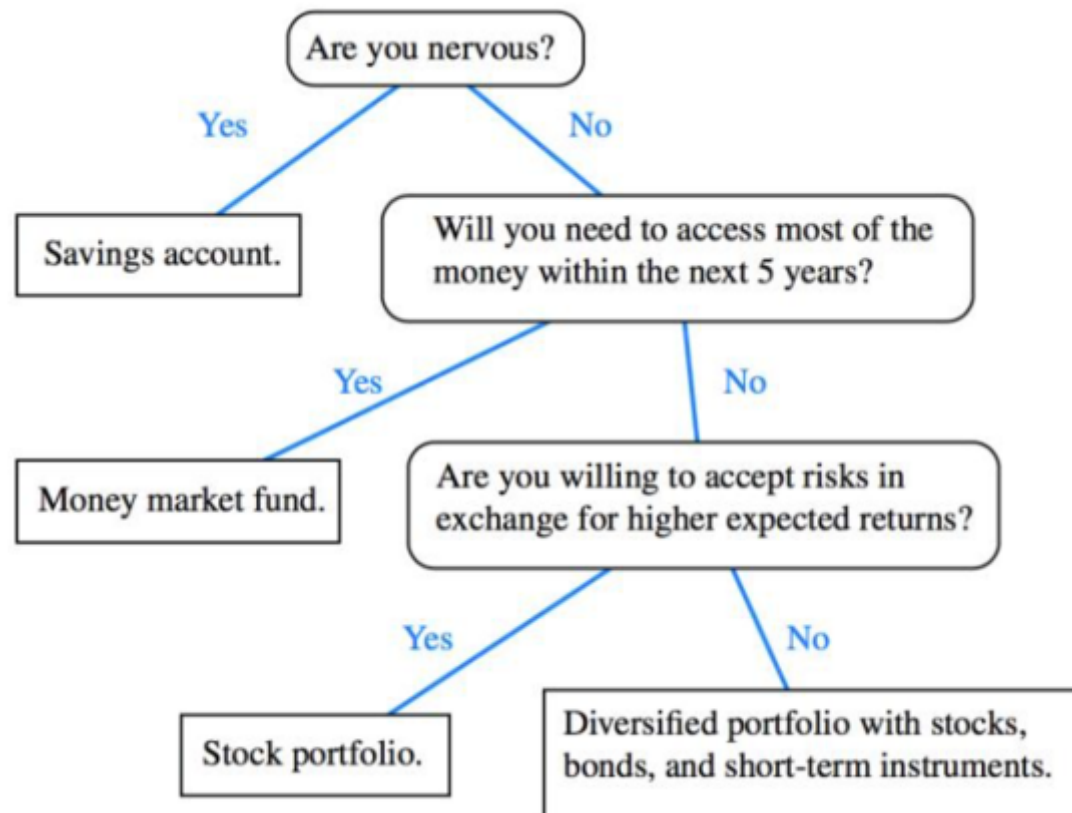
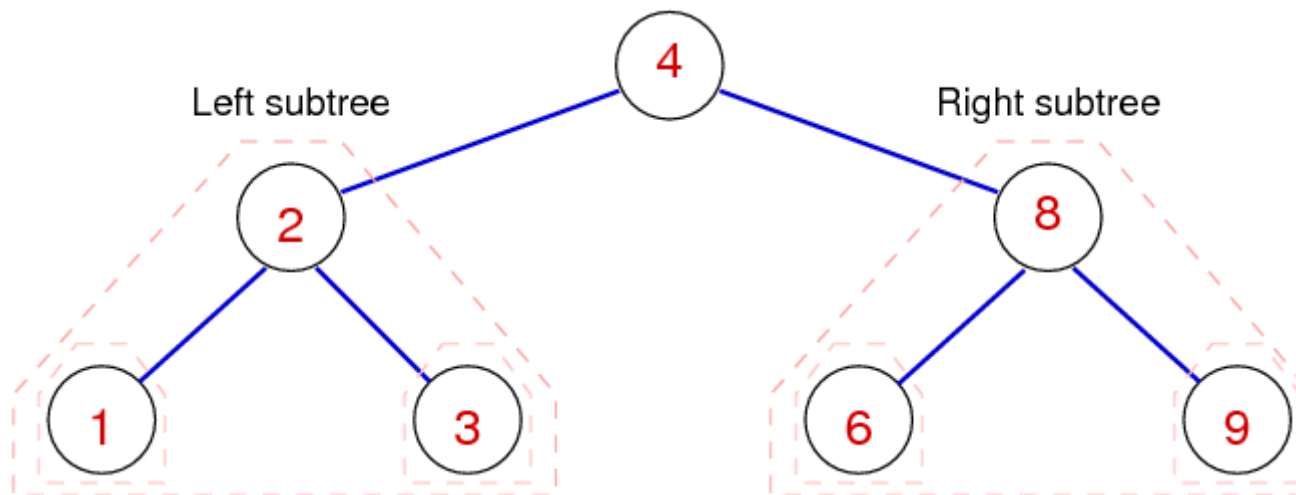


Diagram from "Data Structures and Algorithms in Java" (6th ed) by Goodrich et al

## ❖ ... Tree Data Structures

A *binary tree* is either

- empty (contains no nodes)
- consists of a **node**, with **two subtrees**
  - node contains a value (typically key+data)
  - left and right subtrees are *binary trees* (recursive)



## ❖ ... Tree Data Structures

---

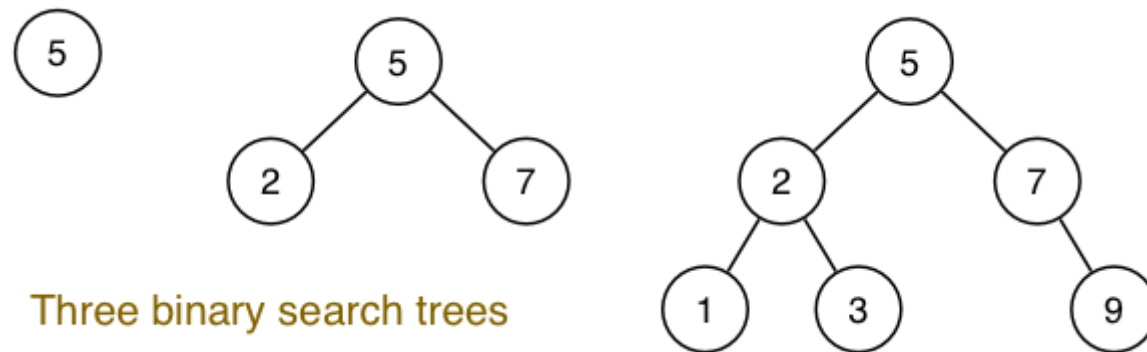
Other special kinds of tree

- ***m*-ary tree**: each internal node has exactly  $m$  children
- **B-tree**: each internal node has  $n/2 \leq \#children \leq n$
- **Ordered tree**: all left values  $<$  root, all right values  $>$  root
- **Balanced tree**: has  $\cong$  minimal height for a given number of nodes
- **Degenerate tree**: has  $\cong$  maximal height for a given number of nodes

## ❖ Binary Search Trees

Binary search trees (or **BSTs**) are ordered trees

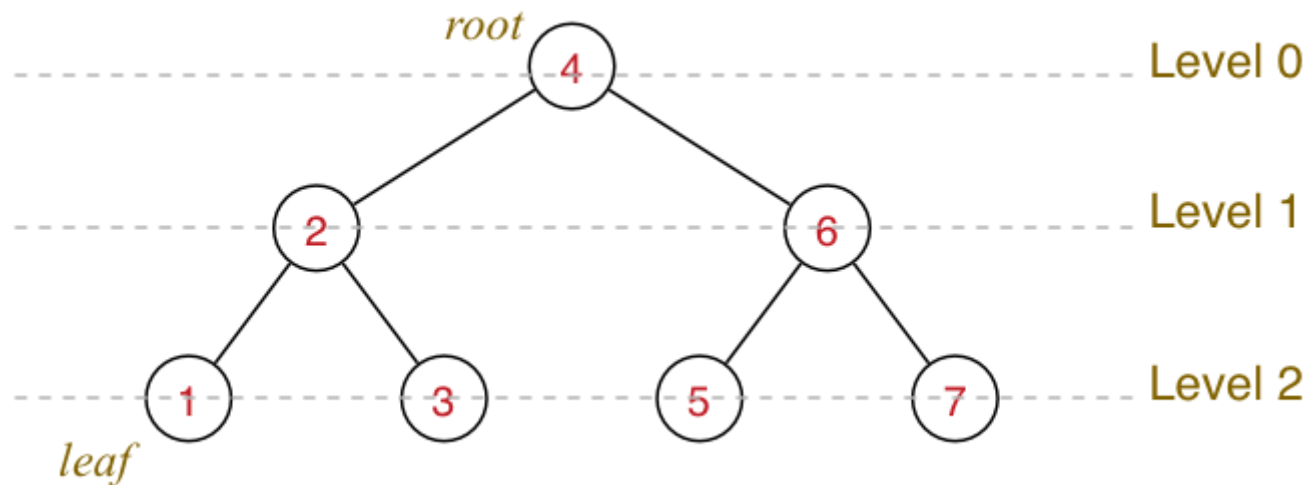
- each node is the root of 0, 1 or 2 subtrees
- all values in any left subtree are less than root
- all values in any right subtree are greater than root
- these properties applies over all nodes in the tree



## ❖ ... Binary Search Trees

**Level** of node = path length from root to node

**Height** (or **depth**) of tree = max path length from root to leaf



## ❖ ... Binary Search Trees

---

Some properties of trees ...

### Ordered

- $\forall$  nodes:  $\max(\text{left subtree}) < \text{root} < \min(\text{right subtree})$

### Perfectly-balanced tree

- $\forall$  nodes:  $\#nodes(\text{left subtree}) = \#nodes(\text{right subtree})$

### Height-balanced tree

- $\forall$  nodes:  $\text{height}(\text{left subtree}) = \text{height}(\text{right subtree})$

Note: time complexity of tree algorithms is typically  $O(\text{height})$

## ❖ ... Binary Search Trees

---

Operations on BSTs:

- `insert(Tree,Item)` ... add new item to tree via key
- `delete(Tree,Key)` ... remove item with specified key from tree
- `search(Tree,Key)` ... find item containing key in tree
- plus, "bookkeeping" ... `new()`, `free()`, `show()`, ...

Notes:

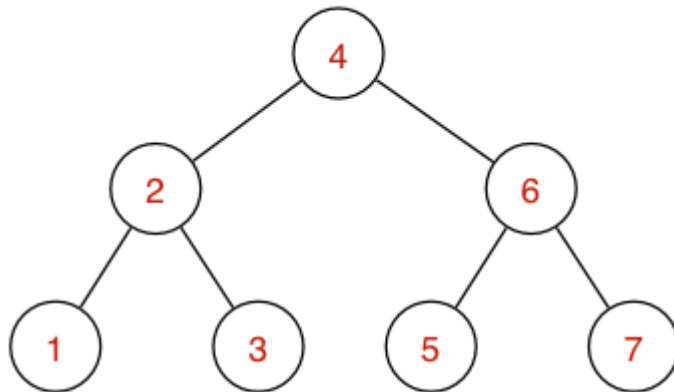
- nodes contain **Items**; we generally show just **Item.key**
- keys are unique (not technically necessary)



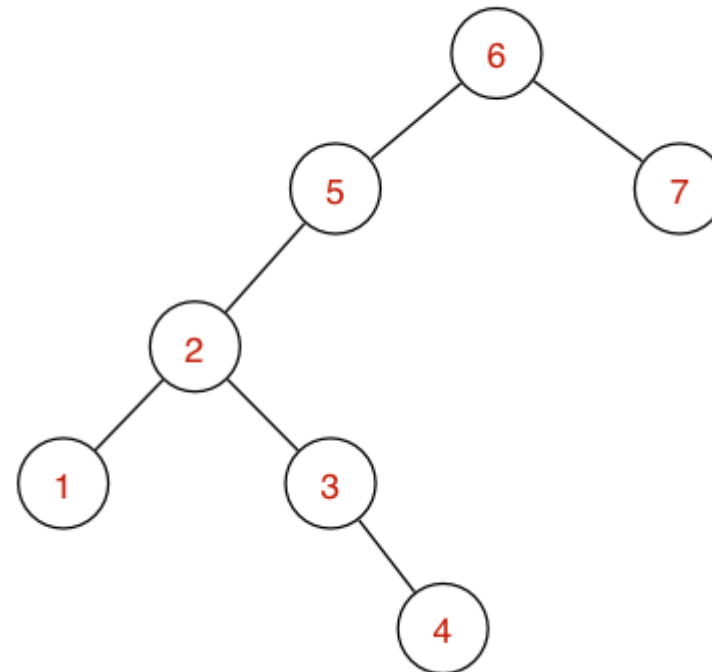
## ❖ ... Binary Search Trees

Examples of binary search trees:

Balanced Tree



Non-balanced Tree



Shape of tree is determined by order of insertion.

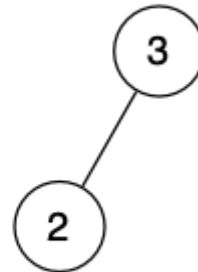
## ❖ Insertion into BSTs

Steps in inserting values into an initially empty BST

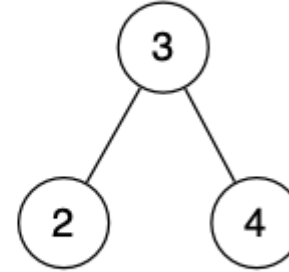
*insert 3*



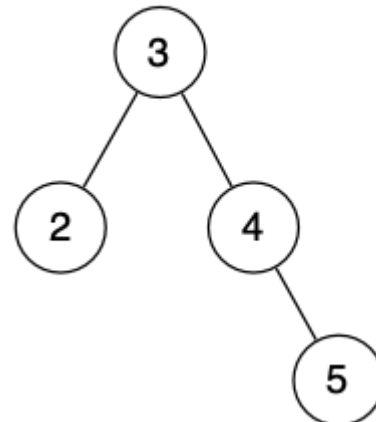
*insert 2*



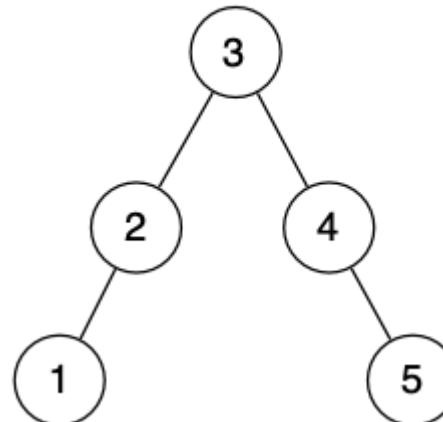
*insert 4*



*insert 5*



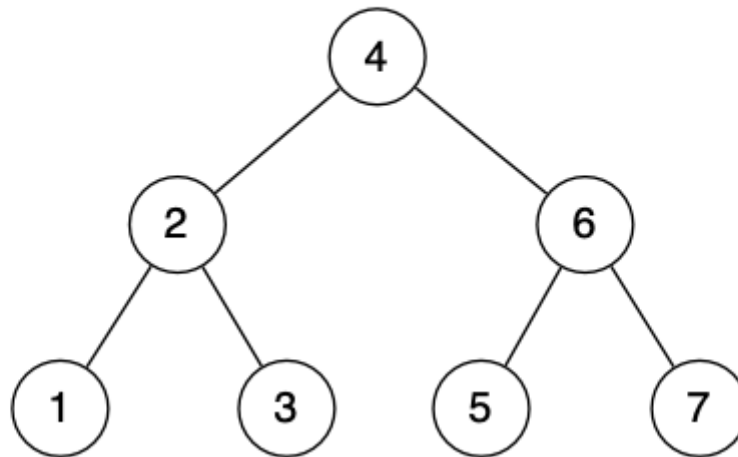
*insert 1*



## ❖ ... Insertion into BSTs

---

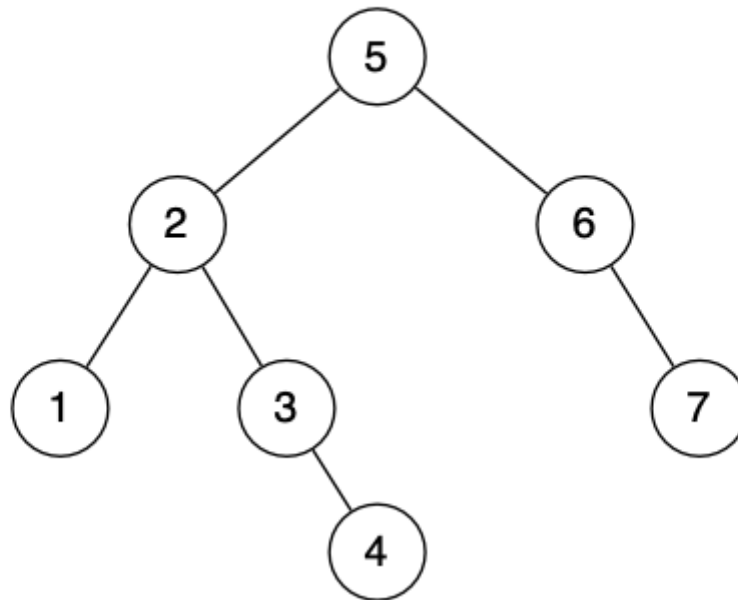
*Tree resulting from inserting: 4 2 6 5 1 7 3*



## ❖ ... Insertion into BSTs

---

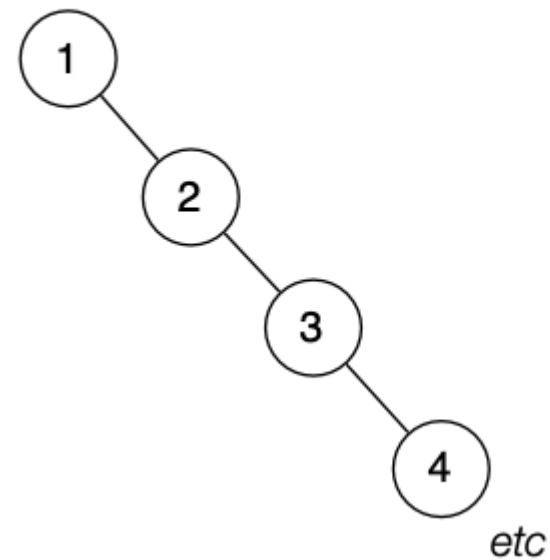
*Tree resulting from inserting: 5 6 2 3 4 7 1*



## ❖ ... Insertion into BSTs

---

*Tree resulting from inserting: 1 2 3 4 5 6 7*



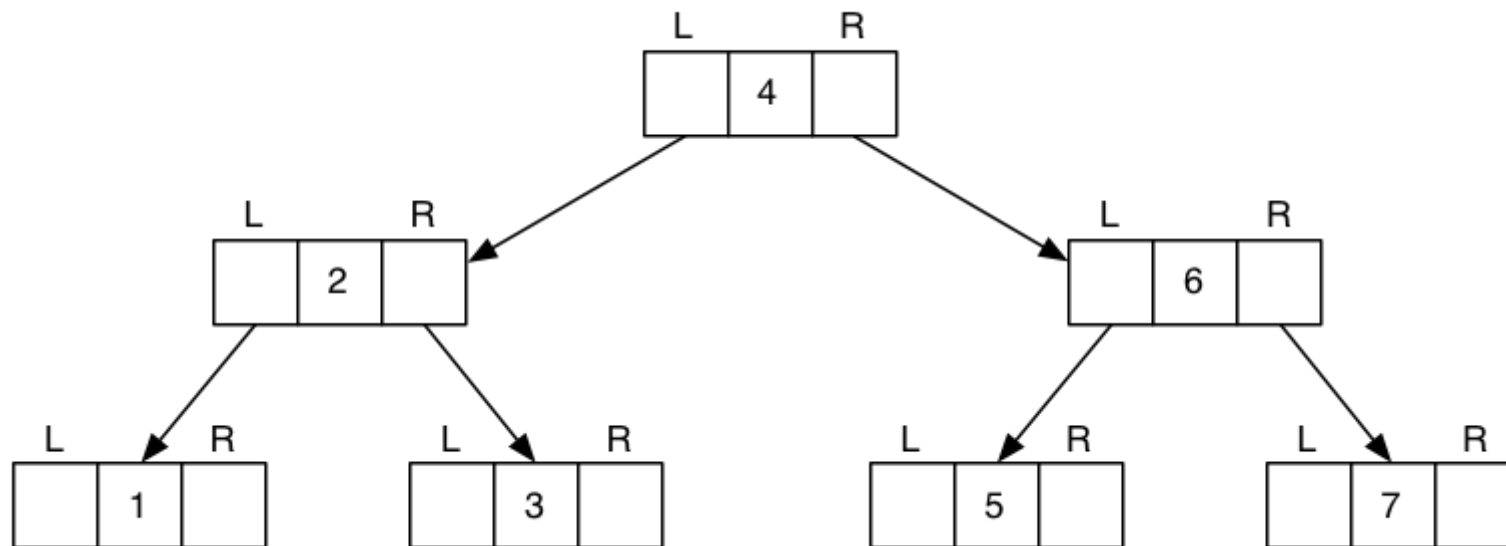
## ❖ Representing BSTs

Binary trees are typically represented by node structures

- where each node contains a value, and pointers to child nodes

Most tree algorithms move *down* the tree.

If upward movement needed, add a pointer to parent.



## ❖ ... Representing BSTs

---

Typical data structures for trees ...

```
// a Tree is represented by a pointer to its root node
typedef struct Node *Tree;

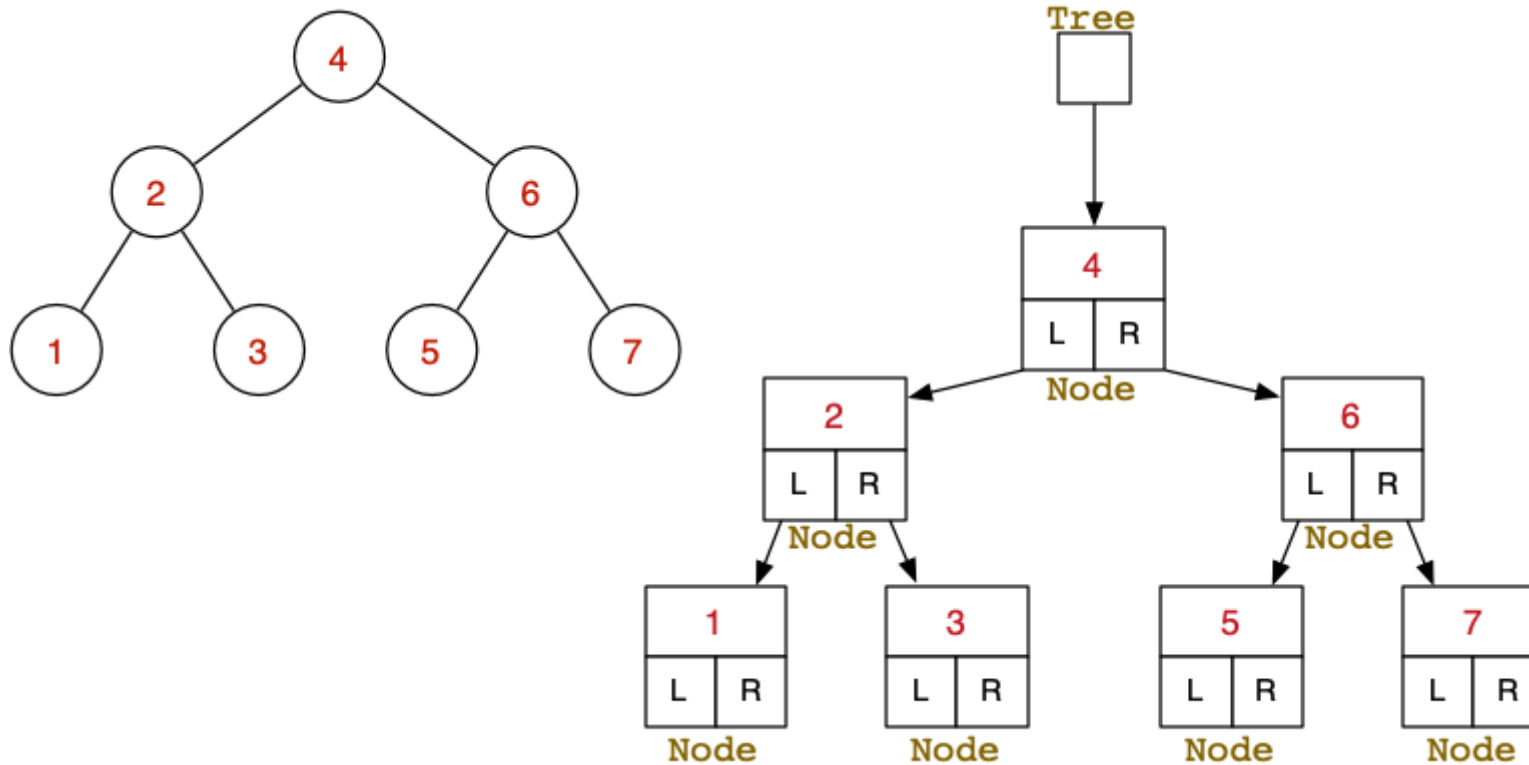
// a Node contains its data, plus left and right subtrees
typedef struct Node {
    int data;
    Tree left, right;
} Node;

// some macros that we will use frequently
#define data(node) ((node)->data)
#define left(node) ((node)->left)
#define right(node) ((node)->right)
```

Here we use a simple definition for **data** ... just a key

## ❖ ... Representing BSTs

Abstract data vs concrete data ...





## ❖ Searching in BSTs

---

Most tree algorithms are best described recursively:

`TreeContains(tree, key):`

```
|   Input  tree, key
|   Output true if key found in tree, false otherwise
|
|   if tree is empty then
|       return false
|   else if key < data(tree) then
|       return TreeContains(left(tree), key)
|   else if key > data(tree) then
|       return TreeContains(right(tree), key)
|   else // found
|       return true
|   end if
```

## ❖ Insertion into BSTs

---

Insert an item into a tree; item becomes new leaf node

```
TreeInsert(tree,item):
|   Input  tree, item
|   Output tree with item inserted
|
|   if tree is empty then
|       return new node containing item
|   else if item < data(tree) then
|       left(tree) = TreeInsert(left(tree),item)
|       return tree
|   else if item > data(tree) then
|       right(tree) = TreeInsert(right(tree),item)
|       return tree
|   else
|       return tree    // avoid duplicates
|   end if
```

## ❖ Tree Traversal

---

Iteration (traversal) on ...

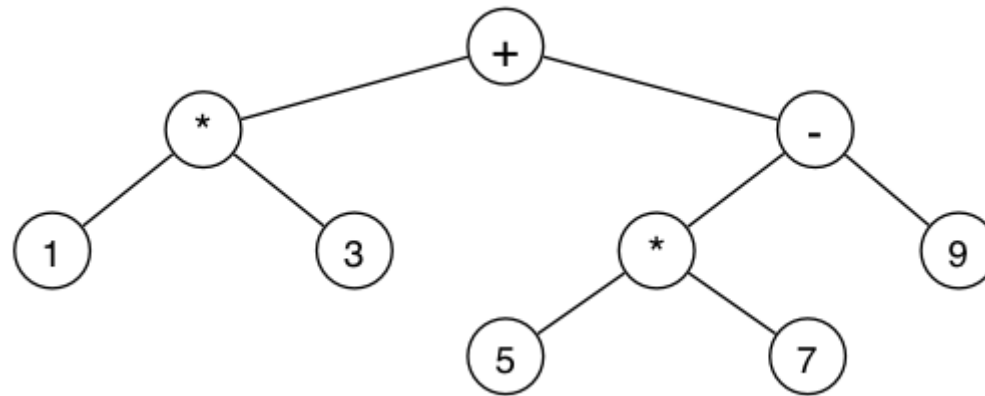
- **Lists** ... visit each value, from first to last
- **Graphs** ... visit each vertex, order determined by DFS/BFS/...

For binary **Trees**, several well-defined visiting orders exist:

- **preorder** (NLR) ... visit root, then left subtree, then right subtree
- **inorder** (LNR) ... visit left subtree, then root, then right subtree
- **postorder** (LRN) ... visit left subtree, then right subtree, then root
- **level-order** ... visit root, then all its children, then all their children

## ❖ ... Tree Traversal

Consider "visiting" an expression tree like:



NLR: + \* 1 3 - \* 5 7 9 (prefix-order: useful for building tree)

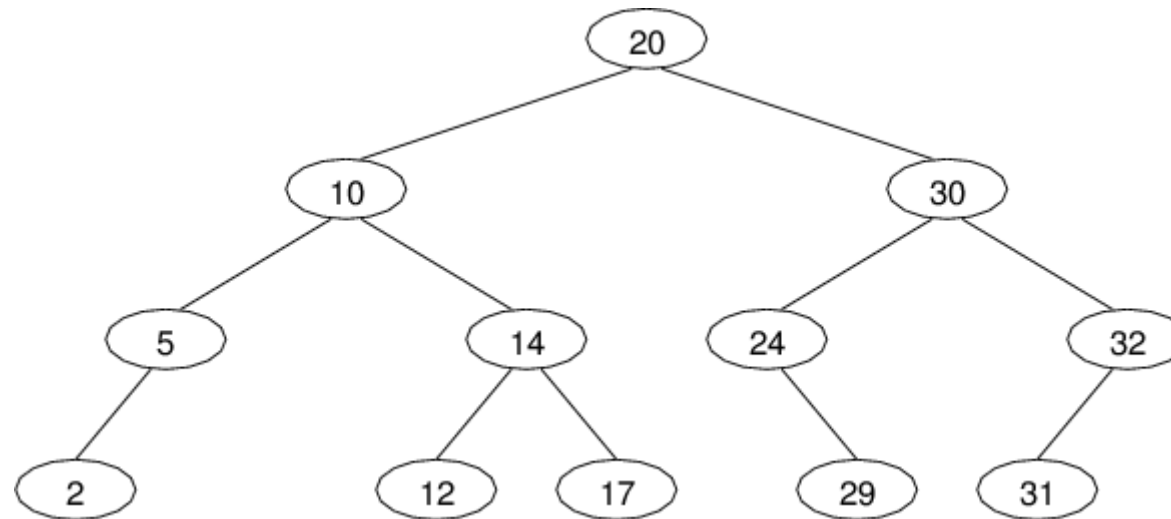
LNR: 1 \* 3 + 5 \* 7 - 9 (infix-order: "natural" order)

LRN: 1 3 \* 5 7 \* 9 - + (postfix-order: useful for evaluation)

Level: + \* - 1 3 \* 9 5 7 (level-order: useful for printing tree)

## ❖ ... Tree Traversal

Traversals for the following tree:



NLR (preorder): 20 10 5 2 14 12 17 30 24 29 32 31

LNR (inorder): 2 5 10 12 14 17 20 24 29 30 31 32

LRN (postorder): 2 5 12 17 14 10 29 24 31 32 30 20

## ❖ ... Tree Traversal

---

Pseudocode for NLR traversal

```
showBSTreePreorder(t):  
|   Input tree t  
|  
|   if t is not empty then  
|   |   print data(t)  
|   |   showBSTreePreorder(left(t))  
|   |   showBSTreePreorder(right(t))  
|   end if
```

Recursive algorithm is very simple.

Iterative version less obvious ... requires a Stack.

## ❖ ... Tree Traversal

---

Pseudocode for NLR traversal (non-recursive)

**showBSTreePreorder(t):**

```
|   Input tree t
|
|   push t onto new stack S
|   while stack is not empty do
|   |   t=pop(S)
|   |   print data(t)
|   |   if right(t) is not empty then
|   |   |   push right(t) onto S
|   |   end if
|   |   if left(t) is not empty then
|   |   |   push left(t) onto S
|   |   end if
|   end while
```

## ❖ Joining Two Trees

---

An auxiliary tree operation ...

Tree operations so far have involved just one tree.

An operation on two trees:  $\mathbf{t} = \mathbf{TreeJoin}(\mathbf{t}_1, \mathbf{t}_2)$

- Pre-conditions:
  - takes two BSTs; returns a single BST
  - $\max(\text{key}(\mathbf{t}_1)) < \min(\text{key}(\mathbf{t}_2))$
- Post-conditions:
  - result is a BST (i.e. fully ordered)
  - containing all items from  $\mathbf{t}_1$  and  $\mathbf{t}_2$



## ❖ ... Joining Two Trees

---

Method for performing tree-join:

- find the min node in the right subtree ( $t_2$ )
- replace min node by its right subtree (possibly empty)
- elevate min node to be new root of both trees

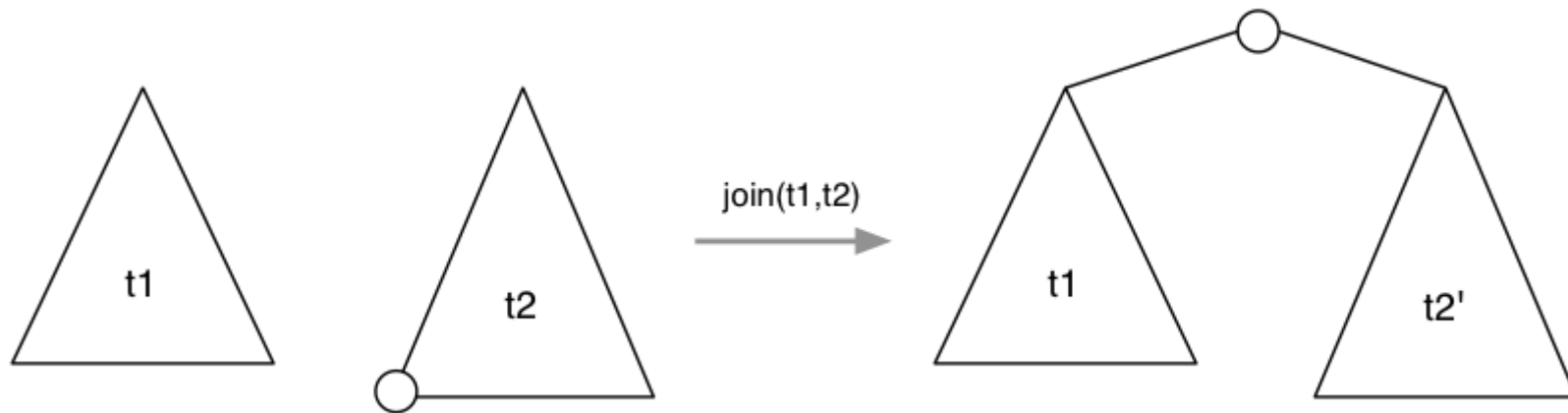
Advantage: doesn't increase height of tree significantly

$x \leq \text{height}(t) \leq x+1$ , where  $x = \max(\text{height}(t_1), \text{height}(t_2))$

Variation: choose deeper subtree; take root from there.

## ❖ ... Joining Two Trees

Joining two trees:



Note:  $t2'$  may be less deep than  $t2$

## ❖ ... Joining Two Trees

Implementation of tree-join:

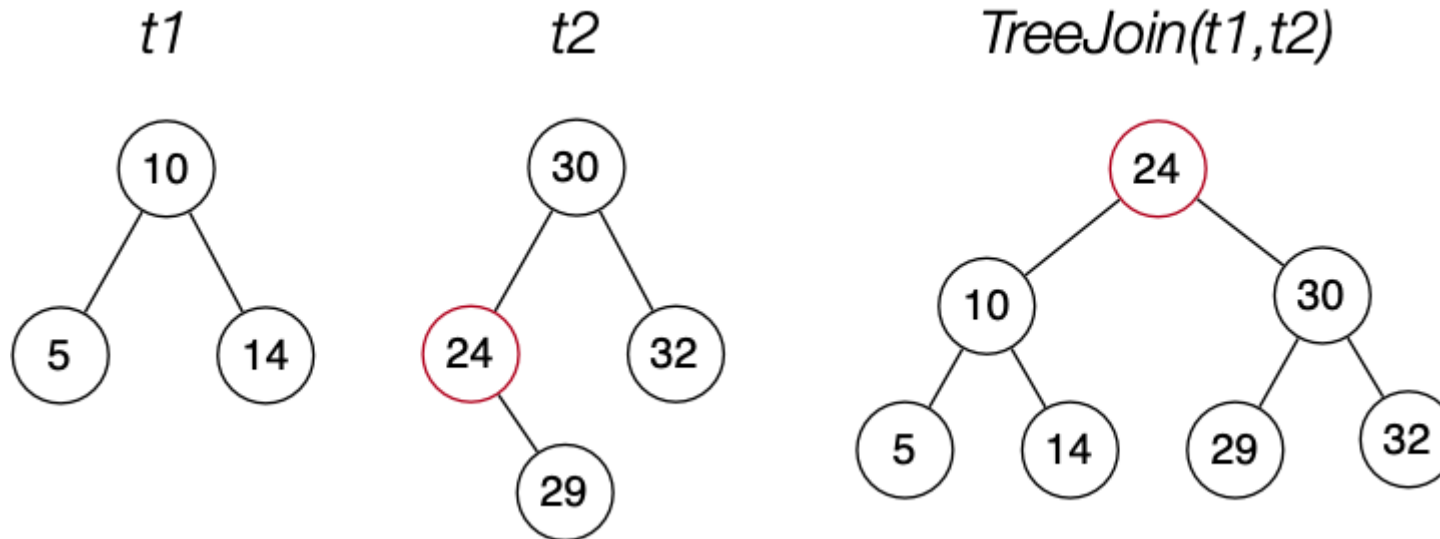
```

TreeJoin( $t_1, t_2$ ):
|   Input   trees  $t_1, t_2$ 
|   Output   $t_1$  and  $t_2$  joined together
|
|   if  $t_1$  is empty then return  $t_2$ 
|   else if  $t_2$  is empty then return  $t_1$ 
|   else
|   |   curr= $t_2$ , parent=NULL
|   |   while left(curr) is not empty do      // find min element in  $t_2$ 
|   |   |   parent=curr
|   |   |   curr=left(curr)
|   |   end while
|   |   if parent≠NULL then
|   |   |   left(parent)=right(curr) // unlink min element from parent
|   |   |   right(curr)= $t_2$ 
|   |   end if
|   |   left(curr)= $t_1$ 
|   |   return curr                        // curr is new root
|   end if

```

## ❖ ... Joining Two Trees

Example tree join:



## ❖ Deletion from BSTs

---

Insertion into a binary search tree is easy.

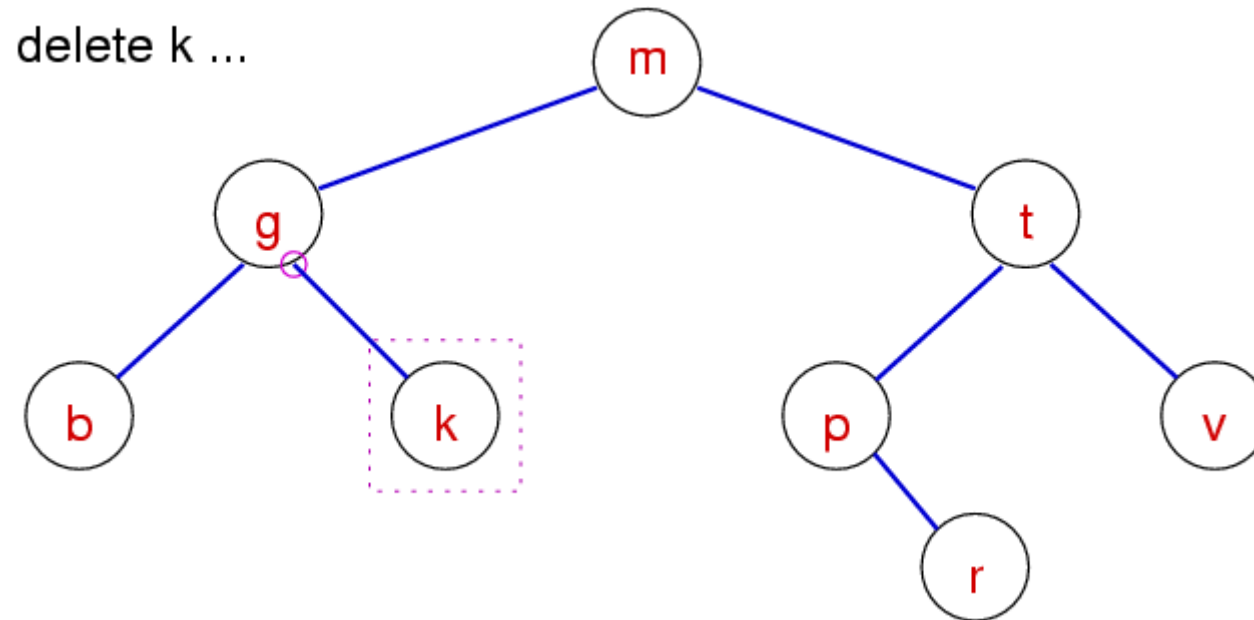
Deletion from a binary search tree is harder.

Four cases to consider ...

- empty tree ... new tree is also empty
- zero subtrees ... unlink node from parent
- one subtree ... replace by child
- two subtrees ... replace by successor, join two subtrees

## ❖ ... Deletion from BSTs

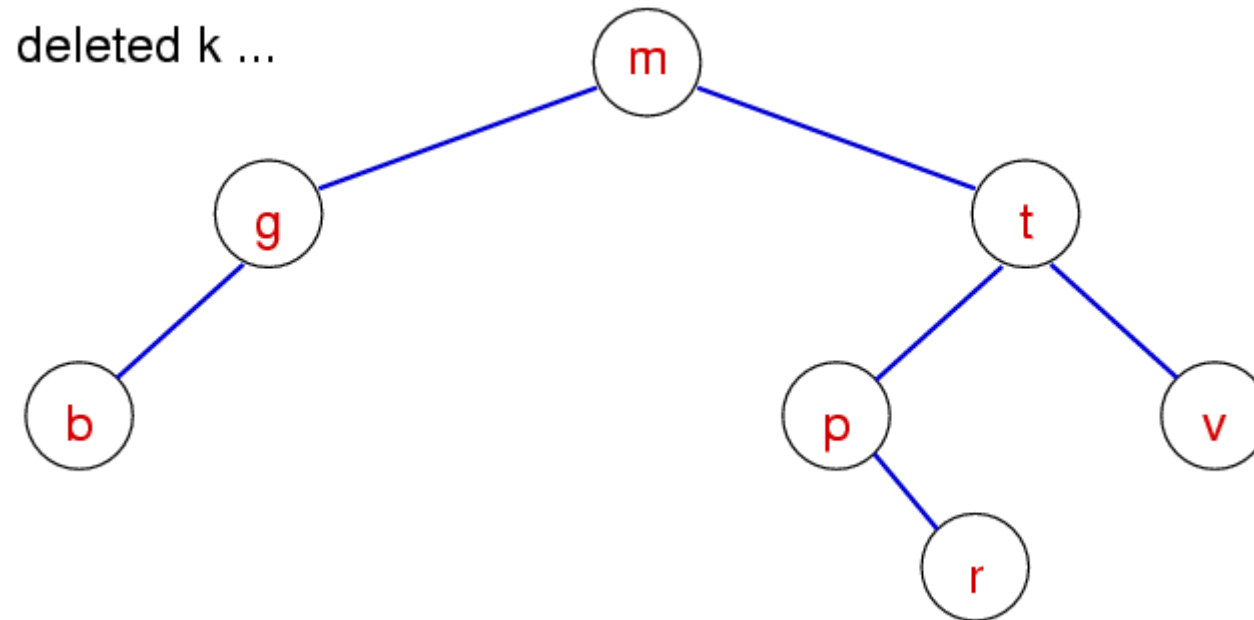
Case 2: item to be deleted is a leaf (zero subtrees)



Just delete the item

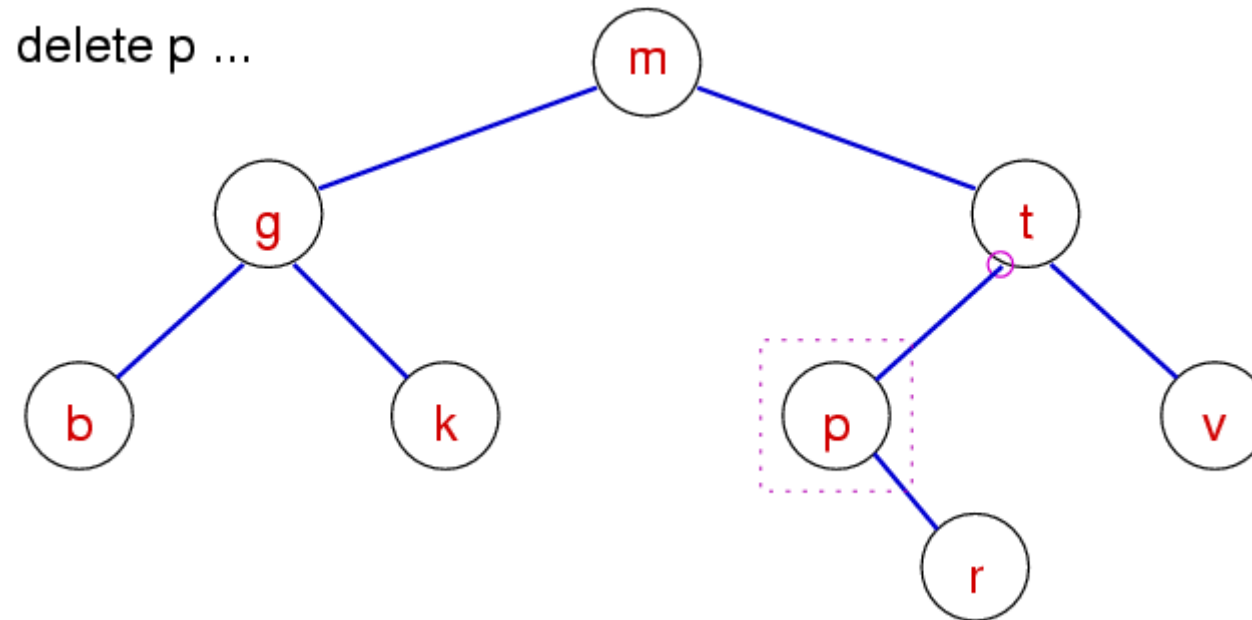
## ❖ ... Deletion from BSTs

Case 2: item to be deleted is a leaf (zero subtrees)



## ❖ ... Deletion from BSTs

Case 3: item to be deleted has one subtree

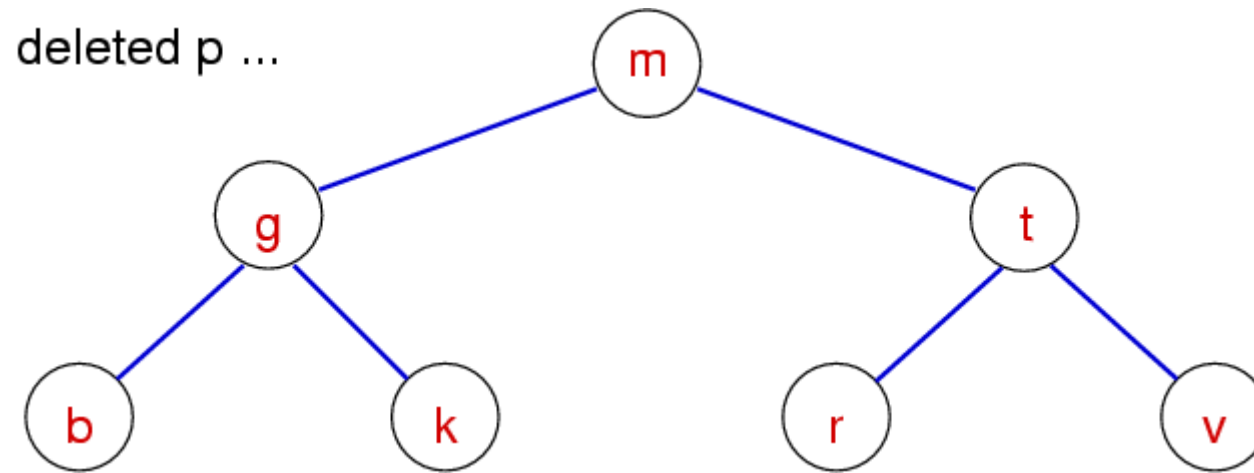


Replace the item by its only subtree



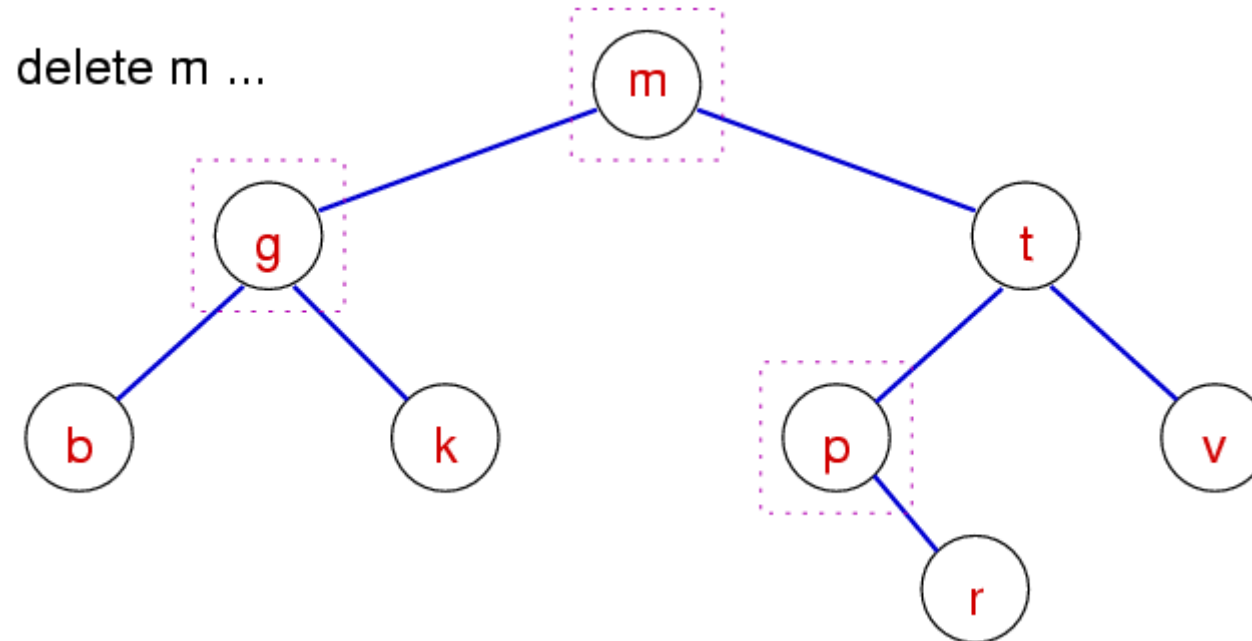
## ❖ ... Deletion from BSTs

Case 3: item to be deleted has one subtree



## ❖ ... Deletion from BSTs

Case 4: item to be deleted has two subtrees

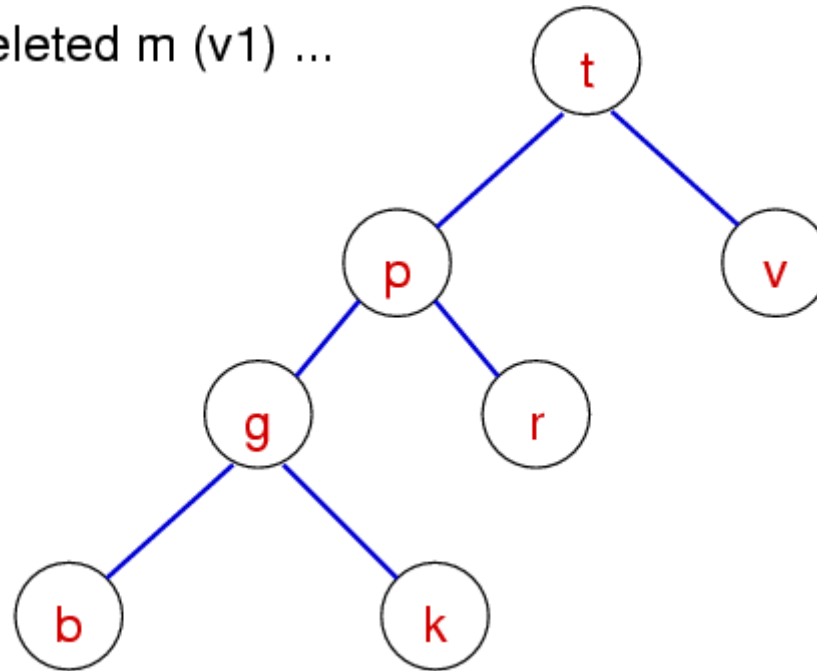


Version 1: right child becomes new root, attach left subtree to min element of right subtree

## ❖ ... Deletion from BSTs

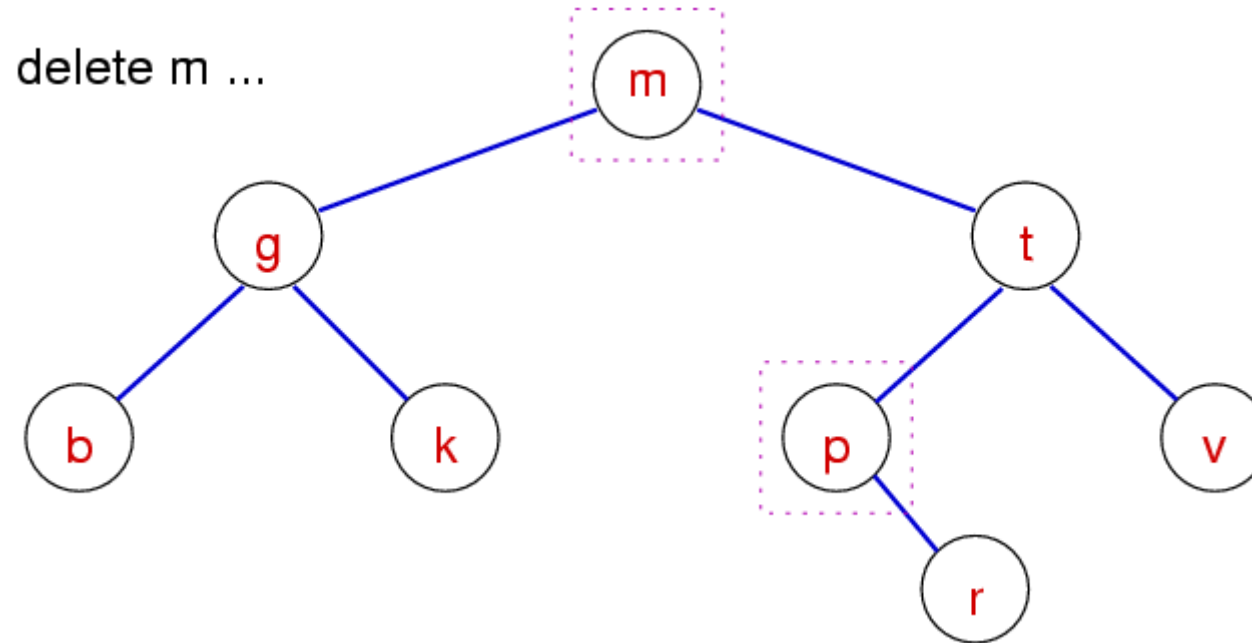
Case 4: item to be deleted has two subtrees

deleted m (v1) ...



## ❖ ... Deletion from BSTs

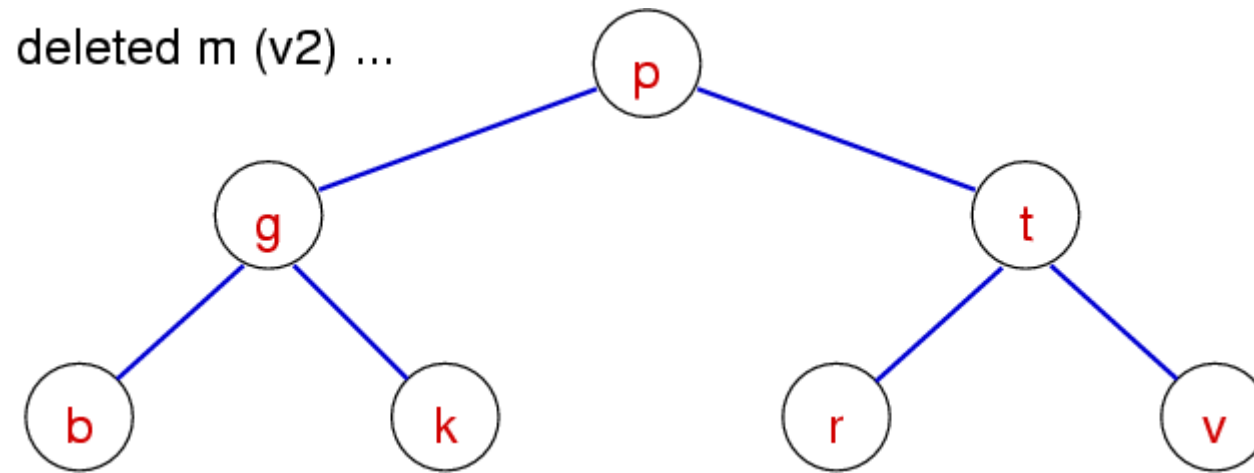
Case 4: item to be deleted has two subtrees



Version 2: *join* left and right subtree

## ❖ ... Deletion from BSTs

Case 4: item to be deleted has two subtrees



## ❖ ... Deletion from BSTs

Pseudocode (version 2):

```
TreeDelete(t,item):
|   Input  tree t, item
|   Output t with item deleted
|
|   if t is not empty then           // nothing to do if tree is empty
|   |   if item < data(t) then       // delete item in left subtree
|   |   |   left(t)=TreeDelete(left(t),item)
|   |   else if item > data(t) then  // delete item in right subtree
|   |   |   right(t)=TreeDelete(right(t),item)
|   |   else                         // node 't' must be deleted
|   |   |   if left(t) and right(t) are empty then
|   |   |   |   new=empty tree           // 0 children
|   |   |   else if left(t) is empty then
|   |   |   |   new=right(t)             // 1 child
|   |   |   else if right(t) is empty then
|   |   |   |   new=left(t)             // 1 child
|   |   |   else
|   |   |   |   new=TreeJoin(left(t),right(t)) // 2 children
|   |   |   end if
|   |   |   free memory allocated for t
|   |   |   t=new
|   |   end if
|   end if
|   return t
```

