

The background features a large, faint, light blue logo of the Technical University of Cluj-Napoca. The logo consists of a shield with a stylized 'T' and 'U' inside, with the text 'TECHNICAL UNIVERSITY' at the top, 'OF CLUJ-NAPOCA' in the middle, and 'Computer Science' at the bottom.

# Fundamental Algorithms

Lecture #6  
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Cluj-Napoca

Computer Science

# Agenda

- **Trees**
  - **Basic operations**
    - walk, search, insert, delete – review
    - walk iterative
    - min, max, pred, succ
  - **Special types**
    - **Balanced trees**
      - PBT (seminar #4)
      - AVL (SDA class + review here)
      - Red-Black (next lecture)
    - **Augmented Trees**
      - Order-statistic trees

# BST – walk, search, insert

- **Walk**

- pre/in/post-orders  **$O(n)$**  if  $O(1)$  outside recursive calls
- else apply master theorem

- **Search**

- **$O(n)$**  for BT
- **$O(h)$**  for BST,  $h \in [\lg n, n]$
- **$O(\lg n)$**  for **balanced** BST

- **Insert**

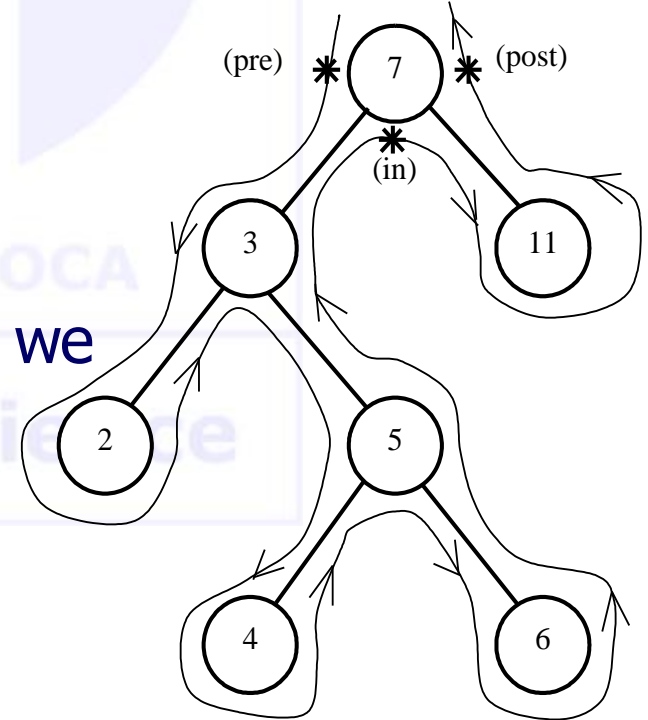
- **Search** for it and reach a leaf/1-child node (parent for the new node)
- Insert as **leaf** always, as child of the given leaf/1-child node

# Tree traversal – iterative version

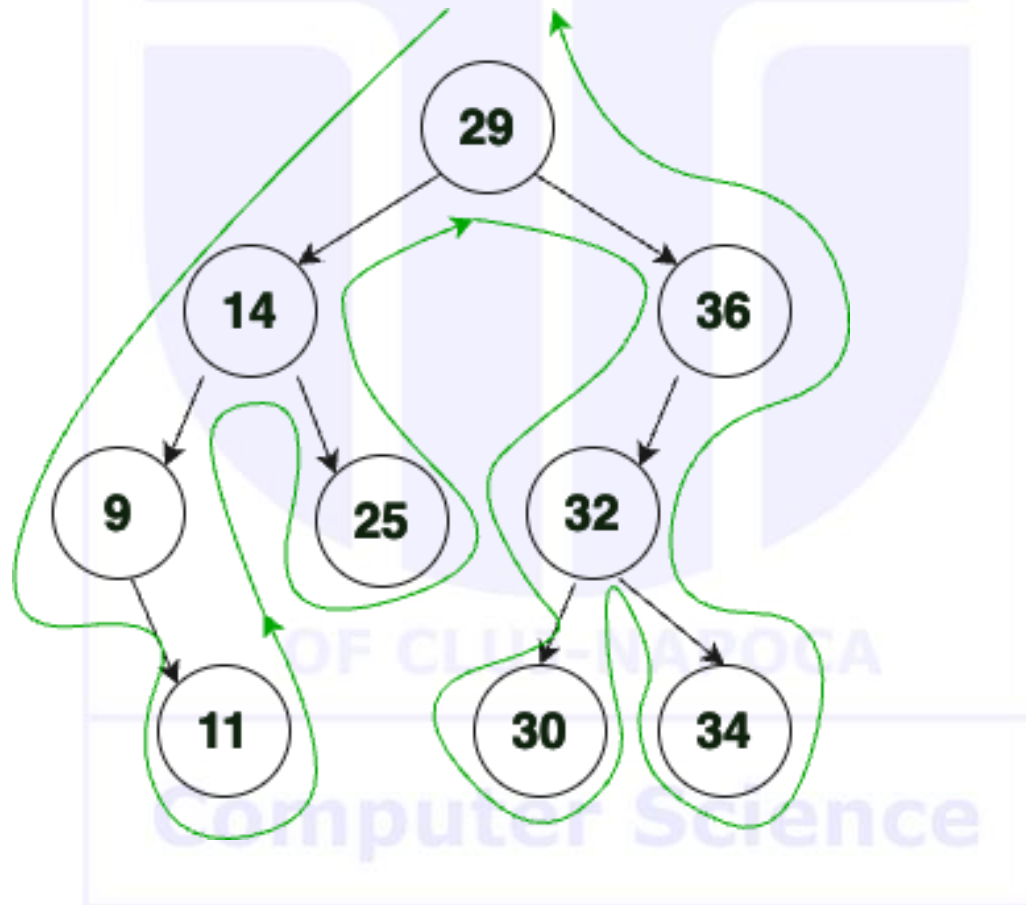
- **Any** recursive implementation can be rewritten iteratively
  - Using a stack is one possible approach
  - Without a stack?
    - if “keep track of the calls” + need parent link in the structure!
- IDEA: should remember where you are coming from (OR one pointer behind to “model” that), so:
  - Either: keep a “counter” to tell how many times you reach the node and act accordingly ...
  - Or: keep a pointer behind the current node (i.e. the previously visited node)

# BST – walk iterative

- Non-recursive traversal
  - No additional memory
  - No explicit stack
- Needs parent pointer in the structure
- Should keep track of the advancement (WHERE we are on the track)
  - Top -> down (pre)
  - Left -> root (in)
  - Right -> root (post)
- We can keep track of the DIRECTION we are:
  - top->down = #1
  - left -> root = #2
  - right -> root = #3



# BST – walk iterative - contd



# Tree traversal – iterative version – contd.

```

d<-1 //initialize d to 1 before you call it on your Tree (on main)
printTree(T)
node<-root[T]
repeat
  if d = 1 then //without else branch & //here print in preord
    if left[node] != NIL
      then node <- left[node] //advance to the left with direction still 1
      else d<-2 //set dir to 2 as you meet node second time => advance to the right
  if d = 2 then //without else branch & //here print in inord
    if right[node] != NIL
      then node <- right[node]; d<-1 //advance to the right => FIRST time
      else d<-3 //set dir to 3 as you meet node 3rd time => advance to parent
  if d = 3 then //without else branch & //here print in postord
    if parent[node] != NIL // we are not done;
      then if node = left[parent[node]] //check the dir we are coming from
            then d<-2 //else remains on 3
            node<-parent[node] //advance to the parent
until (node=root[T] and d=3) // node=root[T] means parent[root]=nil
  
```

# BST – walk iterative - contd

```
printTree(T)
node<-root[T]
```

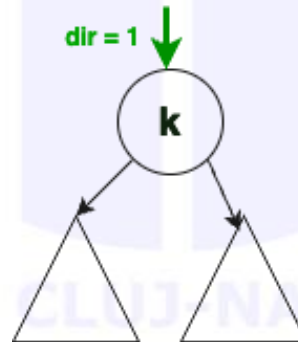
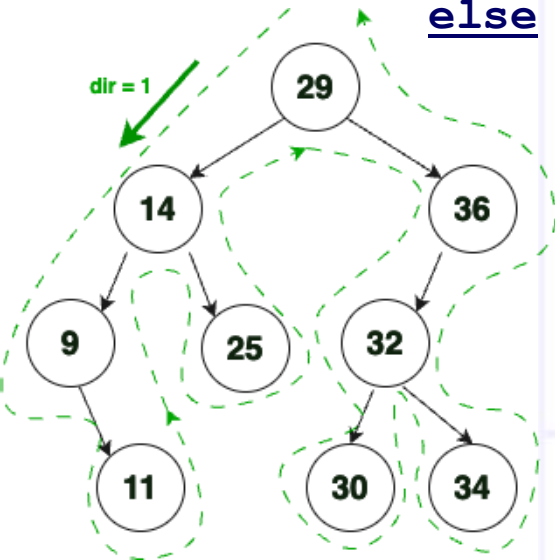
**repeat**

**if** d = 1 **then** //without else branch && //here print in *preord*

**if** left[node] != NIL

**then** node <- left[node] //advance to the left

**else** d<-2

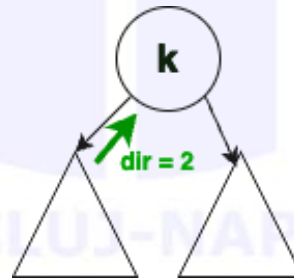
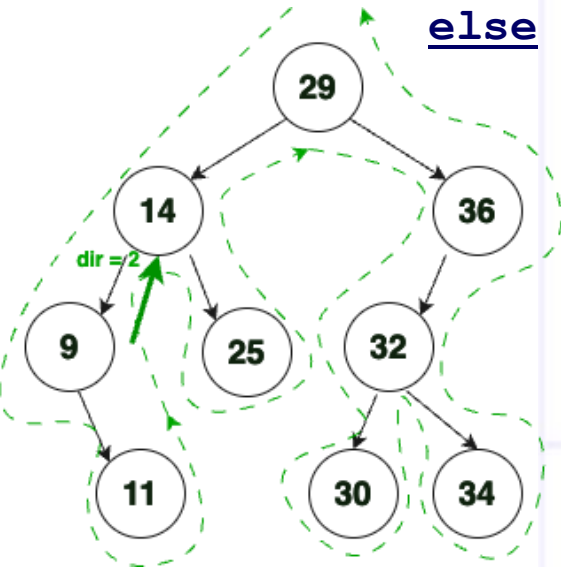


**until** (node=root[T] and d=3) //node=root[T] means parent[root]=nil



# BST – walk iterative - contd

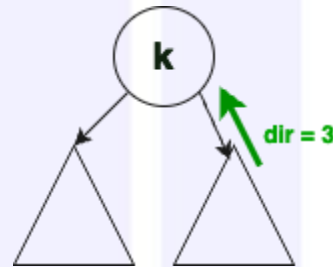
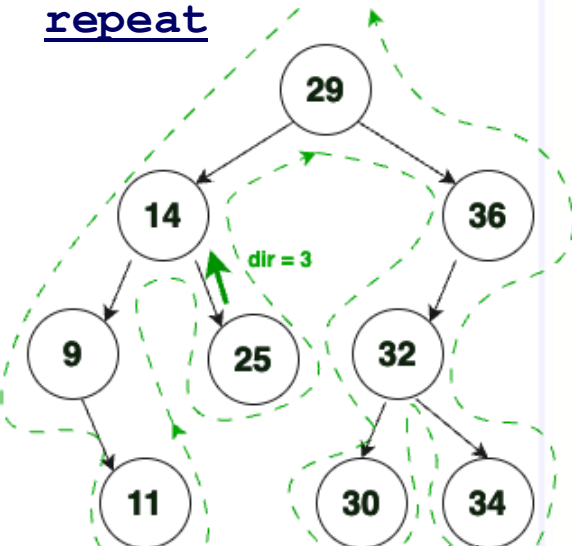
```
printTree(T)
node<-root[T]
repeat
  if d = 2 then //without else branch && //here print in inord
    if right[node]!=NIL
      then node <- right[node]; d<-1//advance to the right
      else d<-3
```



```
until (node=root[T] and d=3) //node=root[T] means parent[root]=nil
```

# BST – walk iterative - contd

```
printTree (T)
node<-root [T]
repeat
```

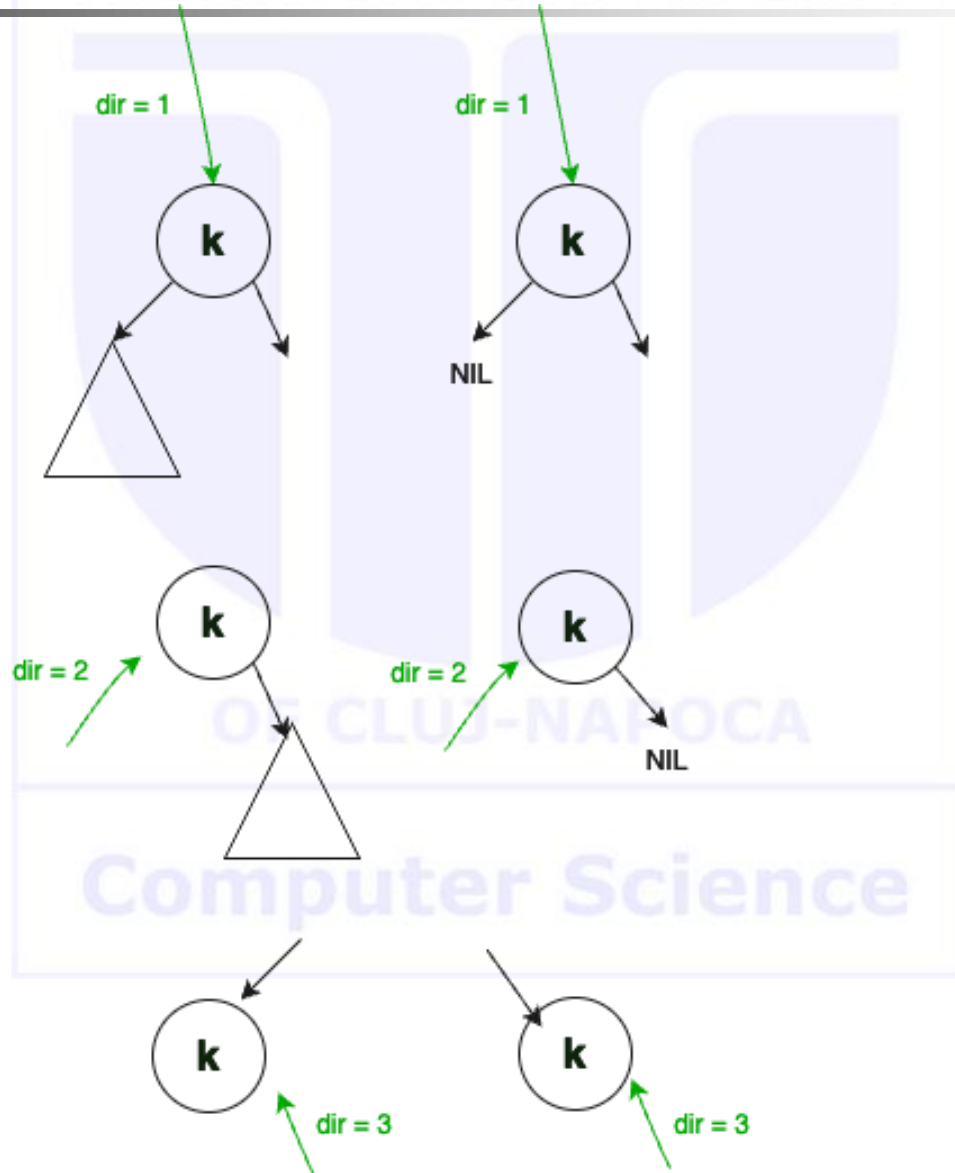


```
if d = 3 then //without else branch && //here print in postord
    if parent[node] !=NIL
        then
            if node = left[parent[node]]//check the dir we are coming from
                then d<-2
                node<-parent[node] //advance to the parent
until (node=root [T] and d=3) //node=root[T] means parent[root]=nil
```

# BST – walk iterative - contd

```
printTree (T)
node<-root[T]
repeat
  if d = 1 then //without else branch && //here print in preord
    if left[node] != NIL
      then node <- left[node] //advance to the left
      else d<-2
  if d = 2 then //without else branch && //here print in inord
    if right[node] != NIL
      then node <- right[node]; d<-1//advance to the right
      else d<-3
  if d = 3 then //without else branch && //here print in postord
    if parent[node] != NIL
      then
        if node = left[parent[node]]//check the dir we are coming from
          then d<-2
        node<-parent[node] //advance to the parent
until (node=root[T] and d=3)//node=root[T] means parent[root]=nil
```

# BST – walk iterative - contd



# BST - delete

- Remove the node
- Cases:
  - Leaf – remove it
  - 1-child node – link parent with the only child
  - 2-children nodes
    - Chain the tree (fast, unbalances the tree)
    - Replace the node with an appropriate one (content of predecessor/successor), and remove (the location of) that one (same time, better balance)

# BST – delete - code

```
tree_delete(T, z)           //z=node to delete; y physically deleted
if left[z]=nil or right[z]=nil
    then y<-z                //Case 1 OR 2; z has at most 1 child => del z
    else y<-tree_successor(z) //find replacement=min(right)
if left[y]<>nil                //we are in Case 2; y is a single child node
    then x<-left[y]           //y has no child to the right; x=y's child
    else x<-right[y]          //case 2 or 3. Why?
if x<>nil                     //y is not a leaf;
    then p[x]<-p[y]            // y's child redirected to y's parent = x's parent
    //becomes the former single (why?) grandparent
if p[y]=nil                   //means y were the root
    then root[T]<-x            //y's child becomes the new root
    else if y=left[p[y]]      //link y's parent to x which becomes its child
        then left[p[y]]<-x
        else right[p[y]]<-x
return[y]                     //outside the procedure: copy y's info into z; dealloc y
```

# BST – delete - eval

- Find node to delete  $O(h)$
- Find successor/predecessor  $O(h)$
- BUT:
  - if finding node to delete takes  $O(h) \Rightarrow$  the node is a leaf  $\Rightarrow$  case 1  $\Rightarrow$  no succ needed
  - if node to delete not a leaf, succ searched from that place down  $\Rightarrow$  find node+find succ= $O(h)$
- Delete takes only  $O(h)$

## Find-min/max $O(h)$

- Root's leftmost/rightmost leaf in the tree rooted at x;

***find\_tree\_min(x)*** //x=root;

```
while left[x] <> nil  
do   x <- left[x]  
return x
```

Q: what if left[x]=nil?

***find\_tree\_max(x)*** //x=root;

```
while right[x] <> nil  
do   x <- right[x]  
return x
```

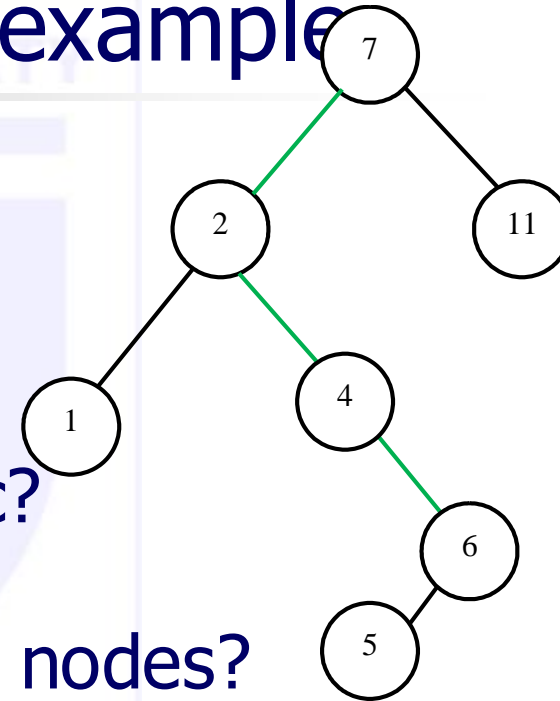


# Find-pred/succ

- $\text{pred} = \text{max in the left subtree} \Rightarrow$   
*find\_tree\_max(left[x])*
- $\text{succ} = \text{min in the right subtree}$   
*find\_tree\_min(right[x])*
- Any other situation possible?
  - What if the node has no left/right subtree?  
Possible?
  - It has no pred/succ?
  - Not necessarily: counterexample!

# Find-pred/succ- counterexample

- 6 has no right child.
- It means it has no successor?
  - False! 7 is its successor!
- 5 has no left/right child.
- It means it has no predecessor/succ?
  - False! 4 is its predecessor/6 its pred!
- How can we find pred/succ for such nodes?



(identify the property such nodes possess)

succ=lowest level ancestor whose left child is an ancestor as well

pred=lowest level ancestor whose right child is an ancestor as well

Determine (for succ) a triangle:

node-upwards while on a right child link

the first time the node is a left child= it is the succ node

# Find-succ-code

***find\_tree\_successor(x)*** //returns x's successor

if right[x] <> nil //regular case; the succ belongs to the same subtree  
then return *find\_tree\_min(right[x])*

y <- p[x] //y keeps a pointer 1 level above x

while y <> nil and x = right[y]

// as long as we haven't reached the root and not changed the direction

// along the upwards path, go upwards 1 level

do x <- y

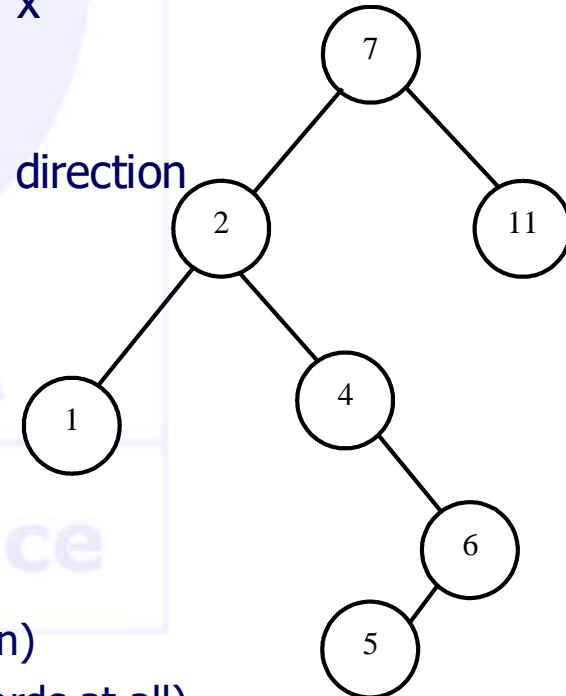
y <- p[y]

return y

Note: 2's successor is 4 (in find\_tree\_min)

6's successor is 7 (take **while twice** and change direction)

5's successor is 6 (0 while, exit while without going upwards at all)



## Find-succ $O(h)$

- Cases:
  - *find\_tree\_min(right[x])* , worst case:  $x = \text{root}$ , succ lowest leaf  $\Rightarrow O(h)$
  - $x$  has no right child; worst case:  $x = \text{leaf}$  on the lowest level, direction changes at the root level  $\Rightarrow$  succ root of the tree  $\Rightarrow O(h)$
- *find\_tree\_successor*  $O(h)$
- Find the predecessor is symmetric (change right with left and min with max) -

## Homework

# BST-eval

- Theorem: All operations in a BST (except traversal) take  $O(h)$
- Adv: faster than on lists!
- Limitation:  $h$ ? Worst case  $h=n$  (why?)  
Therefore, no improvement at all!
- Enhancement?
  - **Balanced trees!**

# Balanced trees

- Augmented BST to keep the height under control
- No matter the balance type, the height is proportional to  $\lg n$  ( **$c \cdot \lg n$** , with  $c \geq 1$ , but  $c$  a SMALL CONSTANT)
- The best possible balanced trees – PBT (perfect balanced trees) – seminar #4
- many other possibilities (for balance)

# Balanced trees - PBT

- Perfect Balanced Trees = BST + balance (nodes rel)
- Any subtree of a PBT is a PBT as well!
- Balance refers to nb of nodes, not to heights
- $b = n_R - n_L \in \{-1, 0, 1\}$
- $h = \lg n$
- Insert  $O(n)$ : **ins** as in regular BST  $O(h) = O(\lg n)$   
**but** requires  $n$  rotations to rebalance  
 $\Rightarrow O(n)$
- Delete  $O(n)$ : **del** as for regular BST  $O(h) = O(\lg n)$   
**but** requires  $n$  rotations  $\Rightarrow O(n)$
- Best  $h$  property; difficult (costly) to maintain
- Discussion: when should be use PBTs?

# Balanced trees - AVL

- AVL = BST + balance (height related)
- Any subtree of an AVL tree is an AVL tree as well!
- (AVL=Adelson-Velskii, Landis)
- Balance on height  $b = h_R - h_L \in \{-1, 0, 1\}$
- PBTs are AVLs. Why? Discussion!
- Most unbalanced out of AVL=Fibonacci trees (i.e. nb of left/right nodes specified by fib. numb.)

$$F_n = F_{n-1} + F_{n-2} + 1 \text{ (} b = -1 \text{ in every node)}$$



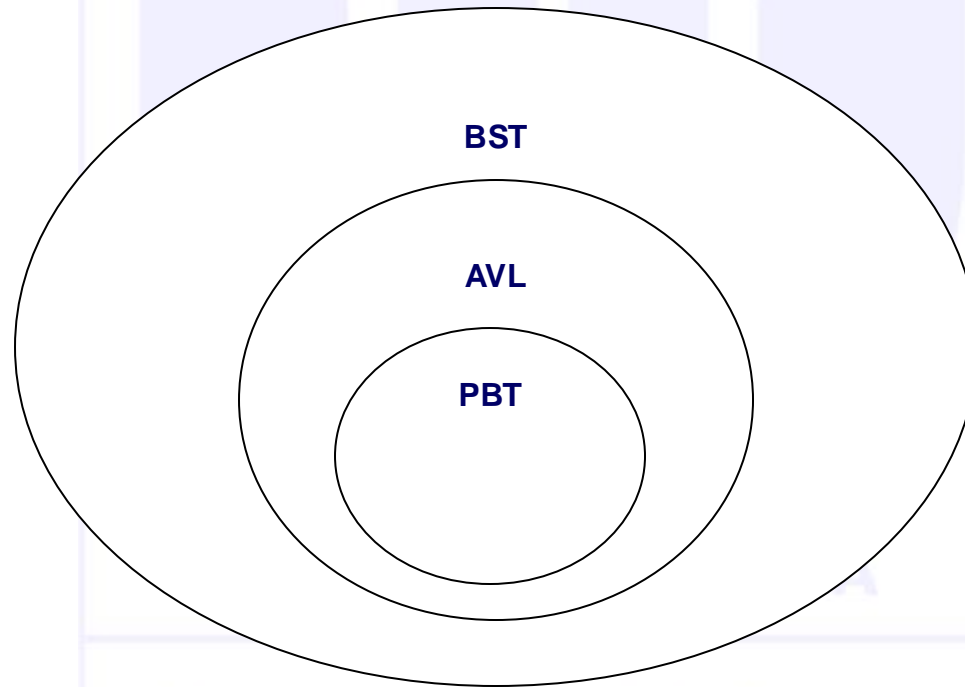
# Balanced trees - AVL

- Insert  $O(h)$ : **ins** as in regular BST  
 $O(h) = O(\lg n)$   
requires at most **1/2 rotations  $O(1)$**
- Delete  $O(h + \lg n)$ : **del** as from a regular BST  
 $O(h) = O(\lg n)$   
requires at most  **$\lg n$  rotation  $O(\lg n)$**
- $h \leq 1.45 \lg n \Rightarrow$  Good height property;
- easy to maintain for insertion;
- deletion might make many changes in the structure
- Discussion: when should be use AVL trees?

# AVL – rotations

- Preserve the search property
- Ensure the balance property
- Self-balancing:
  - Single rotation (see pictures)
  - Double rotation (see pictures)
  - Both take JUST  $O(1)$  => do NOT impact the regular insert
- After an insertion, at MOST 1 rotation may occur. Discussion.
- No other situation may occur. Why? Justification.
- After a rotation, the **NEXT** insertion along the same branch would **NOT** require a self-balancing (rotation)
- The same rotations are used for Red-Black trees (see next lecture)!

# BST-balanced trees relationship



Computer Science

# Augmented DS

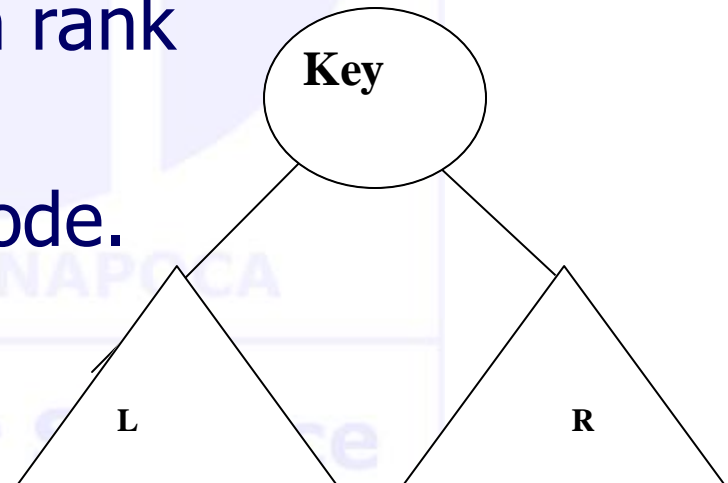
- Augmented = additional property and/or behavior to help (i.e. speed up) various tasks preserving ALL existing properties and behavior with (at least) the SAME performance
- Balanced BST are augmented trees (objective, keep the height under control)
- Current objective = better (=faster) select operations on BST
- **Order Statistic (OS) Tree**
- Augmentation= store at the node level as additional information the dimension of the tree (i.e. the number of nodes in the tree rooted by the given node)
- $\text{dim}[x] = \text{dim}[\text{left}[x]] + \text{dim}[\text{right}[x]] + 1$
- How is calculated? (if the information is not already stored?) – postorder.

# Augmented DS – contd.

- How to maintain this information for the basic tasks (search, insert, delete, traversal, update)?
- What operations are improved?
- Other tasks: Selection and Ranking
  - Selection ( $i^{\text{th}}$  selection) = find the node which is the  $i^{\text{th}}$  one in inorder traversal
  - Selection
    - in arrays – ordered? Not ordered?
    - in lists – ordered.
    - in trees
  - Can we do better for BST?

# Selection

- Returns the  $i^{\text{th}}$  smallest key in the tree
  - rank given ( $i$ )
  - key returned (pointer to the  $i^{\text{th}}$  smallest key in the tree)
- Input: rank (i.e. index in inorder),
- Output: node with the given rank
- Augmentation: dimension =  
=nb of nodes rooted by the node.
- $\text{dim}[x] = \text{dim}[\text{left}[x]] + \text{dim}[\text{right}[x]] + 1$
- $\text{dim}[\text{nil}] = 0$



# OS Select $O(h)$

Initial call with  $\text{root}(T)$  and returns pointer to the  $i^{\text{th}}$  key

What procedure does it resemble? What differs?

## **OS\_Select(x, i)**

$r \leftarrow \text{dim}[\text{left}[x]] + 1$  // number of nodes on the left + root

if  $i = r$  // found it

then return  $x$

else if  $i < r$  //  $i^{\text{th}}$  smallest is on the left

then

return  $\text{OS\_Select}(\text{left}[x], i)$

else //  $i^{\text{th}}$  smallest is on the right

return  $\text{OS\_Select}(\text{right}[x], i - r)$

# Ranking

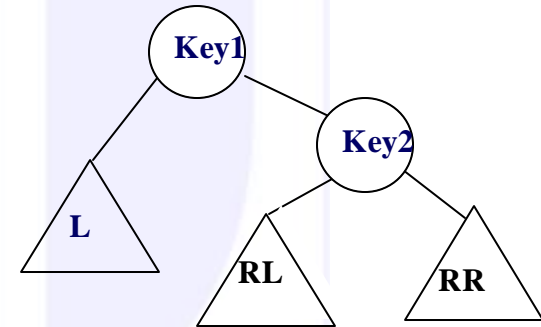
- Reverse problem:
  - key given
  - rank returned
- Input:
  - given an existing key from the tree (that is, a pointer to the node containing that key)
- Output:
  - Return its rank in the tree (i.e. its position in the inorder walk)
  - Rank = nb of keys smaller than the checked key in the tree. Approach: count them all (all before = all to left)



## Ranking – contd.

**Case #1 node is a right child** of its parent (Ex: rank Key2)

$$\text{rank}(\text{Key2}) = \text{dim}(\text{RL}) + 1 + \text{dim}(\text{L}) + 1$$



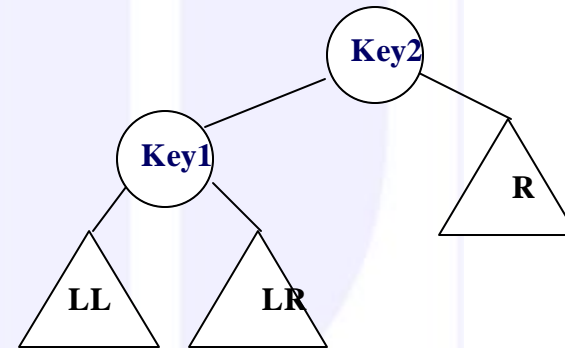
While going upwards in the tree, evaluate what type of child the current node is:

- if a right child (case #1)

**Count the nb of nodes in any subtree to the left of the branch starting from the current node (x) up to the root (T)**

# Ranking – contd.

**Case #2 node is a left child** of its parent (Ex: rank Key1)  
 $\text{rank}(\text{Key1}) = \text{dim}(\text{LL}) + 1$



While going upwards in the tree, evaluate what type of the child the current node is:

- if a left child (case #2)

**Count the nb of nodes in any subtree to the left of the branch starting from the current node (x) up to the root (T)**

# OS Rank $O(h)$

***OS\_Rank (T, x)***

```
r<-dim[left[x]]+1
```

```
y<-x
```

```
while y<>root[T]
```

```
do
```

```
  if y=right[p[y]]
```

```
  then
```

//case #1

```
    r<-r+ dim[left[p[y]]]+1
```

//case #2 (do nothing)

```
  y<-p[y]
```

```
return r
```

# Augmented trees (by dimension)

- Evaluation (performance for select and rank)
- Worst case  $O(h)$
- For balanced trees  $h = \lg n \Rightarrow O(\lg n)$
- OS trees are Red-Black Trees (RBT – check lecture #7)
- What happens (what changes in the tree, besides the regular info/tasks specific to RBT) when updates occur
  - Insert? Discussion/Analysis
  - Delete? Discussion/Analysis

# Required Bibliography

- From the Bible – Chapter 12 (Binary Search Trees), Section 14.1 (Dynamic Order Statistics)