

Searching.

DS 2018/2019

Content

The search problem

Binary search

Binary search trees

Balanced search trees

The search problem

- ▶ The static aspect:
 - ▶ U the universe set, $S \subseteq U$
 - ▶ the search operation:
 - ▶ Instance: $a \in U$
 - ▶ Question: $a \in S$?
- ▶ The dynamic aspect:
 - ▶ the insert operation
 - ▶ Input: $S, x \in U$
 - ▶ Output: $S \cup \{x\}$
 - ▶ the delete operation
 - ▶ Input: $S, x \in U$
 - ▶ Output: $S - \{x\}$

Searching in linear lists - complexity

Data type	Implementation	Search	Insertion	Deletion
Linear list	Arrays	$O(n)$	$O(1)$	$O(n)$
	Linked lists	$O(n)$	$O(1)$	$O(1)$
Ordered list	Arrays	$O(\log n)$	$O(n)$	$O(n)$
	Linked lists	$O(n)$	$O(n)$	$O(1)$

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Binary search: the static aspect

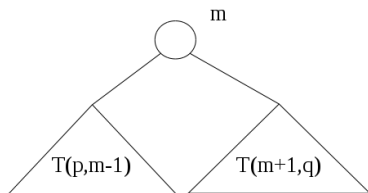
- ▶ The universe set is totally ordered: (U, \leq)
- ▶ The used data structure:
 - ▶ the array $s[0..n-1]$
 - ▶ $s[0] < \dots < s[n-1]$

The binary search: the static aspect

```
Function  $pos(s[0..n-1], n, a)$   
begin  
     $p \leftarrow 0; q \leftarrow n - 1$   
     $m \leftarrow (p + q)/2$   
    while  $(s[m] \neq a \text{ and } p < q)$  do  
        if  $(a < s[m])$  then  
             $q \leftarrow m - 1$   
        else  
             $p \leftarrow m + 1$   
             $m \leftarrow (p + q)/2$   
        if  $(s[m] = a)$  then  
            return  $m$   
        else  
            return  $-1$   
end
```

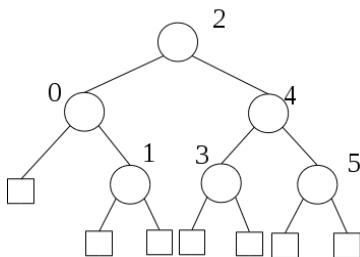
The binary tree associated to the binary search

$$T(p, q)$$



$$T = T(0, n-1)$$

$$n = 6$$



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Binary search: the dynamic aspect

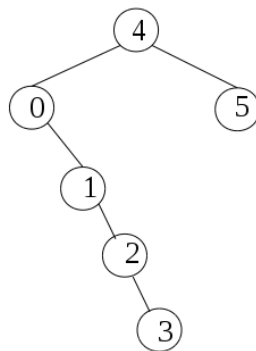
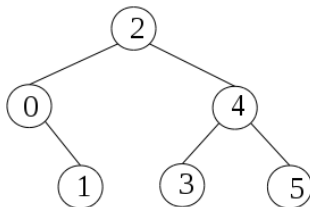
The set S suffers update operations (insertion / deletion).

The binary search tree:

- ▶ In any node \mathbf{v} it is stored a value from a totally ordered set.
- ▶ The values stored in the left subtree of \mathbf{v} are lower than the value of \mathbf{v} .
- ▶ The value of \mathbf{v} is less than the values stored in the right subtree of \mathbf{v} .

Binary search trees

- ▶ The binary search tree associated with a key set is not unique.



Binary search trees: sorting

- Inorder traversal

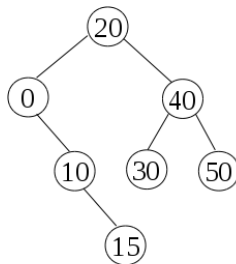
Function *inorder*(*v*, *visit*)
begin

if (*x* == *NULL*) **then**
 return

else
 inorder(*v* → *stg*, *visit*)
 visit(*v*)
 inorder(*v* → *drp*, *visit*)

end

- Time complexity: $O(n)$



Binary search trees: searching

Function $poz(t, x)$

begin

$p \leftarrow t$

while $(p \neq NULL \text{ and } p \rightarrow val \neq x)$ **do**

if $(x < p \rightarrow val)$ **then**

$p \leftarrow p \rightarrow stg$

else

$p \leftarrow p \rightarrow drp$

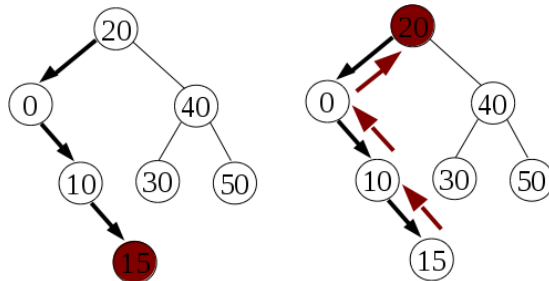
return p

end

- ▶ Time complexity: $O(h)$, h the height

Predecessor/Successor

- ▶ Modify the search operation: if the searched value x is not in the tree, then return:
 - ▶ either the highest value $< x$ (predecessor),
 - ▶ either the smallest value $> x$ (successor).



the predecessor of 18

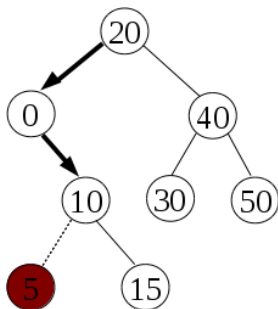
the successor of 18

Successor

```
Function successor(t)  
begin  
  if ( $t \rightarrow drp! = NULL$ ) then  
    /*min( $t \rightarrow drp$ )*/  
     $p \leftarrow t \rightarrow drp$   
    while ( $p \rightarrow stg! = NULL$ ) do  
       $p \leftarrow p \rightarrow stg$   
    return  $p$   
  else  
     $p \leftarrow t \rightarrow pred$   
    while ( $p! = NULL$  and  $t == p \rightarrow drp$ ) do  
       $t \leftarrow p$   
       $p \leftarrow p \rightarrow pred$   
    return  $p$   
end
```

Binary search trees: insertion

- ▶ Search in the tree the place to insert the new element (similarly with the search operation).
- ▶ Add the node with the new information, and the left subtree, respectively the right one is NULL.



Time complexity: $O(h)$, h the height of the tree.

Binary search trees: insertion

Procedure *insBinarySearchTree*(t, x)

begin

if ($t == \text{NULL}$) **then**

$\text{new}(t)$; $t \rightarrow \text{val} \leftarrow x$; $t \rightarrow \text{stg} \leftarrow \text{NULL}$; $t \rightarrow \text{drp} \leftarrow \text{NULL}$

else

$p \leftarrow t$

while ($p \neq \text{NULL}$) **do**

$\text{predp} \leftarrow p$

if ($x < p \rightarrow \text{val}$) **then** $p \leftarrow p \rightarrow \text{stg}$;

else

if ($x > p \rightarrow \text{val}$) **then** $p \leftarrow p \rightarrow \text{drp}$;

else $p \leftarrow \text{NULL}$;

if ($\text{predp} \rightarrow \text{val} \neq x$) **then**

if ($x < \text{predp} \rightarrow \text{val}$) **then**

 /* add x as left child of predp */

else /* add x as right child of predp */ ;

end

Binary search trees: elimination

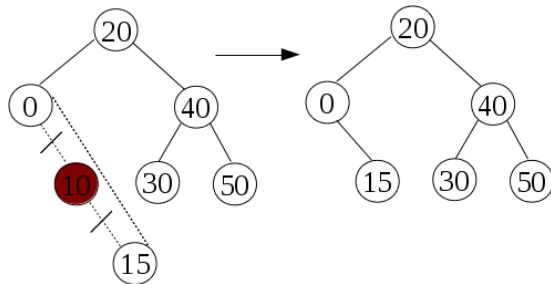
Search x in the tree t ; if it is found, then distinguish the following cases:

- ▶ Case 1: the node p which stores x has no children;
- ▶ Case 2: the node p which stores x has a single child;
- ▶ Case 3: the node p which stores x has both children.
 - ▶ Find the node q which stores the highest value y smaller than x (get down from p to the left and then to the right as much as possible).
 - ▶ Interchange the values from p and q .
 - ▶ Delete q as in case 1 or 2.

Time complexity: $O(h)$, h the height.

Binary search trees: elimination

► Case 2. Example.



Binary search trees: elimination

► Case 1 or 2

Procedure *elimCase1or2*(*t*, *predp*, *p*)

begin

if (*p* == *t*) **then**

 /* *t* becomes void or */

 /* the only child of *t* becomes the root */

else

if (*p* → *stg* == *NULL*) **then**

 /* replace in *predp*, *p* with *p* → *drp* */

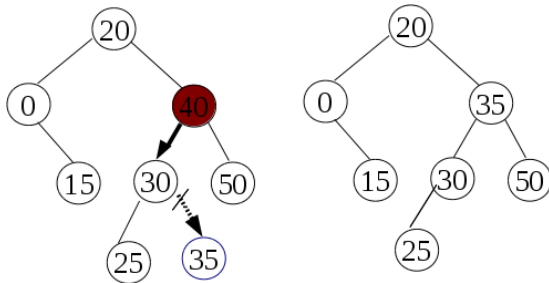
else

 /* replace in *predp*, *p* with *p* → *stg* */

end

Binary search trees: elimination

► Case 3. Example.



Binary search trees: elimination

Procedure *elimBinarySearchTree*(t, x)

begin

if ($t \neq \text{NULL}$) **then**

$p \leftarrow t$; $\text{predp} \leftarrow \text{NULL}$

while ($p \neq \text{NULL}$ and $p \rightarrow \text{val} \neq x$) **do**

$\text{predp} \leftarrow p$

if ($x < p \rightarrow \text{val}$) **then** $p \leftarrow p \rightarrow \text{stg}$;

else $p \leftarrow p \rightarrow \text{drp}$;

if ($p \neq \text{NULL}$) **then**

if ($p \rightarrow \text{stg} == \text{NULL}$ or $p \rightarrow \text{drp} == \text{NULL}$) **then**
 $\text{elimCase1or2}(t, \text{predp}, p)$

else

$q \leftarrow p \rightarrow \text{stg}$; $\text{predq} \leftarrow p$

while ($q \rightarrow \text{drp} \neq \text{NULL}$) **do**

$\text{predq} \leftarrow q$; $q \leftarrow q \rightarrow \text{drp}$

$p \rightarrow \text{val} \leftarrow q \rightarrow \text{val}$

$\text{elimCase1or2}(t, \text{predq}, q)$

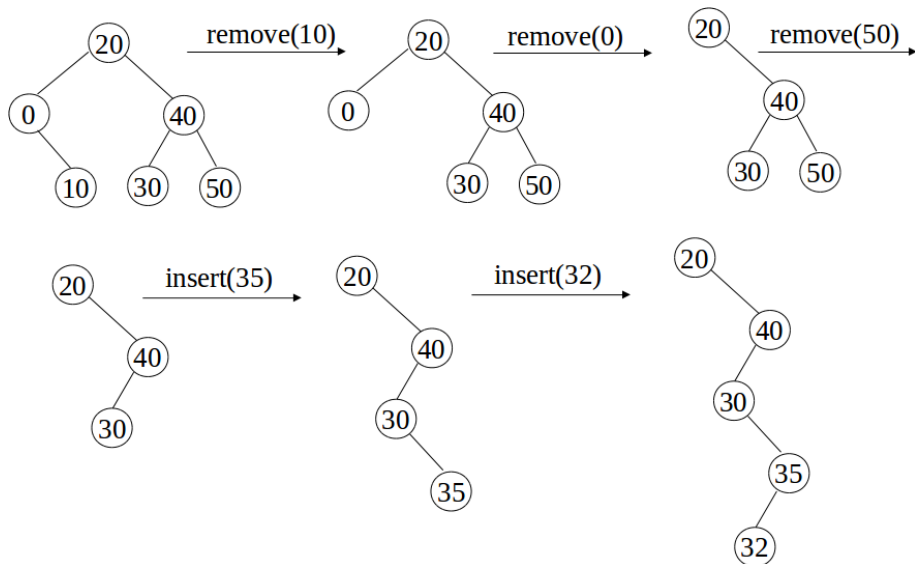
end

Binary search trees: analysis

Time complexity

- ▶ The worst case: $O(n)$, n elements
- ▶ The average case: $O(\log n)$

The degeneration of binary search in linear search



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Balanced search trees

Balanced search trees

- ▶ AVL trees (Adelson-Velsii and Landis, 1962)
- ▶ B trees/2-3-4 trees (Bayer and McCreight, 1972)
- ▶ Red-black trees (Bayer, 1972)
- ▶ Splay Trees (Sleator and Tarjan, 1985)
- ▶ Treaps (Seidel and Aragon, 1996)

Balanced search trees

- ▶ \mathcal{C} is a **class of balanced trees** if
for any tree t with n vertices from \mathcal{C} : $h(t) \leq c \log n$, c constant.
- ▶ \mathcal{C} is a class of balanced trees **$O(\log n)$ -stable** if
there are algorithms for the operations of search, insertion, deletion in $O(\log n)$, and the resulted trees belong to class \mathcal{C} .

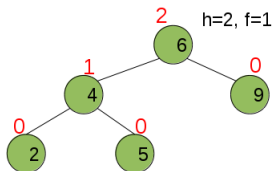
AVL trees

(G. **A**delson-**V**elskii, E.M. **L**andis 1962)

- ▶ A binary search tree t is a balanced **AVL tree** if for each vertex v ,

$$|h(v \rightarrow stg) - h(v \rightarrow drp)| \leq 1$$

- ▶ $h(v \rightarrow stg) - h(v \rightarrow drp)$ is called the **balancing factor**.
- ▶ Example:



▶ Lemma

If t is an AVL tree with n internal nodes then $h(t) = \Theta(\log n)$.

Proof. At class.

▶ Theorem

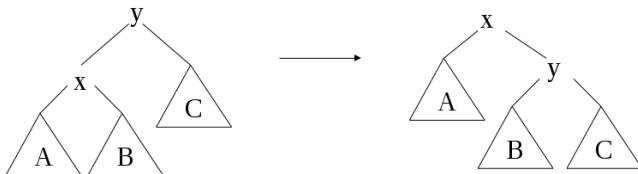
The class of AVL trees is $O(\log n)$ stable.

▶ The search/deletion algorithm

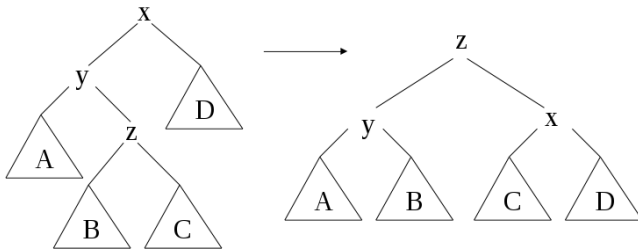
- ▶ The nodes have also saved the balancing factors $(-1, 0, 1)$.
- ▶ Store the path from the root to the added/deleted node in a stack ($O(\log n)$).
- ▶ Traverse the path stored in the stack in reverse order and rebalance the unbalanced nodes with one of the operations: left/right rotation simple/double ($O(\log n)$).

Rotations

Right rotation (simple)

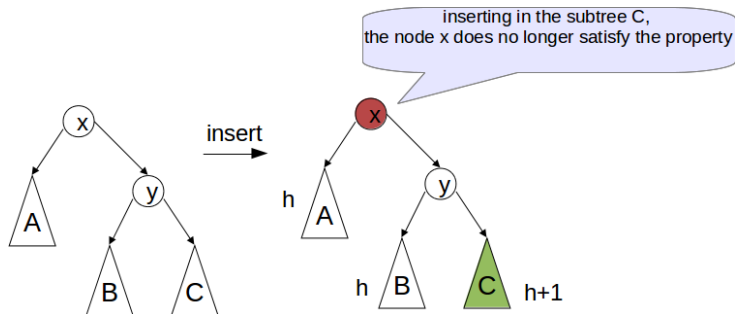


Double right rotation

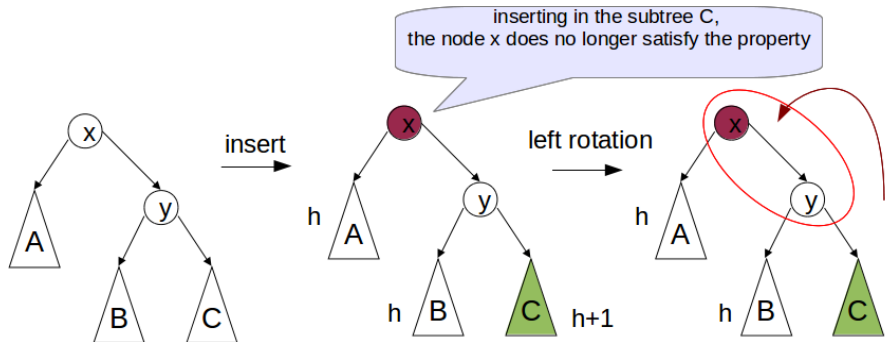


Similarly for simple left rotation, respectively for double left rotation.

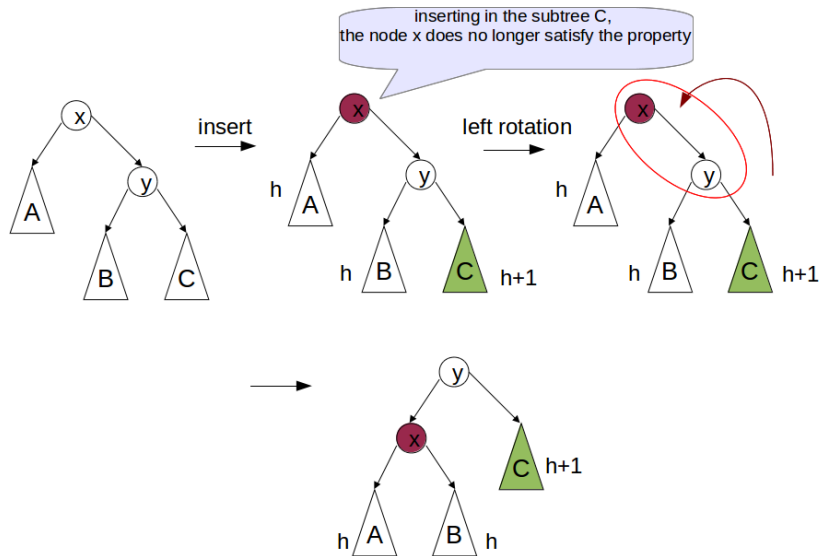
Simple left rotation



Simple left rotation (cont.)



Simple left rotation (cont.)



Simple left rotation

Procedure *leftRotation*(x)
begin

$y \leftarrow x \rightarrow drp$

$x \rightarrow drp \leftarrow y \rightarrow stg$

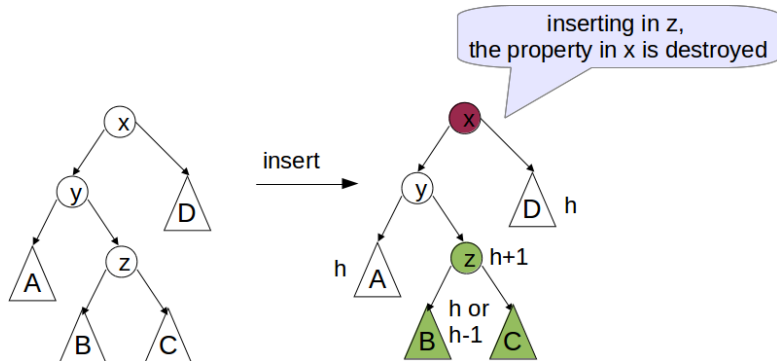
$y \rightarrow stg \leftarrow x$

return y

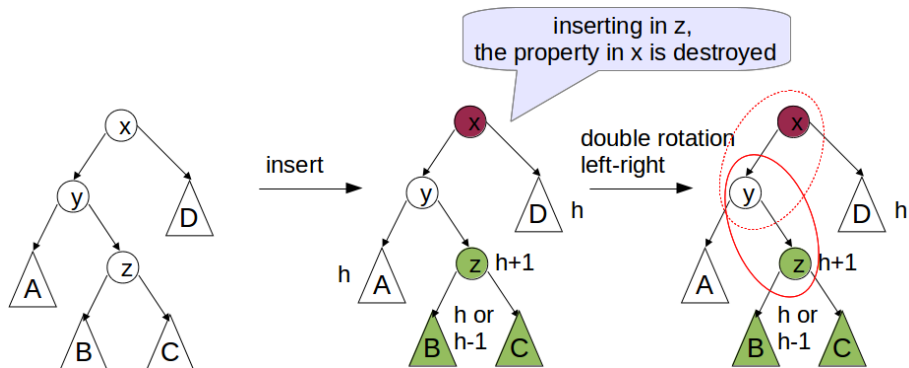
end

- ▶ Time complexity: $O(1)$

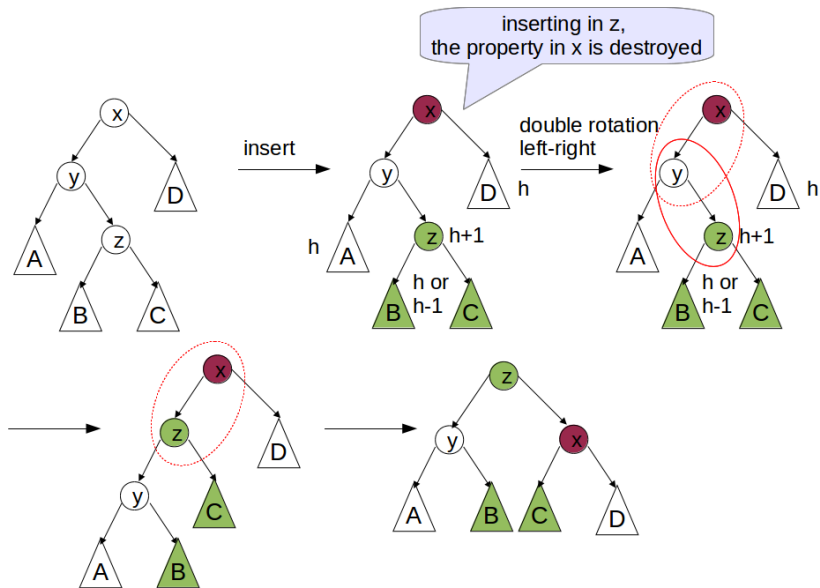
Double rotation



Double rotation (cont.)



Double rotation (cont.)



Insertion: algorithm

Procedure *balancing*(t, x)
begin

while ($x \neq \text{NULL}$) **do**

 /* update the height $h(x)$ */

if ($h(x \rightarrow \text{stg})) \geq 2 + h(x \rightarrow \text{drp}))$ **then**

if ($h(x \rightarrow \text{stg} \rightarrow \text{stg})) \geq h(x \rightarrow \text{stg} \rightarrow \text{drp}))$ **then**
 $\text{rightRotation}(t, x)$

else

$\text{leftRotation}(t, x \rightarrow \text{stg}); \text{rightRotation}(t, x)$

else

if ($h(x \rightarrow \text{drp})) \geq 2 + h(x \rightarrow \text{stg}))$ **then**

if ($h(x \rightarrow \text{drp} \rightarrow \text{drp})) \geq h(x \rightarrow \text{drp} \rightarrow \text{stg}))$ **then**
 $\text{leftRotation}(t, x)$

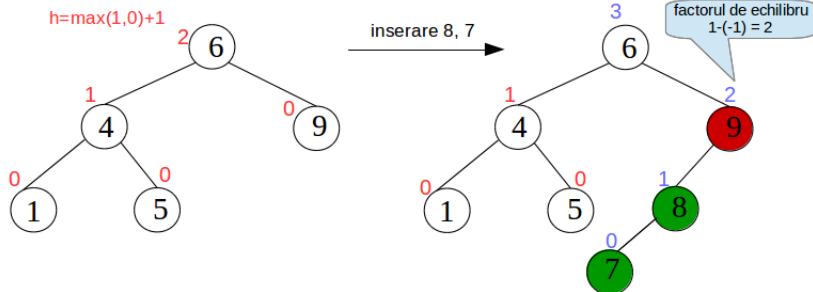
else

$\text{rightRotation}(t, x \rightarrow \text{drp}); \text{leftRotation}(t, x)$

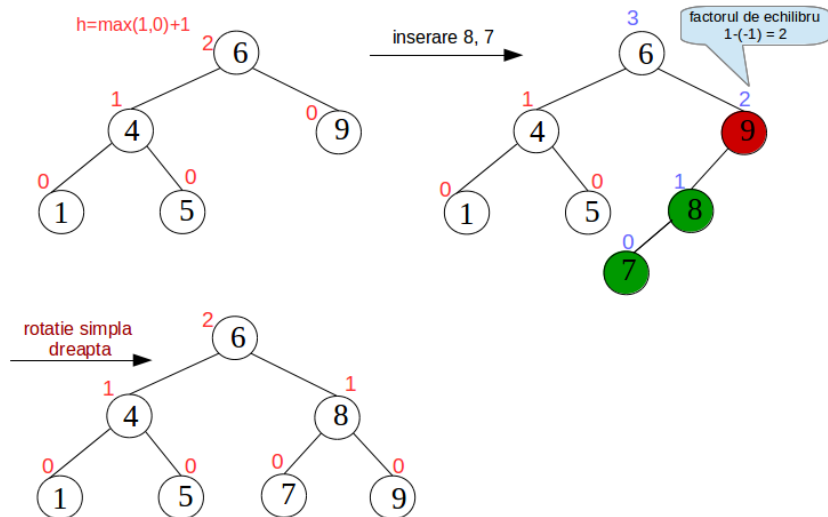
$x \leftarrow \text{pred}[x]$

end

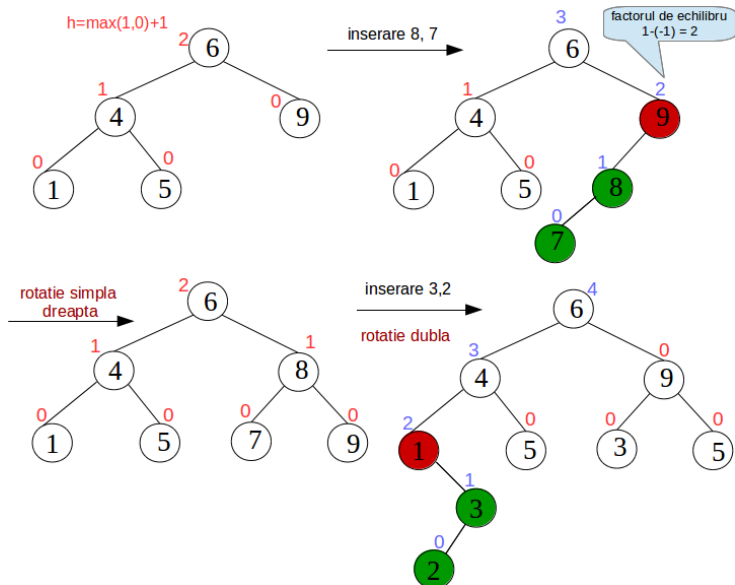
Example: insertion



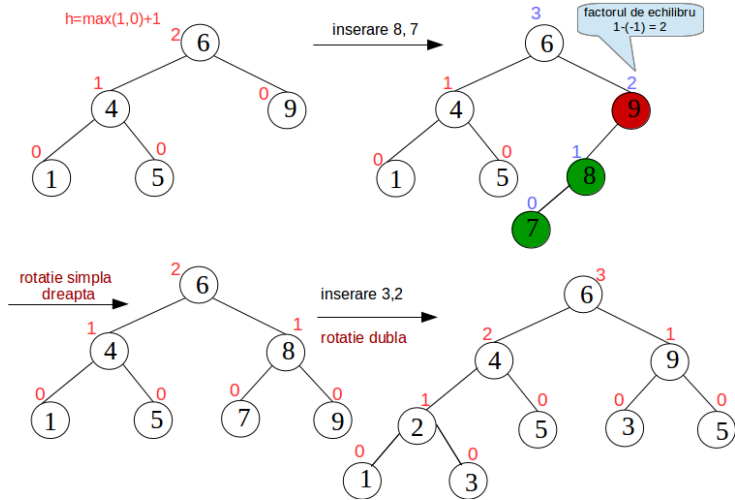
Exemplu: insertion (cont.)



Example: insertion (cont.)



Example: insertion (cont.)



Advantages/drawbacks of AVL trees

- ▶ Advantages:
 - ▶ Searching, insertion and deletion takes $O(\log n)$ complexity.
- ▶ Drawbacks:
 - ▶ Additional space for storing the height / the balancing factor.
 - ▶ The re-balancing operations are expensive.
- ▶ Are favorite when we are making more searches and fewer insertions and deletions
- ▶ Applications in Data Analysis, Data Mining