## Definition 15

AVL-trees are binary search trees that fulfill the following balance condition. For every node  $\boldsymbol{v}$ 

 $|\text{height}(\text{left sub-tree}(v)) - \text{height}(\text{right sub-tree}(v))| \le 1$ .

#### Lemma 16

An AVL-tree of height h contains at least  $F_{h+2} - 1$  and at most  $2^h - 1$  internal nodes, where  $F_n$  is the n-th Fibonacci number ( $F_0 = 0, F_1 = 1$ ), and the height is the maximal number of edges from the root to an (empty) dummy leaf.



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## Proof.

The upper bound is clear, as a binary tree of height h can only contain  $h^{-1}$ 

$$\sum_{j=0}^{h-1} 2^j = 2^h - 1$$

internal nodes.



## Proof (cont.)

## Induction (base cases):

- 1. an AVL-tree of height h = 1 contains at least one internal node,  $1 \ge F_3 1 = 2 1 = 1$ .
- 2. an AVL tree of height h = 2 contains at least two internal nodes,  $2 \ge F_4 1 = 3 1 = 2$



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An AVL-tree of height  $h \ge 2$  of minimal size has a root with sub-trees of height h - 1 and h - 2, respectively. Both, sub-trees have minmal node number.

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Let

 $f_h \coloneqq 1 + \min$  size of AVL-tree of height  $h \ .$ 

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#### Let

 $f_h := 1 + \text{minimal size of AVL-tree of height } h$  .

#### Then

An AVL-tree of height  $h \ge 2$  of minimal size has a root with sub-trees of height h - 1 and h - 2, respectively. Both, sub-trees have minmal node number.



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$$f_h - 1 = 1 + f_{h-1} - 1 + f_{h-2} - 1$$
, hence  
 $f_h = f_{h-1} + f_{h-2}$   $= F_{h+2}$ 

Since

$$F(k) \approx rac{1}{\sqrt{5}} \left(rac{1+\sqrt{5}}{2}
ight)^k$$
 ,

## an AVL-tree with n internal nodes has height $\Theta(\log n)$ .



## We need to maintain the balance condition through rotations.

For this we store in every internal tree-node v the balance of the node. Let v denote a tree node with left child  $c_{\ell}$  and right child  $c_r$ .

 $balance[v] := height(T_{c_{\ell}}) - height(T_{c_r})$ ,

where  $T_{c_{\ell}}$  and  $T_{c_r}$ , are the sub-trees rooted at  $c_{\ell}$  and  $c_r$ , respectively.



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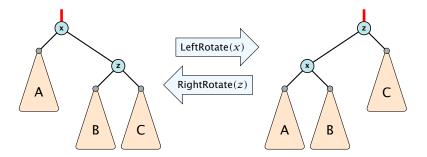
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# Rotations

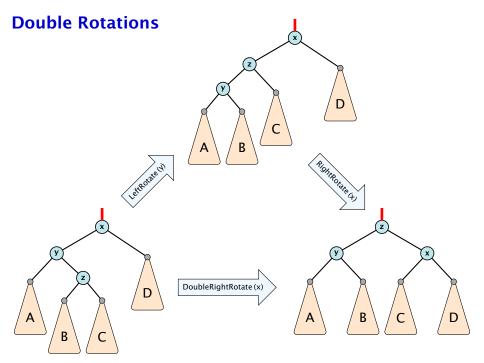
The properties will be maintained through rotations:





7.3 AVL-Trees

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Insert like in a binary search tree.



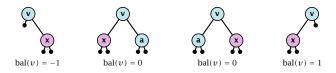
7.3 AVL-Trees

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- Insert like in a binary search tree.
- Let *v* denote the parent of the newly inserted node *x*.

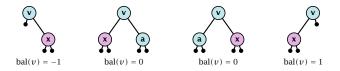


- Insert like in a binary search tree.
- Let *v* denote the parent of the newly inserted node *x*.
- One of the following cases holds:





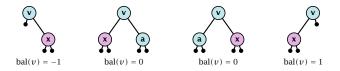
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- If  $bal[v] \neq 0$ ,  $T_v$  has changed height; the balance-constraint may be violated at ancestors of v.
- ► Call fix-up(parent[v]) to restore the balance-condition.

## Invariant at the beginning fix-up(v):

- 1. The balance constraints holds at all descendants of v.
- 2. A node has been inserted into  $T_c$ , where c is either the right or left child of v.
- 3.  $T_c$  has increased its height by one (otw. we would already have aborted the fix-up procedure).
- 4. The balance at the node c fulfills balance $[c] \in \{-1, 1\}$ . This holds because if the balance of c is 0, then  $T_c$  did not change its height, and the whole procedure will have been aborted in the previous step.



## Invariant at the beginning fix-up(v):

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## Algorithm 11 AVL-fix-up-insert(v)

- 1: **if** balance[v]  $\in$  {-2, 2} **then** DoRotationInsert(v);
- 2: if balance[v]  $\in$  {0} return;
- 3: AVL-fix-up-insert(parent[v]);

We will show that the above procedure is correct, and that it will do at most one rotation.



Algorithm 12 DoRotationInsert(v)	
1:	<b>if</b> balance[ $v$ ] = $-2$ <b>then</b>
2:	<b>if</b> balance[right[ $v$ ]] = $-1$ <b>then</b>
3:	LeftRotate $(v)$ ;
4:	else
5:	DoubleLeftRotate( $v$ );
6: <b>else</b>	
7:	<b>if</b> balance $[left[v]] = 1$ <b>then</b>
8:	RightRotate( $v$ );
9:	else
10:	DoubleRightRotate( $v$ );

# It is clear that the invariant for the fix-up routine holds as long as no rotations have been done.

We have to show that after doing one rotation all balance constraints are fulfilled.

We show that after doing a rotation at v:

- $\triangleright$  v fulfills balance condition.
- All children of v still fulfill the balance condition.
- The height of  $T_v$  is the same as before the insert-operation took place.

We only look at the case where the insert happened into the right sub-tree of v. The other case is symmetric.

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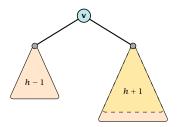
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We have the following situation:



The right sub-tree of v has increased its height which results in a balance of -2 at v.

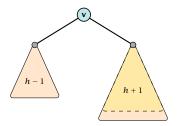
Before the insertion the height of  $T_v$  was h+1.



7.3 AVL-Trees

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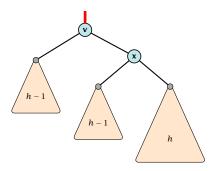
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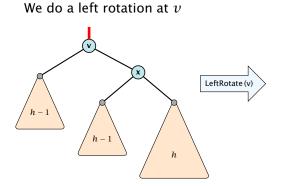
We do a left rotation at v



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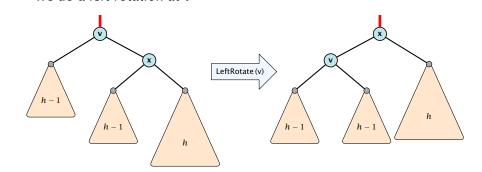




7.3 AVL-Trees

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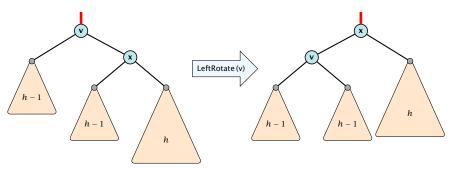
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7.3 AVL-Trees

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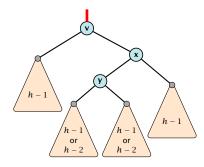


We do a left rotation at v

Now,  $T_v$  has height h + 1 as before the insertion. Hence, we do not need to continue.

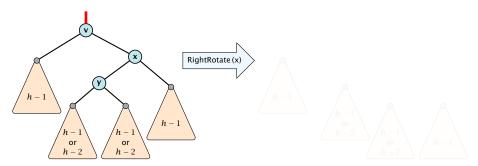




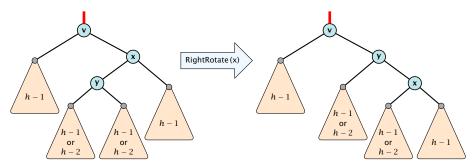




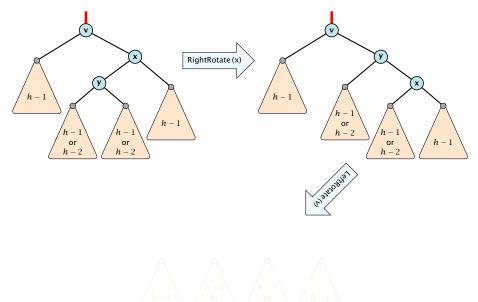


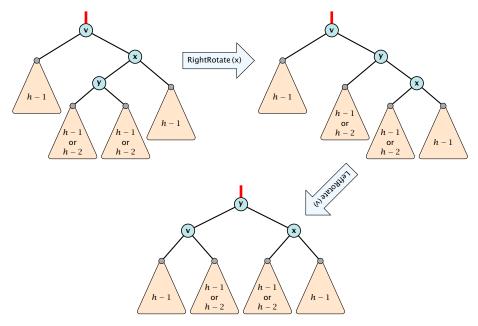


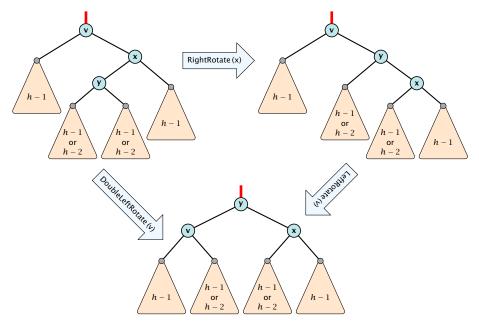


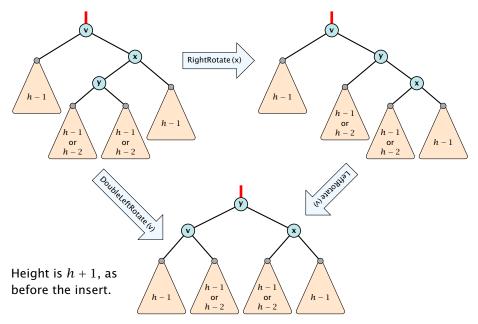












#### • Delete like in a binary search tree.

- Let v denote the parent of the node that has been spliced out.
- The balance-constraint may be violated at v, or at ancestors of v, as a sub-tree of a child of v has reduced its height.
- Initially, the node c—the new root in the sub-tree that has changed— is either a dummy leaf or a node with two dummy leafs as children.





In both cases bal[c] = 0.

Call fix-up(v) to restore the balance-condition.

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Case 2

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7.3 AVL-Trees

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#### Algorithm 13 AVL-fix-up-delete(v)

- 1: **if** balance[v]  $\in \{-2, 2\}$  **then** DoRotationDelete(v);
- 2: if balance[v]  $\in \{-1, 1\}$  return;
- 3: AVL-fix-up-delete(parent[v]);

We will show that the above procedure is correct. However, for the case of a delete there may be a logarithmic number of rotations.



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Alg	<b>Jorithm 14</b> DoRotationDelete $(v)$
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3:	LeftRotate( $v$ );
4:	else
5:	DoubleLeftRotate( $v$ );
6: else	
7:	if balance[left[ $v$ ]] = {0, 1} then
8:	RightRotate( $v$ );
9:	else
10:	DoubleRightRotate(v);

# It is clear that the invariant for the fix-up routine holds as long as no rotations have been done.

We show that after doing a rotation at v:

- v fulfills balance condition.
- All children of v still fulfill the balance condition.
- ▶ If now balance[v]  $\in$  {-1,1} we can stop as the height of  $T_v$  is the same as before the deletion.

We only look at the case where the deleted node was in the right sub-tree of v. The other case is symmetric.



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It is clear that the invariant for the fix-up routine holds as long as no rotations have been done.

We show that after doing a rotation at v:

- v fulfills balance condition.
- All children of v still fulfill the balance condition.
- ▶ If now balance[v]  $\in$  {-1,1} we can stop as the height of  $T_v$  is the same as before the deletion.

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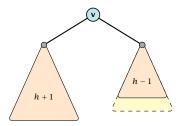
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We only look at the case where the deleted node was in the right sub-tree of v. The other case is symmetric.



We have the following situation:



The right sub-tree of v has decreased its height which results in a balance of 2 at v.

Before the insertion the height of  $T_v$  was h + 2.

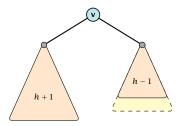


7.3 AVL-Trees

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#### **AVL-trees: Delete**

We have the following situation:



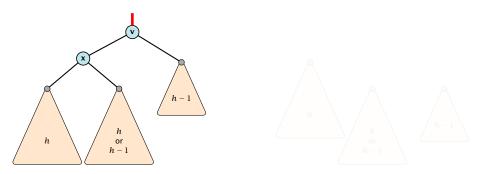
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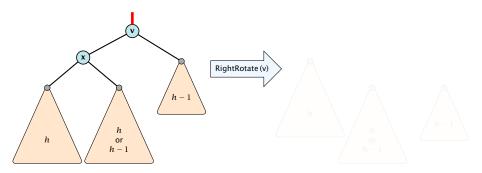
7.3 AVL-Trees



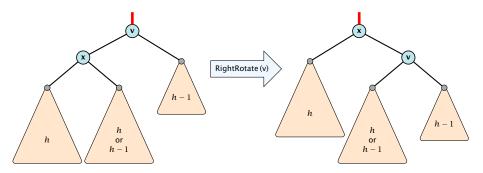
If the middle subtree has height h the whole tree has height h + 2 as before the deletion. The iteration stops as the balance at the root is non-zero.



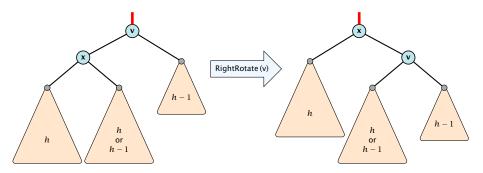
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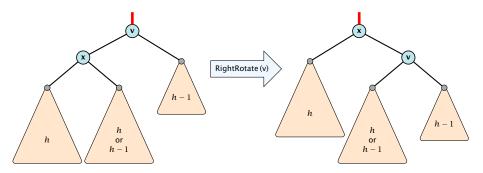
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