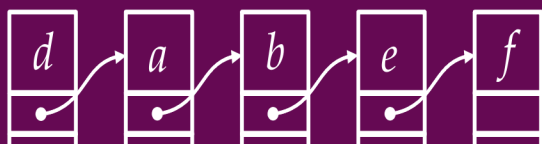
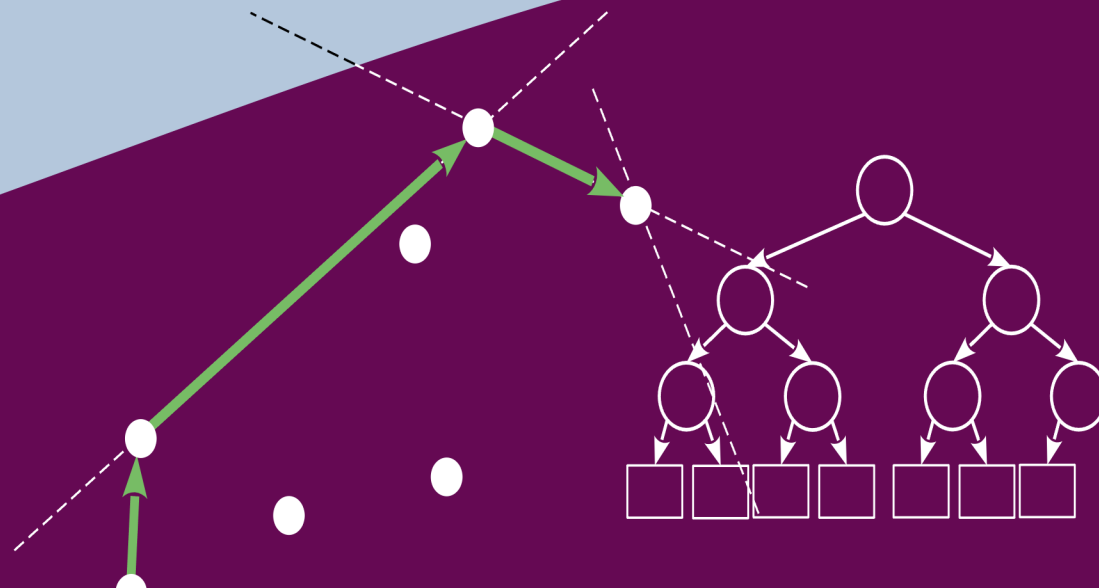
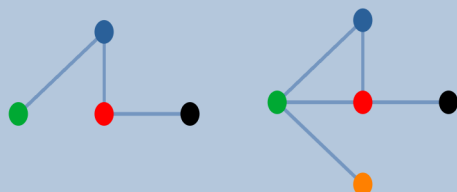




# Advanced algorithms and data structures

## Week 1: Advanced data structures



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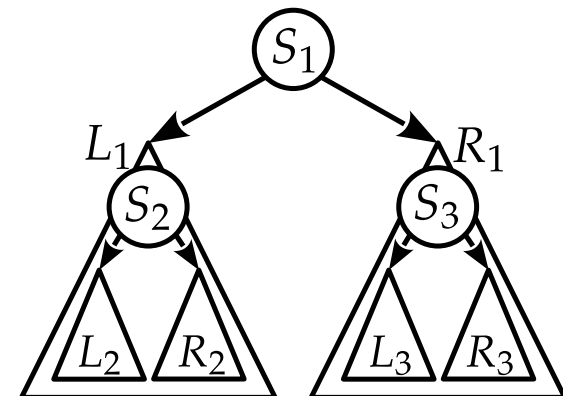
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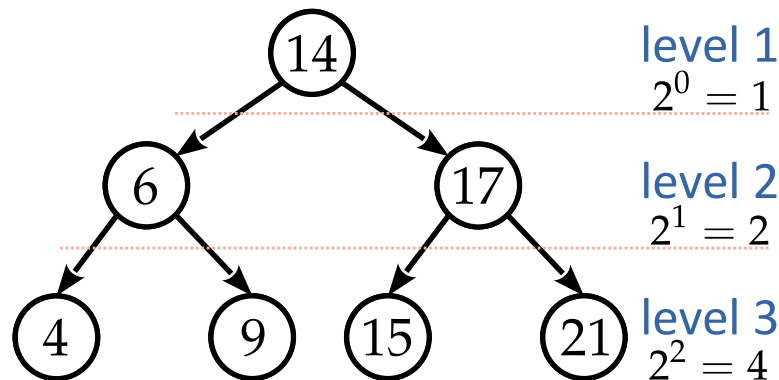
# Binary trees (1)

- Trees are directed acyclic graphs
- Binary trees are specific - each node can have a maximum of two children
  - A binary tree can be described by an ordered triple  
$$= (L, S, R)$$
    - where L is the left subtree, S is the root of the binary tree B, and R is the right subtree
  - Recursive definition



# Binary trees (2)

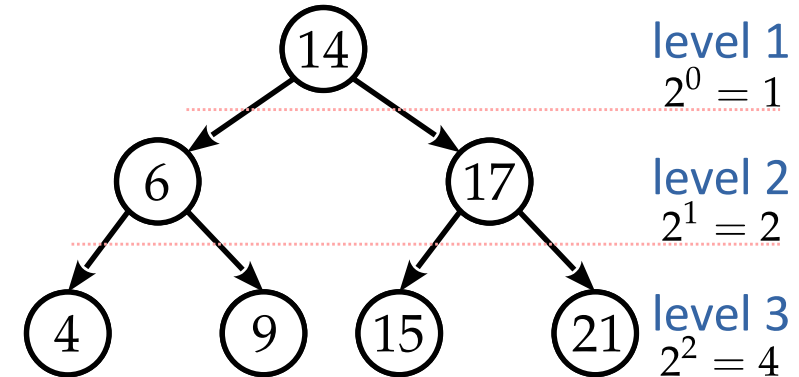
- To describe the relationship between the nodes of a binary tree, we use genealogical terms
  - Parent, child, twins
  - Expressions such as: great-grandfather (parent's parent), uncle (twin of parents) can be used.
- **A perfect binary tree**(*perfect*)
  - A binary tree in which all levels are completely filled with nodes



# Binary trees (3)

- Properties of a perfect binary tree

- Number of nodes =  $2^{h+1} - 1$
- Number of leaves =  $2^h$
- Number of internal nodes =  $2^{h+1} - 1 - 2^h = 2^h - 1$
- Height =  $\lceil \log_2(n+1) \rceil - 1$



- **Complete binary tree**(*complete*) – A binary tree that has all but the lowest levels completely filled with nodes. In the lowest level, the leaves are filled from the left.

- Number of nodes  $\leq 2^{h+1} - 1$
- Number of leaves  $\leq 2^h$
- Number of internal nodes  $\leq 2^h - 1$

# Binary trees (4)

- The height of the complete binary tree - directly related to the complexity of the search

$$h = \lceil \log_2(n+1) \rceil$$

- It is also valid

$$h = \lceil \log_2(n+1) \rceil \leq \log_2(n+1) + 1$$

- Full binary tree**(*full*) – A binary tree whose internal nodes have exactly two children.

- Organization **sorted** binary tree = ( , , )

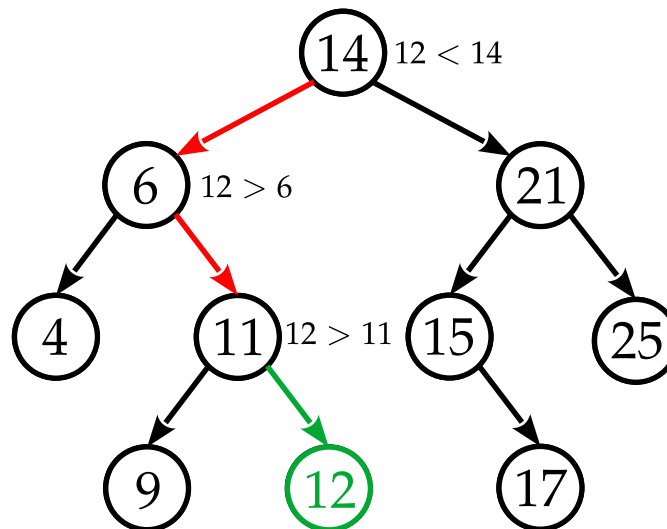
- No duplicates  $\{ ( ) \} < ( < ) \quad ( ( ) )$

- With duplicates

$$\left\{ \begin{array}{l} ( ( ) ) \\ ( ( ) ) \end{array} \right\} \leq \begin{array}{l} ( < ) \\ ( ) \end{array} < \left\{ \begin{array}{l} ( \leq ) \\ ( ( ) ) \end{array} \right\}$$

# Binary tree operations (1)

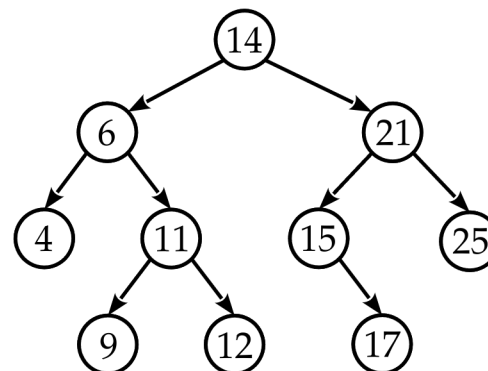
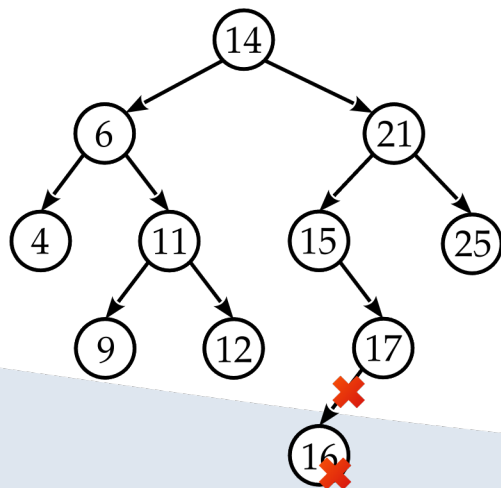
- **Let's repeat** adding values to a binary tree
  - Adding is preceded by a search
  - Upon encountering a free place, we add a new node according to the organization of the binary tree:
    - Left if smaller
    - To the right if it's bigger



# Deleting Nodes (1)

- First we find the node we are deleting
- Three cases:
  1. The node to be deleted is a leaf
  2. The node being deleted has one child
  3. The node being deleted has both children

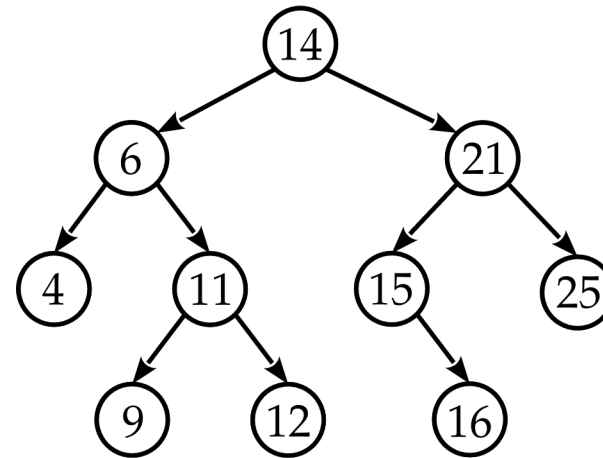
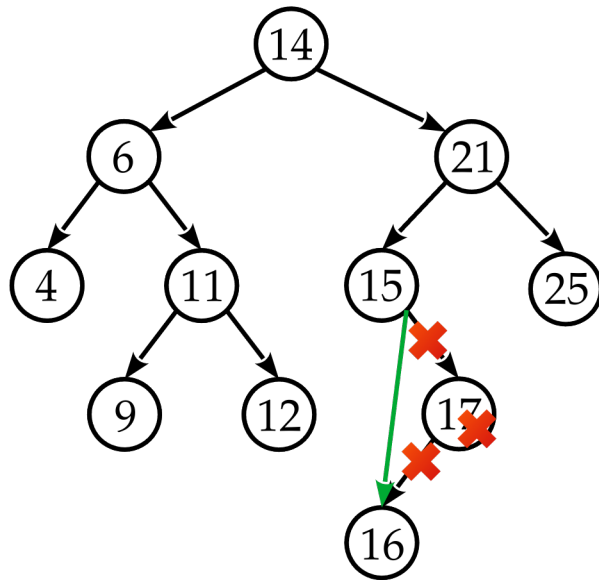
1. The node to be deleted is a leaf – we just delete the node





# Deleting nodes (2)

2. The node has one child – That child becomes the new child of the parent of the node being deleted



# Deleting nodes (3)

## 3. The node has two children - options

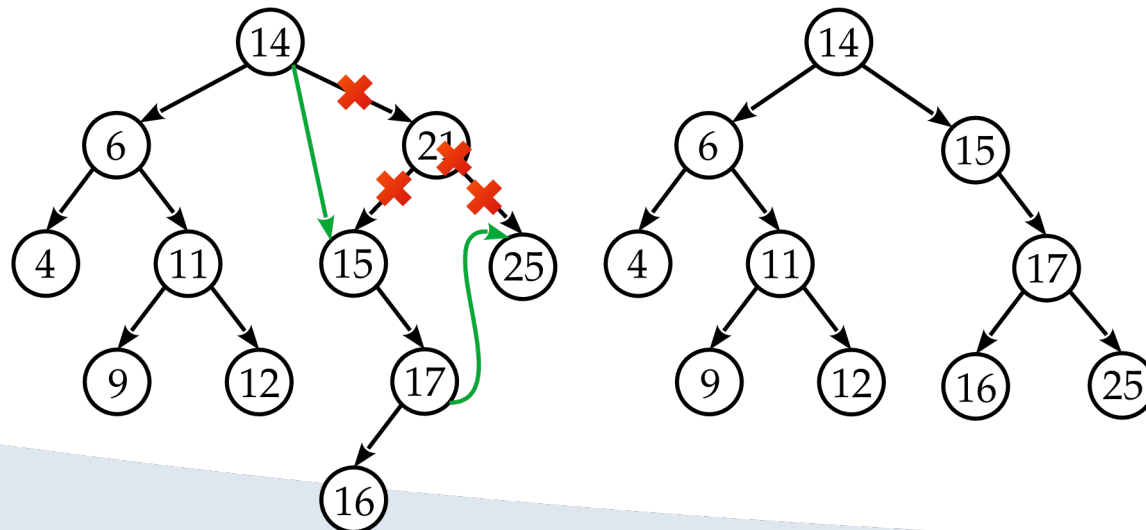
- Delete by merging – significantly changes the structure
- Delete by copy – the structure changes minimally

## • Deletion by union

- Find the node being deleted and its parent (if the root node is not being deleted)
- Let's determine on which side the node that is being deleted is in relation to its parent
  - If the root node is in question, then it does not matter which subtree we take as the union subtree (*merging subtree*)
  - Otherwise we have two options:
    - If the node to be deleted is in **the left** subtree of the parent, then the union tree is its right subtree
    - If the node to be deleted is in **with the right** subtree of the parent, then the union tree is its left subtree

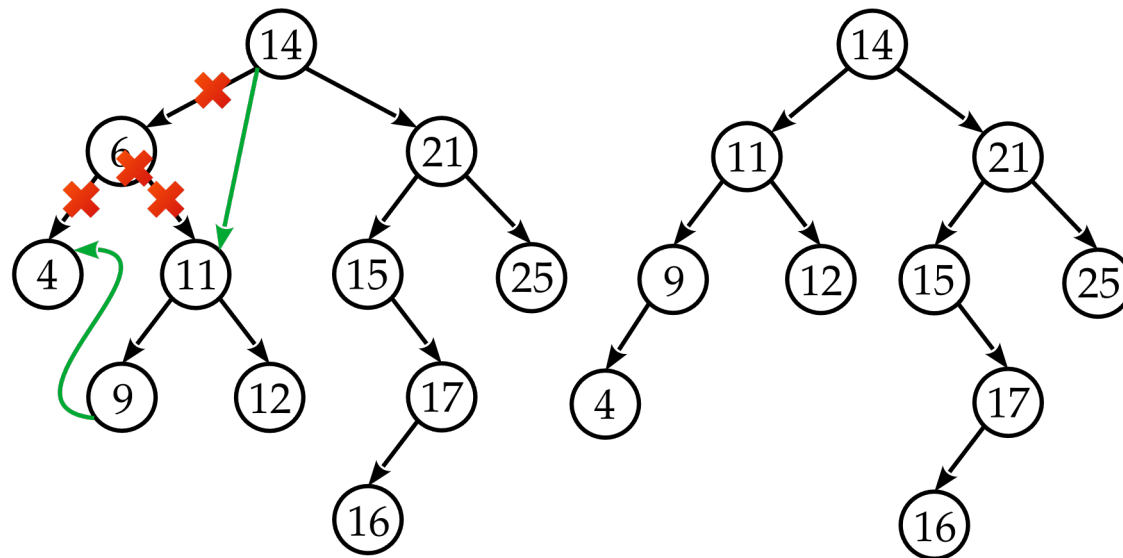
# Deleting nodes (4)

- Deleting node A by union
  - We connect the twin node to the root node of the union subtree at
    - Knot**follower** if the subtree of the union was the right subtree of node A
    - Knot**predecessor** if the subtree of the union was the left subtree of node A
  - We connect the root of the union subtree with the parent of the deleted node
    - Except in the case when the root node is deleted



# Deleting nodes (5)

- Deletion by union



# Deleting nodes (6)

- Delete by copying

- It boils down to deleting a node without children or with one child
- A replacement node is found and deleted - the binary tree structure is minimally changed

1. We find the node A that we are deleting

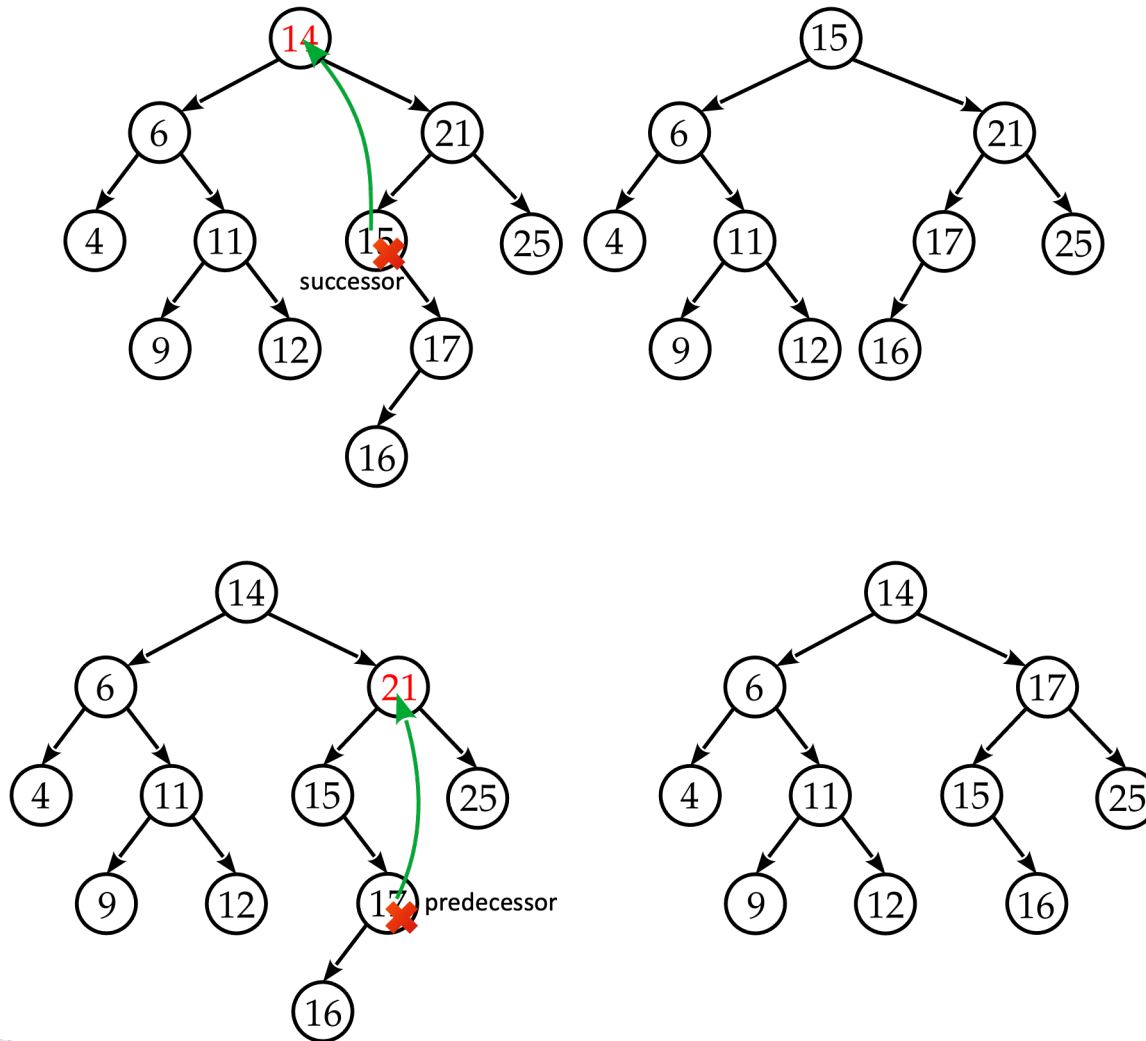
2. We find the node X that contains a direct predecessor or successor – a replacement node

- The predecessor is the rightmost node in the left subtree of A
- A follower is the leftmost node in the right subtree of A

3. We copy the value of the replacement node X to the node A that is being deleted

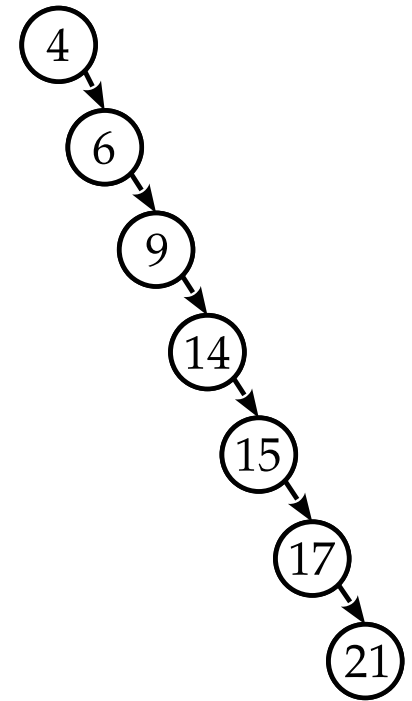
4. The replacement node X is removed

# Deleting nodes (7)



# Balanced Binary Tree (1)

- Why is a balanced binary tree interesting to us?
- We want to achieve a search complexity of  $(\log n)$
- The other extreme -**degenerate (oblique) binary tree** (*degenerates*) – example on the right
  - The complexity is  $(n)$

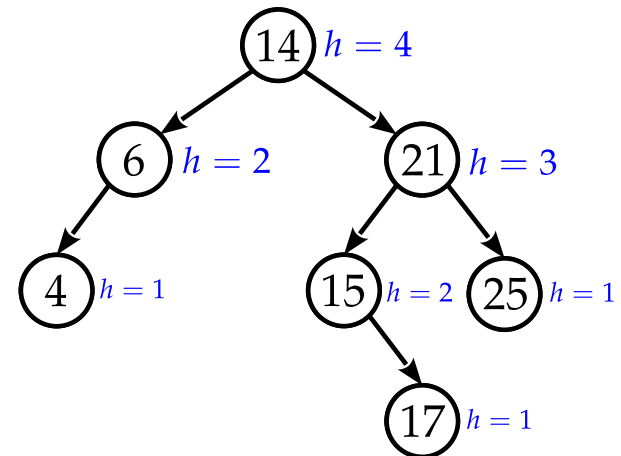
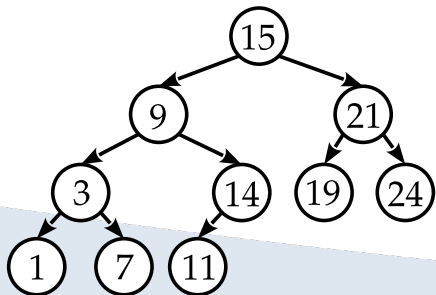


# Balanced Binary Tree (2)

- For a binary tree  $T = (V, E)$  the definition of a balanced tree is
$$\forall v \in V, |h(\text{left}(v)) - h(\text{right}(v))| \leq 1$$
  - The difference in the height of the left and right subtrees of **each node** can be at most 1

- A perfectly balanced binary tree** (*perfectly balanced*) – balanced and complete

- All levels except the last one are completely filled with nodes





# Creating a binary tree (1)

(from a sorted array of values)

- We have a sorted field available (*array*) values  
"= 1,3,7,9,11,14,15,21,24 }

1. We find the positional mean value  $a$  in the field
2. Let's create a root value node  $a$  of the current binary tree
3. For the subfield to the left of  $a$  the left subtree is recursively created
4. For the subfield to the right of  $a$  the right subtree is recursively created
5. We repeat until we can create a left or right subtree

```
function CREATEBALANCEDTREE( $V_s$ )
```

```
   $n \leftarrow |S|$ 
```

```
  if  $n > 0$  then
```

```
     $i \leftarrow (n \div 2) + (n \% 2)$ 
```

```
     $root \leftarrow$  create node having value  $V_s[i - 1]$ 
```

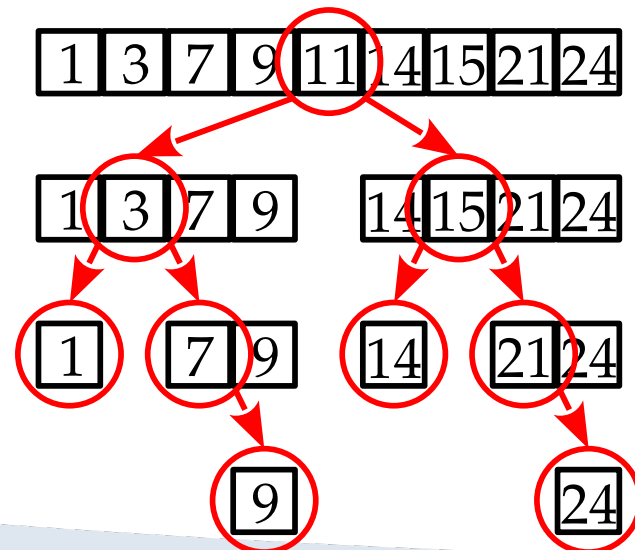
```
     $leftChild(root) \leftarrow$  CREATEBALANCEDTREE( $V_s[0, i - 1]$ )
```

```
     $rightChild(root) \leftarrow$  CREATEBALANCEDTREE( $V_s[i, n]$ )
```

```
    return  $root$ 
```

```
  else
```

```
    return nil
```



# Creating a binary tree (2)

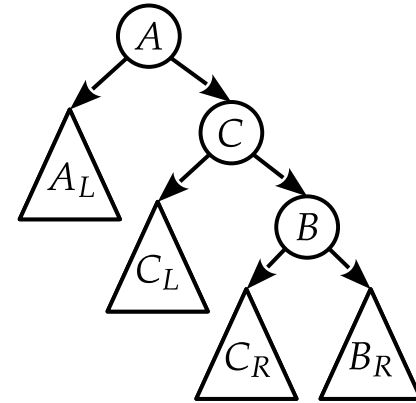
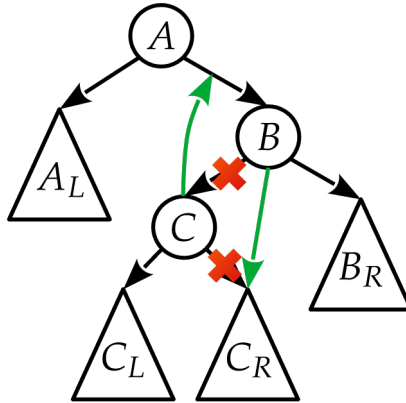
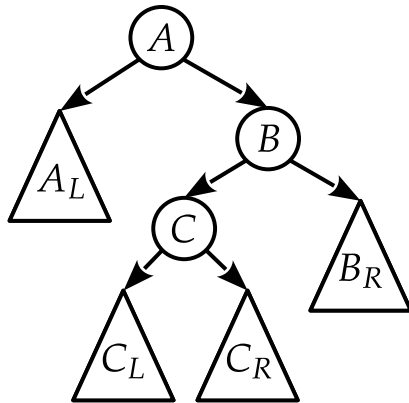
(from a sorted array of values)

- This algorithm has complexity  $O(n \log n)$ 
  - Field sorting + traversal of all field elements
- The algorithm can only be used in special situations
  - When we have a field of values and we want to create a balanced binary tree from it
  - It is used relatively often, concrete examples will be given later in the lectures
- The binary tree created in this way is balanced

# Rotations in the tree (1) - right

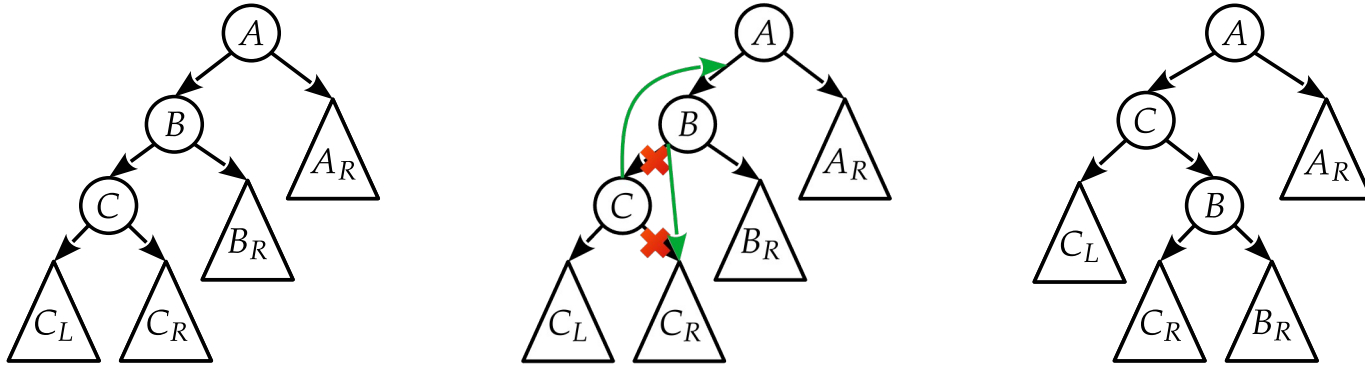
- To balance trees we need two operations (rotations) on binary trees (pulley analogy)
- Right rotation of C about B
  - How to rotate the tree so that C is between A and B, while preserving the order

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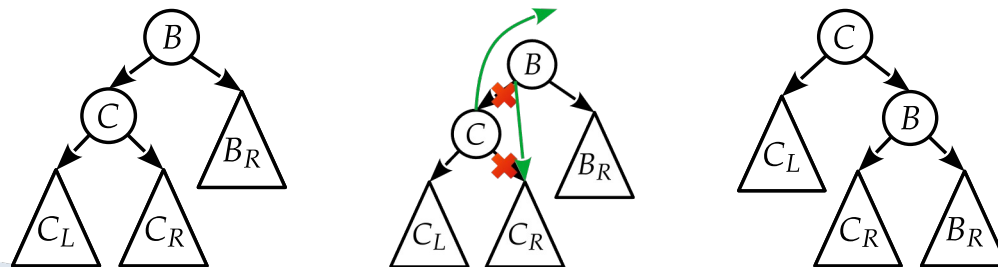


# Rotations in the tree (2) - right

- Another right rotation of C around B



- The right child of C becomes the left child of B
- B becomes the right child of C
- C becomes a child of the former parent of node B (if it exists)

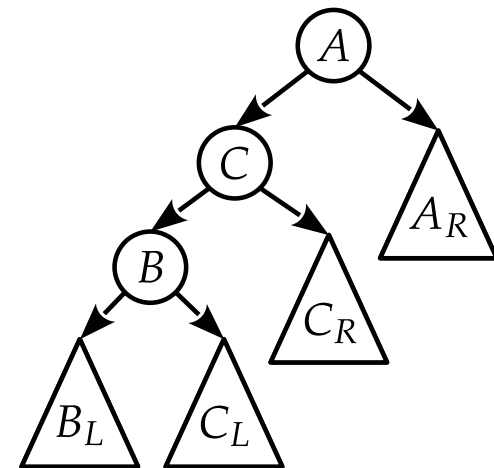
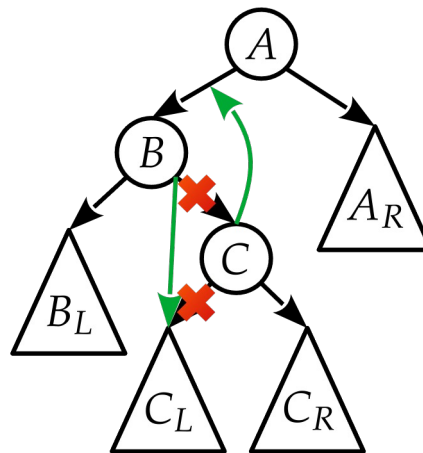
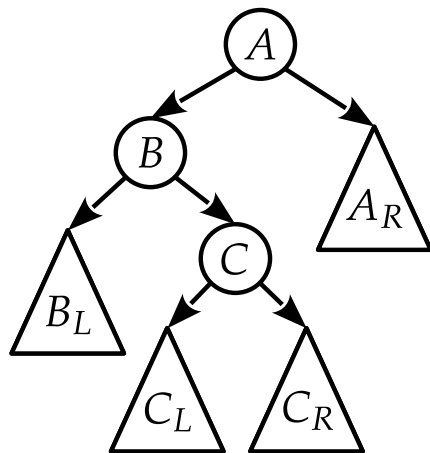


# Rotations in the tree (3) - left

- Left rotation of C around B

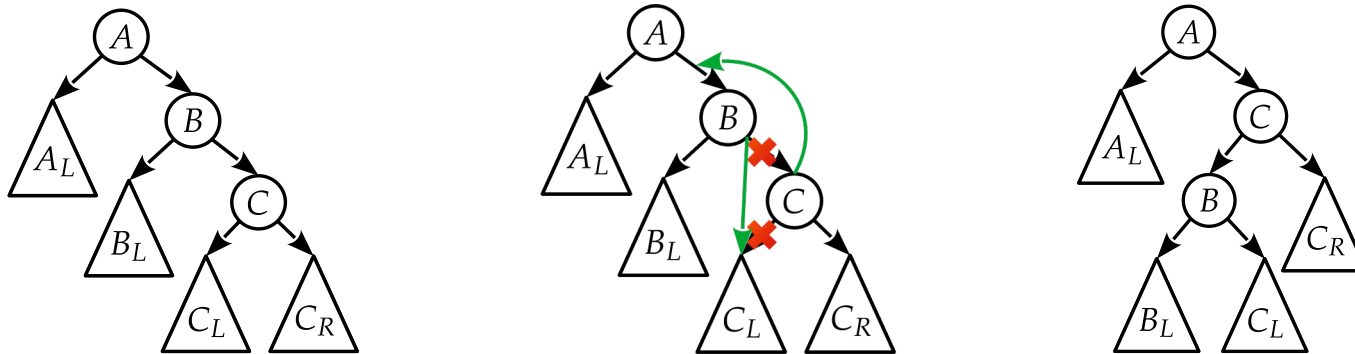
- How to rotate the tree so that C is between A and B, while preserving the order

$\#(\leftarrow) < \#(\leftarrow) < (\$ \leftarrow) < ((\$)) \quad ( ) \quad ( )$

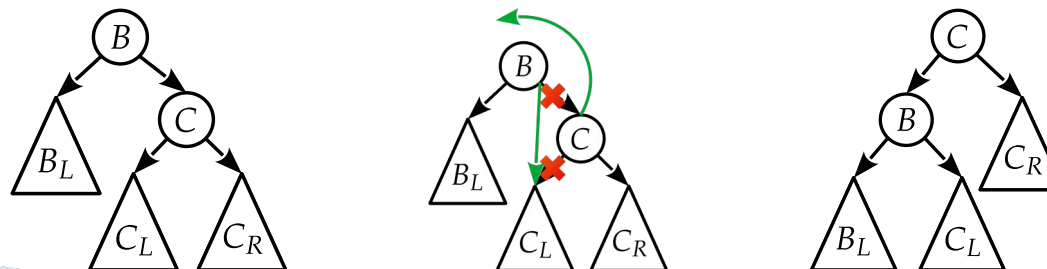


# Rotations in the tree (4) - left

- Another left rotation of C around B



- The left child of C becomes the right child of B
- B becomes the left child of C
- C becomes a child of the former parent of node B (if it exists)



# Day-Stout-Warren algorithm (DSW)

- Two phases of the algorithm

1. Making the spine (oblique tree)

2. Recursively breaking the spine back into a complete tree

# DSW – spine manufacturing

```
procedure RIGHTBACKBONE(root)
```

```
  B  $\leftarrow$  root
```

```
  A  $\leftarrow$  nil
```

```
  while B  $\neq$  nil do
```

```
    C  $\leftarrow$  leftChild(B)
```

```
    if C  $\neq$  nil then
```

```
      RIGHTROTATE(A, B)
```

```
      if A = nil then
```

```
        root  $\leftarrow$  C
```

```
      B  $\leftarrow$  C
```

```
    else
```

```
       $\triangleright$  Descending right to the first node that has the left child
```

```
      A  $\leftarrow$  B
```

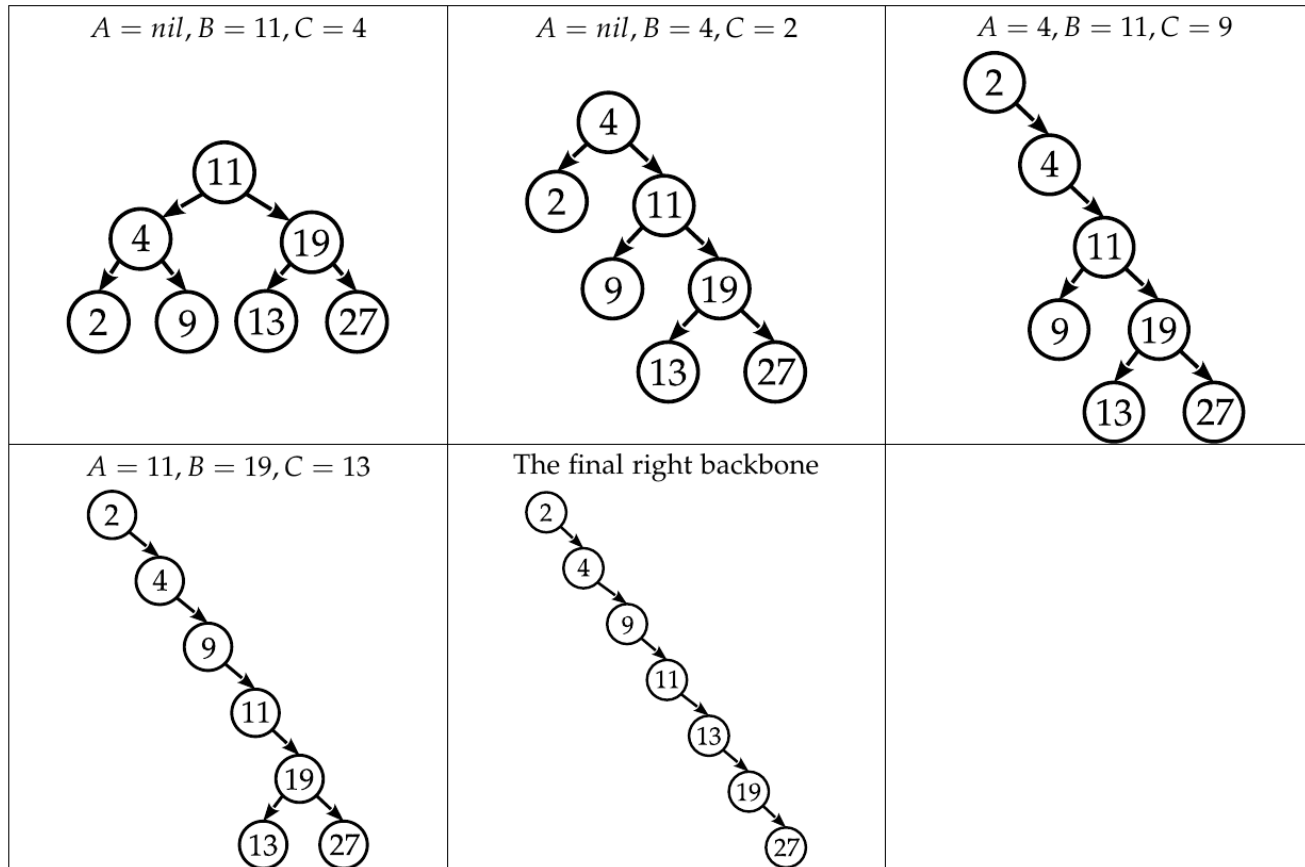
```
      B  $\leftarrow$  rightChild(B)
```

- The first step is to create a backbone from a binary tree - eg right spine
- We rotate the left children of the nodes to the right
- We repeat right rotations until there are no left children



# DSW – spine manufacturing

- Example



# DSW - breaking

- Strategically positioned left rotations for a perfectly balanced binary tree

```
procedure DSW(tree, n)  
   $h \leftarrow \lceil \log_2(n + 1) \rceil$   
   $i \leftarrow 2^{h-1} - 1$   
  perform  $n - i$  rotations of every second node from the root  
  while  $i > 1$  do  
     $i \leftarrow \lfloor i/2 \rfloor$   
    perform  $i$  rotations of every second node from the root
```

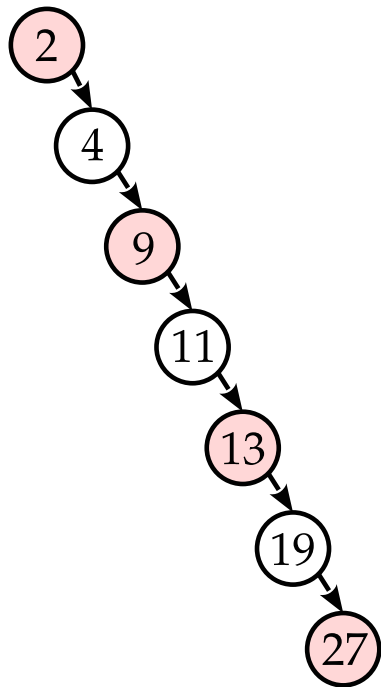
- $h$  – height of the binary tree for  $n$  nodes
- $i$  – number of internal nodes
- For the right spine, we do left rotations to bring the nodes back into the binary tree structure

# DSW – breaking, example

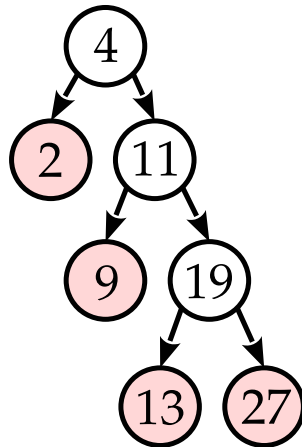
$n = 7$

$h = 3$

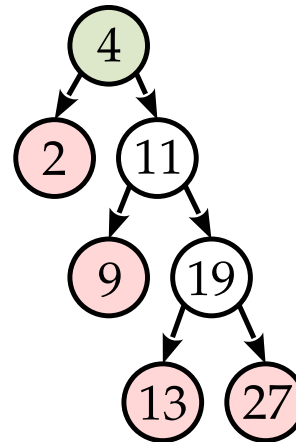
$r = 3$



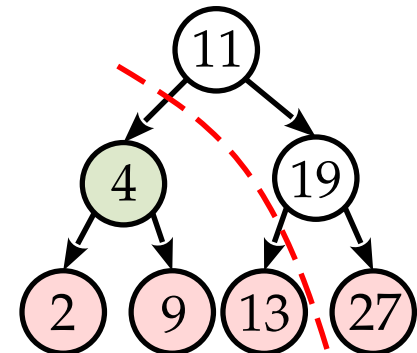
$n - r = 4$   
left rotations  
for leaves



$\lfloor n/2 \rfloor = \lfloor 3/2 \rfloor = 1$   
of left rotations for  
internal nodes



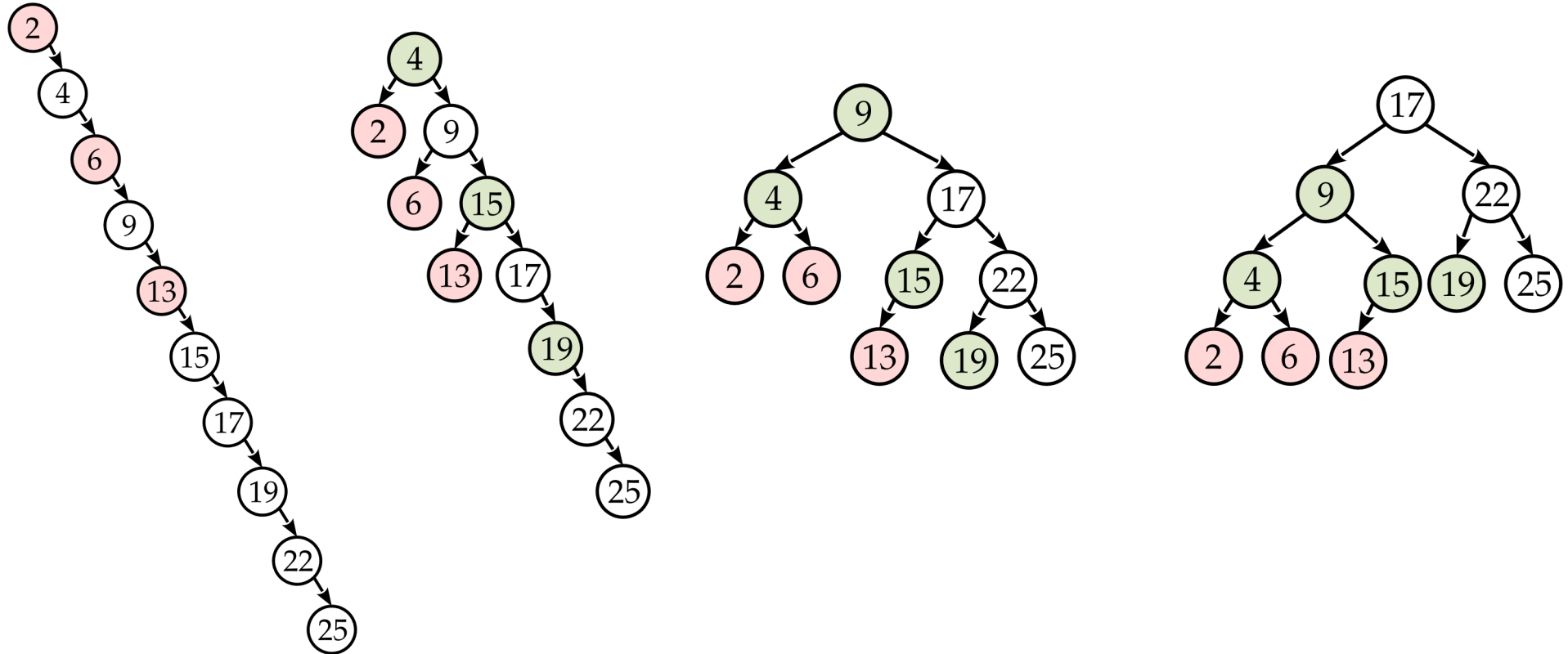
it is obtained  
perfectly binary  
tree



# DSW – breaking, example

- Example
  - $n = 10$
  - It is  $h = 4$  levels
  - The total number of internal nodes is  $n = 7$
  - Nodes in the lowest level is  $10 - 7 = 3$  – first we do 3 left rotations of every other node of the right spine, starting from the root node
  - Then we work  $\lceil 7/2 \rceil = 3$  left rotations of every other node of the rest of the right spine, starting from the root node, which gives us the lowest level of internal nodes
  - Then we work  $\lceil 3/2 \rceil = 1$  left rotations of every other node of the rest of the right spine, starting from the root node, which gives us the lowest level of internal nodes

# DSW – breaking, example



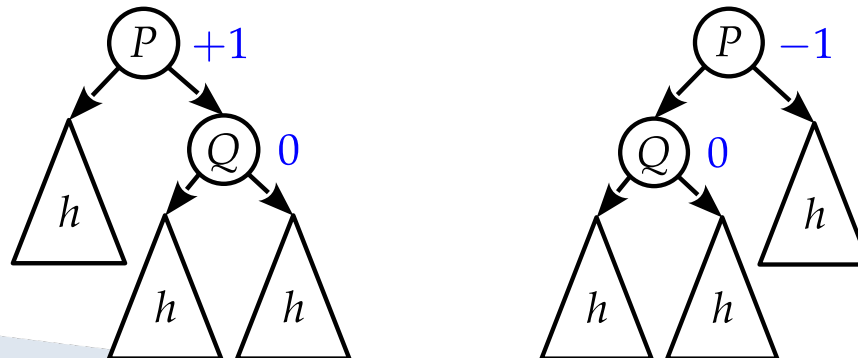
- This is global binary tree balancing
  - We first destroy the structure of the tree to balance it
  - The complexity of the DSW algorithm is ( )

# Adelson-Velski-Landis binary tree (AVL)

- Previous examples are **offline** balancing
- **Online** balancing – adding new values
  - Check if the binary tree is balanced?
  - If not, balance that tree with minimal intervention in its structure
- This is called local balancing

# AVL (2)

- By adding a new leaf, we can move along the path to the root node, and check the balance in each node
- For a binary tree  $T = (V, E)$  we define the balance factor (*balance factor*) as
 
$$bf(P) = h(P_{left}) - h(P_{right})$$
- For all nodes that have  $-1 \leq bf(P) \leq 1$  we consider their subtree to be balanced



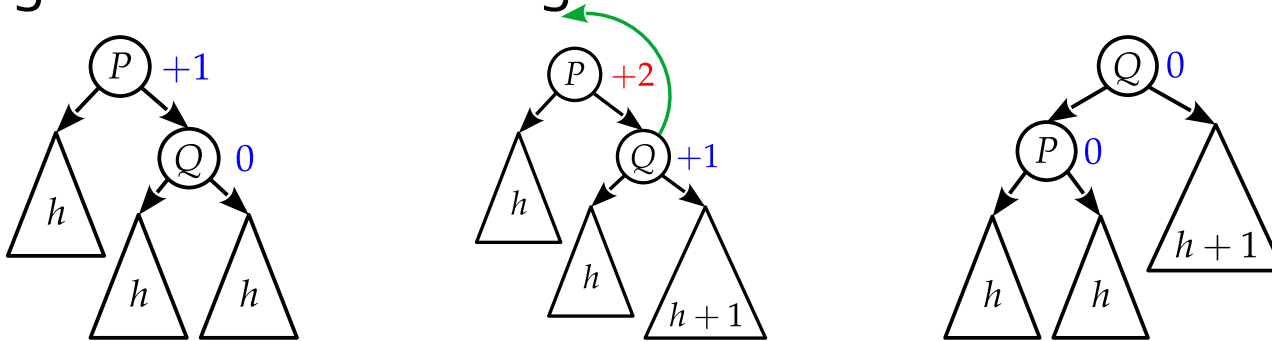
# AVL (3)

- After adding, we update the balance factors on the vertical path. If there is a node  $S$  with  $( ) = -2$  or  $( ) = 2$ , local balancing is required
- Two cases – a node and its child (depending on the sign of the node):
  - **Level up**case, identical signs BF:
    - The balance factor of the node is +2 and the right child has a balance factor of 0 or +1 – the right flattened case
    - The balance factor of a node is -2 and the left child has a balance factor of 0 or -1 – the left aligned case
  - **Broken**case, strictly opposite signs BF:
    - The balance factor of the node is +2 and the right child has a balance factor of -1 – the right broken case
    - The balance factor of the node is -2 and the left child has a balance factor of +1 – the left broken case

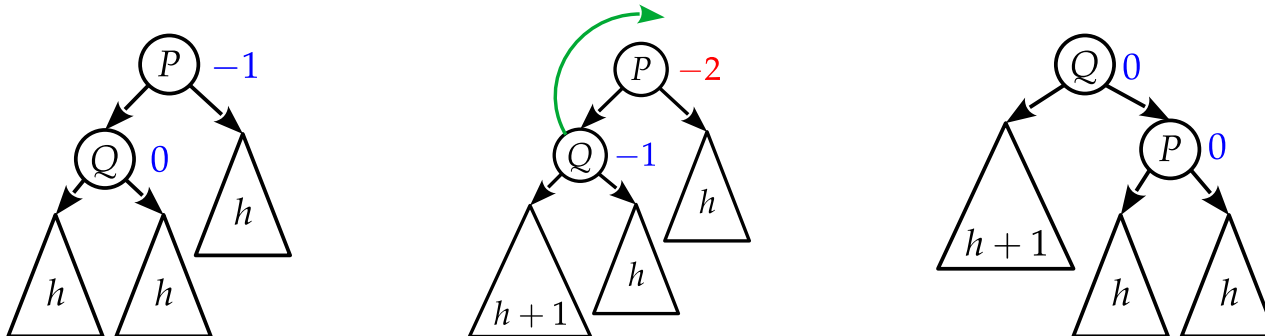


# AVL (4)

- Right aligned case: +2 and right child 0 or +1



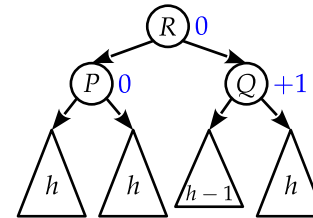
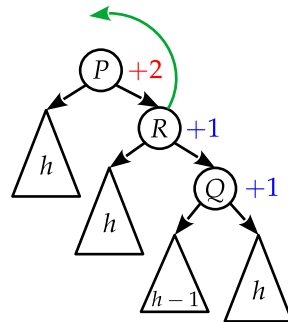
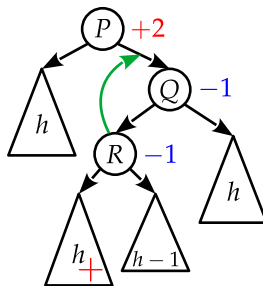
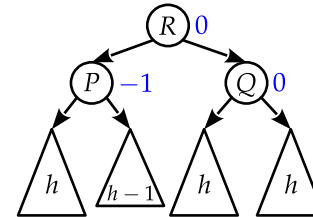
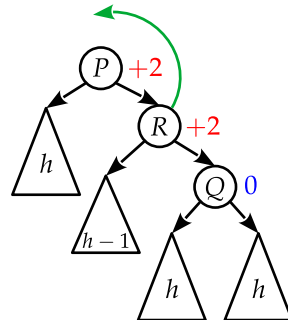
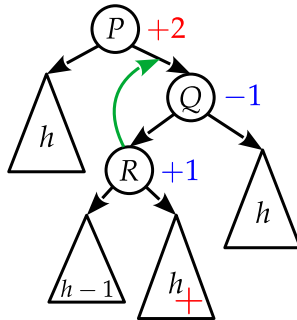
- We add the new value to the right subtree of node Q
- A left rotation of Q around P is performed
- Left aligned case: -2 and left child 0 or -1



- A right rotation of Q around P is performed

# AVL (5)

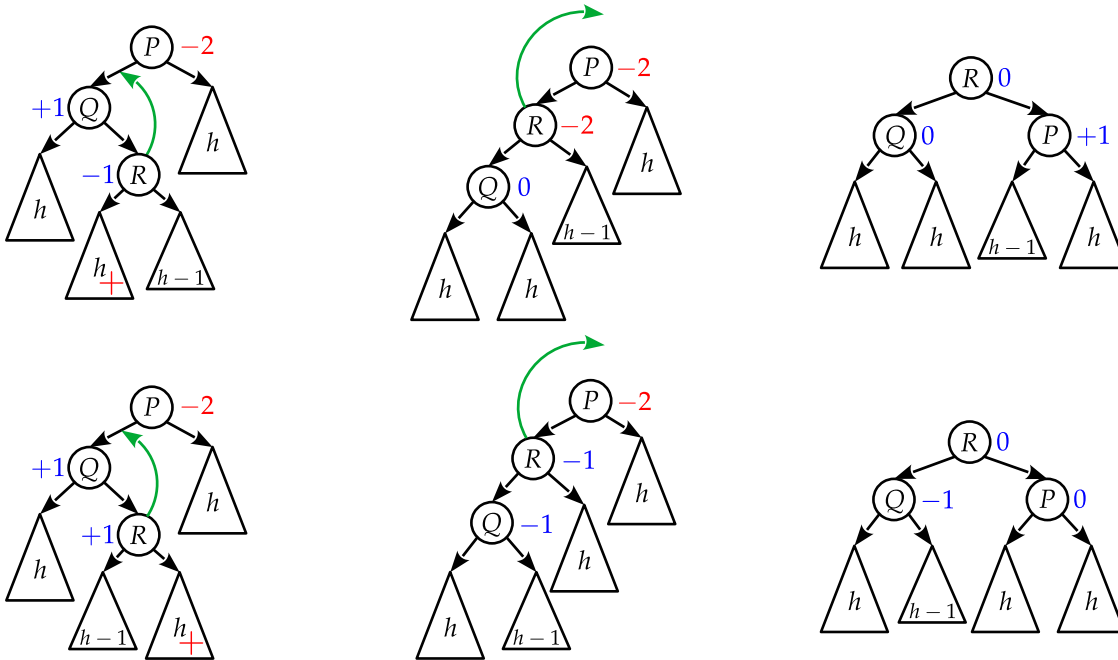
- Right fractured case: +2 and right child -1



- First the right rotation of R about Q
- Then a left rotation of R around P

# AVL (6)

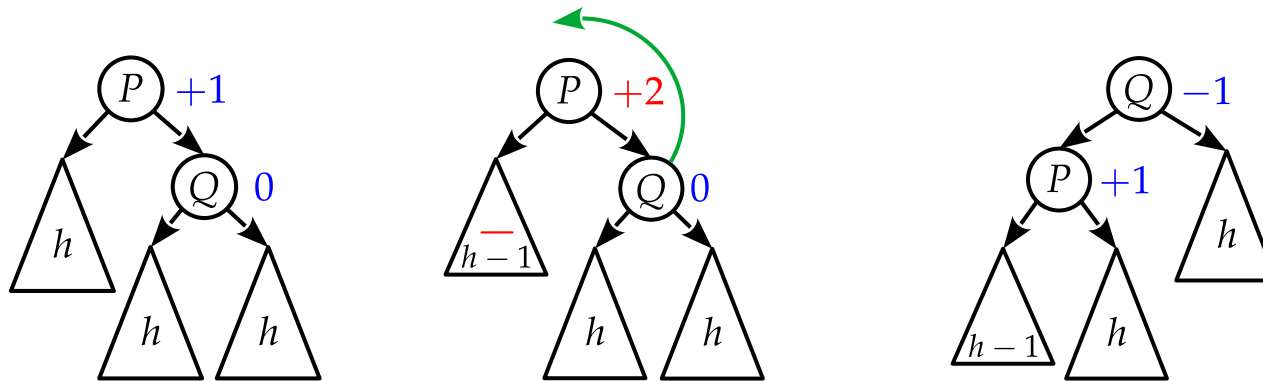
- Left broken case: -2 and left child +1



- First a left rotation of  $R$  about  $Q$
- Then a right rotation of  $R$  around  $P$

# AVL (7)

- Deleting values - always delete by copying
  - With such deletion, the height of one of the subtrees can be reduced



- We can see that deleting a node in the left subtree of node  $P$  caused an imbalance
- It is the right flat case

# AVL (8)

```
function AVLDETECTROTATE(n)
  if balanceFactor(n) is +2 then
     $n_1 \leftarrow \text{rightChild}(n)$ 
    if balanceFactor( $n_1$ ) is 0 or +1 then
      left rotate  $n_1$  around n
    if balanceFactor( $n_1$ ) is -1 then
       $n_2 \leftarrow \text{leftChild}(n_1)$ 
      right rotate  $n_2$  around  $n_1$ 
      left rotate  $n_2$  around n
  else
     $n_1 \leftarrow \text{leftChild}(n)$ 
    if balanceFactor( $n_1$ ) is 0 or -1 then
      right rotate  $n_1$  around n
    if balanceFactor( $n_1$ ) is +1 then
       $n_2 \leftarrow \text{rightChild}(n_1)$ 
      left rotate  $n_2$  around  $n_1$ 
      right rotate  $n_2$  around n

procedure AVLBALANCE(n)
   $p \leftarrow \text{parent}(n)$ 
  if balanceFactor(n) is -2 or +2 then
    AVLDETECTROTATE(n)
  if p is not nil then
    AVLBALANCE(p)
```

- The complexity of the search is the same as for a classic binary tree ( ! )
- When writing or deleting values, we return along the vertical path back to the root node, which gives complexity (2 ! )
- The theoretical height of the AVL tree is  $!(+1) \leq h \leq . \quad !(+2) - 0.328$ 
  - Proof in Drozdek

**Questions?**