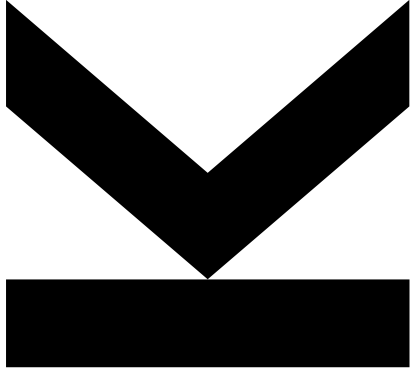


Trees (Weight Balanced)



Algorithms and Data Structures 2, 340300
Lecture – 2023W
Univ.-Prof. Dr. Alois Ferscha, teaching@pervasive.jku.at

Balanced Trees

Two different approaches

- **Height-balanced trees:**

The maximum allowed **height difference** of the two subtrees is limited

- **Weight-balanced trees:**

The **ratio** of the **node weights (number of nodes)** of both **subtrees** meets certain conditions.

Balanced Trees

Balanced trees are introduced as a compromise between balanced and natural search trees, whereby **logarithmic search complexity** is required in the **worst case**.

For the **height** h_b of an AVL tree with N nodes we have:

$$\lfloor \log_2 N \rfloor \leq h_b \leq 1,44 * \log_2 (N+2)$$

- The upper limit can be derived from Fibonacci trees, a subclass of the AVL trees.
- Let $N(h)$ be the **minimum number** of **nodes** of a **height-balanced** tree with **height** h . We have:
 - $N(0)=1, N(1)=2, N(2)=4, N(3)=7, N(4)=12, N(5)=20, \dots$
 - $N(h) = 1 + N(h-1) + N(h-2) = \text{Fib}(h+3) - 1$
 - $\text{Fib}(h) = 1/\sqrt{5} * ((1 + \sqrt{5})/2)^h - ((1 - \sqrt{5})/2)^h$
 - for all h we have: $\text{Fib}(h) \geq 1/\sqrt{5} * ((1 + \sqrt{5})/2)^h - 1$
 - if $N(h)=\text{Fib}(h+3)-1$ we have: $\log_2 (N(h)+2) \geq \log_2 (1/\sqrt{5}) + (h+3) \log_2 ((1 + \sqrt{5})/2)$
- From this the estimation follows: $h \leq 1,44 \log_2 (N(h)+2) \rightarrow h = \mathbf{O}(\log N(h))$

0,1,1,2,3,5,8,13,21, ...

Minimum number of nodes **grows exponential** with **height**

→ so vice versa: **height grows logarithmically** with **node number**

Weight-Balanced Search Trees

Weight-balanced or BB trees (bounded balance):

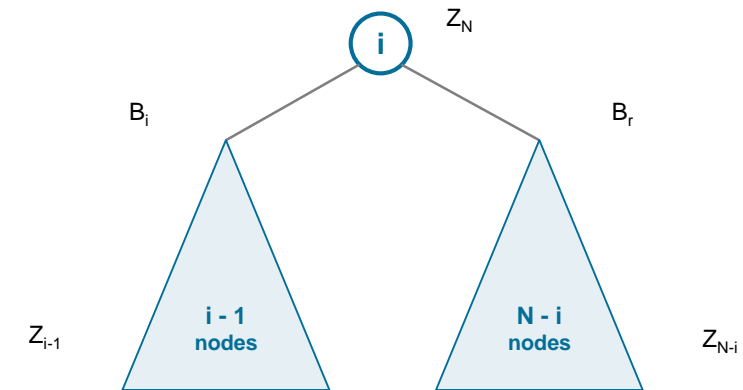
Tolerated deviation of the structure from balanced binary tree is defined as the **difference** between the **number of nodes** in the **right** and **left subtree**.

Definition:

Let B be a binary search tree with left subtree B_l and l be the number of nodes in B_l

(let N be the corresponding number of nodes in B)

- $\rho(B) = (l + 1) / (N + 1)$ is the **root balance** of B .
- A tree B is weight-balanced ($BB(\alpha)$) or of **limited balance** α , if for each subtree B' of B we have: $\alpha \leq \rho(B') \leq 1 - \alpha$



Weight-Balanced Search Trees

Parameter α as degree of freedom in the tree

- $\alpha = 1/2$: Balancing criterion only accepts complete binary trees
- $\alpha < 1/2$: Structural restriction is increasingly relaxed

What effects does the relaxation of the balancing criterion have on costs?

Rebalancing

- Use of the same rotation types as for the AVL tree
- is guaranteed by the choice of $\alpha \leq 1 - \sqrt{2} / 2$

Search and update costs: $O(\log_2 N)$

Multipath Search Trees

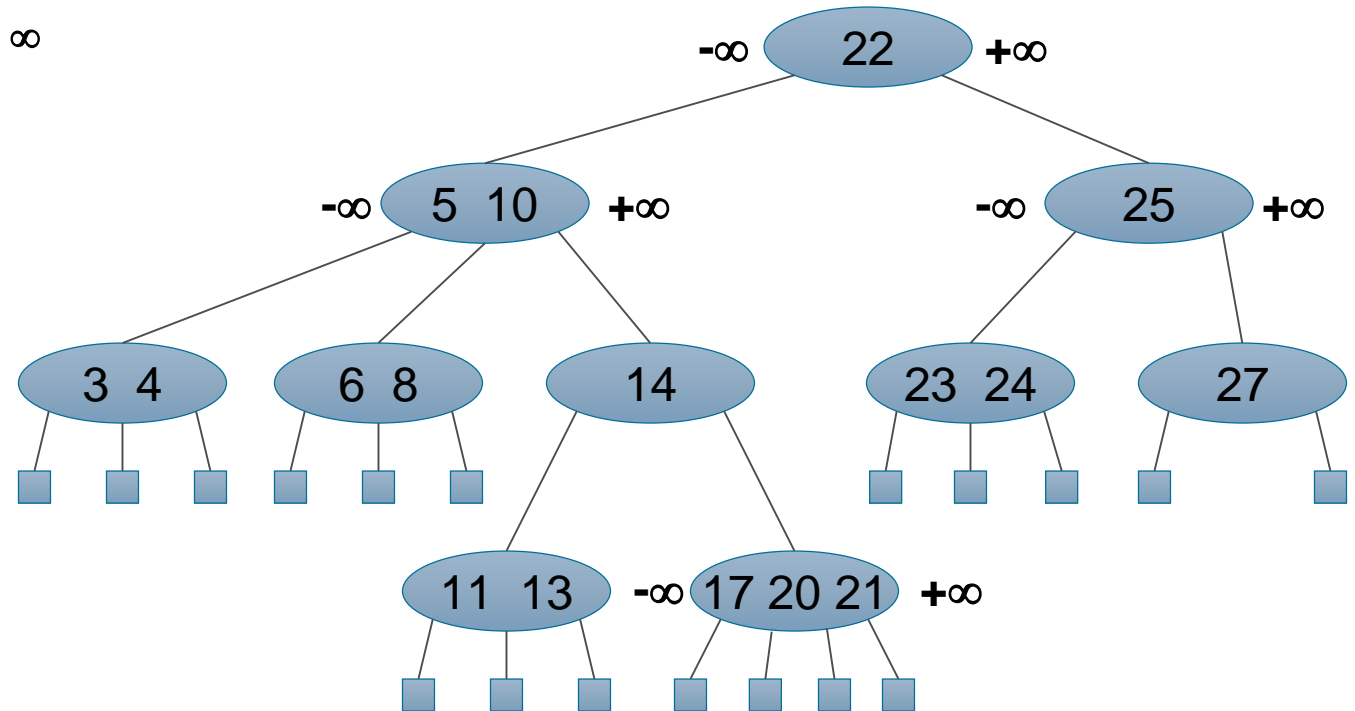
Each internal node of a **multipath search tree**

- has **d children**, where $d \geq 2$
- Stores a **set of records**(k, x) where k is the key and x the element
- **Number of records: d-1**
- Additionally: **2 pseudo records: $k_0 = -\infty$ and $k_d = \infty$**

For all children of an internal node we have:

- **Keys of the children lie between the keys of the respective records**

External nodes are placeholders

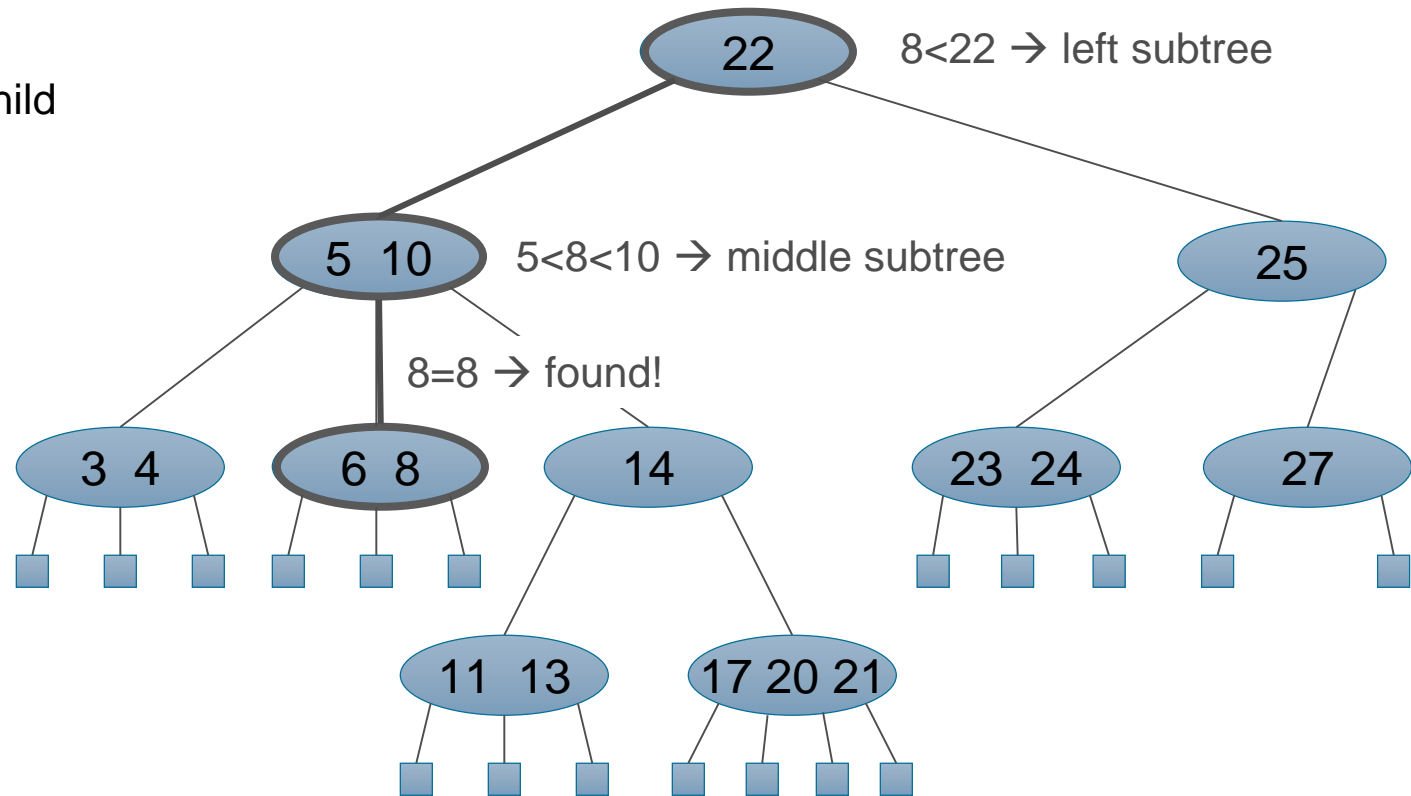


Multipath Search

Similar to binary search

- If $k < k_1$ **search in the leftmost** child
- If $k > k_{d-1}$ **search in the rightmost** child
- If $d > 2$:
find key k_{i-1} and k_i for which:
 $k_{i-1} < k < k_i$ and continue
search in child v_i

Example: Search 8

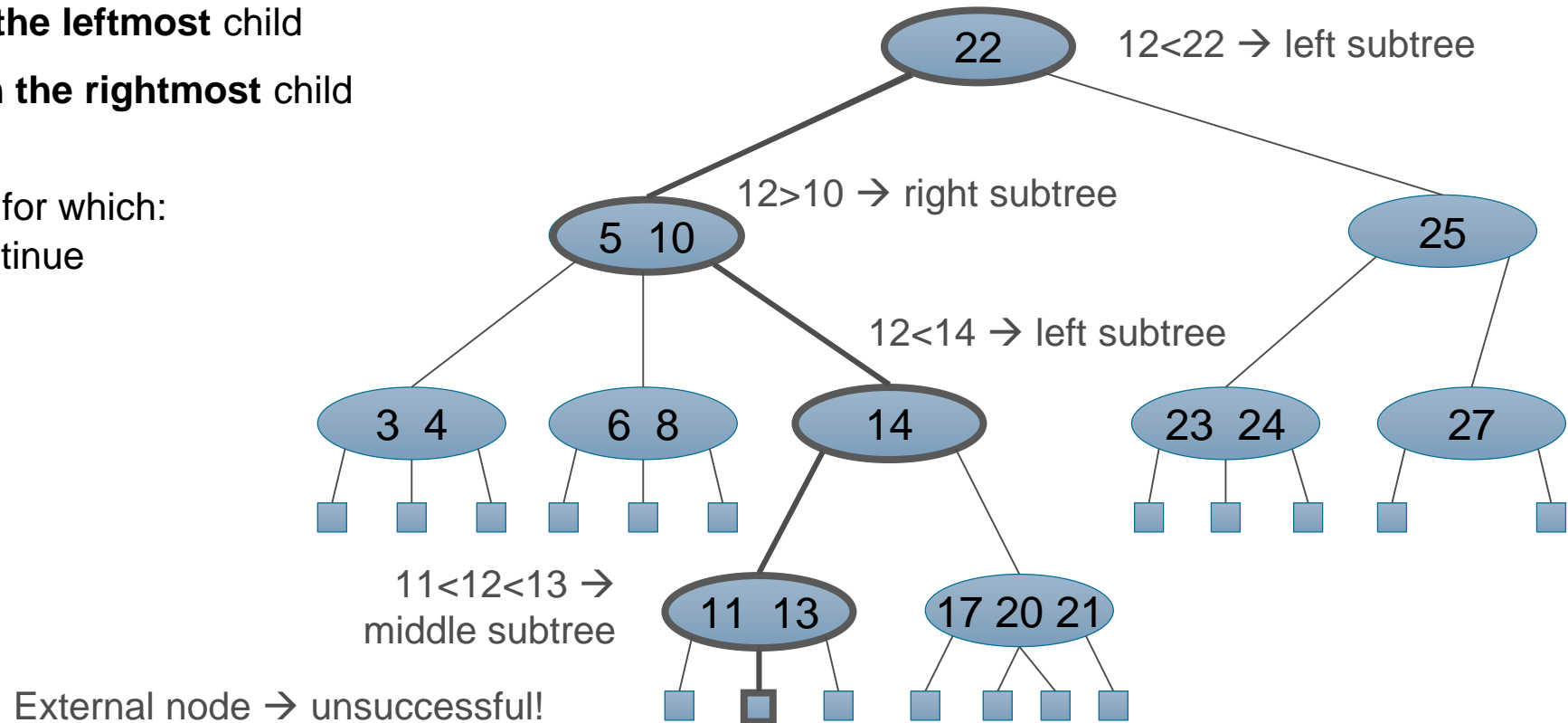


Multipath Search

Similar to binary search

- If $k < k_1$ **search in the leftmost** child
- If $k > k_{d-1}$ **search in the rightmost** child
- If $d > 2$:
find key k_{i-1} and k_i for which:
 $k_{i-1} < k < k_i$ and continue
search in child v_i

Example: Search 12



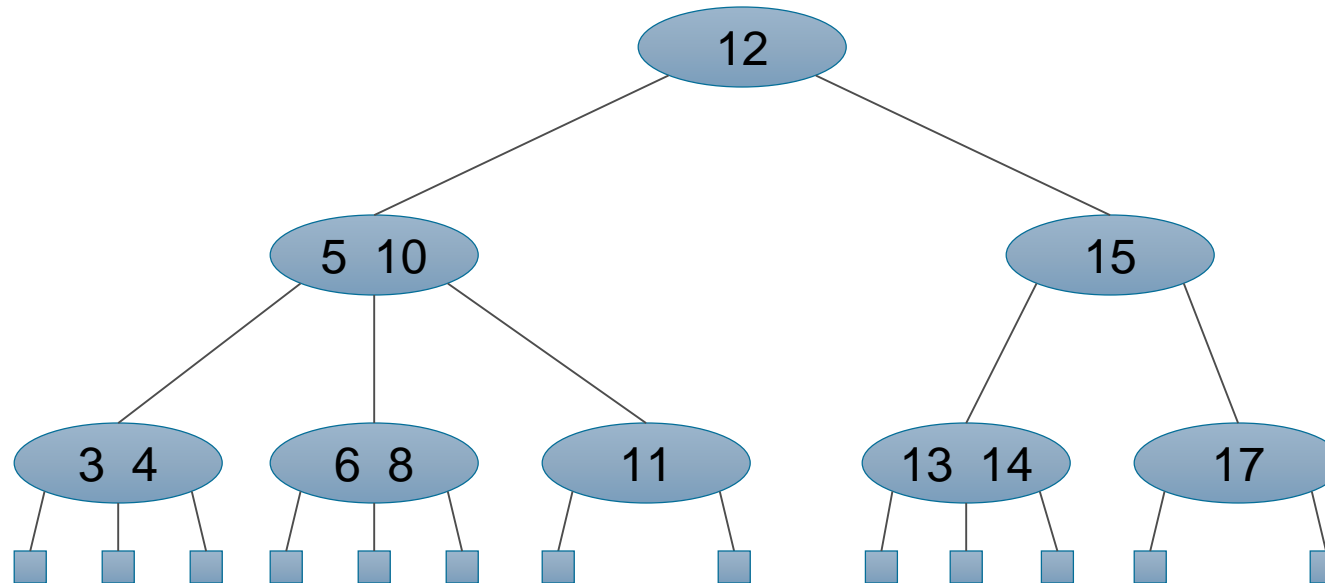
(2,4) Trees

Special case of a multipath tree:

- Each node has a **minimum** of 2, and a **maximum** of 4 children
- All **external** nodes have the **same depth**
- **Height** of the tree is $O(\log N)$

width property

depth property

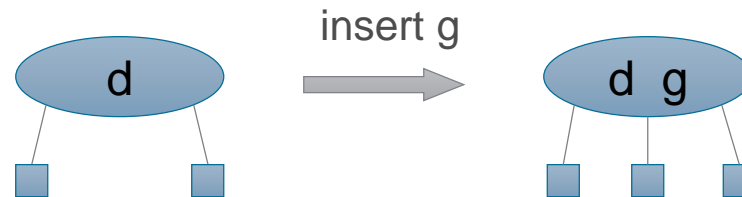


Insert in (2,4) Trees

Insert key in lowest internal node, that has been reached during search.

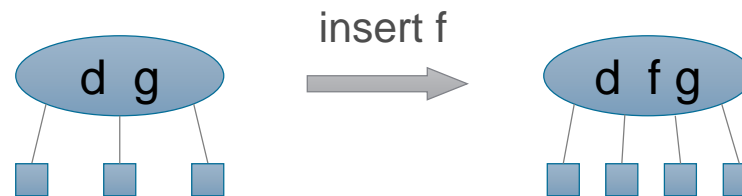
Case 1:

Node has 1 record



Case 2:

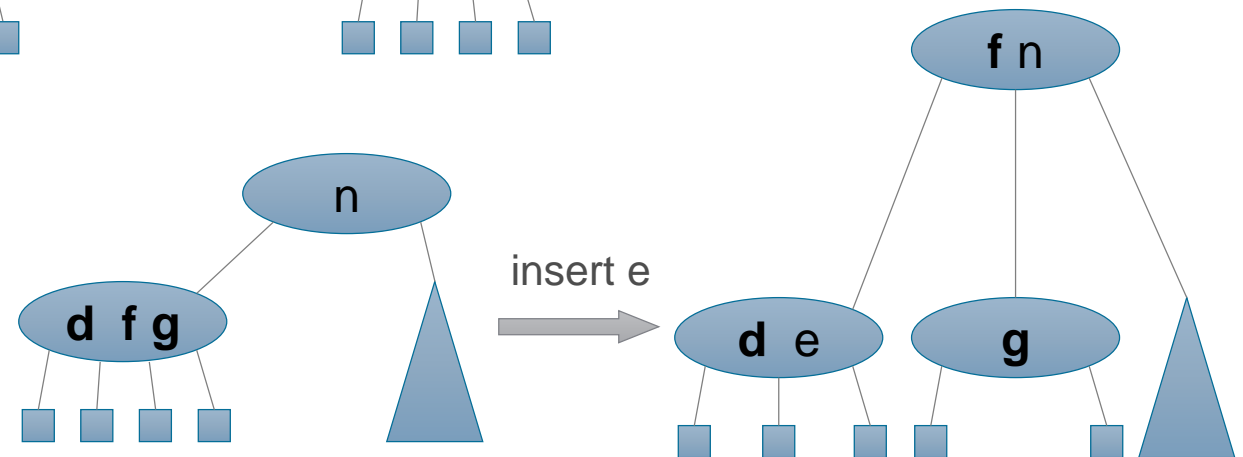
Node has 2 records



Case 3:

Node has already 3 records

- **Node splitting:** Split node into two 1-element nodes and move middle element into parent node



Insert in (2,4) Trees

Top-Down Insertion

- Starting with the root, **node-splitting** is done for **each node with three** elements, that is visited on the way when searching for the insertion position
- This ensures that inserting can be done according to case 1 or 2.

split concerns
constant number of nodes $\rightarrow O(1)$

Bottom-Up Insertion

- Search for insertion position
- If the node at the insertion position has already 3 elements, **node-splitting** is done
- If this results in an “**overflow**” in the **parent** node (by moving the middle element upwards), **node-splitting** is done again.

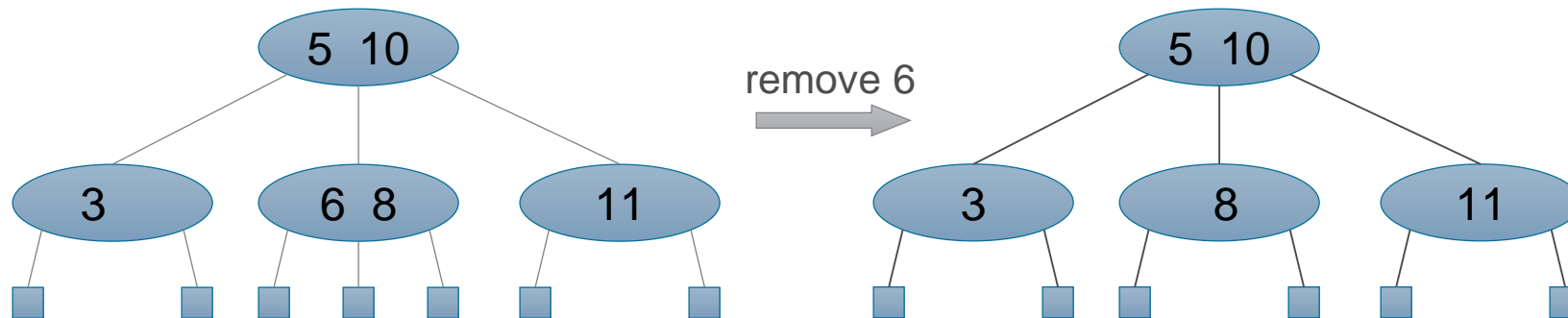
the maximum number of levels affected is
 $\log N \rightarrow O(\log N)$

Removal in (2,4) Trees

Principle

- **Find** the record to be deleted via key
- **Remove** the entry and **merge** (inverse operation to split), **if node has too few entries**

Example



The following special cases must be considered in detail:

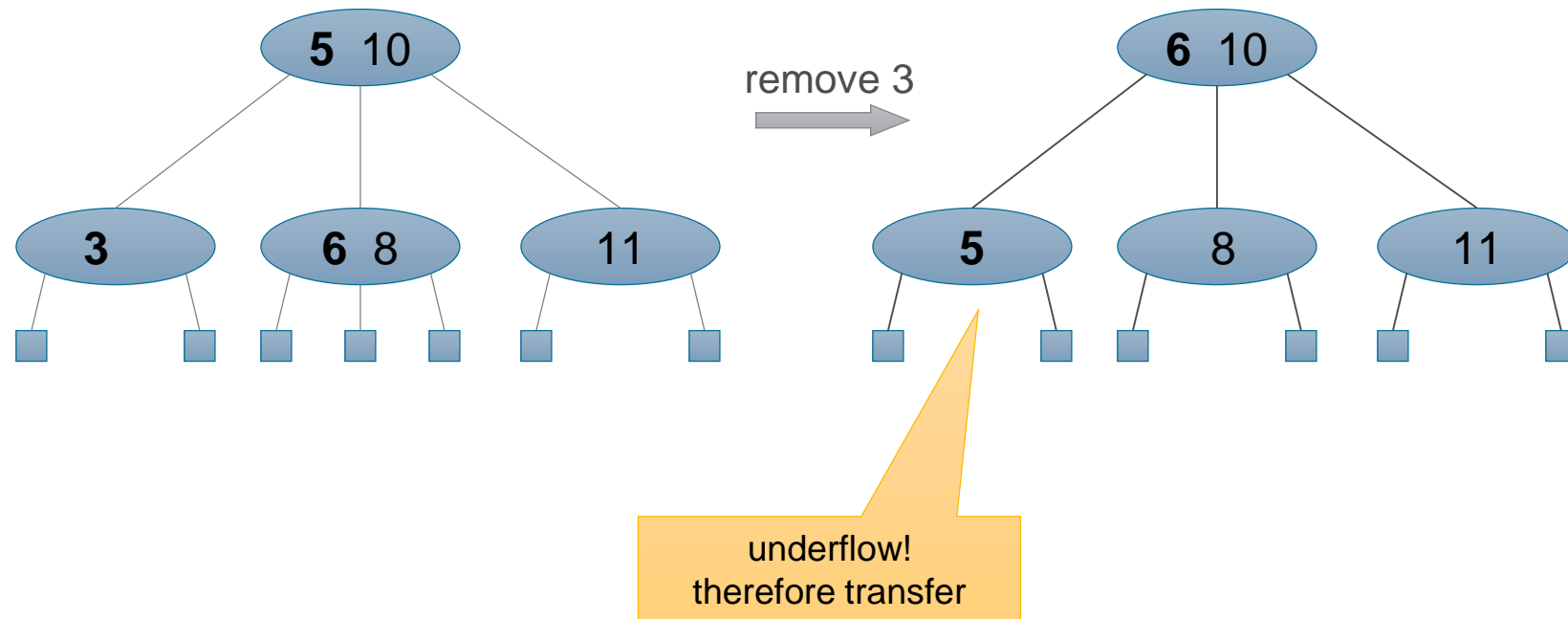
- If node has internal nodes among its children: **reduce** this case to the case where node has **only external nodes** as successors:
 - Search for previous entry according to **in-order traversing**
 - **Swap** entry with this predecessor
 - is **repeated until** the entry is at the **lowest level** of the tree.

Removal in (2,4) Trees

The entry to be deleted is the **last entry** in the node:

- **Get** entry **from parent** in this node
- Replace "gap" in **parent** node with entry from **sibling (transfer)**

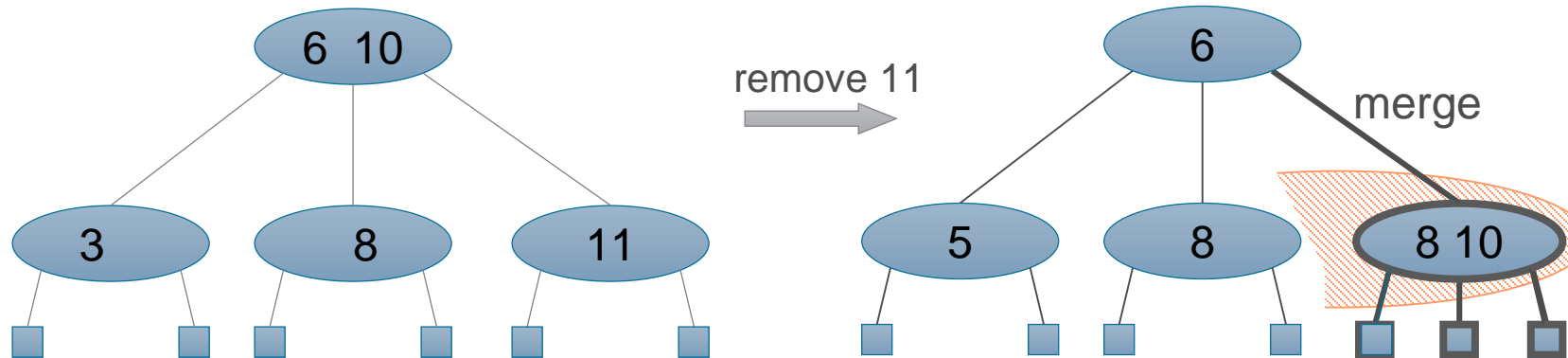
Example: Remove 3



Removal in (2,4) Trees

All siblings have **only one records**:

- Get entry from parent node
- “Merge” 2 siblings

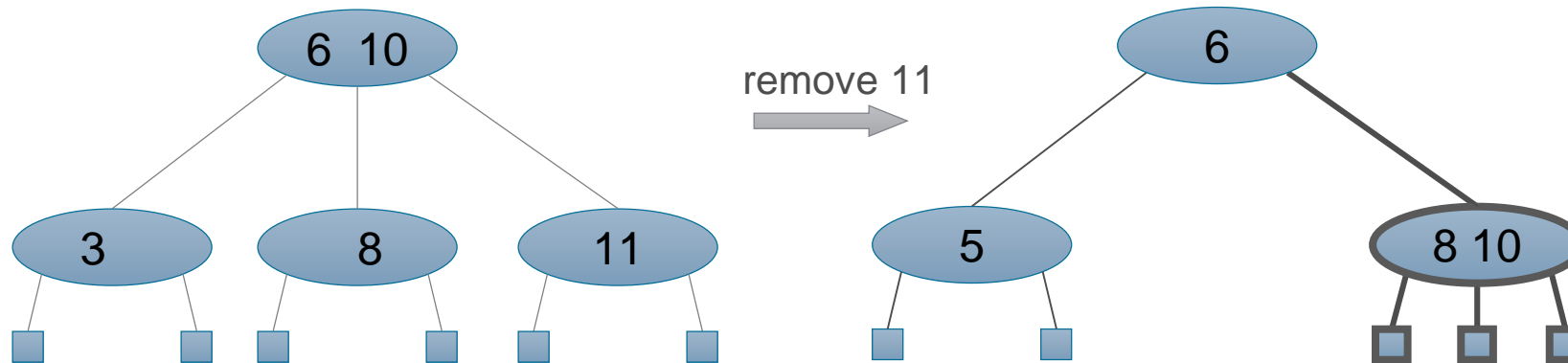


Example: Remove 11

Removal in (2,4) Trees

All siblings have **only one records**:

- Get entry from parent node
- “Merge” 2 siblings



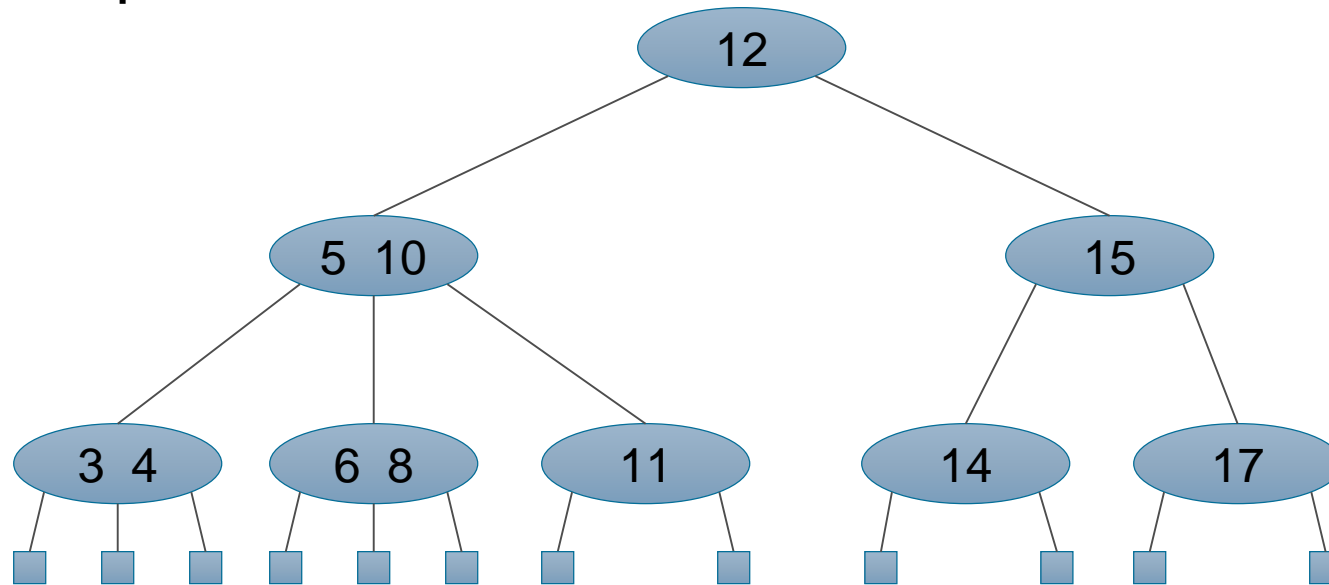
Example: Remove 11

Removal in (2,4) Trees

Parent has **only one record**:

- **Merging propagates upwards**

Example: Remove 14

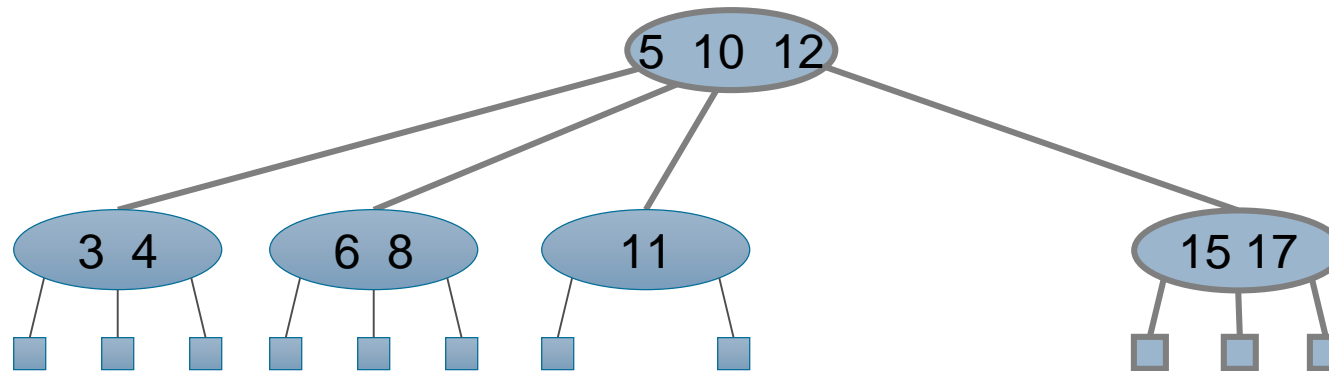


Removal in (2,4) Trees

Parent has **only one record**:

- **Merging propagates upwards**

Example: Rem



(2,4) Trees :: Complexity

Splitting, Transfer, Merge: $O(1)$

Search

- **Runtime** corresponds to **height** of the **tree**, therefore $O(\log N)$

Insert

- During search $O(\log N)$ nodes are visited
- **Inserting requires (at maximum) $O(\log N)$ node-splitting** operations
- A node-splitting operation can be done in constant time, $O(1)$
- Therefore the overall complexity for insert is: $O(\log N)$

Remove

- During search $O(\log N)$ nodes are visited
- **Remove requires at maximum $O(\log N)$ update** operations (Transfer, Merge)
- Therefore the overall complexity for remove is: $O(\log N)$

From (2,4) Trees to Red-Black Trees

Properties of (2,4) trees:

- balanced
- **Search, Insert, Remove: $O(\log N)$**
- but: structure!!

From (2,4) Trees to Red-Black Trees

Properties of (2,4) trees:

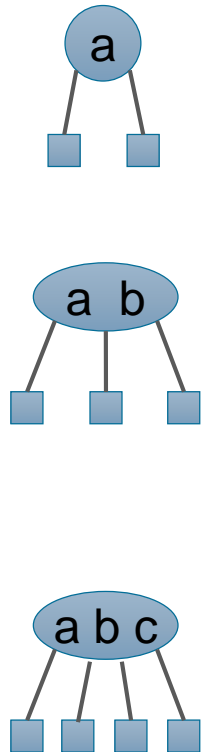
- balanced
- **Search, Insert, Remove: $O(\log N)$**
- but: structure!!

Red-Black trees

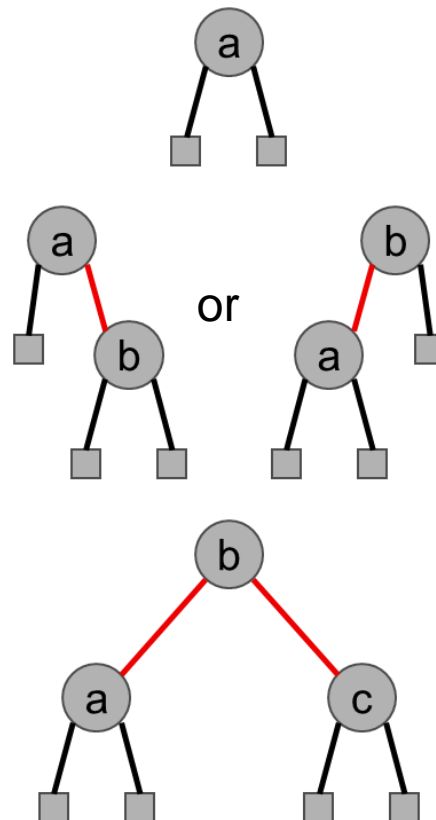
- balanced
- **Search, Insert, Remove: $O(\log N)$**
- Binary tree structure!

Red-black Trees

(2,4) tree



Red-Black tree

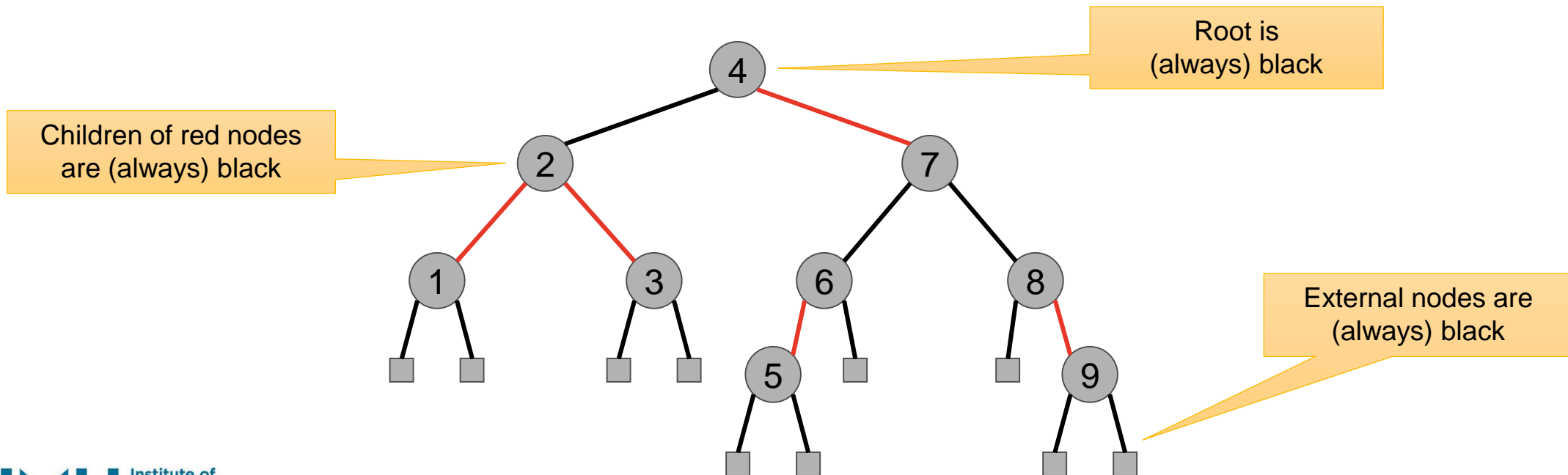


Red-black trees are another way of representing (2,4) trees.

Red-black Trees

A red-black tree is a **binary search tree** with the following properties

- Edges are colored **red** or **black**
- In **no** path from root to leaf there are **two consecutive red** edges
- The number of **black edges** is the same for each path from the root to a leaf ("**black height**")
- **Edges** that lead to **leaves** are **always black**.



Properties of red-black Trees

Let

- N** be the number of **internal nodes**
- L** be the number of **leaves** ($L = N+1$)
- H** be the **height**
- B** be the **Black Height** (height according to black edges)

Property 1:

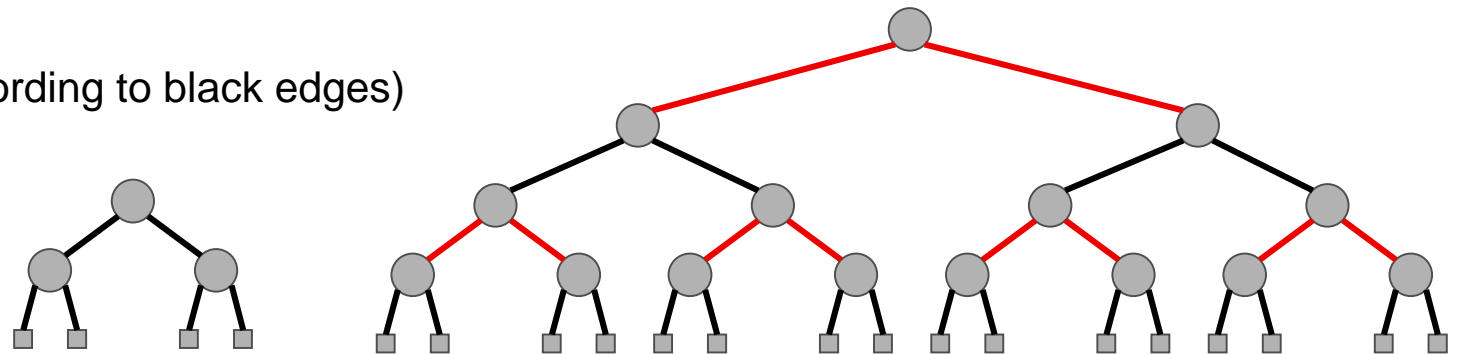
$$2^B \leq N+1 \leq 4^B$$

Property 2:

$$1/2 \log_2 (N+1) \leq B \leq \log_2 (N+1)$$

Property 3:

$$\log_2 (N+1) \leq H \leq 2 \log_2 (N+1)$$



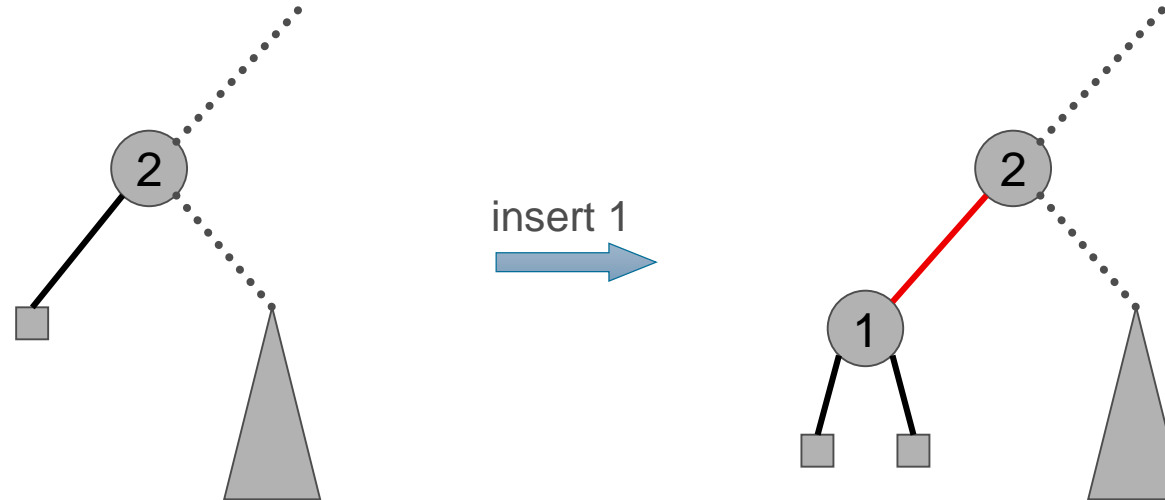
Search algorithm in Red-Black trees is identical to search in binary trees

Implies a search complexity of $O(\log N)$

Height is twice as high as that of the corresponding (2,4) tree

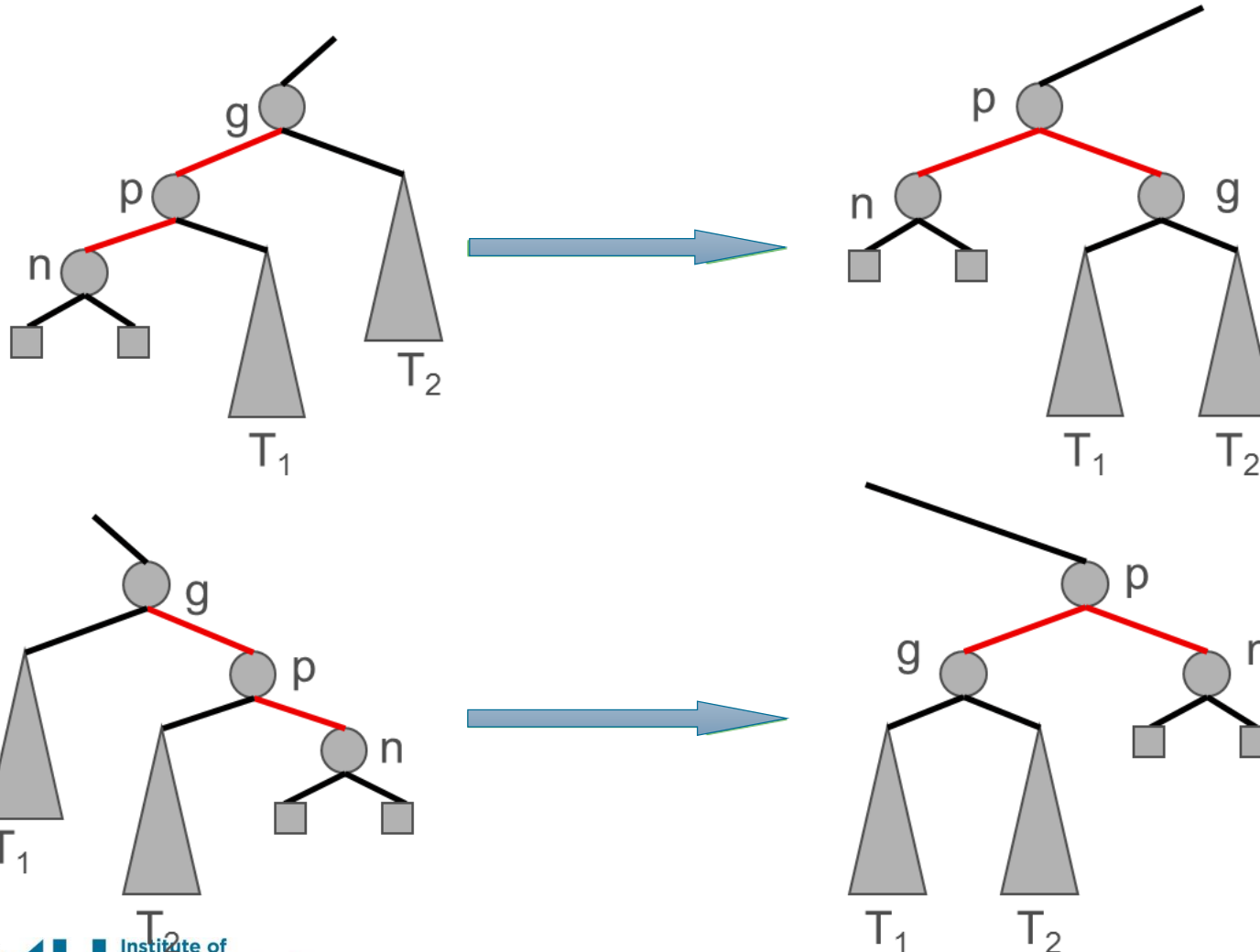
Insert in red-black Trees

- **Search** for **leaf position** at which the new key is to be **inserted**.
- **Replace leaf** with **internal node** containing **new key**
- **Color** the edge leading into the new node **red**.
- **Attach** two **new leaves** to the new node via **black edges**



- If the parent of the new node has already an incoming red edge, two red edges would follow each other. Therefore **restructuring by rotation or promotion** is required.

Insert in red-black Trees



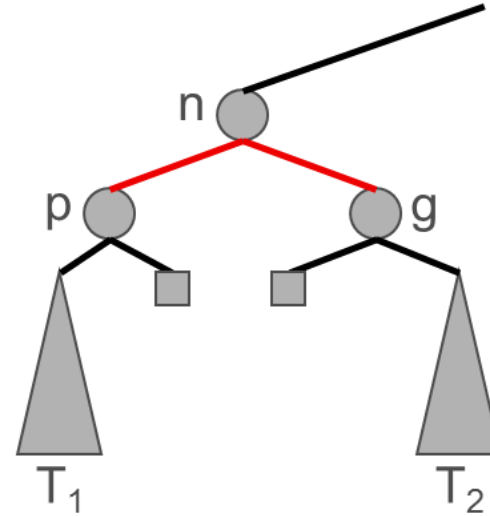
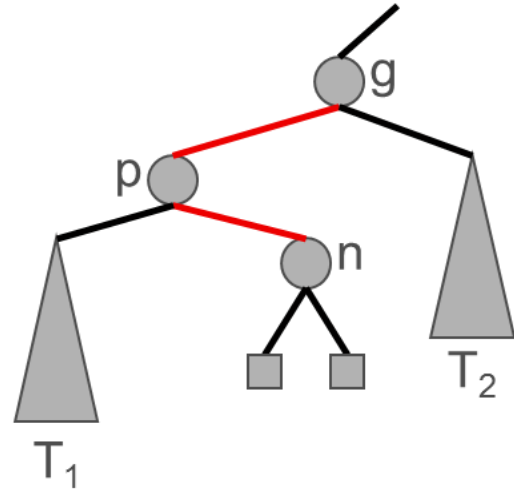
Restructuring by **rotation** (single)

n ... new node

p ... parent

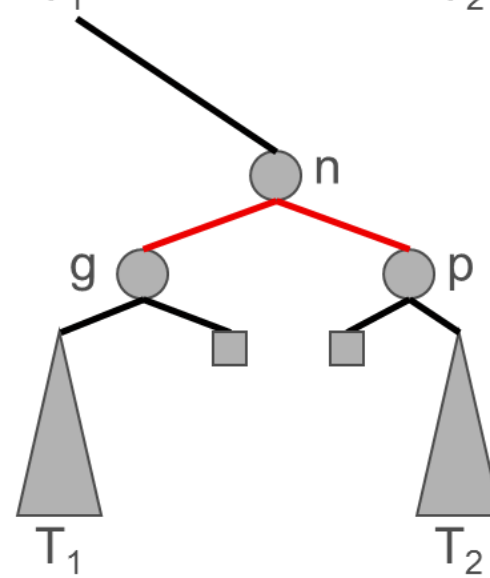
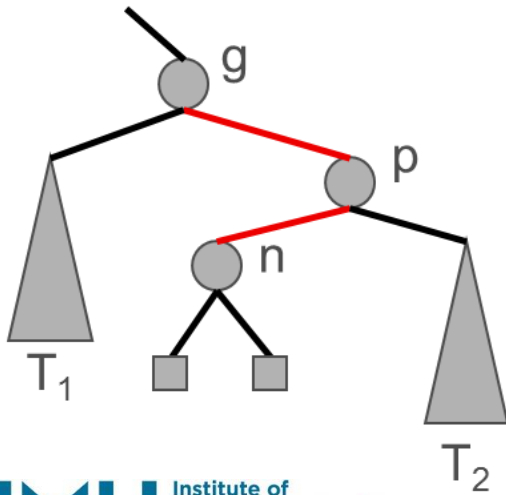
g ... grandparent

Insert in red-black Trees



Restructuring by **rotation**
(double)

n ... new node
p ... parent
g ... grandparent



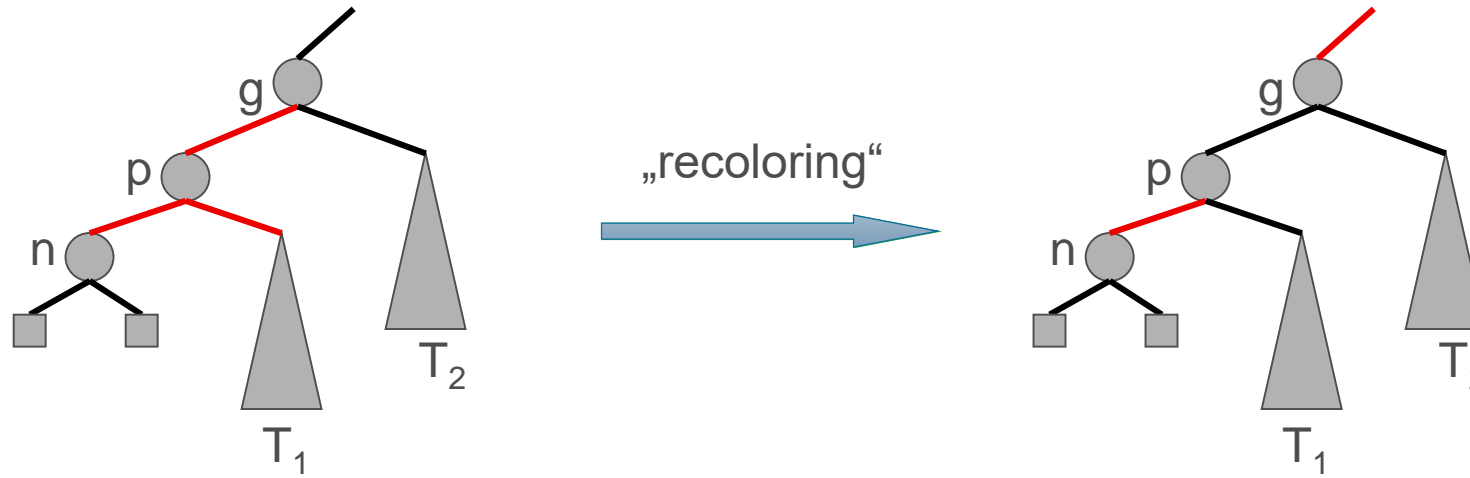
Insert in red-black Trees

Restructuring by **promotion** (if sibling of p is also red)

n ... new node

p ... parent

g ... grandparent



Can propagate upwards (if parent of g has a red incoming edge)

Insert in red-black Trees :: Summary

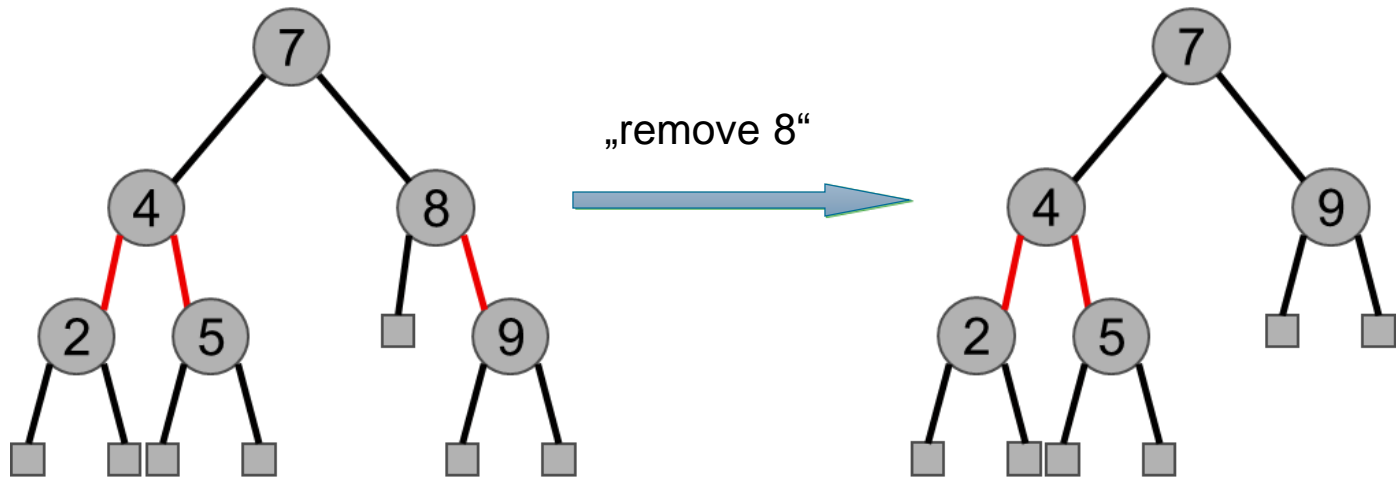
If **two red edges** follow each other after insertion, then

- **restructure** tree by **single** or **double rotation** - done!
- or **recolor** edges (if necessary propagate upwards)

Runtime

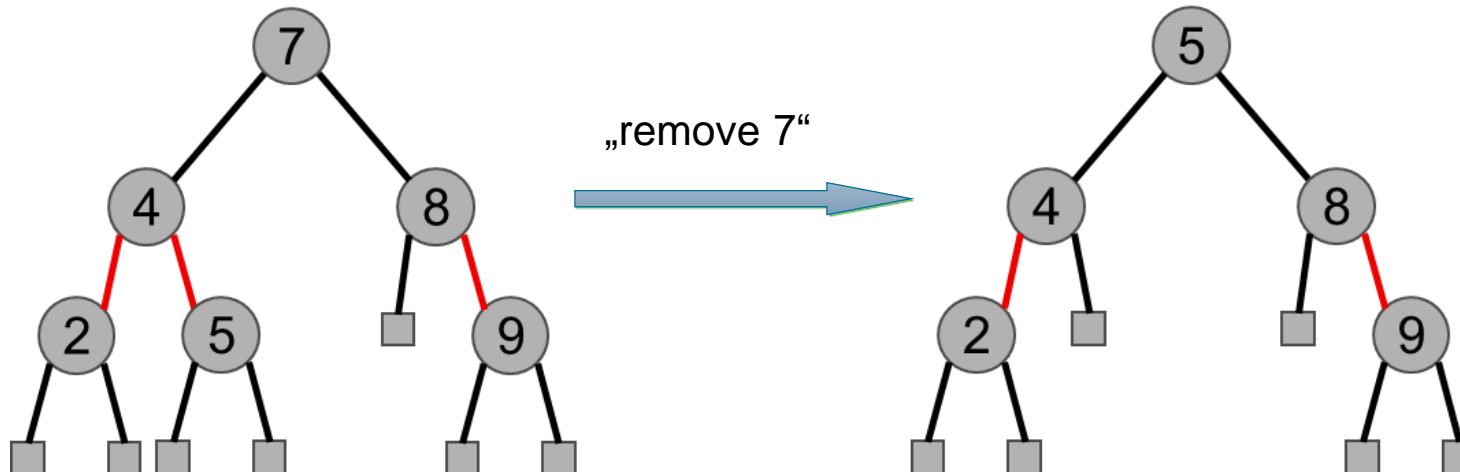
- **Restructuring:** $O(1)$
- **Promotion (Recoloring):** $O(\log N)$
if it propagates until root is reached
- Therefore the **overall** complexity for insert is: $O(\log N)$

Removal in red-black Trees



Case 1:

The node to be deleted has **at least one external** node as a child.



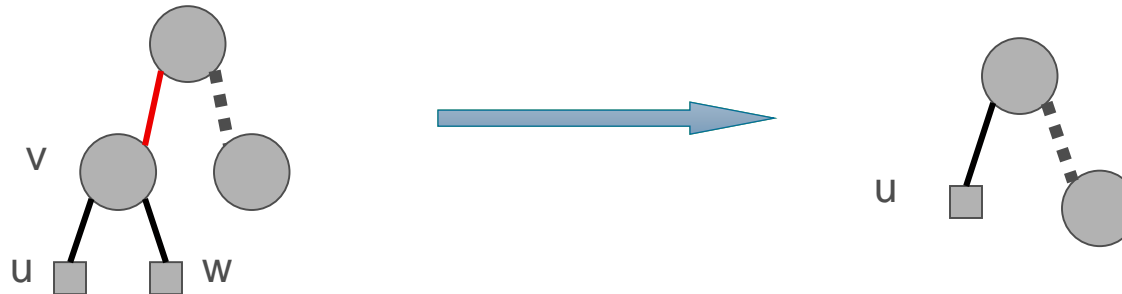
Case 2:

The node to be deleted has **no external node** as child, then replace node with in-order predecessor (or successor).

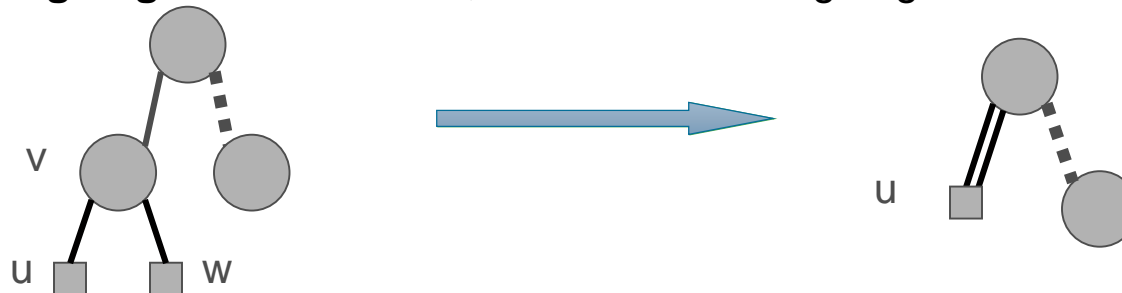
Removal in red-black Trees

Algorithm for Remove:

1. Remove **v** by “**removeAboveExternal**” operation on a leaf **w**, which is a child of **v**.
2. If **parent incoming edge** to **v** was red, color the incoming edge to **u** now black



3. If **parent incoming edge** to **v** was black, color the incoming edge to **u** double-black.



4. As long as there are double-black colored edges, “**color compensation**” by **restructuring** or **recoloring** is required (total number of black edges must be preserved).

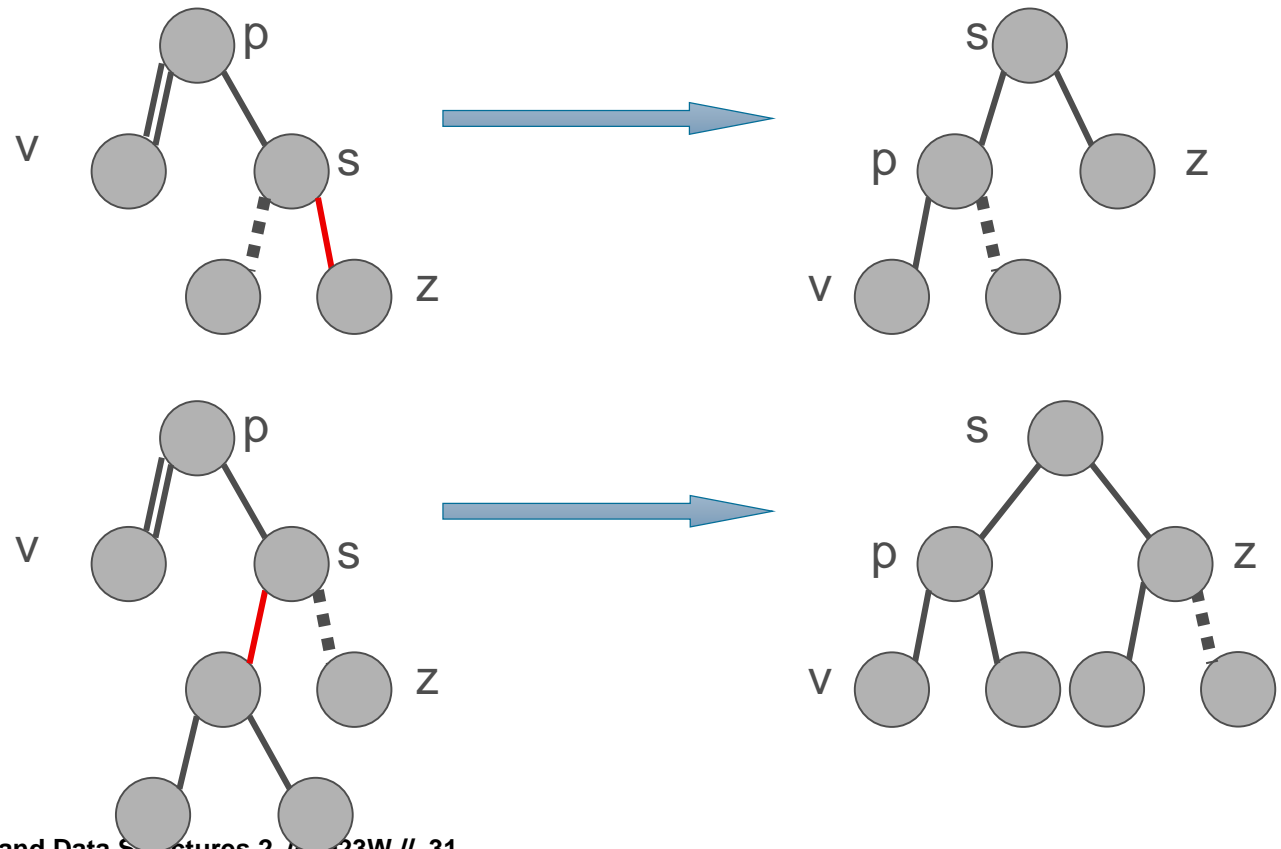
Removal in red-black Trees

Elimination of double-black colored edges

- Search „nearby“ red edge and **change colors** from (red, double-black) in (black, black)

Case 1: black sibling with red child;

Restructuring



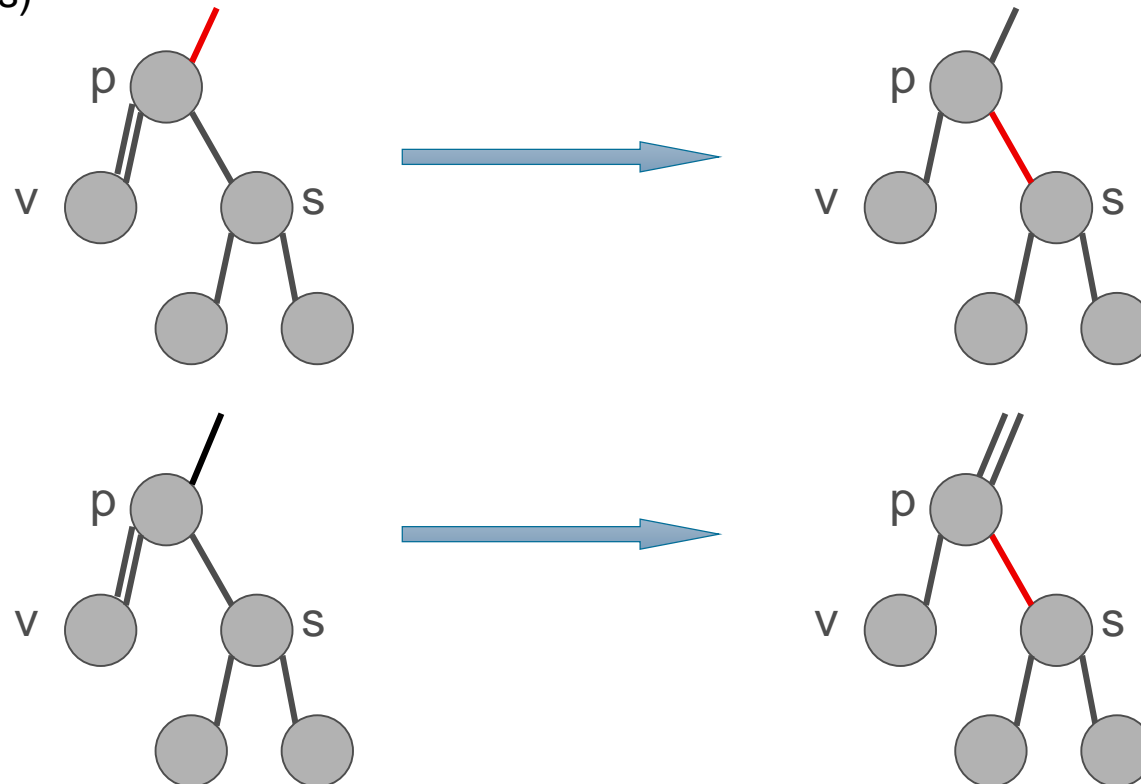
Removal in red-black Trees

Elimination of double-black colored edges

- Search „nearby“ red edge and change colors from (red, double-black) in (black, black)

Case 2: black sibling with black child;

Recoloring (with possible **propagation** upwards)



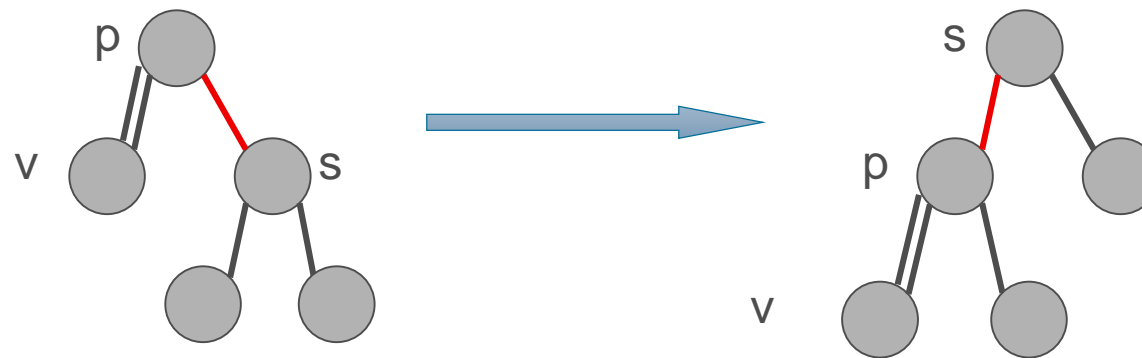
Removal in red-black Trees

Elimination of double-black colored edges

- Search „nearby“ red edge and change colors from (red, double-black) in (black, black)

Case 3: red sibling;

Adjustment



Then proceed according to case 1 or 2.

Red-black Trees :: Summary

Insert or **Remove** can cause a **local interference** (successive red or double-black colored edges)

Resolving the interference

- **Locally** by **restructuring**
- **Globally** by **propagation** on higher levels (recoloring)

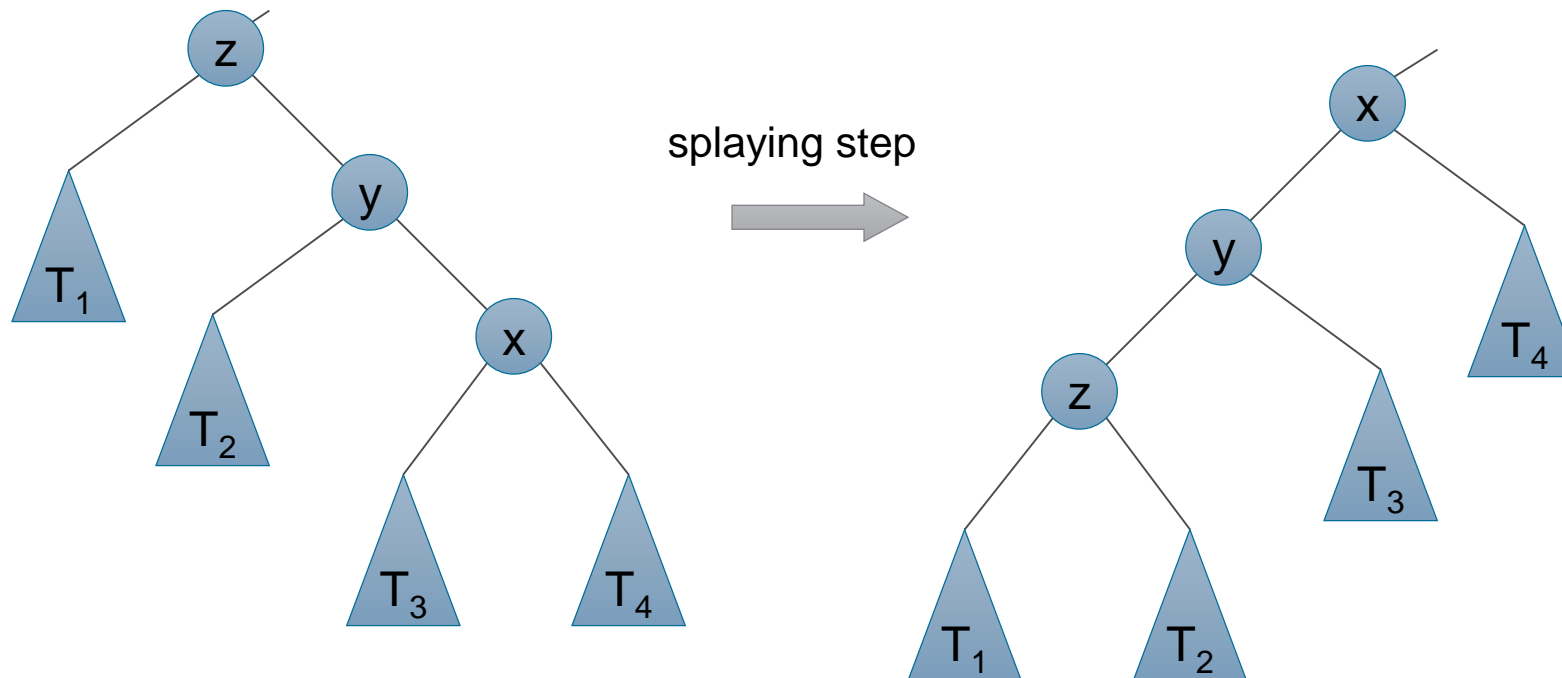
Complexity

- One restructure or recolor step: $O(1)$
- **Insert**: at maximum **1 restructure** step or $O(\log N)$ **recolor** steps
- **Remove**: at maximum **2 restructure** steps or $O(\log N)$ **recolor** steps
- **Overall** complexity: $O(\log N)$

Splay Trees

Binary search tree, in which “splaying” is done **after each access operation** => adaption to search queries

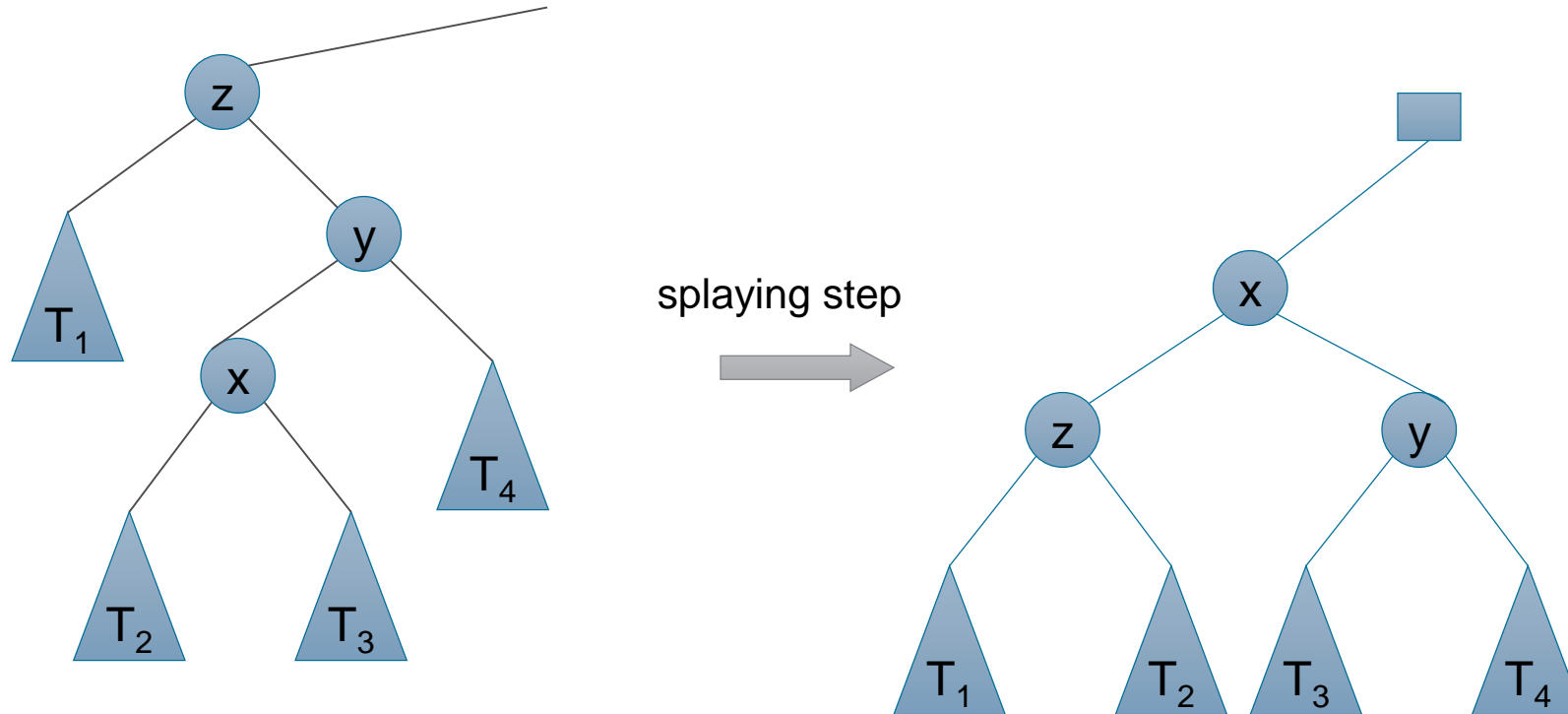
- **Splaying**: special **move-to-root operation** is applied to node **x**
- **Three cases** for one step in splaying:
 - **zick-zick**: **x** is right (left) child of **y**, **y** is right (left) child of **z**



Splay Trees

Three cases for one step in splaying:

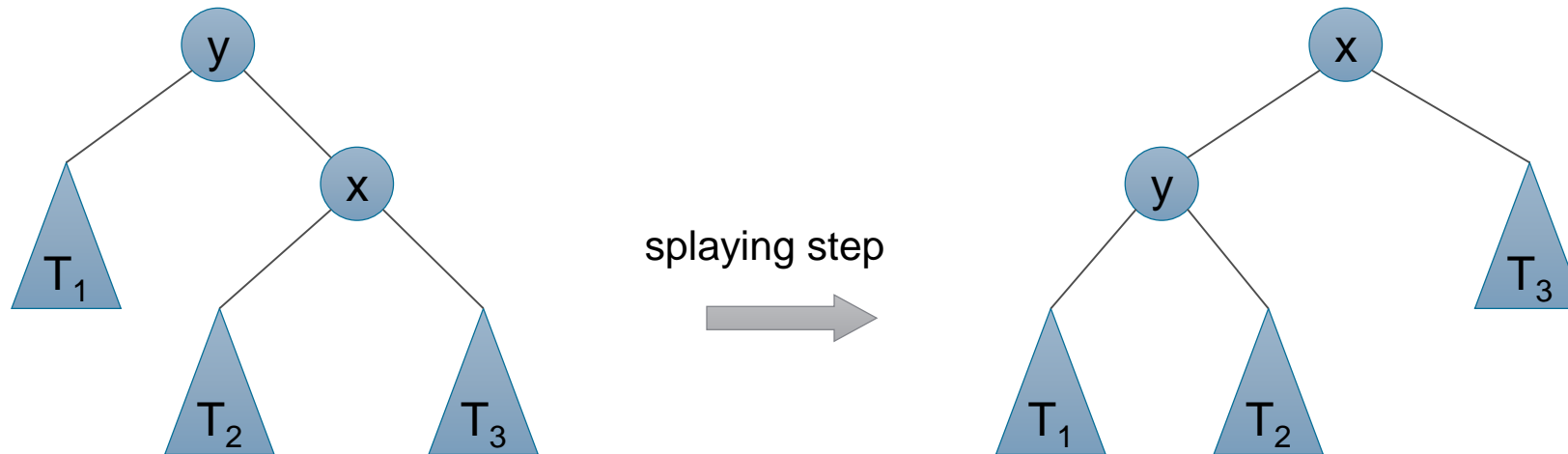
- **zick-zack:** **x** is left (right) child of **y**, **y** is right (left) child of **z**



Splay Trees

Three cases for one step in splaying:

- **zick**: **x** is left (right) child of **y**, **y** is root



Splay Trees

Splaying operation **starts** at the **lowest** node **x**, which is **visited** in an **access operation** (**insert, delete, find**)

Is executed **until** this node **x** is the **root**

In each **zick-zick** or **zick-zack** step the **height** of **x** **decreases** by **2**, in one **zick** step by **1**

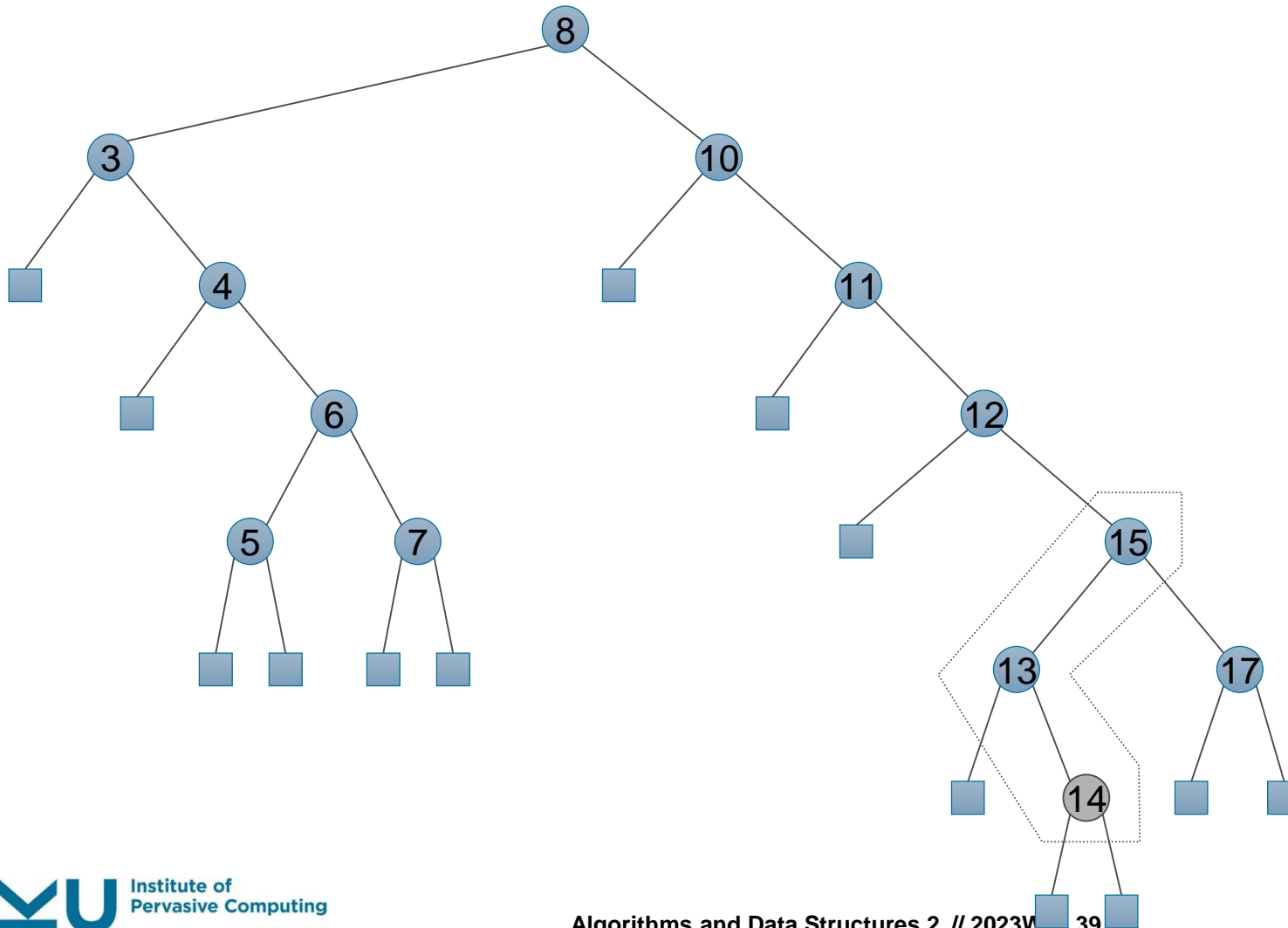
- Therefore, splaying the node **x** with **depth d** requires $\lfloor d/2 \rfloor$ zick-zacks or zick-zicks if **d** is even and an additional zick if **d** is odd

Each of these operations affect a **constant** number of nodes, so the complexity is $O(1)$

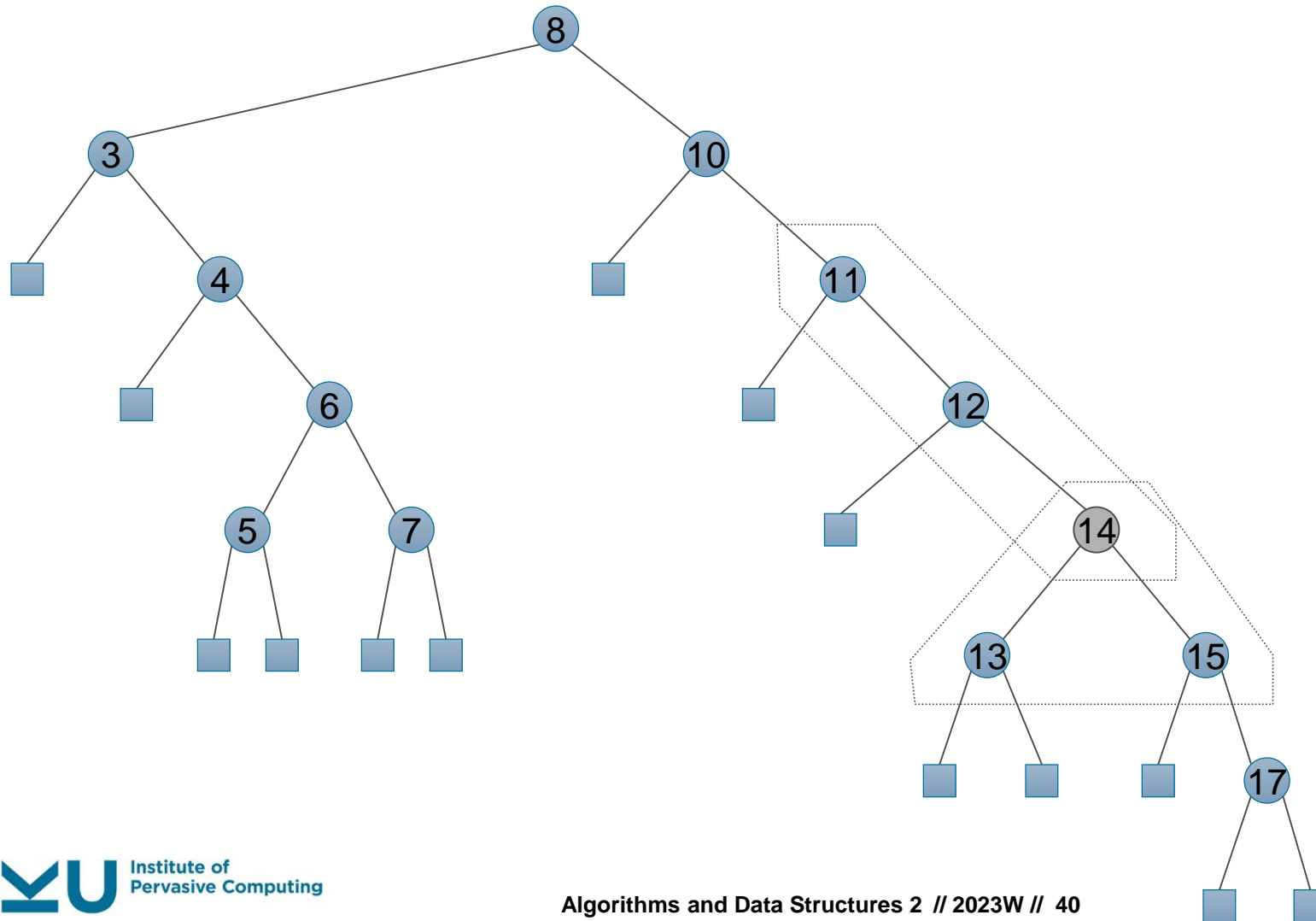
- Therefore we have a **complexity** for **splaying** of **$O(d)$**
d ... depth of the tree

Splay Trees :: Example

splaying starts at node 14: [zick-zack](#)

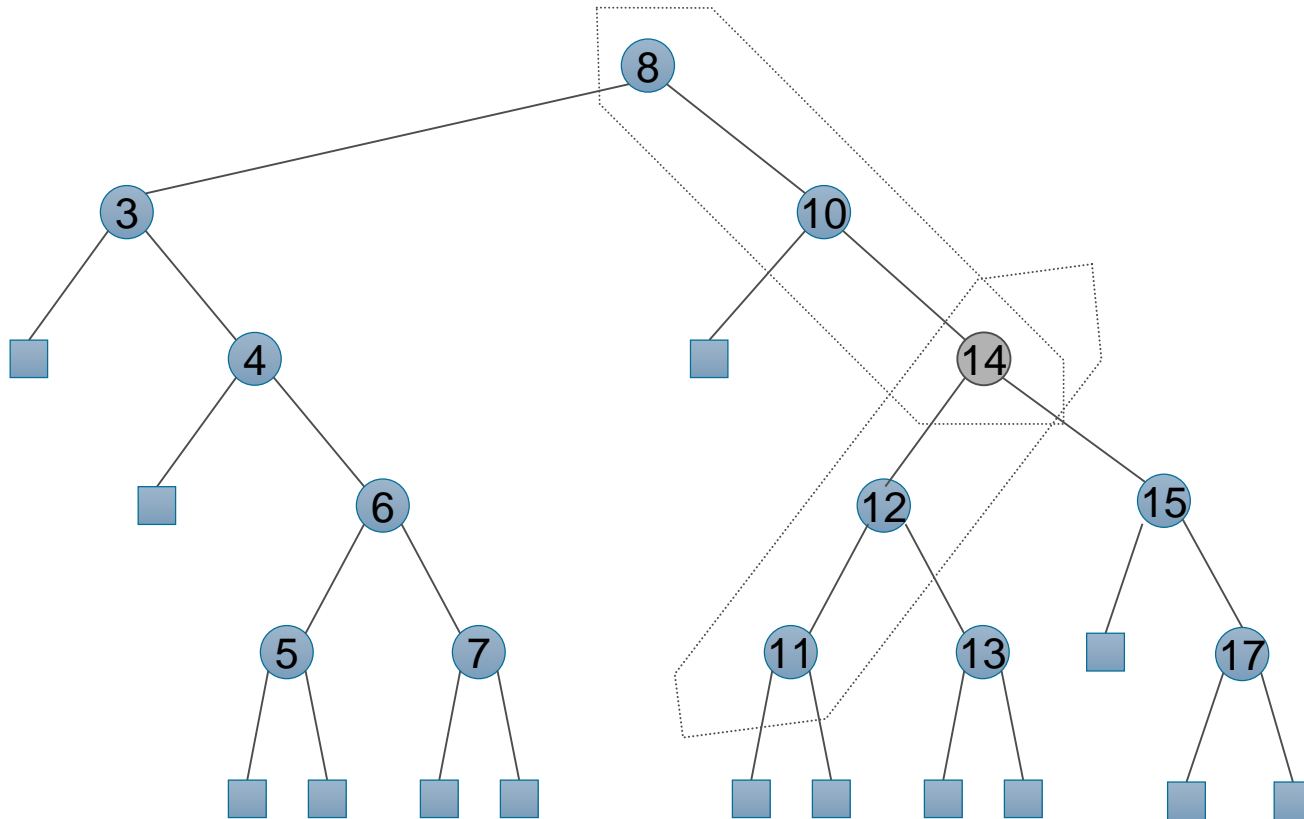


Splay Trees :: Example



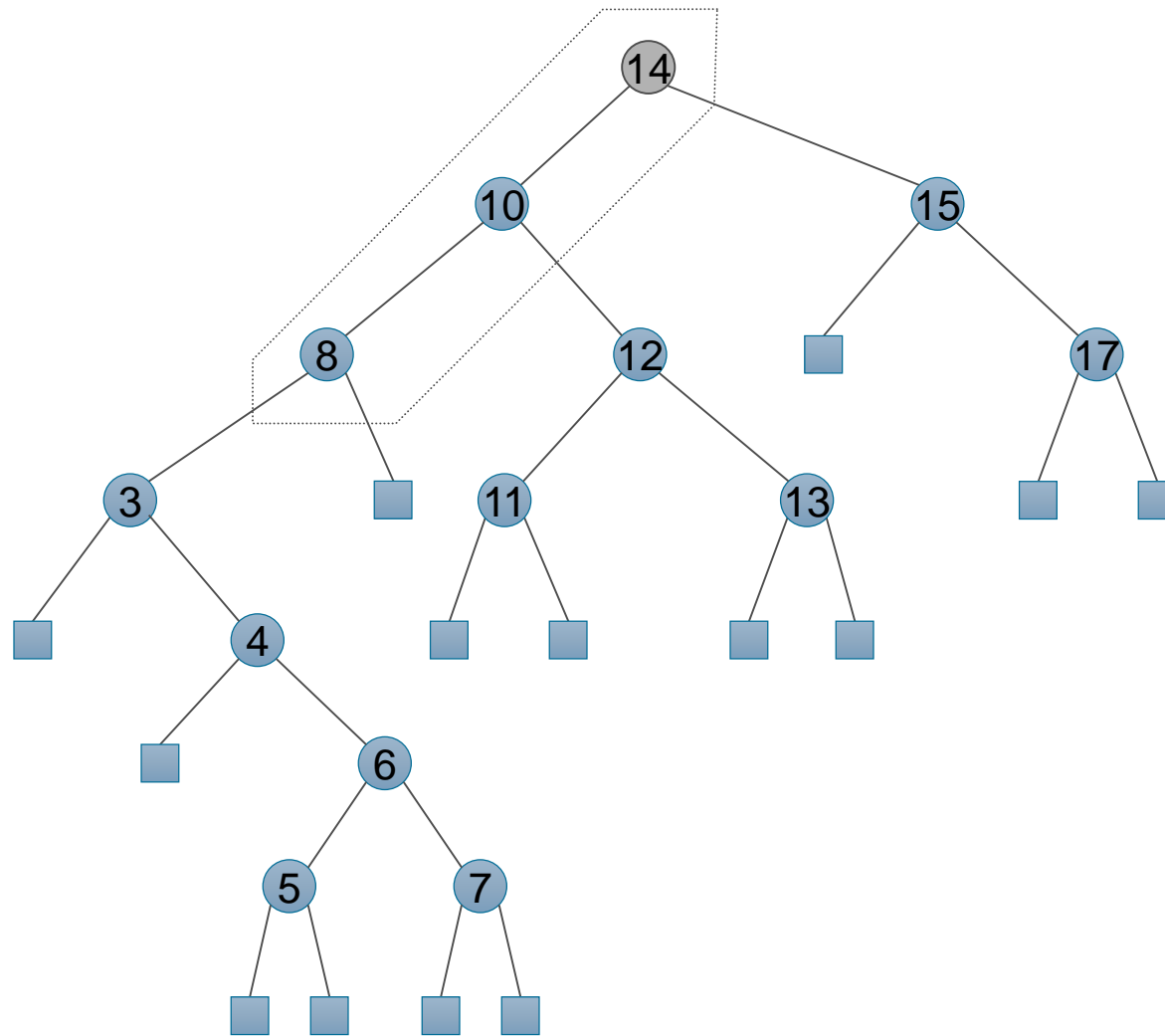
after [zick-zack](#)
next step: zick-zick

Splay Trees :: Example



after **zick-zick**
next step: zick-zick

Splay Trees :: Example



after zick-zick – done!

Splay Trees

When and at which node is splaying performed?

Search for key k

- Case 1: node x **contains** key k, then splaying of x
(previous example could be considered as splaying after “find 14”)
- Case 2: search unsuccessful, then splaying of **parent** of **last visited** leaf
(previous example could be considered as splaying after “find 14,5”)

Insertion of key k

- Splaying is done **with new** node x containing k
(previous example could be considered as splaying after “insert 14”)

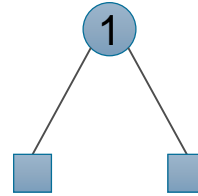
Removal of key k

- Splaying with **parent of removed** node

Splay Trees

Example for Insert

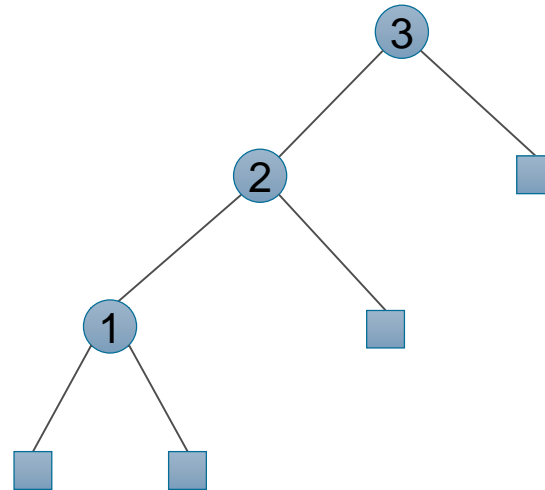
- original tree



Splay Trees

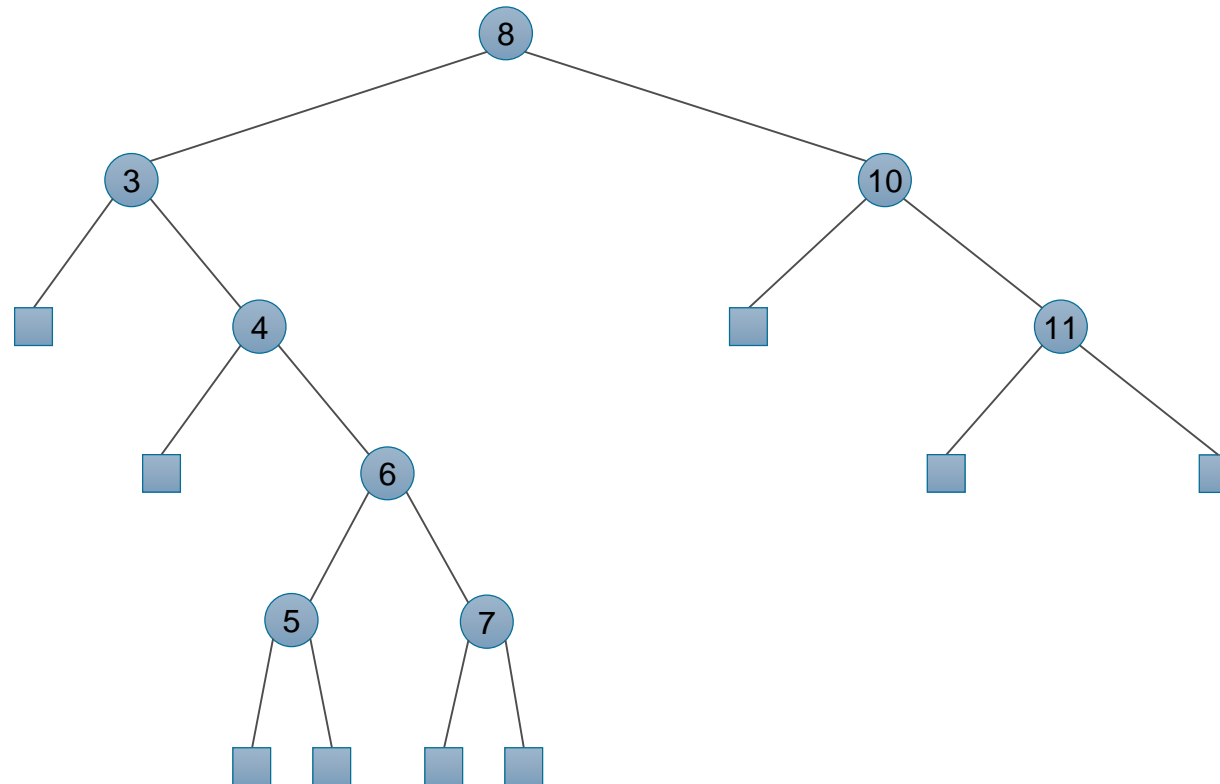
Example for Insert

- original tree
- after Insert of 2
- after splaying
- after insertion of 3
- after splaying



Splay Trees

Example for Remove: remove 8

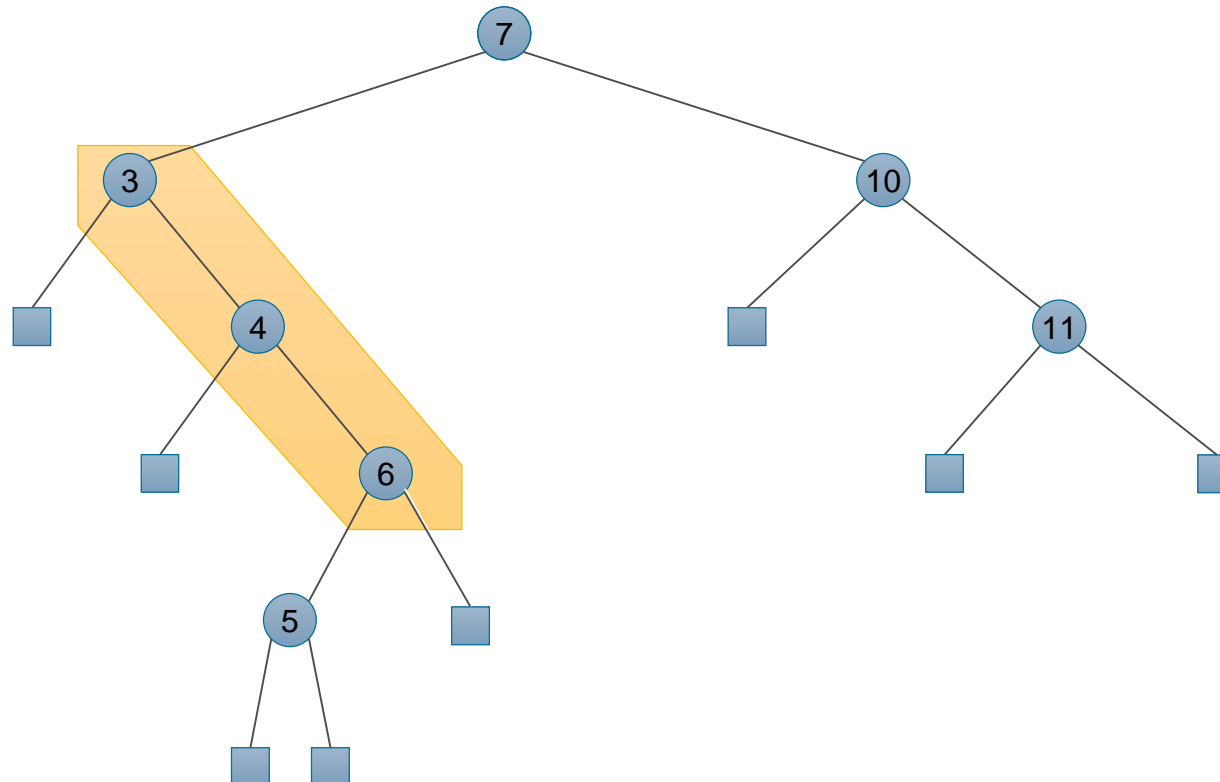


Splay Trees

Example for Remove: remove 8

Set the rightmost internal node of the left subtree of 8 at the position of 8

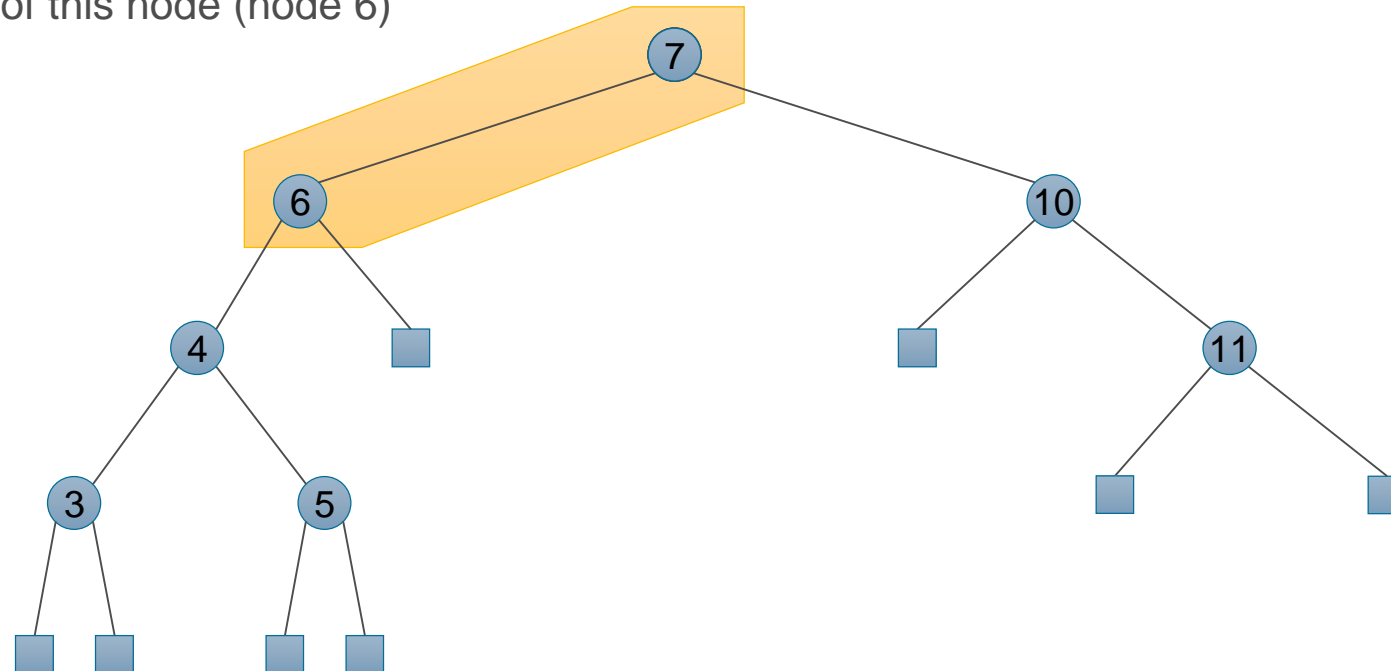
Splaying with parent of this node (node 6)



Splay Trees

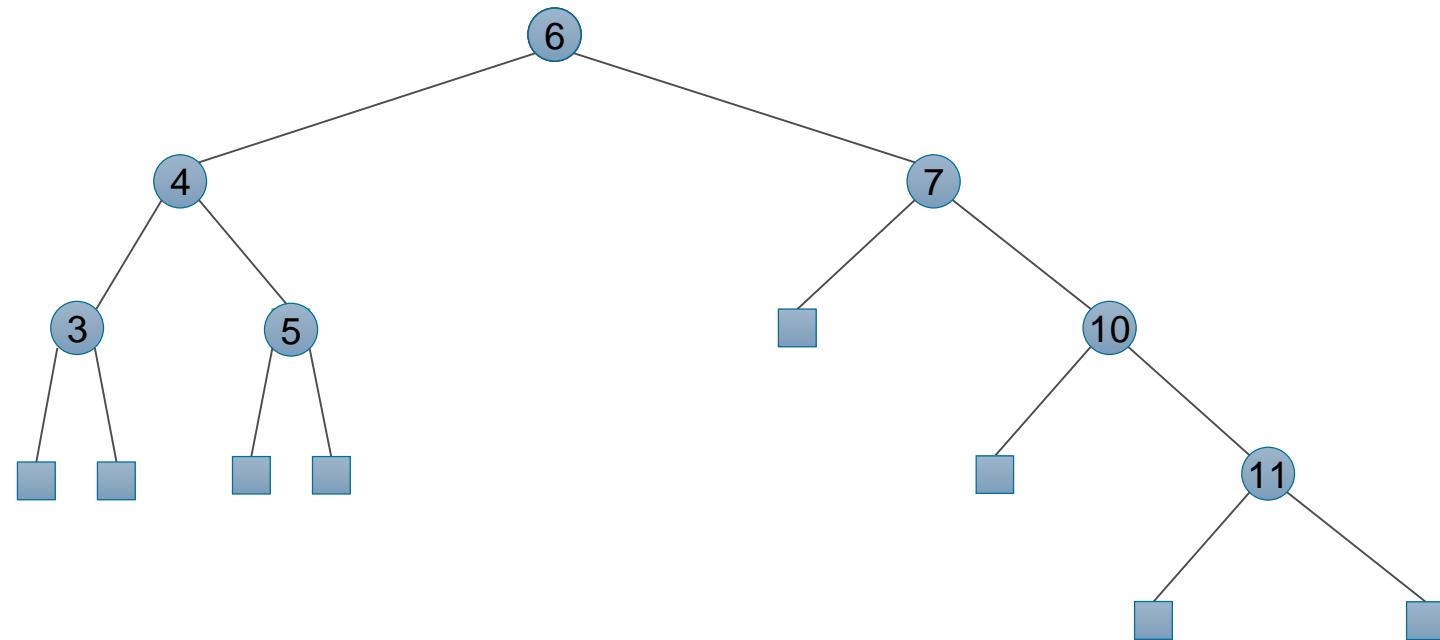
Example for Remove: remove 8

Set the rightmost internal node of the left subtree of 8 at the position of 8
Splaying with parent of this node (node 6)



Splay Trees

Example for Remove: remove 8



Splay Trees :: Analysis

Insert, Remove, Search: $O(h)$
(with h = depth of the tree)

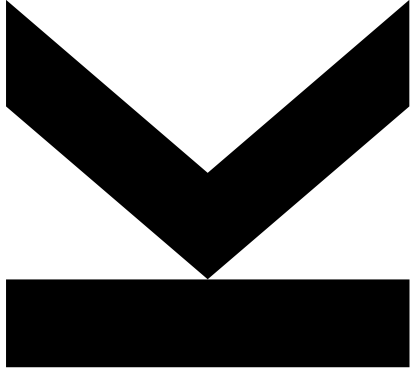
in worst case: $h = N$ therefore $O(N)$
(see example of insertion)

An amortized analysis (using the accounting method) can show that on average we have:
 $O(\log N)$

Splay Trees :: Analysis

Implementation	Search Time		Insertion Time		Deletion Time	
<i>Skip lists</i>	0.051 msec	(1.0)	0.065 msec	(1.0)	0.059 msec	(1.0)
<i>Non-recursive AVL trees</i>	0.046 msec	(0.91)	0.10 msec	(1.55)	0.085 msec	(1.46)
<i>Recursive 2-3 trees</i>	0.054 msec	(1.05)	0.21 msec	(3.2)	0.21 msec	(3.65)
<i>Self-adjusting trees:</i>						
<i>Top-down splaying</i>	0.15 msec	(3.0)	0.16 msec	(2.5)	0.18 msec	(3.1)
<i>Bottom-up splaying</i>	0.49 msec	(9.6)	0.51 msec	(7.8)	0.53 msec	(9.0)

Trees (Weight Balanced)



Algorithms and Data Structures 2, 340300
Lecture – 2023W
Univ.-Prof. Dr. Alois Ferscha, teaching@pervasive.jku.at