
Algorithms II, CS 502

Augmenting Data Structures

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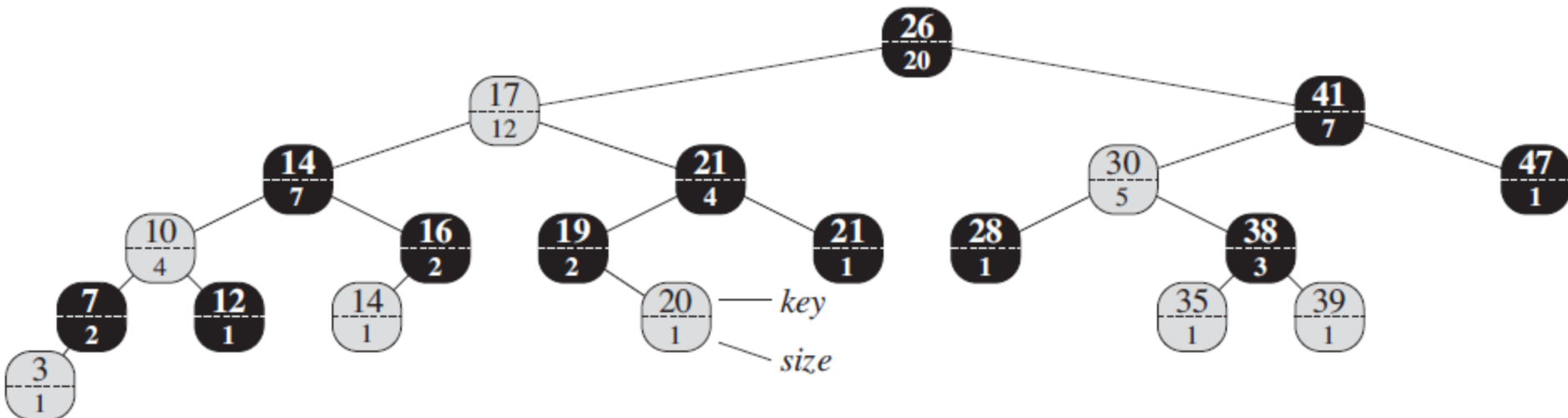
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Augmenting

- Often times “textbook” data structures (DS) are sufficient
 - need to modify for real-life usage of course (we rarely sort “just integers” but rather “objects based on a unique field which is an integer”)
- Frequently, will suffice to **augment** a textbook DS by storing additional info in it
 - to perform additional operations on the DS

Example: Dynamic order statistics

- Order statistic (OS) trees augment red-black trees:
 - Associate a **size** field with each node in the tree
 - **x.size** keeps size of subtree rooted at **x** (including **x**)
 - **x.size = x.left.size + x.right.size + 1**



Selecting i^{th} element

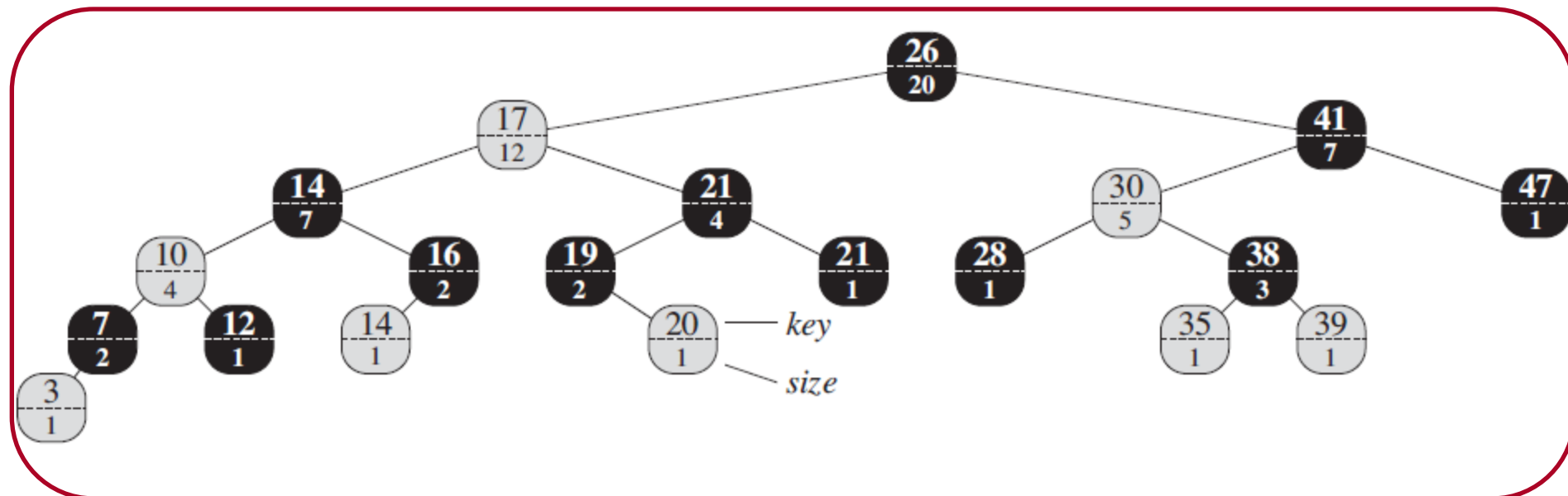
- We can use this new field to select i^{th} element in $O(\lg n)$ time

```
OS-SELECT( $x, i$ )
1   $r = x.left.size + 1$ 
2  if  $i == r$ 
3      return  $x$ 
4  elseif  $i < r$ 
5      return OS-SELECT( $x.left, i$ )
6  else return OS-SELECT( $x.right, i - r$ )
```

Selecting i^{th} element

□ OS-Select (T.root, 17)

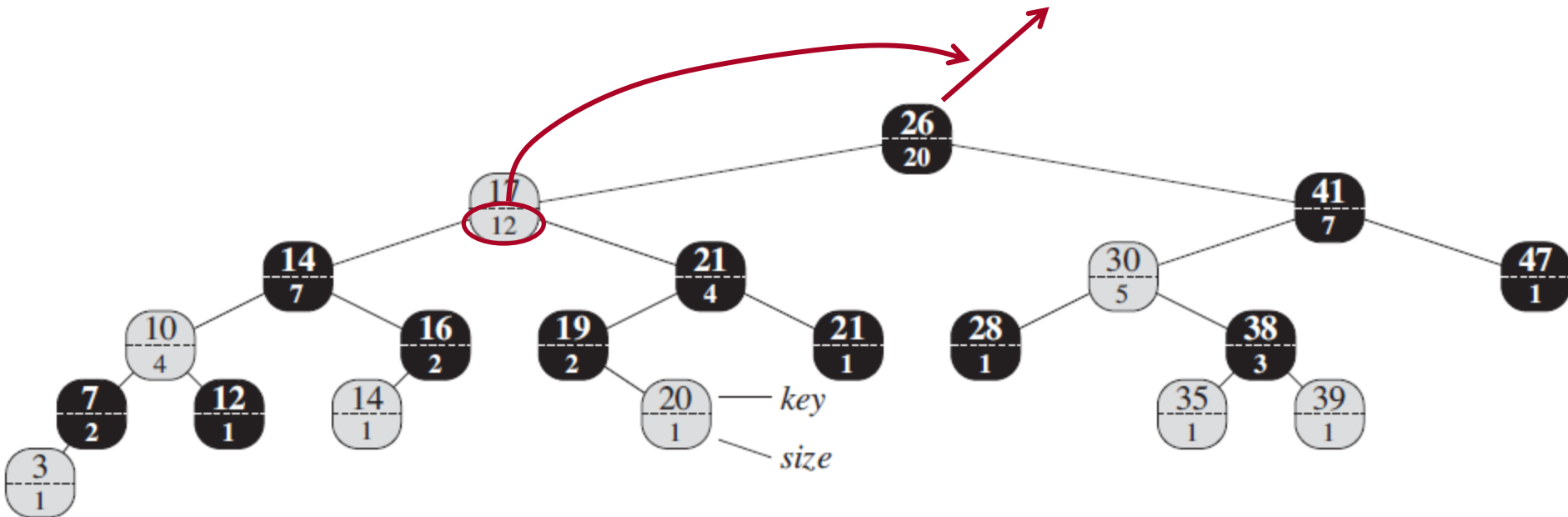
17th in



Selecting i^{th} element

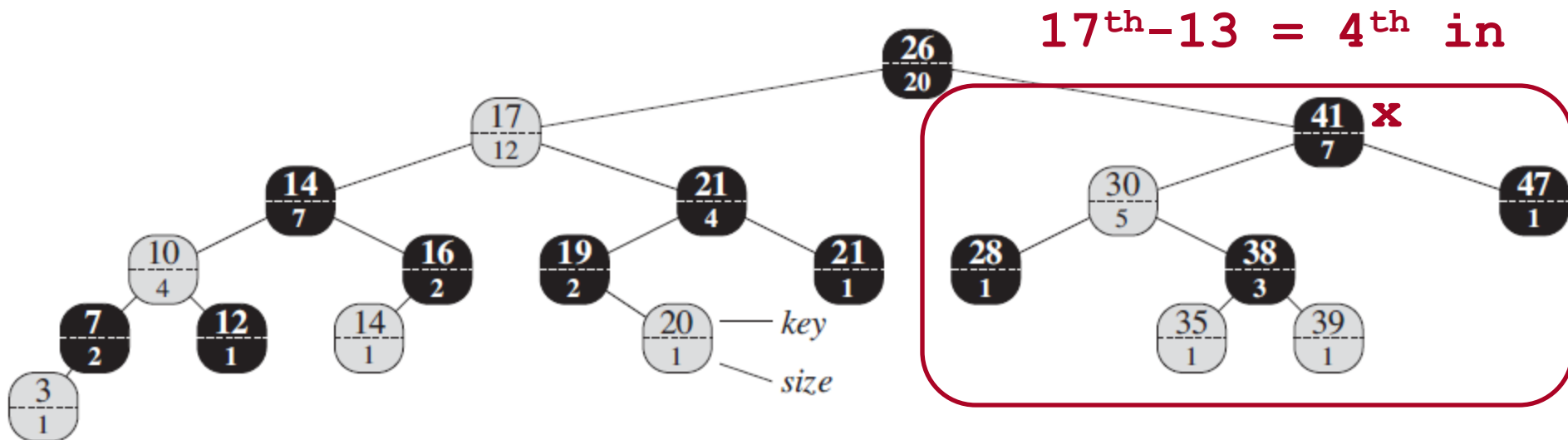
□ OS-Select (T.root, 17)

rank(T.root) =
 $12 + 1 = 13 < 17^{\text{th}}$



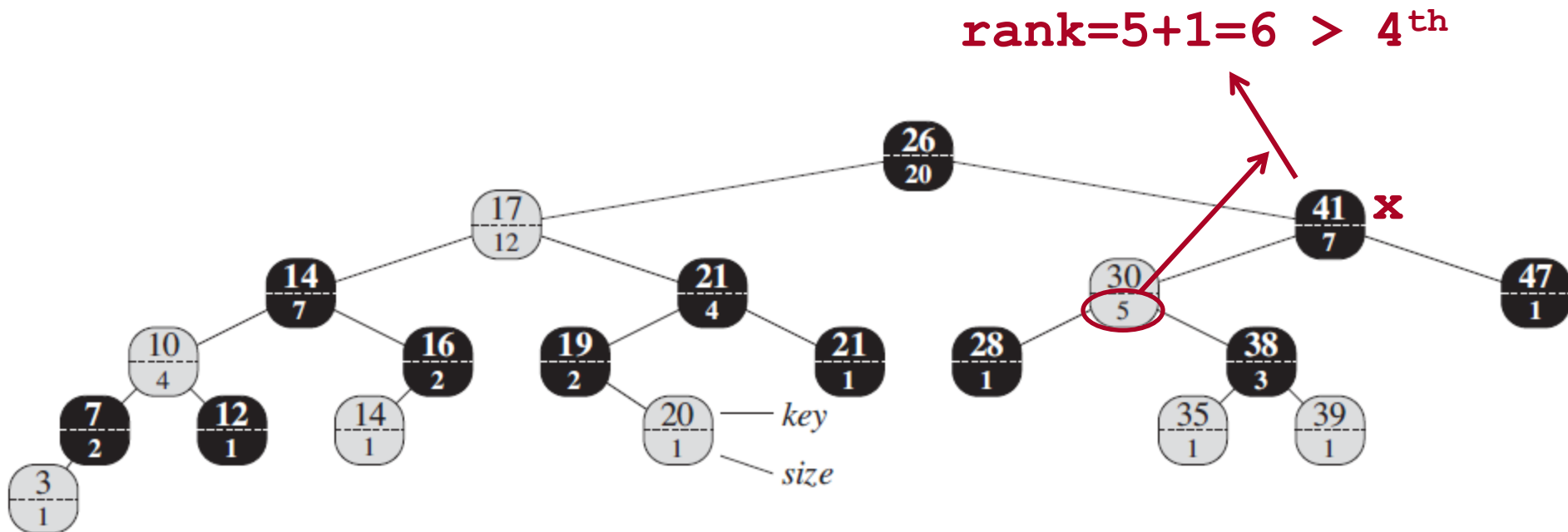
Selecting i^{th} element

□ OS-Select ($x, 4$)



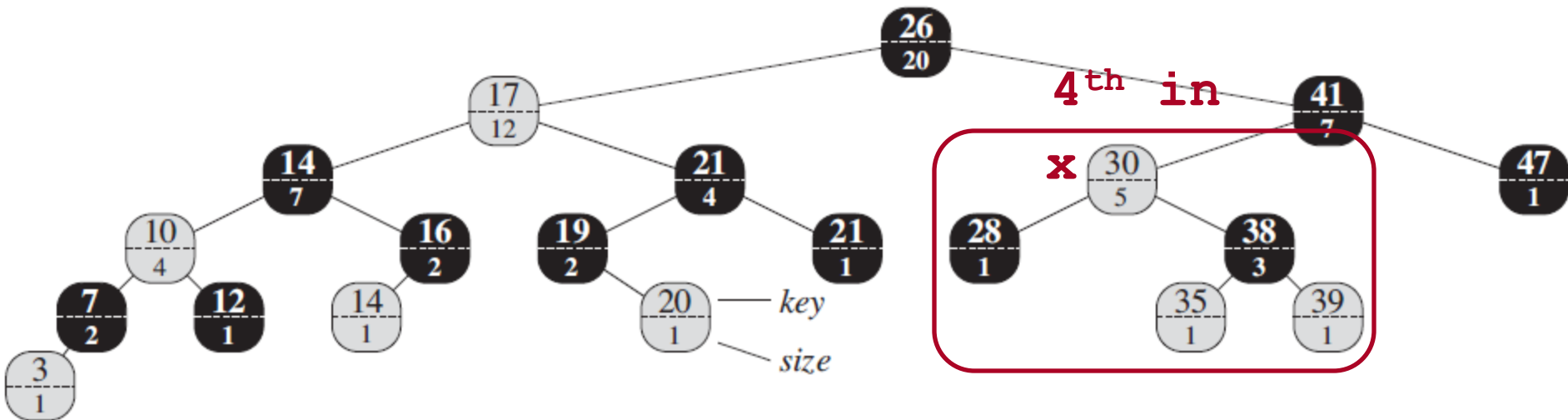
Selecting i^{th} element

□ OS-Select ($x, 4$)



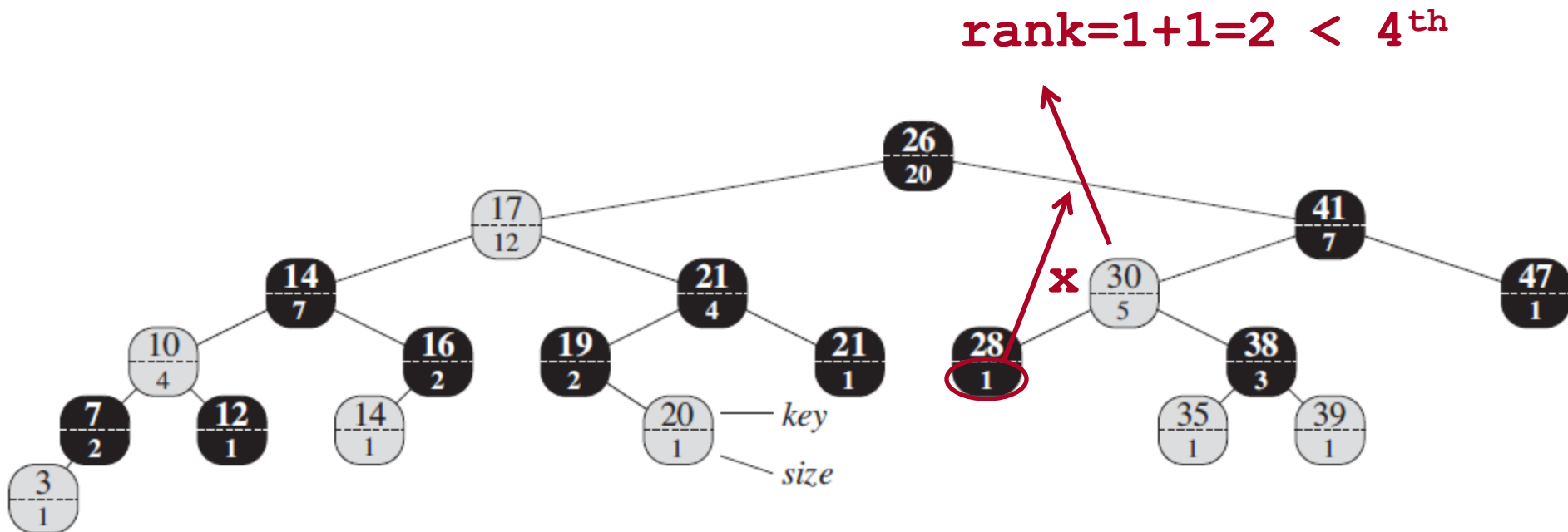
Selecting i^{th} element

□ OS-Select ($x, 4$)



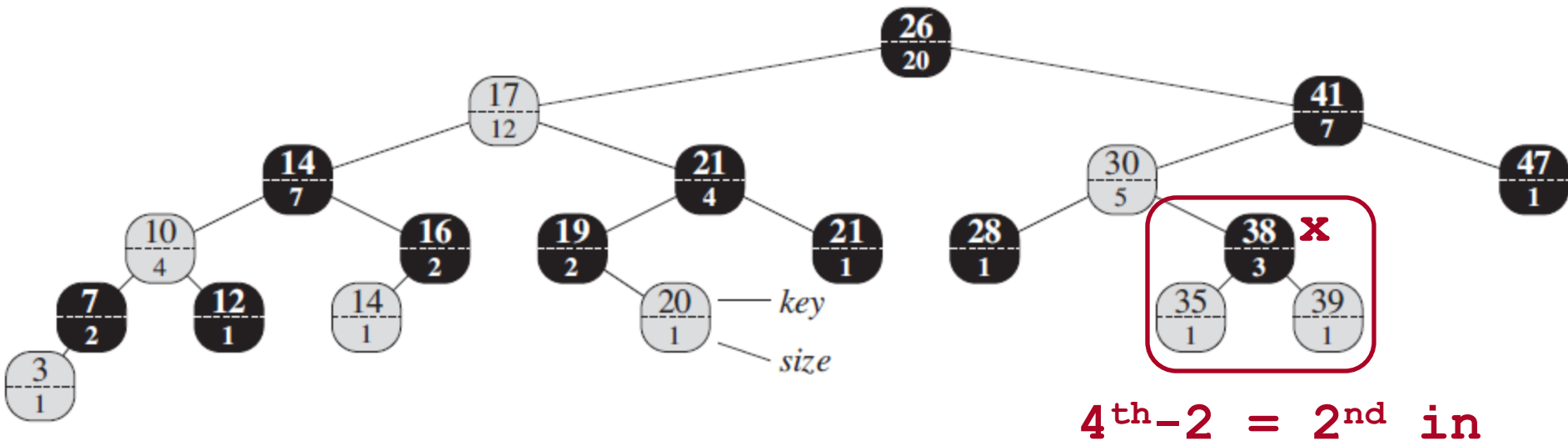
Selecting i^{th} element

□ OS-Select ($x, 4$)



Selecting i^{th} element

OS-Select ($x, 2$)



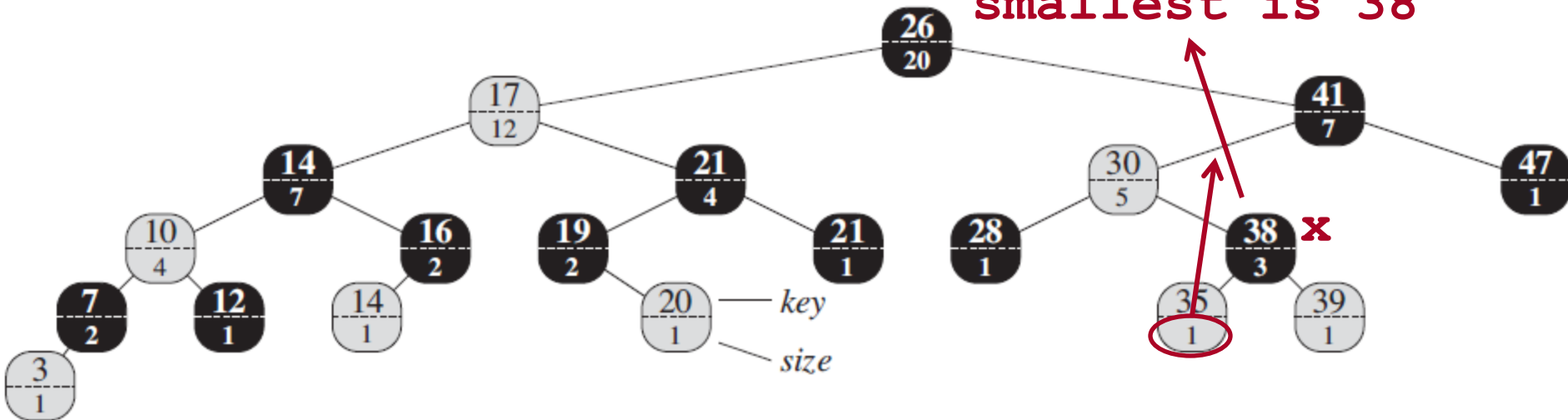
Selecting i^{th} element

OS-Select ($x, 2$)

rank=1+1=2 = 2nd

Bingo! 17th

smallest is 38



Calculating rank

- We can use this new field to calculate rank in $O(\lg n)$ time

OS-RANK(T, x)

1 $r = x.left.size + 1$

2 $y = x$

3 **while** $y \neq T.root$

4 **if** $y == y.p.right$

5 $r = r + y.p.left.size + 1$

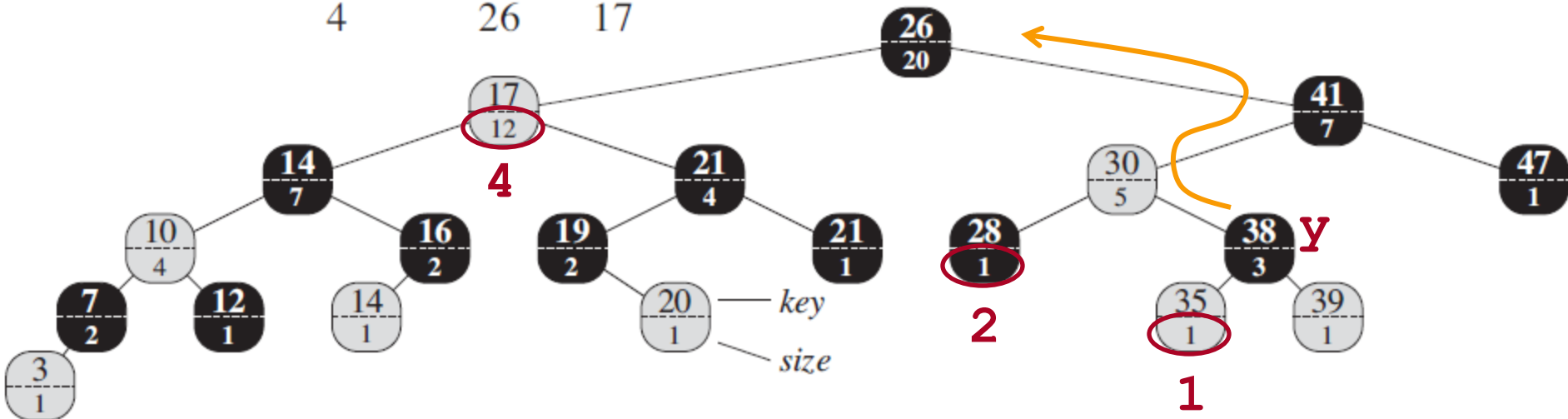
6 $y = y.p$

7 **return** r

Calculating rank

OS-Rank (T, y)

iteration	$y.key$	r
1	38	2
2	30	4
3	41	4
4	26	17

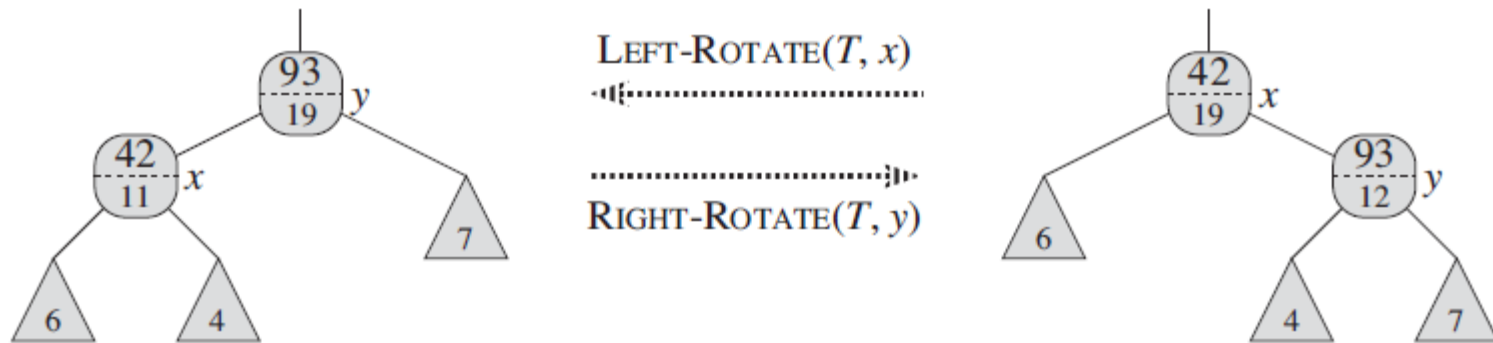


Maintaining subtree sizes: *insertion*

- First phase: go down tree to insert new node as a child of an existing node
 - Increment `x.size` for each node on simple path traversed from the root downward leaves
- Second phase: go up tree changing colors and rotating to maintain tree properties
 - Rotations only **locally** affect `size` attribute
 - For `LEFT-ROTATE(T, x)` add:
 - `y.size = x.size`
 - `x.size = x.left.size + x.right.size + 1`

Maintaining subtree sizes: *insertion*

■ Example update on rotations



■ Additional work:

- First phase: $O(\lg n)$
- Second phase: $O(1)$

■ Overall $O(\lg n)$ is preserved

Maintaining subtree sizes: *deletion*

- First phase: only operates on the search tree
 - Either removes one node y from tree or moves upward it within the tree
 - Simply traverse a simple path from node y up to root, decrementing **size** attribute of each node on the path
 - Additional cost of $O(\lg n)$
- Second phase: causes at most 3 rotations (no other structural changes)
 - Handle similar to *insertion*
 - Additional cost of $O(1)$
- Overall $O(\lg n)$ is preserved

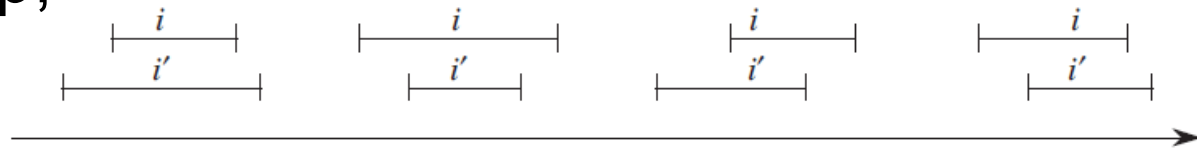
How to augment a data structure

1. Choose an underlying data structure
 - Red-black trees
2. Determine additional information to maintain
 - Add the `size` attribute
3. Verify additional information can be maintained for basic modifying operations
 - `insert` and `delete` still in $O(\lg n)$
4. Develop new operations
 - $O(\lg n)$ operations `OS-Select` and `OS-Rank`

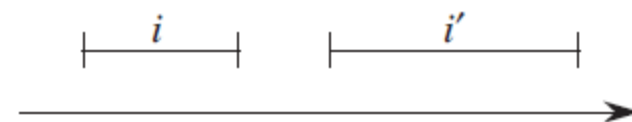
Example: Dynamic set of intervals

- Interval $[t_1, t_2]$ represents the set $\{t \in \mathbb{R} \mid t_1 \leq t \leq t_2\}$
- Any two intervals i and i' satisfy **interval trichotomy**:

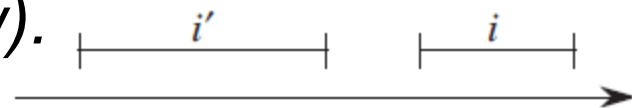
- i and i' overlap,



- i is to the left of i' ($i.high < i'.low$),



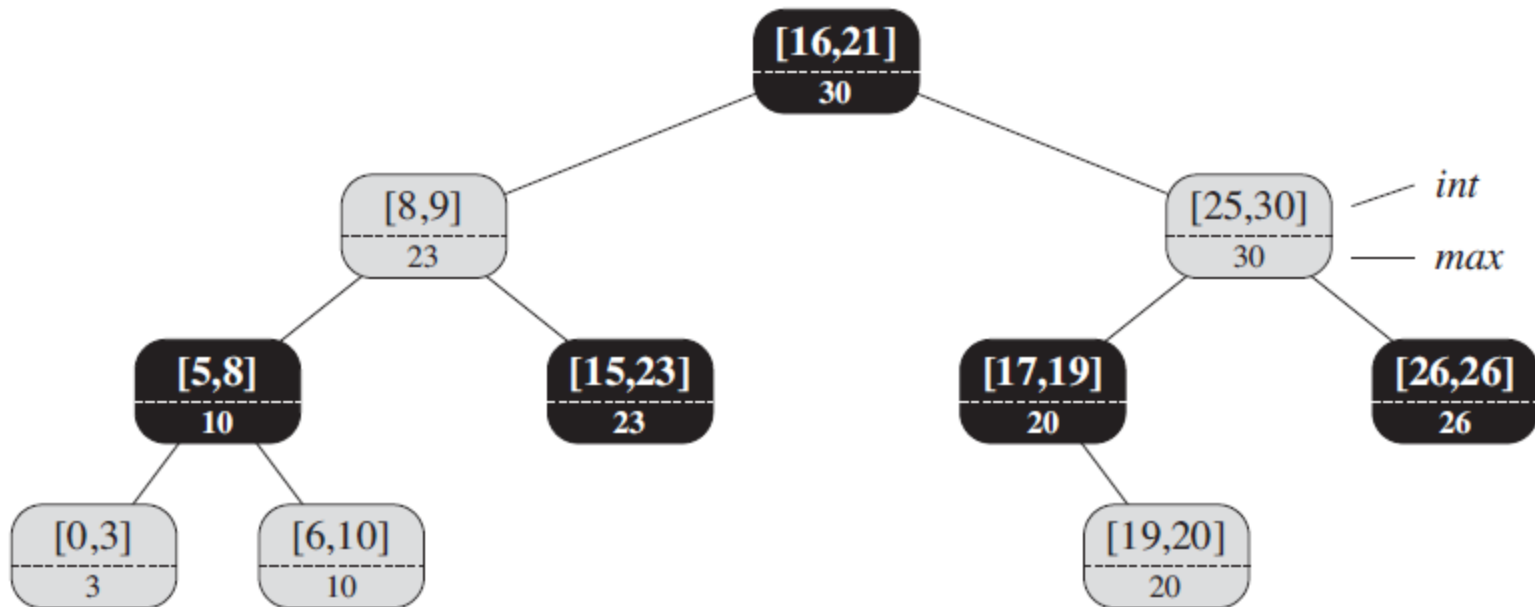
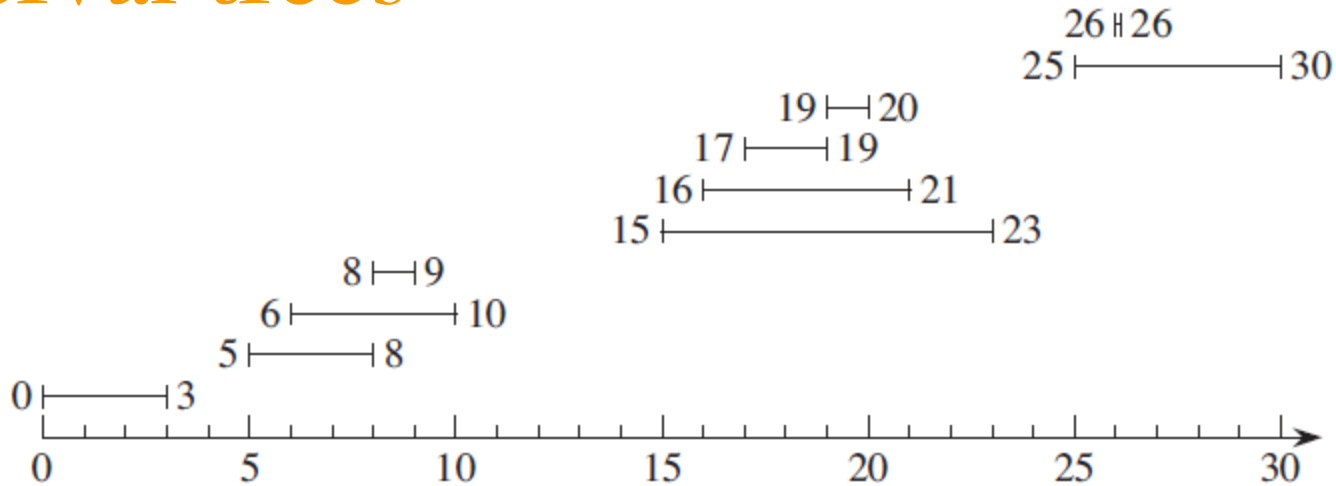
- i is to the right of i' ($i'.high < i.low$).



Interval trees

- A red-black tree that maintains a dynamic set of intervals, with each element \mathbf{x} containing an interval $\mathbf{x}.int$ supporting
 - **Interval-Insert** (\mathbf{T}, \mathbf{x}) adds element \mathbf{x} , whose *int* attribute contains an interval, to interval tree \mathbf{T}
 - **Interval-Delete** (\mathbf{T}, \mathbf{x}) removes element \mathbf{x} from interval tree \mathbf{T}
 - **Interval-Search** (\mathbf{T}, i) returns a pointer to an element \mathbf{x} in interval tree \mathbf{T} such that $\mathbf{x}.int$ overlaps interval i , $\mathbf{T}.nil$ otherwise

Interval trees



Interval trees

1. Choose an underlying data structure
 - Red-black trees with **key of node x being $x.int.low$**
2. Determine additional information to maintain
 - **$x.max$: max value of any interval endpoint stored in subtree rooted at x**
3. Verify additional information can be maintained for basic modifying operations
 - **insert and delete still in $O(\lg n)$**

Interval trees

Theorem 14.1 (Augmenting a red-black tree):

If the value of an augmenting field \mathbf{f} for each node \mathbf{x} depends on only the information in nodes \mathbf{x} , $\mathbf{x}.left$, and $\mathbf{x}.right$, then we can maintain values of \mathbf{f} in all nodes of \mathbf{T} during insertion and deletion without asymptotically affecting $O(\lg n)$ performance of these operations

Determine ***max*** value of a node as follows:

$$\mathbf{x}.max = \max(\mathbf{x}.int.high, \mathbf{x}.left.max, \mathbf{x}.right.max)$$

In fact, rotations only take $O(1)$ additional time

Interval trees

4. Develop new operations

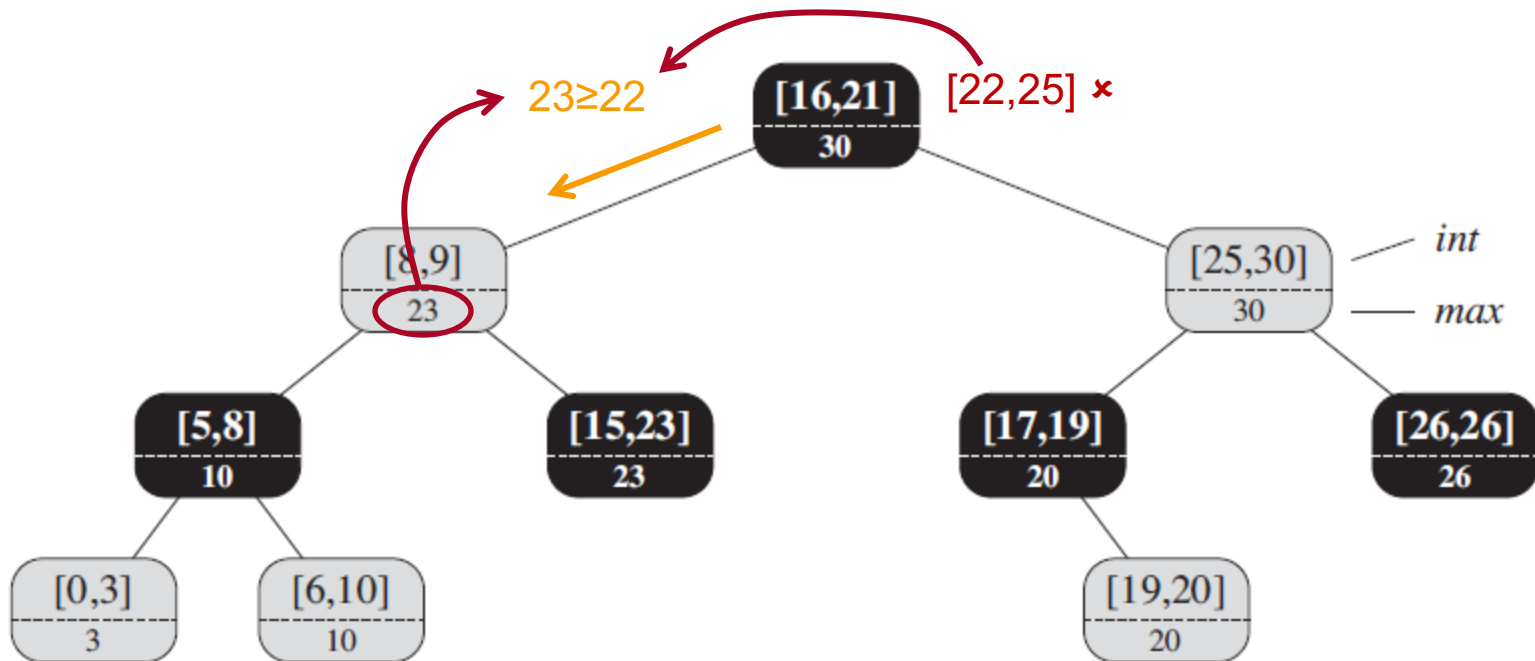
- $O(\lg n)$ operation **Interval-Search** (\mathbf{T}, \mathbf{i}) returns a node in tree \mathbf{T} whose interval overlaps \mathbf{i} ; $\mathbf{T.nil}$ otherwise.

INTERVAL-SEARCH(T, i)

```
1   $x = T.root$ 
2  while  $x \neq T.nil$  and  $i$  does not overlap  $x.int$ 
3      if  $x.left \neq T.nil$  and  $x.left.max \geq i.low$ 
4           $x = x.left$ 
5      else  $x = x.right$ 
6  return  $x$ 
```

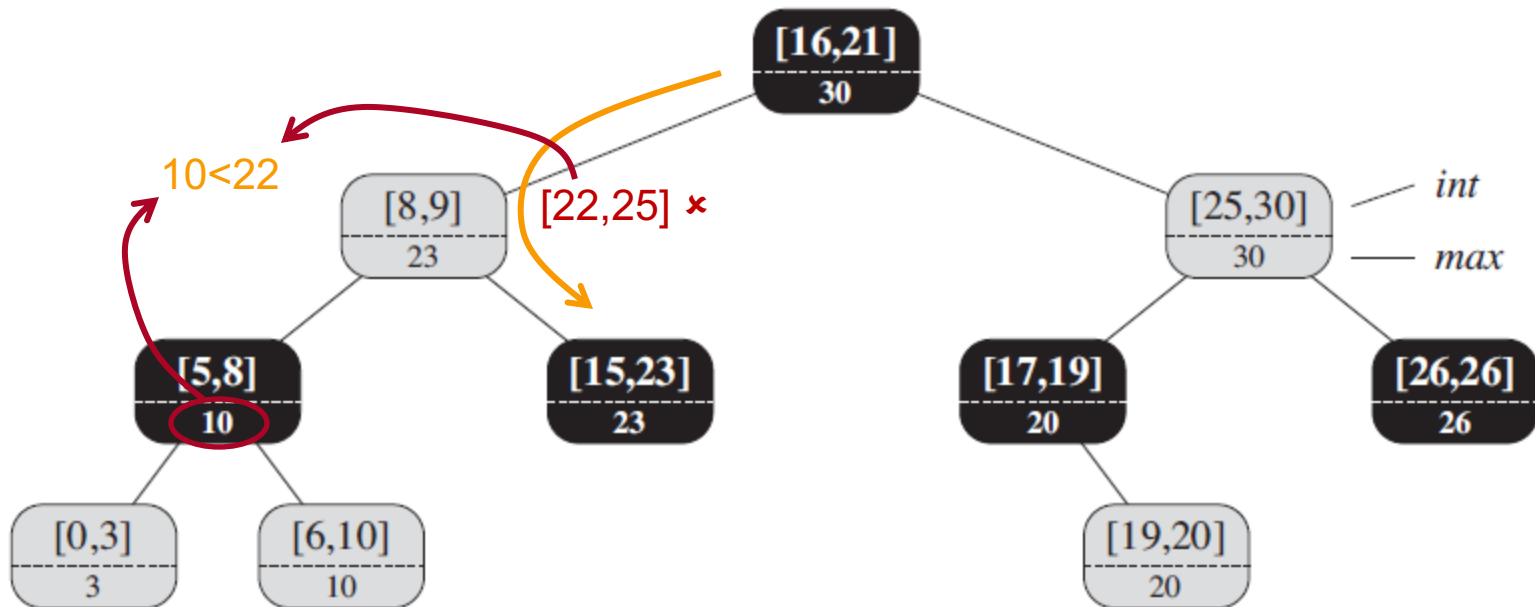

Interval trees

Interval-Search ($T, i=[22, 25]$)



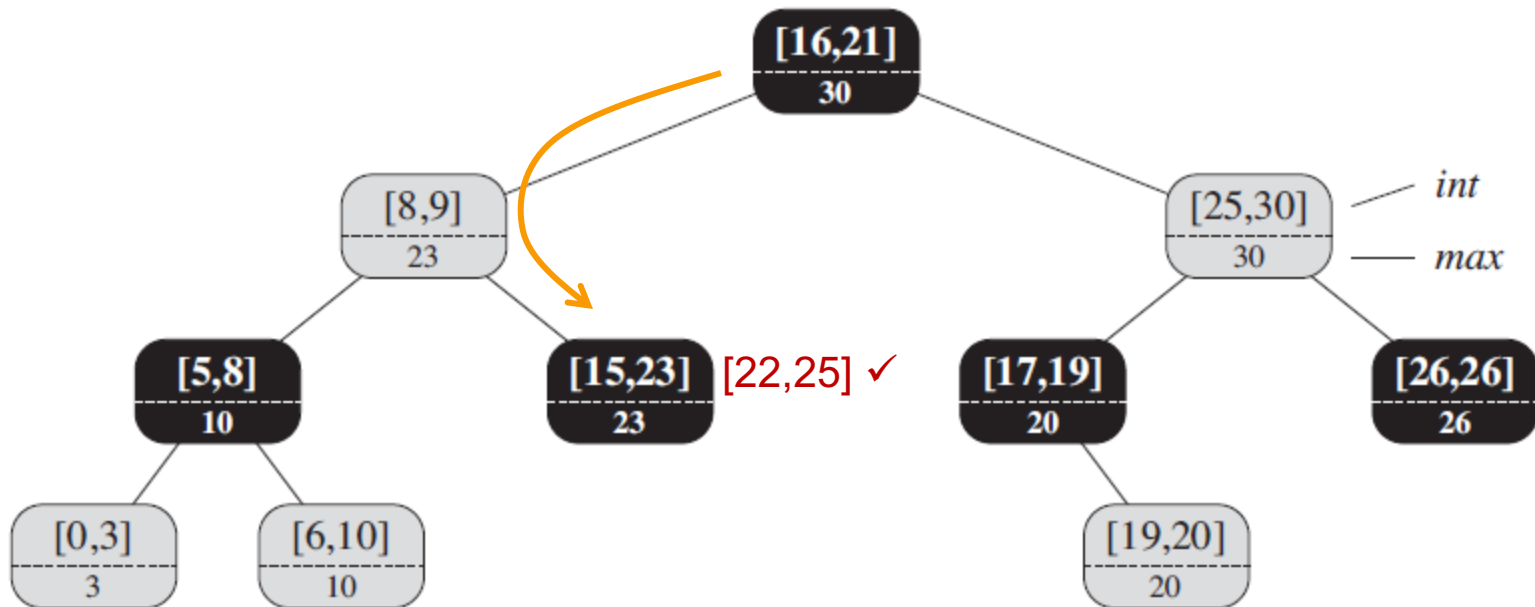
Interval trees

Interval-Search ($T, i=[22, 25]$)



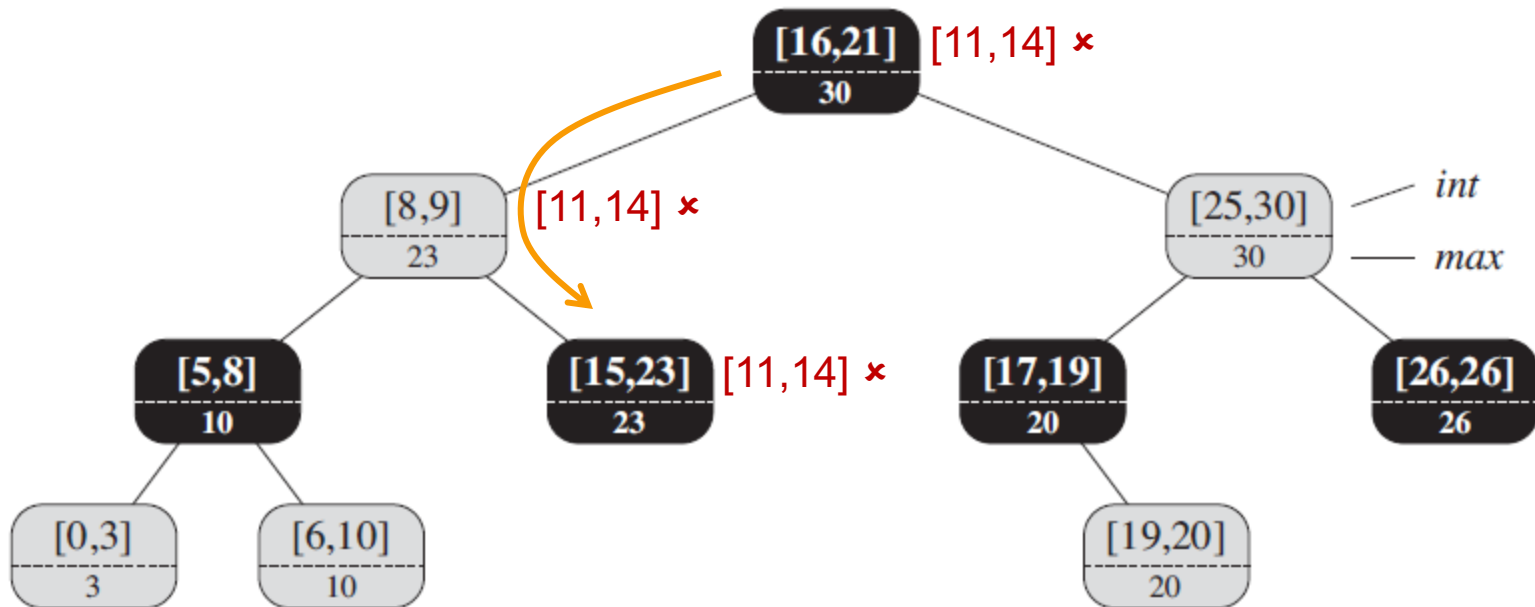
Interval trees

Interval-Search ($T, i = [22, 25]$)



Interval trees

Interval-Search ($T, i = [11, 14]$)



Interval trees

Theorem 14.2 (Interval-Search works correctly):

Any execution of `INTERVAL-SEARCH(T, i)` either returns a node whose interval overlaps i , or it returns $T.nil$ and the tree T contains no node whose interval overlaps i .

Proof: *Invariant:* If tree T contains an interval that overlaps i , then the subtree rooted at x contains such an interval.

- Initialization (line 1), Maintenance (line 4 or 5), Termination (line 2)

`INTERVAL-SEARCH(T, i)`

```
1  $x = T.root$ 
2 while  $x \neq T.nil$  and  $i$  does not overlap  $x.int$ 
3     if  $x.left \neq T.nil$  and  $x.left.max \geq i.low$ 
4          $x = x.left$ 
5     else  $x = x.right$ 
6 return  $x$ 
```