

# Algorithms and Datastructures

## Lecture 8

Manfred Jaeger

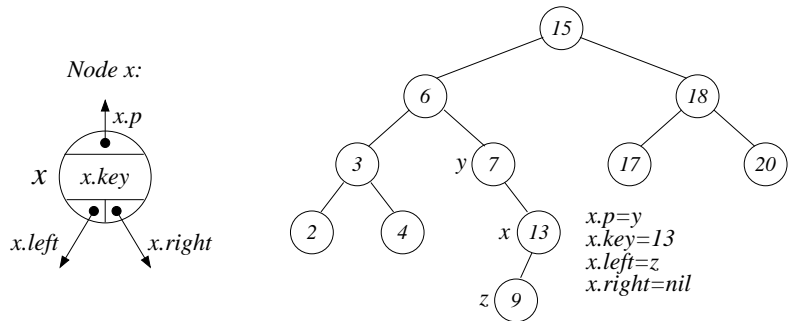


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# Binary Search Trees

Datastructure for storing a set of objects  $x$  with key attribute. Keys come from an ordered set (need not be integers).

A Binary Tree is composed of *node* elements:



A tree is a *node* object that defines the root of the tree.

## Binary Search Tree Property

All keys in the *left subtree* of  $x$  are  $\leq x.key$ , and all keys in the *right subtree* of  $x$  are  $\geq x.key$

BSTs support operations

```
Object search(Key k)
void insert(Object o)
void delete(Object o)
Object minimum()
Object maximum()
Object successor(Object o)
Object predecessor(Object o)
```

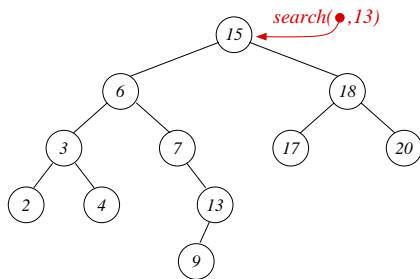
 BSTs implement ADTs *Dictionary*, *Priority Queue*, ...

**input** : Root node  $x$  of BST, Integer  $k$

**output**: Node  $y$  in tree rooted at  $x$   
with  $y.key = k$  if such  $y$  exists,  
otherwise *nil*

TREESearch( $x, k$ )

```
1 if  $x == nil$  or  $x.key == k$  then
2   return ( $x$ )
3 if  $k < x.key$  then
4   return (TREESearch( $x.left, k$ ))
5 else
6   return (TREESearch( $x.right, k$ ))
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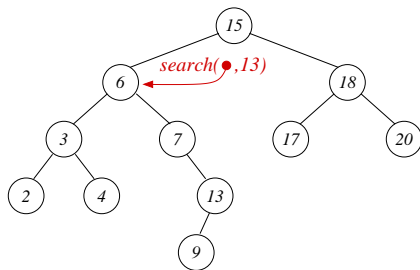


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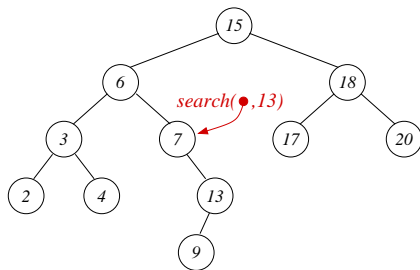


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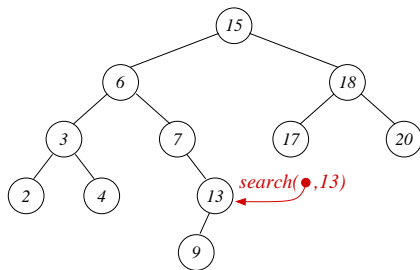


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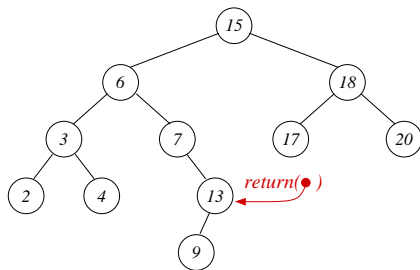


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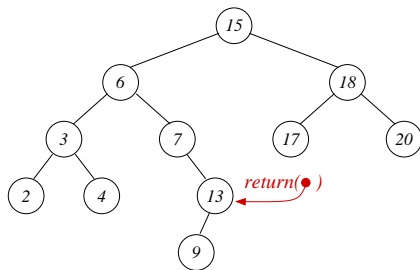


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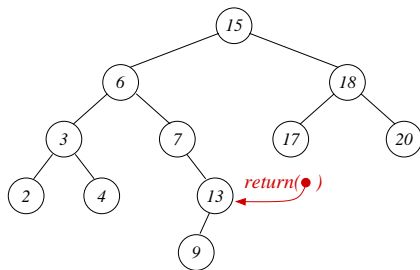
Complexity:  $O(\text{height of tree})$

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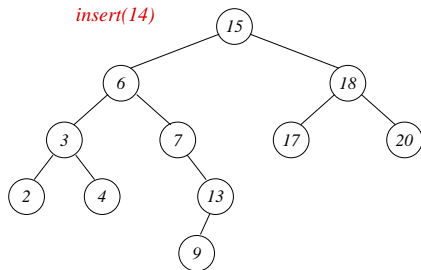
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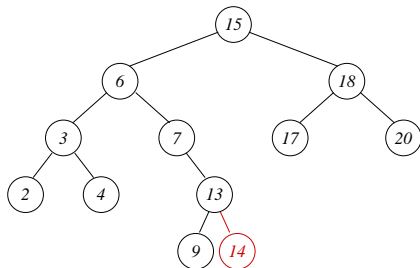
Complexity:  $O(\text{height of tree})$

Also in  $O(\text{height})$ : *minimum, maximum, successor, predecessor*



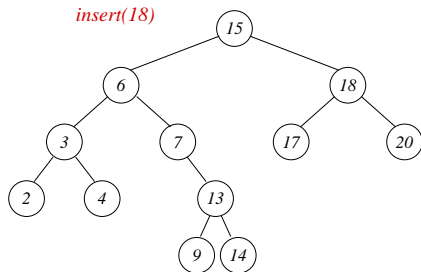
Inserting  $x$ :

- ▶ search for  $x.key$  until *nil* encountered
- ▶ replace the *nil* with a new node for key  $x$
- ▶ when  $x.key$  already contained in the tree: continue “search” in right sub-tree



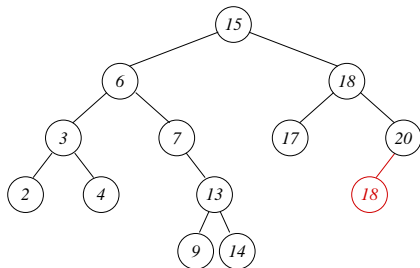
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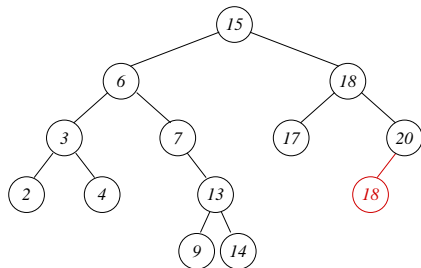
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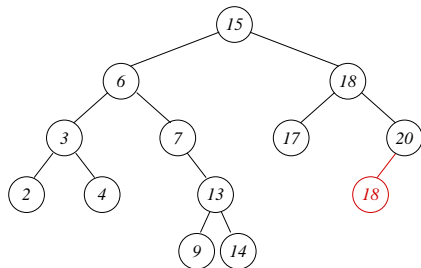
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### Alternative:

- ▶ Insertion (a.k.a. *put*) takes arguments *key*  $k$  and *value*  $v$
- ▶ When node  $x$  with  $x.key = k$  found in search, update  $x.value$  with  $v$ .





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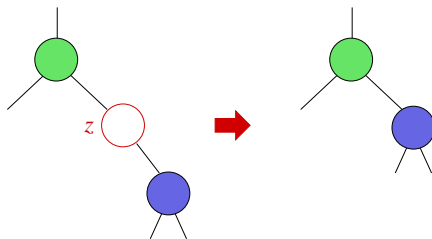
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Complexity:  $O(h)$

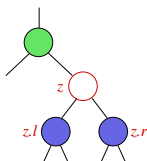
Operation: *delete*( $z$ ) ( $z$  a node)

**Case 1:**  $z$  has at most one child:

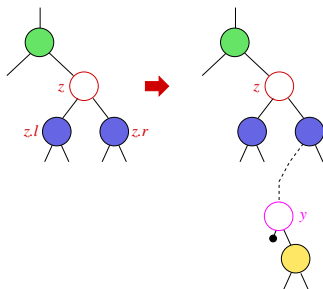


- $z$ 's child (if there is one) takes  $z$ 's place in  $z.p$

**Case 2:**  $z$  has two children:

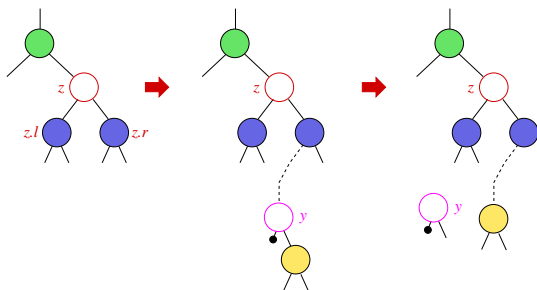


**Case 2:**  $z$  has two children:



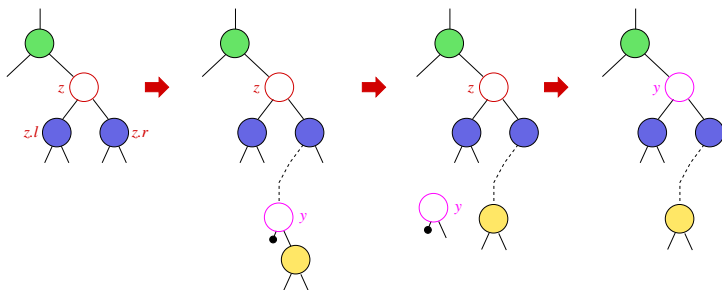
- Find  $y = \text{TreeMinimum}(z.r)$ . Then  $y.l = \text{nil}$ !

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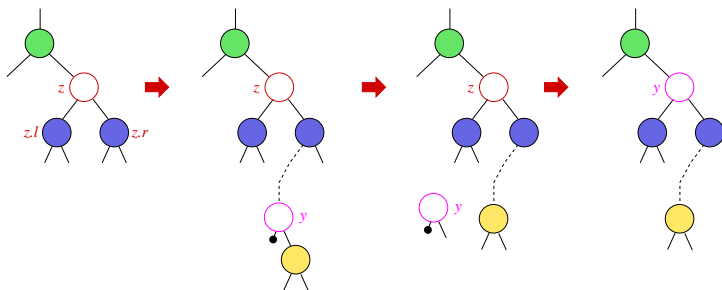
- ▶ Find  $y = \text{TreeMinimum}(z.r)$ . Then  $y.l = nil$ !
- ▶ “Delete  $y$ ” (case 1!)

**Case 2:**  $z$  has two children:




- ▶ Find  $y = \text{TreeMinimum}(z.r)$ . Then  $y.l = \text{nil}$ !
- ▶ “Delete  $y$ ” (case 1!)
- ▶ Substitute  $y$  for  $z$

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Complexity:  $O(h)$  (finding *TreeMinimum*)

 All operations performed by re-directing *left*, *right* and *parent* references (no copying/editing of *node.key* or *node.value* fields)

The *height* of a binary tree containing  $n$  nodes is between

- a 1 and  $n$
- b  $n$  and  $n \lg n$
- c  $\lg n$  and  $n \lg n$
- d  $\lg n$  and  $n$
- e 1 and  $\lg n$

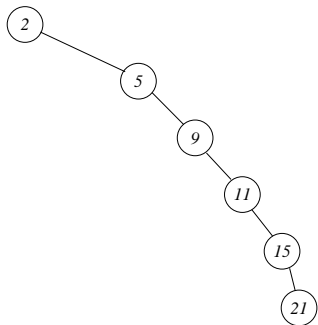
(select sharpest bounds!)



All operations *search*, *insert*, *delete* are  $O(h)$ . In the worst case  $h = n$ :

BST constructed from insertion sequence

2, 5, 9, 11, 15, 21 :



### Expected Height

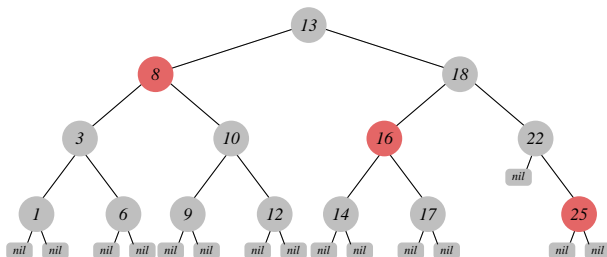
- ▶ When BST is constructed for  $n$  keys that arrive for insertion in random order, then the expected height of the tree is  $O(\lg n)$ .
- ▶ Compare: expected height of QUICKSORT recursion tree when input array is in random order

# Red-Black Trees


**Idea:** ensure that binary search tree is approximately **balanced** regardless of the insertion order of keys

- ▶ Query operations *search*, *maximum*, *minimum*, *successor*, *predecessor* as before in time  $O(h)$ .
- ▶ Ensure that  $h = \Theta(\lg n)$  by modifying *insert* and *delete*

**Red-Black Trees** are one (out of several) implementations of this idea. They are the basis for the Java `TreeMap` class.



- ▶ Only internal nodes are associated with keys. Leaves have value *nil*
- ▶ Nodes have a *color* attribute with values *red* or *black*
- ▶ The coloring satisfies the following conditions:
  - ▶ The root is black
  - ▶ All leaves are black
  - ▶ Both children of a red node are black
  - ▶ For all nodes  $x$ : all paths from  $x$  to a leaf contain the same number of black nodes

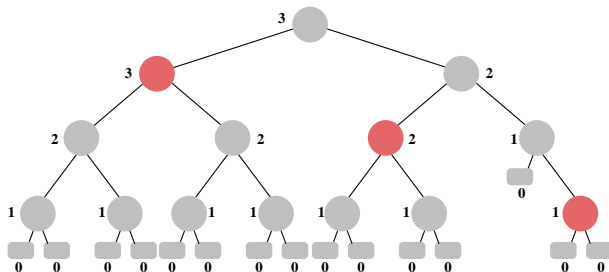
 the *nil* leaves are mainly a conceptual tool for simplifying the analysis; can be represented by a single *nil sentinel element* in implementation.

## Lemma

A RB-tree with  $n$  internal nodes has height at most  $2\lg(n + 1)$ .

## Black-Height

For node  $x$  in RB-tree:  $bh(x)$  = number of black nodes on a path from  $x$  to a leaf (not including  $x$ )



Nodes labeled with black-height

Claim: A subtree rooted at a node  $x$  contains at least  $2^{bh(x)} - 1$  internal nodes.

Proof of claim by induction on the *height* (!) of  $x$ :

**Base case:**  $h(x) = 0$ :  $x$  is a leaf,  $bh(x) = 0$ , and  $2^{bh(x)} - 1 = 0$ .

**Induction step:** Let  $h(x) > 0$ . Induction hypothesis applied to  $x.l$  and  $x.r$  implies that the left and right sub-tree of  $x$  contain at least  $2^{bh(x)-1} - 1$  internal nodes each. Thus, the total number of internal nodes of sub-tree rooted at  $x$  is at least

$$(2^{bh(x)-1} - 1) + (2^{bh(x)-1} - 1) + 1 = 2^{bh(x)} - 1$$

Claim proved! Now continue:

For the root  $r$  of the tree:

$$bh(r) \geq h(r)/2.$$

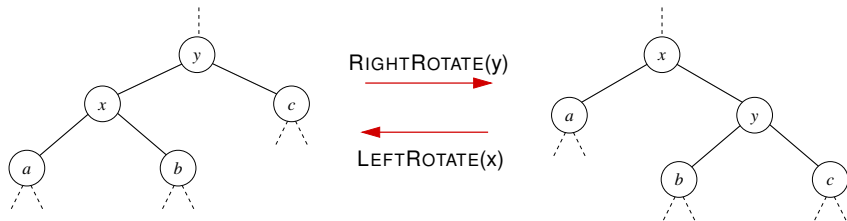
Therefore:

$$n \geq 2^{bh(r)} - 1 \geq 2^{h(r)/2} - 1,$$

and

$$\lg(n + 1) \geq h(r)/2.$$

## Rotations



- ▶ Constant time operations that locally redirect child/parent pointers
- ▶ Preserves binary search tree property for keys
- ▶ Does not take coloring into account: can destroy or establish RB tree conditions

To insert new node  $z$  with key  $k$ :

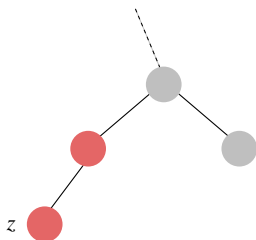
- ▶ Perform a standard BST *insert*
- ▶ Color  $z$  red
- ▶ Call RB-INSERT-FIXUP( $z$ ) to re-establish RB tree properties

What can have gone wrong to require fixup?

- ▶ Root no longer black: only happens when  $z$  is the first node inserted.
- ▶ Leaves no longer black? Cannot happen!
- ▶ Red node has red child: can happen.
- ▶ Unequal number of black nodes on paths starting from a node  $x$ ? Cannot happen!



The problem that needs to be fixed:

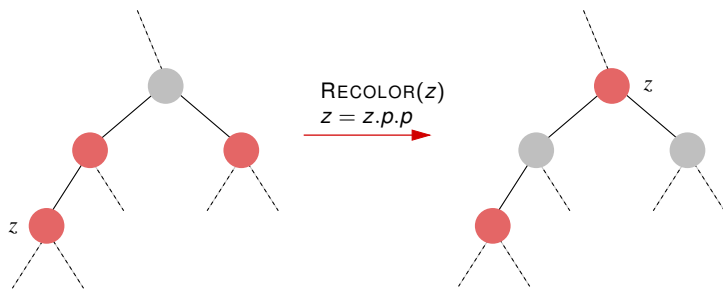


```

FIXUP(z)
1  while z != T.root & z.p.color == red do
2    if z's uncle is red then
3      RECOLOR(z)
4      z = z.p.p
5    else
6      if linear-config(z) then
7        ROTATE-TO-FIX(z)
8      if zig-zag-config(z) then
9        ROTATE-TO-LINEAR-CONFIG(z)
10  T.root.color = black
  
```

*Invariant* maintained by the **while** loop:

- ▶ *z* is red
- ▶ the only possible violations of the RB tree properties are:
  - ▶ *z* is the root and red, or
  - ▶ *z* is not the root and *z.p* is also red

**Case: z has red uncle**

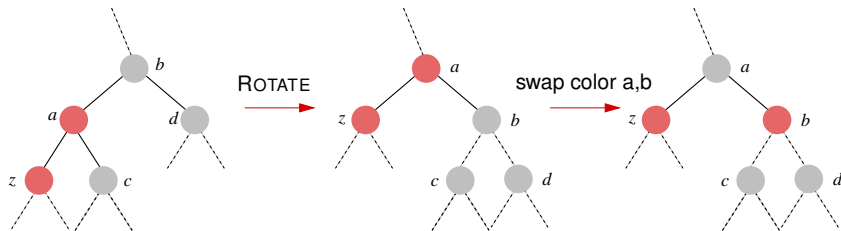
*Invariant:* maintained!

*Progress:* violating node  $z$  moves closer to the root!

**Case:** *linear-config(z)*

- ▶ z's uncle is black
- ▶ both z and z.p are left (or both right) children

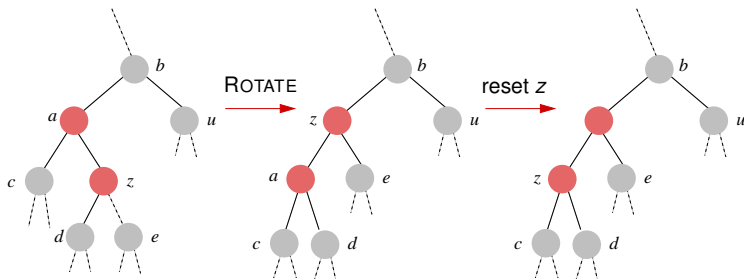
ROTATE-TO-FIX:

*Invariant:* no more violations!*Progress:* done!

**Case:** *zig-zag-config(z)*

- ▶ z's uncle is black
- ▶ z is right, and z.p left child (or vice-versa)

ROTATE-TO-LINEAR-CONFIG:



*Invariant:* maintained!

*Progress:* one step left to do!

## Summary

### FIXUP(z)

```
1 while  $z \neq T.root$  &  $z.p.color == red$  do
2   if  $z$ 's uncle is red then
3     RECOLOR( $z$ )
4      $z = z.p.p$ 
5   else
6     if linear-config( $z$ ) then
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  - ▶  $z$  is the root and red, or
  - ▶  $z$  is not the root, and  $z.p$  is also red

*Progress:* Each iteration of the **while** loop either moves  $z$  closer to the root, or leads to termination within at most one more iteration.

Complexity: One iteration of **while** loop:  $O(1)$ . At most  $O(h)$  iterations.

Similar strategy as for *insert*:

- ▶ Perform standard BST *delete*
- ▶ Fix violations of RB tree properties that may have occurred

Possible violations now also include the property that all paths from a node contain the same number of black nodes.

**Idea:** Represent this as a local violation of RB tree properties by assigning a node a *double black* or *red and black* value.

Then same strategy as for *insert*:

- ▶ locally resolve the violation, and
- ▶ move violating node up the tree (or terminate)

Complexity:  $O(h)$