

# Analysis of Algorithms

## Red-Black Trees

Andres Mendez-Vazquez

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# Outline

## 1 Red-Black Trees

- The Search for Well Balanced Trees
- Observations
- Red-Black Trees
- Examples
- Lemma for the height of Red-Black Trees
  - Base Case of Induction
  - Induction
- Rotations in Red-Black Trees

## 2 Insertion in Red-Black Trees

- Important!!!
- Insertion Code
- The Fixup Code
- Loop Invariance
  - Initialization
  - Maintenance
  - Termination
- Example

## 3 Deletion in Red-Black Trees

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- The Code To Fix the Violations
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- Example of Deletion in Red-Black Trees

## 4 Exercises

- Something for you to do



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# Well Balanced Trees

Do you remember AVL (Adelson-Velskii and Landis) Trees?

Quite nice recursive methods for balancing the tree!!!

It is based on an height invariant

At any node in the tree, the heights of the left and right subtrees differs by at most 1.



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**It is based on an height Invariant**

**At any node in the tree, the heights of the left and right subtrees differs by at most 1.**



Thus, it is necessary to add an extra field to the Node Structure

## Structure of a Node

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### **Structure 1: STRUCT NODE**

---

- 1 Key key
  - 2 int height
  - 3 Value val
  - 4 Node Left, Right
- 



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## Due to the balancing methods

- AVL Trees require to have a  $O(\log_2 n)$  rotations.
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- The dynamic space nature of the balancing (Height) factor.
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## Properties

- 1 Every node is either red or black.
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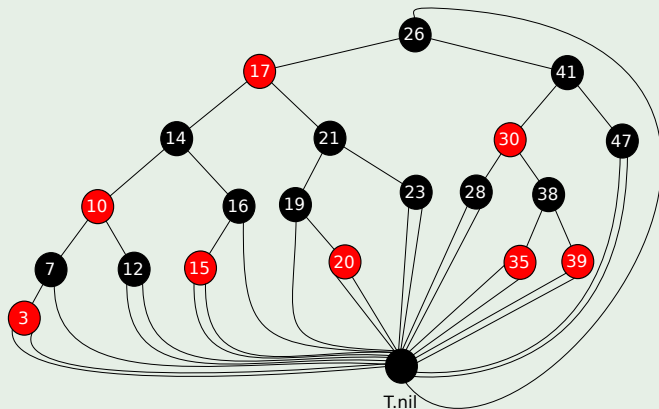
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# Red-Black Trees

## Example



# Height on a Red Black Tree

## Black Height $bh(x)$

We call the number of black nodes on any path from, but not including, a node  $x$  down to a leaf the black height of the node.



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# Lemma for the height of Red-Black Trees

## Theorem

A Red-Black Trees with  $n$  internal nodes has height at most  $2\log(n + 1)$ .



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## Proof: Step 1

- Prove that any subtree rooted at  $x$  **contains at least**  $2^{bh(x)} - 1$  internal nodes.
- If  $bh(x) = 0$ , then



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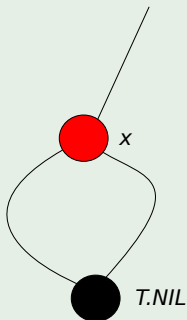
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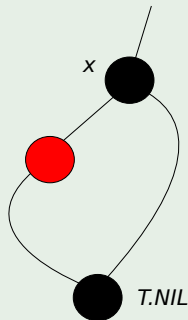
## Case I





# Examples for $bh(x) = 0$

Case II - There are other, but they are similar



Then

Then, we have

- Thus  $2^{bh(x)} - 1 = 2^0 - 1 = 0$ .
- Now with  $bh(x) > 0$ , we have that  $\text{child}[x]$  has height  $bh(x)$  or  $bh(x) - 1$ .



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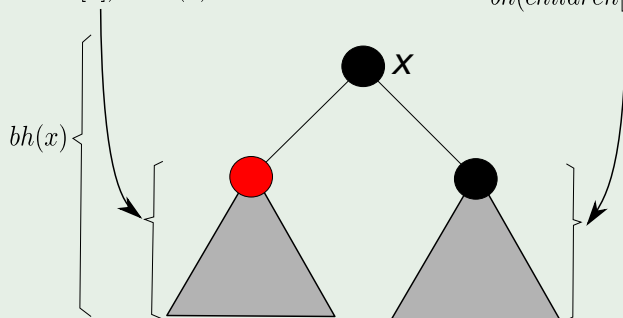


Thus, we have the following

## Example

$$bh(children[x]) = bh(x)$$

$$bh(children[x]) = bh(x) - 1$$



# Proof

## Case I

- Height of child is  $bh(x)$ .
- Then, the child is red, if not subtree rooted at  $x$  will have height  $bh(x) + 1$ !
- Now, we have two subtrees from the child with red root...(The children are black)

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- Thus, each of this subtrees has height  $bh(x) - 1 \Rightarrow$  each tree contains at least  $2^{bh(x)-1} - 1$  nodes by inductive hypothesis.
- Then the child contains at least  $2^{bh(x)-1} - 1 + 2^{bh(x)-1} - 1$  internal nodes.
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  - Then  $n \geq 2^{bh(\text{root})} - 1 \geq 2^{\frac{h}{2}} - 1$ .
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# Lemma for the height of Red-Black Trees

## Corollary

From the previous theorem we conclude that SEARCH, MINIMUM, etcetera, can be implemented in  $O(\log n)$ .



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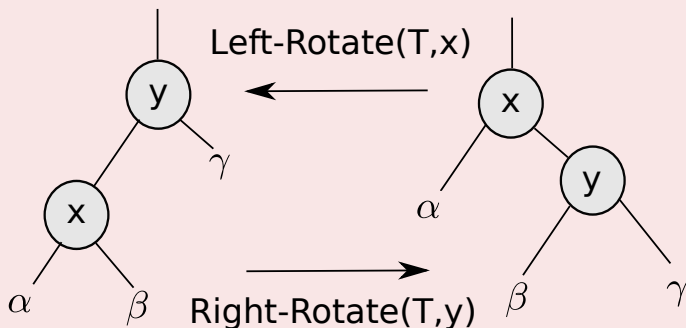
# Rotations in Red-Black Trees

## Purpose

Rotations are used to maintain the structure of the Red-Black Trees.

## Types of rotations

There are left and right rotations, they are inverse to each other.



## Example of Rotations in Red-Black Trees

### LEFT-ROTATE( $T, x$ )

- 1  $y = x.right$       ▷ Set  $y$
- 2  $x.right = y.left$       ▷ Turn  $y$ 's left subtree into  $x$ 's right subtree
- 3 if  $y.left \neq T.nil$
- 4      $y.left.p = x$
- 5  $y.p = x.p$             ▷ Link  $x$ 's parent to  $y$
- 6 if  $x.p == T.nil$
- 7      $T.root = y$
- 8 elseif  $x == x.p.left$
- 9      $x.p.left = y$
- 10 else  $x.p.right = y$
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- 8 elseif  $x == x.p.left$
- 9      $x.p.left = y$
- 10 else  $x.p.right = y$
- 11  $y.left = x$           ▷ Put  $x$  on  $y$ 's left
- 12  $x.p = y$

## Example of Rotations in Red-Black Trees

### LEFT-ROTATE(T,x)

- 1  $y = x.right$       ▷ Set  $y$
- 2  $x.right = y.left$     ▷ Turn  $y$ 's left subtree into  $x$ 's right subtree
- 3 if  $y.left \neq T.nil$
- 4      $y.left.p = x$
- 5  $y.p = x.p$           ▷ Link  $x$ 's parent to  $y$
- 6 if  $x.p == T.nil$
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  - 6 if  $x.p == T.nil$
  - 7      $T.root = y$
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  - 9      $x.p.left = y$
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12  $x.p = y$

## Example of Rotations in Red-Black Trees

### LEFT-ROTATE(T,x)

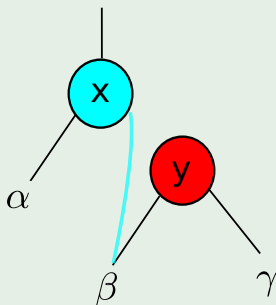
- 1  $y = x.right$       ▷ Set  $y$
- 2  $x.right = y.left$     ▷ Turn  $y$ 's left subtree into  $x$ 's right subtree
- 3 if  $y.left \neq T.nil$
- 4      $y.left.p = x$
- 5  $y.p = x.p$             ▷ Link  $x$ 's parent to  $y$
- 6 if  $x.p == T.nil$
- 7      $T.root = y$
- 8 elseif  $x == x.p.left$
- 9      $x.p.left = y$
- 10 else  $x.p.right = y$
- 11  $y.left = x$             ▷ Put  $x$  on  $y$ 's left
- 12  $x.p = y$



# Example Left-Rotate

## Step 1 - the correct right child is changed

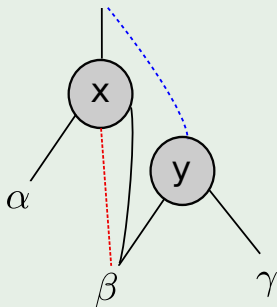
- 1  $y = x.\text{right}$       ▷ Set  $y$
- 2  $x.\text{right} = y.\text{left}$     ▷ Turn  $y$ 's left subtree into  $x$ 's right subtree



## Example Left-Rotate

### Step 2 - the parents are set correctly

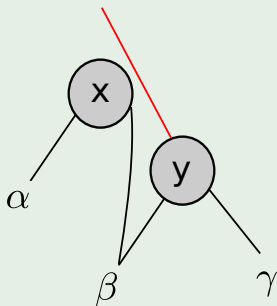
3. if  $y.\text{left} \neq \text{T.nil}$
4.  $y.\text{left.p} = x$
5.  $y.p = x.p$



## Example Left-Rotate

### Step 3

6. if  $x.p == T.nil$  ▷Set  $y$  to be the root if  $x$  was it
7.  $T.root = y$
8. elseif  $x == x.p.left$
9.  $x.p.left = y$
10. else  $x.p.right = y$



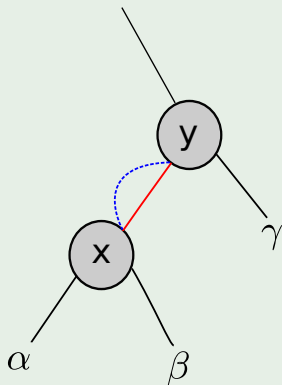
## Example Left-Rotate

### Step 4

11.  $y.\text{left} = x$

▷ Put  $x$  on  $y$ 's left

12.  $x.p = y$



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- **Important!!!**
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- The Fixup Code
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## 4 Exercises

- Something for you to do



# First than anything

## Something Notable

You still have a Binary Search Tree!!!

Where

How do you do insertion in a Binary Search Tree?



# First than anything

## Something Notable

You still have a Binary Search Tree!!!

## There

How do you do insertion in a Binary Search Tree?



# Outline

## 1 Red-Black Trees

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- Something for you to do





# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.  $z.p = y$
9. if  $y == T.nil$
10.      $T.root = z$
11. elseif  $z.key < y.key$
12.      $y.left = z$
13. else  $y.right = z$
14.  $z.left = T.nil$
15.  $z.right = T.nil$
16.  $z.color = T.RED$
17. RB-Insert-Fixup( $T.z$ )

## First

Search Variables being Initialized.

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. **while**  $x \neq T.nil$
4.      $y = x$
5.     **if**  $z.key < x.key$
6.          $x =$   
        $x.left$
7.     **else**  $x =$   
        $x.right$
8.  $z.p = y$
9. **if**  $y == T.nil$
10.      $T.root = z$
11. **elseif**  $z.key < y.key$
12.      $y.left = z$
13. **else**  $y.right = z$
14.  $z.left = T.nil$
15.  $z.right = T.nil$
16.  $z.color = T.RED$
17. RB-Insert-Fixup( $T.z$ )

## Second

Binary search for insertion.

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.      $z.p = y$
9.     if  $y == T.nil$
10.          $T.root = z$
11.     elseif  $z.key < y.key$
12.          $y.left = z$
13.     else  $y.right = z$
14.      $z.left = T.nil$
15.      $z.right = T.nil$
16.      $z.color = T.RED$
17.     RB-Insert-Fixup( $T.z$ )

## Third

Change parent of the node to be inserted.

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

```
1. y = T.nil
2. x = T.root
3. while x ≠ T.nil
4.     y = x
5.     if z.key < x.key
6.         x = x.left
7.     else x = x.right
8. z.p = y
9. if y == T.nil
10.     T.root = z
11. elseif z.key < y.key
12.     y.left = z
13. else y.right = z
14. z.left = T.nil
15. z.right = T.nil
16. z.color = T.RED
17. RB-Insert-Fixup(T.z)
```

## Fourth

Test to see if the Tree is empty!!!

## Insertion Code in Red-Black Trees

### RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.  $z.p = y$
9. if  $y == T.nil$
10.      $T.root = z$
11.    **elseif  $z.key < y.key$**
12.         **$y.left = z$**
13.    **else  $y.right = z$**
14.  $z.left = T.nil$
15.  $z.right = T.nil$
16.  $z.color = T.RED$
17. RB-Insert-Fixup( $T.z$ )

### Fifth

Insert node  $z$  in the correct left or right child:

- if  $z.key < y.key \Rightarrow y.left = z$
- if  $z.key \geq y.key \Rightarrow y.right = z$

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.  $z.p = y$
9. if  $y == T.nil$
10.      $T.root = z$
11. elseif  $z.key < y.key$
12.      $y.left = z$
13. else  $y.right = z$
14.      **$z.left = T.nil$**
15.      **$z.right = T.nil$**
16.  $z.color = T.RED$
17. RB-Insert-Fixup( $T.z$ )

## Sixth

Make  $z$ 's leafs equal to  $T.nil$ .

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.  $z.p = y$
9. if  $y == T.nil$
10.      $T.root = z$
11. elseif  $z.key < y.key$
12.      $y.left = z$
13. else  $y.right = z$
14.  $z.left = T.nil$
15.  $z.right = T.nil$
16.  **$z.color = T.RED$**
17. RB-Insert-Fixup( $T.z$ )

## Seventh

Make  $z$ 's color equal to **RED**.

# Insertion Code in Red-Black Trees

## RB-INSERT( $T, z$ )

1.  $y = T.nil$
2.  $x = T.root$
3. while  $x \neq T.nil$
4.      $y = x$
5.     if  $z.key < x.key$
6.          $x = x.left$
7.     else  $x = x.right$
8.  $z.p = y$
9. if  $y == T.nil$
10.      $T.root = z$
11. elseif  $z.key < y.key$
12.      $y.left = z$
13. else  $y.right = z$
14.  $z.left = T.nil$
15.  $z.right = T.nil$
16.  $z.color = T.RED$
17. **RB-Insert-Fixup( $T.z$ )**

Eight

Call RB-Insert-Fixup!!!





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## 4 Exercises

- Something for you to do



# RB-Insert-Fixup

## RB-Insert-Fixup( $T, z$ )

```
1 while z.p.color == RED
2   if z.p == z.p.p.left
3     y=z.p.p.right
4     if y.color ==RED
5       z.p.color = BLACK
6       y.color = BLACK
7       z.p.p.color = RED
8       z = z.p.p
9   else if z == z.p.right
10      z = z.p
11      Left-Rotate( $T, z$ )
12      z.p.color = BLACK
13      z.p.p.color = RED
14      Right-Rotate( $T, z.p.p$ )
15   else ("right" and "left" exchanged)
16   T.root.color = BLACK
```

### Case 1

- $z$ 's uncle is RED
  - ▶ Change of parent and uncle's color to BLACK
  - ▶ Move problem to  $z$ 's grandfather

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## Prior to the first iteration of the loop

We start with a red-black tree with no violations

- Then, the algorithm insert the red node  $z$  at the bottom of the Red-Black Trees.

► This Tree does not violate properties 1,3 and 5.

## Prior to the first iteration of the loop

### We start with a red-black tree with no violations

- Then, the algorithm insert the red node  $z$  at the bottom of the Red-Black Trees.
  - ▶ This Tree does not violate properties 1,3 and 5.

### Properties

- 1 **Every node is either red or black.**
- 2 The root is black.
- 3 **Every leaf (NIL) is black.**
- 4 If a node is red, then both its children are black.
- 5 **For each node, all paths from the node to descendant leaves contain the same number of black nodes.**



# Important

If  $z.p$  is the root

- Then,  $z.p$  began as a black node no change happened when Fix-Up is Called



# Then

## Fix-Up is Called

- The RB-Insert-Fixup is called because the following possible violations.

### Case 1

- If  $z$  is the first node to be inserted, you violate the property 2.
  - ▶ It is the only violation on the entire Red-Black Trees.
  - ▶ Because the parent and both children of  $z$  are the sentinel.





# Then

## Fix-Up is Called

- The RB-Insert-Fixup is called because the following possible violations.

## Case I

- If  $z$  is the first node to be inserted, you violate the property 2.
  - ▶ It is the only violation on the entire Red-Black Trees.
  - ▶ Because the parent and both children of  $z$  are the sentinel.



## Case II

- If the tree violates property 4

was inserted after a red node

- Thus,  $z$  and  $z.p$  are red
  - ▶ The Tree does not violate any other property



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- If the tree violates property 4

## $z$ was inserted after a red node

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  - Initialization
  - **Maintenance**
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# Some Notes

## Something Notable

- We need to consider six cases

### However:

- but three of them are symmetric to the other three
  - ▶ Depending if  $z.p$  to be a left or right child of  $z.p.p$  given
    - if  $z.p == z.p.p.left$



# Some Notes

## Something Notable

- We need to consider six cases

## However

- but three of them are symmetric to the other three
  - ▶ Depending if  $z.p$  to be a left or right child of  $z.p.p$  given
    - ① **if  $z.p == z.p.p.left$**



# Therefore

If  $z.p$  is red

- We enter the loop of Fix-Up code...

Which falls as then

- If  $z.p$  is red,  $z.p$  cannot be the root  $\Rightarrow z.p.p$  exists



# Therefore

If  $z.p$  is red

- We enter the loop of Fix-Up code...

Which tells us that

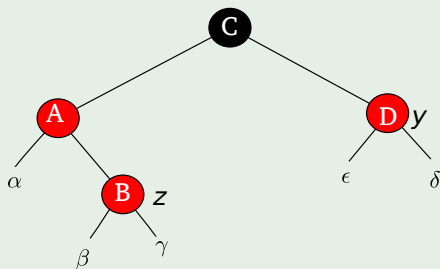
- If  $z.p$  is red,  $z.p$  cannot be the root  $\Rightarrow z.p.p$  exists





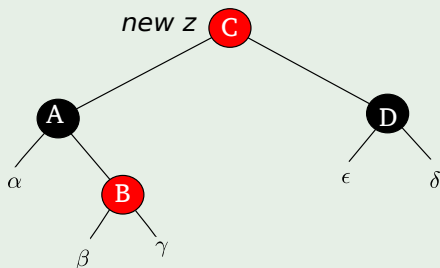
# Maintenance in Insertion in Red-Black Trees

## Case I - $z$ 's uncle is red



# Maintenance in Insertion in Red-Black Trees

Recolor parent and uncle to black



# Thus

## Observations

- 1 Recoloring will fix the  $z.parent.color == red$  and keeps the bh property
  - 2 It will move the problem upwards.
  - 3 Nevertheless, the tree rooted at A, B and D are Red-Black Trees.
  - 4 So the new  $z$  will move the problem upward for the next iteration.



# Thus

## Observations

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  - 1 It will move the problem upwards.

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# Thus

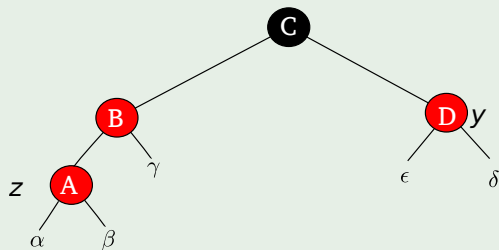
## Observations

- 1 Recoloring will fix the  $z.parent.color == red$  and keeps the bh property
  - 1 It will move the problem upwards.
- 2 Nevertheless, the tree rooted at A, B and D are Red-Black Trees.
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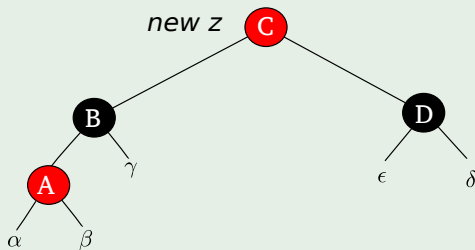
# The Symmetric Case

We have



# The Symmetric Case

We have





# RB-Insert-Fixup

## RB-Insert-Fixup( $T, z$ )

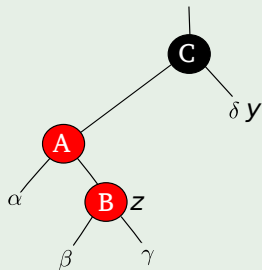
```
1 while z.p.color == RED
2     if z.p == z.p.p.left
3         y=z.p.p.right
4         if y.color ==RED
5             z.p.color = BLACK
6             y.color = BLACK
7             z.p.p.color = RED
8             z = z.p.p
9     else if z == z.p.right
10         z = z.p
11         Left-Rotate( $T, z$ )
12         z.p.color = BLACK
13         z.p.p.color = RED
14         Right-Rotate( $T, z.p.p$ )
15     else ("right" and "left" exchanged)
16 T.root.color = BLACK
```

### Case 2

- if  $z$  is in the right child then
  - ▶ Move the problem to the parent by making  $z = z.p$
  - ▶ Rotate left using  $z$  as the rotation node

# Insertion in Red-Black Trees

Case 2 -  $z$ 's uncle  $y$  is black and  $z$  is a right child



CASE 2



univstg

# Thus

## First

Here simple recoloring will not work.

## Rotate

We rotate first from to left using z.p.

This moves case 2 toward case 3.

To get ready for the final fix-up.



onyxteq

# Thus

## First

Here simple recoloring will not work.

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## First

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We rotate first from to left using z.p.

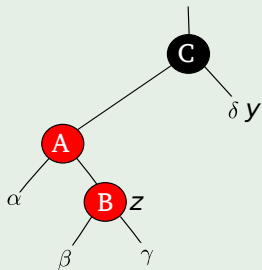
This moves case 2 toward case 3

To get ready for the final fix-up.

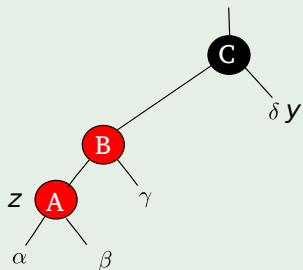


# From Case 2 to Case 3

## Example



CASE 2



CASE 3

# RB-Insert-Fixup

## RB-Insert-Fixup( $T, z$ )

```
1 while z.p.color == RED
2     if z.p == z.p.p.left
3         y=z.p.p.right
4         if y.color ==RED
5             z.p.color = BLACK
6             y.color = BLACK
7             z.p.p.color = RED
8             z = z.p.p
9     else if z == z.p.right
10         z = z.p
11         Left-Rotate( $T, z$ )
12         z.p.color = BLACK
13         z.p.p.color = RED
14         Right-Rotate( $T, z.p.p$ )
15     else ("right" and "left" exchanged)
16 T.root.color = BLACK
```

### Case 3

- if  $z$  is in the left child then
  - ▶ Recolor  $z$ 's parent to BLACK
  - ▶ recolor  $z$ 's grandparent to RED
  - ▶ Rotate right using the grandparent

Then

We do the following

Then, we recolor  $B.color = \mathbf{BLACK}$ ,  $C.color = \mathbf{RED}$  (No problem  $\gamma$  and  $\delta$  are black nodes)

Finally

Then, you rotate right using  $z.p.p$  to fix the black height property!!





Then

We do the following

Then, we recolor  $B.color = \mathbf{BLACK}$ ,  $C.color = \mathbf{RED}$  (No problem  $\gamma$  and  $\delta$  are black nodes)

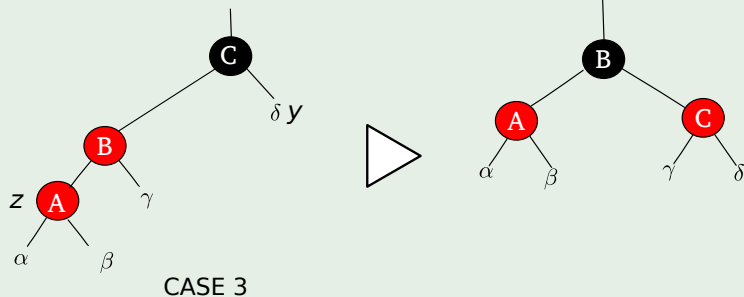
Finally

Then, you rotate right using  $z.p.p$  to fix the black height property!!



## From Case 3 to final recoloring

Case 3 - It allows to fix the bh locally



# Outline

## 1 Red-Black Trees

- The Search for Well Balanced Trees
- Observations
- Red-Black Trees
- Examples
- Lemma for the height of Red-Black Trees
  - Base Case of Induction
  - Induction
- Rotations in Red-Black Trees

## 2 Insertion in Red-Black Trees

- Important!!!
- Insertion Code
- The Fixup Code
- **Loop Invariance**
  - Initialization
  - Maintenance
  - **Termination**
- Example

## 3 Deletion in Red-Black Trees

- The Basics
- The Code
- The Case of a Virtual Node  $y$
- The Fix-Up
- The Code To Fix the Violations
- Suitable Rotations and Recoloring
- Example of Deletion in Red-Black Trees

## 4 Exercises

- Something for you to do



## When the loop terminates

it does so because  $z.p$  is black (Sentinel or not)

- The Tree does not violate property 4 at loop termination.
  - ▶ If a node is red, then both its children are black.

By the loop invariant

- The only property that might fail to hold is property 2
  - ▶ The root is black.



## When the loop terminates

it does so because  $z.p$  is black (Sentinel or not)

- The Tree does not violate property 4 at loop termination.
  - ▶ If a node is red, then both its children are black.

By the loop invariant

- The only property that might fail to hold is property 2
  - ▶ **The root is black.**

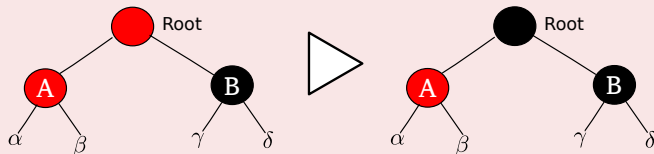


Then

## Root Recoloring

After pushing the problem up to the root by the while loop color the root to **BLACK!!!**

We have then



# Outline

## 1 Red-Black Trees

- The Search for Well Balanced Trees
- Observations
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- Examples
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  - Induction
- Rotations in Red-Black Trees

## 2 Insertion in Red-Black Trees

- Important!!!
- Insertion Code
- The Fixup Code
- Loop Invariance
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  - Termination
- **Example**

## 3 Deletion in Red-Black Trees

- The Basics
- The Code
- The Case of a Virtual Node  $y$
- The Fix-Up
- The Code To Fix the Violations
- Suitable Rotations and Recoloring
- Example of Deletion in Red-Black Trees

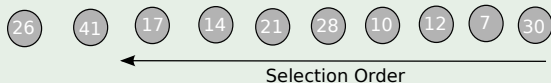
## 4 Exercises

- Something for you to do



# Example: Insertion in Red-Black Trees

Example Tree is empty



T.nil



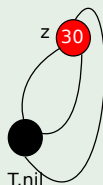
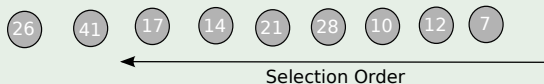


# Example: Insertion in Red-Black Trees

The root becomes red!!!

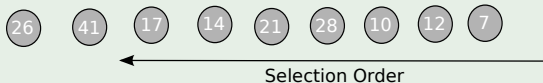
## STEPS

- 1  $y = T.nil$
- 2  $x = T.root$
- 3 We never go into the search loop
- 4  $z.p = y$
- 5 if  $y == T.nil$
- 6  $T.root = z$
- 7  $z.left = T.nil$
- 8  $z.right = T.nil$
- 9  $z.color = T.RED$



# Example: Insertion in Red-Black Trees

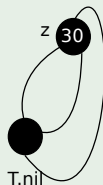
## Fix the problem



### ONLY STEP

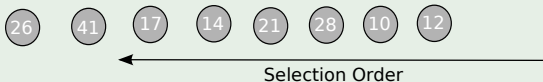
- 1 T.root.color=BLACK

It happens at the end of the Fix-up

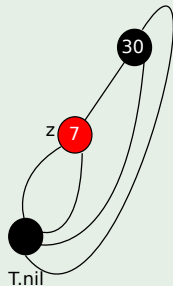


# Example: Insertion in Red-Black Trees

## Insert 7



- 1 Do a binary search to find a place to insert
- 2 Parent of z is not RED  $\Rightarrow$  no fix-up

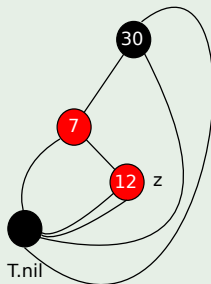


# Example: Insertion in Red-Black Trees

## Insert 12

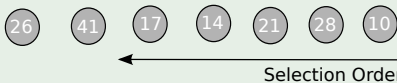


- 1 Do a binary search to find a place to insert
- 2 Parent of z is RED!!!

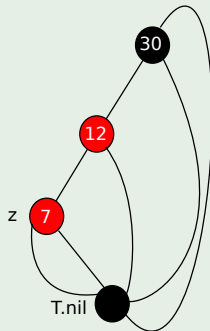


# Example: Insertion in Red-Black Trees

## Case 2 into Case 3



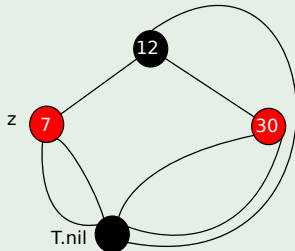
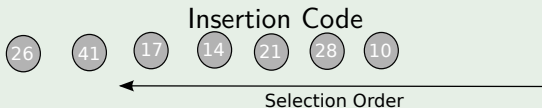
- 1 Re-balance first to the left  
if  $z == z.p.right$   
     $z = z.p$   
    Left-Rotate( $T, z$ )



# Example: Insertion in Red-Black Trees

## Case 3

- 1 Re-color and re-balance to the right  
 $z.p.color = \text{BLACK}$   
 $z.p.p.color = \text{RED}$   
 $\text{Right-Rotate}(T, z.p.p)$
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens

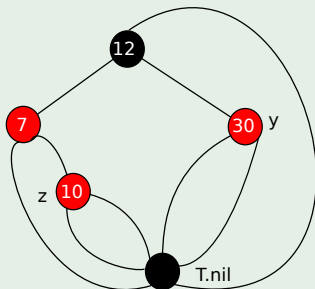


# Example: Insertion Code in Red-Black Trees

## Insert 10

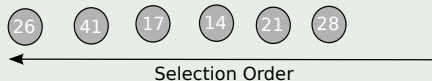


- 1 We insert 10
- 2 We color it to RED
- 3 We need to fix the problem

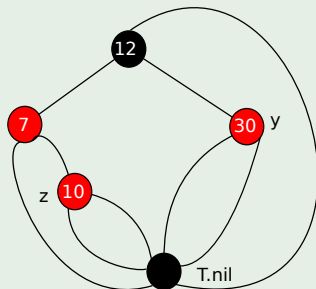


# Example: Insertion in Red-Black Trees

## Case 1



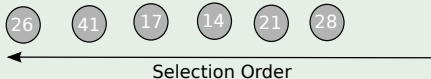
- 1 if  $z.p == z.p.p.left$
- 2  $y = z.p.p.right$
- 3 if  $y.color == RED$



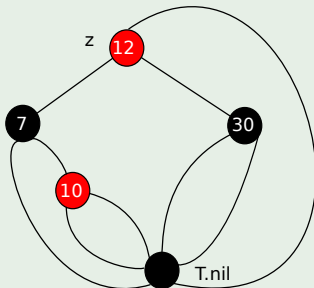


# Example: Insertion in Red-Black Trees

## Case 1

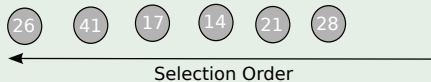


- 1 if  $y.color == RED$
- 2  $z.p.color = BLACK$
- 3  $y.color = BLACK$
- 4  $z.p.p.color = RED$
- 5  $z = z.p.p$

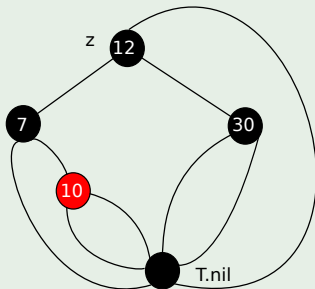


# Example: Insertion in Red-Black Trees

## Case 1 You get out of the loop and...

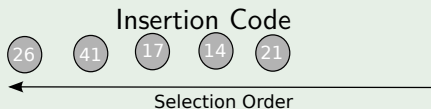


1 T.root.color = BLACK

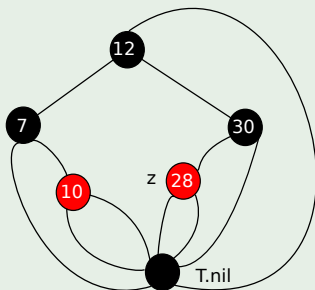


# Example: Insertion in Red-Black Trees

## Insert 28

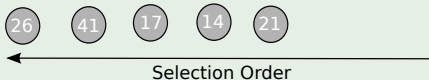


- 1 We insert 28
- 2 We color it to RED
- 3 No problem to fix...

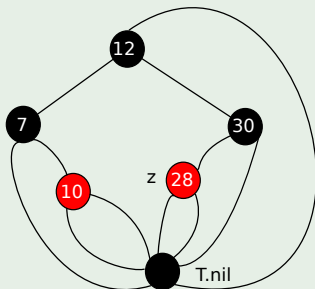


# Example: Insertion in Red-Black Trees

## Insert 28



- 1 We insert 28
- 2 We color it to RED
- 3 No problem to fix...



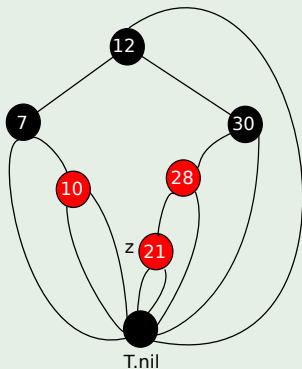
# Example: Insertion in Red-Black Trees

## Insert 21



Selection Order

- 1 We insert 21
- 2 We color it to RED
- 3 We need to fix...

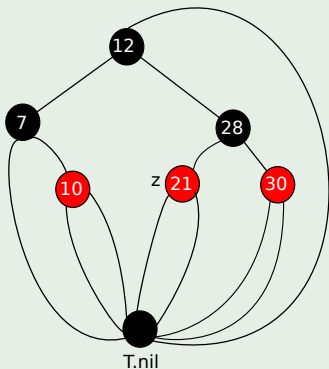


# Example: Insertion in Red-Black Trees

## Case 3



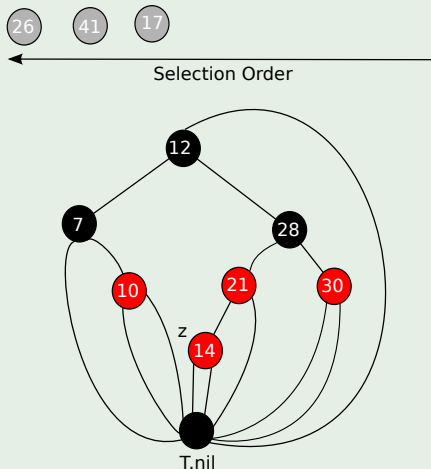
- 1 Re-color and re-balance to the right  
 $z.p.color = \text{BLACK}$   
 $z.p.p.color = \text{RED}$   
 $\text{Right-Rotate}(T, z.p.p)$
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens



# Example: Insertion in Red-Black Trees

## Insert 14

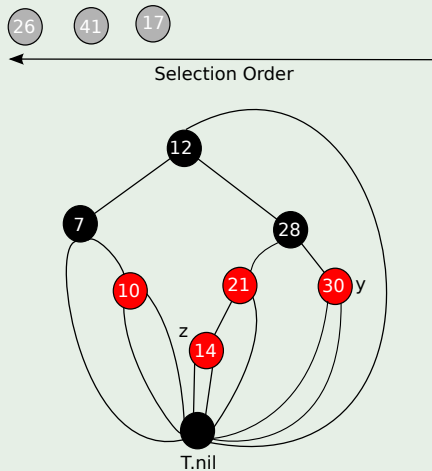
- 1 We insert 14
- 2 We color it to RED
- 3 We need to fix...



# Example: Insertion in Red-Black Trees

## Case 1

- 1 if  $z.p == z.p.p.left$
- 2  $y = z.p.p.right$
- 3 if  $y.color == RED$



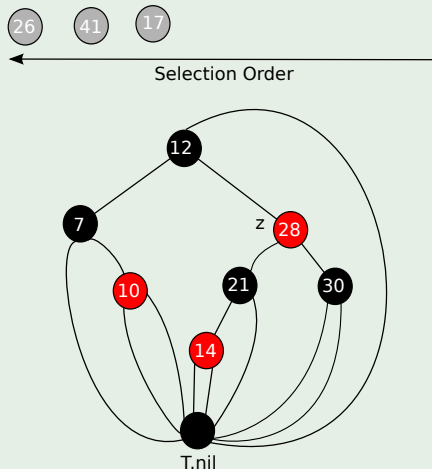


# Example: Insertion in Red-Black Trees

## Case 1

- 1 if  $y.color == RED$
- 2  $z.p.color = BLACK$
- 3  $y.color = BLACK$
- 4  $z.p.p.color = RED$
- 5  $z = z.p.p$

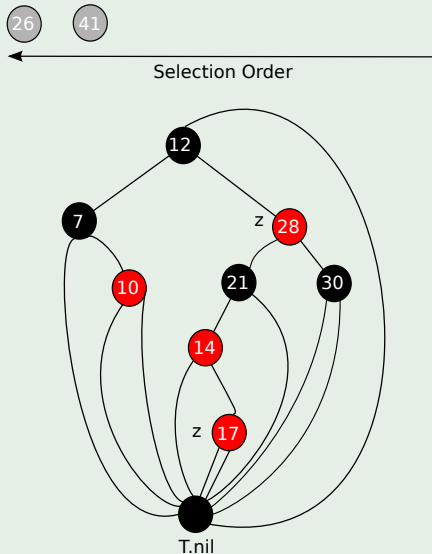
Nothing to do after!!!



# Example: Insertion in Red-Black Trees

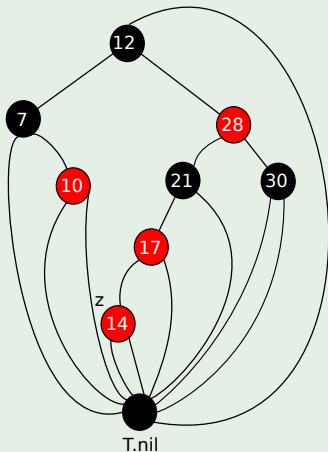
## Insert 17

- 1 Do a binary search to find a place to insert
- 2 Parent of z is RED!!!



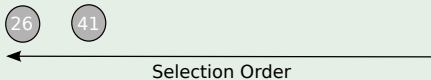


- 1 Re-balance first to the left  
if  $z == z.p.right$   
 $z = z.p$   
Left-Rotate( $T, z$ )

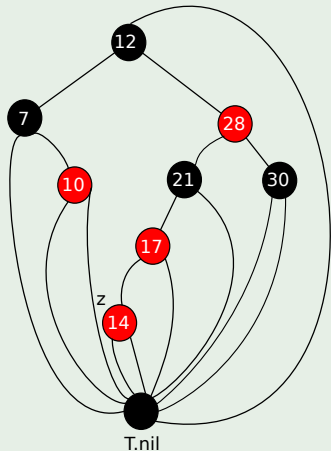


# Example: Insertion in Red-Black Trees

## Case 3

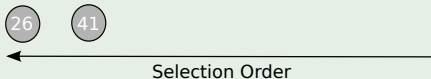


- 1 Re-color and re-balance to the right  
 $z.p.color = \text{BLACK}$   
 $z.p.p.color = \text{RED}$   
 $\text{Right-Rotate}(T, z.p.p)$
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens

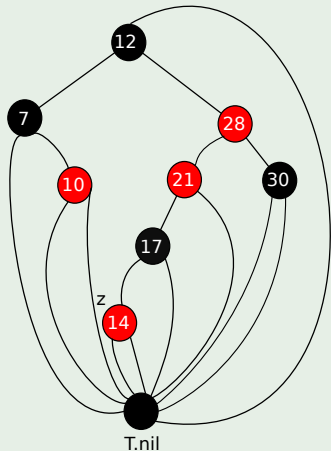


# Example: Insertion in Red-Black Trees

## Case 3

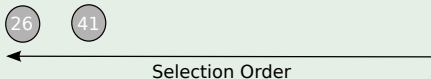


- 1 Re-color and re-balance to the right  
 $z.p.color = \text{BLACK}$   
 $z.p.p.color = \text{RED}$   
 $\text{Right-Rotate}(T, z.p.p)$
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens

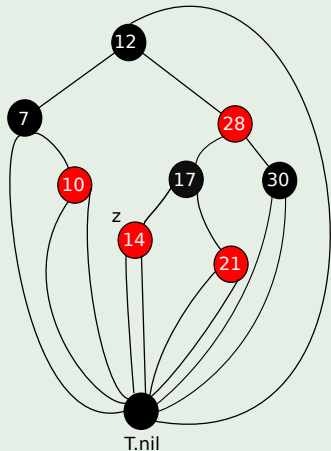


# Example: Insertion in Red-Black Trees

## Case 3

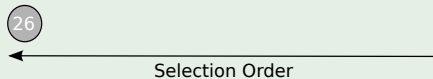


- 1 Re-color and re-balance to the right  
 $z.p.color = \text{BLACK}$   
 $z.p.p.color = \text{RED}$   
 $\text{Right-Rotate}(T, z.p.p)$
- 2 No problem to fix
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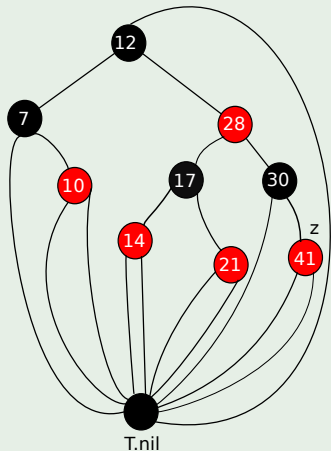


# Example: Insertion in Red-Black Trees

## Insert 41



- 1 Put in the correct node by binary search
- 2 Because 41's parent is BLACK nothing to fix

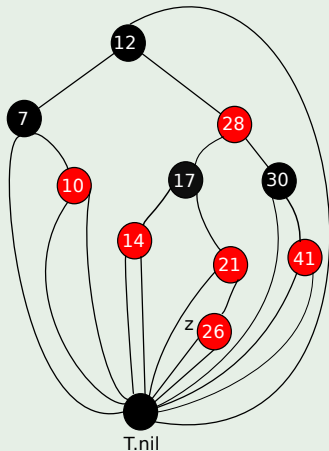


# Example: Insertion in Red-Black Trees

## Case 1 Symmetrical

- 1 if  $z.p == z.p.p.right$
- 2  $y = z.p.p.left$
- 3 if  $y.color == RED$
- 4  $z.p.color = BLACK$
- 5  $y.color = BLACK$
- 6  $z.p.p.color = RED$
- 7  $z = z.p.p$

← Selection Order



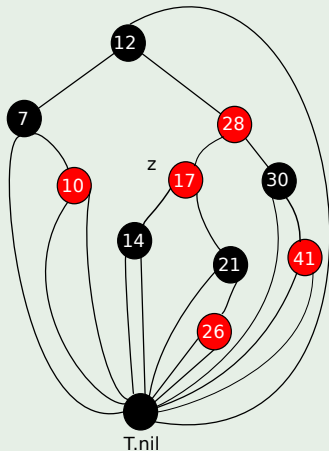


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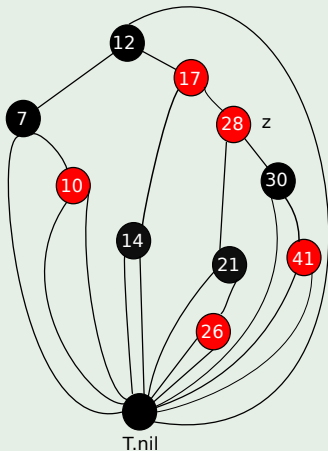


# Example: Insertion in Red-Black Trees

## Case 2 to case 3 - Symmetrical

- 1 Re-balance first to the right  
if  $z == z.p.left$   
 $z = z.p$   
Right-Rotate( $T, z$ )

← Selection Order

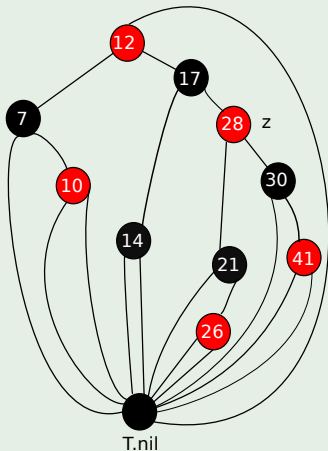


# Example: Insertion in Red-Black Trees

## Case 3 - Symmetrical

- 1 Re-color and re-balance to the right  
z.p.color = BLACK  
z.p.p.color=RED  
Left-Rotate(T, z.p.p)
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens

← Selection Order

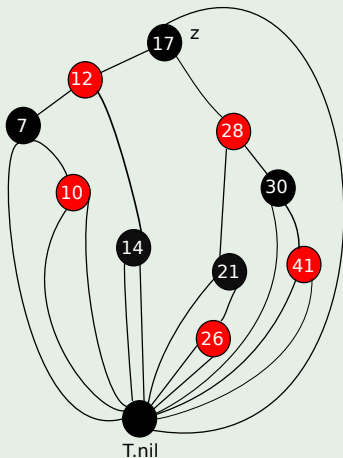


# Example: Insertion in Red-Black Trees

## Case 3 - Symmetrical

- 1 Re-color and re-balance to the right  
z.p.color = BLACK  
z.p.p.color=RED  
Left-Rotate(T, z.p.p)
- 2 No problem to fix
- 3 The root is already BLACK so nothing happens

← Selection Order



# Complexity of RB-Insert

It is easy to see that we have

$$O(\log n)$$

(1)



# Outline

## 1 Red-Black Trees

- The Search for Well Balanced Trees
- Observations
- Red-Black Trees
- Examples
- Lemma for the height of Red-Black Trees
  - Base Case of Induction
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- Important!!!
- Insertion Code
- The Fixup Code
- Loop Invariance
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  - Maintenance
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## 3 Deletion in Red-Black Trees

- **The Basics**
- The Code
- The Case of a Virtual Node  $y$
- The Fix-Up
- The Code To Fix the Violations
- Suitable Rotations and Recoloring
- Example of Deletion in Red-Black Trees

## 4 Exercises

- Something for you to do



# The Main Idea

Here, we use the idea of removing

By pushing in its place its successor.



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By pushing in its place its successor.

Therefore we have a problem

- If the successor of a node is the node  $y$ .
  - ▶ And  $y$  is black.
- We have removed a black node from a path.





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By pushing in its place its successor.

Therefore we have a problem

- If the successor of a node is the node  $y$ .
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• We have removed a black node from a path.



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By pushing in its place its successor.

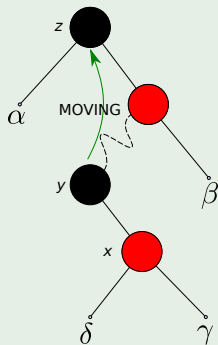
Therefore we have a problem

- If the successor of a node is the node  $y$ .
  - ▶ And  $y$  is black.
- We have removed a black node from a path.



Thus

## Example



# Outline

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- Something for you to do



# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
- 4      $x = z.\text{right}$
- 5     RB-Transplant( $T, z, z.\text{right}$ )
- 6 elseif  $z.\text{right} == T.\text{nil}$
- 7      $x = z.\text{left}$
- 8     RB-Transplant( $T, z, z.\text{left}$ )
- 9 else  $y = \text{Tree-Minimum}(z.\text{right})$
- 10      $y\text{-original-color} = y.\text{color}$
- 11      $x = y.\text{right}$
- 12     if  $y.p == z$
- 13          $x.p = y$
- 14     else RB-Transplant( $T, y, y.\text{right}$ )
- 15          $y.\text{right} = z.\text{right}$
- 16          $y.\text{right}.p = y$

### Case 1

- Store the info of the node to be deleted

# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
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- 5     RB-Transplant( $T, z, z.\text{right}$ )
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- 11     $x = y.\text{right}$
- 12    if  $y.p == z$
- 13        $x.p = y$
- 14    else RB-Transplant( $T, y, y.\text{right}$ )
- 15        $y.\text{right} = z.\text{right}$
- 16        $y.\text{right.p} = y$

### Case 2

- If the left child is empty
- Store the info of the right child
- Move  $z.\text{right}$  into the position of  $z$

# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
- 4      $x = z.\text{right}$
- 5     RB-Transplant( $T, z, z.\text{right}$ )
- 6 elseif  $z.\text{right} == T.\text{nil}$
- 7      $x = z.\text{left}$
- 8     RB-Transplant( $T, z, z.\text{left}$ )
- 9 else  $y = \text{Tree-Minimum}(z.\text{right})$
- 10     $y\text{-original-color} = y.\text{color}$
- 11     $x = y.\text{right}$
- 12    if  $y.p == z$
- 13        $x.p = y$
- 14    else RB-Transplant( $T, y, y.\text{right}$ )
- 15        $y.\text{right} = z.\text{right}$
- 16        $y.\text{right.p} = y$

### Case 3

- If the right child is empty
- Store the info of the left child
- Move  $z.\text{left}$  into the position of  $z$

# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
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- 14     else RB-Transplant( $T, y, y.\text{right}$ )
- 15          $y.\text{right} = z.\text{right}$
- 16          $y.\text{right.p} = y$

### Case 4

- Find the successor of  $z$
- Store the info of it: Color and right child



# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
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- 5     RB-Transplant( $T, z, z.\text{right}$ )
- 6 elseif  $z.\text{right} == T.\text{nil}$
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- 13          $x.p = y$
- 14     else RB-Transplant( $T, y, y.\text{right}$ )
- 15          $y.\text{right} = z.\text{right}$
- 16          $y.\text{right.p} = y$

### Case 5

- If parent of successor is  $z$  then set parent of  $x$  to  $y$

# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

- 1  $y = z$
- 2  $y\text{-original-color} = y.\text{color}$
- 3 if  $z.\text{left} == T.\text{nil}$
- 4      $x = z.\text{right}$
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- 6 elseif  $z.\text{right} == T.\text{nil}$
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- 13        $x.p = y$
- 14    else  $\text{RB-Transplant}(T, y, y.\text{right})$
- 15        $y.\text{right} = z.\text{right}$
- 16        $y.\text{right.p} = y$

$\emptyset$

### Case 6

- Substitute  $y$  with  $y.\text{right}$
- set  $y.\text{right}$  with  $z.\text{right}$
- set the parent of  $y.\text{right}$  to  $y$

# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

17.      RB-Transplant( $T, z, y$ )
18.       $y.left = z.left$
19.       $y.left.p = y$
20.       $y.color = z.color$
21. if  $y.original-color == BLACK$
22.      RB-Delete-Fixup( $T, x$ )

### Case 7

- Substitute  $z$  with  $y$
- Make  $y.left$  to  $z.left$
- Make the parent of  $y.left$  to  $y$
- Make the color of  $y$  to the color of  $z$



# Deletion in Red-Black Trees

## RB-DELETE( $T, z$ )

17. RB-Transplant( $T, z, y$ )
18.  $y.left = z.left$
19.  $y.left.p = y$
20.  $y.color = z.color$
21. if  $y.original-color == BLACK$
22.     RB-Delete-Fixup( $T, x$ )

### Case 8

- If  $y.original-color == BLACK$  then call RB-Delete-Fixup( $T, x$ )
- After all  $x$  points to the node that:
  - ▶ It is moved into the position of  $y$ .
  - ▶ Where  $y$  was moved into the position of  $z$ .



# Where RB-Transplant

## RB-Transplant( $T, u, v$ )

- 1 **if**  $u.p == T.nil$
- 2        $T.root = v$
- 3 **elseif**  $u == u.p.left$
- 4        $u.p.left = v$
- 5 **else**  $u.p.right = v$
- 6  $v.p = u.p$



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# A virtual node $y$ to be removed or moved around

## Case 1

- In line 1,  $y$  is removed when it points to  $z$  and has less than two children.



# A virtual node $y$ to be removed or moved around

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- In line 1,  $y$  is removed when it points to  $z$  and has less than two children.

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- In line 9,  $y$  is moved around when  $z$  has two children  
▶ Because  $y = \text{Tree-Minimum}(z.\text{right})$ .





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Then

$y$  will move to  $z$ 's position.



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## Then

$y$  will move to  $z$ 's position.



# A virtual node $y$ to be removed or moved around

Now, the color of  $y$ 's can change

- Therefore, it gets stored in  $y$ -original-color (Lines 2, 10).

Now, the color of  $x$ 's can change

## A virtual node $y$ to be removed or moved around

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Then, when  $z$  has two children

- Then  $y$  moves to  $z$ 's position and  $y$  gets the same color than  $z$ .
- This can produce a violation.



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## The node $x$ gets position $y$

In lines 4, 7, and 11,  $x$  is set to point to

- to  $y$ 's only child or

- $T.nil$



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Since  $x$  is going to move to  $y$ 's original position,

The  $x.p$  is pointed to  $y$ 's parent.



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In lines 4, 7, and 11,  $x$  is set to point to

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Since  $x$  is going to move to  $y$ 's original position

The  $x.p$  is pointed to  $y$ 's parent.

Unless  $y$  is  $x$ 's original parent.

The assignment of  $x.p$  takes place in line 6 of `RB-Transplant`.

- Observe that when `RB-Transplant` is called in lines 5, 8, or 14, the second parameter passed is the same as  $x$ .





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The node  $x$  gets position  $y$

if  $z$  is not the original  $y$ 's parent

We do not want  $x.p$  to point to it since we are going to remove it.

Then

In line 13 of RB-Delete,  $x.p$  is set to point to  $y$ .

Finally

$y$  will take the position of  $z$  in line 17.



The node  $x$  gets position  $y$

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The node  $x$  gets position  $y$

Then

If  $y$  was originally black after taking the  $z.color$  can produce a violation, then RB-Delete-Fixup is called.

This can happen

If  $y$  was originally red the Red-Black Trees properties still hold.



The node  $x$  gets position  $y$

Then

If  $y$  was originally black after taking the  $z.color$  can produce a violation, then RB-Delete-Fixup is called.

This can happen

If  $y$  was originally red the Red-Black Trees properties still hold.



# Deletion in Red-Black Trees

## Question

What if we removed a black node?



onyxteq



# Explanation

## We have three problems

- 1 If  $y$  was a root and a RED child becomes the new root, we have violated property 2.
- 2 If both  $x$  and  $x.p$  are RED, then we have violated property 4.
- 3 Moving  $y$  around decreases the black-height on a section of the Red Black Tree.
- 4 Thus, Property 5 is violated.



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## How?

- This could be fixed assuming that  $x$  has an “extra black.”



# Fix-up

## How?

- This could be fixed assuming that  $x$  has an “extra black.”

## Meaning

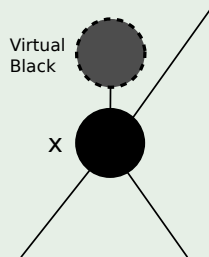
- This means that the node is “doubly black” or “red-and-black.”



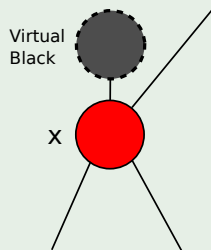
# Example

We have then

Doubly Black Case



Red-and-Black Case





## How is this done?

Thus

The procedure RB-DELETE -FIXUP restores properties 2, 4, and 5 by using the while loop to push the extra BLACK node up the tree.



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The procedure RB-DELETE-FIXUP restores properties 2, 4, and 5 by using the while loop to push the extra BLACK node up the tree.

### Until

- If we have that  $x$  is a **red-and-black**, we simply need to change the color of the node to BLACK (Line 23).



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The procedure RB-DELETE-FIXUP restores properties 2, 4, and 5 by using the while loop to push the extra BLACK node up the tree.

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- If we have that  $x$  is a **red-and-black**, we simply need to change the color of the node to BLACK (Line 23).

## Then, use Rotations

- Use suitable rotations and re-colorings until  $x$  stops to be a doubly black node.
- If we have that  $x$  is pointing to the root, remove "extra node."



# How is this done?

## Thus

The procedure RB-DELETE -FIXUP restores properties 2, 4, and 5 by using the while loop to push the extra BLACK node up the tree.

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- If we have that  $x$  is a **red-and-black**, we simply need to change the color of the node to BLACK (Line 23).

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## 4 Exercises

- Something for you to do



## RB-DELETE-FIXUP(T,x)

```
1 while x ≠ T.root and x.color == BLACK
2   if x == x.p.left
3     w = x.p.right
4     if w.color == RED
5       w.color = BLACK
6       x.p.color = RED
7       Left-Rotate(T, x.p)
8       w = x.p.right
9   if w.left.color == BLACK and w.right.color == BLACK
10    w.color = RED
11    x = x.p
12  else if w.right.color == BLACK
13    w.left.color = BLACK
14    w.color = RED
15    Right-Rotate(T, w)
16    w = x.p.right
17    w.color = x.p.color
18    x.p.color = BLACK
19    w.right.color = BLACK
20    Left-Rotate(T, x.p)
21    x = T.root
22  else (same with "right" and "left" exchanged)
23  x.color = BLACK
```

### While loop

- Because a violation on the bh, you need to move x up until the problem is fixed up.



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### Finding who you are

- Find which child are you
- Make w the other child



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20    Left-Rotate(T, x.p)
21    x = T.root
22  else (same with "right" and "left" exchanged)
23  x.color = BLACK
```

### Case 1

- if x is BLACK and w is RED
- Fix the bh problem by making w BLACK, x's parent to RED then rotate left using x's parent
- Make w = x.p.right moving the problem down.





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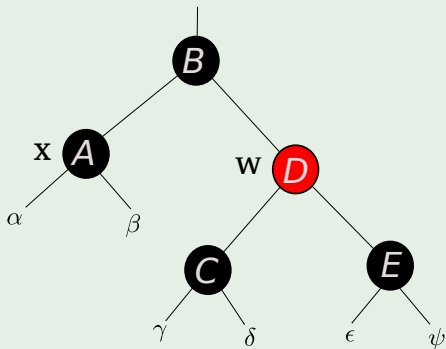
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- Something for you to do



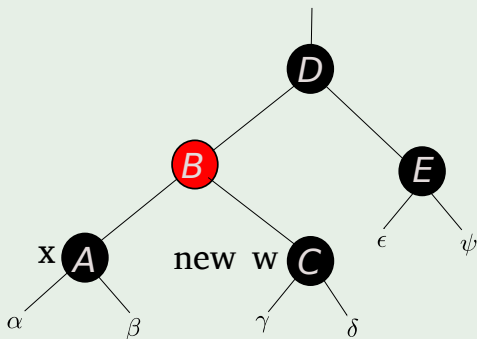
# Suitable Rotations and Recoloring

Case 1 -  $x$ 's sibling  $w$  is red. You keep the bh property of the other subtrees



# Suitable Rotations and Recoloring

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## RB-DELETE-FIXUP(T,x)

```
1 while x ≠ T.root and x.color == BLACK
2   if x == x.p.left
3     w = x.p.right
4     if w.color == RED
5       w.color = BLACK
6       x.p.color = RED
7       Left-Rotate(T, x.p)
8       w = x.p.right
9     if w.left.color == BLACK and w.right.color == BLACK
10      w.color = RED
11      x = x.p
12   else if w.right.color == BLACK
13     w.left.color = BLACK
14     w.color = RED
15     Right-Rotate(T, w)
16     w = x.p.right
17     w.color = x.p.color
18     x.p.color = BLACK
19     w.right.color = BLACK
20     Left-Rotate(T, x.p)
21     x = T.root
22   else (same with "right" and "left" exchanged)
23   x.color = BLACK
```

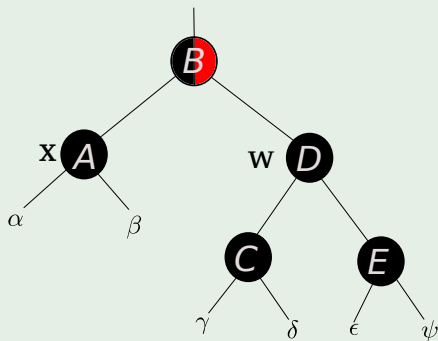
### Case 2

- Now if w.left's color and w.right's color is BLACK
- We do something smart decrease the bh height at w by making w's color to RED
- Move the problem from to x to x.p (After all the subtree have the same height at x.p)



## Suitable Rotations and Recoloring

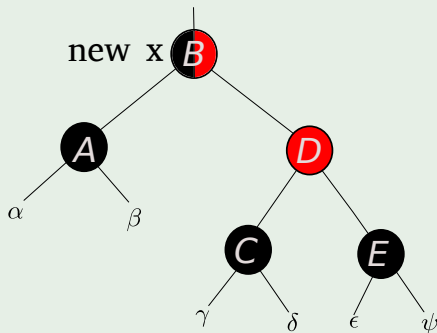
Case 2 -  $x$ 's sibling  $w$  is black, and both of  $w$ 's children are black.



**Note:** The Node with half and half colors has the meaning that it can be red or black.

# Suitable Rotations and Recoloring

Case 2 -  $x$ 's sibling  $w$  is black, and both of  $w$ 's children are black.



## RB-DELETE-FIXUP(T,x)

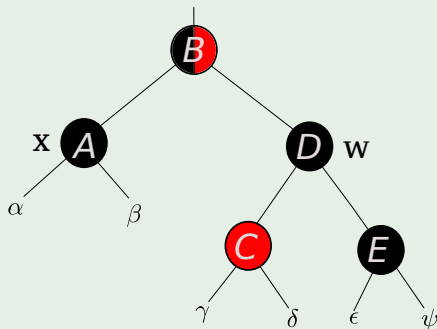
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16        w = x.p.right
17      w.color = x.p.color
18      x.p.color = BLACK
19      w.right.color = BLACK
20      Left-Rotate(T, x.p)
21      x = T.root
22   else (same with "right" and "left" exchanged)
23   x.color = BLACK
```

### Case 3

- If w.right's color is BLACK
- We do something smart, we re-color and do a right rotation at w
- This does not change the Red-Black Trees properties of w
- but prepare the situation for fixing the x height problem in case 4.

# Suitable Rotations and Recoloring

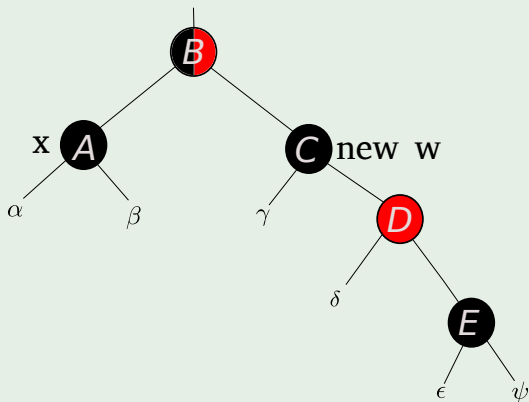
Case 3 -  $x$ 's sibling  $w$  is black,  $w$ 's left child is red, and  $w$ 's right child is black.





# Suitable Rotations and Recoloring

Case 3:  $x$ 's sibling  $w$  is black,  $w$ 's left child is red, and  $w$ 's right child is black.



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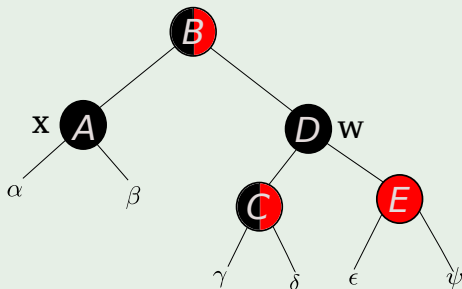
### Case 4

- We are ready to fix our problem!!! with respect to  $x$  (Case 2 and 3 where a preparation to fix the problem)
- We increase the height of the bh with the problem,  $x$ .



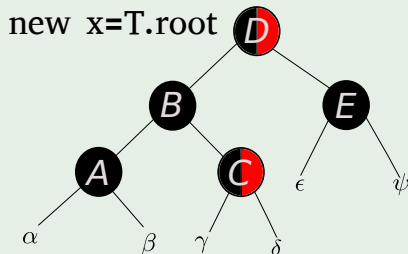
# Suitable Rotations and Recoloring

Case 4:  $x$ 's sibling  $w$  is black, and  $w$ 's right child is red.



# Suitable Rotations and Recoloring

Case 4:  $x$ 's sibling  $w$  is black, and  $w$ 's right child is red.



# Outline

## 1 Red-Black Trees

- The Search for Well Balanced Trees
- Observations
- Red-Black Trees
- Examples
- Lemma for the height of Red-Black Trees
  - Base Case of Induction
  - Induction
- Rotations in Red-Black Trees

## 2 Insertion in Red-Black Trees

- Important!!!
- Insertion Code
- The Fixup Code
- Loop Invariance
  - Initialization
  - Maintenance
  - Termination
- Example

## 3 Deletion in Red-Black Trees

- The Basics
- The Code
- The Case of a Virtual Node  $y$
- The Fix-Up
- The Code To Fix the Violations
- Suitable Rotations and Recoloring
- **Example of Deletion in Red-Black Trees**

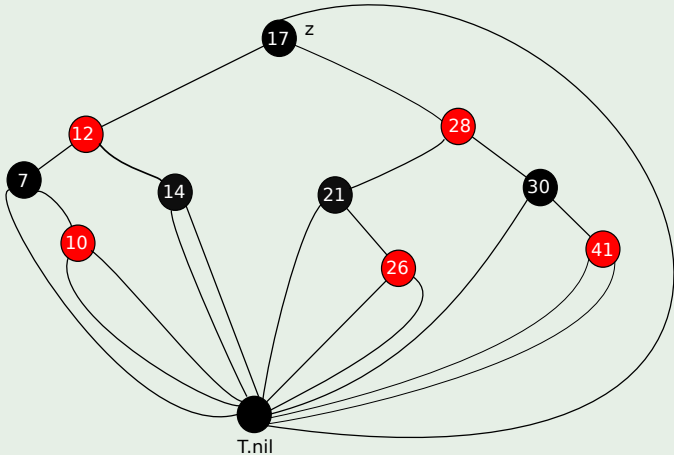
## 4 Exercises

- Something for you to do



# Deletion in Red-Black Trees

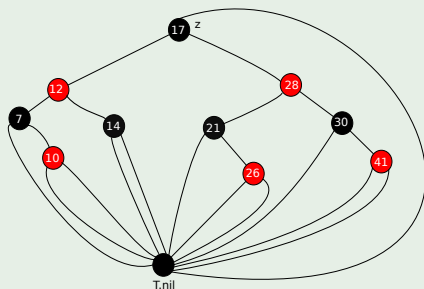
Delete 17



# Deletion in Red-Black Trees

## Store the info about z

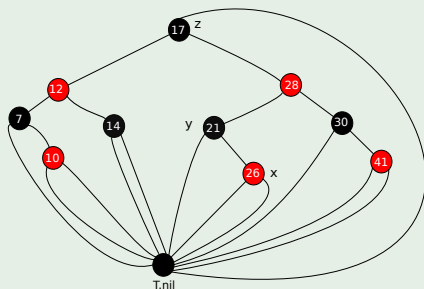
- $y = z$
- $y\text{-original-color} = y.\text{color}$



# Deletion in Red-Black Trees

None of the children of  $z$  are  $T.nil$ , thus

- else  $y = \text{Tree-Minimum}(z.\text{right})$
- $y\text{-original-color} = y.\text{color}$
- $x = y.\text{right}$

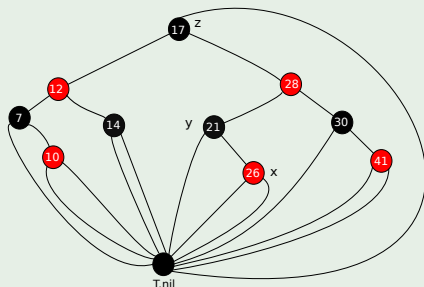




# Deletion in Red-Black Trees

We have that  $y.p \neq z$

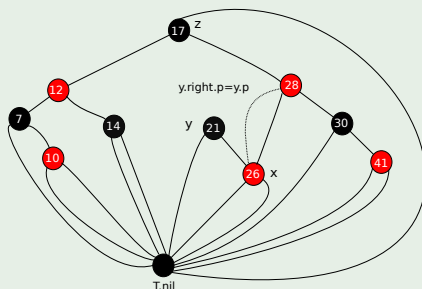
- else RB-Transplant( $T, y, y.right$ )
- $y.right = z.right$
- $y.right.p = y$



# Deletion in Red-Black Trees

## Transplant( $T$ , $y$ , $y$ .right)

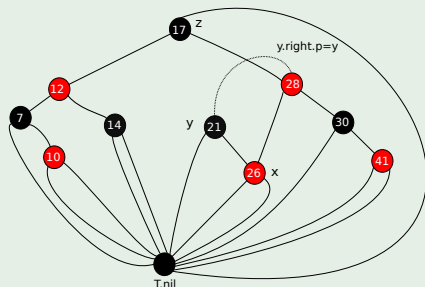
- elseif  $y == y.p.left$
- $y.p.left = y.right$
- $y.right.p = y.p$



# Deletion in Red-Black Trees

## Now, we move pointers

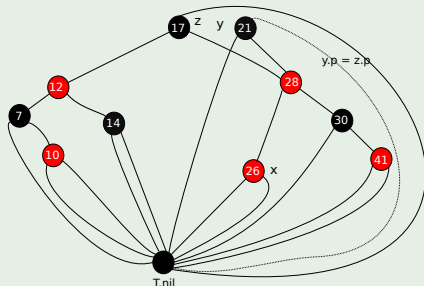
- $y.\text{right} = z.\text{right}$
- $y.\text{right}.p = y$



# Deletion in Red-Black Trees

## Transplant(z,y)

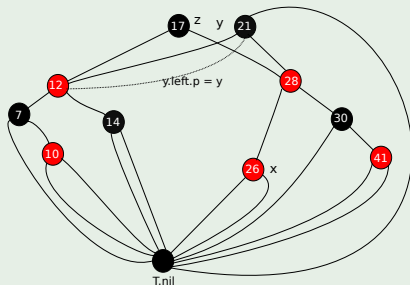
- if  $z.p == T.nil$
- $T.root = y$
- $y.p = z.p$



# Deletion in Red-Black Trees

## Move pointers

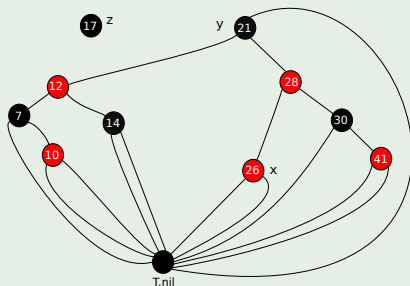
- $y.\text{left} = z.\text{left}$
- $y.\text{left.p} = y$
- $y.\text{color} = z.\text{color}$



# Deletion in Red-Black Trees

We remove  $z$  safely and we go into  $\text{Delete-Fixup}(T, x)$

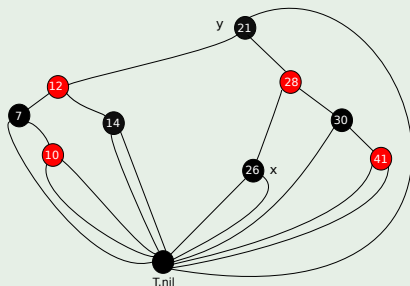
- $z.\text{right} = \text{NULL}$
- $z.\text{left} = \text{NULL}$
- $z.\text{parent} = \text{NULL}$



# Deletion in Red-Black Trees

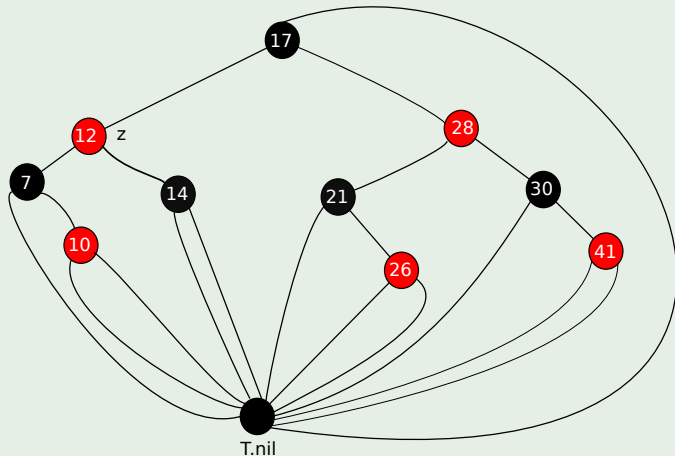
We remove  $z$  safely and we go into  $\text{Delete-Fixup}(T, x)$

- Never enter into the loop
- Simply do  $x.\text{color} = \text{BLACK}$



# Deletion in Red-Black Trees

Delete 12

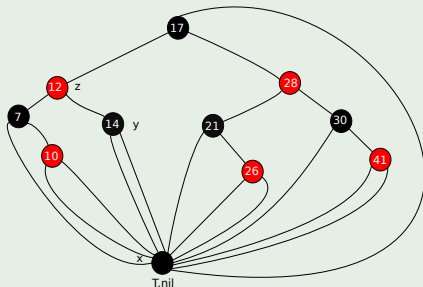




# Deletion in Red-Black Trees

None of the children of  $z$  are T.nil, thus

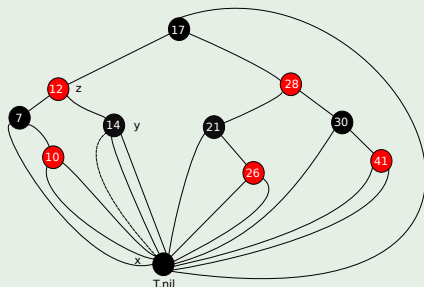
- else  $y = \text{Tree-Minimum}(z.\text{right})$
- $y\text{-original-color} = y.\text{color}$   
(BLACK)
- $x = y.\text{right}$  (T.NIL)



# Deletion in Red-Black Trees

We have that  $y.p == z$

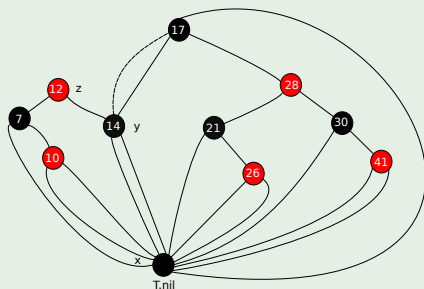
- if  $y.p == z$
- $x.p = y$



# Deletion in Red-Black Trees

## Next

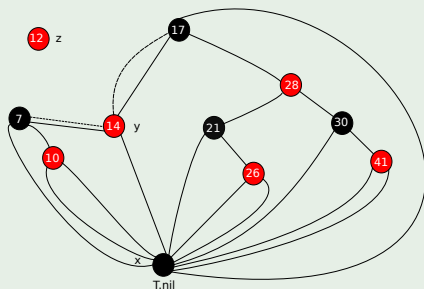
- **RB-Transplant( $T, z, y$ )**
- $y.left = z.left$
- $y.left.p = y$
- $y.color = z.color$



# Deletion in Red-Black Trees

## Next

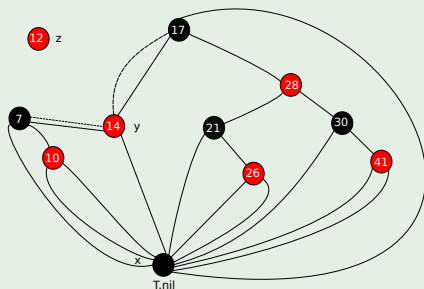
- $\text{RB-Transplant}(T, z, y)$
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- $y.\text{color} = z.\text{color}$



# Deletion in Red-Black Trees

## Next

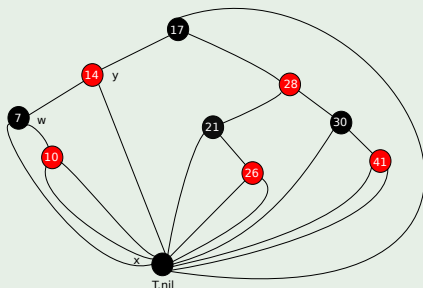
- $\text{RB-Transplant}(T, z, y)$
- $y.\text{left} = z.\text{left}$
- $y.\text{left.p} = y$
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# Deletion in Red-Black Trees

We remove z safely and we go into Delete-Fixup(T,x)

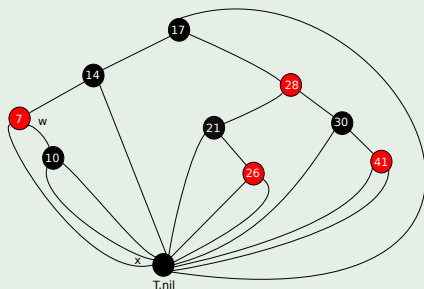
- enter into the loop
- if  $x == x.p.right$
- $w = x.p.left$



# Deletion in Red-Black Trees

## We enter into case 4

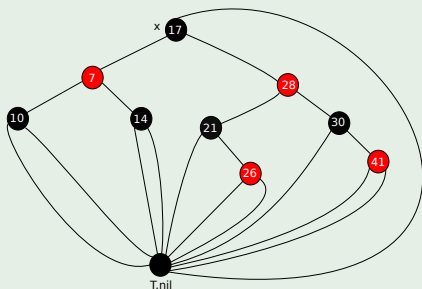
- 1  $w.color = x.p.color$
- 2  $x.p.color = BLACK$
- 3  $w.right.color = BLACK$



# Deletion in Red-Black Trees

## Rotate and move the x

- 1 Left-Rotate( $T, x.p$ )
- 2  $x = T.root$





# Applications of Red-Black Trees

## Completely Fair Scheduler (CFS)

- It is a task scheduler which was merged into 2.6.23 release of the Linux Kernel.
- It is a replacement of earlier  $O(1)$  scheduler.
- CFS algorithm was designed to maintain balance (fairness) in providing processor time to tasks.

## Solving using Parallel Implementations

- Running in  $O(\log \log n)$  time



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## Sorting using Parallel Implementations

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# Exercises

## From Cormen's book solve

- 13.1-1
- 13.1-3
- 13.1-5
- 13.1-7
- 13.2-2
- 13.2-3
- 13.2-4
- 13.2-5
- 13.3-2
- 13.3-4
- 13.4-2
- 13.4-4