Presentation for use with the textbook Algorithm Design and Applications, by M. T. Goodrich and R. Tamassia, Wiley, 2015

## Ch04 Balanced Search Trees



## Why care about advanced implementations?

Same entries, different insertion sequence:

(b)


Not good! Would like to keep tree balanced.

## Balanced binary tree

- The disadvantage of a binary search tree is that its height can be as large as N-1
- This means that the time needed to perform insertion and deletion and many other operations can be $\mathrm{O}(\mathrm{N})$ in the worst case
- We want a tree with small height
- A binary tree with $N$ node has height at least $\Theta$ (log N)
- Thus, our goal is to keep the height of a binary search tree $\mathrm{O}(\log \mathrm{N})$
- Such trees are called balanced binary search trees. Examples are AVL tree, and red-black tree.


## Approaches to balancing trees

- Don't balance
- May end up with some nodes very deep
- Strict balance
- The tree must always be balanced perfectly
- Pretty good balance
- Only allow a little out of balance

Adjust on access

- Self-adjusting


## Balancing Search Trees

- Many algorithms exist for keeping search trees balanced
- Adelson-Velskii and Landis (AVL) trees (height-balanced trees)
- Red-black trees (black nodes balanced trees)
- Splay trees and other self-adjusting trees
- B-trees and other multiway search trees


## Perfect Balance

- Want a complete tree after every operation
- Each level of the tree is full except possibly in the bottom right
- This is expensive
- For example, insert 2 and then rebuild as a complete tree



## AVL - Good but not Perfect Balance

- AVL trees are height-balanced binary search trees
- Balance factor of a node
- height(left subtree) - height(right subtree)
- An AVL tree has balance factor calculated at every node
- For every node, heights of left and right subtree can differ by no more than 1
- Store current heights in each node


## Height of an AVL Tree

- $N(h)=$ minimum number of nodes in an AVL tree of height $h$.
- Basic case:
- $\mathrm{N}(0)=1, \mathrm{~N}(1)=2$
- Inductive case:

$$
\text { - } N(h)=N(h-1)+N(h-2)+1
$$

- Theorem (from Fibonacci analysis)
- $N(h) \geq \phi^{h}$
where $\phi \approx 1.618$, the golden ratio.



## Height of an AVL Tree

$\square N(h) \geq \phi^{h} \quad(\phi \approx 1.618)$

- Suppose we have n nodes in an AVL tree of height $h$.
- $n \geq N(h)$ (because $N(h)$ was the minimum)
- $\mathrm{n} \geq \phi^{\mathrm{h}}$ hence $\log _{\phi} \mathrm{n} \geq \mathrm{h}$ (relatively well balanced tree!!)
- $\mathrm{h} \leq 1.44 \log _{2} \mathrm{n}$ (i.e., Find takes $\mathrm{O}(\operatorname{logn})$ )


## Node Heights



## Node Heights after Insert 7



## Insert and Rotation in AVL Trees

- Insert operation may cause balance factor to become 2 or -2 for some node
- only nodes on the path from insertion point to root node have possibly changed in height
- So after the Insert, go back up to the root node by node, updating heights
- If a new balance factor (the difference $h_{\text {left }}{ }^{-}$ $\mathrm{h}_{\text {right }}$ ) is 2 or -2 , adjust tree by rotation around the node


## Single Rotation in an AVL Tree



## Insertions in AVL Trees

Let the node that needs rebalancing be $\alpha$.

Cases: 1


There are 4 cases:
Outside Cases (require single rotation) :

1. Insertion into left subtree of left child of $\alpha$. (left-left)
2. Insertion into right subtree of right child of $\alpha$. (right-right) Inside Cases (require double rotation) :
3. Insertion into right subtree of left child of $\alpha$. (left-right)
4. Insertion into left subtree of right child of $\alpha$. (right-left)

The rebalancing is performed through four separate rotation algorithms.


15

## AVL Insertion: Outside Case




17

## Single right rotation



## Outside Case Completed



AVL property has been restored!

## AVL Insertion: Inside Case


$\qquad$

## AVL Insertion: Inside Case



21

## AVL Insertion: Inside Case



## AVL Insertion: Inside Case

Consider the structure of subtree Y...


## AVL Insertion: Inside Case

$Y=$ node $i$ and subtrees V and W


25

## Double rotation : first rotation




27

## Double rotation : second rotation

right rotation complete


## Implementation



Once you have performed a rotation (single or double) you won't need to go back up the tree

```
Class BinaryNode
                                    KeyType: Key
                                    int: Height
                                    BinaryNode: LeftChild
                                    BinaryNode: RightChild
    Constructor(KeyType: key)
                Key = key
                Height = 0
        End Constructor
End Class
```


## Java-like Pseudo-Code

rotateToRight( BinaryNode: x ) \{
BinaryNode y = x.LeftChild;
$x$.LeftChild $=y$.RightChild;
y.RightChild $=x$;
return y ;
\}


Rotate with left child

## Java-like Pseudo-Code

```
                rotateToLeft( BinaryNode: x ) {
```

                        BinaryNode y = x.rightChild;
                                x.rightChild = y.leftChild;
                        y. leftChild \(=x\);
        return \(y\);
    \}


Rotate with right child

## Double Rotation

- Implement Double Rotation in two lines.



## Insertion in AVL Trees

$\square$ Insert at the leaf (as for all BST)

- only nodes on the path from insertion point to root node have possibly changed in height
- So after the Insert, go back up to the root node by node, updating heights
- If a new balance factor (the difference $h_{\text {left }}{ }^{-}$ $h_{\text {right }}$ ) is 2 or -2 , adjust tree by rotation around the node


## Insert in ordinary BST

```
Algorithm insert(k,v)
    input: insert key }k\mathrm{ into the tree rooted by v
    output: the tree root with }\boldsymbol{k}\mathrm{ adding to }\boldsymbol{v}\mathrm{ .
    if isNull (v)
        return newNode(k)
    if k\leq\boldsymbol{key}(\boldsymbol{v})\quad// duplicate keys are okay
        leftChild(v) \leftarrow insert (k,leftChild(v))
    else if k>key(v)
        rightChild(v) < insert (k, rightChild(v))
    return v
```


## Insert in AVL trees

```
Insert(v : binaryNode, x : element) : {
    if v = null then
        {v < new node; v.data & x; height & 0;}
    else case
    v.data = x : ; //Duplicate do nothing
    v.data > x : v.leftChild < Insert(v.leftChild, x);
        // handle left-right and left-left cases
        if ((height(v.leftChild)- height(v.rightChild)) = 2)then
            if (v.leftChild.data > x ) then //outside case
                v = RotateToRight (v);
            else //inside case
                v = DoubleRotateToRightt (v);}
    v.data < x : v.righChild & Insert(v.rightChild, x);
        // handle right-right and right-left cases
        ... ..
        Endcase
        v.height & max(height(v.left),height(v.right)) +1;
        return v;
}
```


## Example of Insertions in an AVL Tree



Example of Insertions in an AVL Tree


## Single rotation (outside case)



## Double rotation (inside case)



## In Class Exercises

$\square$ Build an AVL tree with the following values:
$15,20,24,10,13,7,30,36,25$


41



43

## Possible Quiz Questions

- Build an AVL tree by inserting the following values in the given order:
$1,2,3,4,5,6$.


## AVL Tree Deletion

- Similar but more complex than insertion
- Rotations and double rotations needed to rebalance
- Imbalance may propagate upward so that many rotations may be needed.


## Deletion

Removal begins as in a binary search tree, which means the node removed will become an empty external node. Its parent may have an imbalance.

- Example:

before deletion of 32 after deletion


## Rebalancing after a Removal

- Let $z$ be the first unbalanced node encountered while travelling up the tree from $w$. Also, let $y$ be the child of $z$ with the larger height, and let $x$ be the child of $y$ with the larger height
- We perform a rotateToLeft to restore balance at z
- As this restructuring may upset the balance of another node higher in the tree, we must continue checking for balance until the root of T is reached



## Deletion in standard BST

```
Algorithm remove (k, v)
    input: delete the node containing key \(k\)
    output: the tree without \(\boldsymbol{k}\).
    if isNull (v)
        return \(v\)
    if \(k<\boldsymbol{k e y}(v) \quad / /\) duplicate keys are okay
        leftChild \((v) \leftarrow \operatorname{remove}(k\), leftChild(v))
    else if \(k>\operatorname{key}(v)\)
        rightChild \((v) \leftarrow \operatorname{remove}(k\), rightChild \((v))\)
    else if isNull(leftChild(v))
        return rightChild(v)
    else if isNull(rightChild(v))
        return leftChild(v)
    node max \(\leftarrow\) treeMaximum(leftChild(v))
    \(\boldsymbol{k e y}(v) \leftarrow \boldsymbol{k e y}(\) min \()\)
    \(\operatorname{rightChild}(v) \leftarrow \operatorname{remove}(\operatorname{key}(\min )\), rightChild(v))
    return \(v\)
```


## Deletion in AVL Trees

Algorithm remove( $k, v$ )
input: delete the node containing key $k$
output: the tree without $\boldsymbol{k}$.
if isNull ( $v$ )
return $v$
if $\boldsymbol{k}<\boldsymbol{\operatorname { k e y }}(\boldsymbol{v}) \quad / /$ duplicate keys are okay
leftChild $(v) \leftarrow \operatorname{remove}(k$, leftChild $(v))$
else if $k>k e y(v)$
$\operatorname{rightChild}(v) \leftarrow \operatorname{remove}(k$, rightChild $(v))$
else if isNull(leftChild(v))
return rightChild(v)
else if isNull(rightChild(v))
return leftChild(v)
node max $\leftarrow$ treeMaximum(leftChild(v))
$\operatorname{key}(v) \leftarrow \operatorname{key}(\max )$
leftChild $(v) \leftarrow \operatorname{remove}($ key $($ max $)$, leftChild $(v))$
AVLbalance (v)
return $v$

AVLbalance(v)
Assume the height is updated in rotations.
if (v.left.height > v.right.height +1 ) \{ $y=v . l e f t$ if (y.right.height > y.left.height) DoubleRotateToRight(v) else rotateToRight(v)
\}
if (v.right.height > v.left.height+1) \{ $y=$ v.right if (y.left.height > y.right.height) DoubleRotateToLeft(v) else rotateToLeft(v)
\}

## AVL Tree Example:

- Now remove 53


AVL Tree Example:

- Now remove 53, unbalanced


51

AVL Tree Example:

- Balanced!


Now try Remove 11

## AVL Tree Example:

- Remove 11, replace it with the largest, i.e., 8 , in its left branch.


Now try Remove 8.

53

AVL Tree Example:

- Remove 8, unbalanced


AVL Tree Example:

- Remove 8, unbalanced


55

AVL Tree Example:

- Balanced!!



## Deletion in AVL Trees

```
Algorithm remove ( \(k, v\) )
    input: delete the node containing key \(k\)
    output: the tree without \(k\).
    if isNull ( \(v\) )
        return \(v\)
    if \(\boldsymbol{k}<\boldsymbol{\operatorname { k e y }}(\boldsymbol{v}) \quad / /\) duplicate keys are okay
        leftChild \((v) \leftarrow \operatorname{remove}(k\), leftChild \((v))\)
    else if \(k>k e y(v)\)
        \(\operatorname{rightChild}(v) \leftarrow \operatorname{remove}(k\), rightChild \((v))\)
    else if isNull(leftChild(v))
        return rightChild(v)
    else if isNull(rightChild(v))
        return leftChild(v)
    node max \(\leftarrow\) treeMaximum(leftChild(v))
    \(\operatorname{key}(v) \leftarrow \operatorname{key}(\max )\)
    leftChild \((v) \leftarrow \operatorname{remove}(\) key \((\) max \()\), leftChild \((v))\)
    return AVLbalance(v)
```

AVLbalance(v) \{
Assume the height is updated in
rotations.
if (v.left.height >
v.right.height+1) \{
$y=v . l e f t$
if ( y .right. height >
y.left.height)
$\mathrm{v}=$ DoubleRotateToRight(v)
else $v=$ rotateToRight $(v)$
\}
if (v.right.height >
v.left.height+1) \{
$y=v . r i g h t$
if (y.left.height >
y.right.height)
$\mathrm{v}=$ DoubleRotateToLeft(v)
else $\mathrm{v}=$ rotateToLeft(v)
\}
return v
\}


## AVL Tree Performance

- AVL tree storing $n$ items
- The data structure uses $O(n)$ space
- A single restructuring takes $O$ (1) time
- using a linked-structure binary tree
- Searching takes $O(\log n)$ time
- height of tree is $\mathrm{O}(\log n)$, no restructures needed
- Insertion takes $O(\log n)$ time
- initial find is $\mathrm{O}(\log n)$
- restructuring up the tree, maintaining heights is $O(\log n)$
- Removal takes O(logn) time
- initial find is $\mathrm{O}(\log n)$
- restructuring up the tree, maintaining heights is $O(\log n)$


## Pros and Cons of AVL Trees

Arguments for AVL trees:

1. Search is $\mathrm{O}(\log \mathrm{N})$ since AVL trees are always balanced.
2. Insertion and deletions are also O(logn)
3. The height balancing adds no more than a constant factor to the speed of insertion.

Arguments against using AVL trees:

1. Difficult to program \& debug; more space for height.
2. Asymptotically faster but rebalancing costs time.
3. Most large searches are done in database systems on disk and use other structures (e.g. B-trees).
4. May be OK to have $\mathrm{O}(\mathrm{N})$ for a single operation if the total run time for many consecutive operations is fast (e.g. Splay trees).

## Red-Black Tree

- A ref-black tree is a binary search such that each node has a color of either red or black.
- The root is black.
- Empty (or null) nodes are assumed black.
- Every path from a node to a leaf contains the same number of black nodes.

Class BinaryNode KeyType: Key Boolean: isRed<br>BinaryNode: LeftChild BinaryNode: RightChild<br>Constructor(KeyType: key) Key = key isRed = true<br>End Constructor<br>End Class

- If a node is red then its parent must be black.


## Example

The root is black.


Theorem: Any red-black tree with root $\boldsymbol{x}$, has $\mathbf{n} \geq \mathbf{2}^{\mathbf{h} / \mathbf{2}} \mathbf{- 1}$ nodes, where $h$ is the height of tree rooted by $x$.
Proof: We repeatedly replace the subtree rooted by a red node by one of its children.
Let the height of the new tree be $\mathrm{h}^{\prime}$, then $\mathrm{h}^{\prime}>=$ $h / 2$, because the number of red nodes in any path is no more than the number of black nodes.
The new tree is a perfect binary tree, because it has the same of nodes from the root to any leaf. It must have $2^{h^{\prime}}-1$ nodes.
So $h \leq 2 \log (n+1)$.

## Maintain the Red Black Properties in a Tree

-Insertions

- Must maintain rules of Red Black Tree.
- New Node always added at leaf
- can't be black or we will violate rule of the same \# of blacks along any path
- therefore the new node must be red
- If parent is black, done (trivial case)
- If parent red, things get interesting because a red node with a red parent violates no double red rule.


## Algorithm: Insertion

A red-black tree is a particular binary search tree, so create a new node as red and insert it as in normal search tree.


Violation!


What property is violated?
The parent of a red node must be black.

Solution: (1) Rotate; (2) Switch colors.

## Example of Inserting Sorted Numbers



Insert 1. A leaf is red. Realize it is root so recolor to black.


## Insert 2

make 2 red. Parent
is black so done.


## Insert 3

Insert 3. Parent is red.
2's uncle, i.e., the sibling of the parent of 2 , is black (null).
3 is outside relative

to grandparent. Rotate parent and grandparent


68


69


Finish insert of 5


71

Insert 6


6 has a red uncle (3).
So switch the grandparent (4)'s
color with parent (5) and uncle (3).

Finishing insert of 6


73

Insert 7

7's parent is red. Parent's sibling is black (null). 7 is outside relative to grandparent (5) so
 rotate parent and
grandparent then recolor

Finish insert of 7


75

## Insert 8



8's parent is red and its uncle (5) is also red.
Switching the color of 6 with 5 and 7 creates a problem because 6's
parent, 4 , is also red.
Must handle the red-red
violation at 6 .

## Still Inserting 8.

 uncle (5) is also red.
Switching the color of 6 with 5 and 7 creates a problem because 6's

6's uncle (1) is black. So rotate and recolor. parent, 4, is also red.
Must handle the red-red violation at 6 .

Finish inserting 8



79

Finish Inserting 9


## Insert 10



81


Finishing Insert 10


83

## Algorithm: Insertion

We have detected a need for balance when $X$ is red and its parent, too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if new X's parent is red.



## Algorithm: Insertion

We have detected a need for balance when $X$ is red and its parent, too. - If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if new X 's parent is red.


85

## Algorithm: Insertion

We have detected a need for balance when X is red and his parent too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if new X's parent is red.
- If X is a left child and has a black uncle: colour the parent black and the grandparent red, then rotateToRight(X.parent.parent)



## Algorithm: Insertion

We have detected a need for balance when X is red and his parent too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if X 's parent is red.
- If X is a left child and has a black uncle: colour the parent black and the grandparent red, then rotateRight(X.parent.parent)


## Algorithm: Insertion

We have detected a need for balance when X is red and his parent too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if X 's parent is red.
 grandparent red, then rotateRight(X.parent.parent)



## Algorithm: Insertion

We have detected a need for balance when X is red and his parent too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace X by grandparent to see if X 's parent is red.
- If $X$ is a right child and has a black uncle, then rotateToLeft(X.parent) and
- If X is a left child and has a black uncle: colour the parent black and the grandparent red, then rotateToRight(X.parent.parent)


89

## Algorithm: Insertion

We have detected a need for balance when X is red and his parent too.

- If X has a red uncle: colour the parent and uncle black, and grandparent red. Then replace $X$ by grandparent to see if X's parent is red.
- If X is a right child and has a black uncle, then rotateLeft(X.parent) and
- If X is a left child and has a black uncle: colour the parent black and the grandparent red, then rotateRight(X.parent.parent)


90

## Double Rotation

What if $X$ is at left right relative to $G$ ?

- a single rotation will not work

Must perform a double rotation

- rotate $X$ and $P$
- rotate X and G


91


92

## Properties of Red Black Trees

- If a Red node has any children, it must have two children and they must be black. (Why?)
- If a black node has only one child, that child must be a Red leaf. (Why?)
- Due to the rules there are limits on how unbalanced a Red Black tree may become.


## Red Black Trees vs AVL Trees

- AVL trees provide faster lookups than Red Black Trees because they are more strictly balanced.
- Red Black Trees provide faster insertion and removal operations than AVL trees as fewer rotations are done due to relatively relaxed balancing.
- AVL trees store balance factors or
heights with each node, thus requires storage for an integer per node whereas Red Black Tree requires only 1 bit of information per node.


95

## Motivation for Splay Trees

Problems with AVL Trees

- extra storage/complexity for height fields
- ugly delete code

Solution: splay trees

- blind adjusting version of AVL trees
- amortized time for all operations is $O(\log n)$
- worst case time is $\mathrm{O}(\mathrm{n})$
- insert/find always rotates node to the root!


## Splay Tree Idea



## Splaying Cases

Node n being accessed is:

- Root
- Child of root
- Has both parent ( p ) and grandparent ( g )

Zig-zig pattern: $g \rightarrow p \rightarrow n$ is left-left or rightright (outside nodes)
Zig-zag pattern: $\mathrm{g} \rightarrow \mathrm{p} \rightarrow \mathrm{n}$ is left-right or rightleft (inside nodes)

Access root:

## Do nothing (that was easy!)



99

Access child of root:
Zig (AVL single rotation)



101


102

Splaying Example:
Find(6)

Find(6)

(2) zig-zig


103


104


105


## ... 4 splayed out!



107

## Splay Tree Definition



- A splay tree is a binary search tree where a node is splayed after it is accessed (for a search or update)
- deepest internal node accessed is splayed - splaying costs $O(h)$, where $h$ is height of the tree - which is still $O(n)$ worst-case - $\mathrm{O}(\mathrm{h})$ rotations, each of which is $\mathrm{O}(1)$


## Splay Trees do Rotations after Every Operation (Even Search)

- new operation: splay
- splaying moves a node to the root using rotations
$\square$ right rotation
- makes the left child $x$ of a node $y$ into $y$ ' s parent; $y$ becomes the right child of $x$
a right rotation about y
 is not modified)
$\square$ left rotation
- makes the right child $y$ of a node $x$ into $x^{\prime}$ s parent; $x$ becomes the left child of $y$




111

## Splay Tree Operations



- Which nodes are splayed after each operation?

| method | splay node |  |
| :--- | :--- | :--- |
| Search for $k$ | if key found, use that node <br> if key not found, use parent of ending external node |  |
| Insert (k,v) | use the new node containing the entry inserted |  |
| Remove item <br> with key $k$ | use the predecessor of the node to be removed |  |

## Why Splaying Helps

- If a node $n$ on the access path is at depth $d$ before the splay, it's at about depth $d / 2$ after the splay
- Exceptions are the root, the child of the root, and the node splayed
- Overall, nodes which are below nodes on the access path tend to move closer to the root
- Splaying gets amortized $\mathrm{O}(\log \mathrm{n})$ performance. (Maybe not now, but soon, and for the rest of the operations.)

113

## Splay Operations: Find

- Find the node in normal BST manner
- Splay the node to the root


## Splay Operations: Insert

- Ideas?

■ Can we just do BST insert?

115

## Digression: Splitting

- Split(T, x) creates two BSTs L and R:
- all elements of $T$ are in either $L$ or $R(T=L$ $\checkmark$ R)
- all elements in $L$ are $\leq x$
- all elements in $R$ are $\geq x$
- $L$ and $R$ share no elements ( $L \cap R=\varnothing$ )


## Splitting in Splay Trees

## How can we split?

- We have the splay operation.
- We can find $x$ or the parent of where $x$ should be.
- We can splay it to the root.
- Now, what's true about the left subtree of the root?
- And the right?


## Split


$\begin{array}{lll}\leq \mathrm{X} & >\mathrm{x} & <\mathrm{X}\end{array} \geq \mathrm{x}$

## Back to Insert



```
void insert(Node root, Object x)
{
    <left, right> = split(root, x);
        root = newNode(x, left, right);
}
```


## Splay Operations: Delete



Now what?

## Join

Join $(L, R)$ : given two trees such that $L<R$, merge them


Splay on the maximum element in $L$, then attach $R$

121

## Delete Completed


$\operatorname{Join}(\mathrm{L}, \mathrm{R})$



123


124

## Splay Tree Summary

Can be shown that any $m$ consecutive operations starting from an empty tree take at most $O(m \log (n))$, where $n$ is the total number of elements in the tree.
$\rightarrow$ All splay tree operations run in amortized O(log n) time
$\mathrm{O}(\mathrm{N})$ operations can occur, but splaying makes them infrequent

Implements most-recently used (MRU) logic

- Splay tree structure is self-tuning


## Splay Tree Summary (cont.)

Splaying can be done top-down; better because:

- only one pass
- no recursion or parent pointers necessary

There are alternatives to split/insert and join/delete

Splay trees are very effective search trees

- relatively simple: no extra fields required
- excellent locality properties:
frequently accessed keys are cheap to find (near top of tree) infrequently accessed keys stay out of the way (near bottom of tree)


## Amortized Analysis of Splay Trees



- Running time of each operation is proportional to time for splaying.
- Define rank(v) as the logarithm (base 2) of the number of nodes in subtree rooted at v:
- $\operatorname{rank}(v)=\log n(v)$ if null for external nodes
- $\operatorname{rank}(v)=\log (2 n(v)+1)$ if empty nodes for externals.
- Costs: zig = \$1, zig-zig = \$2, zig-zag = \$2.
- Thus, cost for splaying a node at depth d = \$d.
- Imagine that we store rank(v) cyber-dollars at each node $v$ of the splay tree (just for the sake of analysis).
- The total counter values is $\operatorname{rank}(T)=$ sum of $\operatorname{rank}(v)$ for any node $v$ in $T$.

