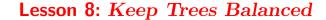
## **Algorithms and Analysis**

## Outline





AVL trees, red-black trees, TreeSet, TreeMap

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### Recap

- Binary search trees are commonly used to store data because we need to only look down one branch to find any element
- We saw how to implement many methods of the binary search tree
  - \* find
  - ★ insert
  - ★ successor (in outline)
- One method we missed was remove!

1. Deletion

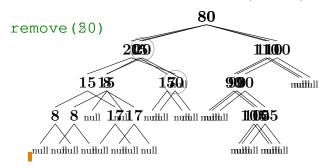
- 2. Balancing Trees
  - Rotations
- 3. AVL
- 4. Red-Black Trees
  - TreeSet
  - TreeMap



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# Deletion

- Suppose we want to delete some elements from a tree!
- It is relatively easy if the element is a leaf node (e.g. 50)
- It is not so hard if the node has one child (e.g. 20)



#### Code to remove Node n

```
if (n->left==0 && n->right==0) {
   if (n == n->parent->left)
      n->parent->left = 0;
                                           delete(50)
      n->parent->right = 0;
} else if (n->right==0) {
  if (n == n->parent->left)
      n->parent->left = n->left;
  else
      n->parent->right = n->left;
  n->left->parent = n->parent;
} else if (n->left==0)
   if (n == n->parent->left)
      n->parent->left = n->right;
                                           delete(110)
      n->parent->right = n->right;
   n->right->parent = n->parent;
delete n;
```

Algorithms and Analysis

**Outline** 

# 1. Deletion

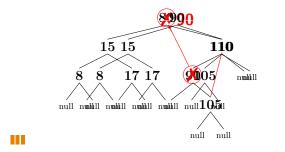
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- 2. Balancing Trees
  - Rotations
- 3. AVL
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## Removing Element with Two Children

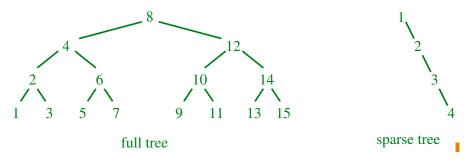
- If an element has two children then I
  - ⋆ replace that element by its successor
  - \* and then remove the successor using the above procedure remove (80)



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# Why Balance Trees

- The number of comparisons to access an element depends on the depth of the nodel
- The average depth of the node depends on the shape of the tree!



• The shape of the tree depends on the order the elements are added

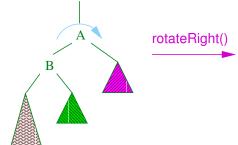
## **Time Complexity**

- In the best situation (a full tree) the number of elements in a tree is  $n=\Theta(2^l)$  the depth is l so that the maximum depth is  $\log_2(n)$
- ullet It turns out for random sequences the average depth is  $\Theta(\log(n))$
- In the worst case (when the tree is effectively a linked list), the average depth is  $\Theta(n)$
- Unfortunately, the worst case happens when the elements are added *in order* (not a rare event)

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## **Types of Rotations**

- We can get by with 4 types of rotations
  - ★ Left rotation (as above)
  - ⋆ Right rotation (symmetric to above)

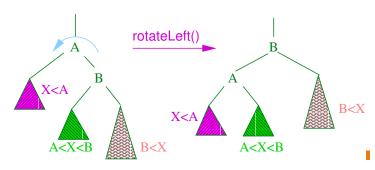




★ Right-left double rotation

#### **Rotations**

- To avoid unbalanced trees we would like to modify the shape!
- This is possible as the shape of the tree is not uniquely defined (e.g. we could make any node the root)
- We can change the shape of a tree using rotations
- E.g. left rotation



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# **Coding Rotations**

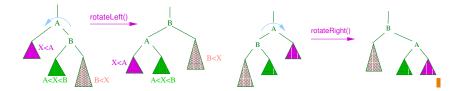
```
void rotateLeft(Node* e)
{
  Node* r = e->right;
  e->right = r->left;
  if (r->left != 0)
    r->left->parent = e;
  r->parent = e->parent;
  if (e->parent == 0)
    root = r;
  else if (e->parent->left = r;
  else
    e->parent->right = r;
  r->left = e;
  e->parent = r;
}
```

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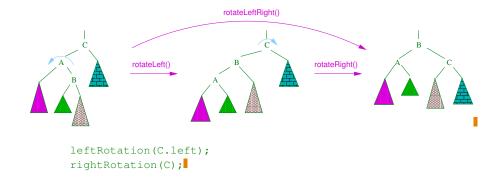
## When Single Rotations Work

### **Double Rotations**

• Single rotations balance the tree when the unbalanced subtree is on the outside



• If the unbalanced subtree is on the inside we need a double rotation



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### **Outline**

# **Balancing Trees**

- 1. Deletion
- 2. Balancing Trees
  - Rotations
- 3. AVL
- 4. Red-Black Trees
  - TreeSet
  - TreeMap



- There are different strategies for using rotations for balancing trees
- The three most popular are
  - ⋆ AVL-trees
  - ★ Red-black trees
  - ⋆ Splay trees
- They differ in the criteria they use for doing rotations

### **AVL Trees**

### Minimum Number of Nodes

• AVL-trees were invented in 1962 by two Russian mathematicians Adelson-Velski and Landis

In AVL trees

1. The heights of the left and right subtree differ by at most 1

2. The left and right subtrees are AVL trees

• This guarantees that the worst case AVL tree has logarithmic depth

• Let m(h) be the minimum number of nodes in a tree of height h

• This has to be made up of two subtrees: one of height h-1; and, in the worst case, one of height h-2

• Thus, the least number of nodes in a tree of height h is

$$m(h) = m(h-1) + m(h-2) + 1 \qquad \downarrow \qquad h-1 \qquad \bigwedge^{A} \qquad \downarrow \qquad h-2$$

• with m(1) = 1, m(2) = 2

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### **Proof of Exponential Number of Nodes**

• We have m(h) = m(h-1) + m(h-2) + 1 with m(1) = 1, m(2) = 2

• This gives us a sequence  $1, 2, 4, 7, 12, \cdots$ 

• Compare this with Fibonacci f(h) = f(h-1) + f(h-2), with f(1) = f(2) = 1

• This gives us a sequence  $1, 1, 2, 3, 5, 8, 13, \cdots$ 

• It looks like m(h) = f(h+2) - 1

Proof by substitution

### **Proof of Logarithmic Depth**

• m(h) = m(h-1) + m(h-2) + 1 with m(1) = 1, m(2) = 2

• We can prove by inductions,  $m(h) > (3/2)^{h-1}$ 

• Taking logs:  $\log(m(h)) \ge (h-1)\log(3/2)$  or

$$h \le \frac{\log(m(h))}{\log(3/2)} + 1 = O\left(\log(m(h))\right)$$

 $\bullet$  The number of elements, n, we can store in an AVL tree is n > m(h) thus

$$h \leq O(\log(n))$$

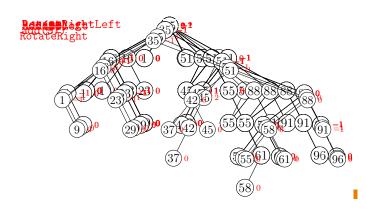
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### **Implementing AVL Trees**

• In practice to implement an AVL tree we include additional information at each node indicating the balance of the subtrees

$$\label{eq:balanceFactor} \text{balanceFactor} = \left\{ \begin{array}{ll} -1 & \text{ right subtree deeper than left subtree} \\ 0 & \text{ left and right subtrees equal} \\ +1 & \text{ left subtree deeper than right subtree} \end{array} \right.$$



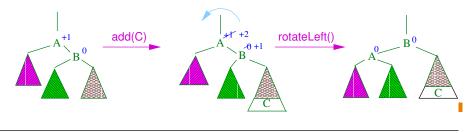
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#### **AVL** Deletions

- AVL deletions are similar to AVL insertions
- One difference is that after performing a rotation the tree may still not satisfy the AVL criteria so higher levels need to be examined.
- In the worst case  $\Theta(\log(n))$  rotations may be necessary
- This may be relatively slow
   —but in many applications deletions
   are rare

### **Balancing AVL Trees**

- When adding an element to an AVL tree!
  - \* Find the location where it is to be inserted
  - ★ Iterate up through the parents re-adjusting the balanceFactor
  - $\star$  If the balance factor exceeds  $\pm 1$  then re-balance the tree and stop!
  - ★ else if the balance factor goes to zero then stop



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#### **AVL** Tree Performance

- Insertion, deletion and search in AVL trees are, at worst,  $\Theta(\log(n)) \mathbb{I}$
- ullet The height of an average AVL tree is  $1.44\log_2(n)$
- The height of an average binary search tree is  $2.1 \log_2(n)$
- Despite being more compact insertion is slightly slower in AVL trees than binary search trees without balancing (for random input sequences)
- Search is, of course, quicker

#### **Outline**

2. Balancing Trees

1. Deletion

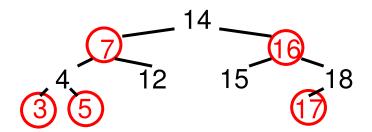
- Rotations
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# Restructuring

- When inserting a new element we first find its position
- If it is the root we colour it black otherwise we colour it red
- If its parent is red we must either relabel or restructure the tree!

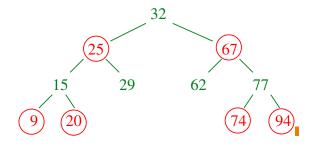


#### **Red-Black Trees**

- Red-black trees are another strategy for balancing trees
- Nodes are either red or black
- Two rules are imposed

Red Rule: the children of a red node must be black

Black Rule: the number of black elements must be the same in all paths from the root to elements with no children or with one child



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### **Performance of Red-Black Trees**

- Red-black trees are slightly more complicated to code than AVL trees
- Red-black trees tend to be slightly less compact than AVL trees
- However, insertion and deletion run slightly quicker
- Both Java Collection classes and C++ STL use red-black trees

### Set

- The standard template library (STL) has a class std::set<T>
- It also has a std::underordered\_set<T> class (which uses a hash table covered later)
- As well as std::multiset<T> that implements a multiset (i.e. a set, but with repetitions)
- Using sets you can also implement maps!

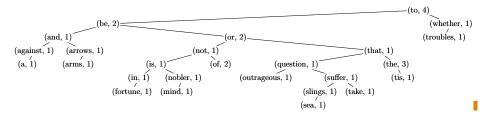
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### Implementing a Map

 Maps can be implemented using a set by making each node hold a pair<K, V> objects

```
class pair<K,V>
{
   public:
   K first;
   V second;
}
```

• We can count words using the key for words and value to count



## Maps

- One major abstract data type (ADT) we have not encountered is the map class
- The map class std:map<Key, V> contain key-value pairs pair<Key, V>
  - ★ The first element of type Key is the key
  - ★ The second element of type V is the value
- Maps work as content addressable arrays

```
map<string, int> students;
student["John_Smith"] = 89;
student["Terry_Jones"] = 98;
cout << students["John_Smith"];</pre>
```

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#### Lessons

Algorithms and Analysis

- ullet Binary search trees are very efficient (order  $\log(n)$  insertion, deletion and search) provided they are balanced
- Balanced trees are achieved by performing rotations
- There are different strategies for deciding when to rotate including
  - ⋆ AVL trees
  - ⋆ Red-black trees
- Binary trees are used for implementing sets and maps

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