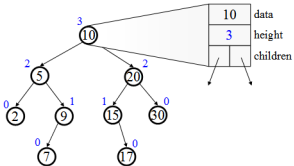


An AVL Tree



CSE 326 Data Structures

CSE 326 : Dave Bacon

Priority Queues : Binomial Queues,
Binary Search Trees, AVL Trees

Logistics

- Updated Due Dates
 - Project 2, Phase A, due Friday, January 26
 - Homework 3, due Monday, January 29 in class
- Project 2A
 - Generic Arrays in Java

Amortized Analysis

- Grow an Array when full...
 - Option 1: increase array by constant c
 - Option 2: increase array by doubling size
- Analyze n push operations...Amortized time?

Option 1: $k=n/c$ replaces

$$O(n+c+2c+3c+\dots+kc)=O(n+ck(k-1)/2)=O(n^2)$$

Option 2: $k=\log n$ replaces

$$O(n+c+2c+4c+\dots+2^k c)=O(n+c(2^{k+1}-1))=O(n)$$

Merging Two Binomial Queues

Essentially like adding two binary numbers!

1. Combine the two forests
2. For k from 0 to maxheight {
 - a. $m \leftarrow$ total number of B_k 's in the two BQs
 - b. if $m=0$: continue;
 - c. if $m=1$: continue;
 - d. if $m=2$: combine the two B_k 's to form a B_{k+1}
 - e. if $m=3$: retain one B_k and combine the other two to form a B_{k+1}}

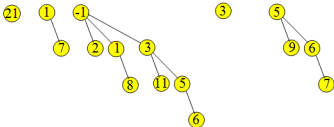
of 1's
$0+0 = 0$
$1+0 = 1$
$1+1 = 0+c$
$1+1+c = 1+c$

Claim: When this process ends, the forest has at most one tree of any height

Example: Binomial Queue Merge

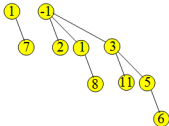
H1:

H2:

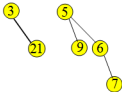


Example: Binomial Queue Merge

H1:

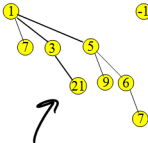


H2:

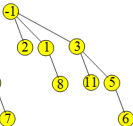


Example: Binomial Queue Merge

H1:



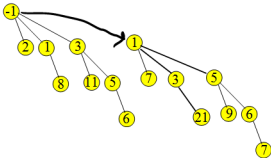
H2:



Example: Binomial Queue Merge

H1:

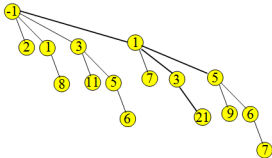
H2:



Example: Binomial Queue Merge

H1:

H2:



Complexity of Merge

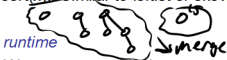
Constant time for each height

Max height is: $\log n$

\Rightarrow worst case running time = $\Theta(\log n)$

Insert in a Binomial Queue

Insert(x): Similar to leftist or skew heap



Worst case complexity: same as merge
 $O(\log n)$

Average case complexity: $O(1)$

Why?? Hint: Think of adding 1 to 1101

$$\begin{array}{r} 101101 \\ + \quad \quad 1 \\ \hline 1011100 \end{array}$$

111111
must not

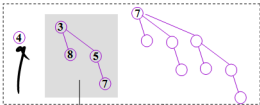
deleteMin in Binomial Queue

Similar to leftist and skew heaps....



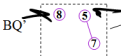
deleteMin: Example

BQ



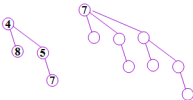
find and delete
smallest root

merge BQ
(without
the shaded part)
and BQ'



deleteMin: Example

Result:

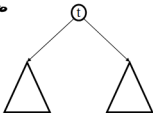


runtime: $O(\log n)$

Bye Bye
Chapter 6.

Tree Calculations

Recall: height is max number of edges from root to a leaf



Find the height of the tree...

$$\text{height}(t) = 1 + \max\left\{ \begin{array}{l} \text{left} \\ \text{right} \end{array} \text{height}(t.\text{left}), \text{height}(t.\text{right}) \right\}$$

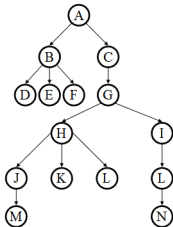
runtime:

n nodes $O(n)$



Tree Calculations Example

How high is this tree?



More Recursive Tree Calculations: Tree Traversals

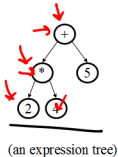
A *traversal* is an order for visiting all the nodes of a tree

Three types:

• Pre-order: Root, left subtree, right subtree

• In-order: Left subtree, root, right subtree

• Post-order: Left subtree, right subtree, root



2 * 4 + 5

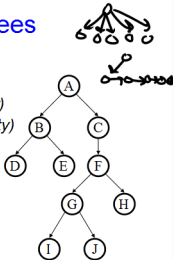
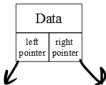
Traversals

```
void traverse(BNode t) {  
    if (t != NULL) {  
        traverse (t.left);  
        print t.element;  
        traverse (t.right);  
    }  
}
```

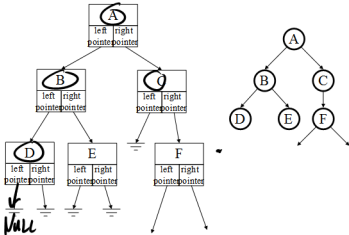


Binary Trees

- Binary tree is
 - a root
 - left subtree (*maybe empty*)
 - right subtree (*maybe empty*)
- Representation:



Binary Tree: Representation



ADTs Seen So Far

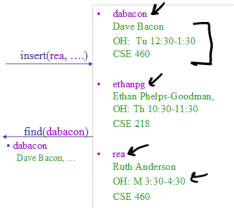
- Stack
 - Push
 - Pop
- Queue
 - Enqueue
 - Dequeue
- Priority Queue
 - Insert
 - DeleteMin

Remember decreaseKey?

The Dictionary ADT

- Data:
 - a set of (key, value) pairs

- Operations:
 - Insert (key, value)
 - Find (key)
 - Remove (key)



The Dictionary ADT is sometimes called the "Map ADT"

A Modest Few Uses

- Sets
- Dictionaries
- Networks : Router tables
- Operating systems : Page tables
- Compilers : Symbol tables

Probably the most widely used ADT!

Implementations

	insert	find	delete
<ul style="list-style-type: none"> Unsorted Linked-list <p> $O(1)$ $O(n)$ $O(n)$ </p> <p> $0 \rightarrow 0 \rightarrow 0 \rightarrow 0$ \uparrow </p>			<p>find + delete</p> <p>$O(n)$</p>
<ul style="list-style-type: none"> Unsorted array 	<p>$O(1)$</p>	<p><u>$O(n)$</u></p>	<p><u>$O(n)$</u></p>
<ul style="list-style-type: none"> <u>Sorted array</u> 	<p> $\swarrow \searrow$ $\log n + n$ $O(n)$ </p>	<p> \downarrow $O(\log n)$ </p>	<p> $\swarrow \searrow$ $\log n + n$ $O(n)$ </p>
	<p>moving nicely</p>		

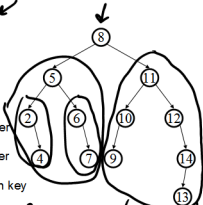
Binary Search Tree Data Structure

Structural property

- each node has ≤ 2 children
- result:
 - storage is small
 - operations are simple
 - average depth is small

Order property

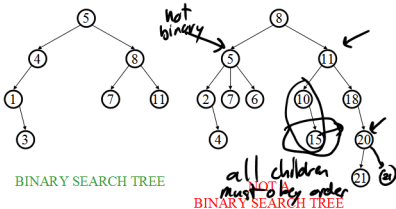
- all keys in left subtree smaller than root's key
- all keys in right subtree larger than root's key
- result: easy to find any given key



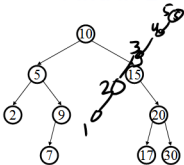
Comparison (equality)

- What must I know about what I store?

Example and Counter-Example



Find in BST, Recursive

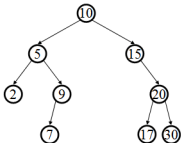


Runtime: $O(n)$

```
Node Find(Object key,  
           Node root) {  
    if (root == NULL)  
        return NULL;  
  
    if (key < root.key)  
        return Find(key,  
                    root.left);  
    else if (key > root.key)  
        return Find(key,  
                    root.right);  
    else  
        return root;  
}
```

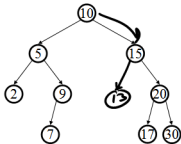
Find in BST, Iterative

```
Node Find(Object key,  
          Node root) {  
  
    while (root != NULL &&  
           root.key !=  
key) {  
        if (key < root.key)  
            root = root.left;  
        else  
            root = root.right;  
    }  
  
    return root;  
}
```



Runtime: Same as before O(h)

Insert in BST



Insert(13)

Insert(8)

Insert(31)

Find 13

Insertions happen only
at the leaves – easy!

Runtime:

$O(n)$ worst case

BuildTree for BST

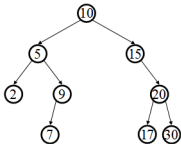
- Suppose keys 1, 2, 3, 4, 5, 6, 7, 8, 9 are inserted into an initially empty BST.

Runtime depends on the order!

- in given order
- in reverse order
- median first, then left median, right median, etc.

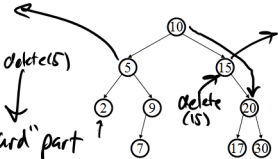
Bonus: FindMin/FindMax

- Find minimum



- Find maximum

Deletion in BST



delete(5)

delete(15)

"Hard" part
two children

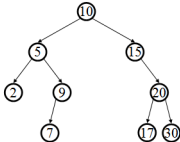
Why might deletion be harder than insertion?

left, then right

Lazy Deletion

Instead of physically deleting nodes, just mark them as deleted

- + simpler
- + physical deletions done in batches
- + some adds just flip deleted flag
- extra memory for deleted flag
- many lazy deletions slow finds
- some operations may have to be modified (e.g., min and max)

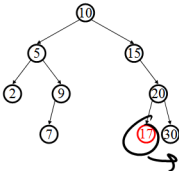


Non-lazy Deletion

- Removing an item disrupts the tree structure.
- Basic idea: **find** the node that is to be removed. Then “fix” the tree so that it is still a binary search tree.
- Three cases:
 - node has no children (leaf node)
 - node has one child
 - node has two children

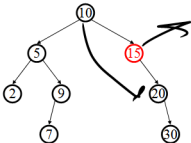
Non-lazy Deletion – The Leaf Case

Delete(17)



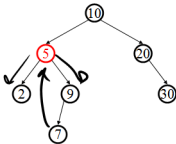
Deletion – The One Child Case

Delete(15)



Deletion – The Two Child Case

Delete(5)



What can we replace 5 with?

Deletion – The Two Child Case

Idea: Replace the deleted node with a value guaranteed to be between the two child subtrees!



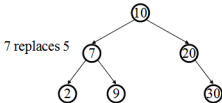
Options:

- *succ* from right subtree: $\text{findMin}(t.\text{right})$
- *pred* from left subtree : $\text{findMax}(t.\text{left})$

Now delete the original node containing *succ* or *pred*

- Leaf or one child case – easy!

Finally...



Original node containing
7 gets deleted

Balanced BST

Observation

- BST: the shallower the better!
- For a BST with n nodes
 - Average height is $O(\log n)$
 - Worst case height is $O(n)$
- Simple cases such as $\text{insert}(1, 2, 3, \dots, n)$ lead to the worst case scenario

$O(n)$
 $O(\log n)$
goal.

A handwritten diagram on the right side of the slide. It features the text 'O(n)' at the top, 'O(log n)' in the middle, and 'goal.' at the bottom. A long arrow points downwards from 'O(n)' to 'goal.'. A shorter arrow points upwards from 'goal.' to 'O(log n)'.

Solution: Require a **Balance Condition** that

1. ensures depth is $O(\log n)$ – strong enough!
2. is easy to maintain – not too strong!

Potential Balance Conditions

3. Left and right subtrees of *every node* have equal number of nodes

4. Left and right subtrees of *every node* have equal *height*

The AVL Balance Condition

Left and right subtrees of *every node*
have equal *heights* **differing by at most 1**

Define: **balance**(x) = height(x .left) – height(x .right)

AVL property: **$-1 \leq \text{balance}(x) \leq 1$, for every node x**

- Ensures small depth
 - Will prove this by showing that an AVL tree of height h must have a lot of (i.e. $O(2^h)$) nodes
- Easy to maintain
 - Using single and double rotations

The AVL Tree Data Structure

Structural properties

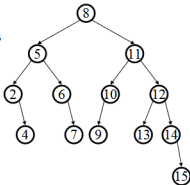
1. Binary tree property
2. Balance property:
balance of every node is
between -1 and 1

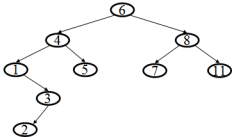
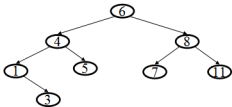
Result:

Worst case depth is
 $O(\log n)$

Ordering property

- Same as for BST





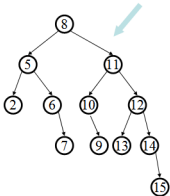
Proving Shallowness Bound

Let $S(h)$ be the min # of nodes in an AVL tree of height h

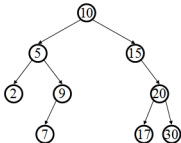
Claim: $S(h) = S(h-1) + S(h-2) + 1$

Solution of recurrence: $S(h) = O(2^h)$
(like Fibonacci numbers)

AVL tree of height $h=4$
with the min # of nodes



Testing the Balance Property



We need to be able to:

- 1.
- 2.
- 3.

NULLs have
height **-1**