

# **Data Structures and Algorithms**

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# Announcements

- \* Homework 2 is up. Due Feb. 23
- \* Problem 2 (Weiss 3.7), `trimToSize()` creates a new array of same size as list, copies each element.

# Review

- \* Introduction to Trees
  - \* Definitions
  - \* Tree Traversal Algorithms
- \* Binary Trees

# Today's Plan

- \* Finish up examples of binary tree applications
- \* Binary Search Trees
  - \* Basic operations: insert, findMin/Max, contains
  - \* Delete
  - \* Average depth analysis

# Full Binary Tree Depth

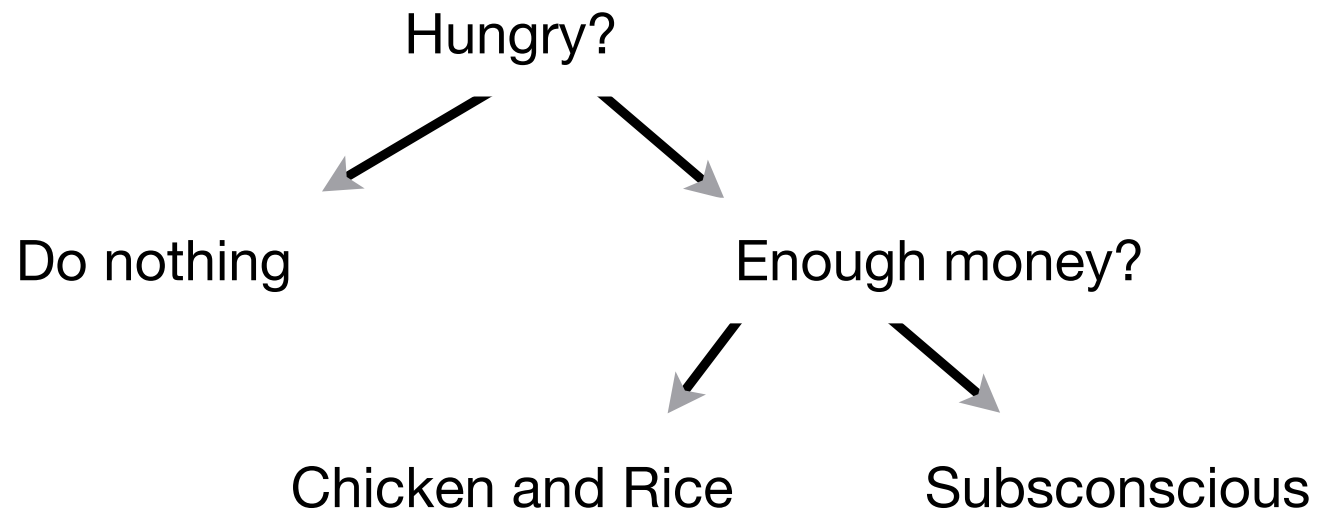
- \* The number of nodes at depth **d** is  $2^d$
- \* Total in a tree of depth **d** is  $\sum_{i=0}^d 2^i = 2^{d+1} - 1$ 
  - \* (series identity)
- \* A perfect binary tree has  $N = 2^{d+1} - 1$  nodes
- \* Solving for **d** finds  $d = \log(N + 1) - 1$

# Expression Trees

- \* Expression Trees are yet another way to store mathematical expressions
  - \*  $((x + y) * z) / 300$
- \* Note that the main mathematical operators have 2 operands each
- \* Inorder traversal reads back infix notation
- \* Postorder traversal reads postfix notation

# Decision Trees

- \* It is often useful to design decision trees
- \* Left/right child represents yes/no answers to questions



# Search (Tree) ADT

- \* ADT that allows insertion, removal, and searching by **key**
  - \* A **key** is a value that can be compared
  - \* In Java, we use the **Comparable** interface
  - \* Comparison must obey transitive property
- \* Notice that the Search ADT doesn't use any index



# Binary Search Tree

- ✦ Binary Search Tree Property:
  - Keys in left subtree are less than root.
  - Keys in right subtree are greater than root.
- ✦ BST property holds for all subtrees of a BST

# Inserting into a BST

- \* **insert(x)** is public method
- \* privately, use **insert(x, root)**
- \* **insert(x, Node t)**
  - if (**t == null**) return new Node(x)
  - if (**x > t.key**), then **t.right = insert(x, t.right)**
  - if (**x < t.key**), then **t.left = insert(x, t.left)**
  - return **t**

# Searching a BST

- \* **findMin(t)**

  - if (**t.left == null**) return **t.key**
  - else return **findMin(t.left)**

- \* **contains(x,t)**

  - if (**t == null**) return **false**
  - if (**x == t.key**) return **true**
  - if (**x > t.key**), then return **contains(x, t.right)**
  - if (**x < t.key**), then return **contains(x, t.left)**

# Deleting from a BST

- \* Removing a leaf is easy, removing a node with one child is also easy
- \* Nodes with no grandchildren are easy
- \* Nodes with both children and grandchildren need more thought
  - \* Why can't we replace the removed node with either of its children?

# A Removal Strategy

- \* First, find node to be removed, **t**
- \* Replace with the smallest node from the right subtree
  - \* **a = findMin(t.right);**  
**t.key = a.key;**
- \* Then delete original smallest node in right subtree  
**remove(a.key, t.right)**

# Average Case Analysis

- \* All operations run in  $O(d)$  time, but what is  $d$ ?
  - \* Worst case  $d = N$
  - \* Best case  $d = \log(N+1)-1$
  - \* Average case?

# Average Case Analysis

- \* Consider the **internal path length**: the sum of the depths of all nodes in a tree
- \* Let  **$D(N)$**  be the internal path length for some tree  **$T$**  with  **$N$**  nodes\*.
- \* Suppose  **$i$**  nodes are in the left subtree of  **$T$** .
- \* Then  $D(N) = D(i) + D(N - i - 1) + N - 1$

# Average Case Analysis

- \*  $D(N) = D(i) + D(N - i - 1) + N - 1$
- \* Assume all insertion sequences are equally likely
- \* Subtree sizes only depend on the 1<sup>st</sup> key inserted
  - \* all subtree sizes equally likely
- \* Average of **D(i)** (and **D(N-i-1)**) is  $\frac{1}{N} \sum_{j=0}^{N-1} D(j)$



# Average Case Analysis

- \* Average case **D(N)** then becomes

$$D(N) = \frac{2}{N} \left[ \sum_{j=0}^{N-1} D(j) \right] + N - 1$$

- \* This is a **recurrence**, which can be solved to show that  $D(N) = O(N \log N)$ 
  - \* (page 272-273 in Weiss)
- \* Then the average depth over all **N** nodes is  $O(\log N)$

# Looking Forward

- \* How do we implement Search Trees that explicitly avoid worst case  $O(N)$  operations?
- \* What is the cost of avoiding worst case?

# Reading

- \* Weiss Section 4.4: AVL Trees