

CSE373: Data Structures and Algorithms

## Binary Search Trees

Steve Tanimoto  
Winter 2016

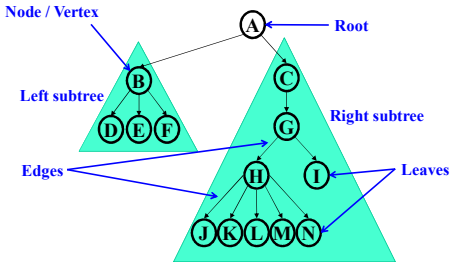
This lecture material represents the work of multiple instructors at the University of Washington. Thank you to all who have contributed!

### Recall ....

- Dictionary ADT
  - stores (key, value) pairs
  - **find, insert, delete**
- Trees
  - Terminology
  - Binary Trees

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### Reminder: Tree terminology


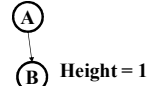
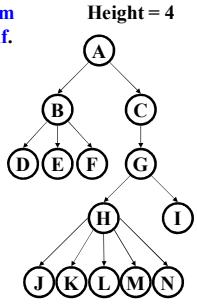


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### Example Tree Calculations

Recall: **Height** of a tree is the **maximum** number of edges from the **root** to a **leaf**.

What is the **height** of this tree?


 Height = 0
 
 Height = 1
 
 Height = 4

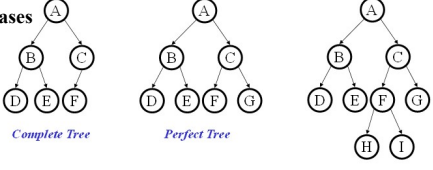
What is the **depth** of node G?  
Depth = 2

What is the **depth** of node L?  
Depth = 4

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### Binary Trees

- **Binary tree:** Each node has at most 2 children (branching factor 2)
- **Binary tree is**
  - A root (*with data*)
  - A left subtree (*may be empty*)
  - A right subtree (*may be empty*)
- **Special Cases**



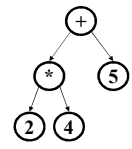
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### Tree Traversals

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

- **Pre-order:** root, left subtree, right subtree  
+ \* 2 4 5
- **In-order:** left subtree, root, right subtree  
2 \* 4 + 5
- **Post-order:** left subtree, right subtree, root  
2 4 \* 5 +

(an expression tree)



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### More on traversals

```
void inOrderTraversal(Node t){
  if(t != null) {
    inOrderTraversal(t.left);
    process(t.element);
    inOrderTraversal(t.right);
  }
}
```

● A = current node    ● A = processing (on the call stack)  
● A = completed node    ✓ = element has been processed

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### More on traversals

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**D B E A**

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**D B E A**

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### More on traversals

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**D B E A F C**

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### More on traversals

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**D B E A F C G**

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### More on traversals

```
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}
```

**Sometimes order doesn't matter**  
 • Example: sum all elements  
**Sometimes order matters**  
 • Example: evaluate an expression tree

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### Binary Search Tree (BST) Data Structure

- Structure property (binary tree)
  - Each node has  $\leq 2$  children
  - Result: keeps operations simple
- Order property
  - All keys in left subtree smaller than node's key
  - All keys in right subtree larger than node's key
  - Result: easy to find any given key

**A binary search tree is a type of binary tree (but not all binary trees are binary search trees!)**

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### Are these BSTs?

**Activity!**

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### Find in BST, Recursive

```

Data find(Key key, Node root) {
    if (root == null)
        return null;
    if (key < root.key)
        return find(key, root.left);
    if (key > root.key)
        return find(key, root.right);
    return root.data;
}
    
```

What is the running time?  
**Worst case** running time is  $O(n)$ .  
 - Happens if the tree is very lopsided (e.g. list)

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### Find in BST, Iterative

```

Data find(Key key, Node root) {
    while (root != null
           && root.key != key) {
        if (key < root.key)
            root = root.left;
        else (key > root.key)
            root = root.right;
    }
    if (root == null)
        return null;
    return root.data;
}
    
```

**Worst case** running time is  $O(n)$ .  
 - Happens if the tree is very lopsided (e.g. list)

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### Bonus: Other BST "Finding" Operations

- **FindMin:** Find *minimum* node  
 - Left-most node
- **FindMax:** Find *maximum* node  
 - Right-most node

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### Insert in BST

```

insert(13)
insert(8)
insert(31)
    
```

**(New) insertions happen only at leaves - easy!**

Again... **worst case** running time is  $O(n)$ , which may happen if the tree is not balanced.

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### Deletion in BST

**Why might deletion be harder than insertion?**  
 Removing an item may disrupt the tree structure!

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### Deletion in BST

- Basic idea: **find** the node to be removed, then "fix" the tree so that it is still a binary search tree
- Three potential cases to fix:
  - Node has no children (**leaf**)
  - Node has **one child**
  - Node has **two children**

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### Deletion – The Leaf Case

delete (17)

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### Deletion – The One Child Case

delete (15)

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### Deletion – The One Child Case

delete (15)

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### Deletion – The Two Child Case

delete (5)

What can we replace 5 with?

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### Deletion – The Two Child Case

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

Options:

- successor** minimum node from right subtree  
`findMin(node.right)`
- predecessor** maximum node from left subtree  
`findMax(node.left)`

Now delete the original node containing *successor* or *predecessor*

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*Deletion: The Two Child Case (example)*

delete (23)

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*Deletion: The Two Child Case (example)*

delete (23)

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*Deletion: The Two Child Case (example)*

delete (23)

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*Deletion: The Two Child Case (example)*

delete (23)

Success! ☺

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**Lazy Deletion**

- Lazy deletion can work well for a BST
  - Simpler
  - Can do "real deletions" later as a batch
  - Some inserts can just "undelete" a tree node
- But
  - Can waste space and slow down find operations
  - Make some operations more complicated:
    - e.g., findMin and findMax?

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**BuildTree for BST**

- Let's consider `buildTree`
  - Insert all, starting from an empty tree
- Insert keys 1, 2, 3, 4, 5, 6, 7, 8, 9 into an empty BST
  - If inserted in given order, what is the tree?
  - What big-O runtime for this kind of sorted input?  $\Theta(n^2)$  *Not a happy place*
  - Is inserting in the reverse order any better?

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### BuildTree for BST

- Insert keys 1, 2, 3, 4, 5, 6, 7, 8, 9 into an empty BST
- What we if could somehow re-arrange them
  - median first, then left median, right median, etc.
  - 5, 3, 7, 2, 1, 4, 8, 6, 9
  - What tree does that give us?
  - What big-O runtime?

*$O(n \log n)$ , definitely better*

