



CSE373: Data Structures and Algorithms

Dictionaries and 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!

Today's Outline

Today's Topics

- Finish Asymptotic Analysis
- Dictionary ADT (a.k.a. Map): associate keys with values
 - Extremely common
- Binary Trees

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Summary of Asymptotic Analysis

Analysis can be about:

- The problem or the algorithm (usually algorithm)
- Time or space (usually time)
 - Or power or dollars or ...
- Best-, worst-, or average-case (usually worst)
- Upper-, lower-, or tight-bound (usually upper)
- The most common thing we will do is give an O upper bound to the **worst-case running time** of an algorithm.

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Big-Oh Caveats

- Asymptotic complexity focuses on behavior for large n and is independent of any computer / coding trick
- But you can "abuse" it to be misled about trade-offs
- Example: $n^{1/10}$ vs. $\log n$
 - Asymptotically $n^{1/10}$ grows more quickly
 - But the "cross-over" point is around $5 * 10^{17}$
 - So if you have input size less than 2^{28} , prefer $n^{1/10}$
- For *small* n , an algorithm with worse asymptotic complexity might be faster
 - If you care about performance for small n then the constant factors can matter

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Addendum: Timing vs. Big-Oh Summary

- Big-oh is an essential part of computer science's mathematical foundation
 - Examine the algorithm itself, not the implementation
 - Reason about (even prove) performance as a function of n
- Timing also has its place
 - Compare implementations
 - Focus on data sets you care about (versus worst case)
 - Determine what the constant factors "really are"

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Let's take a breath

- So far we've covered
 - Some simple ADTs: stacks, queues, lists
 - Some math (proof by induction)
 - How to analyze algorithms
 - Asymptotic notation (Big-Oh)
- Coming up....
 - Many more ADTs
 - Starting with dictionaries

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The Dictionary (a.k.a. Map) ADT

- Data:
 - set of (key, value) pairs
 - keys must be comparable
- Operations:
 - `insert(key, value)`
 - `find(key)`
 - `delete(key)`
 - ...

- david
David Swanson
OH: Wed 3.30-4.20
...
- nicholas
Nicholas Shahan
OH: Wed 11.30-12.20
...
- megan
Megan Hopp
OH: Mon 10-10.50
...

*Will tend to emphasize the keys;
don't forget about the stored values*

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A Modest Few Uses

Any time you want to store information according to some key and be able to retrieve it efficiently

- Lots of programs do that!

- Search: inverted indexes, phone directories, ...
- Networks: router tables
- Operating systems: page tables
- Compilers: symbol tables
- Databases: dictionaries with other nice properties
- Biology: genome maps
- ...

Possibly the most widely used ADT

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Simple implementations

For dictionary with n key/value pairs

	insert	find	delete
• Unsorted linked-list	$O(1)^*$	$O(n)$	$O(n)$
• Unsorted array	$O(1)^*$	$O(n)$	$O(n)$
• Sorted linked list	$O(n)$	$O(n)$	$O(n)$
• Sorted array	$O(n)$	$O(\log n)$	$O(n)$

* Unless we need to check for duplicates

We'll see a Binary Search Tree (BST) probably does better
but not in the worst case (unless we keep it balanced)

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Lazy Deletion

10	12	24	30	41	42	44	45	50
✓	✗	✓	✓	✓	✓	✗	✓	✓

A general technique for making `delete` as fast as `find`:

- Instead of actually removing the item just mark it deleted

Plusses:

- Simpler
- Can do removals later in batches
- If re-added soon thereafter, just unmark the deletion

Minuses:

- Extra space for the "is-it-deleted" flag
- Data structure full of deleted nodes wastes space
- May complicate other operations

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Better dictionary data structures

There are many good data structures for (large) dictionaries

1. Binary trees
2. AVL trees
 - Binary search trees with *guaranteed balancing*
3. Hashtables
 - Not tree-like at all

Skipping: Other trees (e.g., B-trees, red-black, splay)

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Tree terms (review?)

- Root (tree)
- Leaves (tree)
- Children (node)
- Parent (node)
- Siblings (node)
- Ancestors (node)
- Descendants (node)
- Subtree (node)

- Depth (node)
- Height (tree)
- Degree (node)
- Branching factor (tree)

```

graph TD
    A((A)) --- B((B))
    A --- C((C))
    B --- D((D))
    B --- E((E))
    B --- F((F))
    C --- G((G))
    C --- I((I))
    G --- H((H))
    G --- J((J))
    H --- K((K))
    H --- L((L))
    H --- M((M))
    H --- N((N))
            
```

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More tree terms

- There are many kinds of trees
 - Every binary tree is a tree
 - Every list is kind of a tree (think of "next" as the one child)
- There are many kinds of binary trees
 - Every binary search tree is a binary tree
 - Later: A binary heap is a different kind of binary tree
- A tree can be balanced or not
 - A balanced tree with n nodes has a height of $O(\log n)$
 - Different tree data structures have different "balance conditions" to achieve this

Kinds of trees

Certain terms define trees with specific structure

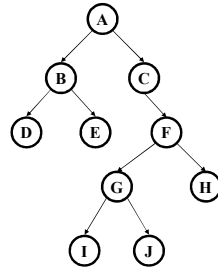
- **Binary tree:** Each node has at most 2 children (branching factor 2)
- **n -ary tree:** Each node has at most n children (branching factor n)
- **Perfect tree:** Each row completely full
- **Complete tree:** Each row completely full except maybe the bottom row, which is filled from left to right



What is the height of a **perfect binary tree** with n nodes?
A **complete binary tree**?

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*)

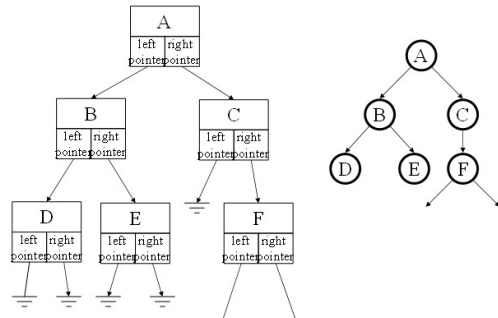


Representation:

Data	
left pointer	right pointer

- For a dictionary, data will include a key and a value

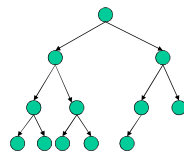
Binary Tree Representation



Binary Trees: Some Numbers

Recall: height of a tree = longest path from root to leaf (count edges)

- For binary tree of height h :
- max # of leaves: 2^h
 - max # of nodes: $2^{(h+1)} - 1$
 - min # of leaves: 1
 - min # of nodes: $h + 1$



For n nodes, we cannot do better than $O(\log n)$ height and we want to avoid $O(n)$ height

Calculating height

What is the height of a tree with root `root`?

```
int treeHeight(Node root) {
    ???
}
```

Calculating height

What is the height of a tree with root `root`?

```
int treeHeight(Node root) {
    if (root == null)
        return -1;
    return 1 + max(treeHeight(root.left),
                  treeHeight(root.right));
}
```

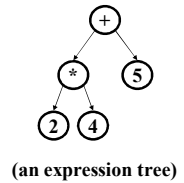
Running time for tree with n nodes: $O(n)$ – single pass over tree

Note: non-recursive is painful – need your own stack of pending nodes; much easier to use recursion's call stack

Tree Traversals

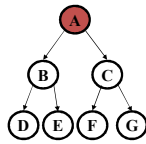
A *traversal* is an order for visiting all the nodes of a tree

- *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
 $2 4 * 5 +$



More on traversals

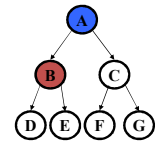
```
void inOrderTraversal(Node t) {
    if (t != null) {
        inOrderTraversal(t.left);
        process(t.element);
        inOrderTraversal(t.right);
    }
}
```



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

More on traversals

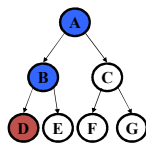
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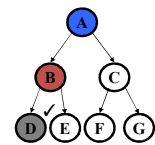
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