

# 31251 – Data Structures and Algorithms

Week 6

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- Binary Trees
- Tree Traversals
- Expression Trees
- Binary Search Trees
- Just for “fun”: AVL Trees

# Binary Trees

- A *Tree* is a graph with no cycles.
  - You can't walk through the graph and get back to your starting point without backtracking.
- A *Binary Tree* is a tree where every vertex has at most three neighbours.

- If it has at most 3 neighbours, why is it “binary”?
- We normally think of them as having an order:
  - One vertex is the root.
  - Each vertex has at most two children, and at most one parent.
  - Vertices with no children are called *leaves*.

- Binary Trees find uses in many areas of computer science:
  - 3D rendering (binary space partition).
  - Networking (Binary Tries, Treaps).
  - Cryptology (GGM Trees).
  - Coding and Compression (Huffman Trees).
  - Hashing (Hash Trees).
  - Sorting (Heaps and Heapsort).
  - Searching (Binary Search Trees).
  - Parsing (Expression Trees)

## How do we build them?

- There are two basic methods for building a binary tree:
  - ① Kind of like a LinkedList with with two next pointers (left and right children).
  - ② Embedded in an array, where the children of the vertex at index  $i$  are at indices  $2i$  and  $2i + 1$ .

## How do we get around them?

- No matter which representation you choose, we can use versions of the same two traversals we saw with normal graphs:
  - ① Breadth first - start with the root, then visit its children, then their children, then their children...
  - ② Depth first - start at the root, go all the way to the bottom first, then backtrack.



- Very amenable to recursive implementation.
- At each node we have 3 things to do:
  - ① Deal with the current node,
  - ② visit the left child,
  - ③ visit the right child.
- Gives 3 different traversals.
  - ① Pre-order (deal with the current node first)
  - ② In-order (deal with the current node between visiting the descendents)
  - ③ Post-order (deal with the current node last).

## Depth First Traversal – Implementation

Pre-order traversal, recursive:

```
preorderTraversal(Node n){  
    if (n == null) return;  
  
    visit(n);  
    preorderTraversal(n.leftChild());  
    preorderTraversal(n.rightChild());  
}
```

## Depth First Traversal – Implementation

We can switch from recursive to iterative by swapping the implicit use of the call stack with an explicit stack.

Pre-order traversal, iterative:

```
preorderTraversal(Node n){  
    Stack<Node> s = new Stack<Node>();  
    Node current = n;  
  
    while (current != null){  
        visit(current);  
        if (current.rightChild() != null)  
            s.push(current.rightChild());  
        if (current.leftChild() != null)  
            s.push(current.leftChild());  
  
        current = stack.pop();  
    }  
}
```

## Depth First Traversal – Implementation

In-order traversal, recursive:

```
inorderTraversal(Node n){  
    if (n == null) return;  
  
    preorderTraversal(n.leftChild());  
    visit(n);  
    preorderTraversal(n.rightChild());  
}
```

## Depth First Traversal – Implementation

In-order traversal, iterative:

```
inorderTraversal(Node n){  
    Stack<Node> s = new Stack<Node>();  
    Node current = n;  
  
    while (current != null || !s.isEmpty()){  
        if (current != null){  
            s.push(current);  
            current = current.leftChild();  
        }  
        else {  
            current = s.pop();  
            visit(current);  
            current = current.rightChild();  
        }  
    }  
}
```

## Depth First Traversal – Implementation

Post-order traversal, recursive:

```
postorderTraversal(Node n){  
    if (n == null) return;  
  
    preorderTraversal(n.leftChild());  
    preorderTraversal(n.rightChild());  
    visit(n);  
}
```

# Depth First Traversal – Implementation

Post-order traversal, iterative:

```
postorderTraversal(Node n){
    Stack<Node> s = new Stack<Node>();
    Node current = n;
    Node last = null;

    while (current != null || !s.isEmpty()){
        if (current != null){
            s.push(current);
            current = current.leftChild();
        }
        else{
            if (s.peek().rightChild() != null &&
                s.peek().rightChild() != last){
                current = s.peek().rightChild();
            }
            else{
                current = s.pop();
                visit(current);
                last = current;
            }
        }
    }
}
```

- Visits vertices according to their level in the tree (“left to right, top to bottom”).
- Simple to implement iteratively using a queue.



## Breadth First Traversal - Implementation

```
breadthFirst(Node n){  
    Queue<Node> q = new Queue<Node>();  
  
    q.add(n);  
  
    while (!q.isEmpty()){  
  
        Node current = q.remove();  
        visit(current);  
  
        if (current.leftChild != null)  
            q.add(current.leftChild());  
        if (current.rightChild != null)  
            q.add(current.rightChild());  
  
    }  
}
```

# Binary Search Trees

# Binary Search Trees

- Binary Search Trees (BSTs) are a simple data structure that allows fast insertion, removal and lookup of the elements they store.
- They are an ordered data structure, but because they use a binary tree, you don't have to reshuffle everything to put something new in. (Unlike array-like data structures, for example.)
- They follow a simple rule to find or insert:
  - If what you're looking for (or what you have) has a smaller key than the current vertex, go to the left. Otherwise, go to the right. (Special case: duplicate keys)
- Insertion then is just traversing the tree to the bottom and adding the new element wherever you stop.
- Finding something mimics binary search, if you get to the bottom without finding it, it's not there.

# Complexity of Binary Search Trees

Operation	Average Case	Worst Case
Space	$O(n)$	$O(n)^1$
Insert	$O(\log n)$	$O(n)$
Remove	$O(\log n)$	$O(n)$
Find	$O(\log n)$	$O(n)$

At the cost of more complicated code, there are several self-balancing BST data structures which reduce the worst case insert, remove and find to  $O(\log n)$ : 2-3 Trees, Red-Black Trees, AVL Trees, Splay Trees and others. (Some material at the end if we have time, or to peruse at your leisure.)

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<sup>1</sup>Using the array embedding, this can actually end up as  $O(2^n)$ .

## Some Uses of Binary Trees

# Representing Grammars with Trees

- Many things in computer science can be expressed in terms of *Formal Grammars*.
  - (We don't need to know what they are though).
- In particular, expressions that have syntax can be modelled with grammars.
  - e.g. every programming language (and much more).
- One way of showing how a concrete expression derives from a grammar is by using a tree.
  - ... and for certain types of expression grammars, binary trees!

- We can take Boolean expressions as an example. They have simple rules:
  - ① True is a Boolean expression.
  - ② False is a Boolean expression.
  - ③ If  $A$  a Boolean expression,  $\neg A$  is a Boolean expression.
  - ④ If  $A$  and  $B$  are Boolean expressions,  $A \wedge B$  is a Boolean expression.
  - ⑤ If  $A$  and  $B$  are Boolean expressions,  $A \vee B$  is a Boolean expression.

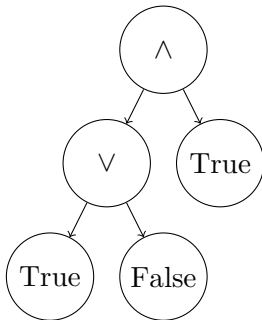
- Just for those that are interested, a grammar for that looks like:

$$S \rightarrow \neg S \mid S \wedge S \mid S \vee S \mid \text{True} \mid \text{False}$$

- You can build more complicated ones that build in operator precedence and associativity too.



- We can convert these rules to a binary tree structure.
- For example, the expression  $(\text{True} \vee \text{False}) \wedge \text{True}$  can be represented by:



## Why is this useful?

- Given an expression as text, it is not immediately obvious how to begin computing its value.
- You need to read the whole thing, then decide which bits you are going to do first.
  - Operator precedence is important! ( $3 \times 2 - 1$  vs  $3 \times (2 - 1)$ )
- If we can quickly build a tree like this, then we can *recursively* evaluate it!
  - It becomes a simple divide and conquer algorithm!
- We can also traverse it looking for other properties (very useful when compiling code).

- Another thing we can do is turn the expression back into a string in different ways.
  - ① Prefix notation results from a pre-order traversal of the tree,
  - ② Infix notation results from an in-order traversal, and...
  - ③ (you guessed it) Postfix notation results from a post-order traversal of the tree.
- Prefix and Postfix are unambiguous, and don't require operator precedence or associativity rules to parse.
  - So converting an infix expression (what we meat-bags normally write in) to postfix or prefix can make things easier for the computer (or better still easier for the computer programmer).

## A More Balanced Binary Search Tree - AVL Trees

## Better Balance = Less Falling Over

- Binary Search Trees work well if the tree is balanced.
- ... but this doesn't always happen.
- We can correct this by doing some extra work to maintain balance.

AVL Trees do extra work at each insertion and deletion, to maintain good running times no matter what:

Operation	Average Case	Worst Case
Space	$O(n)$	$O(n)^2$
Insert	$O(\log n)$	$O(\log n)$
Remove	$O(\log n)$	$O(\log n)$
Find	$O(\log n)$	$O(\log n)$

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<sup>2</sup>Same caveat as the BST.

## How do they balance things?

- AVL trees keep things balanced by maintaining an invariant at each vertex: the balance factor.
- The balance factor of a vertex  $v$  is the height of the left subtree minus the height of the right subtree.
- The balance factor of a vertex can be -1, 0 or 1. Anything else, and the tree needs rebalancing.
- Because inserting a new element only adds one vertex, the balance factor will only get as bad as -2 or 2, before something is done.

- First we insert as normal with a BST.
- Then we need to check if the height of the subtrees of the ancestors of the newly inserted vertex are okay.
- The balance factor of any vertex is the height of its left subtree minus the height of its right subtree.
- If everything is okay, the balance factor is  $-1$ ,  $0$  or  $1$ .
- If we always do our check from the bottom, we also know that if the tree is unbalanced, it will be  $2$  or  $-2$ .
- We can store the height at each vertex, then we only need to update the relevant ones when we add a new child.



- A tree rotation is an order invariant operation on binary trees.
- It changes the structure, but the traversal order remains the same.
- A tree rotation can be left or right.
- Given a vertex  $x$ , with a right subtree  $\gamma$ , and a left child  $y$  which has subtrees  $\alpha$  and  $\beta$ , we can rotate right to get  $y$  with left subtree  $\alpha$ , and right child  $x$  which has subtrees  $\beta$  and  $\gamma$ .
- A left rotation is just the reverse operation.

If we get a vertex  $x$  with balance factor 2:

- ① We look at the left child  $y$  (this must be the larger one).
- ② If it has balance factor  $-1$ , it “leans to the right”.
  - ① We rotate left the child  $y$  and its right child  $z$ . This makes  $z$  the left child of  $x$ .
  - ② Then we rotate right  $z$  and  $x$  to get a balanced tree.
- ③ Otherwise
  - ① Rotate right with  $y$  and  $x$  to get a balanced tree.

The  $-2$  case is analogous:

- ① If  $y$  has balance factor 1
  - ① Rotate right with  $z$  and  $y$ .
  - ② Rotate left with  $z$  and  $x$ .
- ② Else
  - ① Rotate left with  $y$  and  $x$ .

- This leaves the subtree with balance factor  $-1$ ,  $0$  or  $1$ , depending on the exact balance factors of its subtrees (but entirely predictable).
- Then we continue up the tree checking.
- So we only need to follow a path to the root, doing at most two rotations at each step – turns out to not be that expensive.

- We need to keep track of a couple of things:
  - ① Let  $x$  be the vertex we want to delete.
  - ②  $y$  is a vertex whose value we will move.
  - ③ and  $z$  is the actual vertex we remove.

- ① If  $x$  is a leaf, or has one child  $z := x$ .
- ② Otherwise
  - ① Find the largest value in the left subtree, or the smallest in the right subtree of  $x$ , this will be  $y$ .
  - ② Copy the value at  $y$  over the value at  $x$ .
  - ③ Now  $z := y$ .
- ③ If  $z$  has a subtree, attach it to  $z$ 's parent in its place, and delete  $z$  (or set the child to the root if  $z$  is the root).
- ④ Starting with  $z$ 's parent, rebalance the tree.