

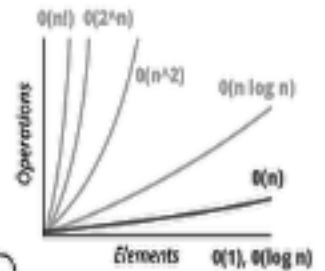
## LEGEND

TIME Complexity vs. SPACE Complexity

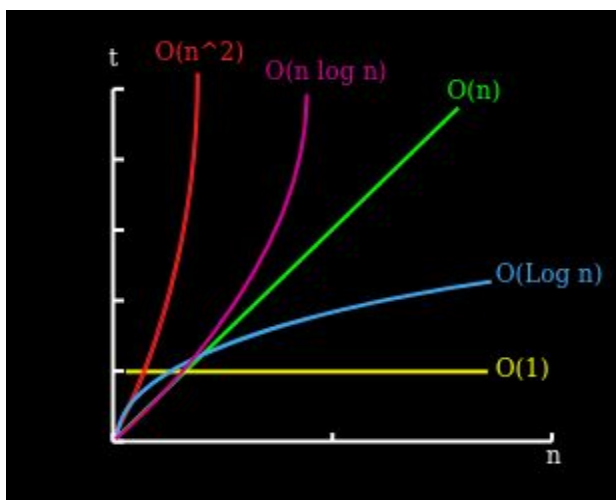
Good Fair Bad  
Good Fair Bad

## <BIG-O-CHEATSHEET>

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DATA STRUCTURE Operations											ARRAY SORTING Algorithms					
DATA Structure	TIME Complexity										ARRAY Algorithms	TIME Complexity				SPACE Complexity
	Average					Worst						Best	Average	Worst	Worst	
	Access	Search	Insertion	Deletion		Access	Search	Insertion	Deletion							
Array		$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	Quicksort		$O(n \log(n))$	$O(n \log(n))$	$O(n^2)$	$O(\log(n))$
Stack		$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	Mergesort		$O(n \log(n))$	$O(n \log(n))$	$O(n \log(n))$	$O(n)$
Queue		$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	$O(1)$	Timsort		$O(n)$	$O(n \log(n))$	$O(n \log(n))$	$O(1)$
Single-Linked List		$O(n)$	$O(n)$	$O(1)$	$O(1)$	$O(n)$	$O(n)$	$O(1)$	$O(1)$	$O(n)$	Heapsort		$O(n \log(n))$	$O(n \log(n))$	$O(n \log(n))$	$O(1)$
Doubly-Linked List		$O(n)$	$O(1)$	$O(1)$	$O(1)$	$O(n)$	$O(n)$	$O(1)$	$O(1)$	$O(n)$	Bubble Sort		$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Skip List		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	$O(n)$	$O(n)$	$O(n)$	$O(n \log(n))$	Insertion Sort		$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Hash Table		N/A	$O(1)$	$O(1)$	$O(1)$	N/A	$O(1)$	$O(1)$	$O(1)$	$O(1)$	Selection Sort		$O(n^2)$	$O(n^2)$	$O(n^2)$	$O(1)$
Binary Search Tree		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	$O(n)$	$O(n)$	$O(n)$	$O(n)$	Tree Sort		$O(n \log(n))$	$O(n \log(n))$	$O(n^2)$	$O(n)$
Correlation Tree		N/A	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	N/A	$O(n)$	$O(n)$	$O(n)$	$O(n)$	Shell Sort		$O(n \log(n))$	$O(n \log(n) \log(n)^2)$	$O(n \log(n) \log(n)^2)$	$O(1)$
B-Tree		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	Bucket Sort		$O(n+k)$	$O(n+k)$	$O(n^2)$	$O(n)$
Red Black Tree		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	Radix Sort		$O(n)$	$O(n)$	$O(n)$	$O(n+k)$
Splay Tree		N/A	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	N/A	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	Counting Sort		$O(n+k)$	$O(n+k)$	$O(n+k)$	$O(n)$
AVL Tree		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	Cubsort		$O(n)$	$O(n \log(n))$	$O(n \log(n))$	$O(n)$
B+ Tree		$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(\log(n))$	$O(n)$	$O(n)$	$O(n)$	$O(n)$	$O(n)$						



Constant Time  $O(1)$

Linear Time  $O(n)$

Quadratic Time  $O(n^2)$

Logarithmic Time  $O(\log n)$

Linearithmic  $(n \cdot \log n)$

Runtime

Indicate for each of the statements below whether the statement is true or false.

You do not need to show work. (2 points each)

a)  $n^3$  is in  $\Omega(n^4)$  False

b)  $2n^3 + n^2$  is in  $\Theta(n^3)$  True

c)

while

InOrder(root) visits nodes in the following order:

4, 10, 12, 15, 18, 22, 24, 25, 31, 35, 44, 50, 66, 70, 90

$f(n) \geq O(g(n))$

$f(n) > o(g(n))$

$f(n) = \Theta(g(n))$

$f(n) < \omega(g(n))$

$f(n) \leq \Omega(g(n))$

```

(n>0) { is in  $\Omega(n)$  and  $O(n)$ 
      n--;
    } //True
d) while (n²>0) {is in  $\Omega(n)$  and
n--; } //False!!!
e) buildHeap() is in  $O(n)$  True
f) AVL height is  $O(\log n)$  True
g) AVL height is  $O(n)$  True
h) BST height is best case  $O(n)$  True

```

Tree Traversal  
InOrder: (LPR)      $O(n)$   
PostOrder: (LRP)  
PreOrder: (PLR)

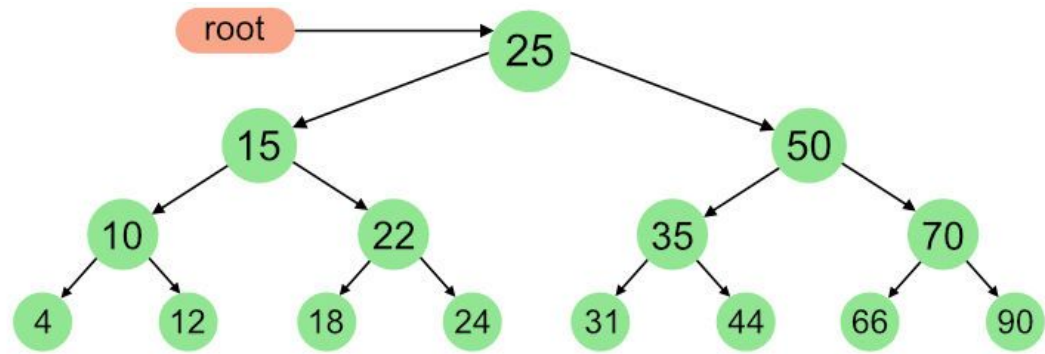
Call recursively for tree traversal.

```

LPR(Left Print Right)
LRP(Left Right Print)
PLR(Print Left Right)

```

Hash Table  
Consider inserting data with integer keys 22, 55, 33, 2, 26, 12 in that order into a hash table of size 11 where the hashing function is  $h(\text{key}) \% 11$ .



Mod		Chaining Hash		QP		Linear f(i)=i h(k),...,h(k)+ i		Double Hash f(i)=i*g(k) h(k),...,h(k)+i*g(k)
22 % 11 = 0	0	33 -> 55 -> 22	0	22	0	22	0	22
55 % 11 = 0	1	12	1	55	1	55	1	55
33 % 11 = 0	2	2	2	2	2	33	2	33
2 % 11 = 2	3		3		3	2	3	12
26 % 11 = 4	4	26	4	33	4	26	4	26
12 % 11 = 1	5		5	26	5	12	5	
	6		6		6		6	
	7		7		7		7	24
	8		8		8		8	
	9		9		9		9	
	10		10	12	10		10	

## Programming Questions

IF tree is right heavy

```
{
    IF tree's right subtree is left heavy
    {
        Perform Double Left rotation
    }
    ELSE
    {
        Perform Single Left rotation
    }
}
```

ELSE IF tree is left heavy

```
{
    IF tree's left subtree is right heavy
    {
        Perform Double Right rotation
    }
    ELSE
    {
        Perform Single Right rotation
    }
}
```

/\* Java program to checks if a binary tree is max heap or not \*/

// A Binary Tree node

class Node

```
{
    int key;
    Node left, right;
    Node(int k)
    {
        key = k;
        left = right = null;
    }
}
```

class Is\_BinaryTree\_MaxHeap

```
{
    /* This function counts the number of nodes in a binary tree */
    int countNodes(Node root)
    {
        if(root==null)
            return 0;
        return(1 + countNodes(root.left) + countNodes(root.right));
    }

    /* This function checks if the binary tree is complete or not */
    boolean isCompleteUtil(Node root, int index, int number_nodes)
    {
        // An empty tree is complete
        if(root == null)
            return true;

        // If index assigned to current node is more than
```

```
public static Integer last_printed = null;
public static boolean checkBST(TreeNode n){
    if (n == null) return true;
    // check / recurse left
    if (!checkBST(n.left)) return false;

    // check current
    if( last_printed != null && n.data <= last_printed) {
        return false;
    }

    //check / recurse right
    if (!checkBST(n.right)) return false;

    return true;
}
```

```
boolean checkBST(TreeNode n){
    return checkBST(n, null, null);
}

boolean checkBST(TreeNode n, Integer min, Integer max){
    if(n == null){
        return true;
    }

    if((min != null && n.data <= min) ||
        (max !=null && n.data > max)){
        return false;
    }

    if(!checkBST(n.left, min, n.data) ||
        !checkBST(n.right, n.data, max)){
        return false;
    }
    return true;
}
```

```

// number of nodes in tree, then tree is not complete
if(index >= number_nodes)
    return false;

// Recur for left and right subtrees
return isCompleteUtil(root.left, 2*index+1, number_nodes) &&
    isCompleteUtil(root.right, 2*index+2, number_nodes);
}

// This Function checks the heap property in the tree.
boolean isHeapUtil(Node root)
{
    // Base case : single node satisfies property
    if(root.left == null && root.right==null)
        return true;

    // node will be in second last level
    if(root.right == null)
    {
        // check heap property at Node
        // No recursive call , because no need to check last level
        return root.key >= root.left.key;
    }
    else
    {
        // Check heap property at Node and
        // Recursive check heap property at left and right subtree
        if(root.key >= root.left.key && root.key >= root.right.key)
            return isHeapUtil(root.left) && isHeapUtil(root.right);
        else
            return false;
    }
}

// Function to check binary tree is a Heap or Not.
boolean isHeap(Node root)
{
    if(root == null)
        return true;

    // These two are used in isCompleteUtil()
    int node_count = countNodes(root);

    if(isCompleteUtil(root, 0 , node_count)==true && isHeapUtil(root)==true)
        return true;
    return false;
}

// driver function to test the above functions
public static void main(String args[])
{
    Is_BinaryTree_MaxHeap bt = new Is_BinaryTree_MaxHeap();

    Node root = new Node(10);
    root.left = new Node(9);
    root.right = new Node(8);
    root.left.left = new Node(7);

```

```

        root.left.right = new Node(6);
        root.right.left = new Node(5);
        root.right.right = new Node(4);
        root.left.left.left = new Node(3);
        root.left.left.right = new Node(2);
        root.left.right.left = new Node(1);
        if(bt.isHeap(root) == true)
            System.out.println("Given binary tree is a Heap");
        else
            System.out.println("Given binary tree is not a Heap");
    }
}

```

```

} //End Heap Confirmation program

```

```

// Java Program for Lowest Common Ancestor in a Binary Tree
// A O(n) solution to find LCA of two given values n1 and n2

```

```

import java.util.ArrayList;
import java.util.List;

```

```

// A Binary Tree node

```

```

class Node {
    int data;
    Node left, right;

    Node(int value) {
        data = value;
        left = right = null;
    }
}

```

```

public class BT_NoParentPtr_Solution1
{

```

```

    Node root;
    private List<Integer> path1 = new ArrayList<>();
    private List<Integer> path2 = new ArrayList<>();

    // Finds the path from root node to given root of the tree.
    int findLCA(int n1, int n2) {
        path1.clear();
        path2.clear();
        return findLCAInternal(root, n1, n2);
    }

```

```

    private int findLCAInternal(Node root, int n1, int n2) {

        if (!findPath(root, n1, path1) || !findPath(root, n2, path2)) {
            System.out.println((path1.size() > 0) ? "n1 is present" : "n1 is missing");
            System.out.println((path2.size() > 0) ? "n2 is present" : "n2 is missing");
            return -1;
        }

        int i;
        for (i = 0; i < path1.size() && i < path2.size(); i++) {
            // System.out.println(path1.get(i) + " " + path2.get(i));
            if (!path1.get(i).equals(path2.get(i)))
                break;
        }
        return path1.get(i-1);
    }
}

```

```

}

// Finds the path from root node to given root of the tree, Stores the
// path in a vector path[], returns true if path exists otherwise false
private boolean findPath(Node root, int n, List<Integer> path)
{
    // base case
    if (root == null) {
        return false;
    }

    // Store this node . The node will be removed if
    // not in path from root to n.
    path.add(root.data);

    if (root.data == n) {
        return true;
    }

    if (root.left != null && findPath(root.left, n, path)) {
        return true;
    }

    if (root.right != null && findPath(root.right, n, path)) {
        return true;
    }

    // If not present in subtree rooted with root, remove root from
    // path[] and return false
    path.remove(path.size()-1);

    return false;
}

// Driver code
public static void main(String[] args)
{
    BT_NoParentPtr_Solution1 tree = new BT_NoParentPtr_Solution1();
    tree.root = new Node(1);
    tree.root.left = new Node(2);
    tree.root.right = new Node(3);
    tree.root.left.left = new Node(4);
    tree.root.left.right = new Node(5);
    tree.root.right.left = new Node(6);
    tree.root.right.right = new Node(7);

    System.out.println("LCA(4, 5): " + tree.findLCA(4,5));
    System.out.println("LCA(4, 6): " + tree.findLCA(4,6));
    System.out.println("LCA(3, 4): " + tree.findLCA(3,4));
    System.out.println("LCA(2, 4): " + tree.findLCA(2,4));
}
} //End LCA program

```

# Meet the Family

# Asymptotic Analysis

- $O(f(n))$  is the set of all functions asymptotically less than or equal to  $f(n)$ 
  - $o(f(n))$  is the set of all functions asymptotically strictly less than  $f(n)$
- $\Omega(f(n))$  is the set of all functions asymptotically greater than or equal to  $f(n)$ 
  - $\omega(f(n))$  is the set of all functions asymptotically strictly greater than  $f(n)$
- $\Theta(f(n))$  is the set of all functions asymptotically equal to  $f(n)$

- Eliminate low order terms
  - $4n + 5 \Rightarrow$
  - $0.5 n \log n + 2n + 7 \Rightarrow$
  - $n^3 + 2^n + 3n \Rightarrow$
- Eliminate coefficients
  - $4n \Rightarrow$
  - $0.5 n \log n \Rightarrow$
  - $n \log n^2 \Rightarrow$

## Definition of Order Notation

## Example

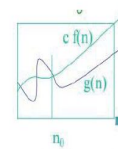
- Upper bound:  $T(n) = O(f(n))$ 
  - Exist constants  $c$  and  $n'$  such that
    - $T(n) \leq c f(n)$  for all  $n \geq n'$
- Lower bound:  $T(n) = \Omega(g(n))$ 
  - Exist constants  $c$  and  $n'$  such that
    - $T(n) \geq c g(n)$  for all  $n \geq n'$

Big-O

Omega

Theta

- $g(n) = 1000n$  vs.  $f(n) = n^2$
- Is  $g(n) \in O(f(n))$  ?
  - Pick:  $n_0 = 1000, c = 1$
  - $1000n \leq 1 * n^2$  for all  $n \geq 1000$
  - So  $g(n) \in O(f(n))$



- Tight bound  $T(n) = \Theta(f(n))$ 
  - When both hold:  $T(n) = O(f(n))$  and  $T(n) = \Omega(f(n))$
- Small cases, really don't matter. As long as it's eventually an upper bound, it fits the definition
- If  $f(n)$  is in  $O(n)$ ... what about is  $f(n)$  in  $O(n^2)$ ?

Slowest to Fastest Growing	Function Type	Example
1	Constant Functions	5, 25, 6000
2	Logarithmic Functions	$\log_5 n, \log n$
3	Linear Functions	$5n, 25n, 6000n$
4	Linearithmic Functions	$n \log_5 n, n \log n$
5	Polynomial Functions	$5n^2, 25n^4, 6000n^{12}$
6	Exponential Functions	$5^n, 25^{6000n}$

## Balancing AVL Trees, cont'd

- o Therefore, one of the following had to occur:

- n Case 1 (outside left-left): The insertion was into the left subtree of the left child of  $\alpha$ .
- n Case 2 (inside left-right): The insertion was into the right subtree of the left child of  $\alpha$ .
- n Case 3 (inside right-left): The insertion was into the left subtree of the right child of  $\alpha$ .
- n Case 4 (outside right-right): The insertion was into the right subtree of the right child of  $\alpha$ .

Cases 1 and 4 are mirrors of each other, and cases 2 and 3 are mirrors of each other.

## Balancing AVL Trees: Case 1

- o Case 1 (outside left-left): Rebalance with a single right rotation.

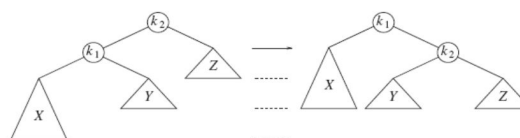
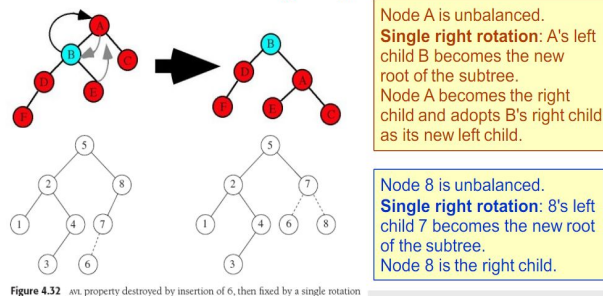


Figure 4.31 Single rotation to fix case 1



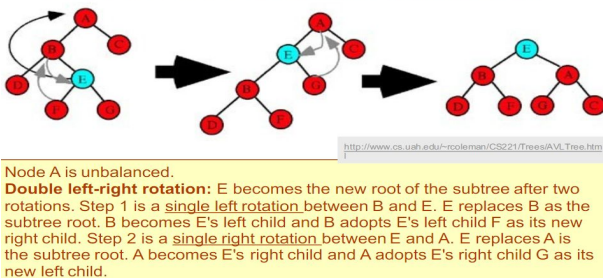
## Balancing AVL Trees: Case 1, *cont'd*

- Case 1 (outside left-left):  
Rebalance with a **single right rotation**.



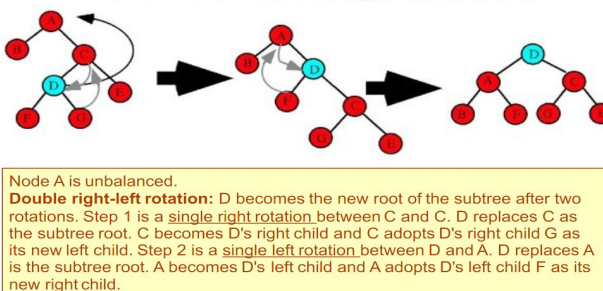
## Balancing AVL Trees: Case 2, *cont'd*

- Case 2 (inside left-right):  
Rebalance with a **double left-right rotation**.



## Balancing AVL Trees: Case 3, *cont'd*

- Case 3 (inside right-left):  
Rebalance with a **double right-left rotation**.



## Balancing AVL Trees: Case 2

- Case 2 (inside left-right):  
Rebalance with a **double left-right rotation**.

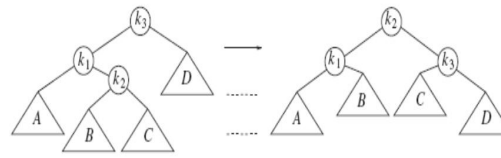


Figure 4.35 Left-right double rotation to fix case 2

## Balancing AVL Trees: Case 3

- Case 3 (inside right-left):  
Rebalance with a **double right-left rotation**.

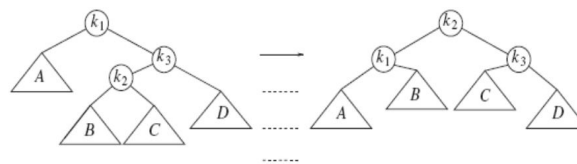
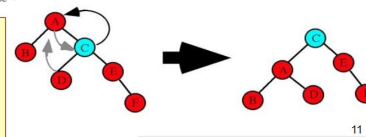
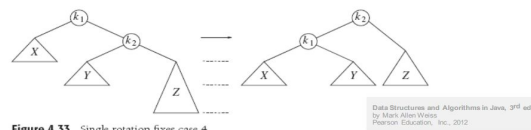


Figure 4.36 Right-left double rotation to fix case 3

## Balancing AVL Trees: Case 4

- Case 4 (outside right-right):  
Rebalance with a **single left rotation**.



## AVL Trees ( $N > \text{root} = \text{Right Child}$ , $N < \text{root} = \text{Left Child}$ )

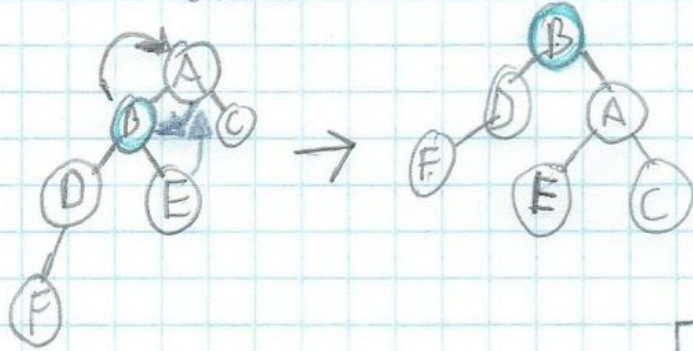
AVL's are balanced as long as the heights differ by 1. Not only for the entire tree, but each subtree as well.

If the height differs by 2 or more, then unbalanced, and we'll need a rotation. We look at the root and call it  $\alpha$ .

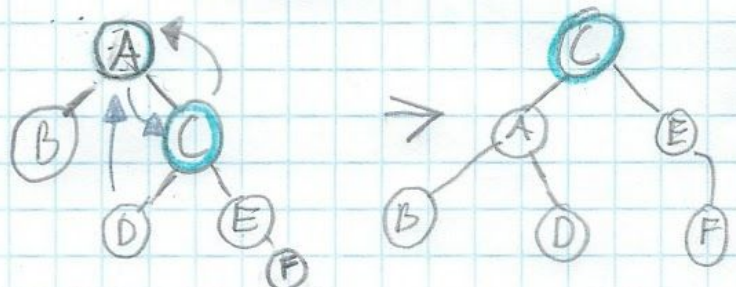


# AVL trees

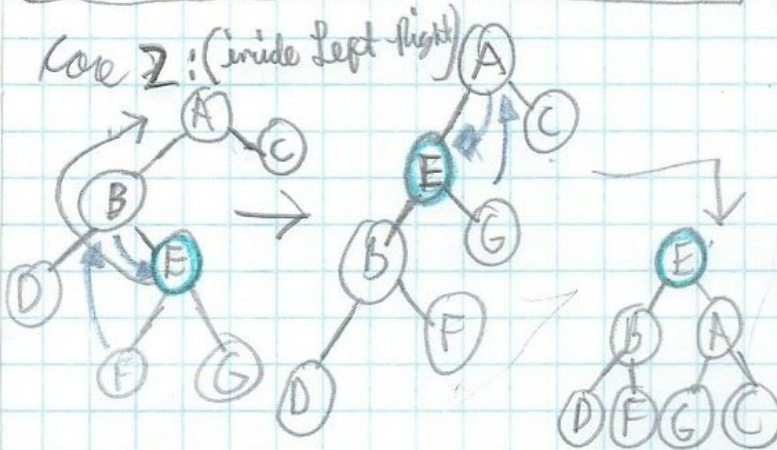
Case 1: (Left-Left)  
outside



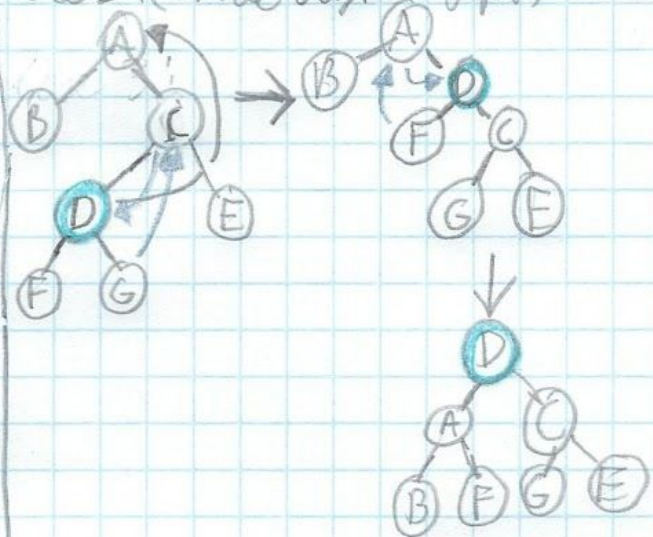
Case 4: (Right-Right)  
outside



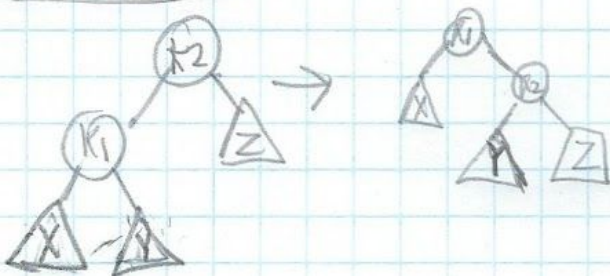
Case 2: (inside Left-right)



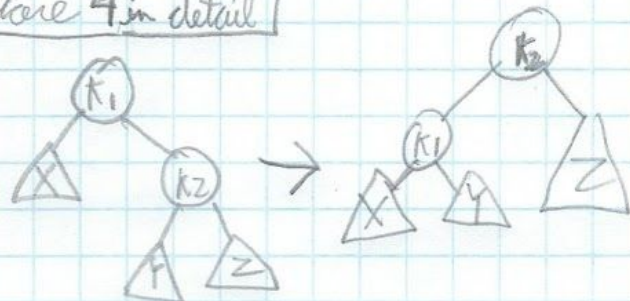
Case 3: (inside right-left)



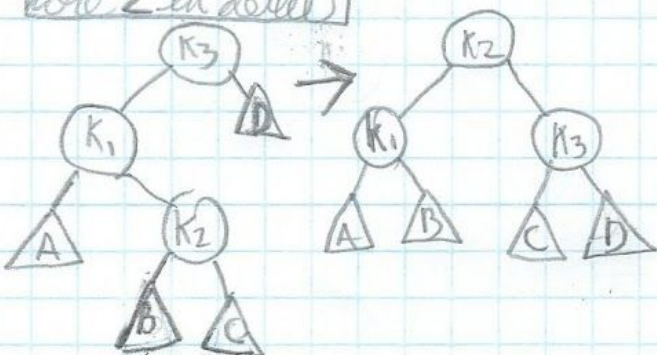
Case 1 in detail



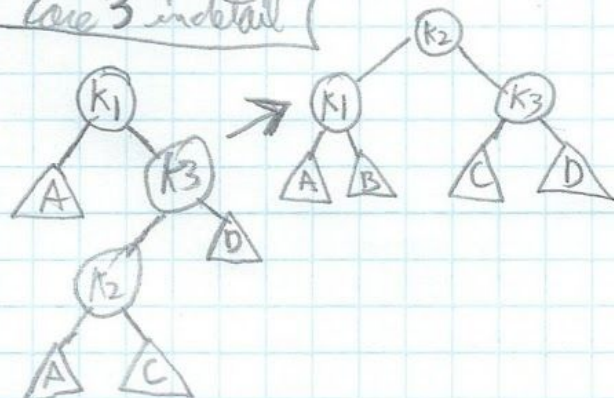
Case 4 in detail



Case 2 in detail



Case 3 in detail





## Sorting Summary

- Simple  $O(n^2)$  sorts can be fastest for small  $n$ 
  - selection sort, insertion sort (latter linear for mostly-sorted)
  - good for "below a cut-off" to help divide-and-conquer sorts
- $O(n \log n)$  sorts
  - heap sort, in-place but not stable nor parallelizable
  - merge sort, not in place but stable and works as external sort
  - quick sort, in place but not stable and  $O(n^2)$  in worst-case
    - often fastest, but depends on costs of comparisons/copies
- $\Omega(n \log n)$  is worst-case and average lower-bound for sorting by comparisons
- Non-comparison sorts
  - Bucket sort good for small number of key values
  - Radix sort uses fewer buckets and more phases
- Best way to sort? It depends!

## Demo

```
boolean isPalindrome(LinkedListNode head){
    LinkedListNode fast = head;
    LinkedListNode slow = head;

    Stack<Integer> stack = new Stack<Integer>();

    //push elements from first half of linked list onto stack
    while(fast != null && fast.next != null){
        stack.push(slow.data);
        slow = slow.next;
        fast = fast.next.next;
    }

    //has odd num of elements, so skip the middle
    if (fast != null){
        slow = slow.next;
    }

    while(slow != null){
        int top = stack.pop().intValue();

        //if values are different, then it's not a palindrome
        if(top != slow.data)
            return false;

        slow = slow.next;
    }

    return true;
}
```

Palindrome might be on test,  
but put it in just in case.

## Heaps [Index Zero is always empty]

### Min Heap

$i$  is the Current Index in the array.

$2i$  will give the left child

$2i+1$  Right Child

### DeleteMin:

Deletes lowest value (the root) and creates a whole.

Next Lowest Value moves up to the root.

Then the next lowest root becomes the new root of sub tree.

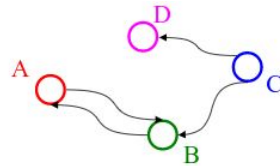
### Inserting Values into Min Heap

Add a hole at the end of the tree and place the new value. Compare the new value to the upper values, if it's less than them, keep moving up. If the new value is greater than the upper root, then it stays.

## More notation

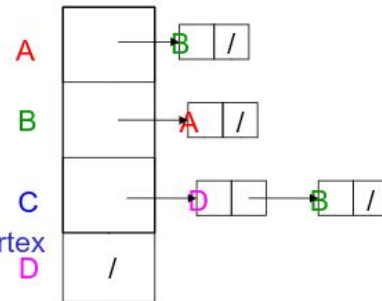
For a graph  $G=(V,E)$ :

- $|V|$  is the number of vertices
- $|E|$  is the number of edges
  - Minimum? 0
  - Maximum for undirected?  $|V|(|V+1|/2) \times O(|V|^2)$
  - Maximum for directed?  $|V|^2 \times O(|V|^2)$   
(assuming self-edges allowed, else subtract  $|V|$ )
- If  $(u,v) \in E$ 
  - Then  $v$  is a **neighbor** of  $u$ , i.e.,  $v$  is **adjacent** to  $u$
  - Order matters for directed edges
    - $u$  is not **adjacent** to  $v$  unless  $(v,u) \in E$



## Adjacency List Properties

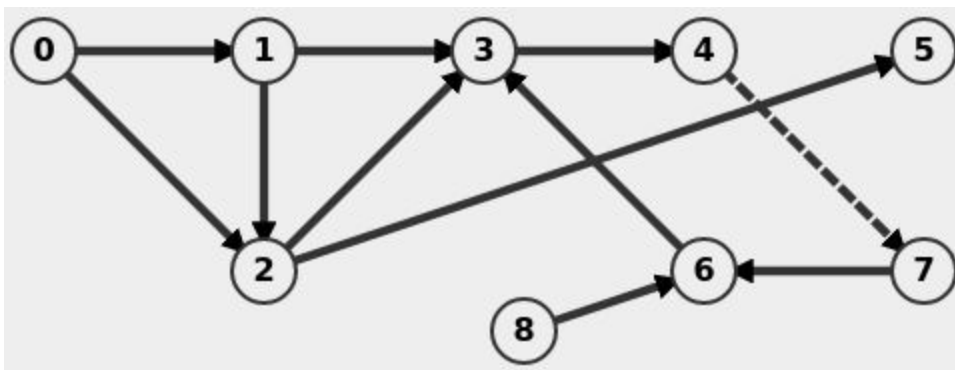
- Running time to:
  - Get all of a vertex's out-edges:  $O(d)$  where  $d$  is out-degree of vertex
  - Get all of a vertex's in-edges:  $O(|E|)$  (but could keep a second adjacency list for this!)
  - Decide if some edge exists:  $O(d)$  where  $d$  is out-degree of source
  - Insert an edge:  $O(1)$  (unless you need to check if it's there)
  - Delete an edge:  $O(d)$  where  $d$  is out-degree of source
- Space requirements:
  - $O(|V|+|E|)$
- Best for dense or sparse graphs?
  - Best for sparse graphs, so usually just stick with linked lists



## Adjacency Matrix Properties

- Running time to:
  - Get a vertex's out-edges:  $O(|V|)$
  - Get a vertex's in-edges:  $O(|V|)$
  - Decide if some edge exists:  $O(1)$
  - Insert an edge:  $O(1)$
  - Delete an edge:  $O(1)$
- Space requirements:
  - $|V|^2$  bits
- Best for sparse or dense graphs?
  - Best for dense graphs

	A	B	C	D
A	F	T	F	F
B	T	F	F	F
C	F	T	F	T
D	F	F	F	F

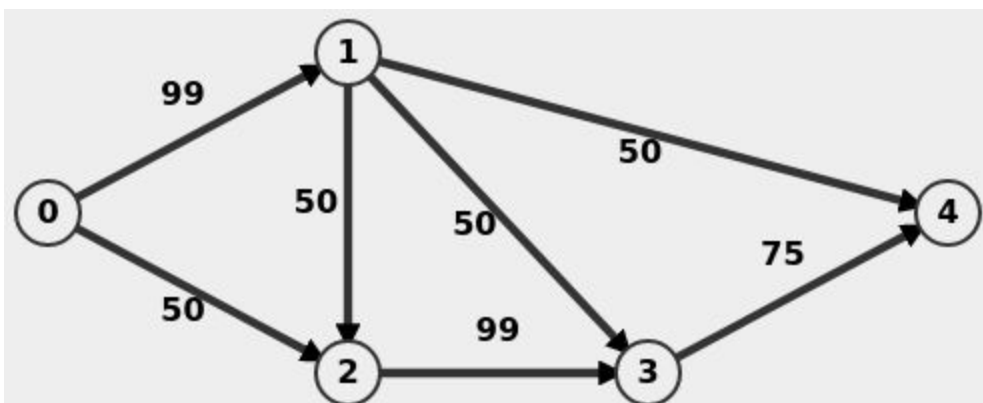


• V=9, E=11 • Tree? N/A • Complete? No • Bipartite? N/A • DAG? No

Edge List			
0:	0	1	
1:	0	2	
2:	1	2	
3:	1	3	
4:	2	3	
5:	2	5	
6:	3	4	
7:	4	7	
8:	6	3	
9:	7	6	
10:	8	6	

Adjacency Matrix									
	0	1	2	3	4	5	6	7	8
0	0	1	1	0	0	0	0	0	0
1	0	0	1	1	0	0	0	0	0
2	0	0	0	1	0	1	0	0	0
3	0	0	0	0	1	0	0	0	0
4	0	0	0	0	0	0	0	1	0
5	0	0	0	0	0	0	0	0	0
6	0	0	0	1	0	0	0	0	0
7	0	0	0	0	0	0	1	0	0
8	0	0	0	0	0	0	1	0	0

Adjacency List		
0:	1	2
1:	2	3
2:	3	5
3:	4	
4:	7	
5:		
6:	3	
7:	6	
8:	6	



• V=5, E=7 • Tree? N/A • Complete? No • Bipartite? N/A • DAG? Yes

Edge List			
0:	0	1	99
1:	0	2	50
2:	1	2	50
3:	1	3	50
4:	1	4	50
5:	2	3	99
6:	3	4	75

Adjacency Matrix					
	0	1	2	3	4
0	0	99	50	0	0
1	0	0	50	50	50
2	0	0	0	99	0
3	0	0	0	0	75
4	0	0	0	0	0

Adjacency List			
0:	(1, 99)	(2, 50)	
1:	(2, 50)	(3, 50)	(4, 50)
2:	(3, 99)		
3:	(4, 75)		
4:			

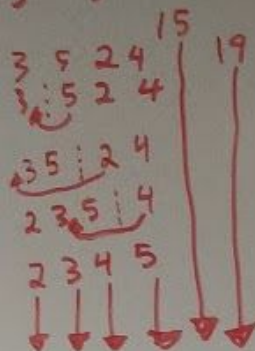




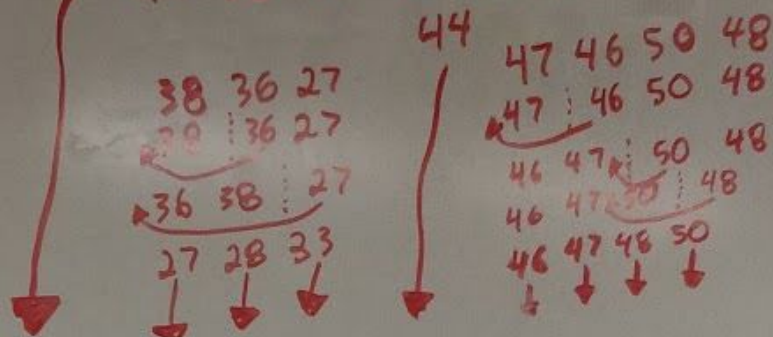
SS w/ median pivot of 3 for arrsize  $\leq 4$  induction test.

3 44 38 5 47 15 36 26 27 2 46 4 19 50 48

3 5 15 2 4 19

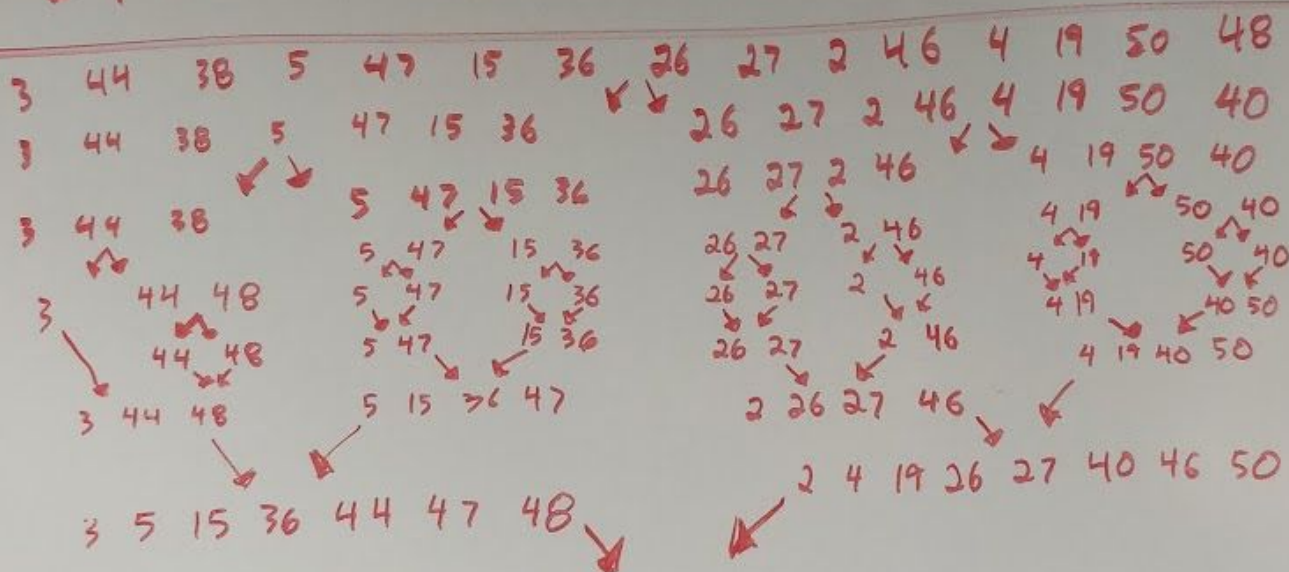


26 44 38 47 36 27 46 50 48



2 3 4 5 15 19 26 27 28 33 44 46 47 48 50

Michael  
Sort



2 3 4 5 15 19 26 27 36 40 44 46 47 48 50