

CS 5010: Programming Design Paradigms

Fall 2017

Lecture 8: Data Structures and Algorithms II

Acknowledgement: lecture notes inspired by course material prepared by UW faculty members Z. Fung and E. McCarthy.

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Administrivia

- Assignment 5 due on Monday, October 30 by 6pm
- Code walkthroughs on Tuesday, October 31 in your regular code walk sessions
- Next assignment – in pairs → watch our for more information on Piazza



[Picture credit: <http://robertsrestaurantpaso.com/wp-content/uploads/2016/12/blog2.jpg>]

Agenda – Algorithms and Data Structures 2

- Some comments and hints about Assignments 4 and 5
- Trees
 - Tree Traversals
 - Binary trees
 - Search tree ADT
 - Balanced trees and AVL trees
- Maps and Sets in Java
- Hashing and Hash Functions in Java
 - HashTables
 - Collisions, probing and chaining

Algorithms and Data Structures 2

ASSIGNMENTS 4 & 5 – COMMENTS AND HINTS

Assignment 4 – A Parser

- Given:
 - Historical knowledge about the neighborhood
 - A list of desired candy for every child
- Find a way to traverse a neighborhood to get all the candy from the list

Assignment 4 – A Parser

- Halloween Trick-or-treating:
 - Different houses give out different kinds of treats (candy) – a language/grammar
 - Kids have very particular preferences what kinds of candy would they like to get – a token stream
 - Neighborhood traversal – a parse tree

Assignment 5 – Background

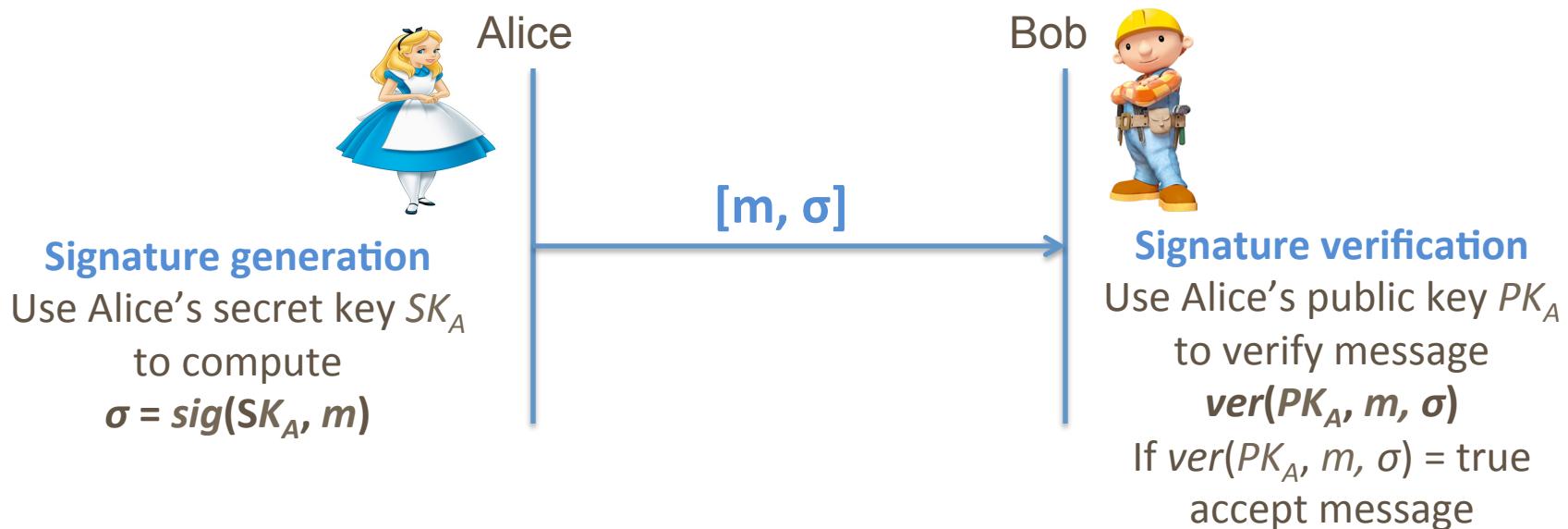
- Online transactions – important to verify:
 - An identity of a client
 - A content of the request
- Both verifications can be done using digital signatures

Assignment 5 – Your Task

- Simulate digital signature verification process for some fictional bank and its unique clients
- Simulator takes several input arguments:
 - Number of unique bank clients
 - Number of distinct transactions
 - Fraction of invalid messages
 - Output files

Quick Introduction to Digital Signatures

Digital signature – a *public-key* mechanism to provide data integrity and authentication



[Picture credit: pinterest.com, hitertainment.com]

The RSA Digital Signature Scheme

RSA digital signature – relies on the difficulty of factoring the product of large prime numbers

Every digital signature scheme consists of three main steps:

1. Key generation
2. Signature generation
3. Signature verification

RSA Digital Signature – Key Generation

The keys for the RSA digital signature are generated in the same way as the keys for RSA encryption:

1. Generate two distinct large primes p and q
2. Compute the product $n = pq$
3. Compute the Euler totient function $\phi(n) = (p - 1)(q - 1)$
4. Randomly generate an integer e that satisfies:
$$\gcd(e, n) = 1$$
$$\gcd(e, \phi(n)) = 1$$
5. Compute d such that $de \equiv 1 \pmod{\phi(n)}$

Public key PKA = (e,n)
Private key SKA = (d,n)

RSA Digital Signature – Signature Generation

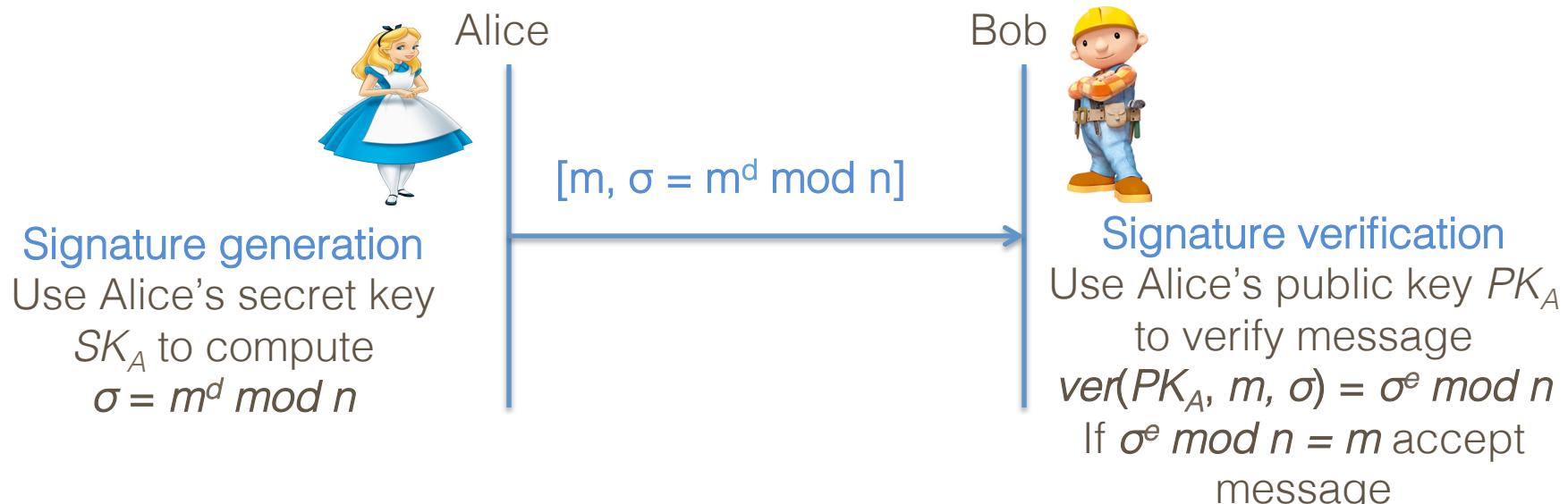
Alice generates a signature on a message m using her private key SK_A :

$$\sigma = \text{sig}(SK_A, m) = m^d \bmod n$$

RSA Digital Signature – Signature Verification

1. Bob uses Alice's public key PK_A , to compute:
 $\sigma^e \bmod n = (m^d)^e \bmod n = m^{ed} \bmod n = m'$
2. He compares the received message m and $\sigma^e \bmod n$
 - *If $m = \sigma^e \bmod n \rightarrow$ message accepted*

RSA Digital Signature – Summary



[Picture credit: pintrest.com, hitentertainment.com]

Algorithms and Data Structures 2

DATA COLLECTIONS

Data Collections?

Collection of chewed gums



Collection of pens



Collection of cassette tapes



Collection of old radios



What is a data collection?

Shoes collection



Star wars collection



Cars collection



[Pictures credit: <http://www.smosh.com/smash-pit/articles/19-epic-collections-strange-things>]

Data Collections?

- **Data collection** - an object used to store data (think *data structures*)
 - Stored objects called **elements**
 - Some typically operations:
 - `add()`
 - `remove()`
 - `clear()`
 - `size()`
 - `contains()`
- Some examples: `ArrayList`, `LinkedList`, `Stack`, `Queue`, `Maps`, `Sets`, `Trees`

Algorithms and Data Structures 2

TREES

Trees



[Pictures credit: <https://static1.squarespace.com/>]

Trees

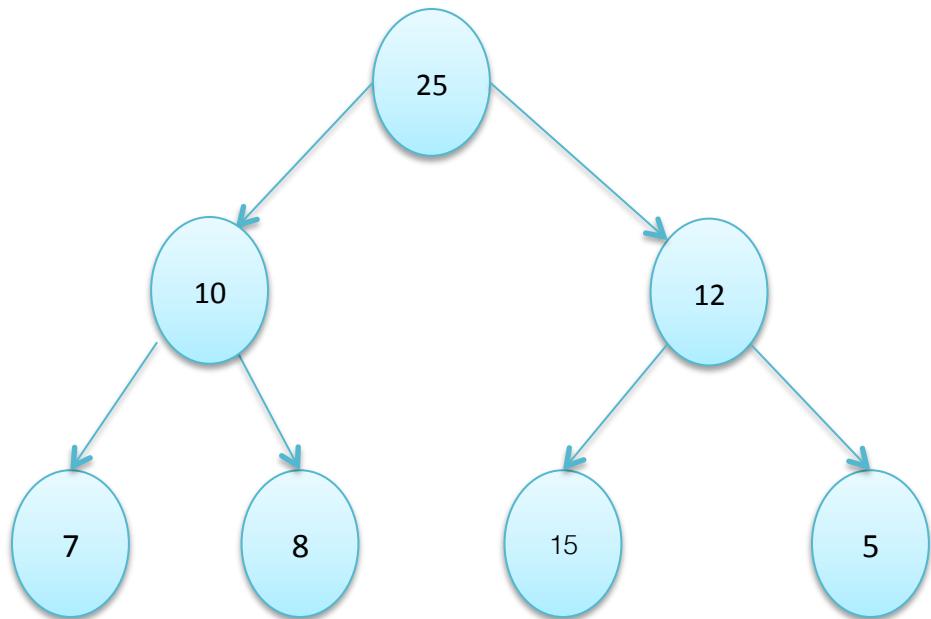
- Tree - a directed, acyclic structure of linked nodes
 - Directed - one-way links between nodes
 - Acyclic - no path wraps back around to the same node twice
 - Can be defined recursively:
 - A tree is either:
 - Empty(null), or
 - A root node that contains:
 - Data
 - A left subtree
 - A right subtree
- (The left and/or right subtree could be empty)

Trees Terminology

- **Node** - an object containing a data value and left/right children
- **Root** - topmost node of a tree
- **Subtree** – a smaller tree of nodes on the left or right of the current node
- **Parent** - a node above the left and right subtrees, that both subtrees are connected to
- **Child** - a root of each subtree
- **Sibling** - a node with a common parent
- **Leaf** - a node that has no children
- **Branch** - any internal node; neither the root nor a leaf
- **Level** or **depth** - length of the path from a root to a given node
- **Height** - length of the longest path from the root to any node

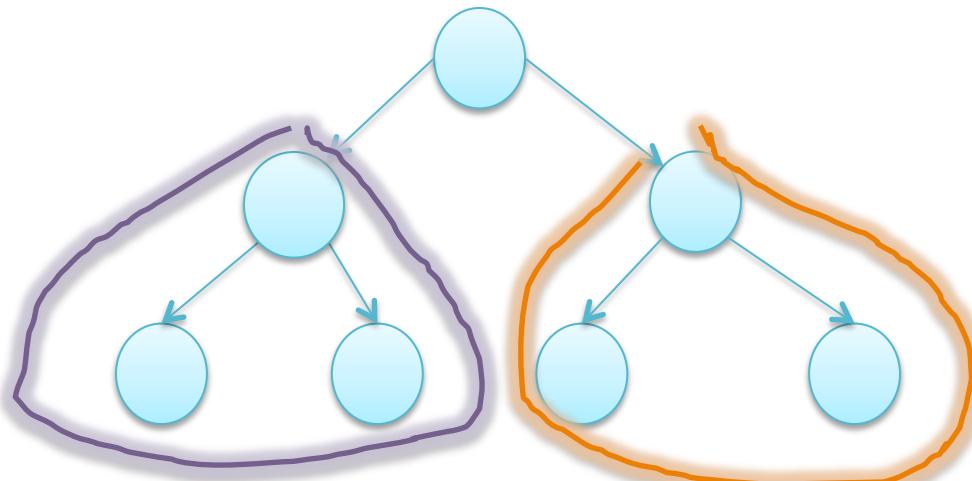
Trees Terminology Example

- **Nodes:** {25, 10 ,12, 7, 8, 15, 5}
- **Root:** 25
- **Subtrees:** {10, 7, 8} and {12, 15, 5}
- **Parents:** 10 → {7, 8}, 12 → {15, 5}, 25→ {10, 12}
- **Children:** {10, 12, 7, 8, 15, 5}
- **Siblings:** {7, 8}, {15, 5} and {10, 12}
- **Leaves:** {7, 8, 15, 5}
- **Height:** 3



Binary Trees

- **Binary tree** – a tree in which no node can have more than two children



Binary Tree Implementation

- A basic `BinaryNode` object stores:
 - Data,
 - Link to the left child
 - Link to the right child
- Multiple nodes can be linked together into a larger tree

```
class BinaryNode{  
    //Friendly data; accessible by other package routines  
    Object element;  
    BinaryNode left;  
    BinaryNode right;  
}
```

Example: Class StringTreeNode

```
StringTreeNode class
// A StringTreeNode object is one node in a binary tree of String
public class StringTreeNode{
    public String data; // data stored at this node
    Public StringTreeNode left; // reference to left subtree
    Public StringTreeNode right; // reference to right subtree

    // Constructs a leaf node with the given data
    Public StringTreeNode(String data) {
        this(data, null, null);
    }

    // Constructs a branch node with the given data and links
    Public StringTreeNode(String data, StringTreeNode left, StringTreeNode right) {
        this.data = data;
        this.left = left;
        this.right = right;
    }
}
```

Example: Class StringTree

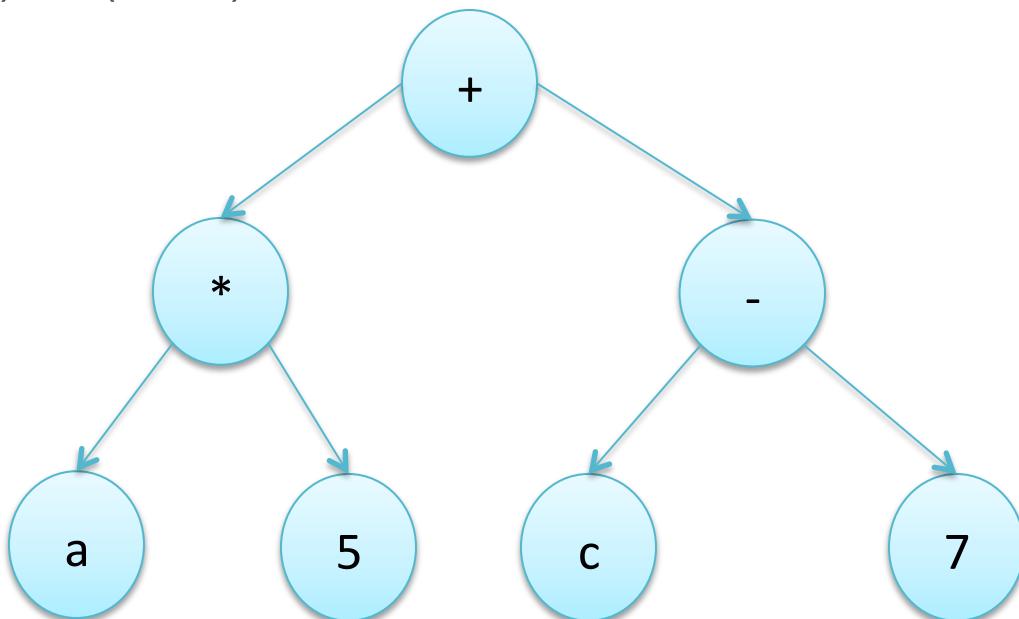
```
// An StringTree object represents an entire binary tree of
String.

public class StringTree{
    private StringTreeNode root;
    //some methods
}
```

- Observations:
 - We can only talk to the StringTree, not to the node objects inside the tree
 - Methods of the StringTree create and manipulate the nodes, their data and links between them

Example: Expression Trees

- In an expression tree:
 - Leaves are **operands** (constants or variable names)
 - All other leaves are **operators** (unary or binary)
 - Example: $(a * 5) + (c - 7)$

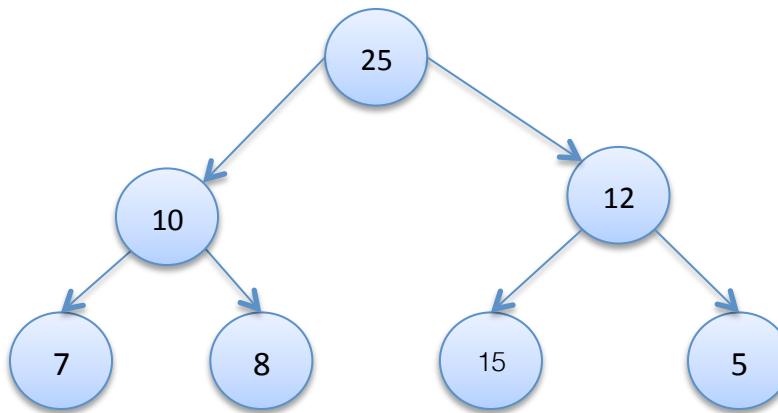


Algorithms and Data Structures 2

TREE TRAVERSALS

Searching an Element in a Tree

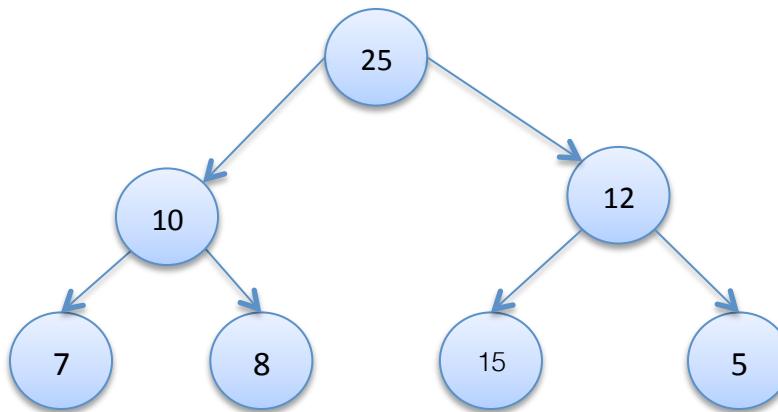
- Example: find element 15 in the given tree



- Possible approaches:
 - Depth-first search (DFS)
 - Breadth-first search (BFS)

Breath-First Search

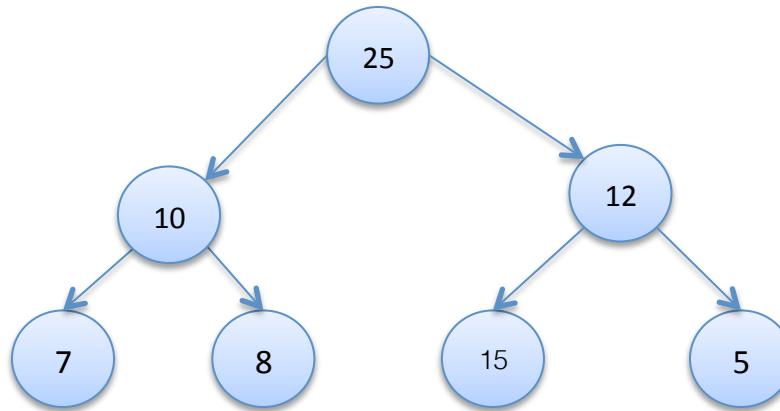
- Example: find element 15 in the given tree



- Traverse all of the nodes on the same level first, and then move on to the next (lower) level

Depth-First Search

- Example: find element 15 in the given tree



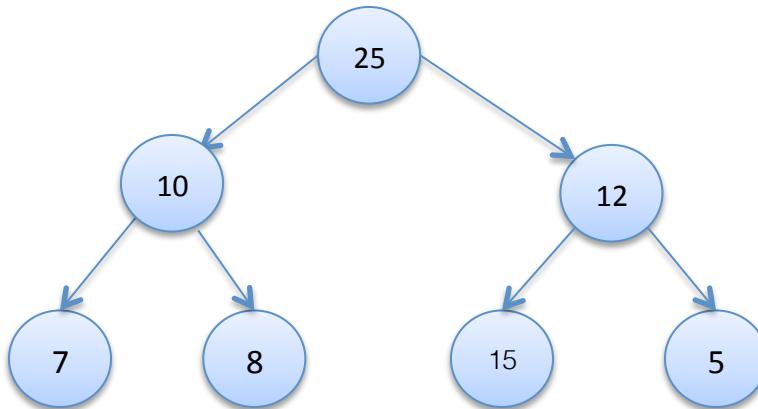
- Traverse one side of the tree all the way to the leaves, followed by the other side

Tree Traversals

- Tree traversal - an examination of the elements of a tree
 - Used in many tree algorithms and methods
- Common orderings for traversals:
 - Pre-order – process root node, then its left/right subtrees
 - In-order – process left subtree, then root node, then right subtree
 - Post-order – process left/right subtrees, then root node

Tree Traversals Example

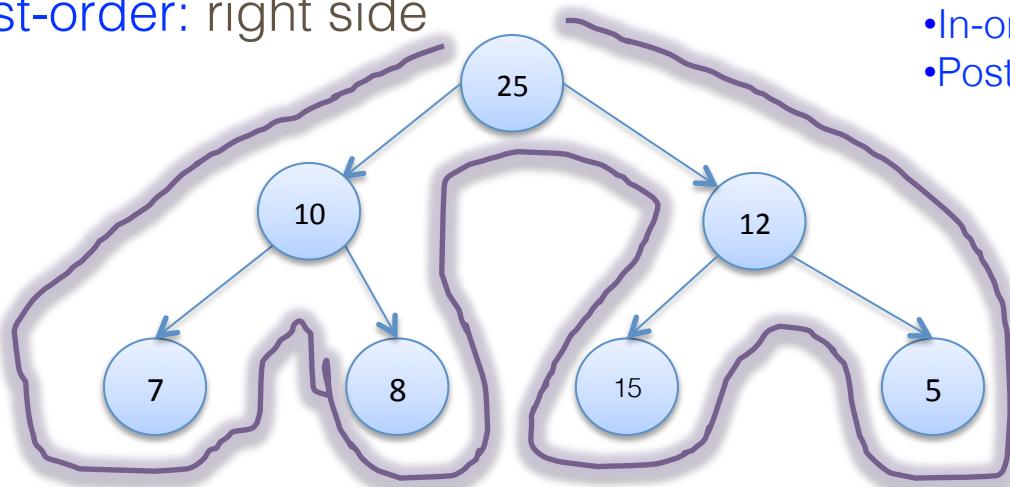
- Common orderings for traversals:
 - **Pre-order** – process root node, then its left/right subtrees
 - **In-order** – process left subtree, then root node, then right subtree
 - **Post-order** – process left/right subtrees, then root node



- Pre-order: 25 10 7 8 12 15 5
- In-order: 7 10 8 25 15 12 5
- Post-order: 7 8 10 15 5 12 25

Tree Traversals Trick

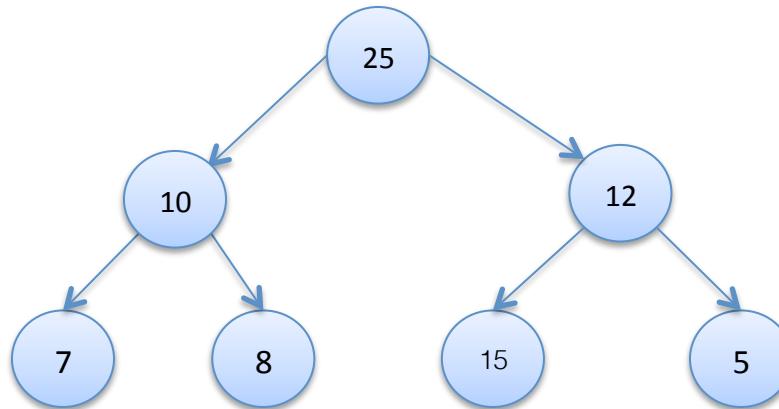
- To quickly generate a traversal, trace a path around the tree
- As you pass a node on the proper side, process it:
 - Pre-order: left side
 - In-order: bottom
 - Post-order: right side



- Pre-order: 25 10 7 8 12 15 5
- In-order: 7 10 8 25 15 12 5
- Post-order: 7 8 10 15 5 12 25

Example: Printing a Tree

- Assume we have some class IntTree
- Add a method `print` to the `IntTree` class that prints the elements of the tree, such that
 - Elements of a tree are separated by spaces
 - A node's left and right subtree should be printed before it
- Example: `tree.print(); //7 8 10 15 5 12 25`



Example: Printing a Tree

```
// An IntTree object represents an entire binary tree of ints
public class IntTree{
    private IntTreeNode overallRoot; // null for an empty tree ...
    public void print() {
        print(overallRoot);
        System.out.println(); // end the line of output
    }
    private void print(IntTreeNode root) {
        // (base case is implicitly to do nothing on null)
        if (root != null) {
            // recursive case: print left, right, center
            print(overallRoot.left);
            print(overallRoot.right);
            System.out.print(overallRoot.data + " ");
        }
    }
}
```

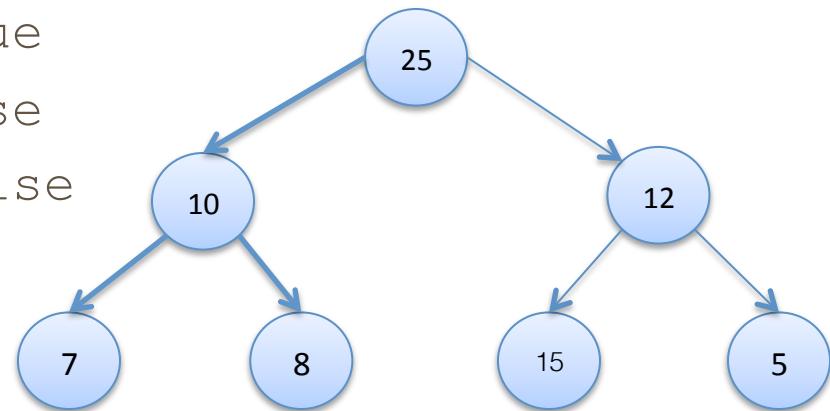
Template for Tree Methods

- Tree methods are often implemented recursively with a public/private pair
 - The private version accepts the root node to process

```
public class IntTree {  
    private IntTreeNode overallRoot;  
  
    ...  
    public type name(parameters) {  
        name(overallRoot, parameters);  
    }  
    private type name(IntTreeNode root, parameters) {  
        ...  
    }  
}
```

Example: contains ()

- Add a method `contains` to the `IntTree` class that searches the tree for a given integer, returning `true` if it is found.
- Example: If an `IntTree` variable `tree` referred to the tree below, the following calls would have these results:
 - `tree.contains(25) → true`
 - `tree.contains(12) → true`
 - `tree.contains(4) → false`
 - `tree.contains(77) → false`



Example: contains()

```
// Returns whether this tree contains the given integer
public boolean contains(int value) {
    return contains(overallRoot, value);
}

private boolean contains(IntTreeNode node, int value) {
    if (node == null) {
        return false; // base case: not found here
    } else if (node.data == value) {
        return true; // base case: found here
    } else {
        // recursive case: search left/right subtrees
        return contains(node.left, value) || contains(node.right,
               value);
    }
}
```

Algorithms and Data Structures 2

SEARCH TREE ADT

Refresher: Binary Search

- **Binary search** – a search that finds a target value in a *sorted* data collection by successively eliminating half of the collection from consideration
- In the worst case how many elements will need to be examined
- Example: Find value 25 in the array below:

index	0	1	2	3	4	5	6	7	8	9	10	11
value	-5	0	6	7	13	20	25	56	78	124	203	255
Min				Mid					Max			

Arrays.binarySearch()

```
// searches an entire sorted array for a given value  
// returns its index if found; a negative number if not found  
// Precondition: array is sorted
```

```
Arrays.binarySearch(array, value)
```

```
// searches given portion of a sorted array for a given value  
// examines minIndex (inclusive) through maxIndex (exclusive)  
// returns its index if found; a negative number if not found  
// Precondition: array is sorted
```

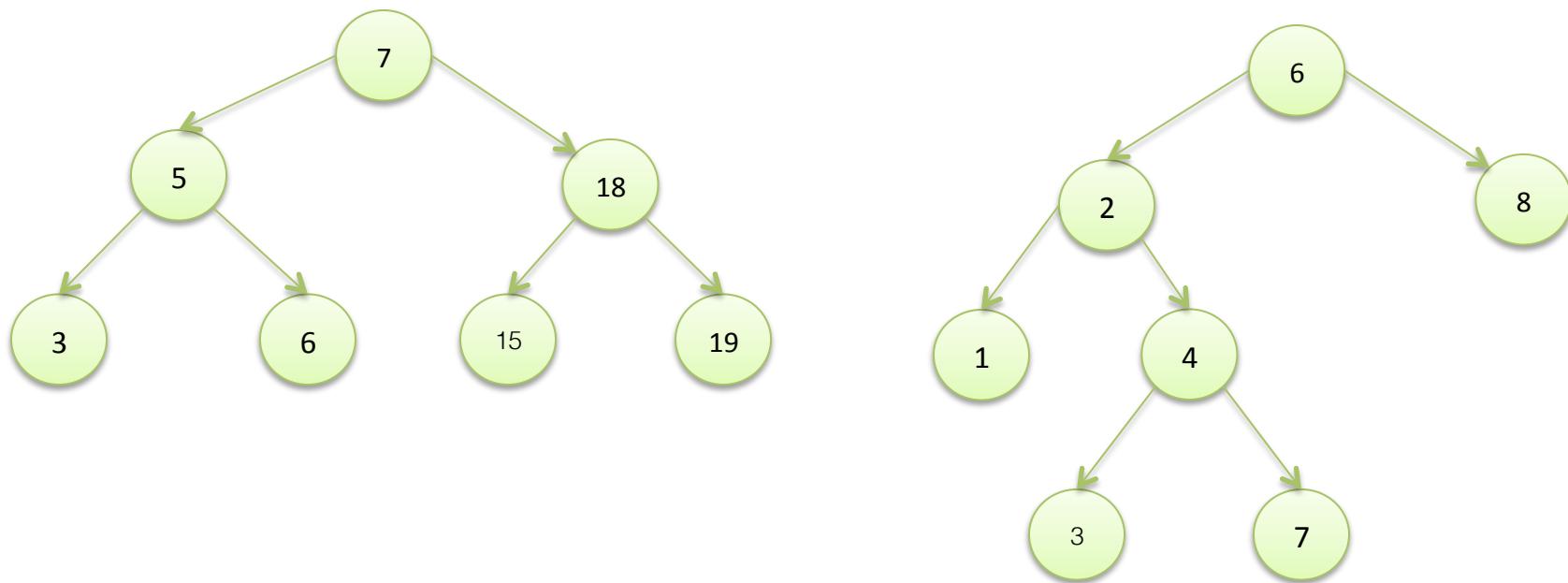
```
Arrays.binarySearch(array, minIndex, maxIndex, value)
```

- If the value is found, binarySearch() returns the index
- If the value is *not* found, binarySearch() returns $-(\text{insertionPoint} + 1)$, where insertionPoint is the index where the element *would* have been, if it had been in the array in sorted order

Binary Search Trees (BST)

- **Binary search tree** – a binary three that stores element in a sorted order
- Every non-empty node X of some BST has the property that:
 - Elements of X 's left subtree contain data **smaller than** X 's data
 - Elements of X 's right subtree contain data **greater than** X 's
 - X 's left and right subtrees are also binary search trees

Example: Binary Search Trees?



Class BinarySearchTree

```
public class BinarySearchTree <T extends Comparable <? super T>> {  
    private static class BinaryNode<T> {  
        //build binary node}  
  
    public BinaryNode<T> root;  
  
    public BinarySearchTree() {  
        root = null;  
    }  
  
    public void makeEmpty() {  
        root = null;  
    }  
  
    public boolean isEmpty() {  
        return root == null;  
    }
```

Class BinarySearchTree

```
public class BinarySearchTree <T extends Comparable <? super T>> {  
    private static class BinaryNode<T> {  
        //build binary node}  
  
    public boolean contains(T x) {  
        return contains(x, root);  
    }  
  
    public T findMin() {  
        if(isEmpty()) throw new NullPointerException();  
        return findMin(root).element;  
    }  
  
    public T findMax() {  
        if(isEmpty()) throw new NullPointerException();  
        return findMax(root).element;  
    }  
}
```

Class BinarySearchTree

```
public class BinarySearchTree <T extends Comparable <? super T>> {  
    private static class BinaryNode<T> {  
        //build binary node}  
  
    public void insert(T x) {  
        root = insert(x, root);  
    }  
  
    public void remove(T x) {  
        root = remove(x, root);  
    }  
}
```

Method private contains(T x, BinaryNode<T> node)

```
/**  
 * Internal method to find an item in a subtree.  
 * @param x is item to search for.  
 * @param node the node that roots the subtree.  
 * @return true if the item is found; false otherwise.  
 */  
private boolean contains(T x, BinaryNode<T> node) {  
    if(node == null)  
        return false;  
  
    int compareResult = x.compareTo(node.element );  
    if(compareResult < 0 )  
        return contains(x, node.left );  
    else if(compareResult > 0)  
        return contains(x, node.right);  
    else return true; // Match  
}
```

Methods `private findMin` and `findMax`

```
/** * Internal method to find the smallest item in a subtree.  
 * @param t the node that roots the subtree.  
 * @return node containing the smallest item.  
 */  
private BinaryNode<T> findMin(BinaryNode<T> t) {  
    if(t == null)  
        return null;  
    else if(t.left == null)  
        return t;  
    return findMin(t.left);  
}  
  
/** * Internal method to find the largest item in a subtree.  
 * @param t the node that roots the subtree.  
 * @return node containing the largest item.  
 */  
private BinaryNode<T> findMax(BinaryNode<T> t) {  
    if(t == null)  
        return null;  
    while(t.right != null)  
        t = t.right;  
    return t;  
}
```

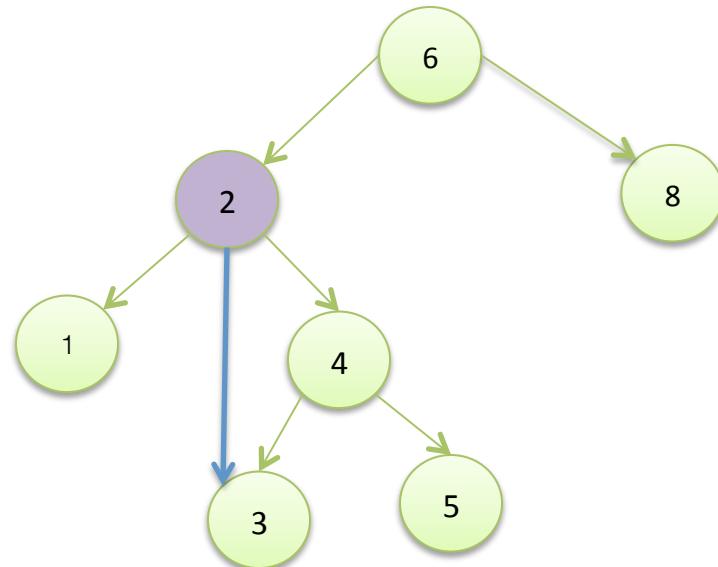
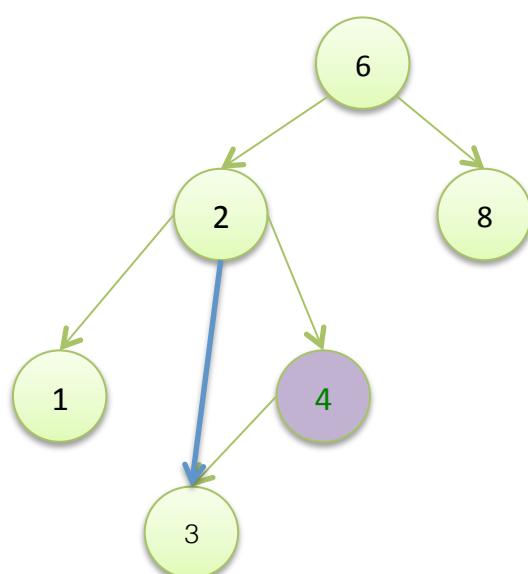
Methods

```
private insert(T x,
BinaryNode<T> t)
```

```
/**  
 * Internal method to insert into a subtree.  
 * @param x the item to insert.  
 * @param t the node that roots the subtree.  
 * @return the new root of the subtree.  
 */  
private BinaryNode<T> insert(T x, BinaryNode<T> node) {  
    if(t == null) {  
        return new BinaryNode<>(x, null, null);  
    }  
  
    int compareResult = x.compareTo(node.element);  
  
    if(compareResult < 0)  
        node.left = insert(x, node.left);  
    else if(compareResult > 0)  
        node.right = insert(x, node.right);  
    else  
        return node; //duplicate, do nothing  
}
```

Methods `private remove(T x,` `BinaryNode<T> t)`

- Deletion – the hardest operation
- Once the node to delete has been found, we need to consider several possibilities:
 - Node is a leaf – can be deleted immediately
 - Node has one child – can be deleted after its parent adjusts a link to bypass it
 - Node has two children – replace data of that node with the smallest data of the right subtree



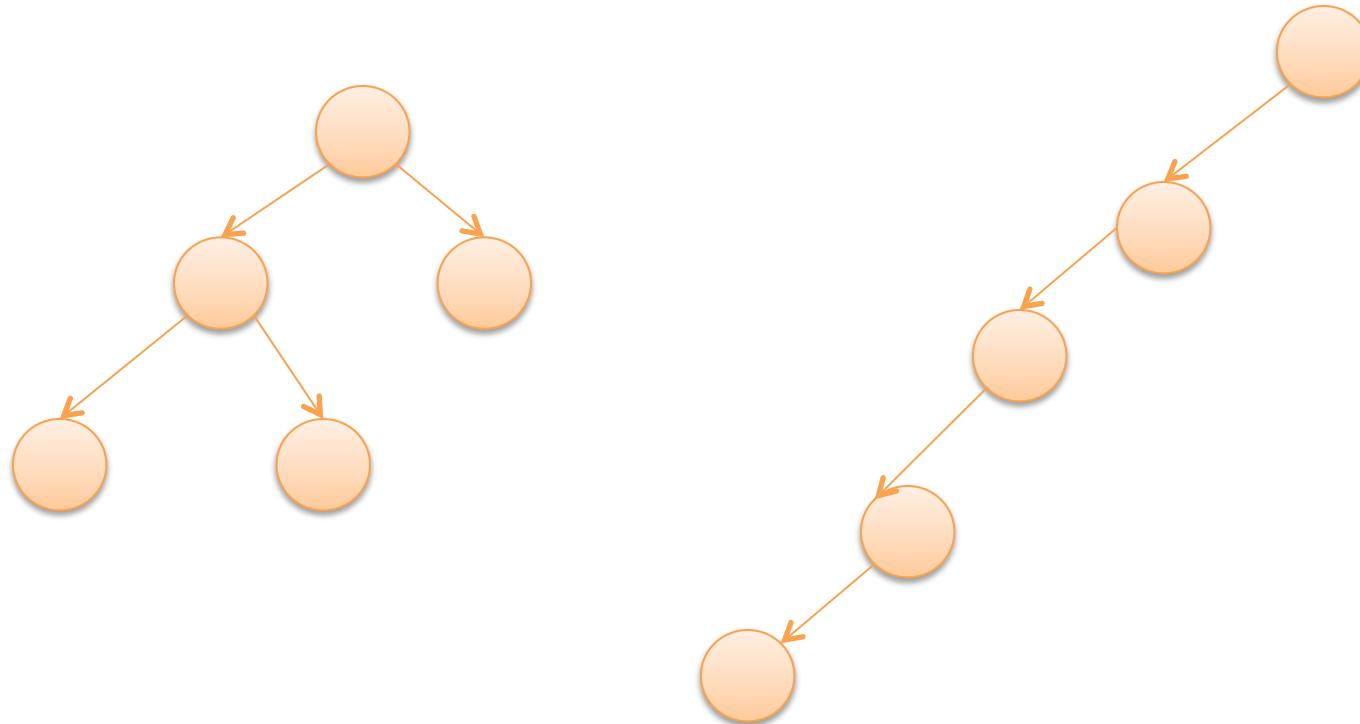
- Lazy deletion – when an element should be deleted, it is left in the tree, and merely marked as being deleted

Algorithms and Data Structures 2

BALANCED AND AVL TREES

Tree Balance and Height

- If the same data can be represented multiple ways, what is best?



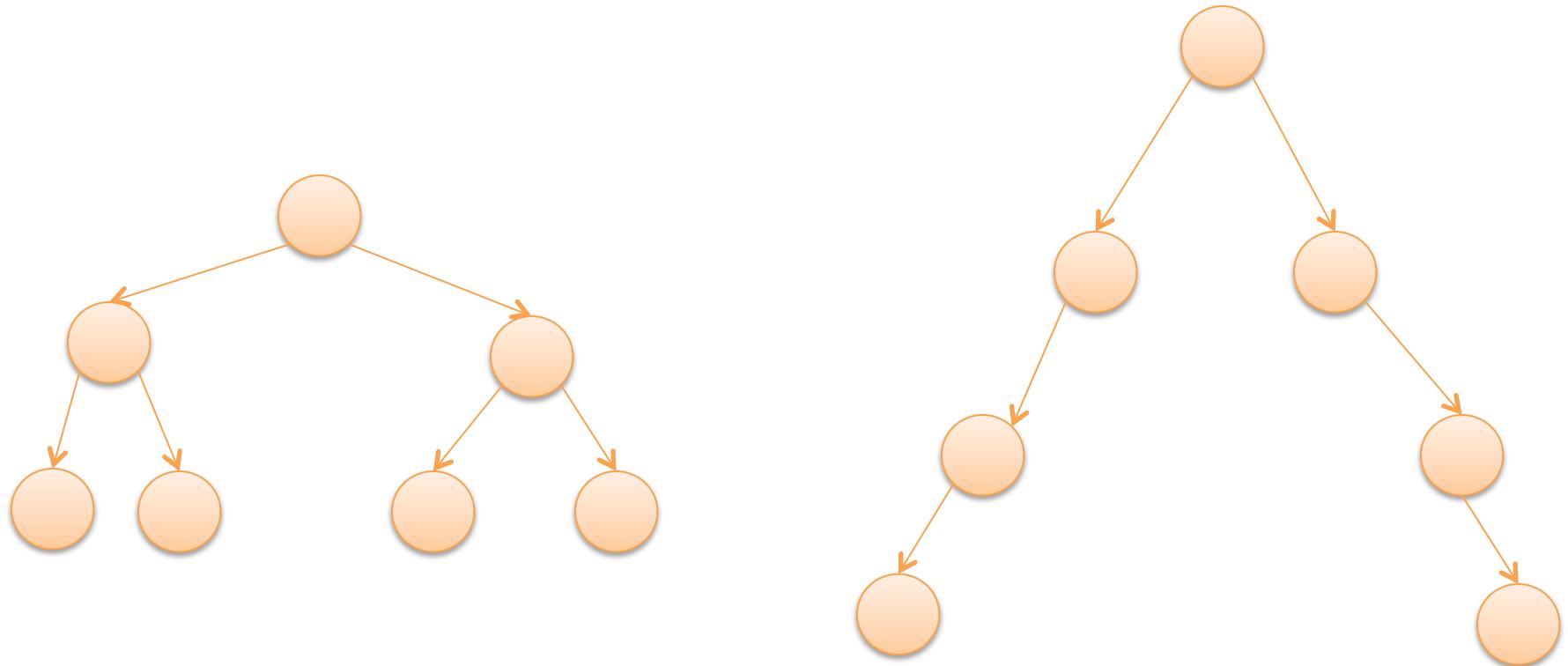
Tree Balance and Height

- If the same data can be represented multiple ways, what is best?
- Height is key for how fast functions on our tree are!
- If we can structure the same data two different ways, we may want to choose a balanced structure (better for BSTs)
- Can we enforce balance?

Tree Balance and Height

- How might we define balance?
- If the heights of the left and right trees are balanced, the tree is balanced, so:
 $\text{Abs}(\text{height(left)} - \text{height(right)})$
- Anything wrong with this?

Tree Balance and Height



Tree Balance and Height

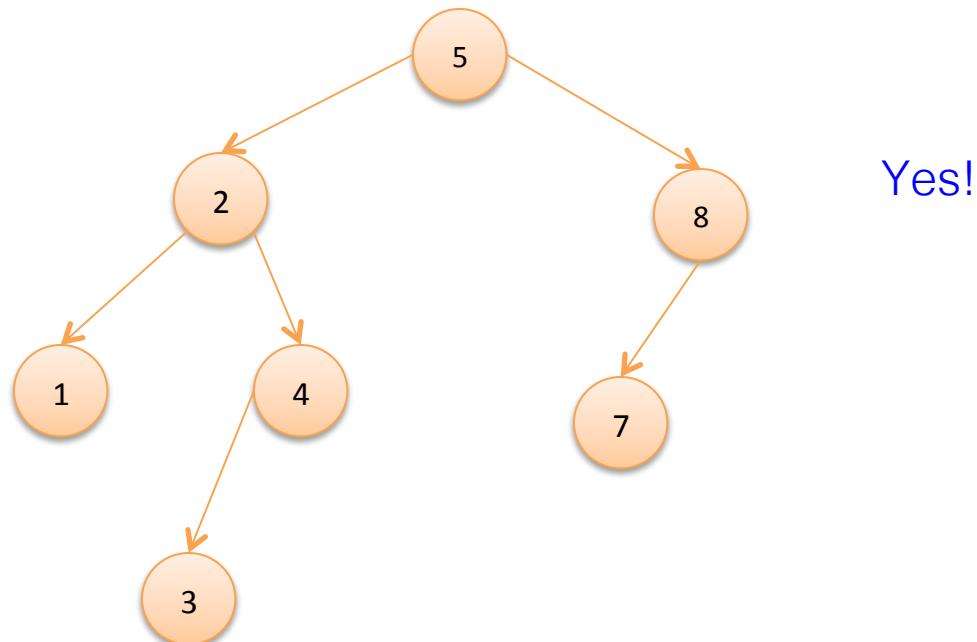
- It is not enough for the root to be balanced
- All nodes must be balanced
- Ideally, our “balance” property should say:
 - For all nodes in the tree, $\text{level}(\text{left}) = \text{level}(\text{right})$
- What is the problem with this? Not always enforceable!

AVL (Adelson-Velskii-Landis) Tree

- AVL tree – binary search tree with a balance condition (AVL condition):
 - The height of the left and right subtrees differ by at most 1
- The height of an empty tree defined to be -1
- All tree operations (exception insertion) can be performed in $O(\log N)$

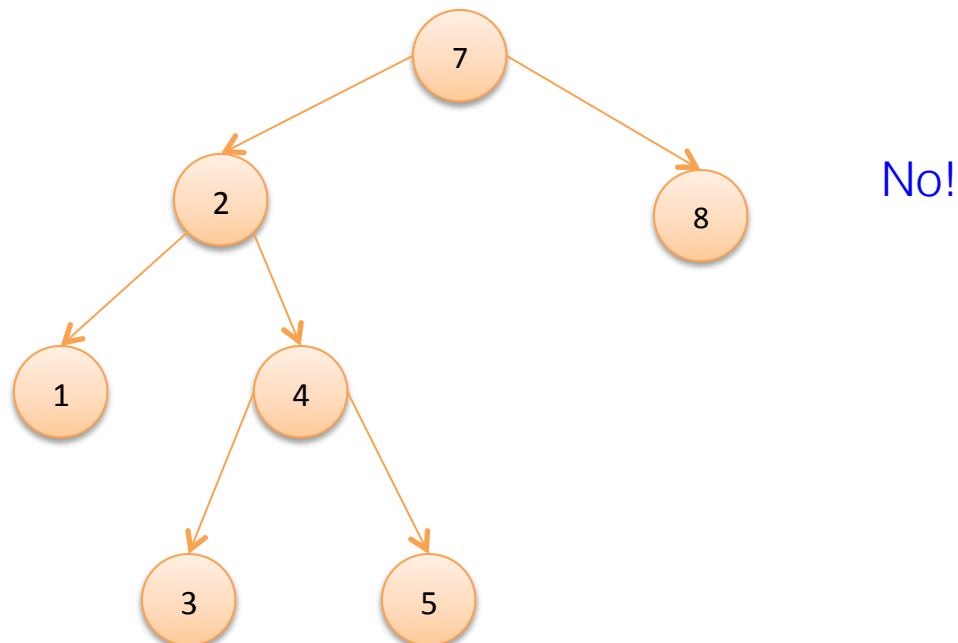
Example: AVL Trees??

- Is this an AVL tree?



Example: AVL Trees??

- Is this an AVL tree?



AVL Operations

- Since AVL trees are also BST trees, they should support the same functionality:
 - `insert(T x, BinaryNode<T> node)`
 - `find(T x)` – same as BST
 - `delete(T x)`
- **Problem:** inserting the node could violate the AVL property
- **Solution:** the AVL property maintained as we add the node → **simple tree modification, rotation**

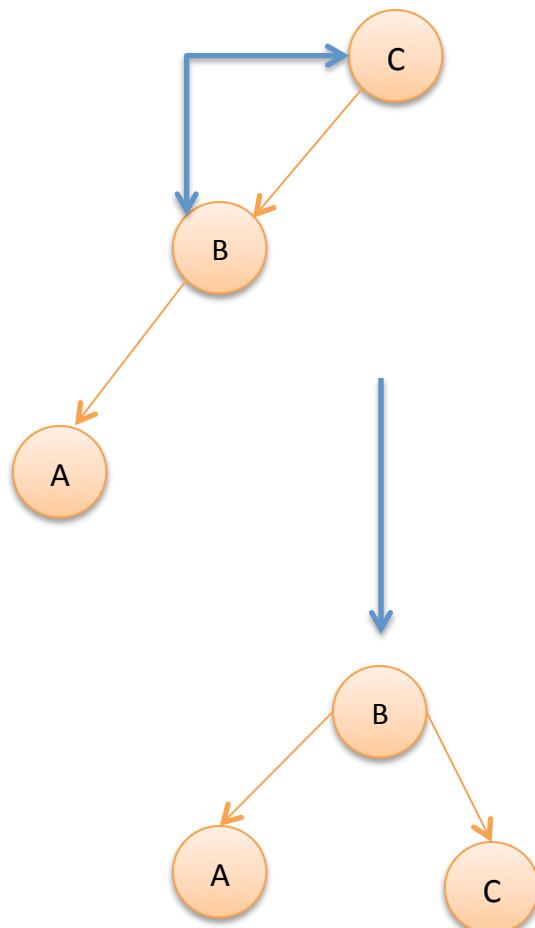
AVL insert() Operation

- Possible insertions:
 1. Insertion into the left subtree of the left child of X
 2. Insertion into the right subtree of the left child X
 3. Insertion into the left subtree of the right child of X
 4. Insertion into the right subtree of the right child of X

Single and Double AVL Rotations

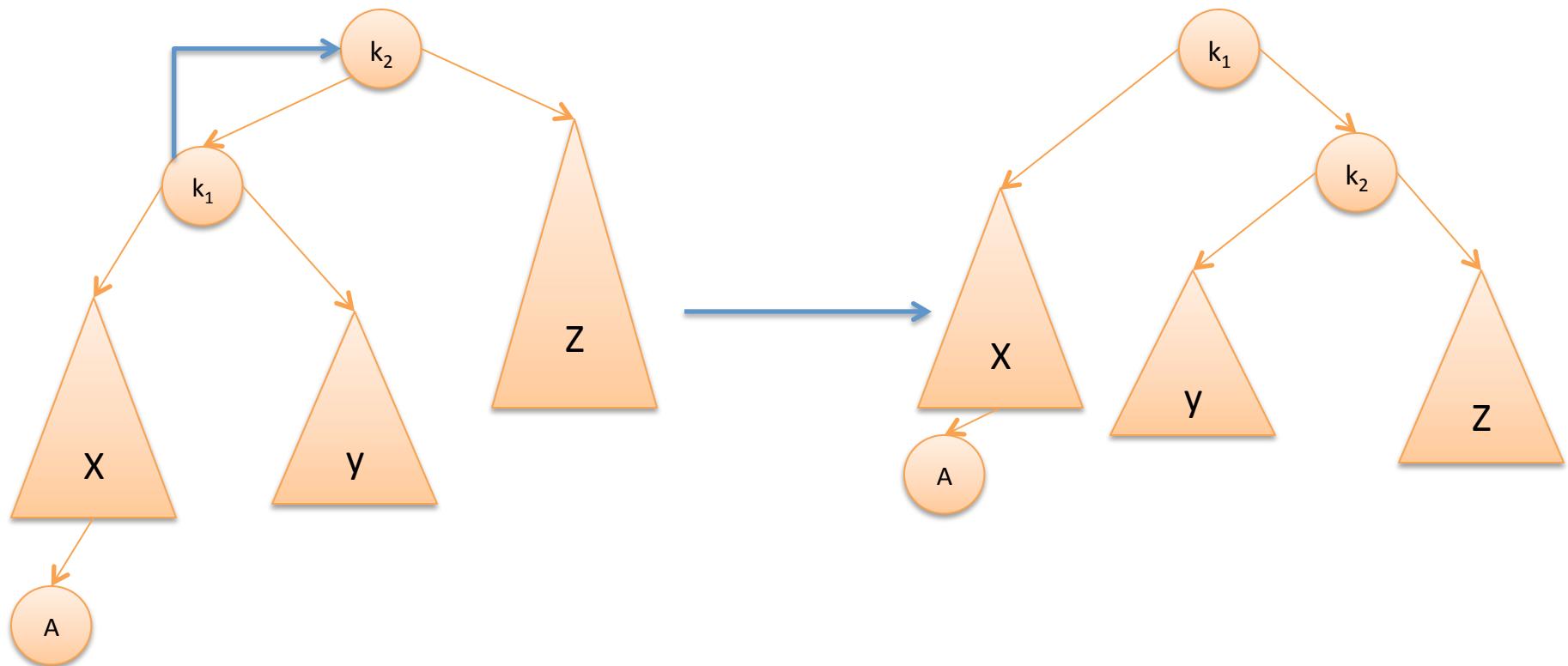
- In cases 1 and 4, the insertions occurs on the “outside”:
 - Left-left insertion (case 1)
 - Right-right insertion (case 2)
- Outside insertions can be “fixed” using **single rotations**
- Similarly, in cases 2 and 3, the insertions occur on the “inside”:
 - Left-to-right (case 2)
 - Right-to-left (case 3)
- Inside rotations require **double rotations** to fix imbalance
- **Caution: with an insertion, a balance might not be off on the parent → it could be somewhere up the tree**

Left-to-left Insertion and AVL Rotation

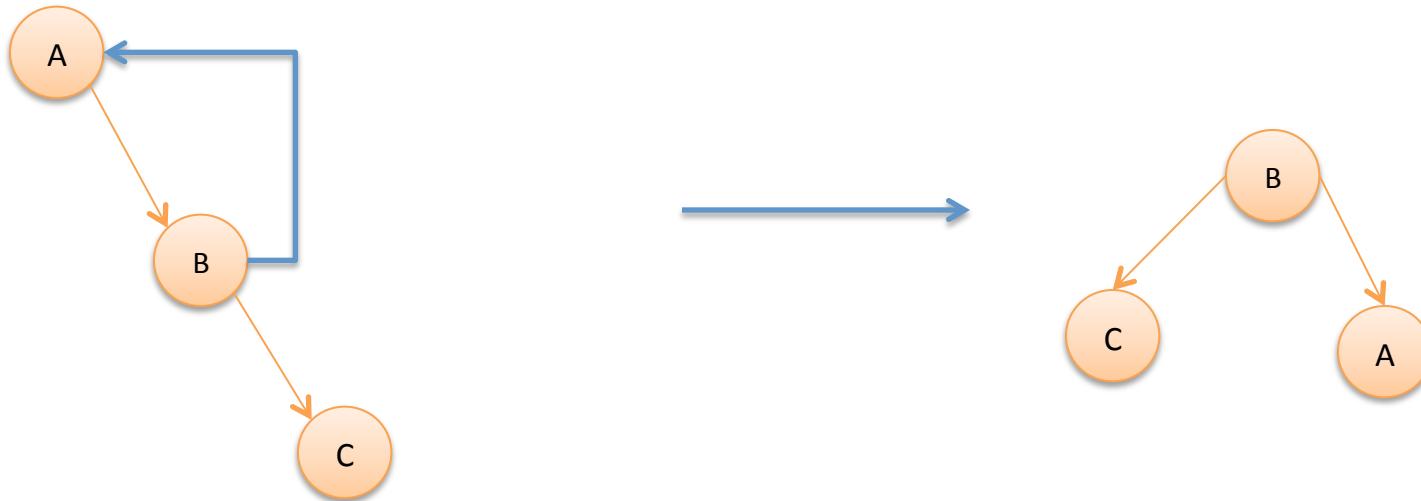


- **Problem:** not balanced anymore
- To correct this insertion – **left rotation:**
- B must become the root
- A must become the left child of B

General Rotation for Left-to-left Insertion

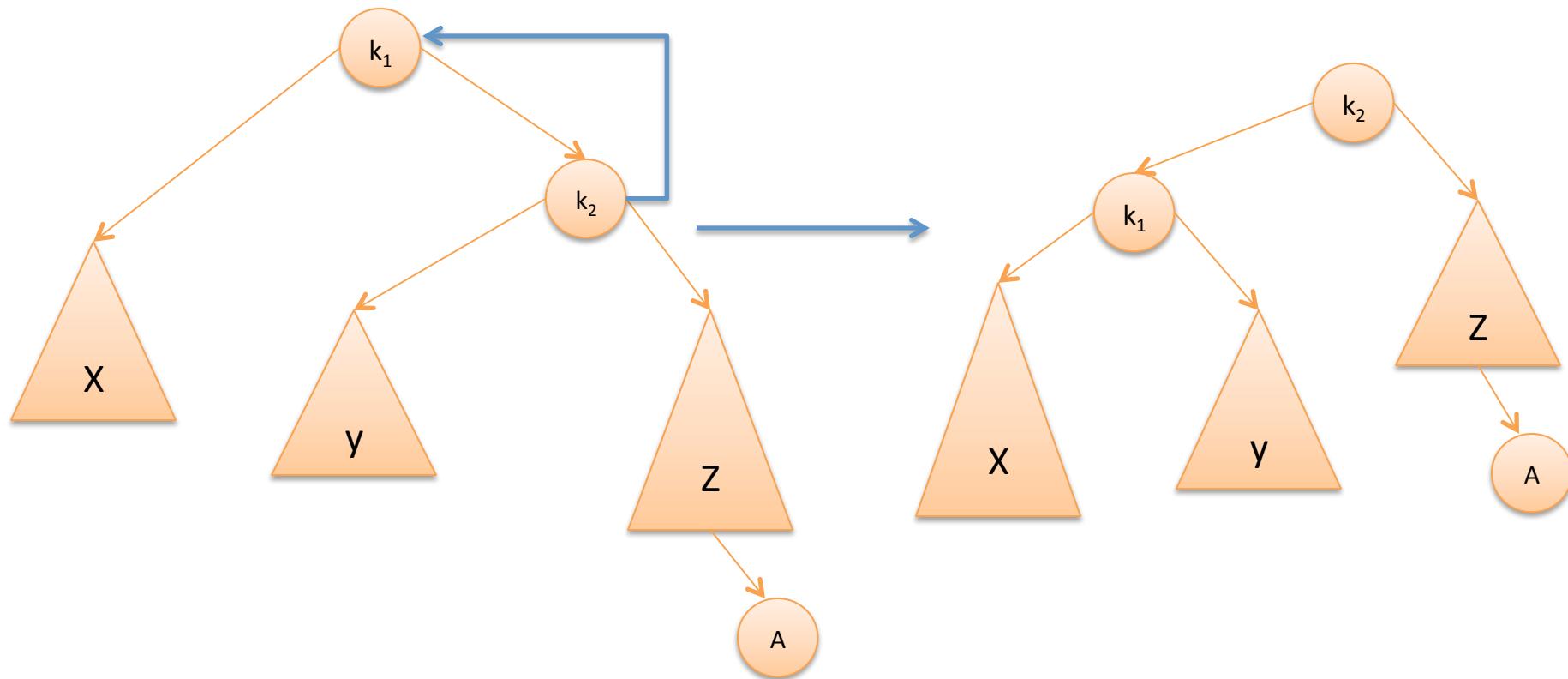


Right-to-Right Insertion and AVL Rotation

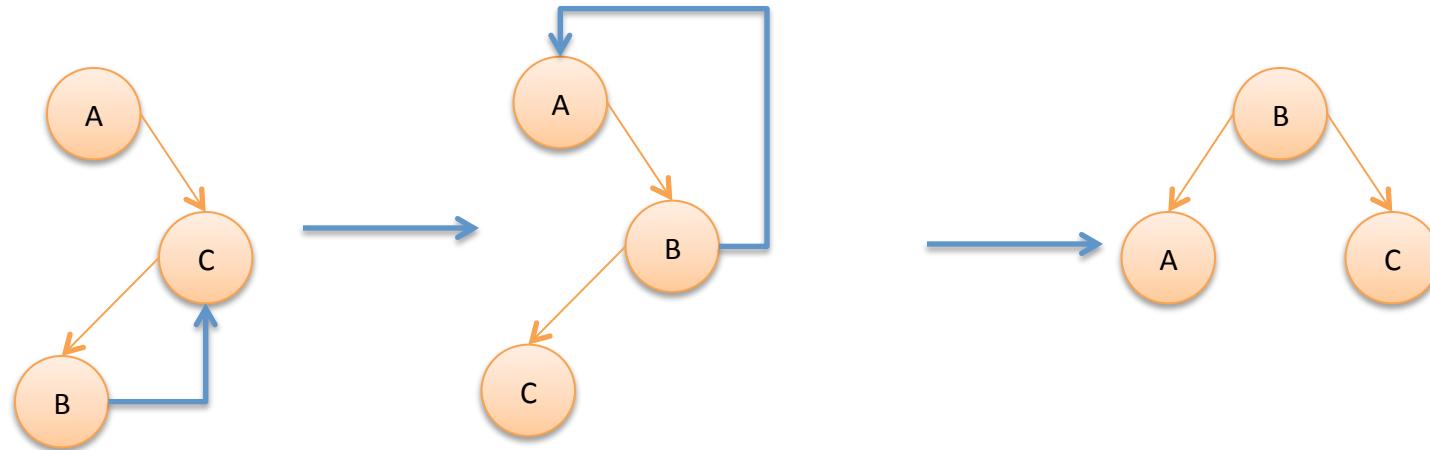


- Problem symmetric to the left-to-left insertion – not balanced anymore
- To correct this insertion – **right rotation**:
 - B must become the root
 - A must become the right child of B

General Rotation for Right-to-Right Insertion

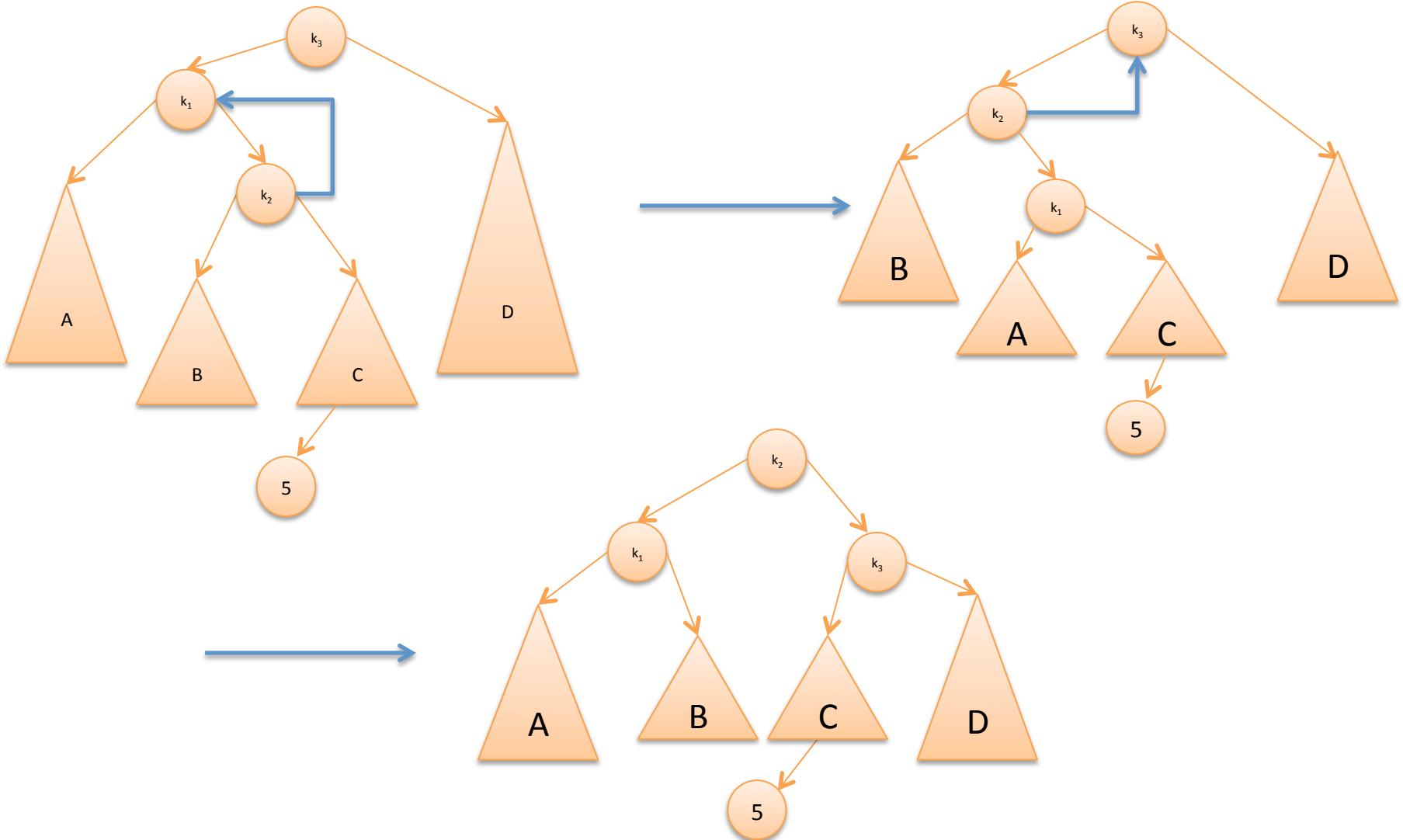


Left-Right Insertion and Double AVL Rotation

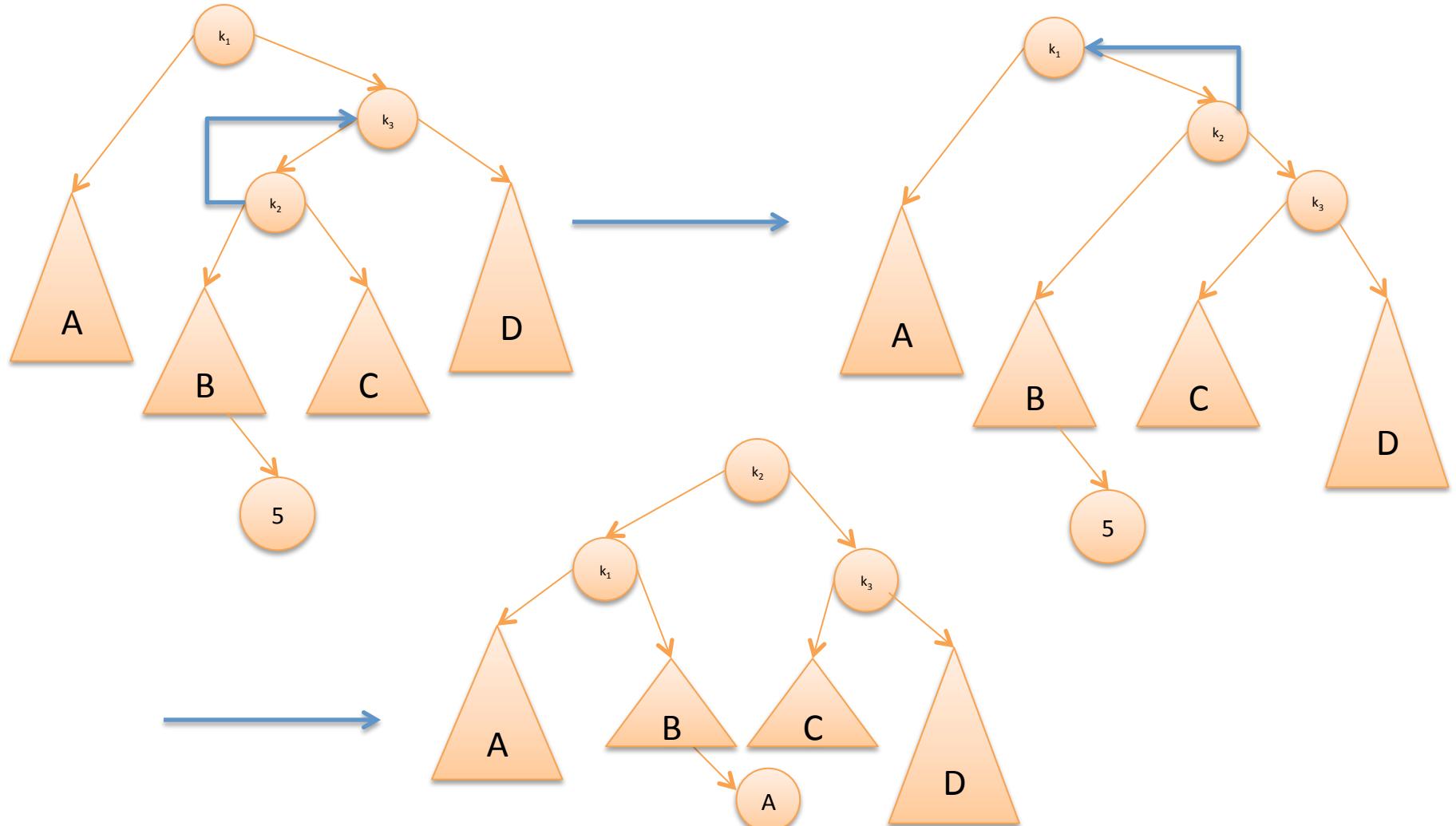


- **Problem:** not balanced anymore
- Identifying what should be the new root is key
- Imagine “lifting” up the root
- Where will the children have to go to maintain the search property?

General Double Rotation for Left-Right Insertion



General Double Rotation for Right-Left Insertion



Class AVLNode

```
private static class AvlNode<T> {  
    T element; //data in the node  
    AvlNode<T> left; //Left child  
    AvlNode<T> right; //Right child  
    int height; //Height  
  
    // Constructors  
    AvlNode(T theElement) {  
        this(theElement, null, null);  
    }  
  
    AvlNode(T theElement, AvlNode<T> left, AvlNode<T> right) {  
        element = theElement;  
        left = left;  
        right = right;  
        height = 0;  
    }  
}
```

Method insert

```
/**  
 * Internal method to insert into a subtree.  
 * @param x the item to insert.  
 * @param t the node that roots the subtree.  
 * @return the new root of the subtree.  
 */  
  
private AvlNode<T> insert (T x, AvlNode<T> t) {  
  
    if (t == null)  
        return new AvlNode(x, null, null);  
    int compareResult = x.compareTo(t.element);  
  
    if(compareResult < 0)  
        t.left = insert(x, t.left);  
    else if(compareResult > 0)  
        t.right = insert(x, t.right);  
    else  
        return balance(t); //Duplicate, do nothing  
}
```

Method balance

```
private static final int ALLOWED_IMBALNCE = 1;

//Assume t is either balanced or within one of being balanced
Private AvlNode<T> balance(AvlNode<T> t) {
    if(t == null)
        return t;
    if(t.left.height - t.right.height > ALLOWED_IMBALANCE)
        if(t.left.left.height >= t.left.right.height)
            t.rotateWithLeftChild(t);
        else
            t.doubleWithLeftChild(t);
    else(t.right.height - t.left.height > ALLOWED_IMBALANCE)
        if(t.right.right.height >= t.right.left.height)
            t.rotateWithRightChild(t);
        else
            t.doubleWithRightChild(t);

    t.height = Math.max(t.left.height, t.right.height) + 1;
    return t;
}
```

Method rotateWithLeftChild

```
/**  
 *Rotate binary tree node with left child.  
 *For AVL tree, this is a single rotation for case 1.  
 *Update heights, then return new root.  
 */  
  
private AvlNode<T> rotateWithLeftChild(AvlNode<T> k2) {  
    AvlNode<T> k1 = k2.left;  
    k2.left = k1.right;  
    k2.right= k2;  
    k2.height = Math.max(k2.left.height, k2.right.height) + 1;  
    k1.height = Math.max(k1.left.height, k2.right.height) + 1;  
    return k1;  
}
```

Method doubleWithLeftChild

```
/**  
*Double rotate binary tree, first left child with its right child,  
then node k3 with new left child.  
*For AVL tree, this is a double rotation for case 2.  
*Update heights, then return new root.  
*/  
  
private AvlNode<T> doubleWithLeftChild(AvlNode<T> k3) {  
    k3.left = rotateWithrightChild(k3.left);  
    return rotateWithLeftChild(k3);  
}
```

AVL Trees – Concluding Remarks

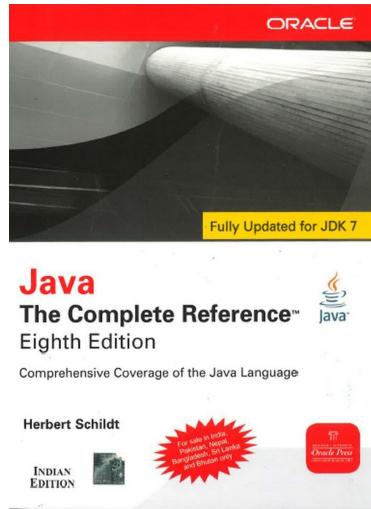
- If AVL rotation can enforce $O(\log n)$ height, what are the asymptotic runtimes for our functions?
 - $\text{insert}(T x, \text{AvlNode node}) = O(\log n) + \text{balancing}$
 - $\text{find}(T x) : O(\text{height}) = O(\log n)$
- How expensive is balancing?
- There are at most three nodes and four subtrees to move around $\rightarrow O(1)$

Algorithms and Data Structures 2

SETS AND MAPS

Sets

- Write a program to count the number of occurrences of every unique word in a large text file (e.g. *Java Reference Manual*)



[Pictures credit: <https://images-na.ssl-images-amazon.com/images/I/61rKnDmww9L.jpg>]

- Possible approach: sets

Sets

- Write a program to count the number of occurrences of every unique word in a large text file (e.g. *Java Reference Manual*)
- Possible approach:
 - Store the words in a collection
 - Report the # of unique words
 - Additionally: once you have this collection, allow a user to search it, to see whether various words appear in the text file
- Question: what is an appropriate data collections for this?
- Answer: Set

Sets



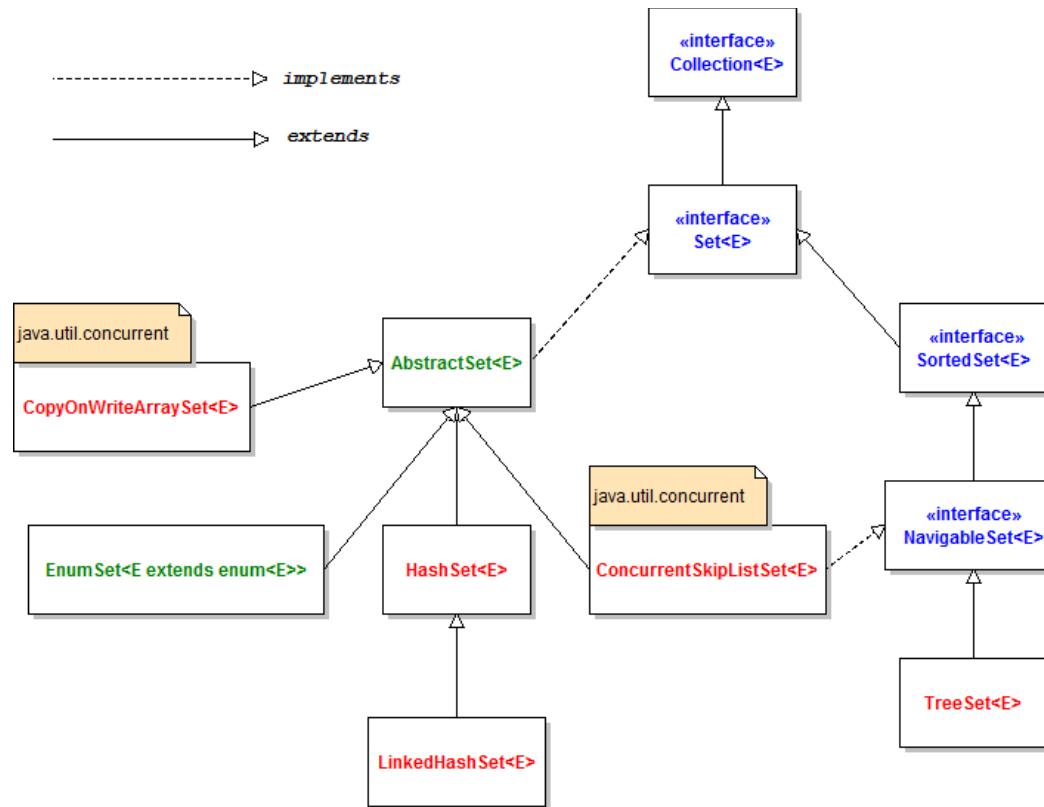
[Pictures credit: https://www.beyondtheblackboard.com/components/com_virtuemart/shop_image/product/full/SET---Box---Transparent-Background---8-22-11_0.png]

Sets

- Set - a collection of unique values (no duplicates allowed) that can perform the following operations efficiently:
 - add,
 - remove,
 - search (contains)
- We don't think of a set as having indexes; we just add things to the set in general and don't worry about order



Set API Class Diagram



[Pictures credit: [http://www.codejava.net/images/articles/javacore/collections/
Set%20API%20class%20diagram.png](http://www.codejava.net/images/articles/javacore/collections/Set%20API%20class%20diagram.png)]

Set Implementations

- In Java, sets are represented by Set type in `java.util`
- Set is implemented by `HashSet` and `TreeSet` classes
 - `HashSet`: implemented using a "hash table" array
 - Very fast: $O(1)$ for all operations
 - Elements are stored in unpredictable order
 - `TreeSet`: implemented using a binary search tree
 - Pretty fast: $O(\log N)$ for all operations
 - Elements are stored in sorted order
 - `LinkedHashSet`:
 - $O(1)$ but stores in order of insertion, but slightly slower than `HashSet` because of extra info stored

Set Methods

- We can construct an empty set, or one based on a given collection
- Examples:

```
Set<Integer> set = new TreeSet<Integer>(); // empty
```

```
List<String> list = new ArrayList<String>();
```

```
...
```

```
Set<String> set2 = new HashSet<String>(list);
```

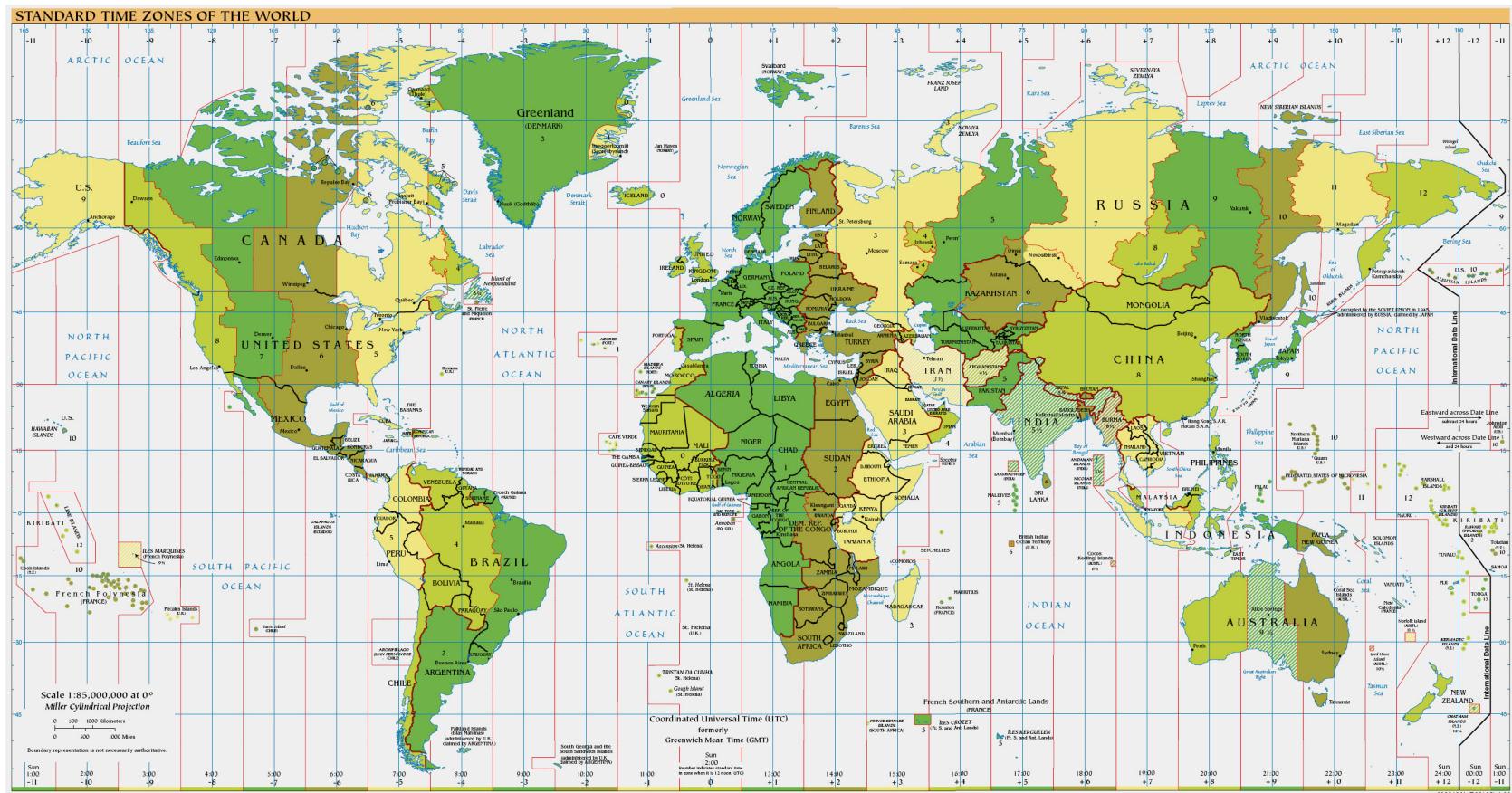
Set Methods

add (value)	adds the given value to the set
contains (value)	returns true if the given value is found in this set
remove (value)	removes the given value from the set
clear ()	removes all elements of the set
size ()	returns the number of elements in list
isEmpty ()	returns true if the set's size is 0
toString ()	returns a string such as "[3, 42, -7, 15]"

Maps

- Write a program that stores, modifies and retrieves:
 - Assignment grades for every student in this College
 - Financial information for every client of some bank
 - Browsing history for every user of some search engine
 - Searches and transactions for every user of some online retailer
 - Activity and likes of every user of some online platform
- Question: What do these records have in common?
- The way we think about them → every data sample has a unique user → unique ID (key)
- What is the appropriate data collection for this data?
- Maps

Maps



[Pictures credit: https://theodora.com/maps/new9/time_zones_4.jpg]

Maps

- **Map** – a data collection that holds a set of unique *keys* and a collection of *values*, where each key is associated with one value
- Also known as:
 - Dictionary
 - Associative array
 - Hash
- Basic map operations:
 - **put(key, value)** - adds a mapping from a key to a value
 - **get(key)** - retrieves the value mapped to the key
 - **remove(key)** - removes the given key and its mapped value

Map Implementations

- In Java, maps are represented by `Map` type in `java.util`
- Map is implemented by the `HashMap` and `TreeMap` classes
 - `HashMap` - implemented using a "hash table"
 - Extremely fast: $O(1)$
 - Keys are stored in unpredictable order
 - `TreeMap` - implemented as a linked "binary tree" structure
 - Very fast: $O(\log N)$
 - Keys are stored in sorted order
 - `LinkedHashMap` - $O(1)$
 - Keys are stored in order of insertion

Map Implementations

- Map requires 2 types of parameters:
 - One for keys
 - One for values
- Example:

```
// maps from String keys to Integer values  
Map<String, Integer> votes = new HashMap<String, Integer>();
```

Map Methods

<code>put(key, value)</code>	adds a mapping from the given key to the given value; if the key already exists, replaces its value with the given one
<code>get(key)</code>	returns the value mapped to the given key (<code>null</code> if not found)
<code>containsKey(key)</code>	returns <code>true</code> if the map contains a mapping for the given key
<code>remove(key)</code>	removes any existing mapping for the given key
<code>clear()</code>	removes all key/value pairs from the map
<code>size()</code>	returns the number of key/value pairs in the map
<code>isEmpty()</code>	returns <code>true</code> if the map's size is 0
<code>toString()</code>	returns a string such as " <code>{a=90, d=60, c=70}</code> "

keySet and Values

- keySet method returns a **Set** of all keys in the map
 - It can loop over the keys in a `foreach` loop
 - It can get each key's associated value by calling `get` on the map
- Example:

```
Map<String, Integer> ages = new TreeMap<String, Integer>();  
ages.put("Marty", 19);  
ages.put("Geneva", 2); // ages.keySet() returns Set<String>  
ages.put("Vicki", 57);  
for (String name : ages.keySet()) {           // Geneva -> 2  
    int age = ages.get(name);                  // Marty -> 19  
    System.out.println(name + " -> " + age); // Vicki -> 57  
}
```

Methods keySet and values

- values method returns a collection of all values in the map
 - It can loop over the values in a `foreach` loop
 - No easy way to get from a value to its associated key(s)

<code>keySet ()</code>	returns a set of all keys in the map
<code>values ()</code>	returns a collection of all values in the map
<code>putAll (map)</code>	adds all key/value pairs from the given map to this map
<code>equals (map)</code>	returns <code>true</code> if given map has the same mappings as this one

Example: Maps

- Many words are similar to other words
- For example word wine can become:
 - dine, fine, line, mine, nine, pine, or vine
 - wide, wife, wipe, or wire
 - wind, wing, wink, or wins
- Write a program to find all words that can be changed into at least 15 other words by a single one-character substitution
- Assume that:
 - We have a dictionary consisting of approximately 89,000 different words of varying lengths
 - Most words are between 6 and 11 characters

[Coding Example]

Algorithms and Data Structures 2

HASHING AND HASH FUNCTIONS

Introduction to Hashing

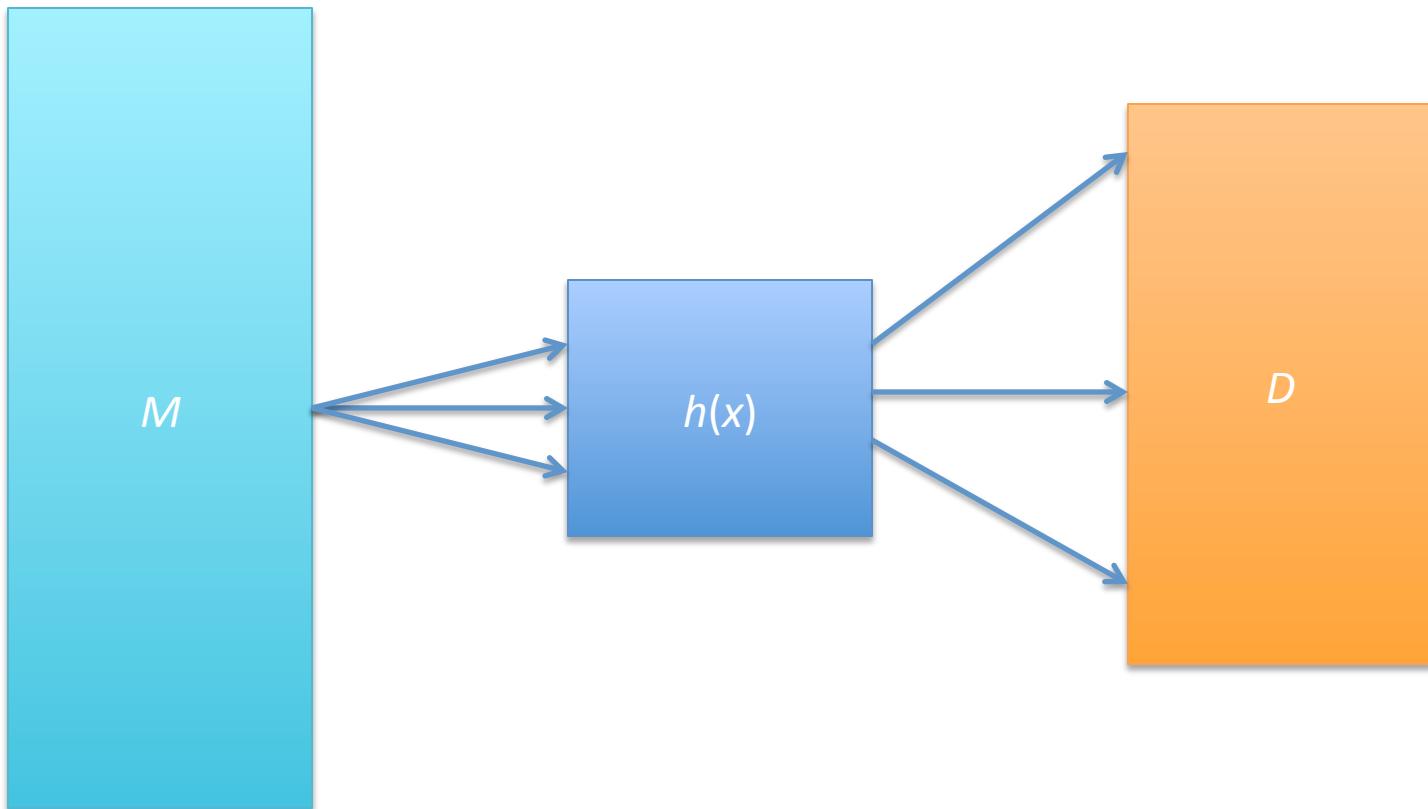
- Suppose we have a large set of items M
- Set M contains the subset D , where $D \ll M$ of items that we actually care about
- **Example:** M may be English dictionary, and D maybe a set of English words we use in everyday life
- **Problem:** How to store data such that we use only $O(D)$ memory, while achieving fast $O(1)$ access

Introduction to Hashing

- **Memory: A Hash Table**
 - Consider an array of size $c * D$
 - Each index in the array corresponds to *some* element in M that we want to store
 - The data in D does not need any particular ordering
- **Possible approaches:**
 - Unsorted array – search takes $O(D)$
 - Sorted array – search still takes $O(D)$
 - Random mapping – search still takes $O(D)$

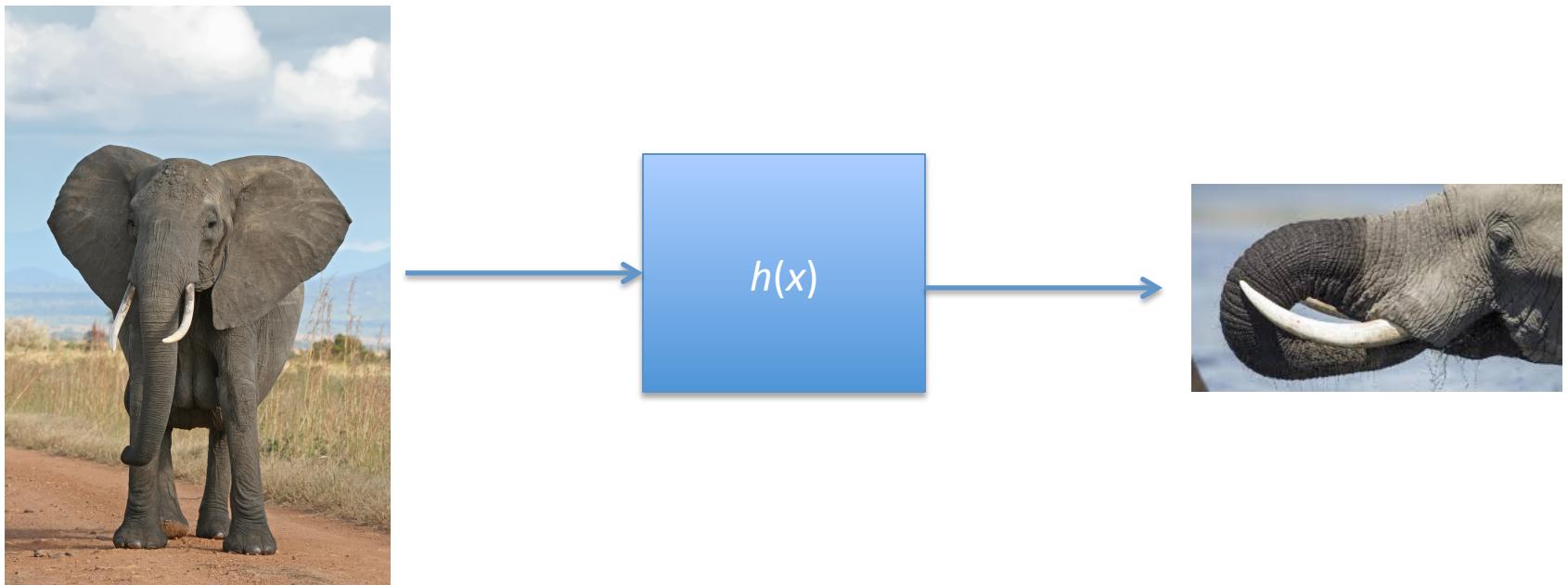
Introduction to Hashing

- Another possible approach – pseudo-random mapping using a hash function $h(x)$



Introduction to Hash Functions

- **Hash function** - maps the large space M into target space D



[Pictures credit: https://upload.wikimedia.org/wikipedia/commons/3/37/African_Bush_Elephant.jpg
https://aos.iacpublishinglabs.com/question/aq/1400px-788px/what-are-elephant-tusks-used-for_3c174bec-bd85-4fab-a617-7a1a33f14c62.jpg?domain=cx-aos.ask.com]

Introduction to Hash Functions

- Hash function - maps the large space M into target space D
- Desired properties of hash functions:
 - Repeatability:
 - For every x in D , it should always be $h(x) = h(x)$
 - Equally distributed:
 - For some y, z in D , $P(h(y)) = P(h(z))$
 - Constant-time execution: $h(x) = O(1)$

Simple Hash Function

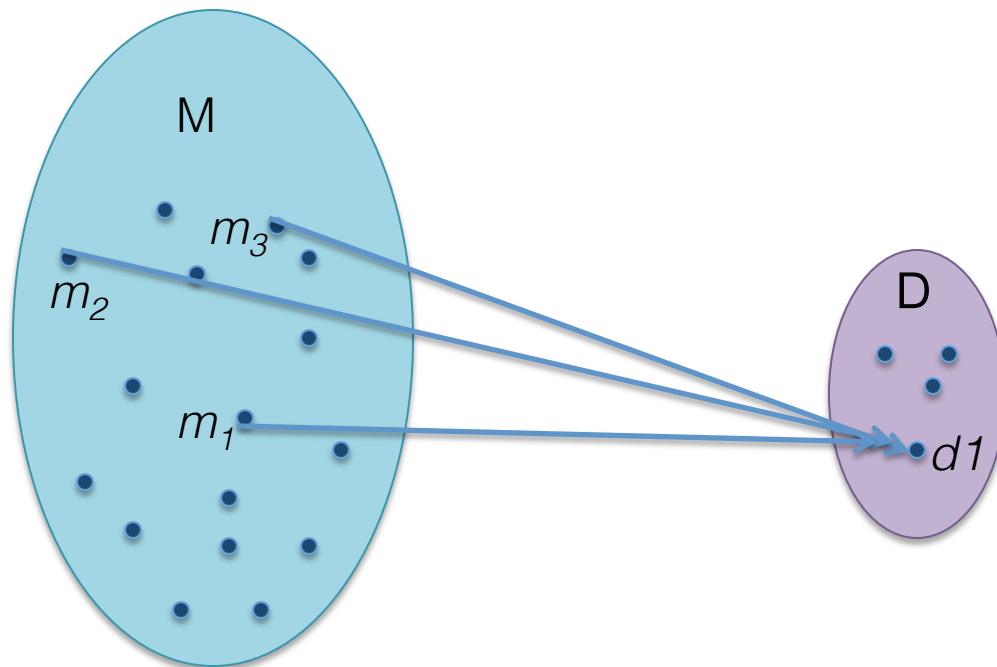
```
/*
 * A hash method for String objects.
 * @param key the String to hash.
 * @param tableSize the size of the hash table.
 * @return the hash value.
 */
public static int hash(String key, int tableSize) {
    int hashVal = 0;

    for(int i=0; i<key.length(); i++)
        hashVal = 37 * hashVal + key.charAt(i);

    hashVal %= tableSize;
    if(hashVal < 0)
        hashVal += tableSize;
    return hashVal;
}
```

Problems with Hash Functions

- **Hash function** – can be thought of as a “lossy compression function”, since $|M| \ll |D|$



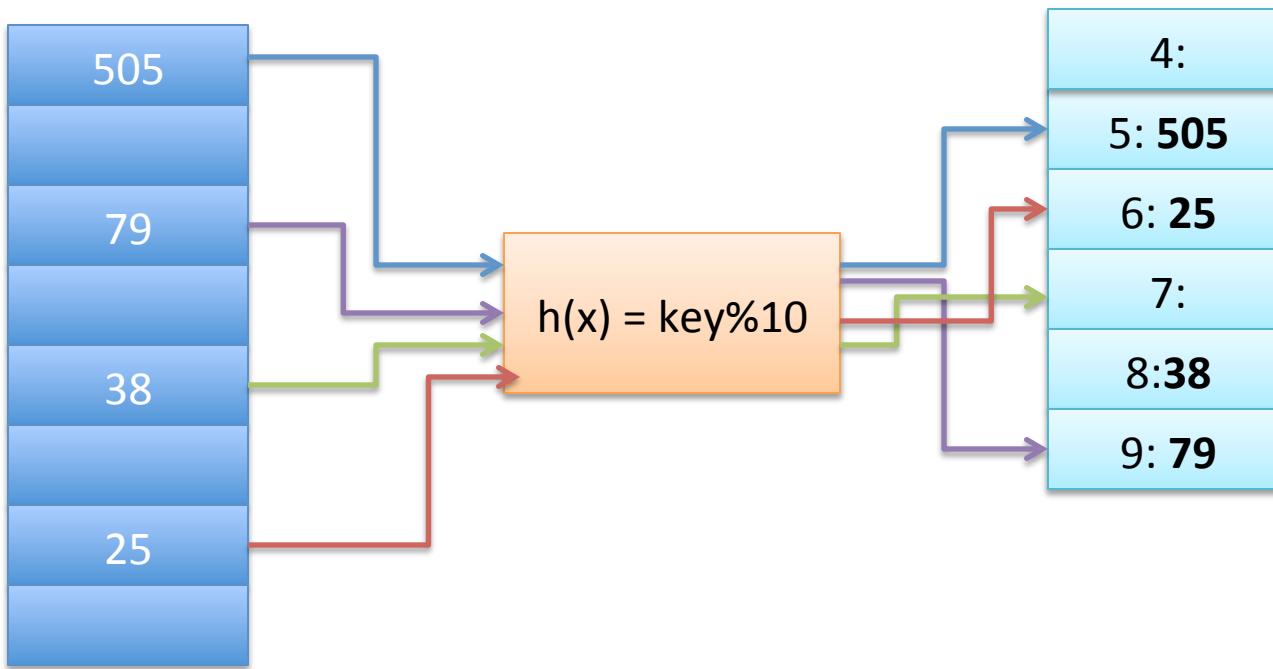
- Do you see any problems here?
- Yes, collision!

Resolving Collisions

- Hash function – can be thought of as a “lossy compression function”, since $|M| \ll |D|$
- Problem – collision
- Possible approaches to resolve collisions:
 - Store data in the next available space
 - Store both in the same space
 - Try a different hash
 - Resize the array

Resolving Collisions – Linear Probing

- **Linear probing – a simple approach**
 - When a collision occurs, find the next available spot in the array



Problems with Linear Probing

- Linear probing – a simple approach
 - When a collision occurs, find the next available spot in the array
- Searching for some element x :
 - Go to position $h(x)$, then cycle through all entries until you either find the element, or the blank space
- Adding an element y , that should go to the position taken by the colliding element:
 - Add element y to the next available spot - clustering

Problems with Linear Probing

- If a cluster becomes too large, it may have negative consequences on the hashing performance:
 - The chances of collision with the cluster increase
 - The time it takes to find something in the cluster increases, and it isn't $O(1)$

Quadratic Probing

- Whereas linear probing increments indices by one each time, quadratic probing goes through the squares
- For example, linear probing would check index 3, then:
 - $3+1$,
 - $3+2$,
 - $3+3$,
 - $3+4$ etc.
- Quadratic probing would check index 3, then
 - $3+1$,
 - $3+4$
 - $3+9$
 - $3+16$ etc.

Problems with Quadratic Probing

- Example: Consider a hash function for ints,
 $h(x) = x \% 7$
- Insert, 3, 10, 17, 24, 31, 38
- What happens? Where does 31 go?
 - $31 \% 7 = 3$
 - $3 + 1 \% 7 = 4$
 - $3 + 2 \% 7 = 5$
 - $3 + 4 \% 7 = 0$
 - $3 + 9 \% 7 = 5$
 - $3 + 16 \% 7 = 5$

0: 17
1
2
3: 3
4: 10
5: 24
6

Problems with Quadratic Probing

- **Secondary clustering problem**
 - Even when there is space available in the table, quadratic probing is not guaranteed to find an opening
 - In fact, half the array has to be empty to guarantee an opening
 - This approach reduces the $O(n)$ problem of linear probing, but it introduces even larger memory constraints
 - .

Secondary Hashing

- If two keys collide in the hash table, then a secondary hash indicates the probing size
- Need to be careful, possible for infinite loops with a very empty array

Chaining

- Rather than probing for an open position, we could just save multiple objects in the same position
 - Some data structure is necessary here
 - Commonly a linked list, AVL tree or secondary hash table
- Resizing isn't necessary, but if you don't, you will get $O(n)$ runtime

Hash Functions

- In reality, good hash functions are difficult to produce
- We want a hash that distributes our data evenly throughout the space
- Usually, our hash function returns some integer, which must then be moded to our table size
- When discussing hash table efficiency, we call the proportion of stored data to table size the *load factor*

Java HashTable Class

- Implements a hash table, which maps keys to values
- Example: a HashTable of integers

```
Hashtable<String, Integer> numbers = new  
Hashtable<String, Integer>();  
numbers.put("one", 1);  
numbers.put("two", 2);  
numbers.put("three", 3);
```

```
Integer n = numbers.get("two");  
if(n != null) {  
    System.out.println("two = " +n);  
}
```

Your Questions



[Meme credit: imgflip.com]

References and Reading Material

- Mark Allen Weiss, Data Structures and Algorithm Analysis in Java, chapters 4, 5 and 9
- Oracle, java.util Class Collections, [Online]
<http://docs.oracle.com/javase/6/docs/api/java/util/Collections.html>
- Oracle, Java Tutorials Collections, [Online]
<https://docs.oracle.com/javase/tutorial/collections/>
- Vogella, Java Collections – Tutorial, [Online]
<http://www.vogella.com/tutorials/JavaCollections/article.html>
- TutorialsPoint, Data Structures and Algorithms - AVL Trees, [Online],
https://www.tutorialspoint.com/data_structures_algorithms/avl_tree_algorithm.htm
- AVL Trees Animation, [Online], <https://www.cs.usfca.edu/~galles/visualization/AVLtree.html>
- Sets, [Online], <https://web.cs.wpi.edu/~cs2102/common/kathi-notes/sets.html>
- Java Tutorials, Sets, [Online], <https://docs.oracle.com/javase/7/docs/api/java/util/Set.html>
- Java Tutorials, Interface Map, [Online],
<https://docs.oracle.com/javase/8/docs/api/java/util/Map.html>
- Problem Solving with Algorithms and Data Structures, Hashing, [Online],
<http://interactivepython.org/courselib/static/pythonds/SortSearch/Hashing.html> (note: code in Python)