



LEC 09

CSE 373

BSTs, AVL Trees

BEFORE WE START

Instructor **Hunter Schafer**

TAs

Ken Aragon
Khushi Chaudhari
Joyce Elauria
Santino Iannone
Leona Kazi
Nathan Lipiarski
Sam Long
Amanda Park

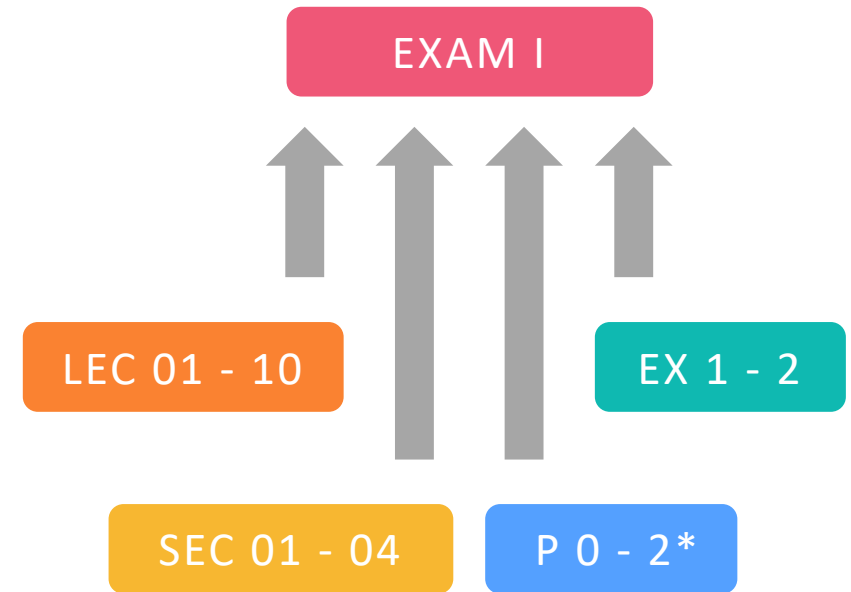
Paul Pham
Mitchell Szeto
Batina Shikhalieva
Ryan Siu
Elena Spasova
Alex Teng
Blarry Wang
Aileen Zeng

Announcements

- Current Assignments: P2 (Due < 2 weeks), EX2 (Due Friday)
- Posted Exam logistics (next slide)
- Project 1 Survey out today, due Friday.
 - Worth extra credit

Exam I Logistics

- You'll have 48 hours (no time limit once you start or anything. Just submit by the deadline!)
- Released 10/26 8:30 AM PDT
- Due 10/28 8:30 AM PDT
 - **No late submissions!**
- Open notes *and* open friends: you'll be able to work on and submit in groups of up to 6
- Covers content up through this Wednesday's lecture (Trees and AVL)
- Will focus on conceptual questions. Be prepared to explain *why* things are true and defend your reasoning



STUDYING

- Topics list on website so you can start looking things over, more thorough review materials will be published later
- Great place to start: Learning Objectives at the beginning of every lecture!

Learning Objectives

After this lecture, you should be able to...

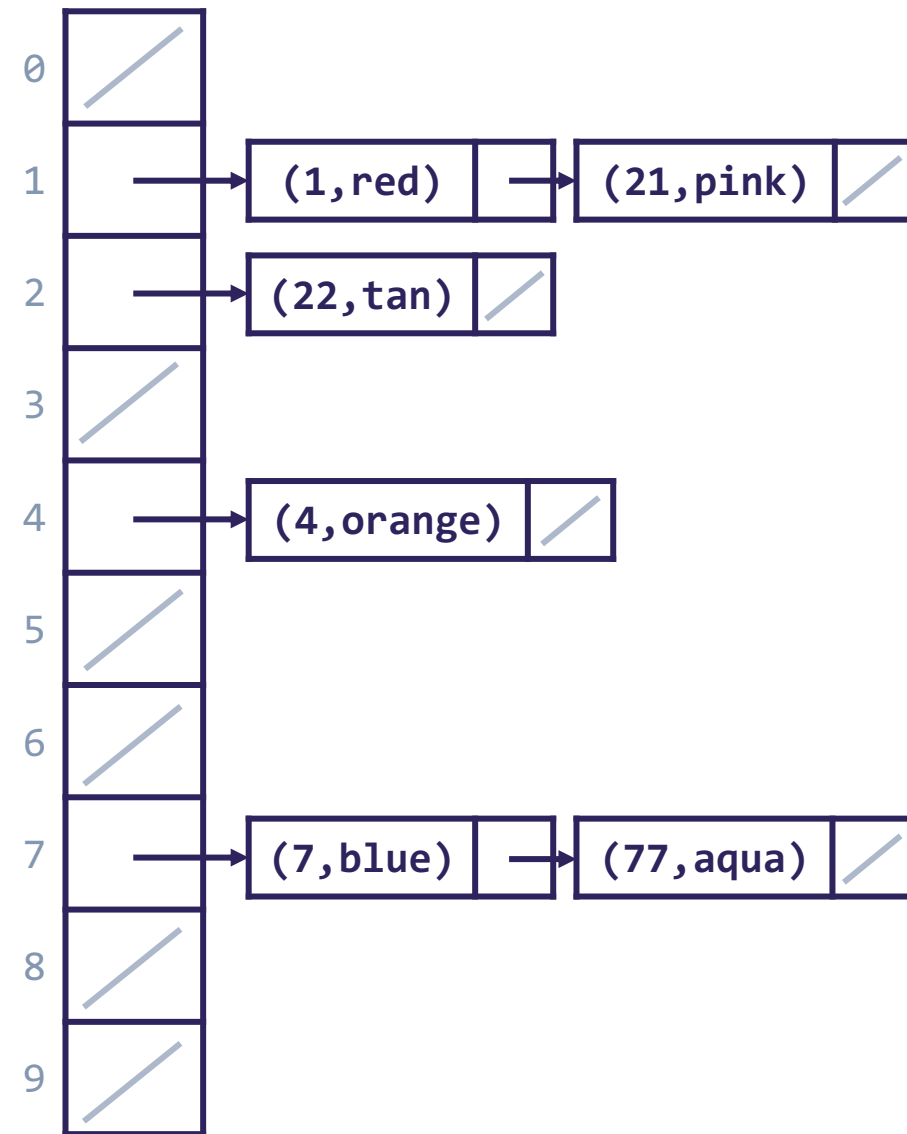
1. Describe the properties of a good hash function and the role of a hash function in making a Hash Map efficient
2. Evaluate invariants based on their strength and maintainability, and come up with the invariants for data structure implementations
3. Compare and contrast the properties and runtimes of BTs, BSTs, and AVL Trees
4. Describe the AVL invariant, explain how it affects AVL Tree runtimes, and compare it with the BST invariant

Lecture Outline

- Hash Map (Wrap-Up)
 - Hashing & Applications 
- Binary Trees & Binary Search Trees (BSTs)
- Case Analysis on BSTs
- Choosing a Good Invariant (AVL Trees)

Review Separate Chaining

- If two values want to live in the same index, let's just let them be roommates!
- Each index is a “bucket”
 - Linked Nodes are a common implementation for these bucket “chains”
- When item x hashes to index h:
 - If bucket at h is empty, create new list with x
 - Else, add x to the list
- But if multiple keys can hash to the same index, need to store the key too!



Review Separate Chaining... In Practice

- A well-implemented separate chaining hash map will stay very close to the best case
 - Most of the time, operations are fast. Rarely, do an expensive operation that restores the map close to best case.
- How to stay close to best case?
 - Good distribution & Resizing!
- We can describe the “in-practice” case as what *almost always* happens:
 - (1) items are fairly evenly distributed
 - (2) assume resizing doesn’t occur on this particular operation
 - This is *similar* to the concept of “amortized”

Operation	Case	Runtime
put(key, value)	best	$\Theta(1)$
	In-practice	$\Theta(1)$
	worst	$\Theta(n)$
get(key)	In-practice	$\Theta(1)$
	average	$\Theta(1)$
	worst	$\Theta(n)$
remove(key)	best	$\Theta(1)$
	In-practice	$\Theta(1)$
	worst	$\Theta(n)$

Review When to Resize?

- In ArrayList, we were forced to resize when we ran out of room
 - In SeparateChainingHashMap, never *forced* to resize, but we want to make sure the buckets don't get too long for good runtime
- How do we quantify “too full”?
 - Look at the average bucket size: number of elements / number of buckets
- If we resize when λ hits some *constant* value like 1:
 - We expect to see 1 element per bucket:
constant runtime!
 - If we double the capacity each time, the expensive resize operation becomes less and less frequent

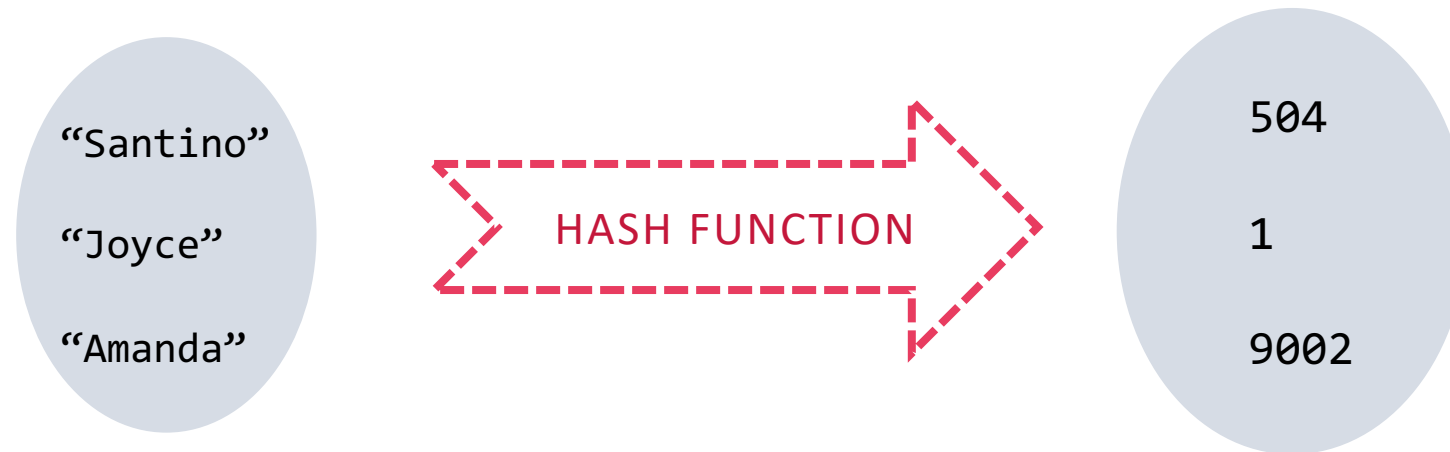
LOAD FACTOR λ

n: total number of key/value pairs
c: capacity of the array (# of buckets)

$$\lambda = \frac{n}{c}$$

Hashing

- What about non-integer data?
 - Remember the definition -- **Hash Function**: any function that can be used to map data of an arbitrary size to fixed-size values.



- Considerations for Hash Functions:
 1. **Deterministic** – same input should generate the same output
 2. **Efficient** – reasonable runtime
 3. **Uniform** – inputs spread “evenly” across output range

Hashing

Implementation 1: Simple aspect of values

```
public int hashCode(String input) {  
    return input.length();  
}
```

Pro: super fast

Con: lots of collisions!

Implementation 2: More aspects of value

```
public int hashCode(String input) {  
    int output = 0;  
    for(char c : input) {  
        out += (int)c;  
    }  
    return output;  
}
```

Pro: still really fast

Con: some collisions

Implementation 3: Multiple aspects of value + math!

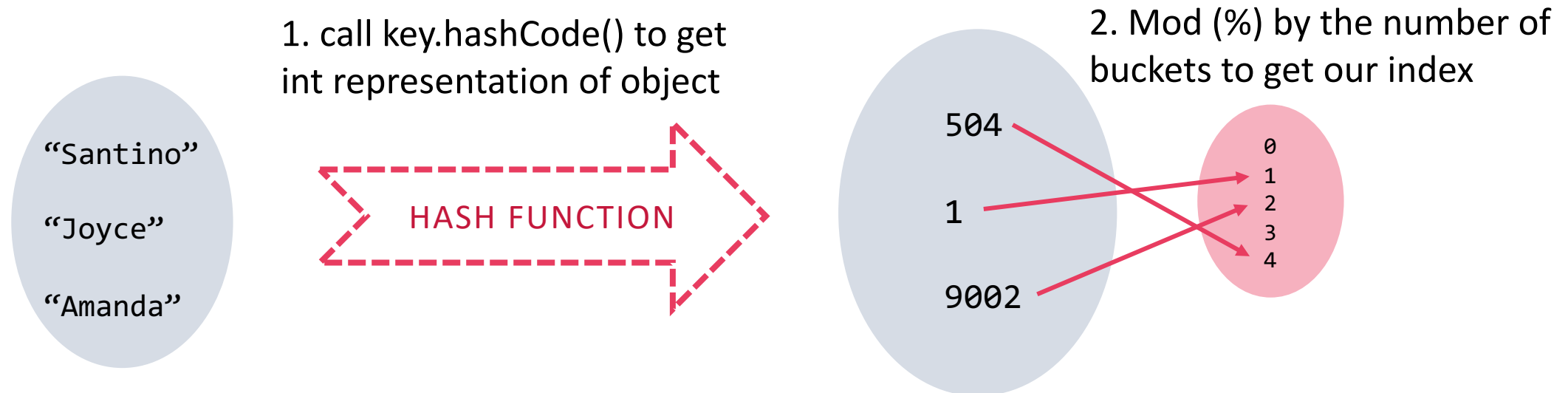
```
public int hashCode(String input) {  
    int output = 1;  
    for (char c : input) {  
        int nextPrime = getNextPrime();  
        out *= Math.pow(nextPrime, (int)c);  
    }  
    return Math.pow(nextPrime, input.length());  
}
```

Pro: few collisions

Con: slower, gigantic integers

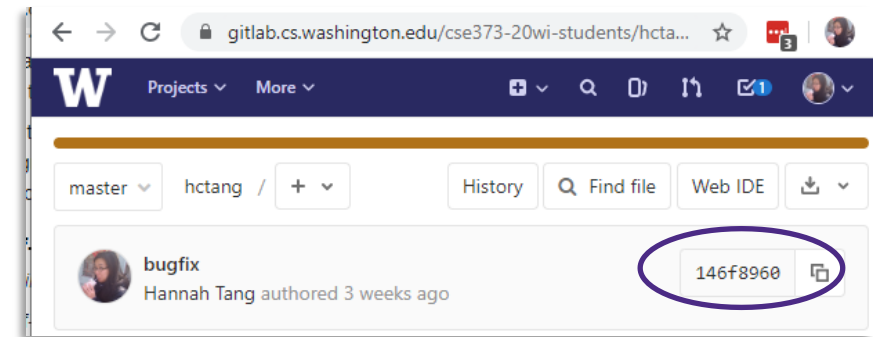
Hashing

- Fortunately, experts have made most of these design decisions for us!
 - All objects in Java have a `.hashCode()` method that does some magic to make a “good” hash for any object type (e.g. String, ArrayList, Scanner)
 - The built-in `hashCode()` has a good distribution/not a lot of collisions
- More precisely, `hashCode()` just gets us an int representation: *then* we % by size



Content Hashing: Applications

- Caching:
 - You've downloaded a large video file. You want to know if a new version is available. Rather than re-downloading the entire file, compare your file's hash value with the server's hash value.
- File Verification / Error Checking:
 - Same implementation
 - Can be used to verify files on your machine, files spread across multiple servers, etc.
- Fingerprinting
 - Git hashes ("identification")
 - Ad tracking ("identification"): see <https://panopticklick.eff.org/>
 - YouTube ContentID ("duplicate detection")



Content Hashing: Defining a Salient Feature

- Hash function implementors can choose what's salient:
 - $\text{hash}(\text{"cat"}) == \text{hash}(\text{"CAT"})$???
- What's salient in detecting that an image or video is unique?



- What's salient in determining that a user is unique?

Review Iterators

- **Iterator**: a Java interface that dictates how a collection of data should be traversed. Can only move forward and in a single pass.

Iterator Interface

Behavior

hasNext() – true if elements remain
next() – returns next element

hasNext() – returns true if the iteration has more elements yet to be examined

next() – returns the next element in the iteration and moves the iterator forward to next item

Two ways to *use* an iterator in Java:

```
ArrayList<Integer> list;
```

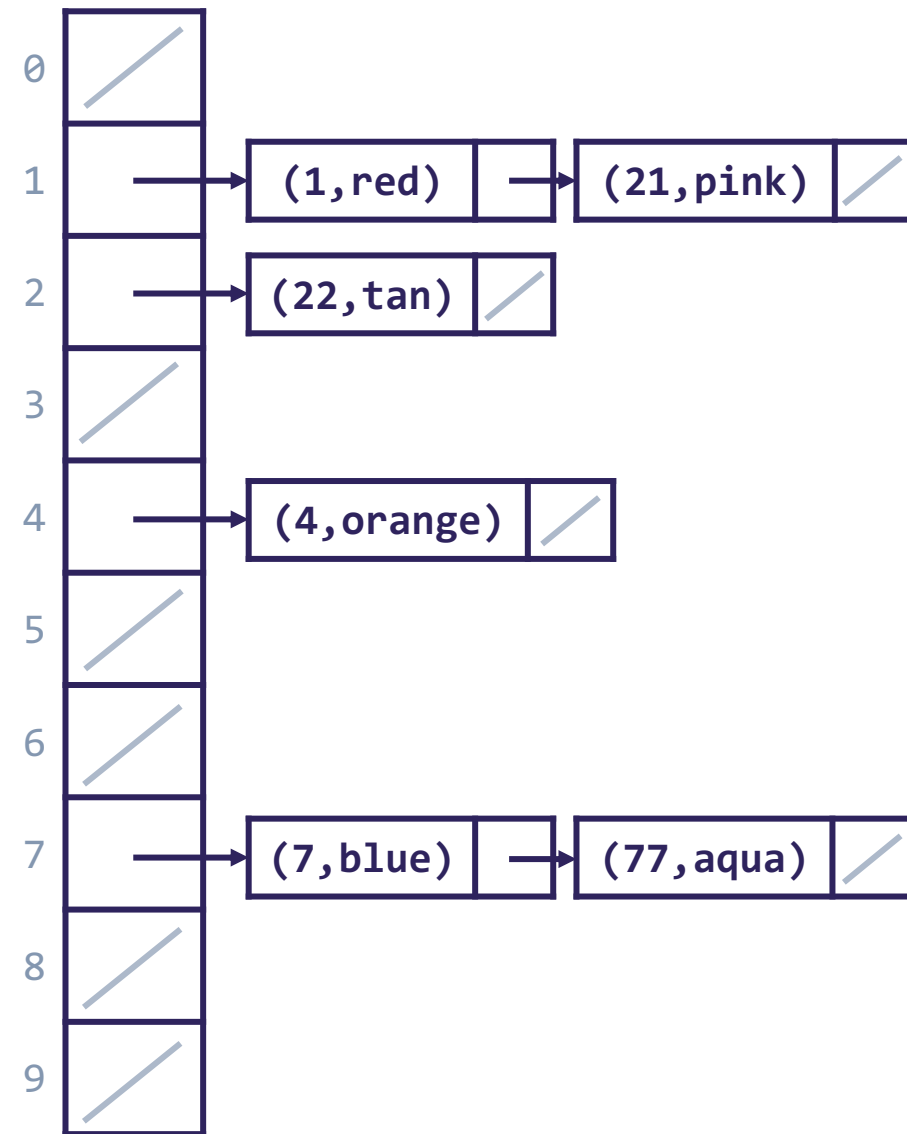
```
Iterator itr = list.iterator();  
while (itr.hasNext()) {  
    int item = itr.next();  
}
```

```
ArrayList<Integer> list;
```

```
for (int i : list) {  
    int item = i;  
}
```

P2 Reminders

- Implementing an iterator for a Hash Map is *complex!*
 - You need to iterate through the elements of a bucket, but when you reach the end of the chain, *have to move to the next bucket*
 - “you’re not iterating over some linear data structure, you’re playing 2D chess”
 - Howard Xiao
- Start early! P2 available for over 1.5 weeks, but for good reason!
 - Especially the ChainedHashMap iterator
- Remember to read the entire Tips section of the instructions!



Lecture Outline

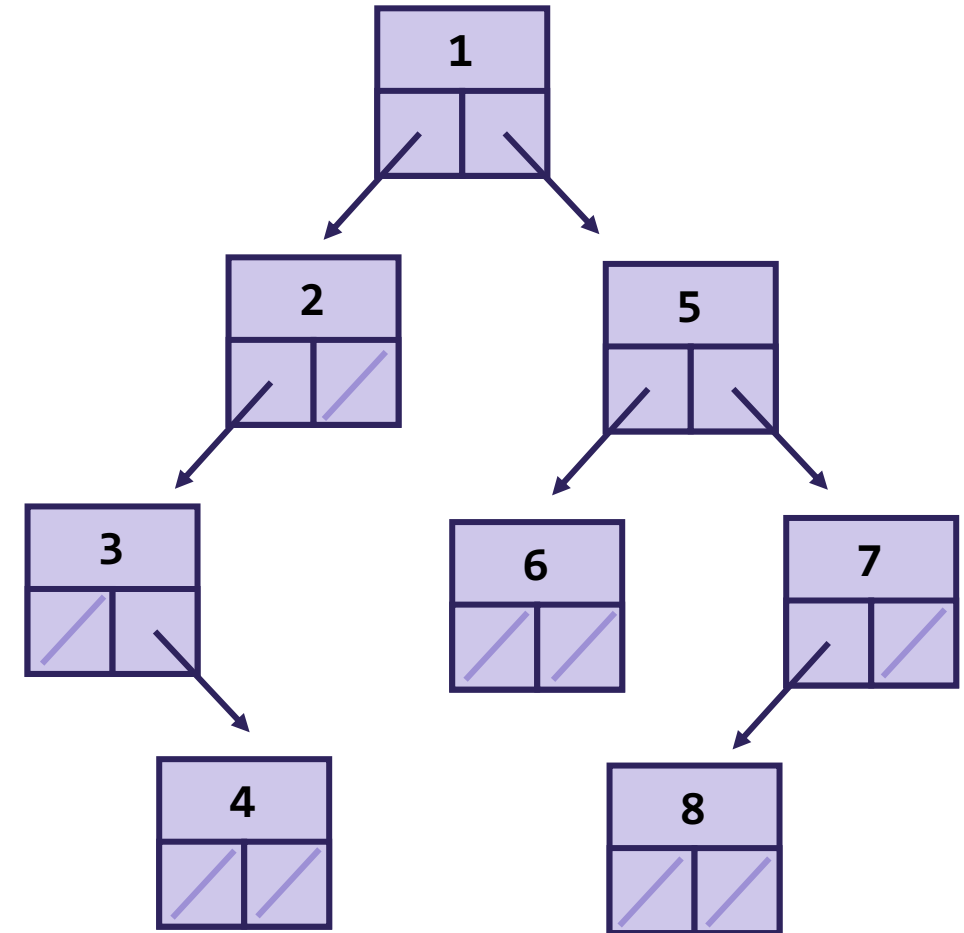
- Hash Map (Wrap-Up)
 - Hashing & Applications
- **Binary Trees & Binary Search Trees (BSTs)** ◀
- Case Analysis on BSTs
- Choosing a Good Invariant (AVL Trees)

143 Review Binary Trees

- A **binary tree** is a collection of nodes where each node has at most 1 parent and anywhere from 0 to 2 children
 - Similar to linked lists (just add an extra child field!)

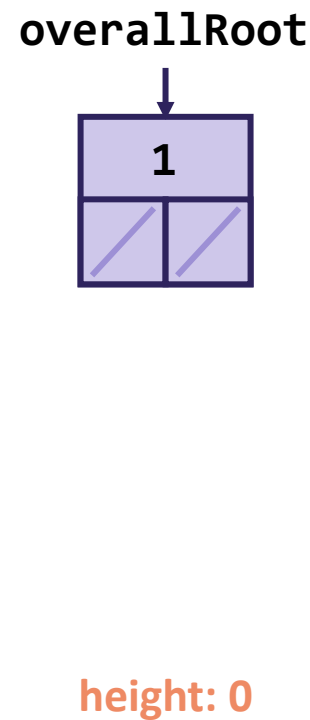
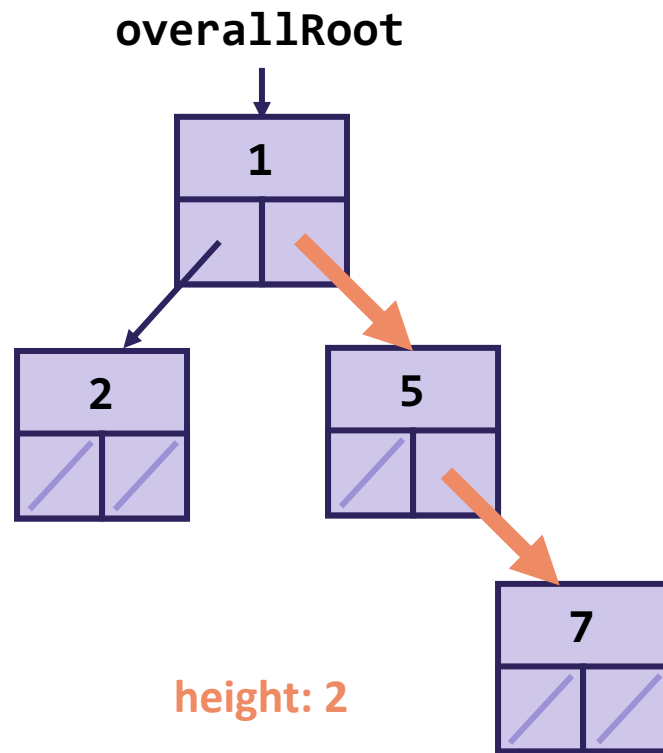
```
public class Node<K> {  
    K data;  
    Node<K> left;  
    Node<K> right;  
}
```

- **Root node**: the single node with no parent, “top” of the tree. Often called the ‘overallRoot’
- **Leaf node**: a node with no children
- **Subtree**: a node and all its descendants
- **Height**: the number of edges contained in the longest path from root node to any leaf node



143 Review Tree Height

- What is the height of the following binary trees?
 - Height:** the number of edges contained in the longest path from root node to any leaf node



Other Useful Binary Tree Numbers

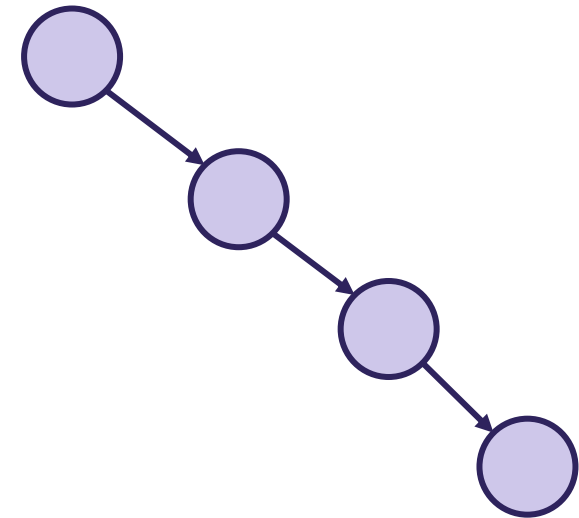
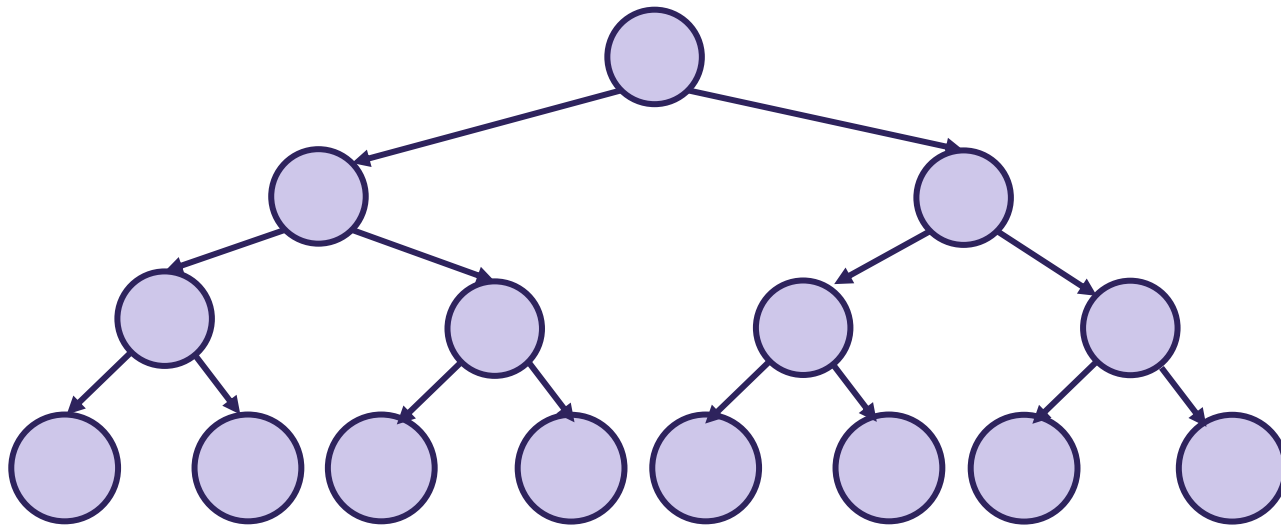
For a binary tree of height h :

Max number of leaves: 2^h

Max number of nodes: $2^{h+1} - 1$

Min number of leaves: 1

Min number of nodes: $h + 1$



143 Review Binary Search Tree (BST)

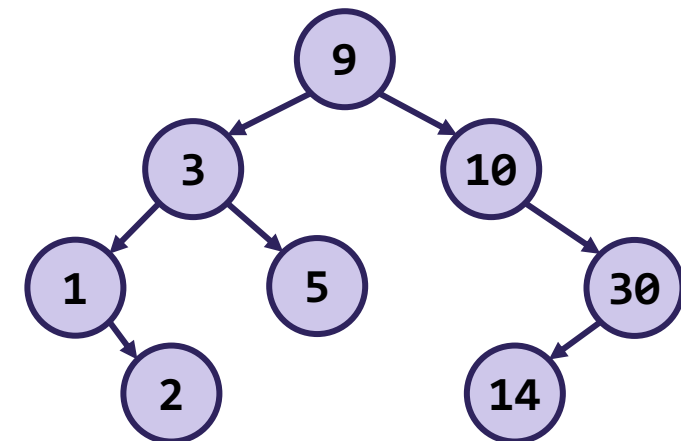
• Invariants

- The *rules* for your data structure or algorithm
- Whenever you implement any operation on your data structure:
 - You know the invariants are true at the beginning.
Great! Simpler code, fewer cases
 - But you must leave the invariants true at the end.
- Accidentally violating invariants a common source of bugs. Defensive programming: check invariants at beginning/end of methods!

✓ INVARIANT

```
public boolean containsKeyBST(node, key) {  
    if (node == null) {  
        return false;  
    } else if (node.key == key) {  
  
        ...  
  
        return result;  
    }  
}
```

✓ INVARIANT



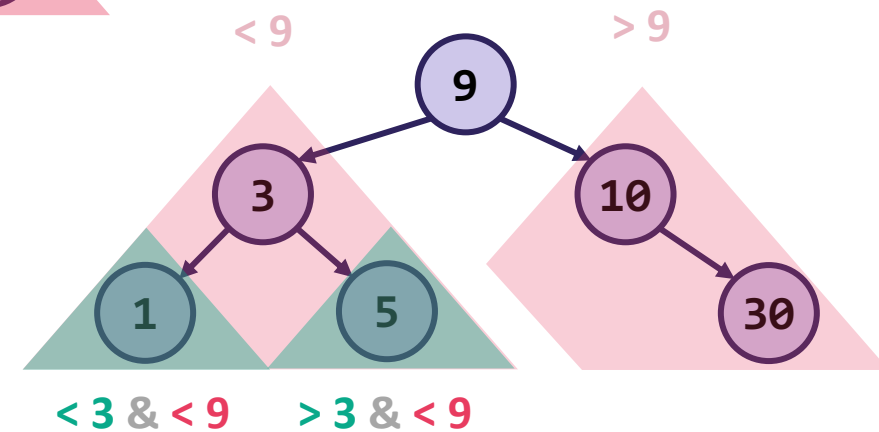
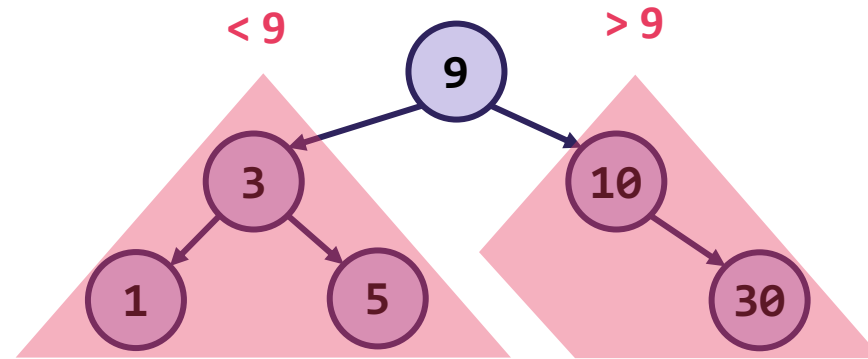
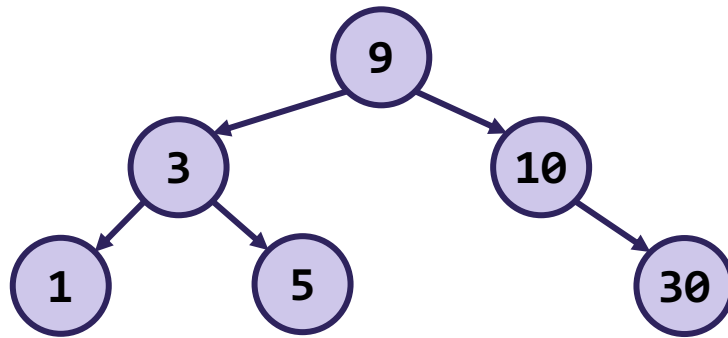
INVARIANT

Binary Search Tree Invariant:

For every node with key k :

- The left subtree has only keys smaller than k .
- The right subtree has only keys greater than k .

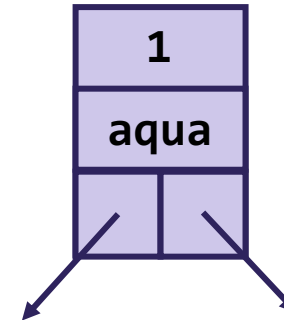
BST Ordering Applies *Recursively*



Aside Anything Can Be a Map

- Want to make a tree implement the Map ADT?
 - No problem – just add a value field to the nodes, so each node represents a key/value pair.

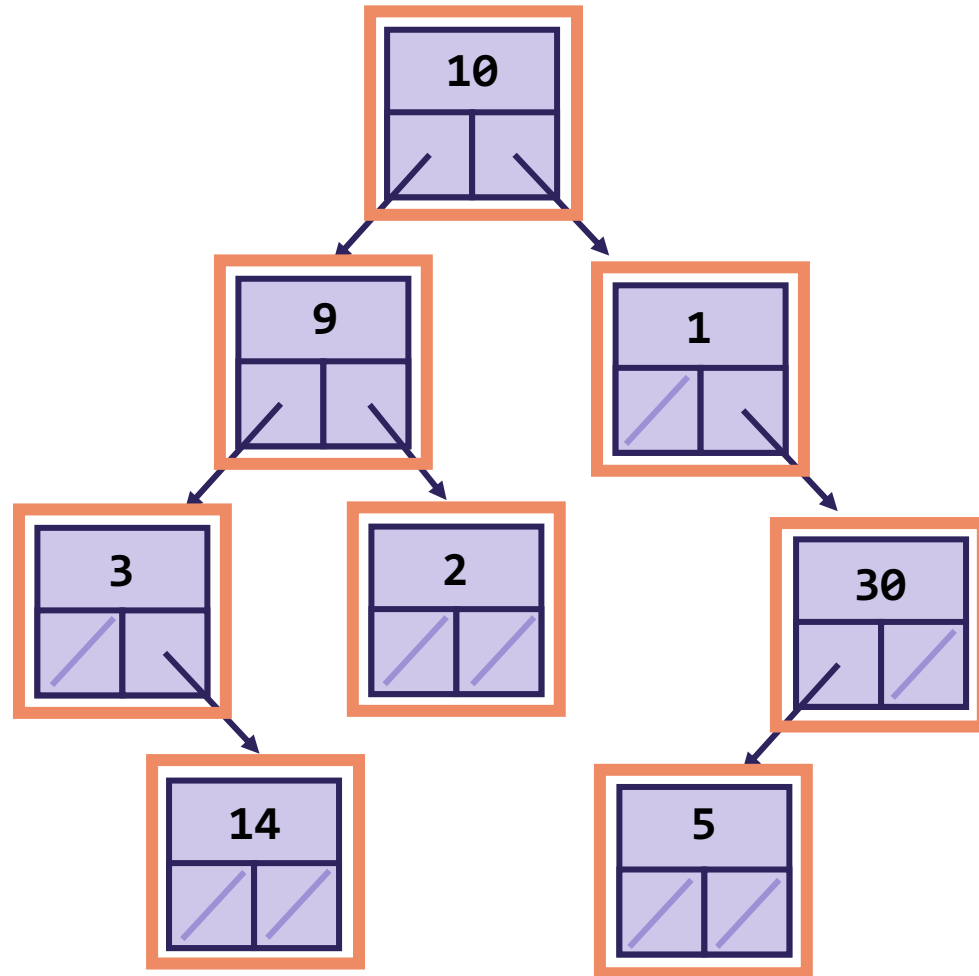
```
public class Node<K, V> {  
    K key;  
    V value;  
    Node<K, V> left;  
    Node<K, V> right;  
}
```



- For simplicity, we'll just talk about the keys
 - Interactions between nodes are based off of keys (e.g. BST sorts by keys)
 - In other words, keys determine where the nodes go

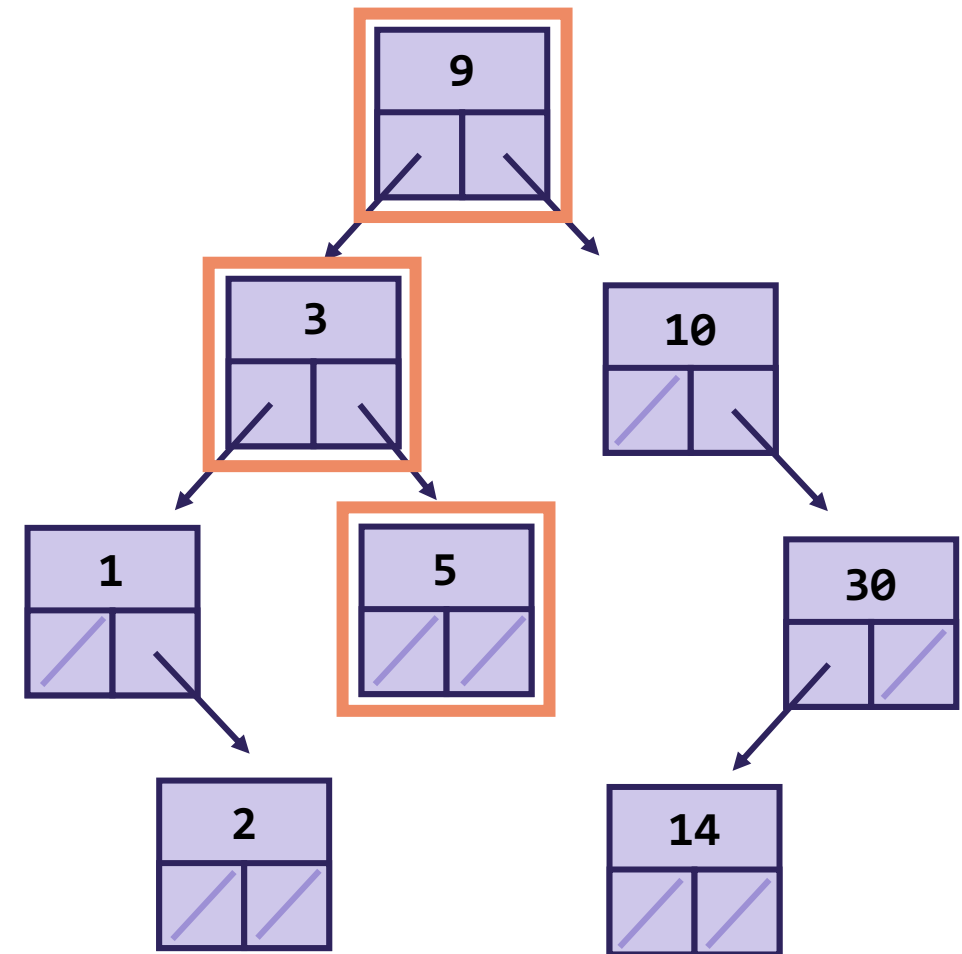
Binary Tree vs. BST: containsKey(5)

Without BST Invariant



Nodes that
are searched

With BST Invariant

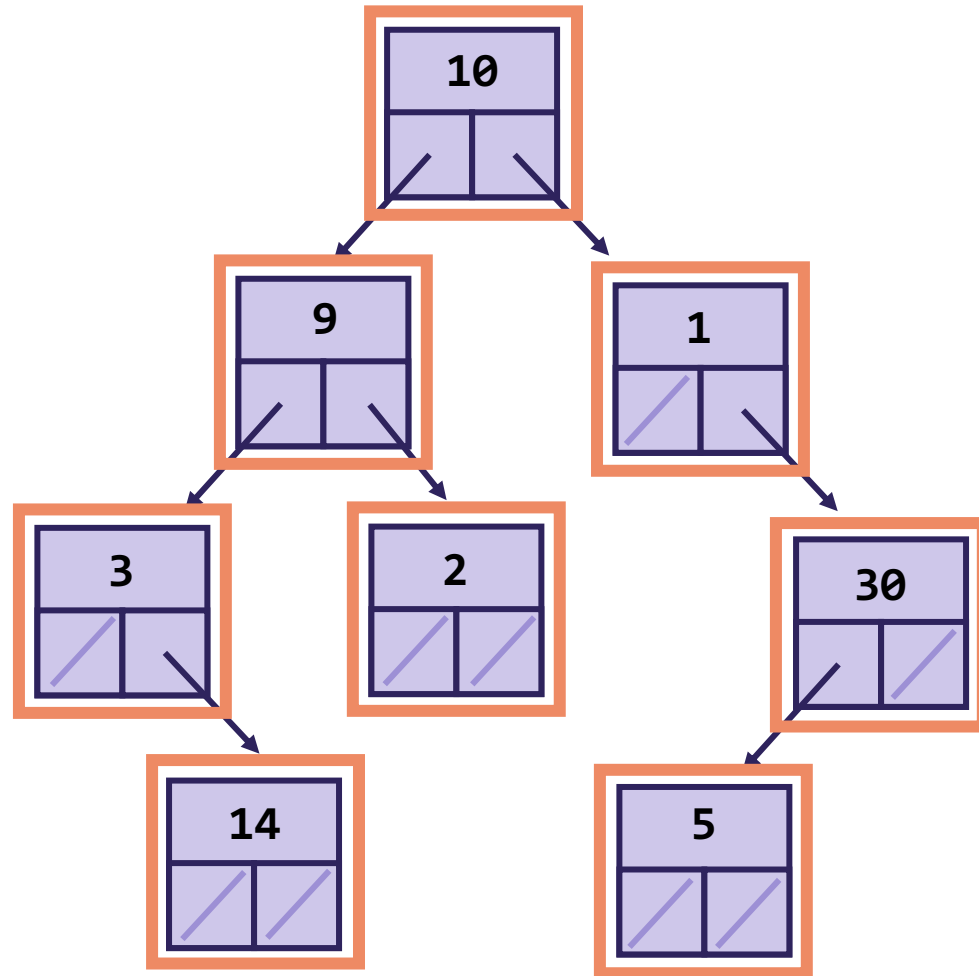


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- **Case Analysis on BSTs** 
- Choosing a Good Invariant (AVL Trees)

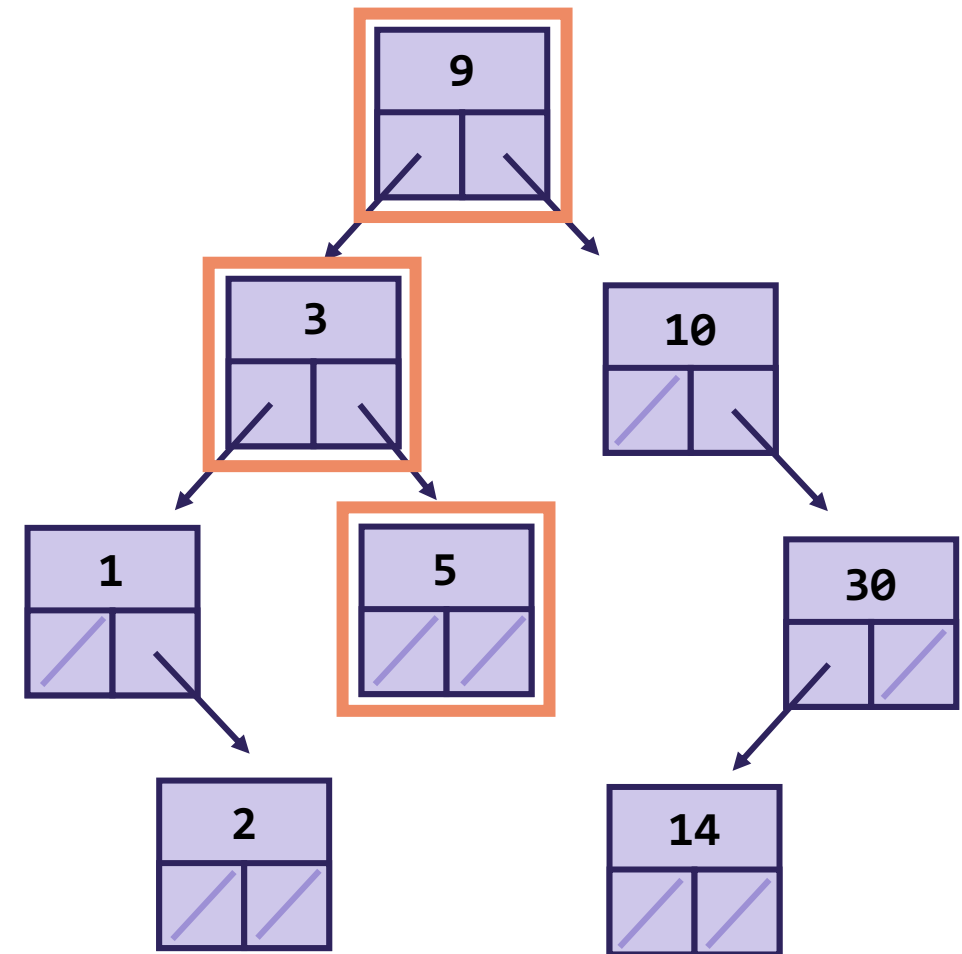
Binary Tree vs. BST: containsKey(5)

Without BST Invariant



Nodes that
are searched

With BST Invariant



Binary Tree vs. BST: containsKey(5)

```
public boolean containsKeyBinaryTree(node, key) {  
    if (node == null) {  
        return false;  
    } else if (node.key == key) {  
        return true;  
    } else {  
        return containsKeyBT(node.left) ||  
            containsKeyBT(node.right);  
    }  
}
```

RECURSIVE PATTERN

2

Constant size Input

$\Theta(n)$

```
public boolean containsKeyBST(node, key) {  
    if (node == null) {  
        return false;  
    } else if (node.key == key) {  
        return true;  
    } else {  
        if (key <= node.key) {  
            return containsKeyBST(node.left);  
        } else {  
            return containsKeyBST(node.right);  
        }  
    }  
}
```

RECURSIVE PATTERN

1

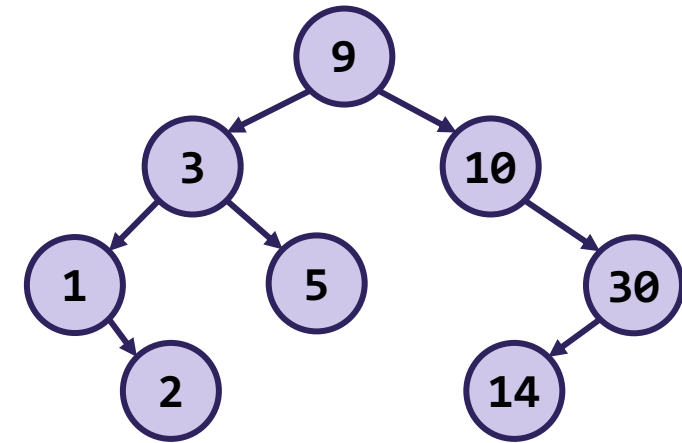
Halving the Input

$\Theta(\log n)$

Where n is the number of nodes in the tree

BST containsKey runtime

```
public boolean containsKeyBST(node, key) {  
    if (node == null) {  
        return false;  
    } else if (node.key == key) {  
        return true;  
    } else {  
        if (key <= node.key) {  
            return containsKeyBST(node.left);  
        } else {  
            return containsKeyBST(node.right);  
        }  
    }  
}
```



For containsKey on a BST, what are some interesting cases for us to consider?

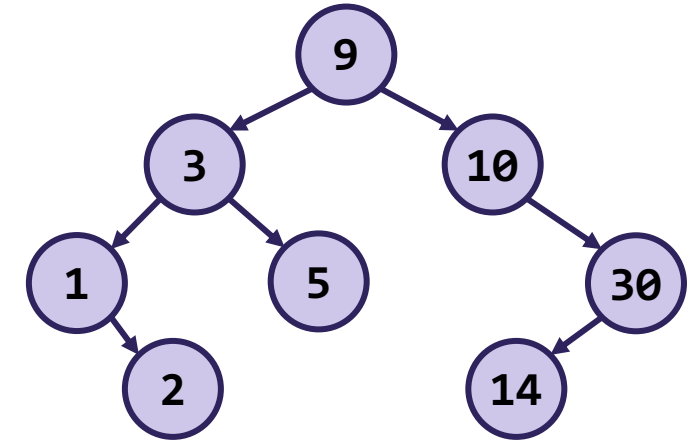
What's the best? The worst? Are there other interesting cases?

For example, consider what values of key could change the behavior on the above tree.

BST containsKey Cases: Varying key

For containsKey on a BST, what are some interesting cases for us to consider?

What's the best? The worst? Are there other interesting cases? For example, consider what values of key could change the behavior on this tree.



Best Case

key=9 seems pretty nice! Find it immediately. $\Theta(1)$

Worst Case

key=100 is terrible. Have to go down the tree (and you don't even get the satisfaction of returning true). $\Theta(\log n)$

We can analyze with recurrences:

$$T(n) = \begin{cases} T\left(\frac{n}{2}\right) + 1 & \text{if } n > 1 \\ 3 & \text{otherwise} \end{cases}$$

$$T(n) = \Theta(\log n)$$

Is it possible to do worse than $\Theta(\log n)$? 🤪

- Sources of variation that affect the runtime:

- 1 Number of elements in the tree (n)
- 2 Position of searched-for key in tree
- 3 Arrangement of elements in tree

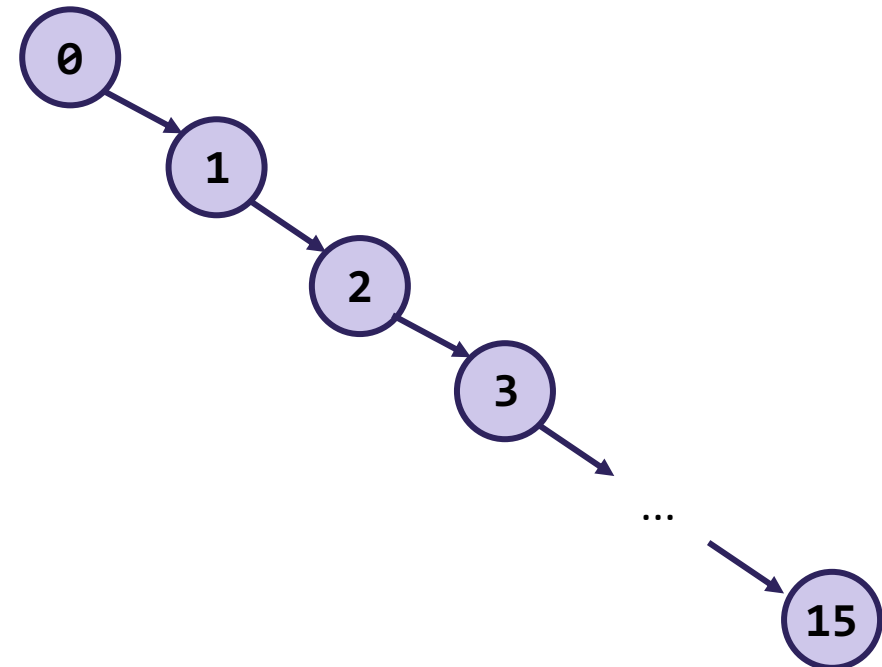


Can we do worse by varying this?

Our new recurrence:

$$T(n) = \begin{cases} T(n-1) + 1 & \text{if } n > 1 \\ 3 & \text{otherwise} \end{cases}$$

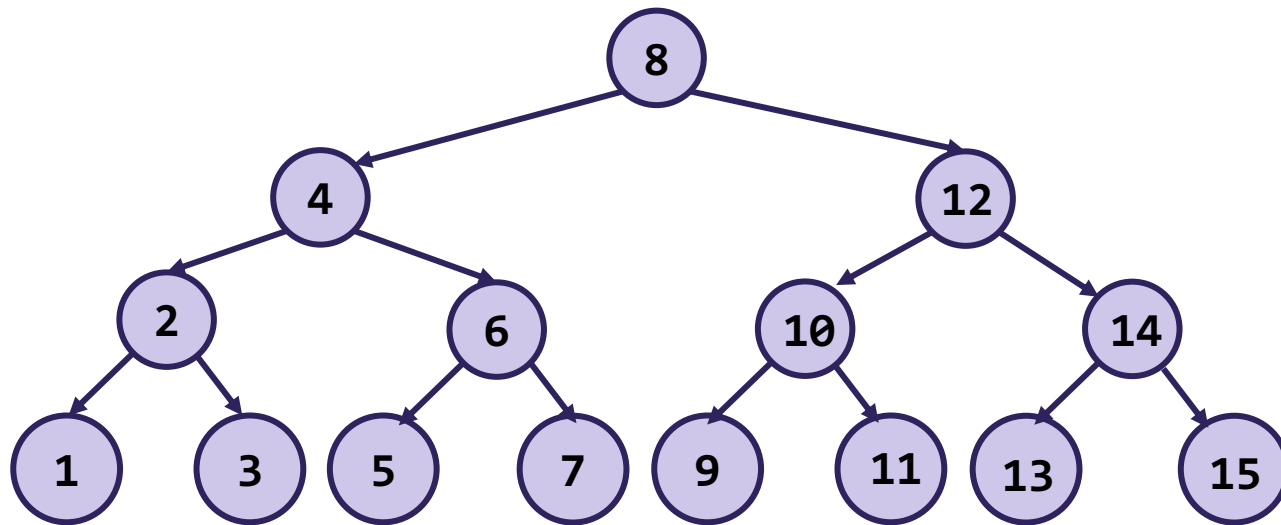
$$T(n) = \Theta(n)$$



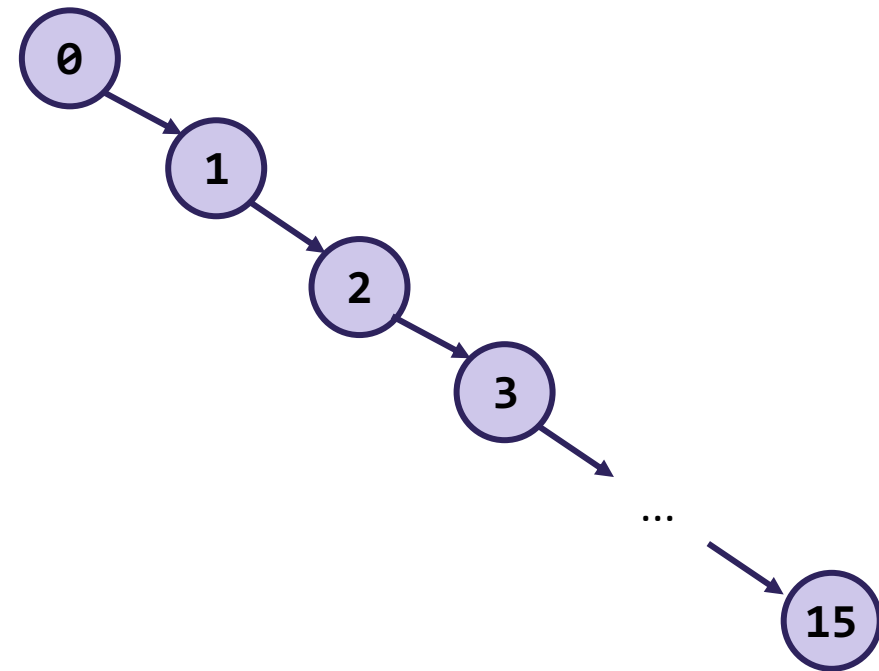
BST Extremes

- Here are two different extremes our BST could end up in:

Perfectly balanced – for every node, its descendants are split evenly between left and right subtrees.



Degenerate – for every node, all of its descendants are in the right subtree.



Can we do better?

- Key observation: what ended up being important was the *height* of the tree!
 - **Height**: the number of edges contained in the longest path from root node to any leaf node
 - In the worst case, this is the number of recursive calls we'll have to make
- If we can limit the height of our tree, the BST invariant can take care of quickly finding the target
 - How do we limit?
 - Let's try to find an invariant that forces the height to be short



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- Case Analysis on BSTs
- **Choosing a Good Invariant (AVL Trees)** 

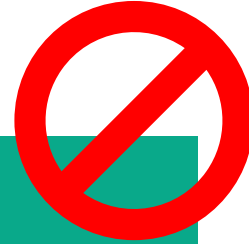
In Search of a “Short BST” Invariant: Take 1

- What about this?

INVARIANT

BST Height Invariant

The height of the tree must not exceed $\Theta(\log n)$



INVARIANT

```
public void insertBST(node, key) {  
    ...  
}
```



INVARIANT

- This *is* technically what we want (would be amazing if true on entry)
- But how do we implement it so it's true on exit?
 - Should the insertBST method rebuild the entire tree balanced every time?
This invariant is too broad to have a clear implementation
- Invariants are **tools** – more of an art than a science, but we want to pick one that is specific enough to be maintainable