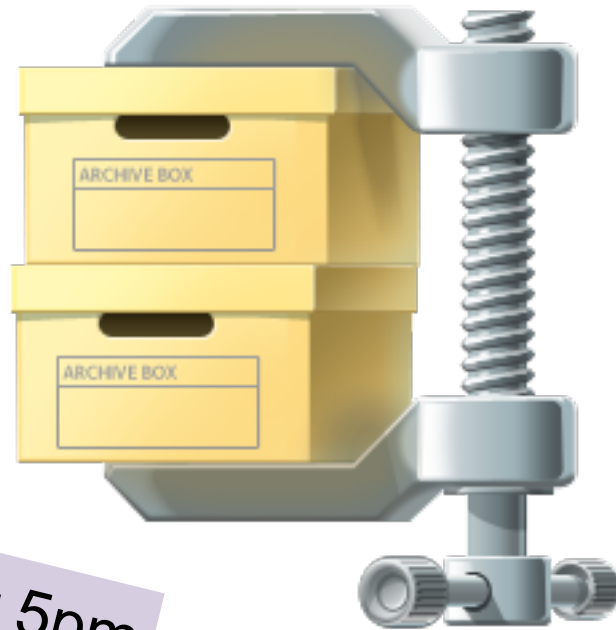
A landscape of baobab trees under a blue sky with clouds. The trees are tall and have thick, textured trunks. The sky is bright blue with scattered white clouds. The ground is dry and sandy.

Binary Search Trees

Chris Piech

CS 106B
Lecture 20
Feb 24, 2016

Announcements



Due March 2nd at 5pm

YEAH tomorrow at 5pm in braunAud

Mid Quarter Evaluations

thank
thank
you!

Socratic



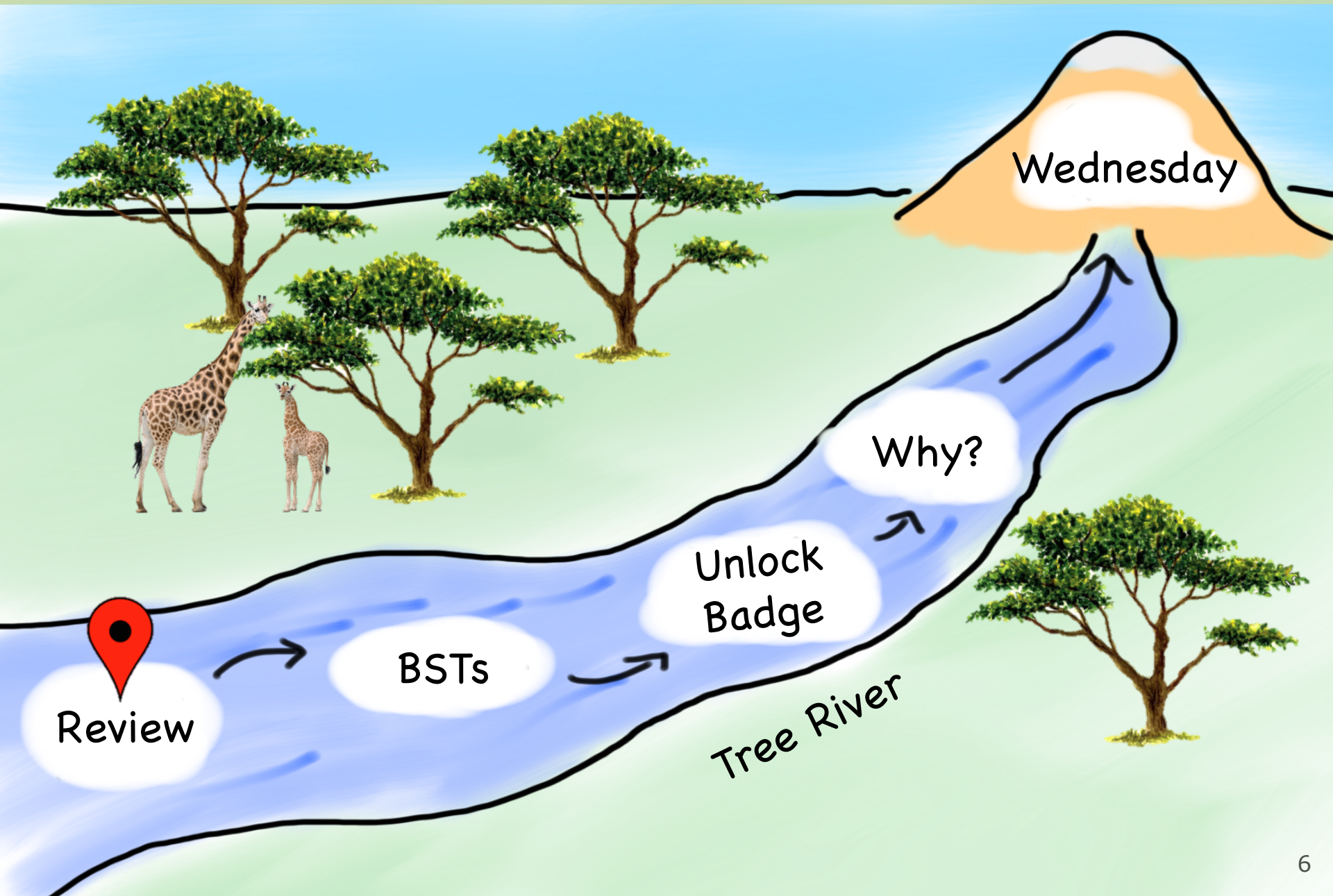
Room: **106BWIN16**

Today's Goal

1. Binary Search Trees
2. Review Under the Hood

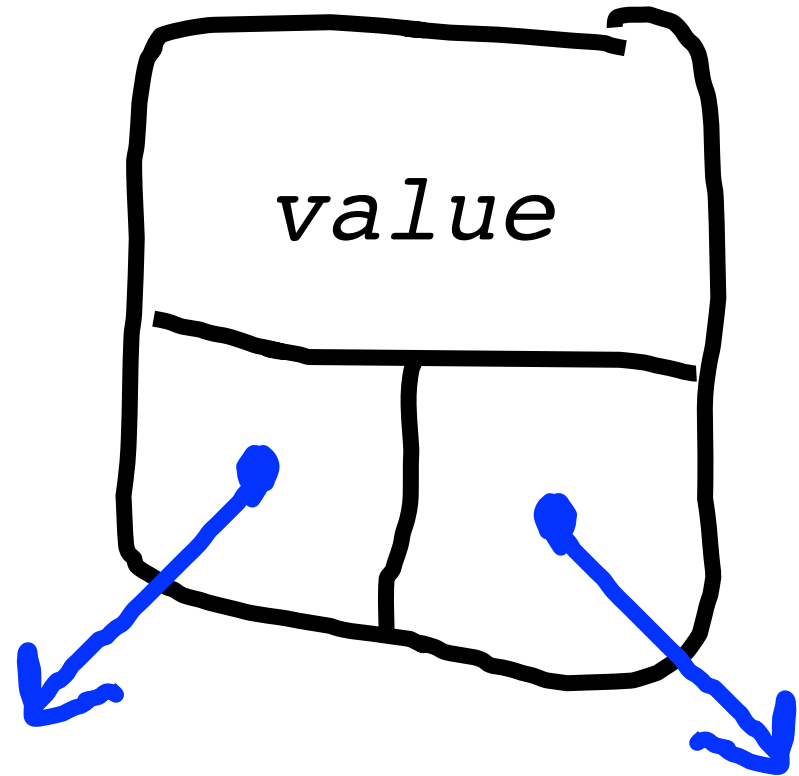


Today's Route



Binary Tree

```
struct Tree {  
    string value;  
    Tree * left;  
    Tree * right;  
};
```



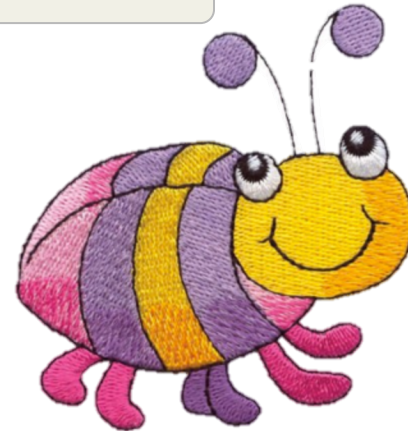
This is how a Binary Tree is defined

Pointers by Reference

Pointers by Reference

```
int main() {
    Tree * root = NULL;
    startTree(root);
}

void startTree(Tree * tree) {
    tree = new Tree;
    tree->label = "S";
}
```



This is not going to do anything

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}
```

```
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

startTree

tree

NULL

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

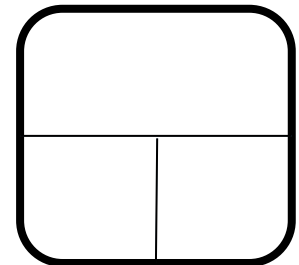
NULL

startTree

tree

0x1234

0x1234



Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

startTree

tree

0x1234

0x1234

S

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

0x1234

S

Pointers by Reference

```
int main() {  
    Tree * root = NULL;  
    startTree(root);  
}  
  
void startTree(Tree * tree) {  
    tree = new Tree;  
    tree->label = "S";  
}
```

main

root

NULL

0x1234

S

Fix

Pointers by Reference

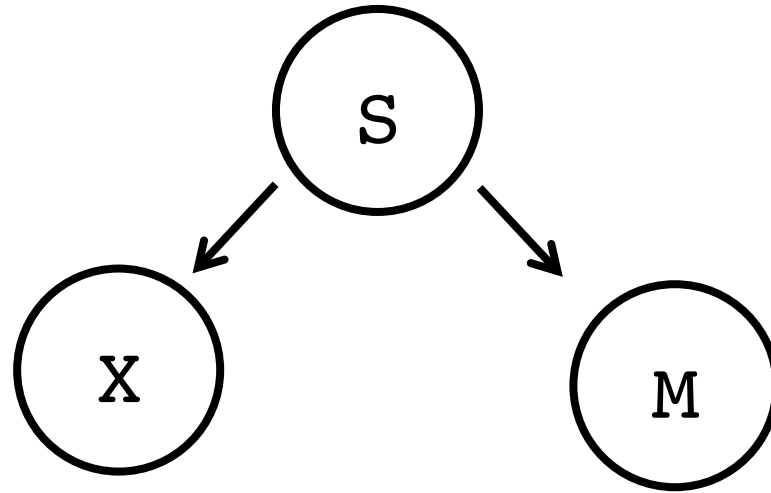
```
int main() {
    Tree * root = NULL;
    startTree(root);
}

void startTree(Tree * & tree) {
    tree = new Tree;
    tree->label = "S";
}
```

This is the fix

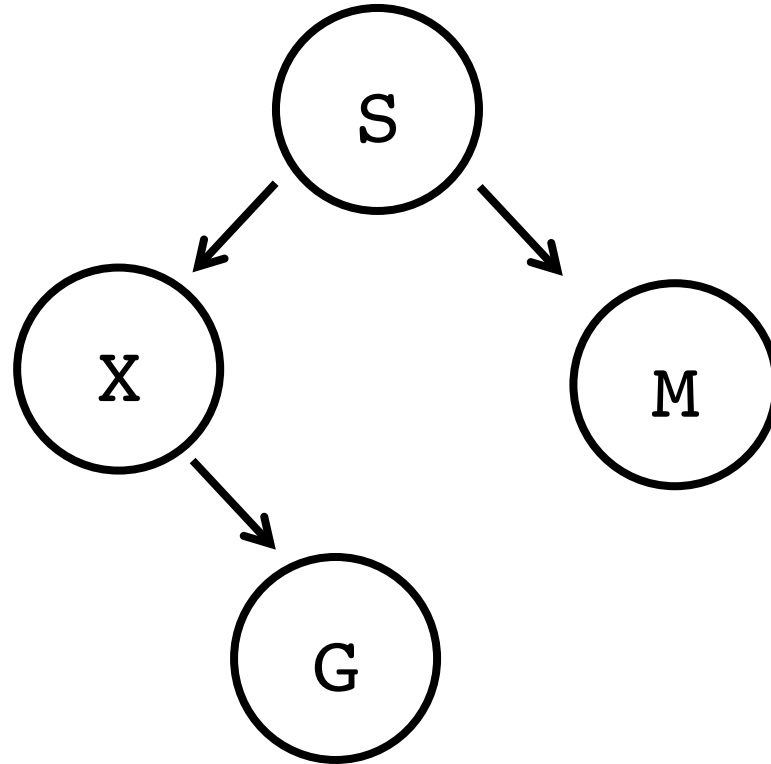
Add Random Leaf

Add Random Leaf



Add a random node to this tree...

Add Random Leaf



... and you might get something like this

Add Random Leaf

```
void addRandomLeaf(Tree * tree) {  
    if(tree == NULL) {  
        tree = new Tree;  
        tree->value = randomChar();  
        return;  
    }  
    if(randomBool()) {  
        addRandomLeaf(tree->left);  
    } else {  
        addRandomLeaf(tree->right);  
    }  
}
```



Add Random Leaf

```
void addRandomLeaf(Tree * & tree) {  
    if(tree == NULL) {  
        tree = new Tree;  
        tree->value = randomChar();  
        return;  
    }  
    if(randomBool()) {  
        addRandomLeaf(tree->left);  
    } else {  
        addRandomLeaf(tree->right);  
    }  
}
```

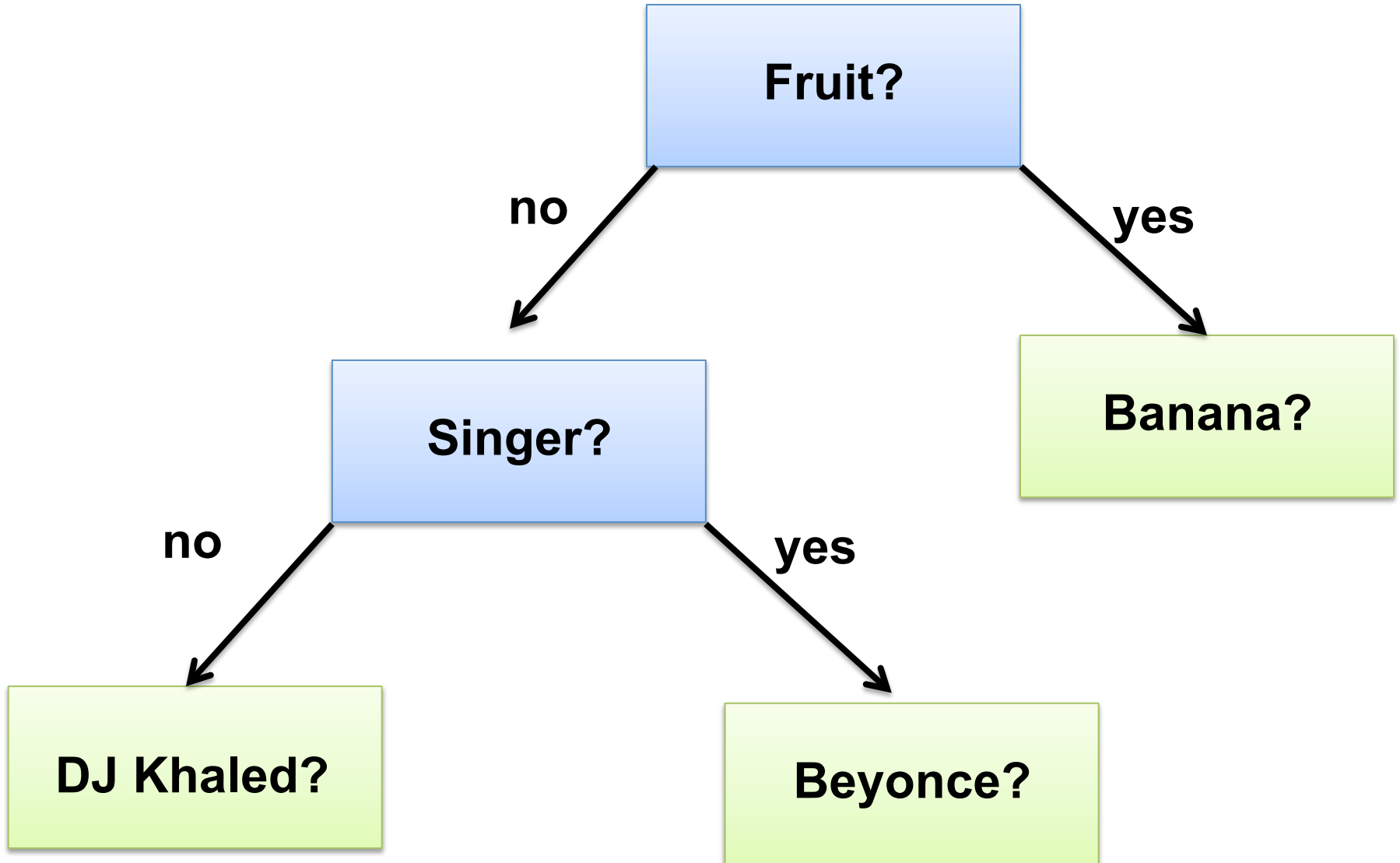
Full trace in Monday's code

Add Random Leaf

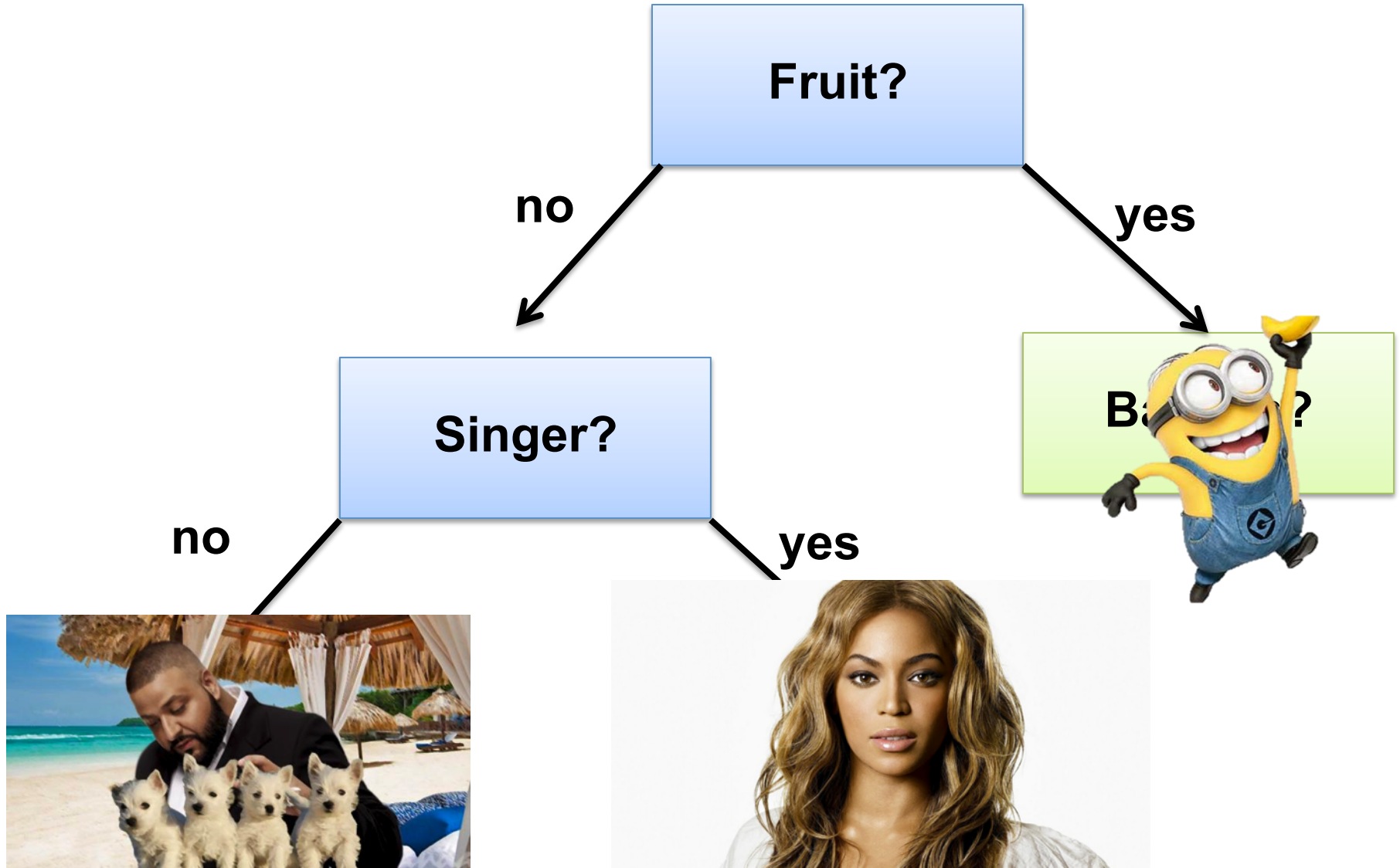
```
void addRandomLeaf(Tree * & tree) {
    if(tree == NULL) {
        tree = new Tree;
        tree->value = randomChar();
        return;
    }
    if(randomBool()) {
        addRandomLeaf(tree->left);
    } else {
        addRandomLeaf(tree->right);
    }
}

int main() {
    Tree * root = NULL;
    addRandomLeaf(root);
}
```

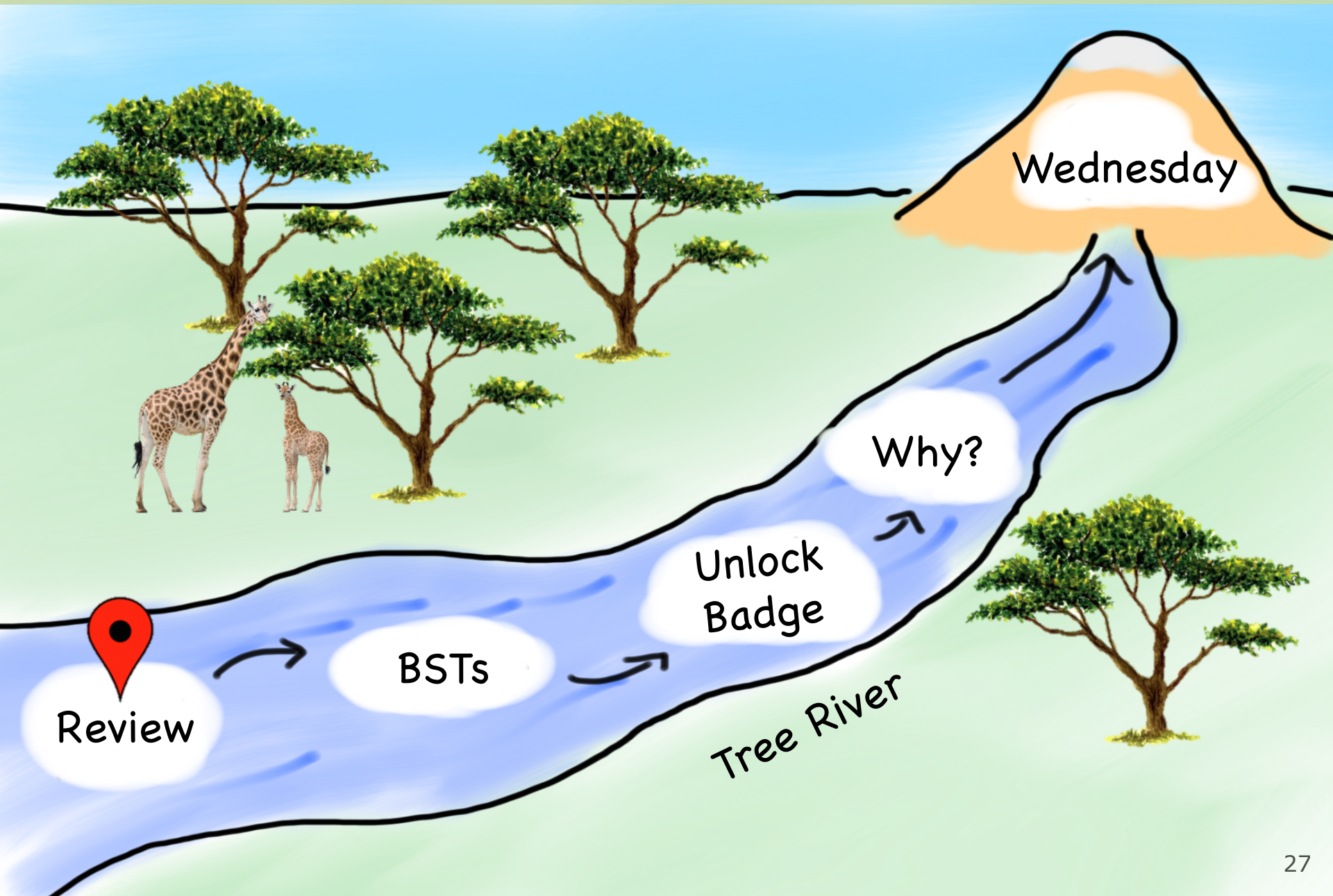

Pensive



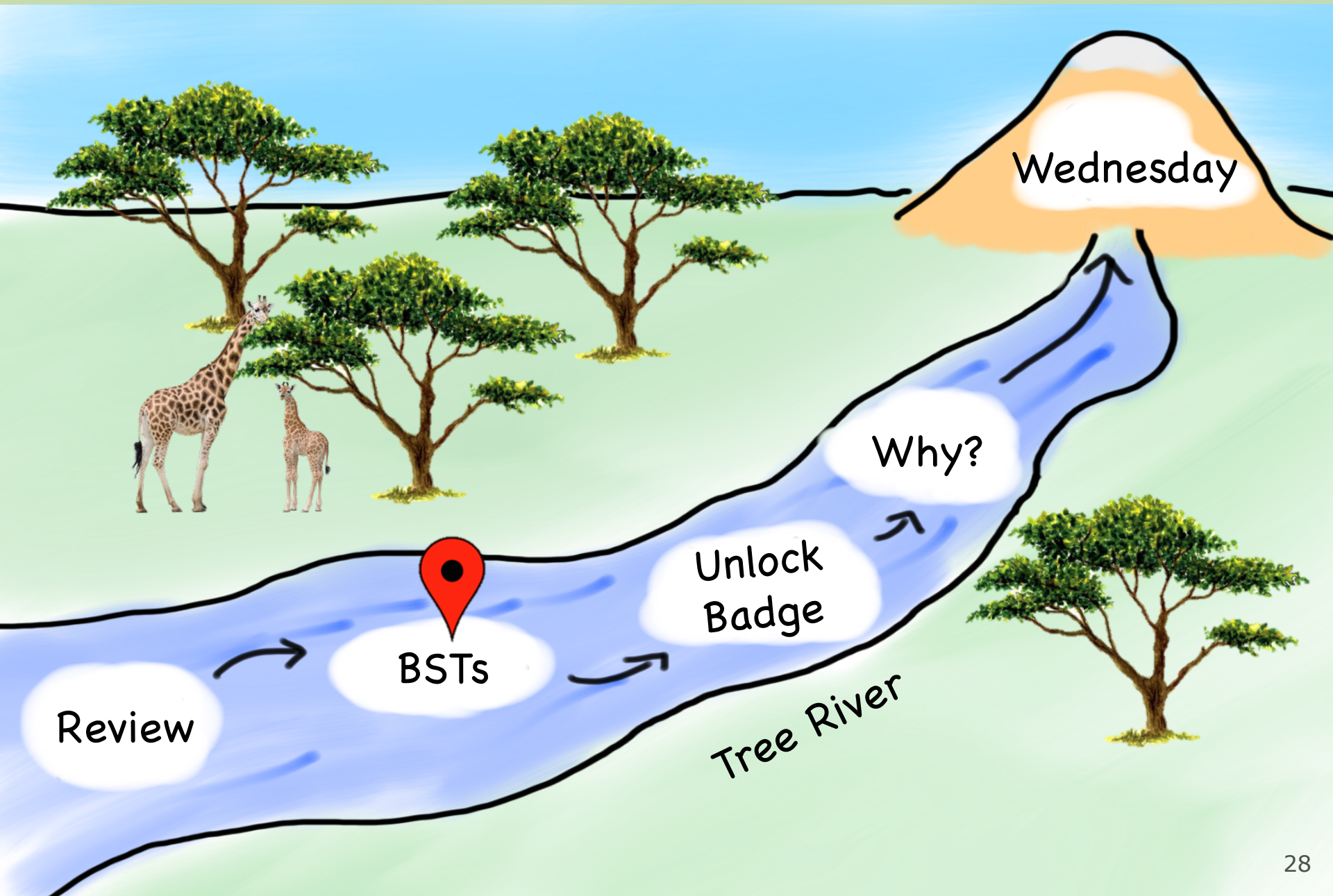
Pensive



Today's Route

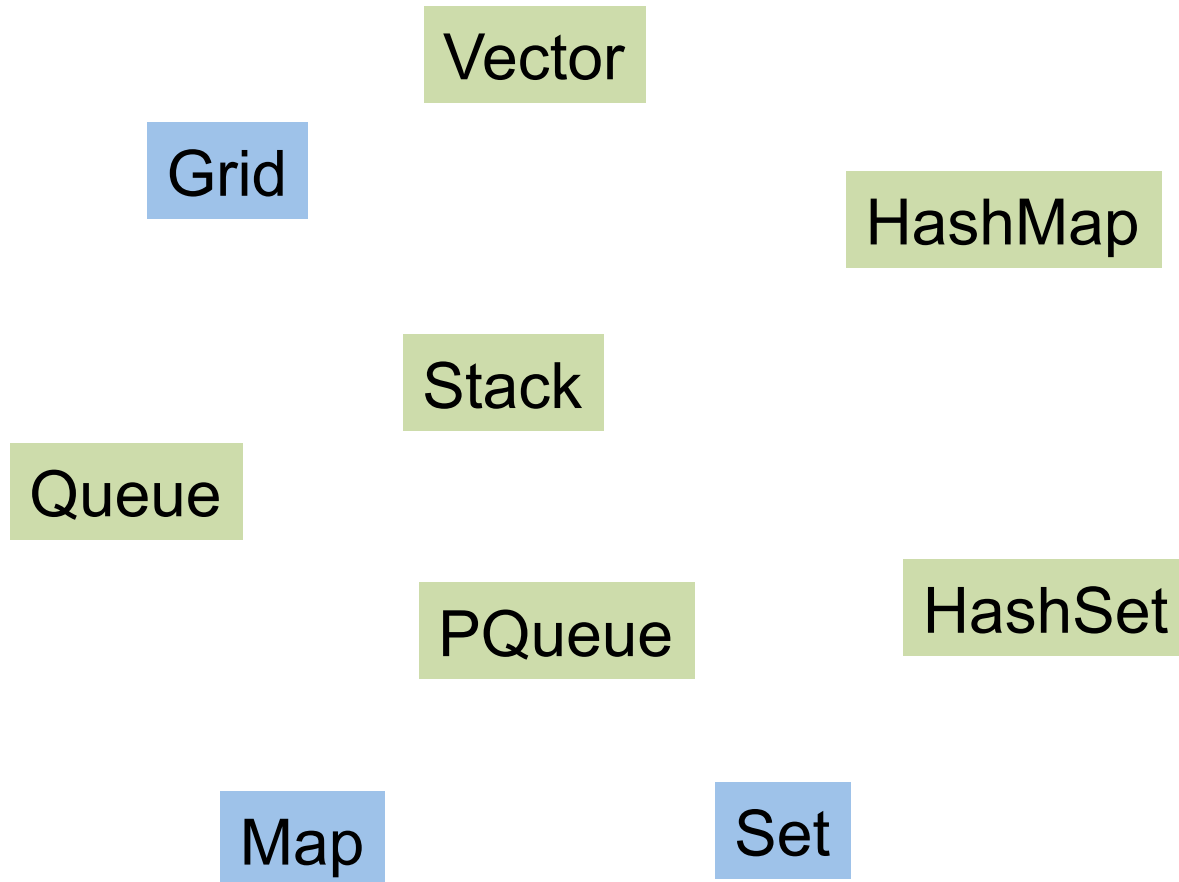


Today's Route

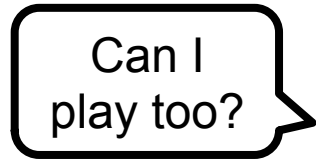


How does the Map/Set work?

Talked About the Others



Talked About the Others



Grid

Vector

HashMap

Stack

Queue

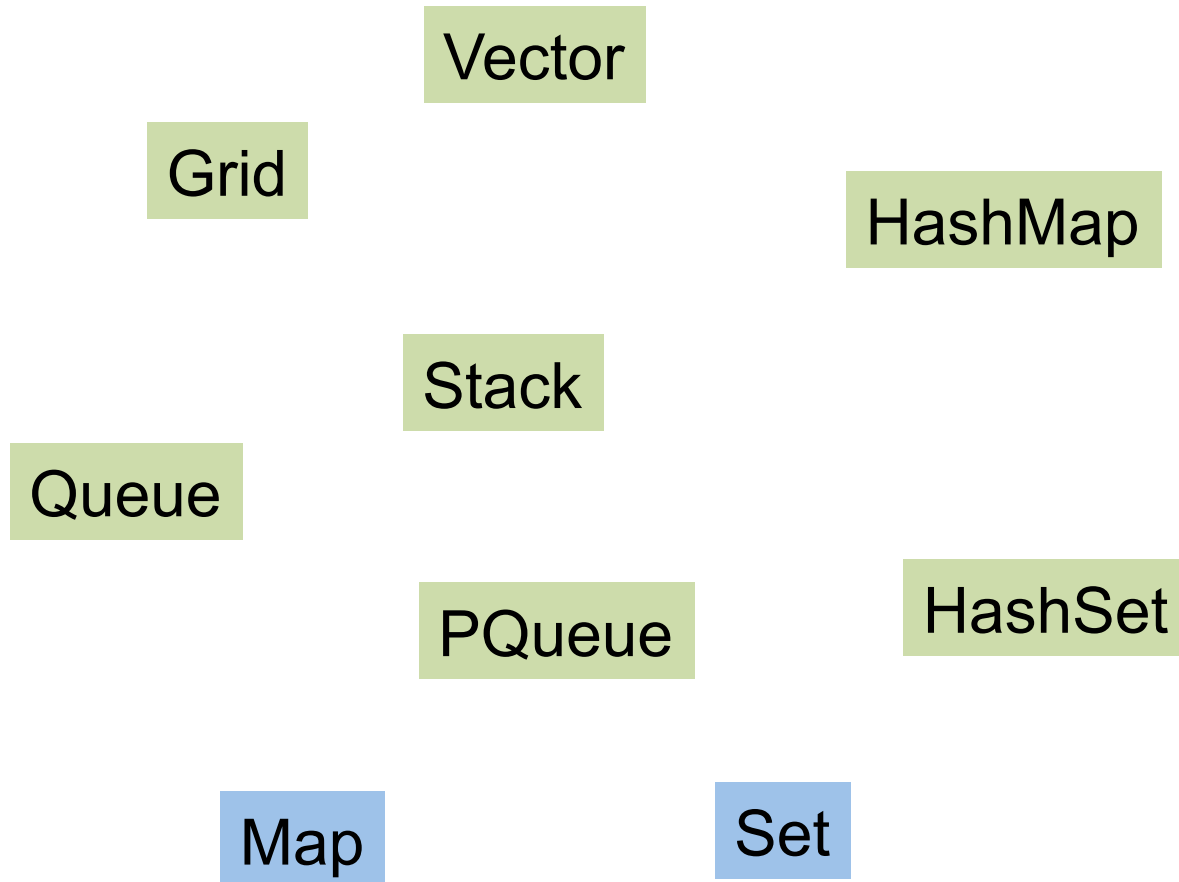
PQueue

HashSet

Map

Set

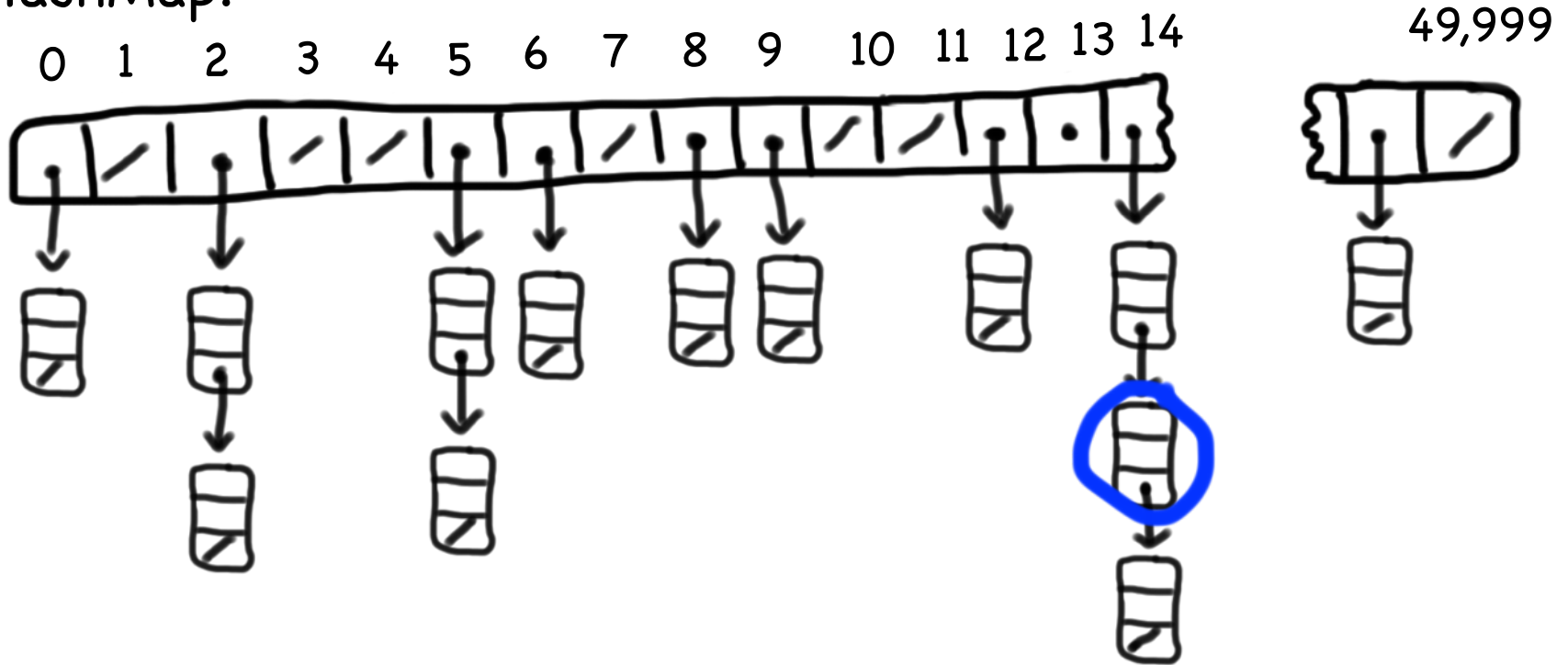
Talked About the Others



How does the Map/Set work?

HashMap

HashMap:

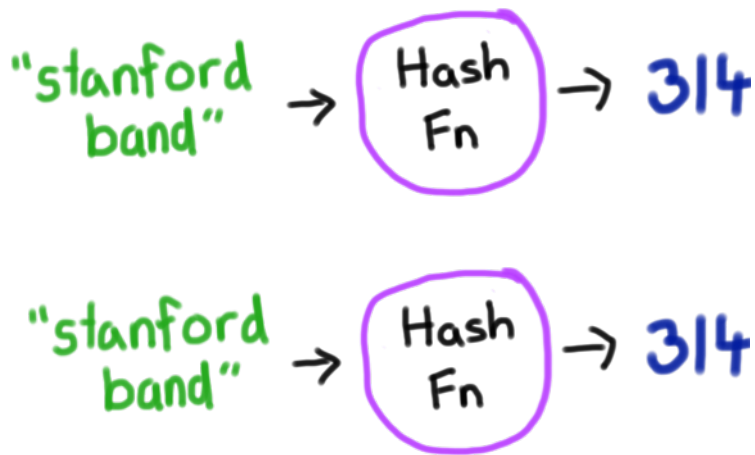


Hash Function

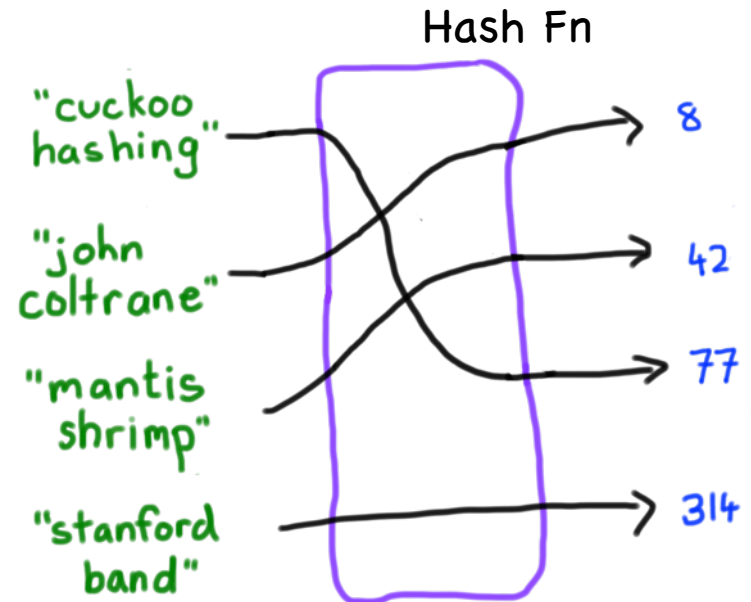
```
int hash(string key);
```



1. Consistent

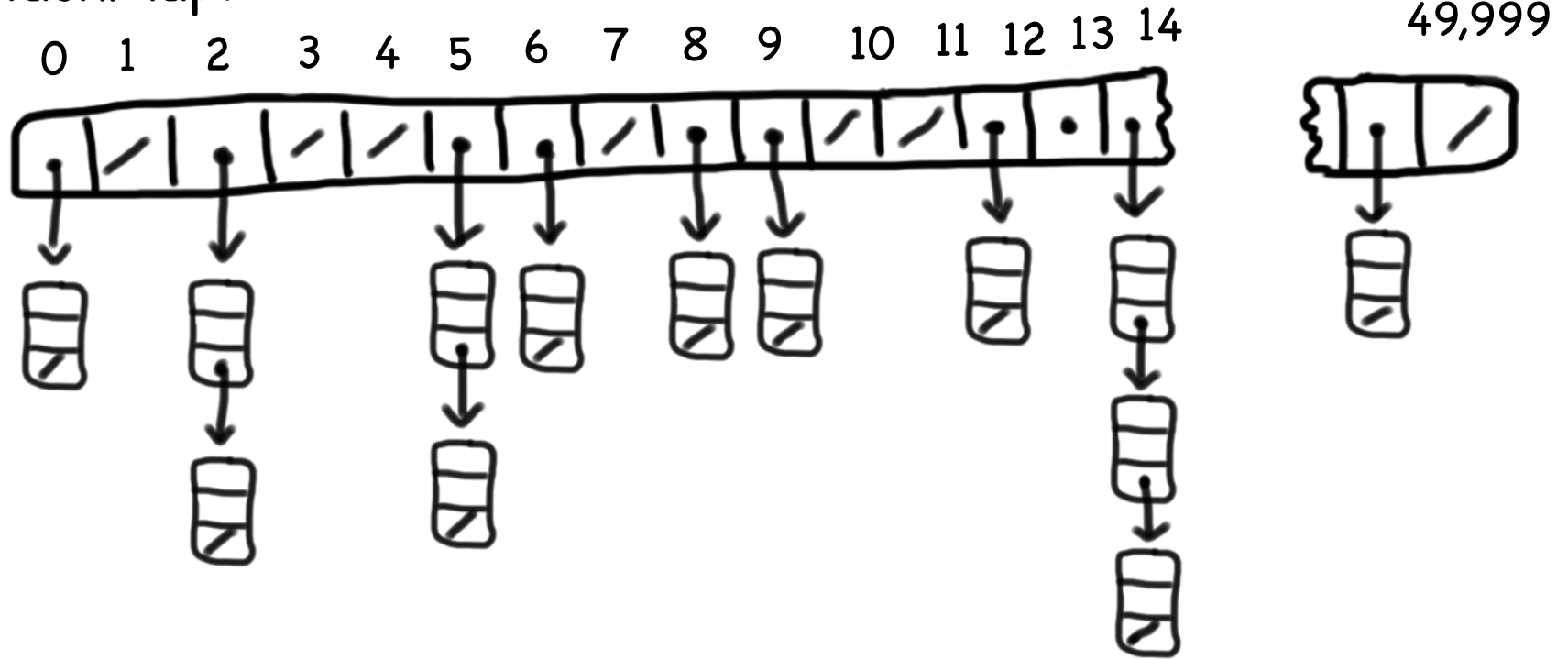


2. Well Distributed



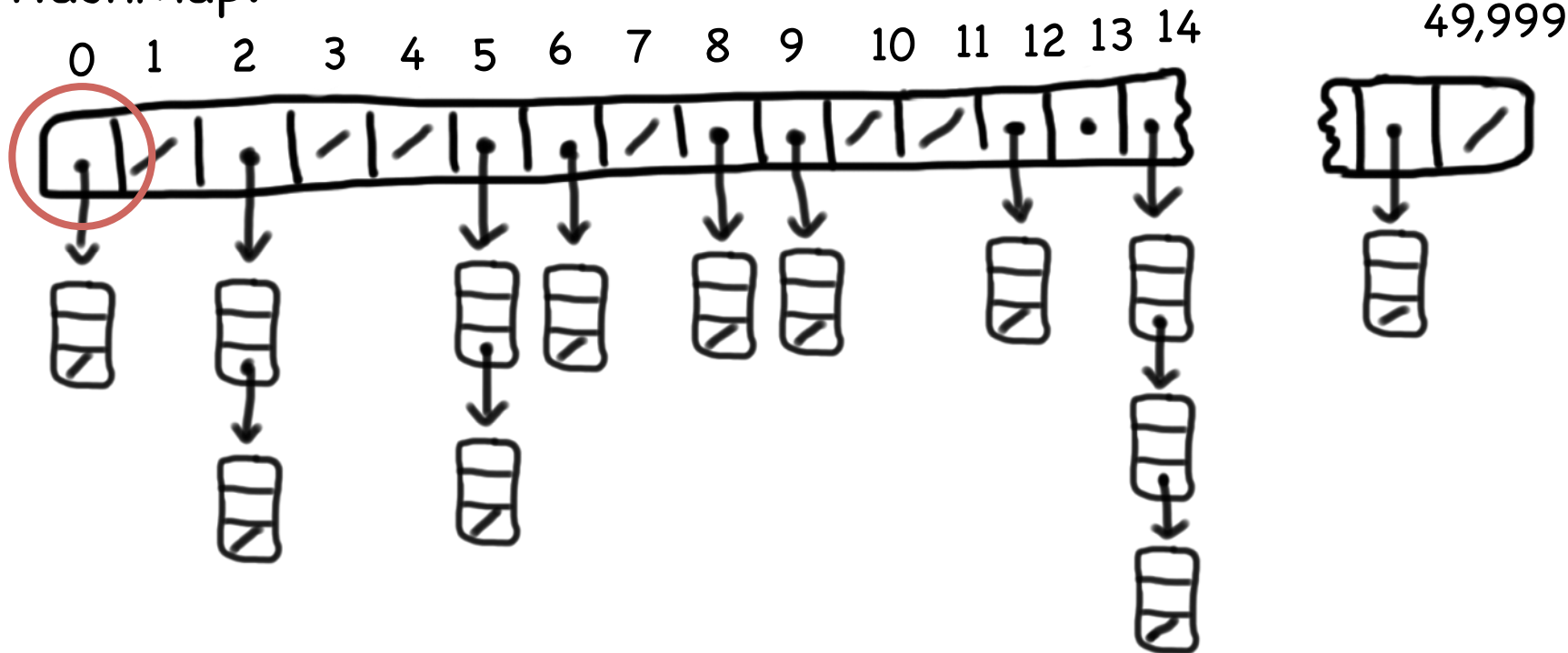
Iteration

HashMap:



Iteration

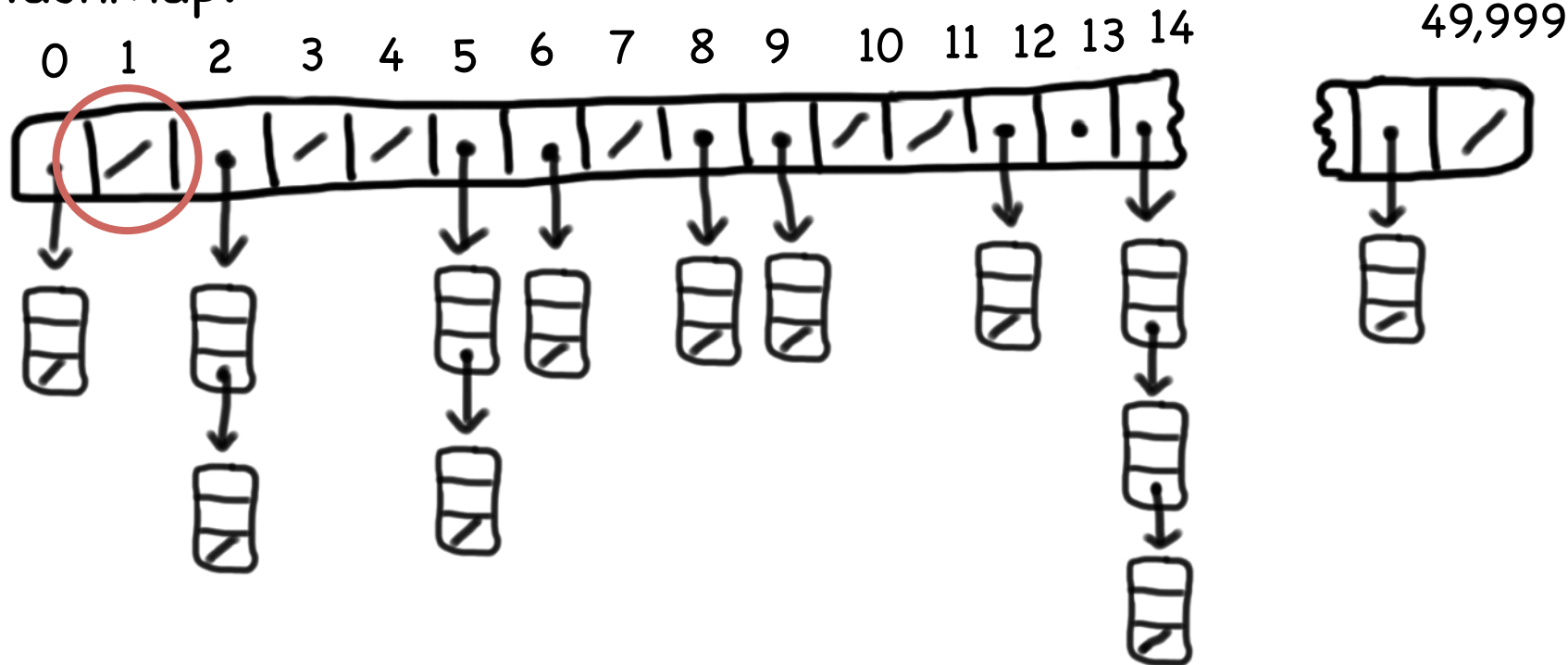
HashMap:



Iterating over a map doesn't return elements in sorted order

Iteration

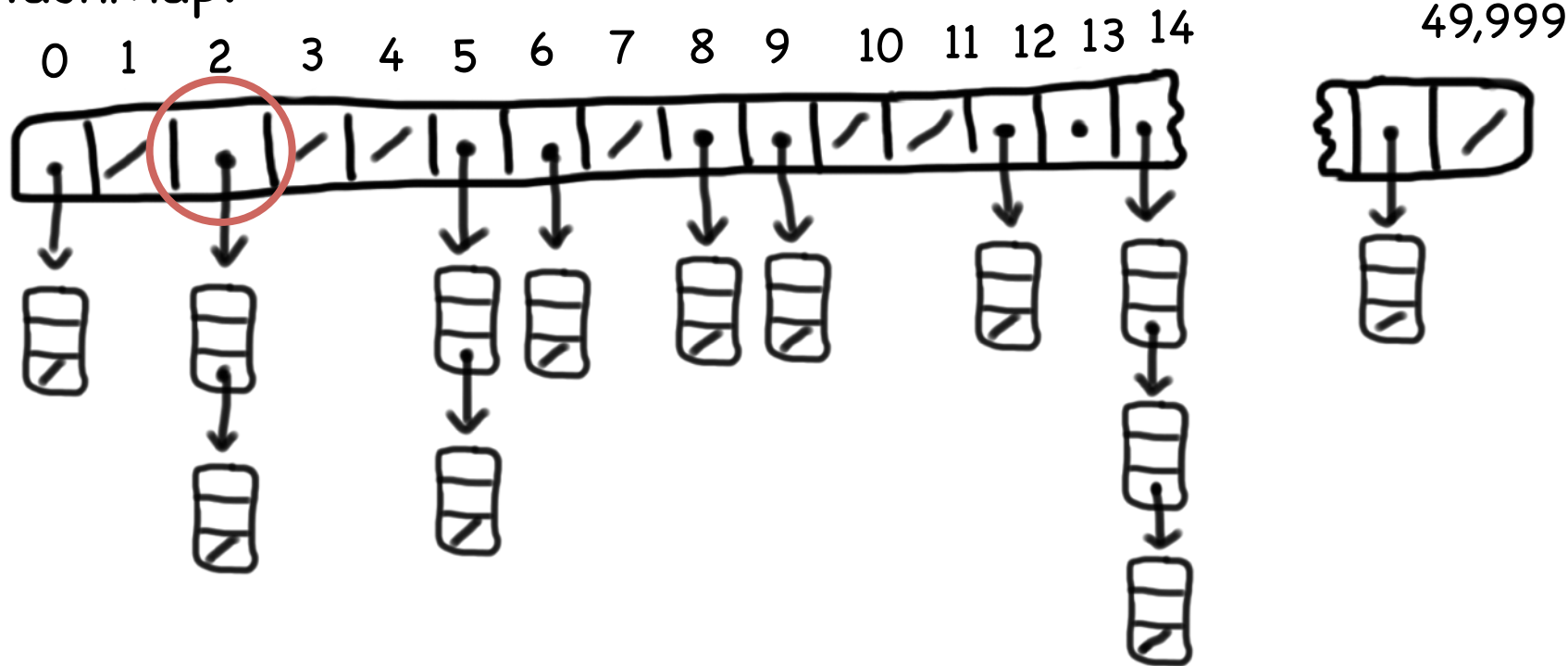
HashMap:



Iterating over a map doesn't return elements in sorted order

Iteration

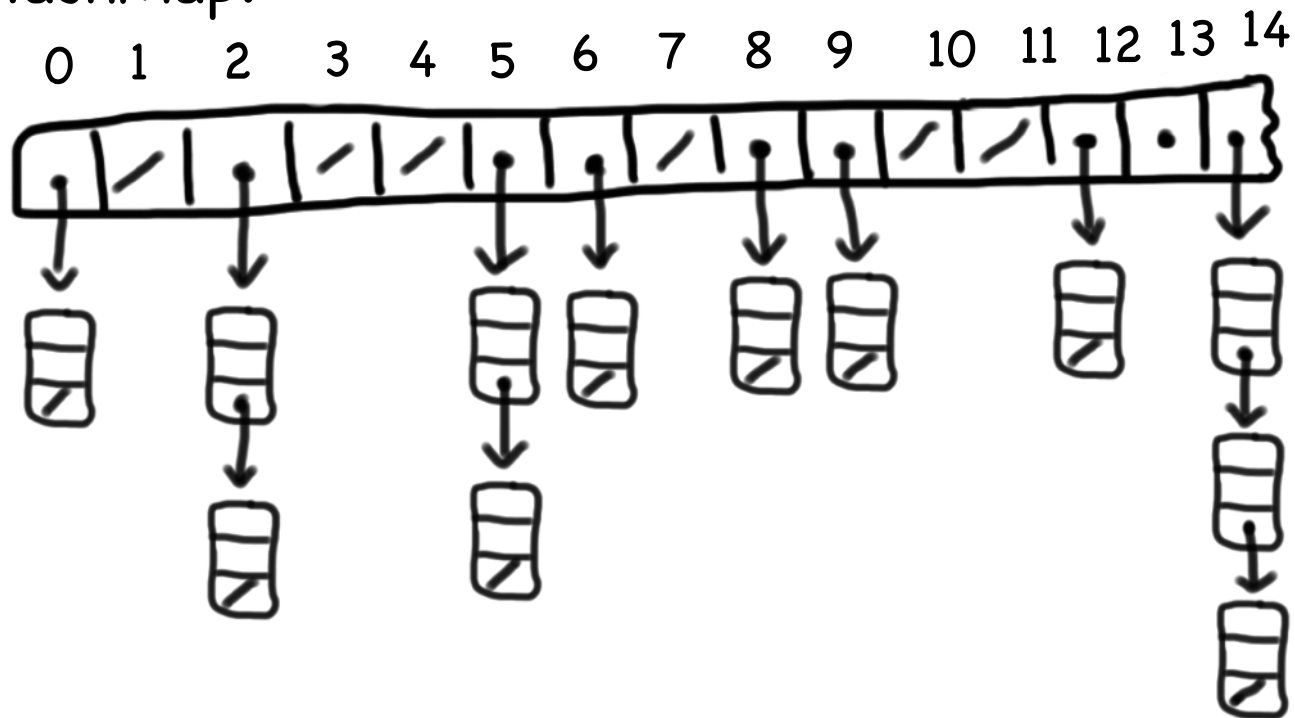
HashMap:



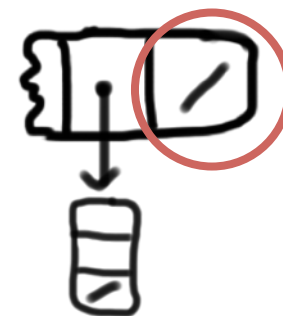
Iterating over a map doesn't return elements in sorted order

Iteration

HashMap:

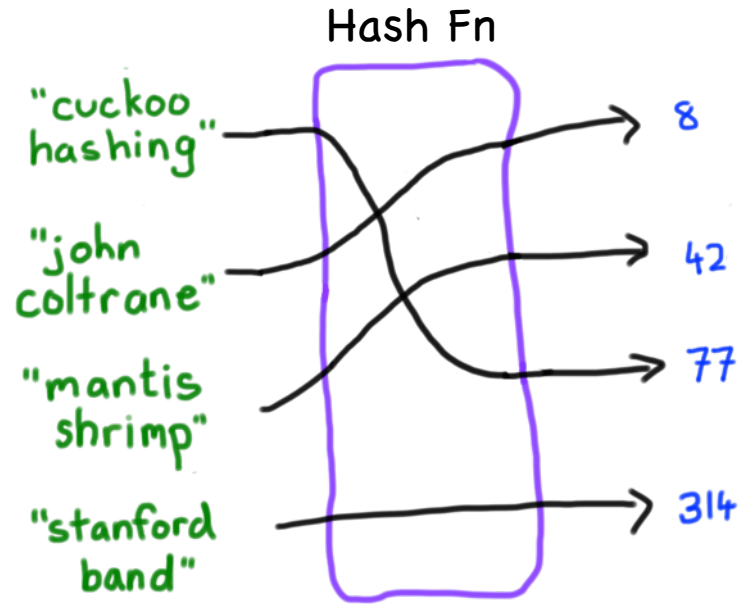


49,999



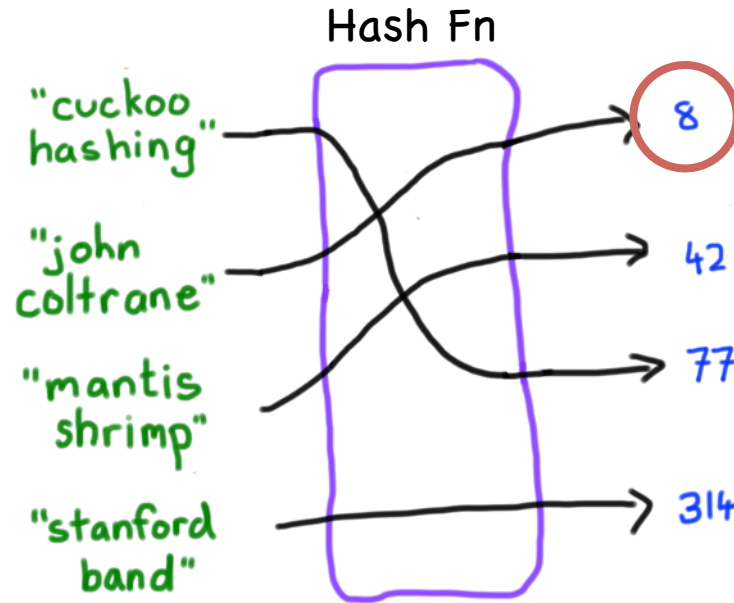
Iterating over a map doesn't return elements in sorted order

Iteration?



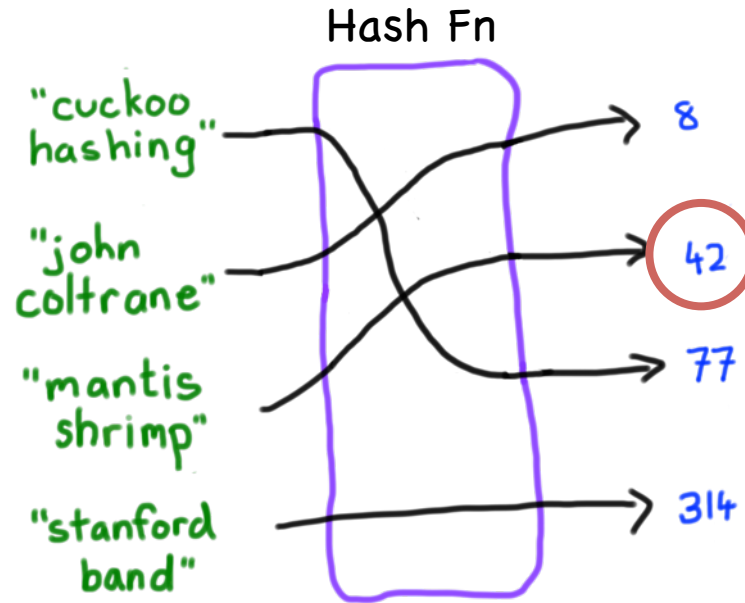
Iterating over a map doesn't return elements in sorted order

Iteration?



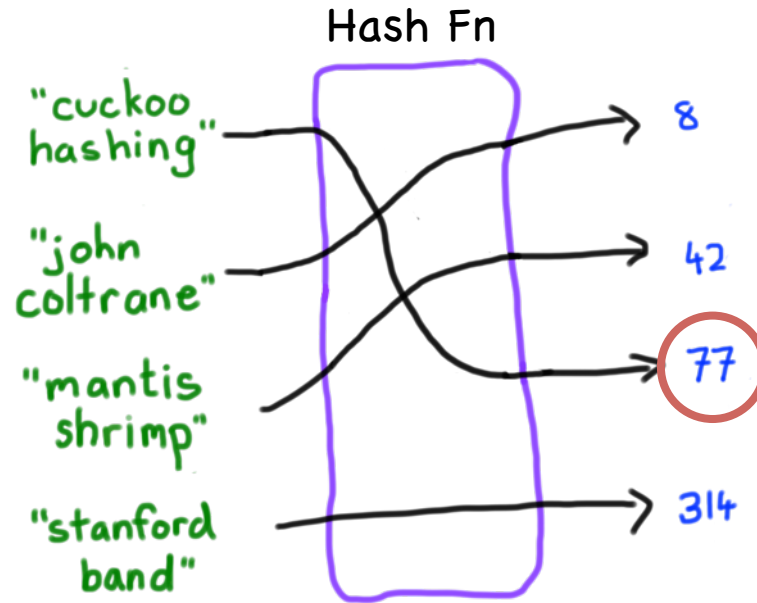
Iterating over a map doesn't return elements in sorted order

Iteration?



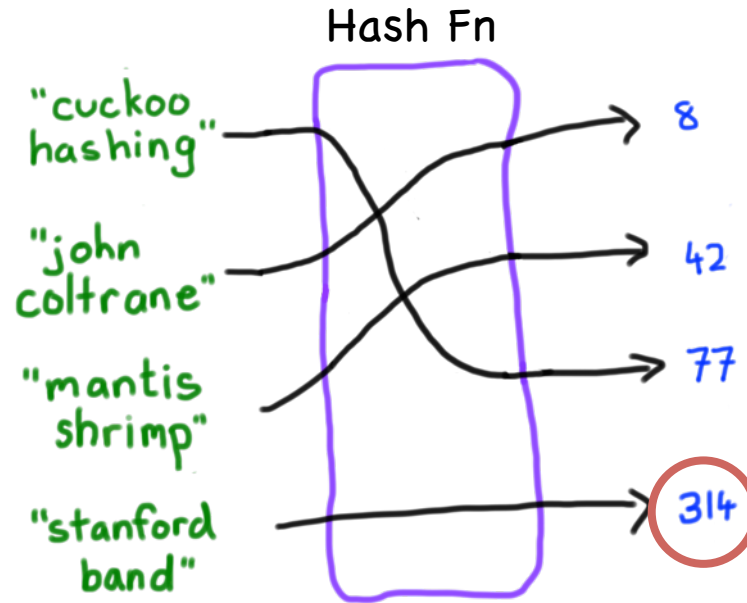
Iterating over a map doesn't return elements in sorted order

Iteration?



Iterating over a map doesn't return elements in sorted order

Iteration?



Iterating over a map doesn't return elements in sorted order

Maps and Sets Print in Order

[Suspense]

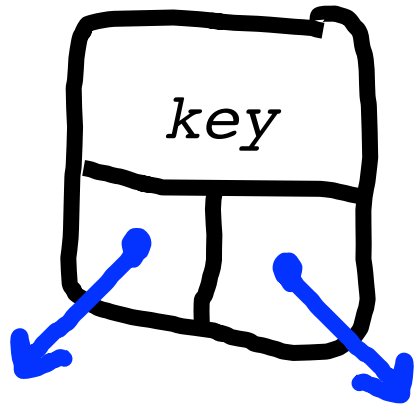


Binary Tree
search

Binary Tree

Search

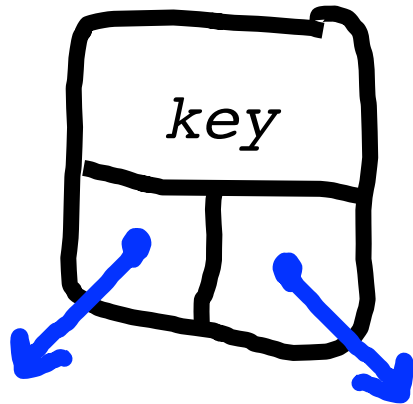
Binary Tree



Binary Tree

Search

Binary Tree

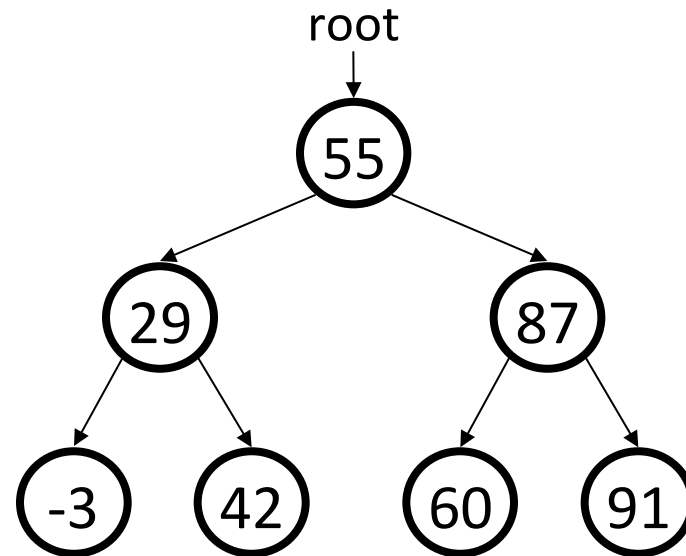


Search Tree

For a tree **root**:

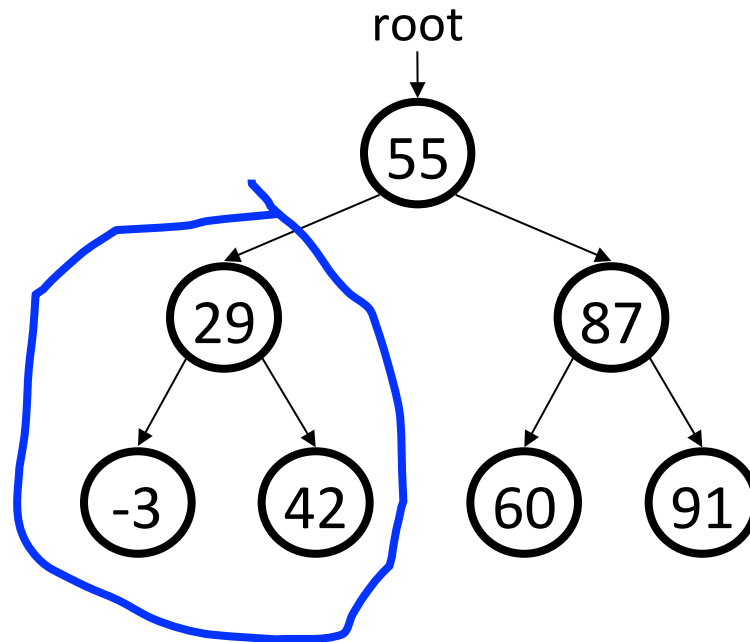
1. Every node in root's left subtree has a key $<$ root's key
2. Every node of root's right subtree has a key $>$ root's key
3. All children of root are also binary search trees

Binary Search Tree



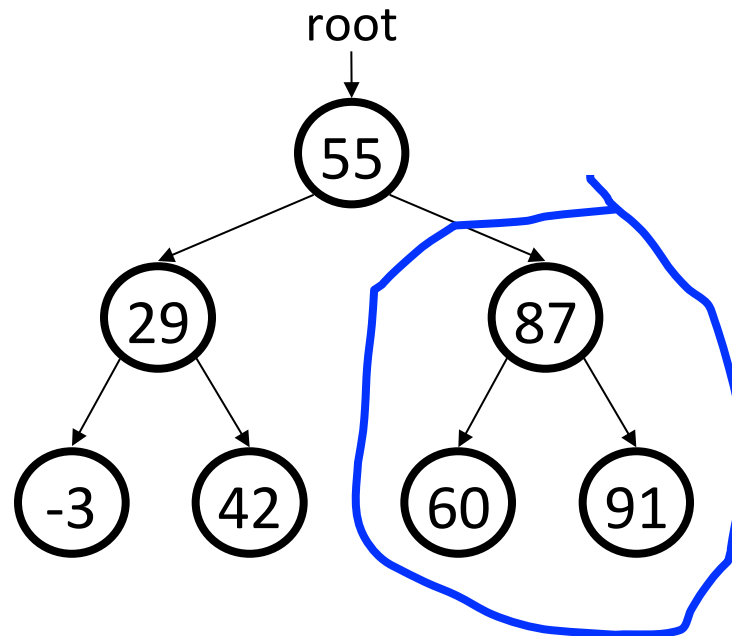
What makes a tree a Binary Search Tree?

Binary Search Tree



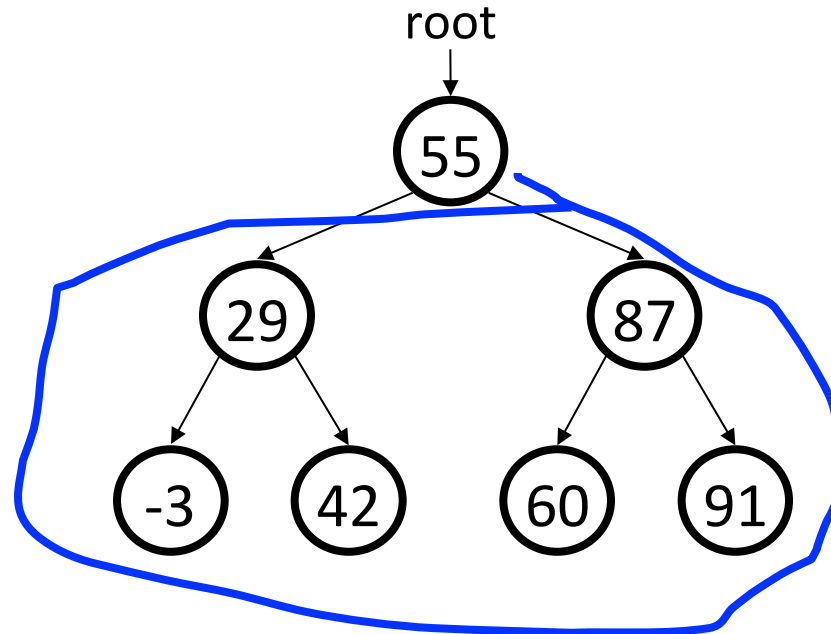
1. Every node in root's left subtree has a key $<$ root's key

Binary Search Tree



2. Every node in root's right subtree has a key $>$ root's key

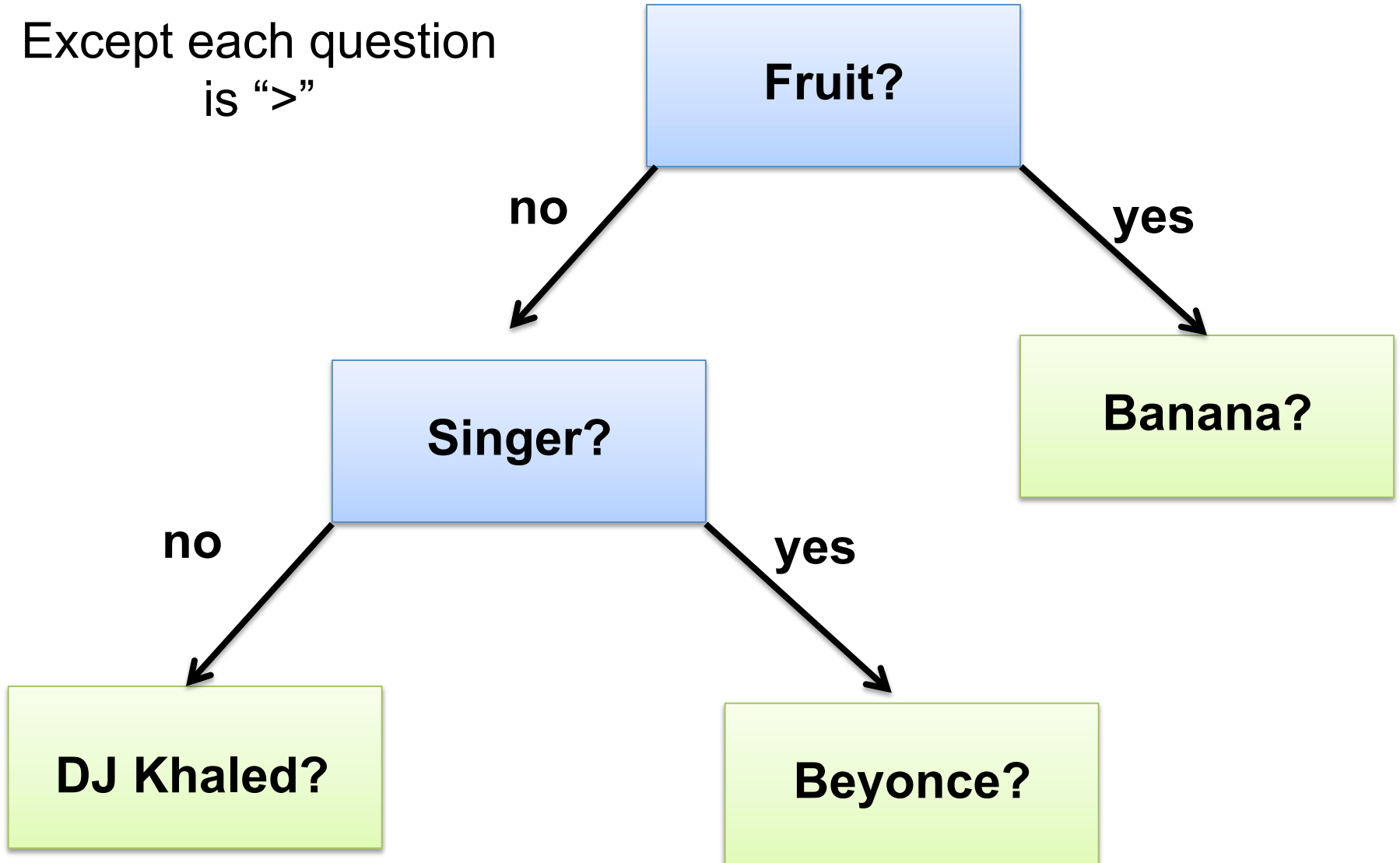
Binary Search Tree



3. All children of root are also binary search trees.

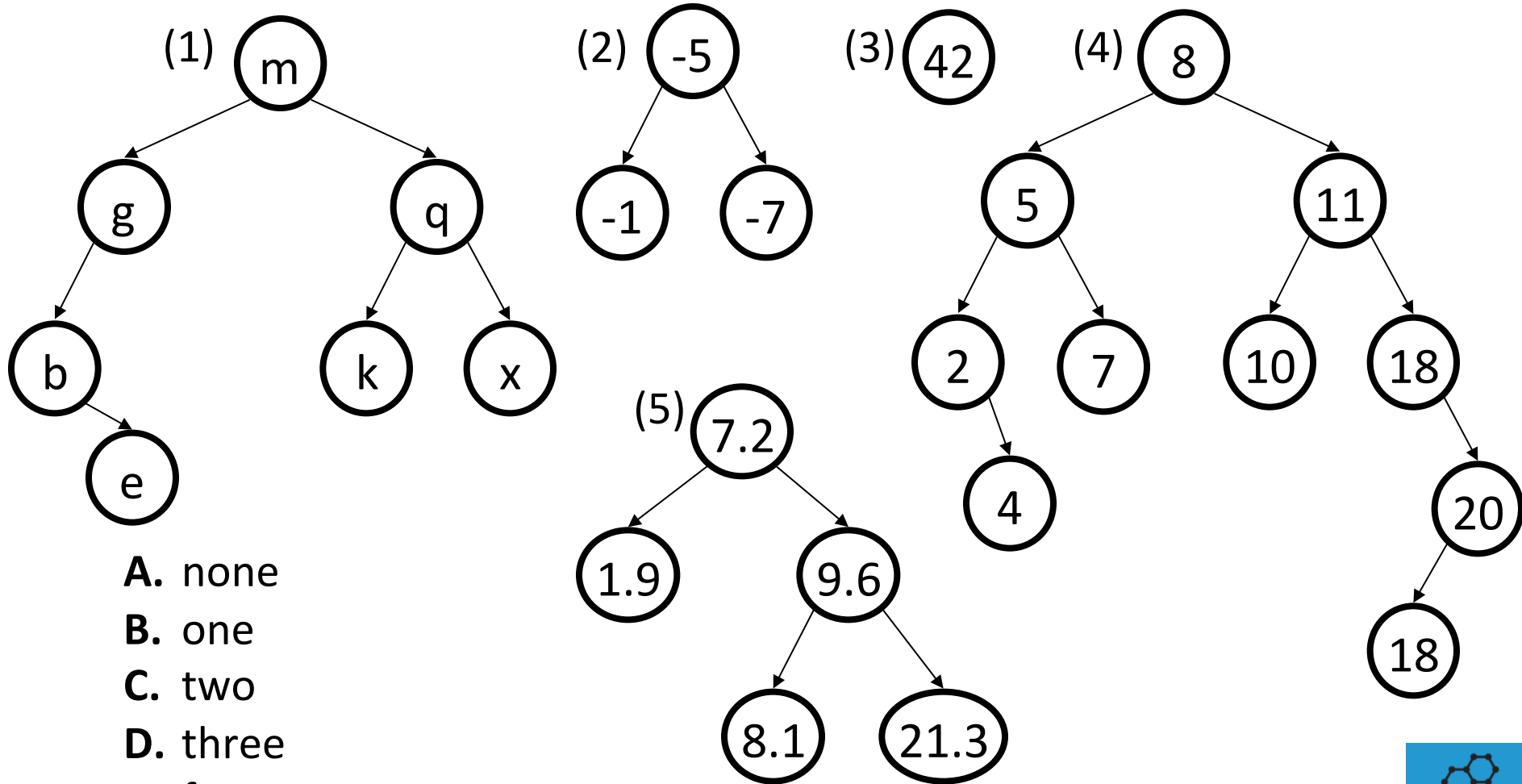
Like a Pensive

Except each question is “>”



BST examples

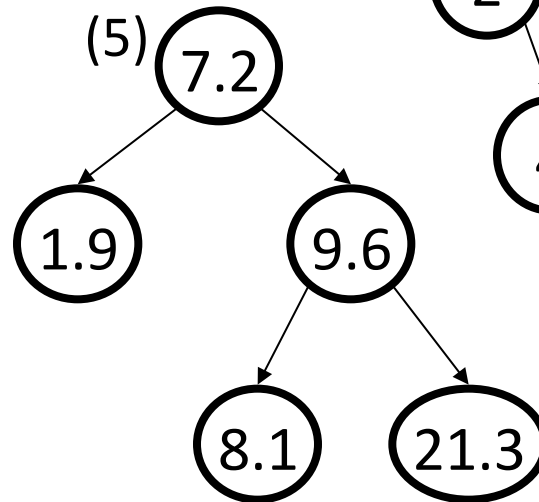
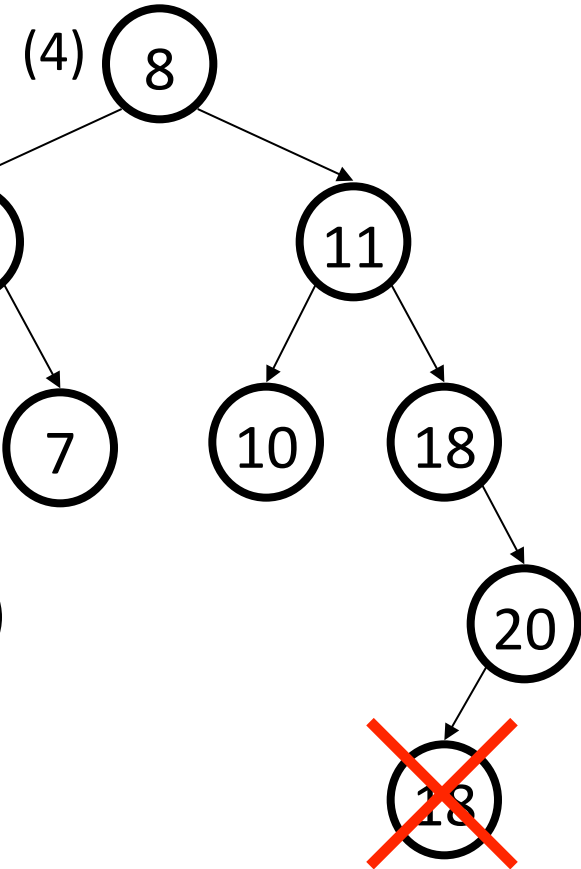
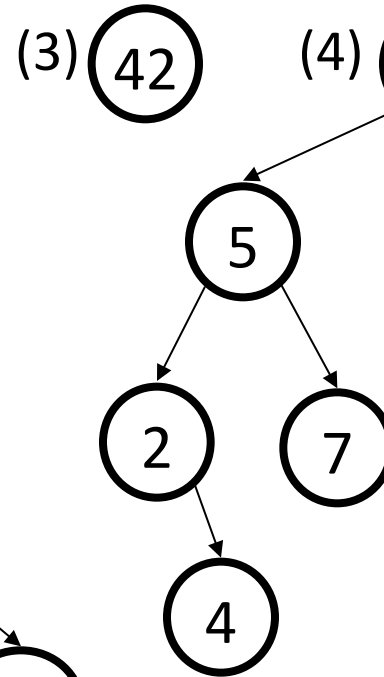
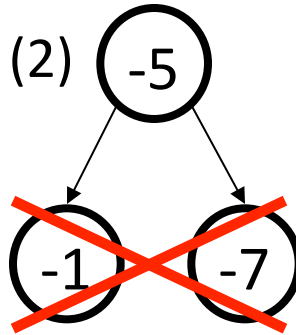
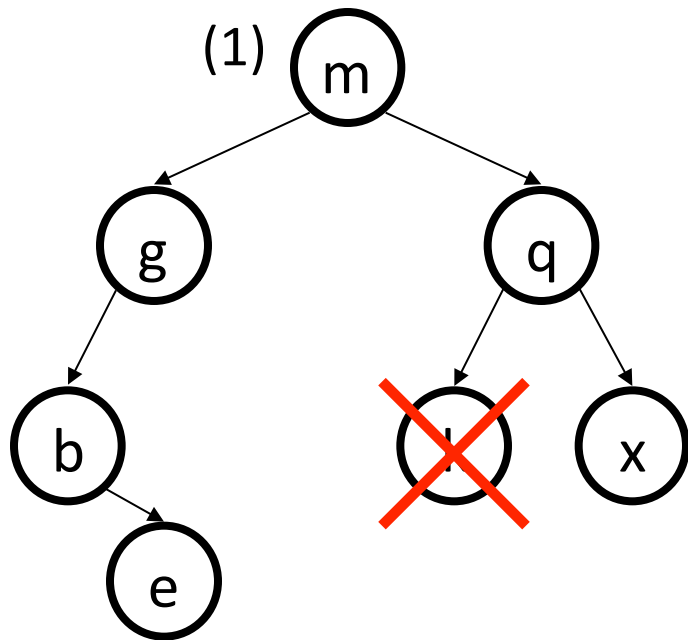
Q: How many of the trees shown are legal binary search trees?



- A. none
- B. one
- C. two
- D. three
- E. four or more

BST examples

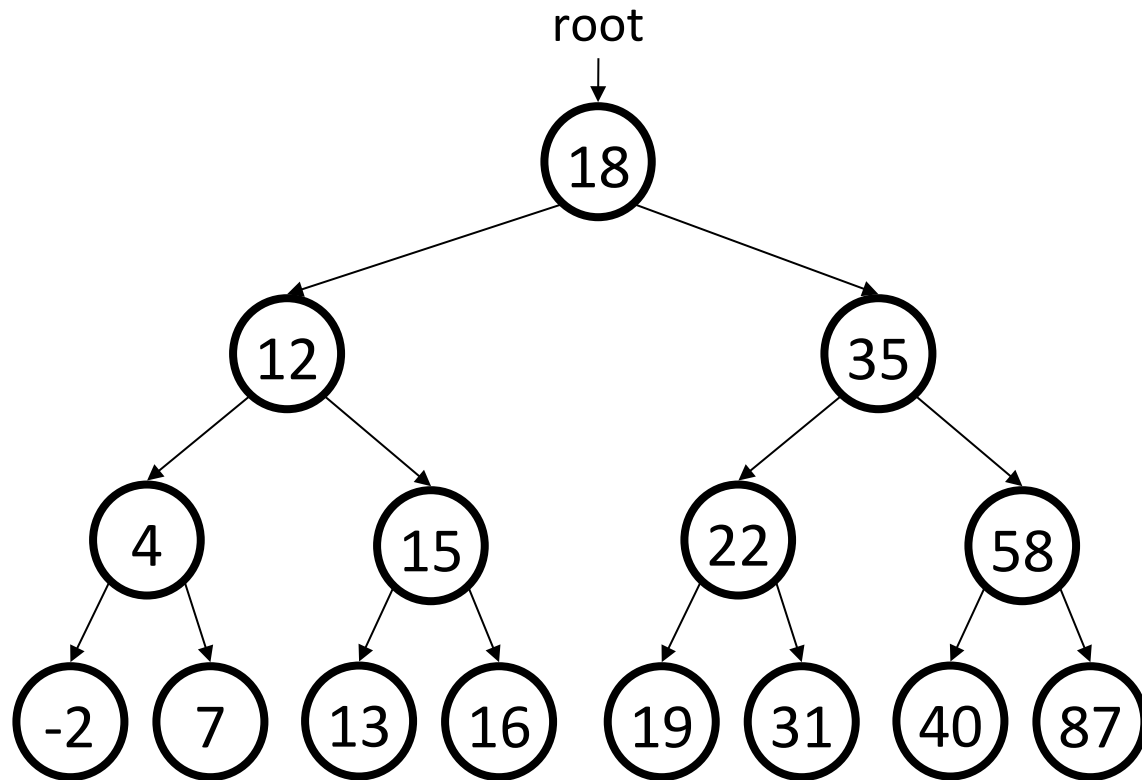
Q: How many of the trees shown are legal binary search trees?



- A. none
- B. one
- C. two
- D. three
- E. four or more

Searching a BST

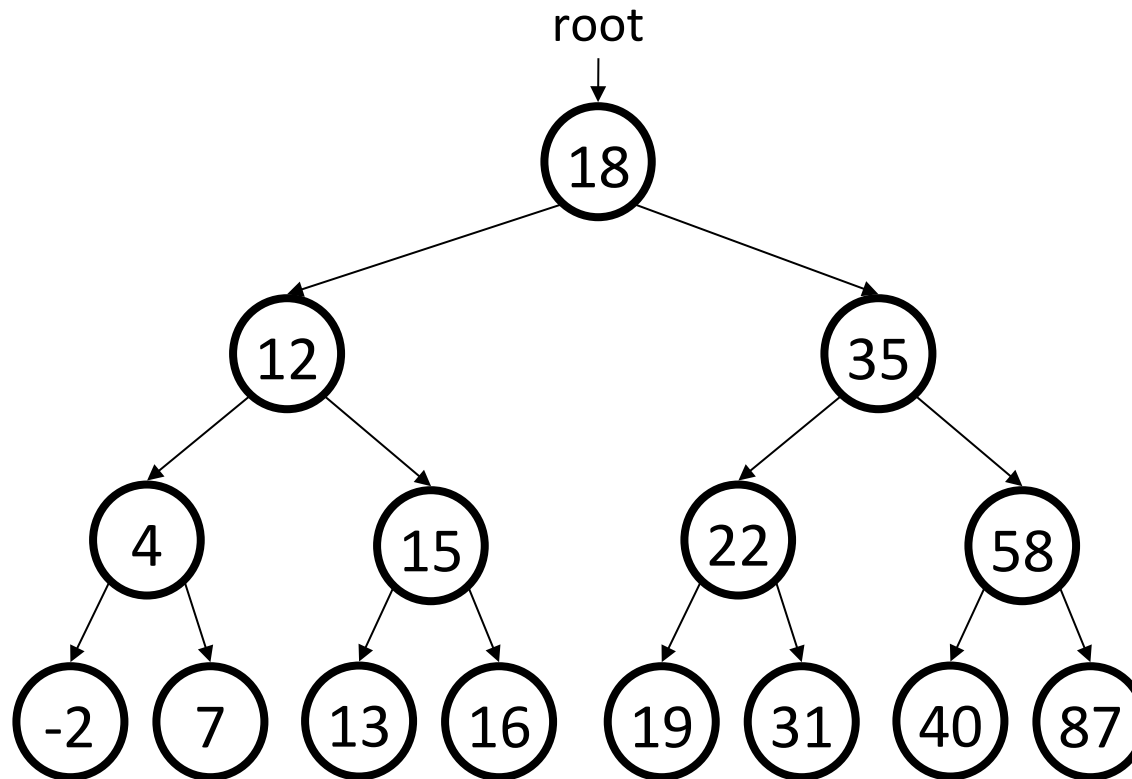
1. Try searching for the value 31, then 6 from the root



Describe your algorithm

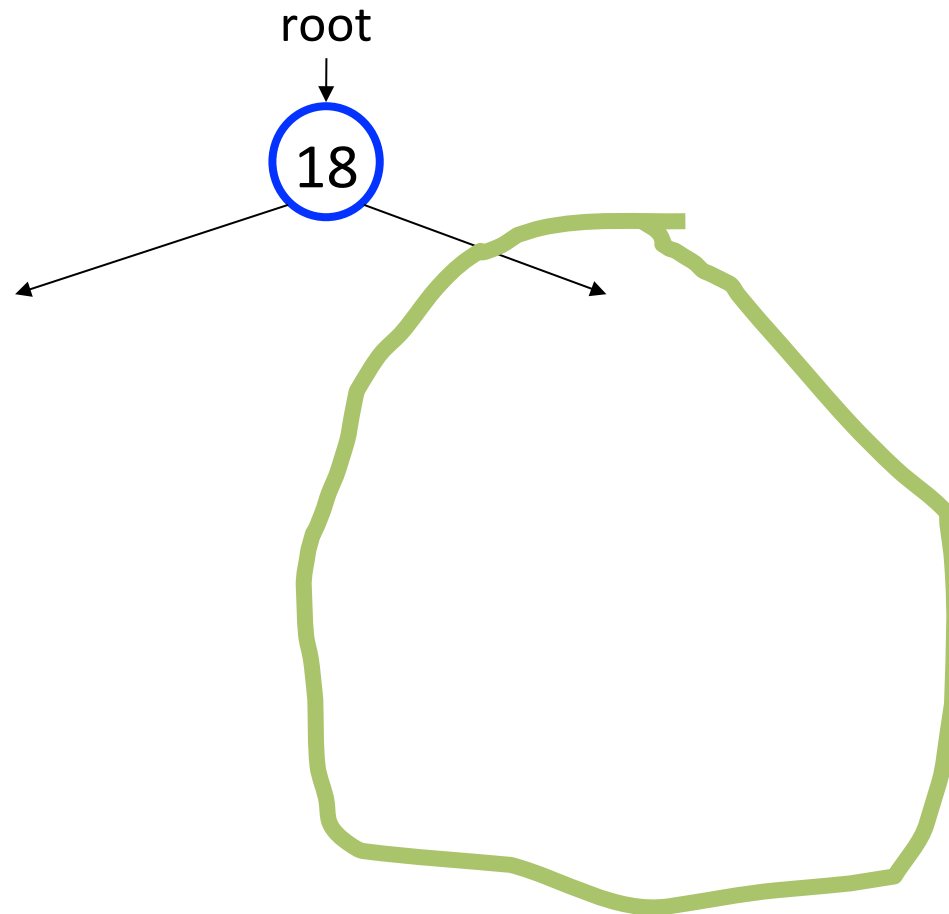
Searching a BST

2. Describe your algorithm



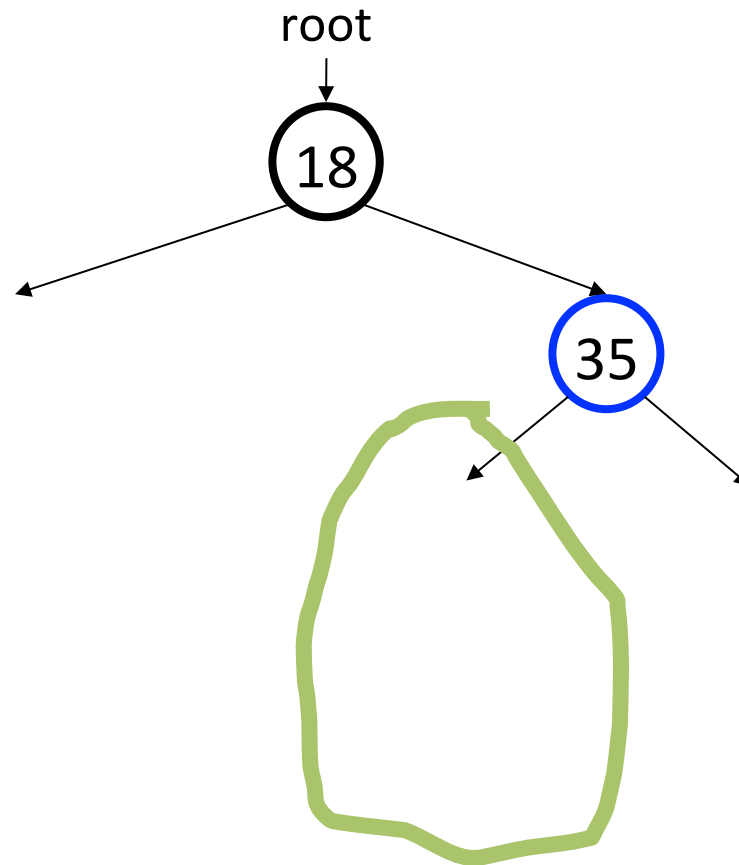
Searching a BST

Searching for the value **31** from the root



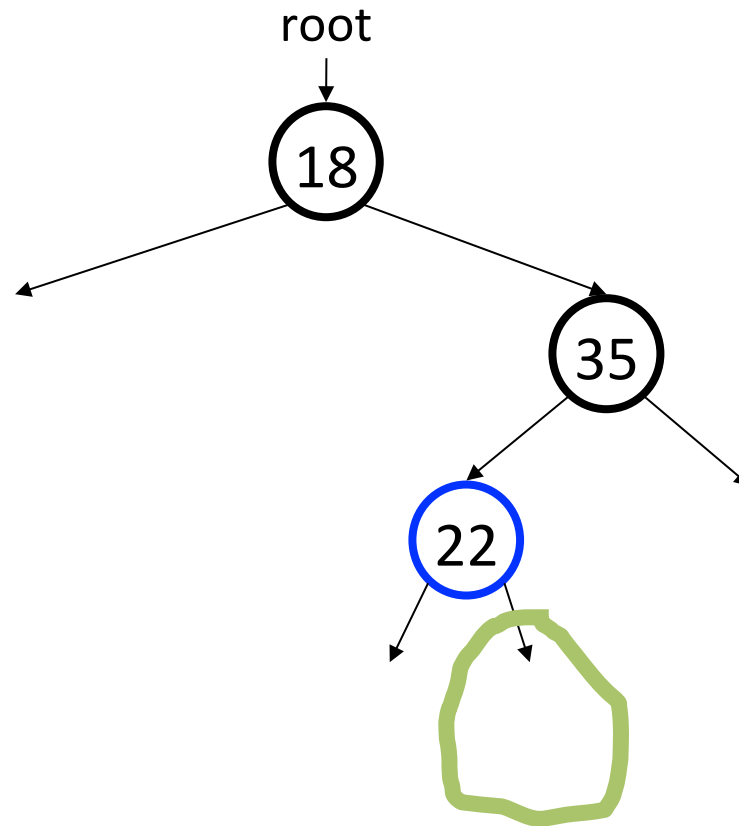
Searching a BST

Searching for the value **31** from the root



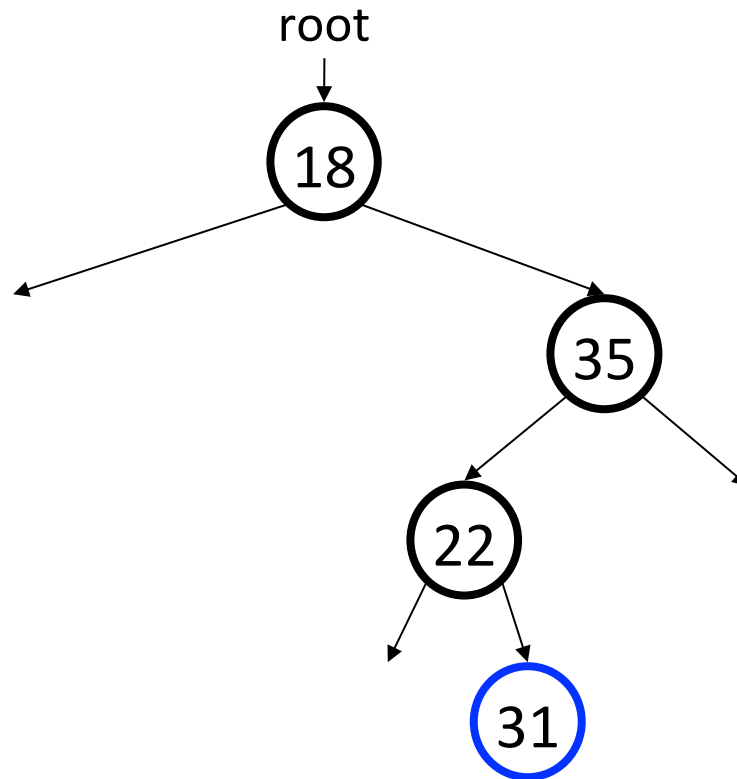
Searching a BST

Searching for the value **31** from the root



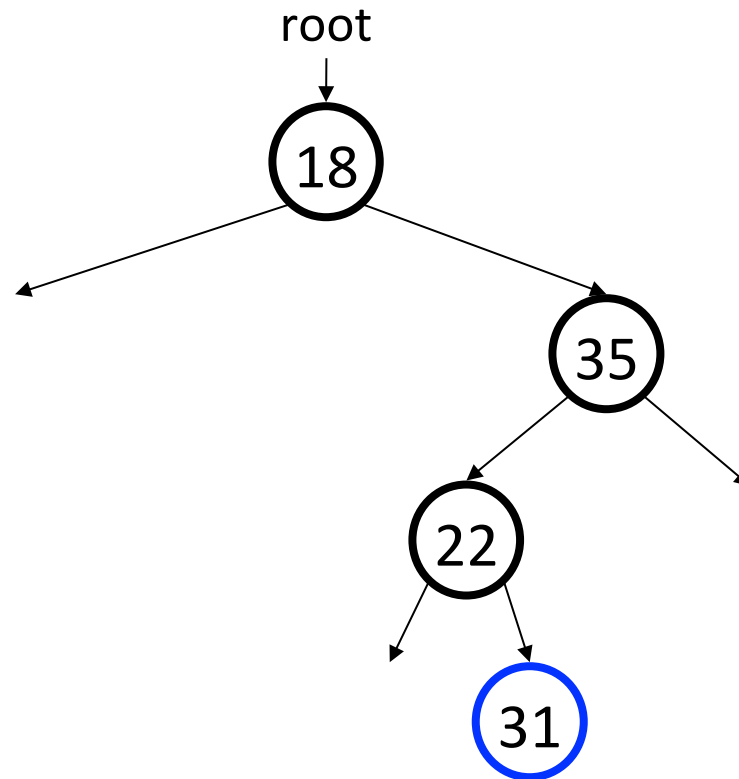
Searching a BST

Searching for the value **31** from the root



Searching a BST

Searching for the value **31** from the root



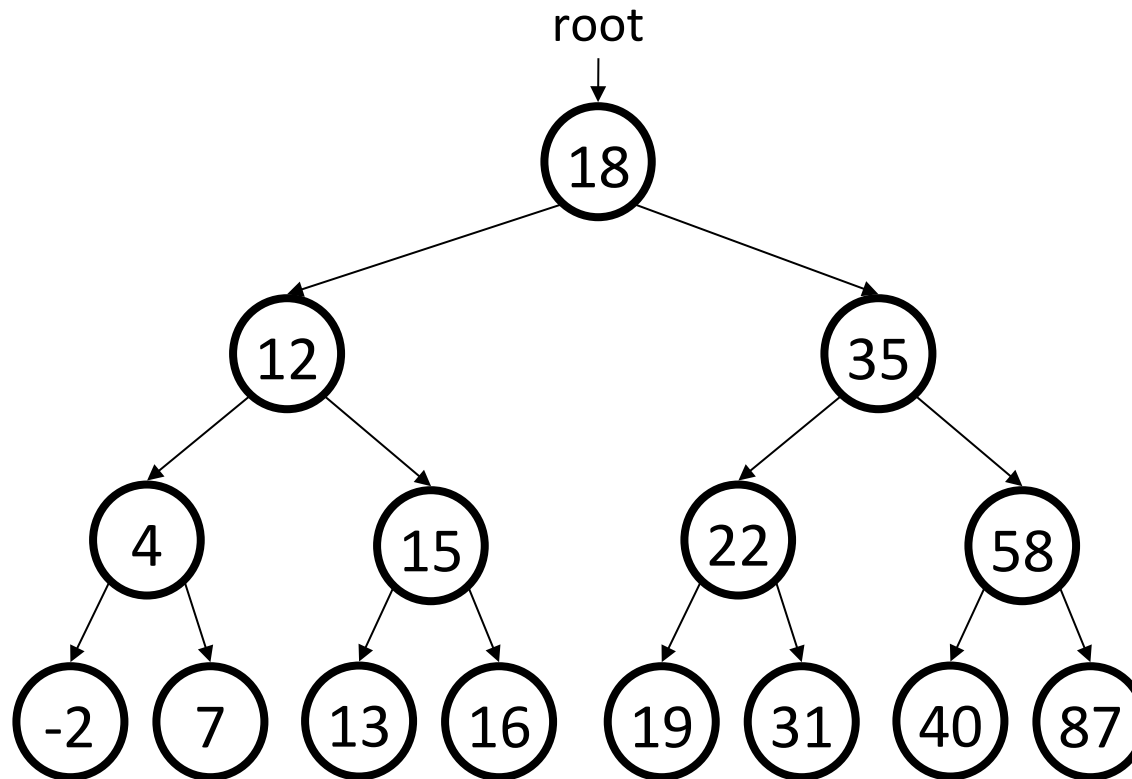
Contains Algorithm

```
bool contains(Tree * tree, int value) {  
    // you hit a leaf. Only happens if no value  
    if(tree == NULL) return false;  
    // you found it! Yes tree contains value.  
    if(tree->value == value) return true;  
  
    if(value < tree->value) {  
        // if value is less, recurse on left.  
        return contains(tree->left);  
    } else {  
        // if value is greater, recurse on right.  
        return contains(tree->right);  
    }  
}
```

Big O?

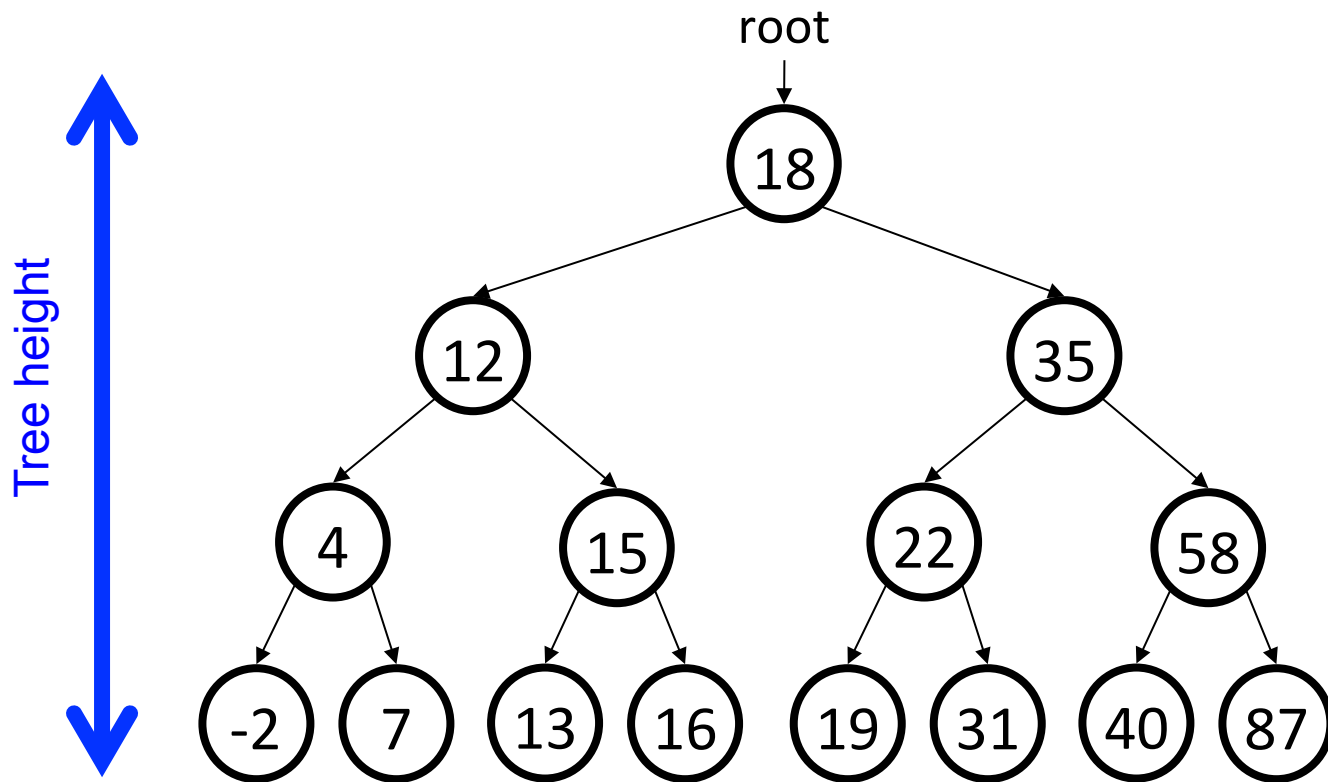
Searching a BST

3. What's the maximum number of nodes to check?



Searching a BST

3. What's the maximum number of nodes to check?

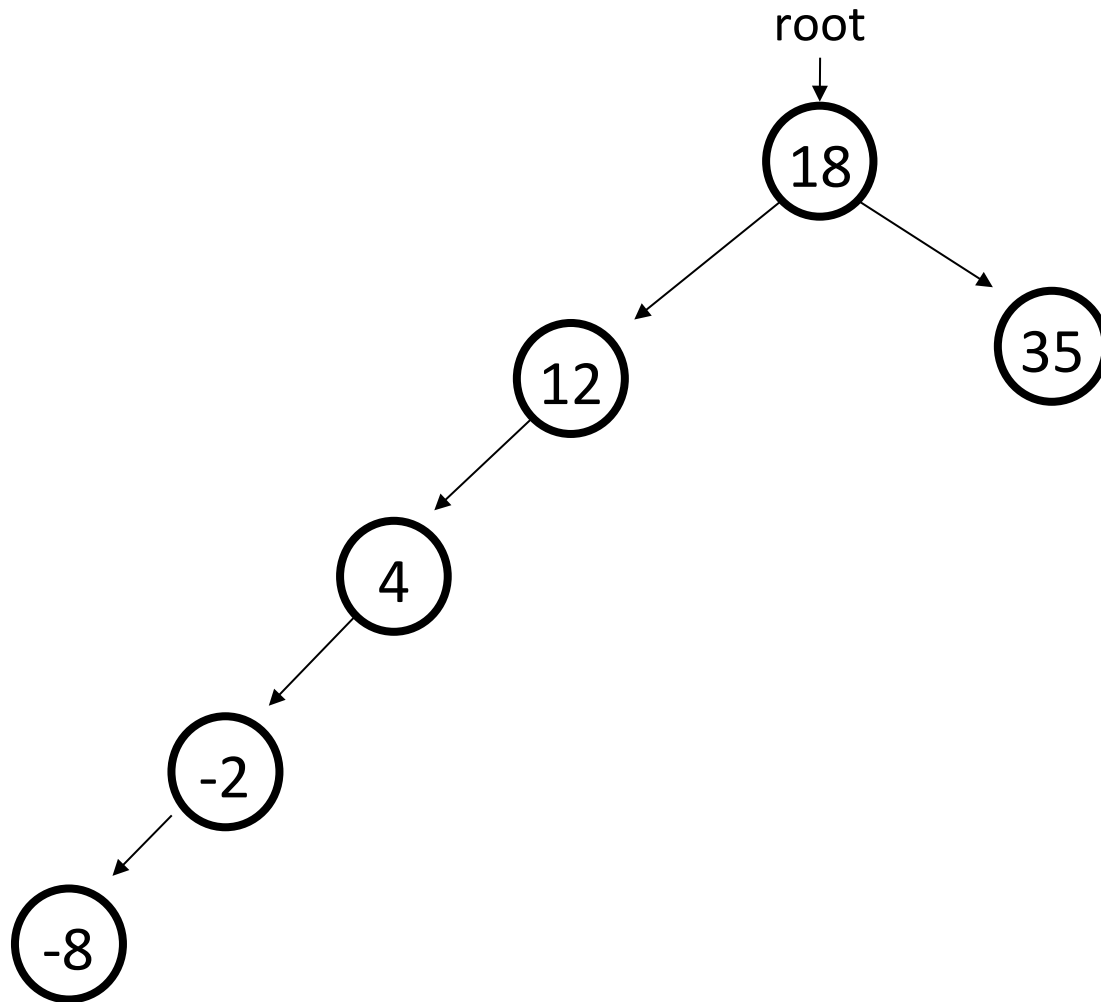


Contains Big O

$$\mathcal{O}(\log n)$$

* Assuming the tree is balanced

Unbalance



This is what an unbalanced tree looks like.

Add

Choice 1

```
void add(Tree * tree, int value) {
    if(tree == NULL) {
        tree = new Tree;
        tree->value = value;
        tree->left = NULL;
        tree->right = NULL;
    } else {
        if(value < tree->value) {
            add(tree->left, value);
        } else if(value > tree->value){
            add(tree->right, value);
        }
    }
}
```

Choice 2

```
void add(Tree * & tree, int value) {
    if(tree == NULL) {
        tree = new Tree;
        tree->value = value;
        tree->left = NULL;
        tree->right = NULL;
    } else {
        if(value < tree->value) {
            add(tree->left, value);
        } else if(value > tree->value){
            add(tree->right, value);
        }
    }
}
```

Which one is better?

Add

Choice 1

```
void add(Tree * tree, int value) {
    if(tree == NULL) {
        tree = new Tree;
        tree->value = value;
        tree->left = NULL;
        tree->right = NULL;
    } else {
        if(value < tree->value) {
            add(tree->left, value);
        } else if(value > tree->value){
            add(tree->right, value);
        }
    }
}
```

Choice 2

```
void add(Tree * & tree, int value) {
    if(tree == NULL) {
        tree = new Tree;
        tree->value = value;
        tree->left = NULL;
        tree->right = NULL;
    } else {
        if(value < tree->value) {
            add(tree->left, value);
        } else if(value > tree->value){
            add(tree->right, value);
        }
    }
}
```

Which one is better?

Balanced Add and Remove



Leonidas Guibas

Note: Beyond Scope

Illustrating AVL

H

He

Li

Be

B

C

Illustrating AVL

H

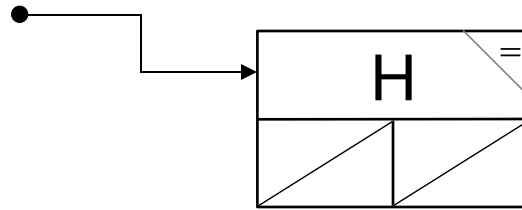
He

Li

Be

B

C



Illustrating AVL

H

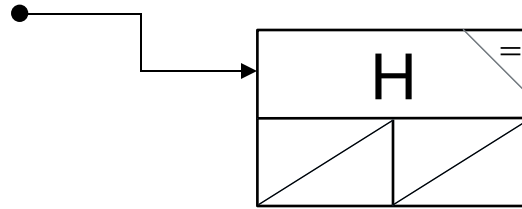
He

Li

Be

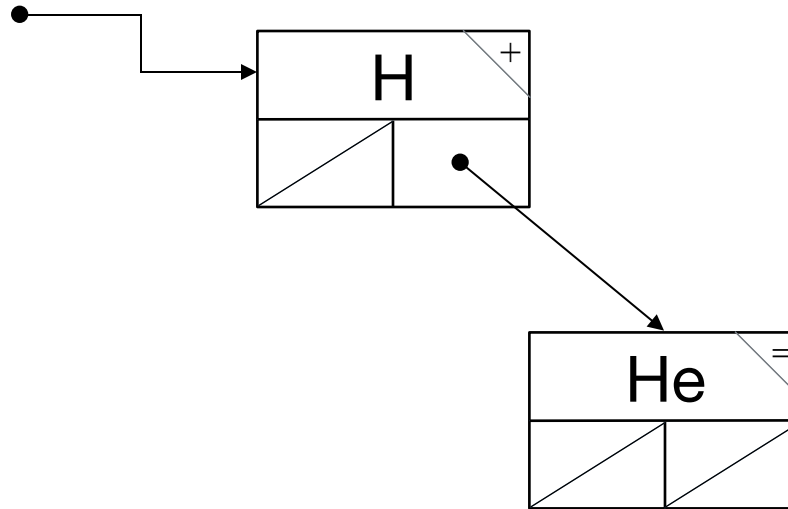
B

C



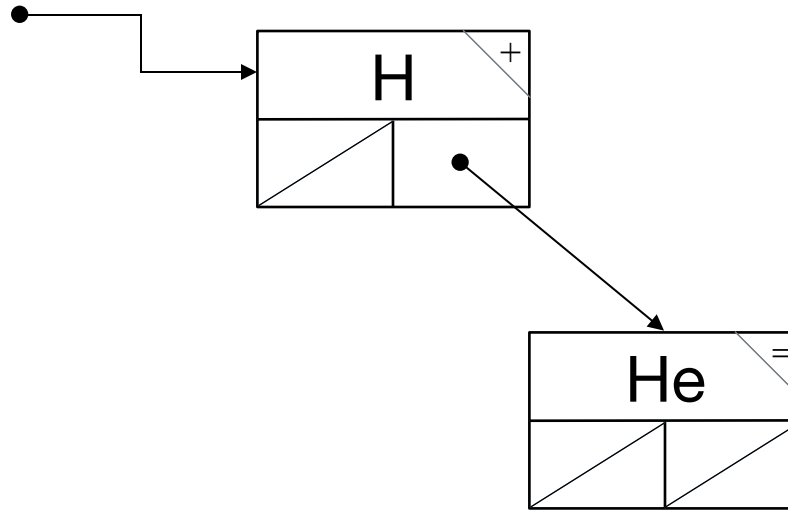
Illustrating AVL

H
He
Li
Be
B
C

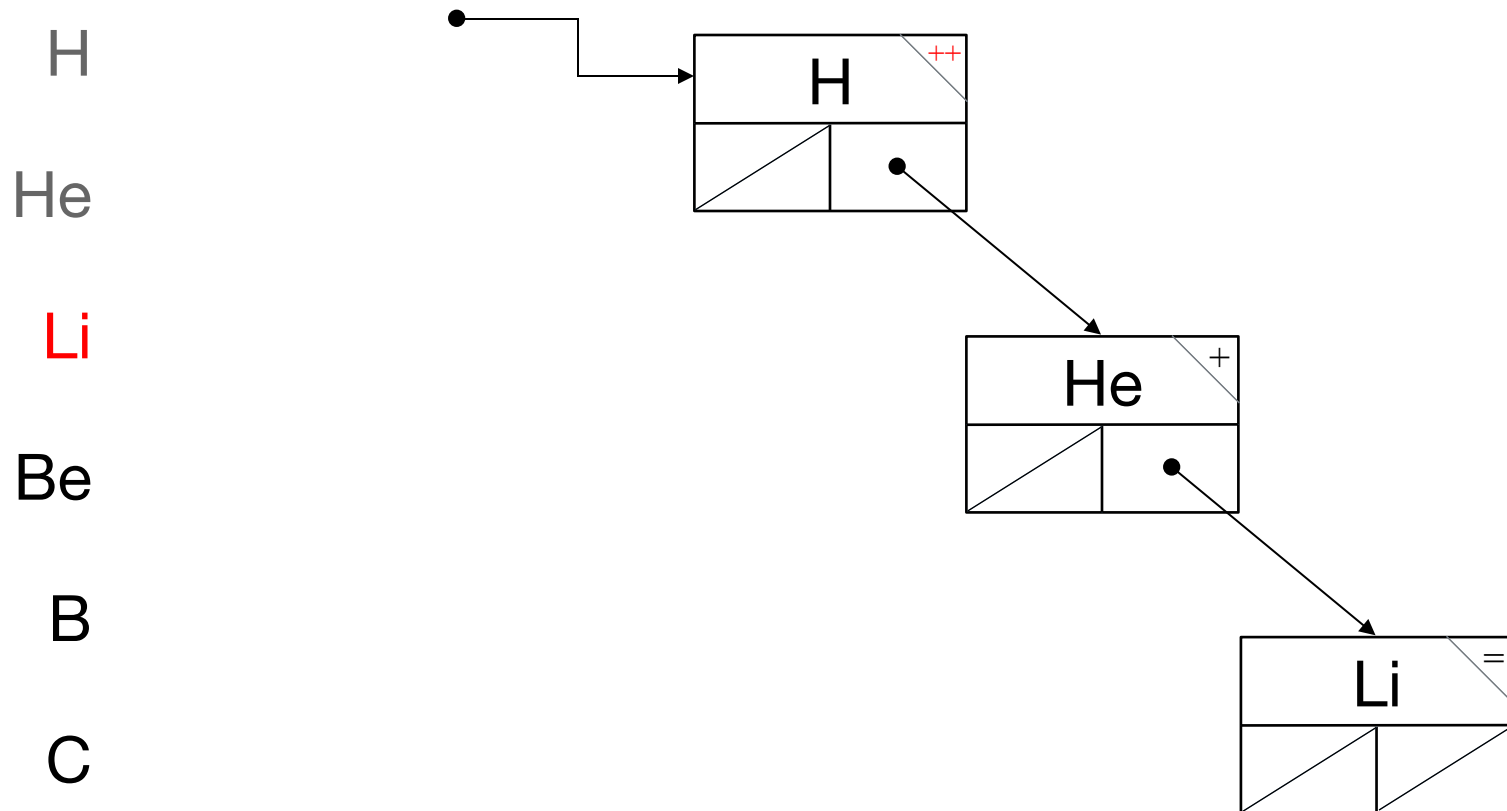


Illustrating AVL

H
He
Li
Be
B
C

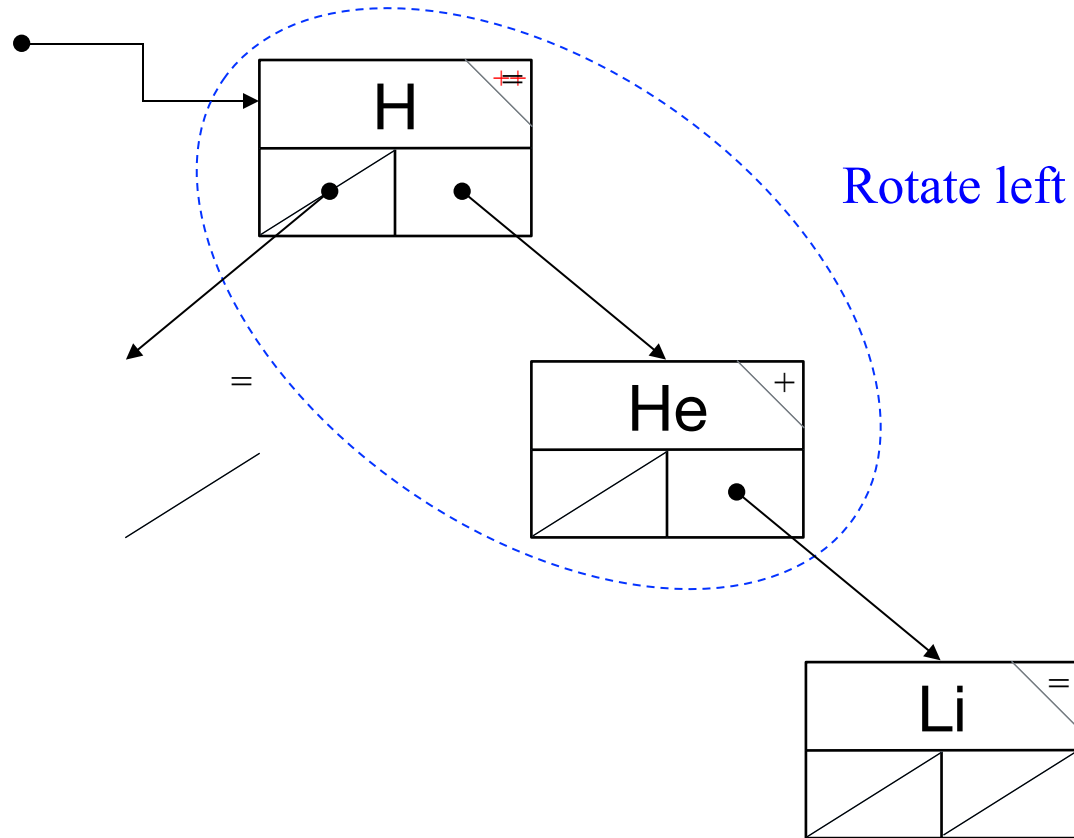


Illustrating AVL

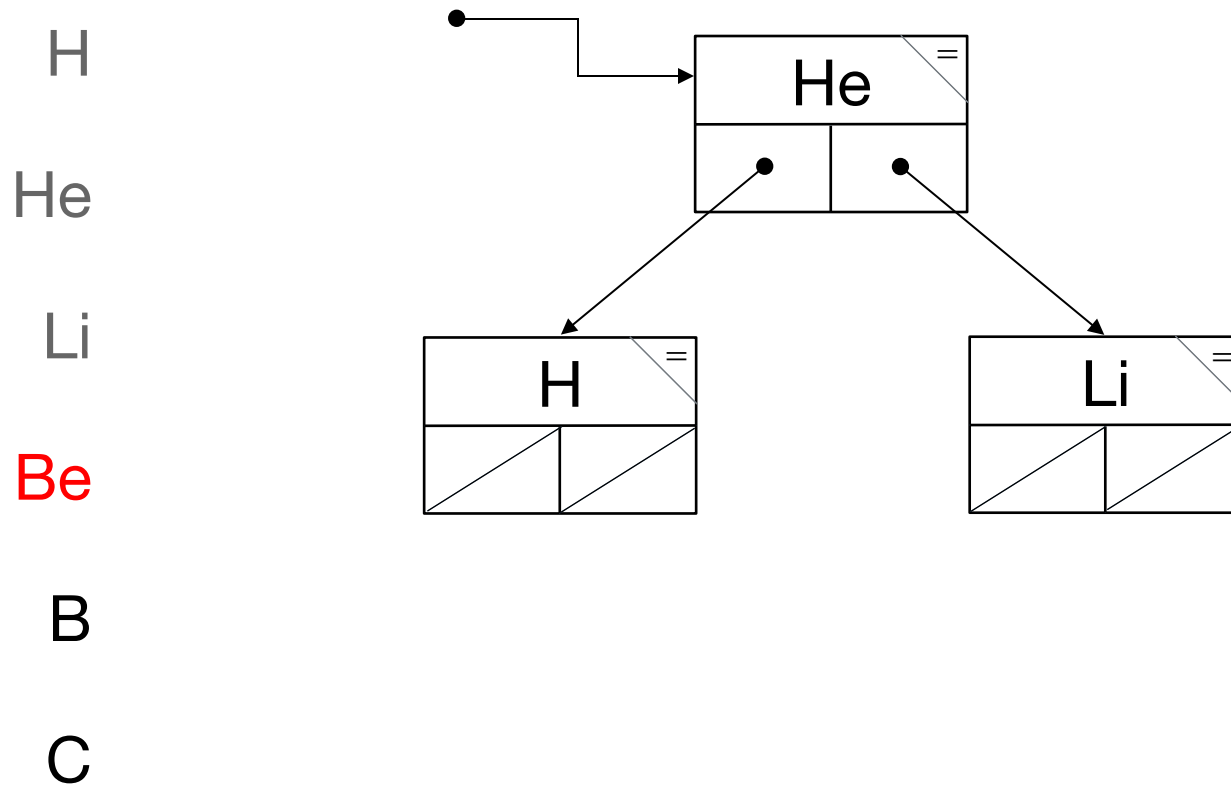


Illustrating AVL

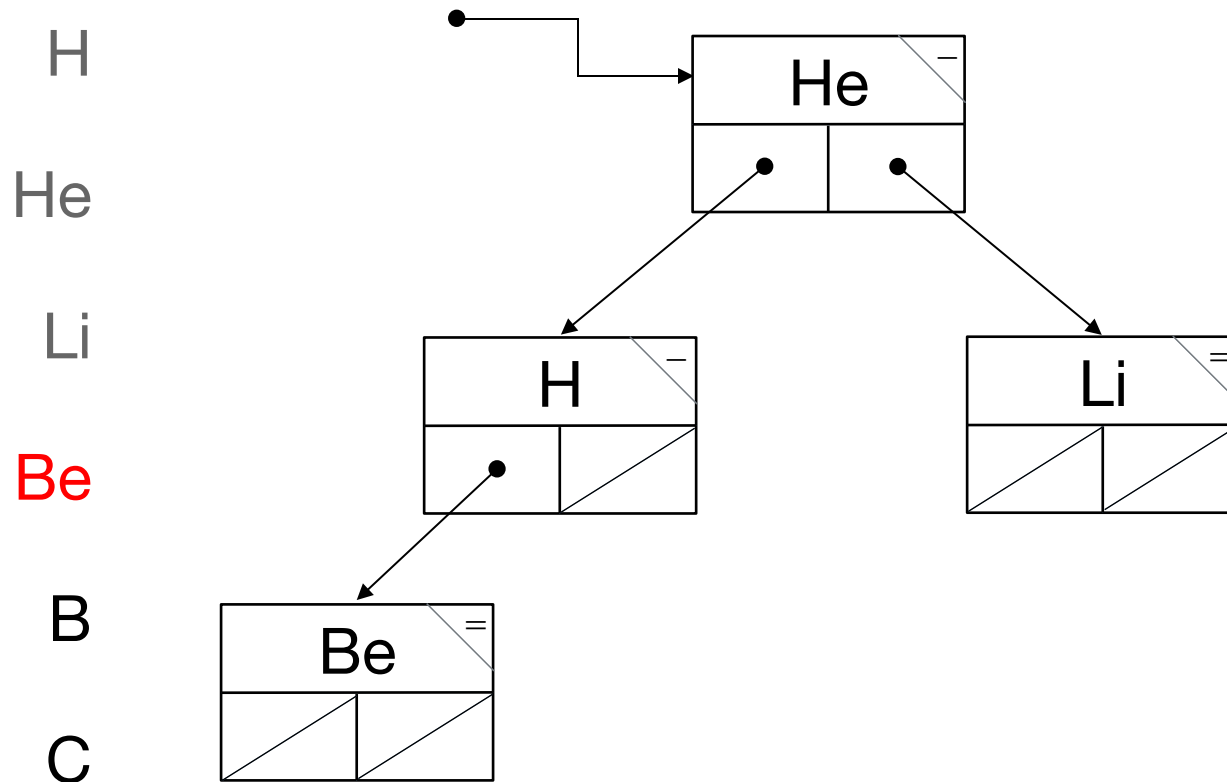
H
He
Li
Be
B
C



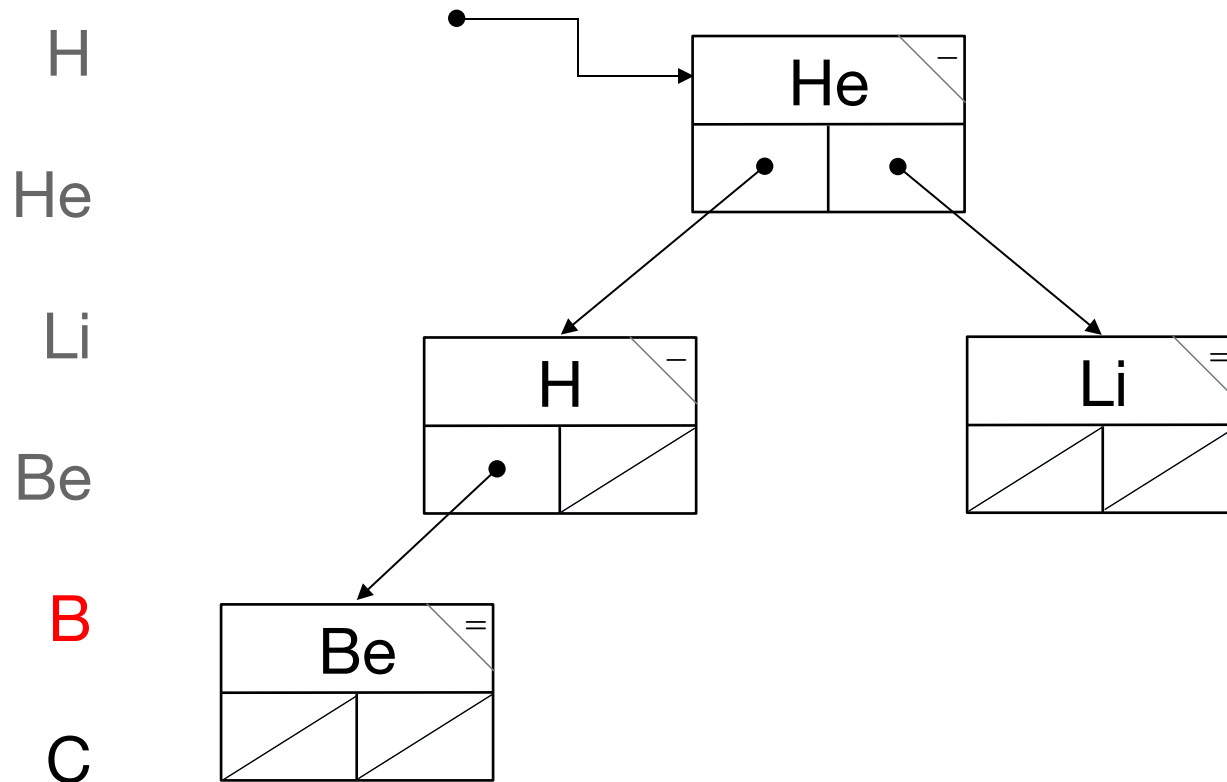
Illustrating AVL



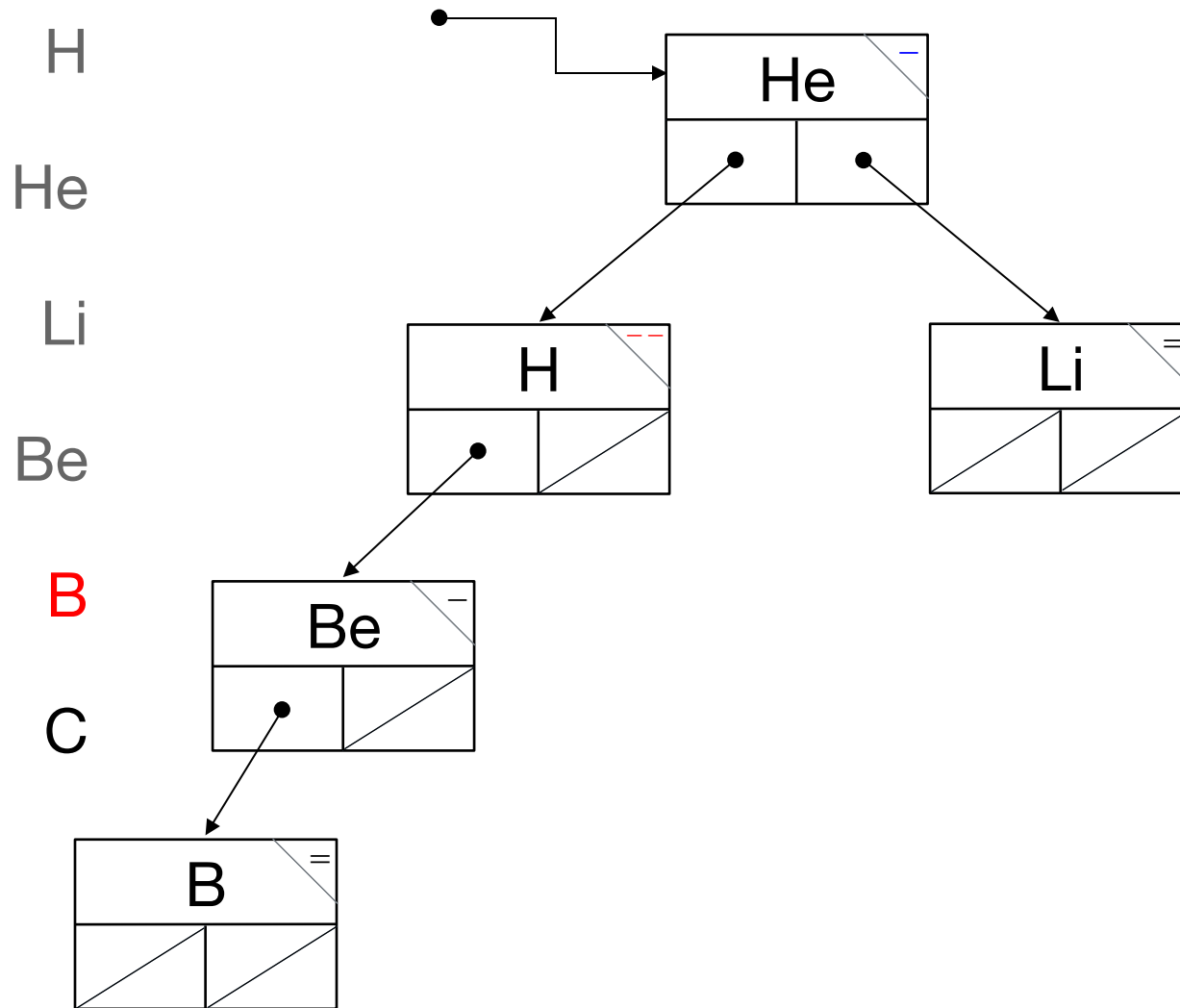
Illustrating AVL



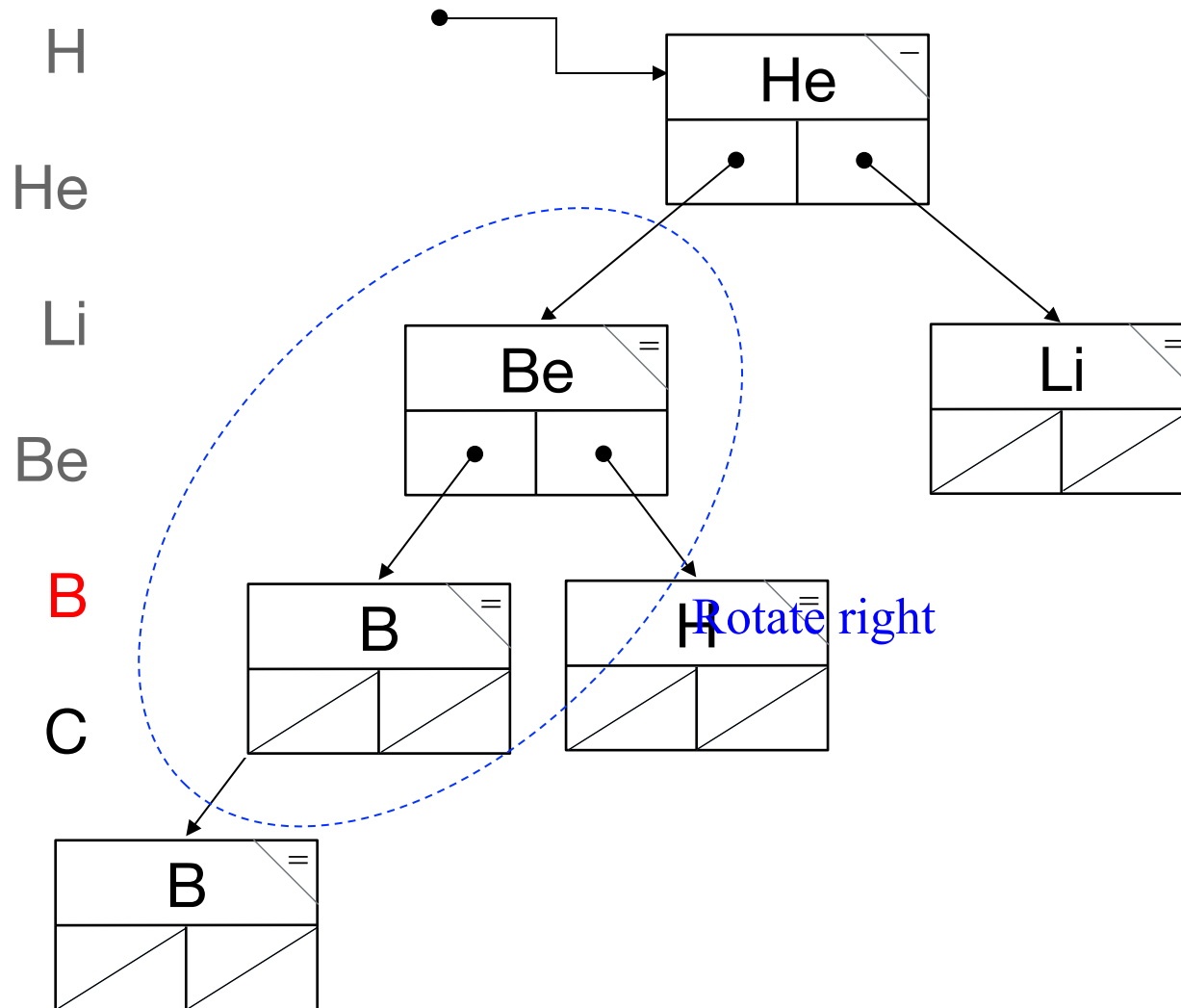
Illustrating AVL



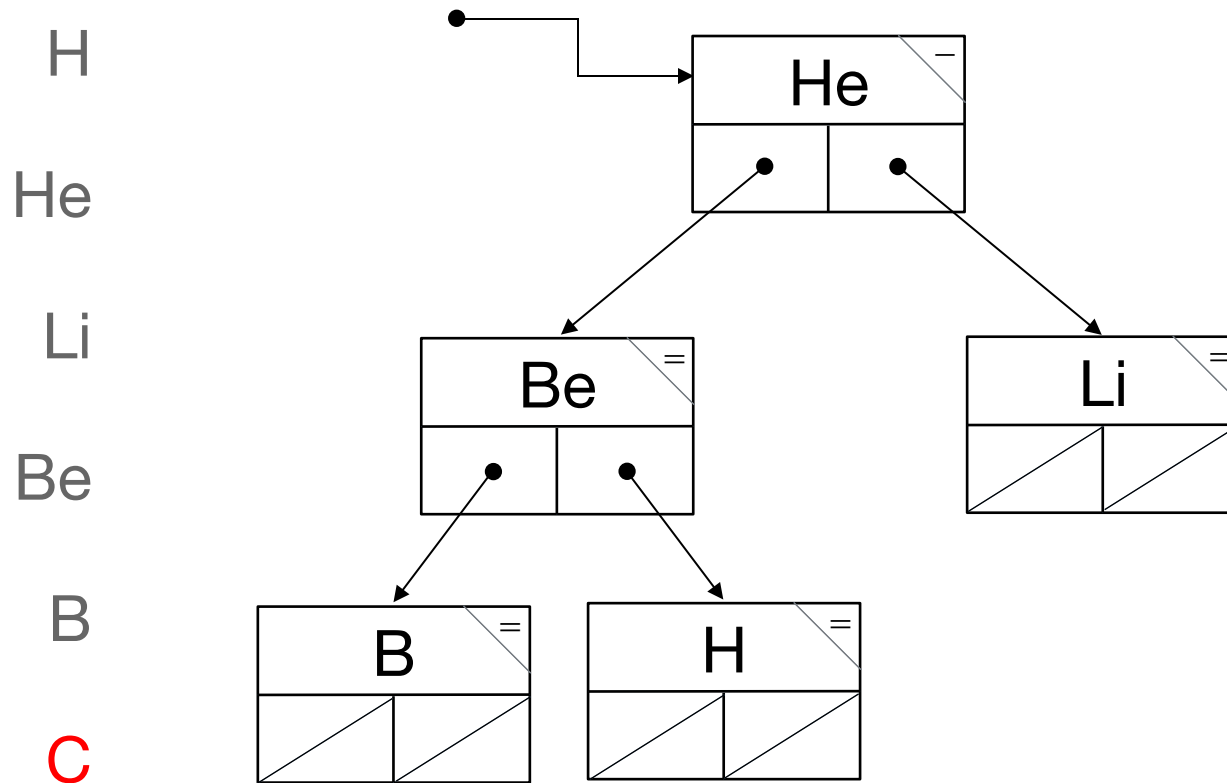
Illustrating AVL



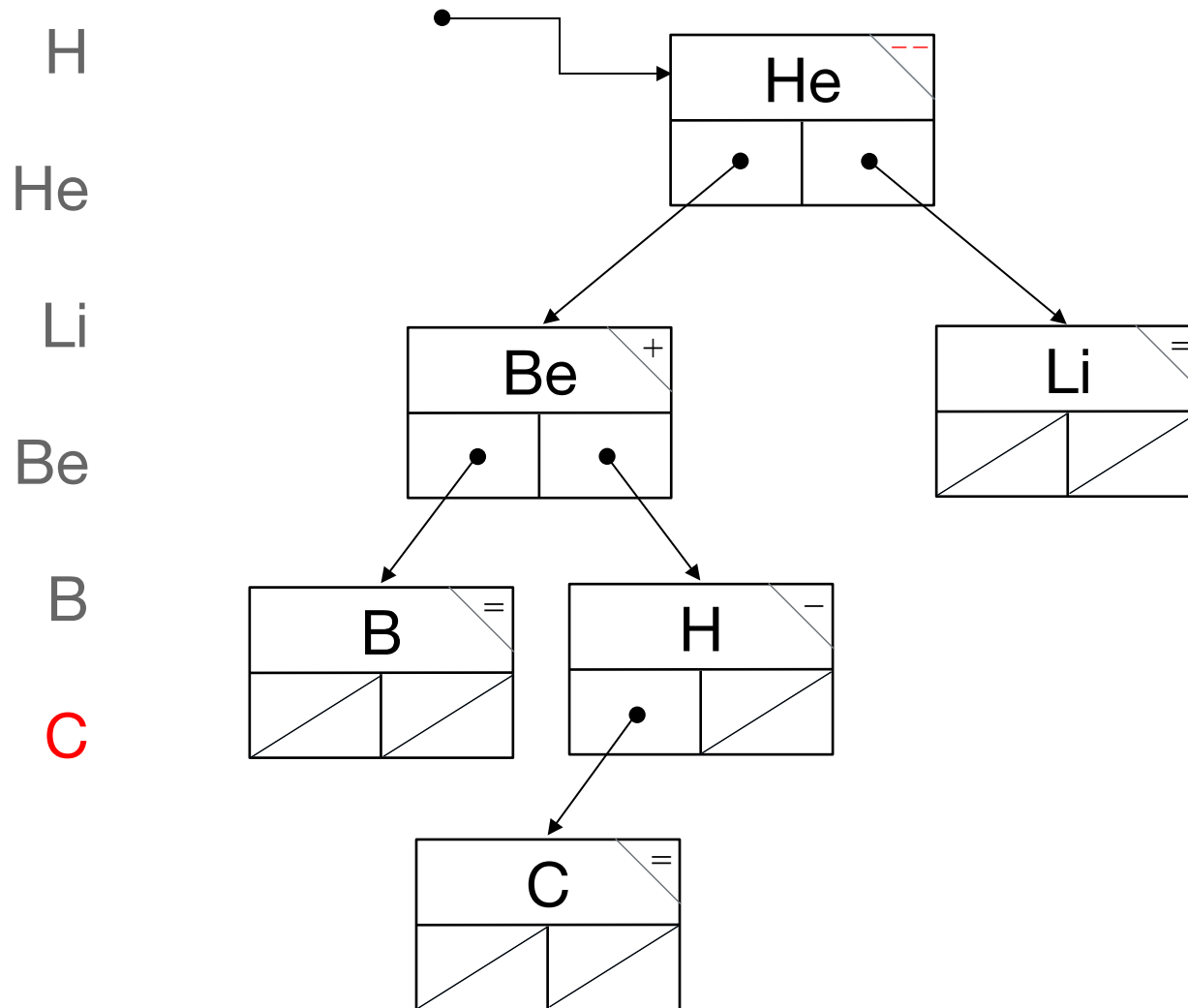
Illustrating AVL



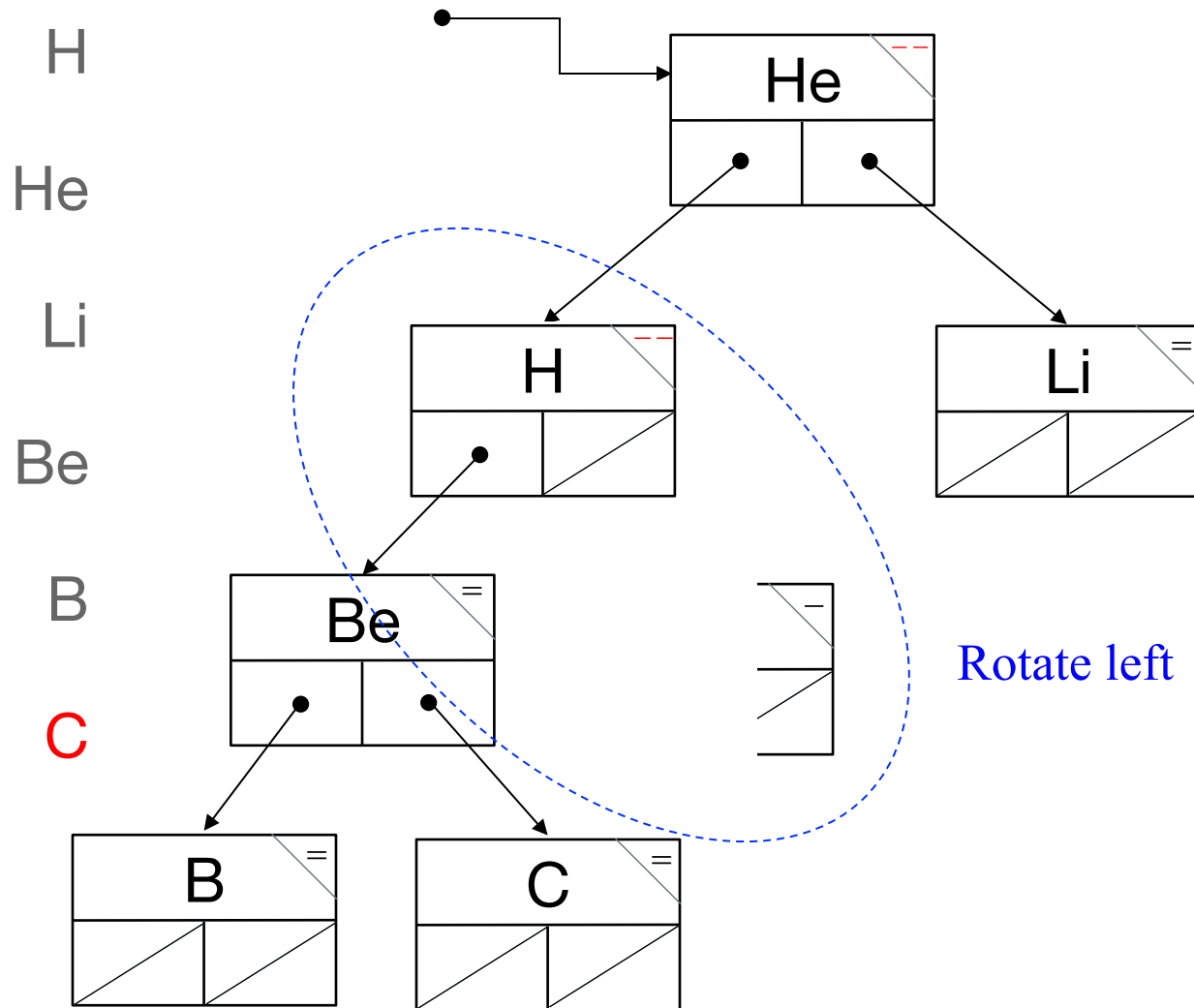
Illustrating AVL



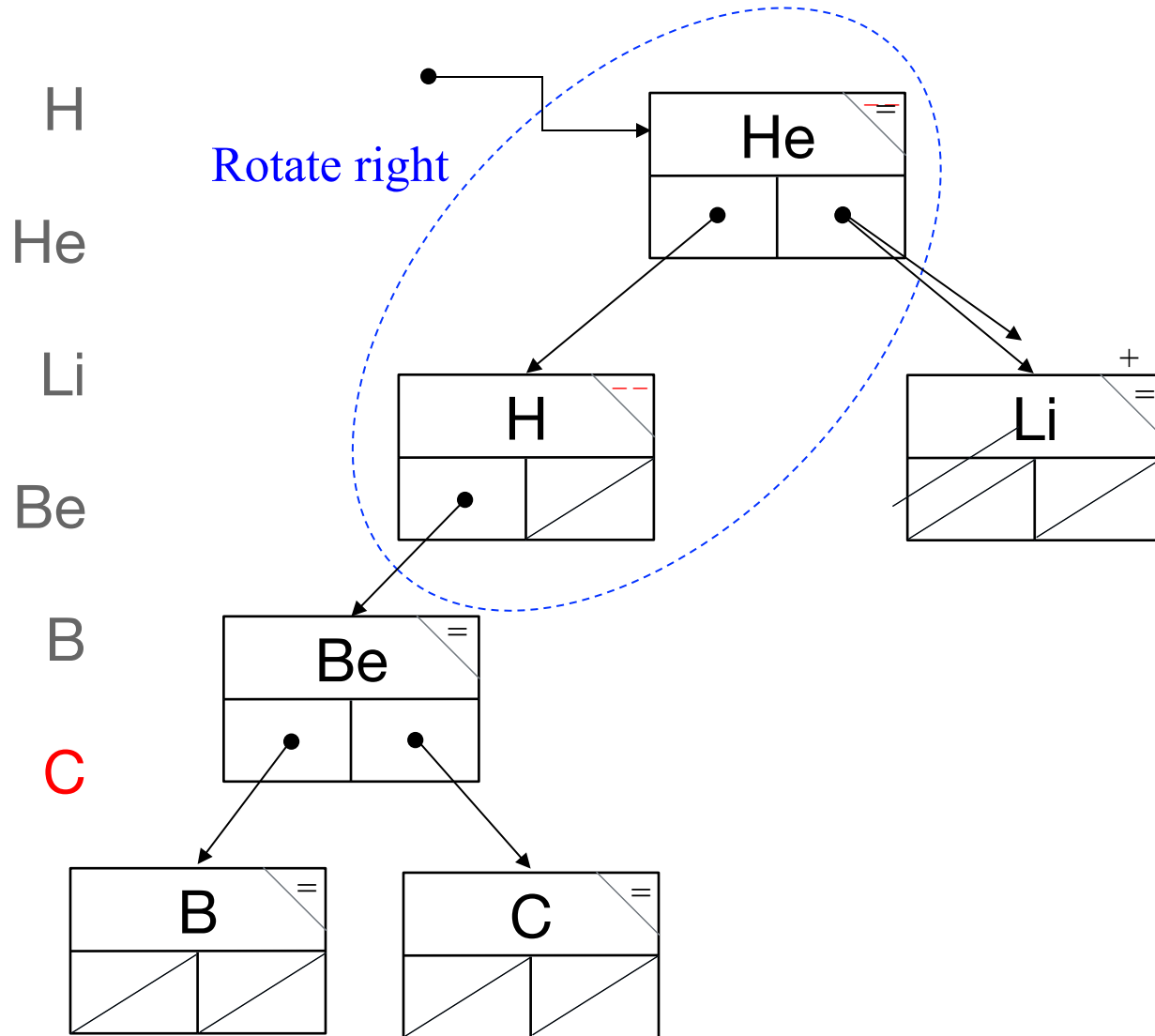
Illustrating AVL



Illustrating AVL

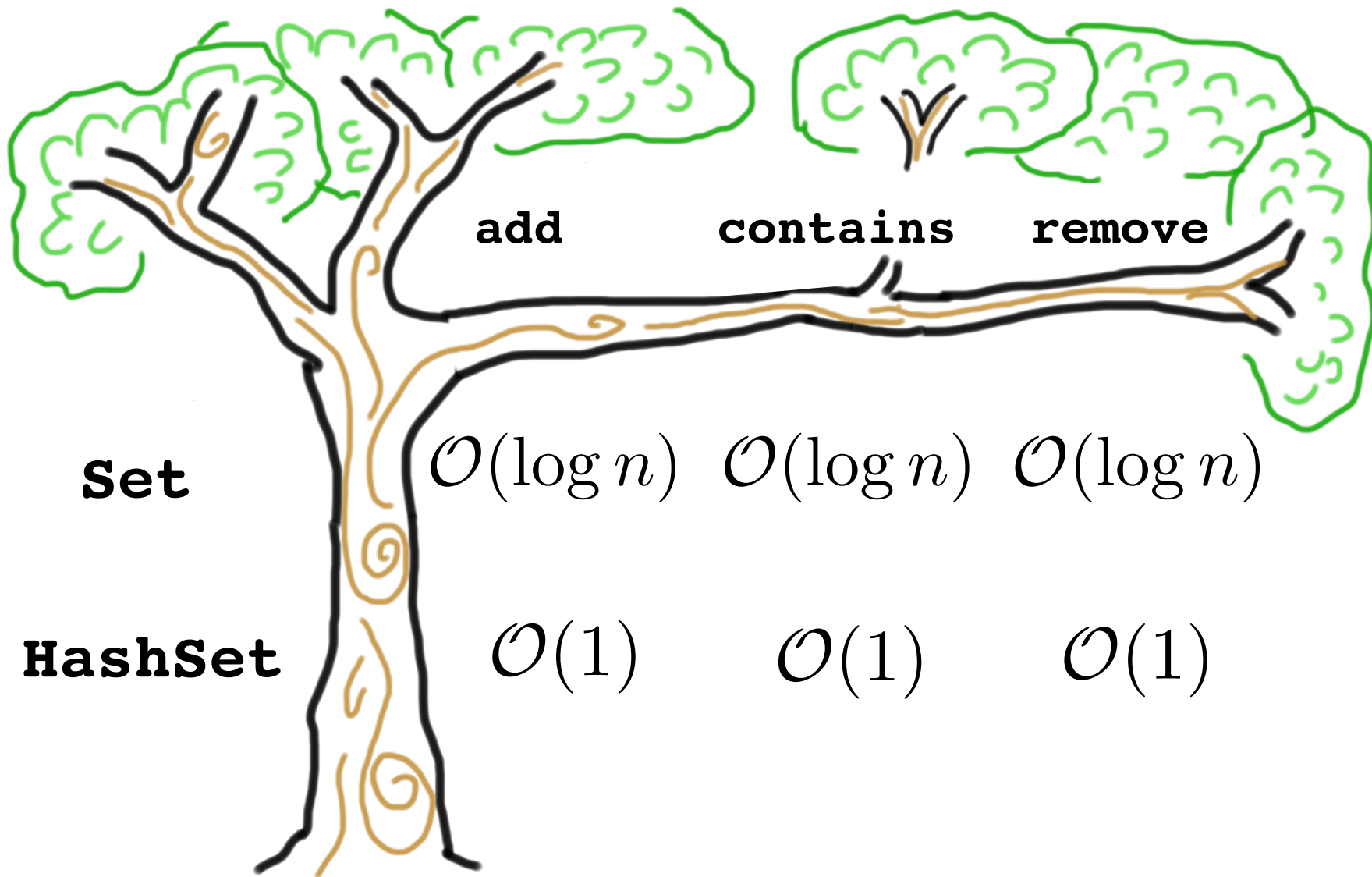


Illustrating AVL



Back to Scope

Binary Search Tree Big O



Hash Map is faster...

Log n

Lets say n is 1 **billion**

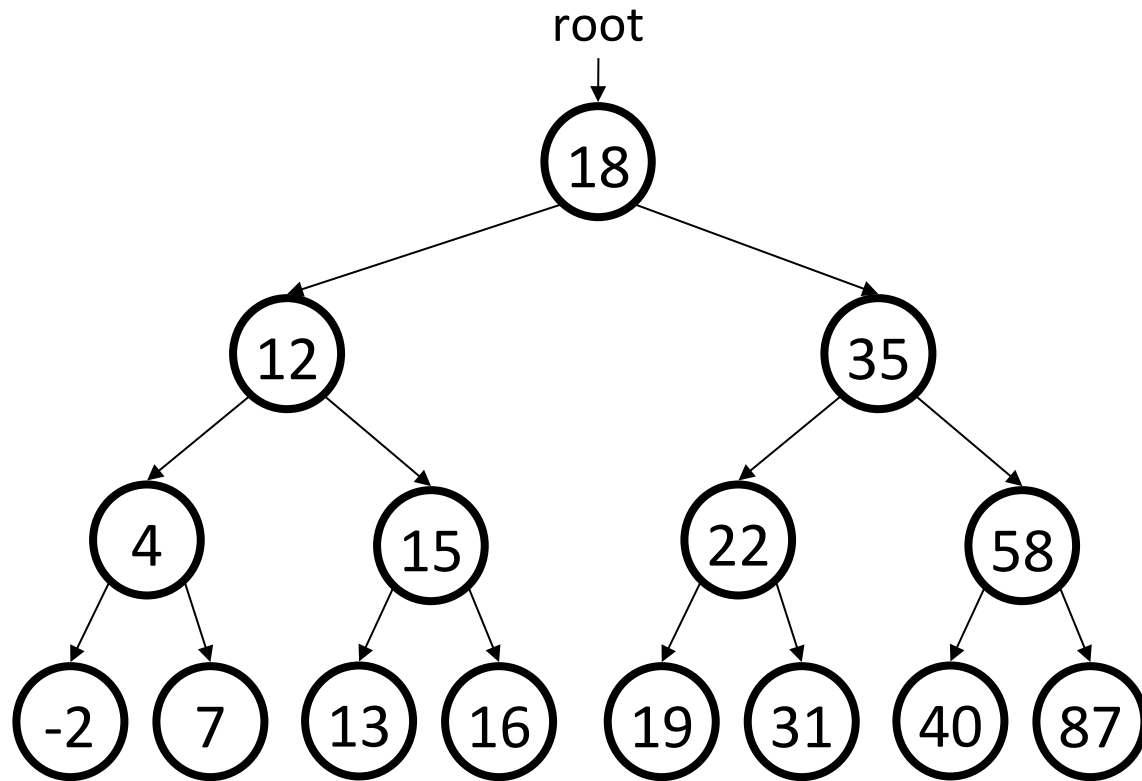
$$\log_2(\textit{billion}) = 30$$

..But not by much

How does the Map/Set work?

Maps and Sets Print in Order

Iteration?

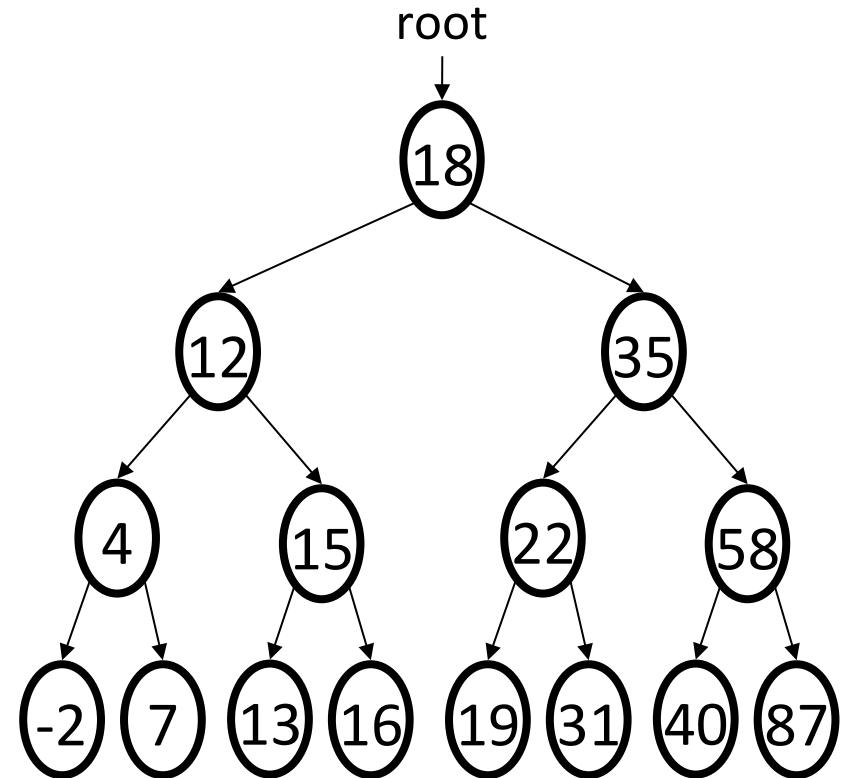


Tree Traversal

```
void preOrder(Tree * tree) {  
    if(tree == NULL) return;  
    cout<<tree->value<<" ";  
    preOrder(tree->left);  
    preOrder(tree->right);  
}
```

```
void inOrder(Tree * tree) {  
    if(tree == NULL) return;  
    inOrder(tree->left);  
    cout<<tree->value<<" ";  
    inOrder(tree->right);  
}
```

```
Void postOrder(Tree * tree) {  
    if(tree == NULL) return;  
    postOrder(tree->left);  
    postOrder(tree->right);  
    cout<<tree->value<<" ";  
}
```

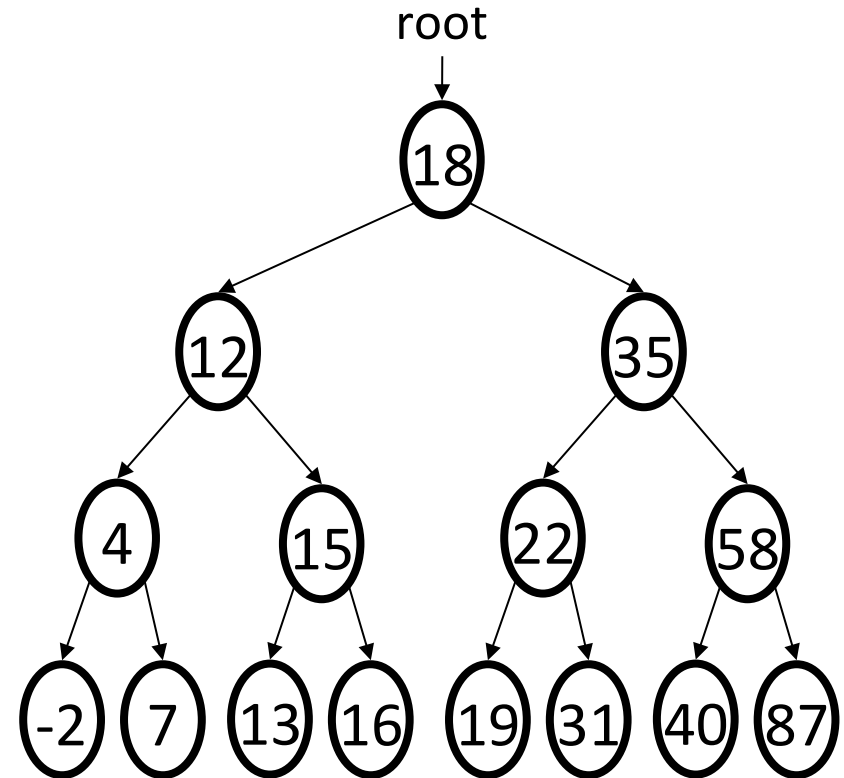


Tree Traversal

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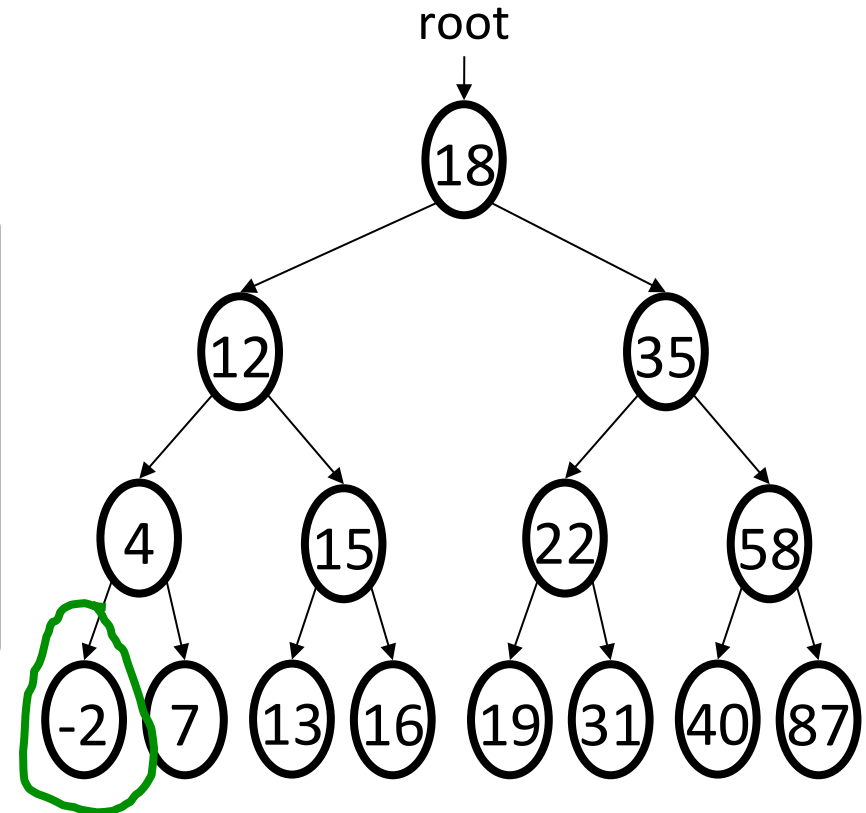


Tree Traversal

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```

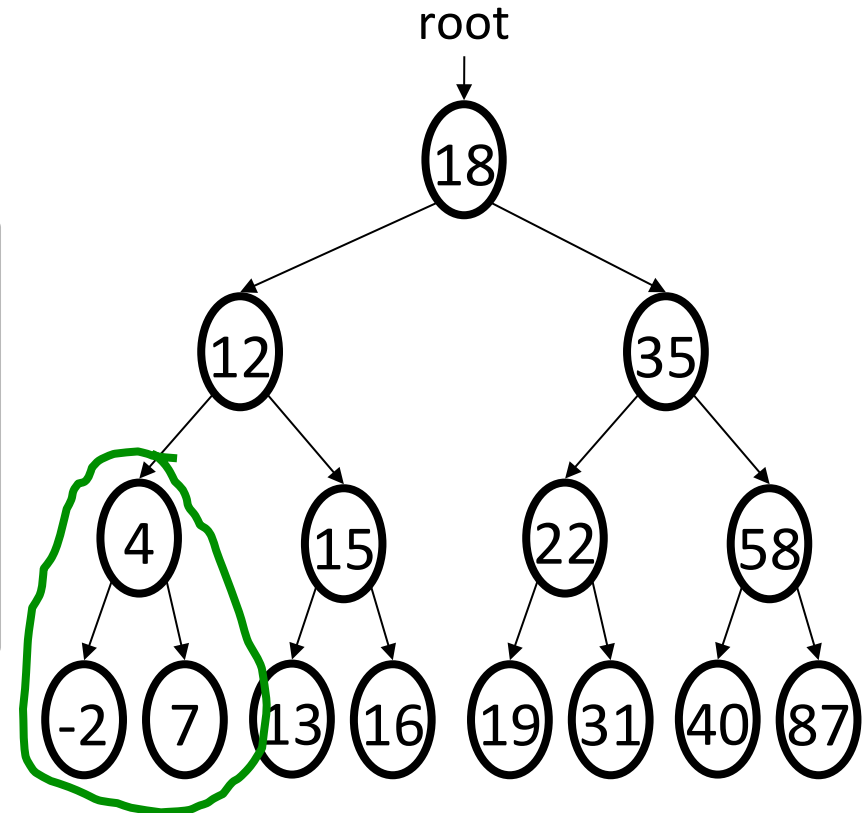


Tree Traversal

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    preOrder(tree->right);  
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```
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    inOrder(tree->left);  
    cout<<tree->value<<" ";  
    inOrder(tree->right);  
}
```

```
void postOrder(Tree * tree) {  
    if(tree == NULL) return;  
    postOrder(tree->left);  
    postOrder(tree->right);  
    cout<<tree->value<<" ";  
}
```

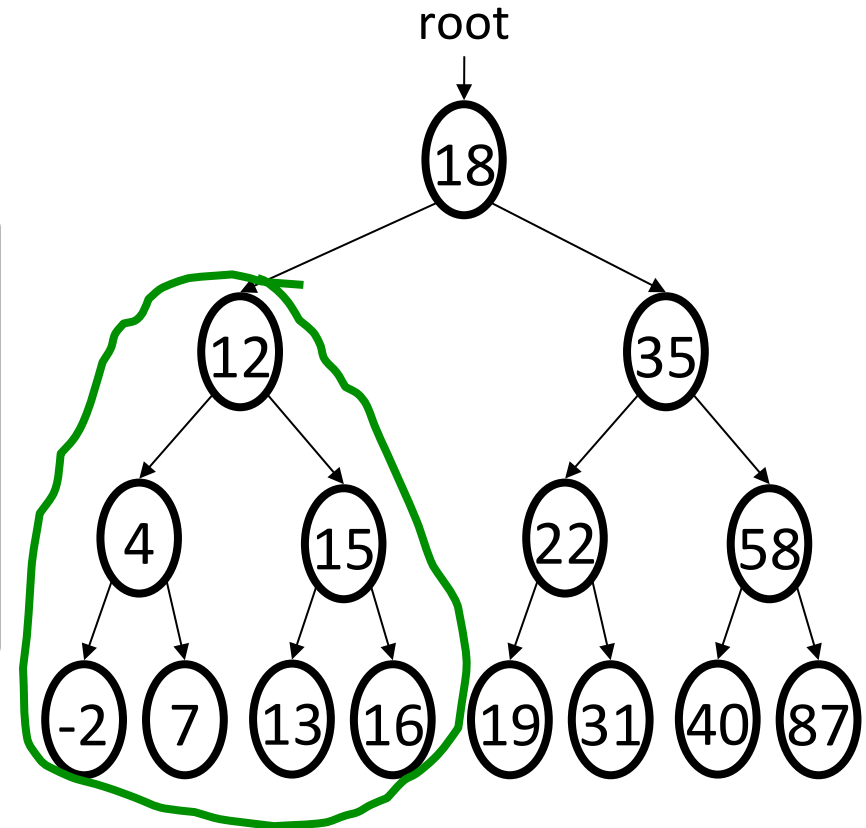


Tree Traversal

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}
```

```
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    postOrder(tree->left);  
    postOrder(tree->right);  
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}
```

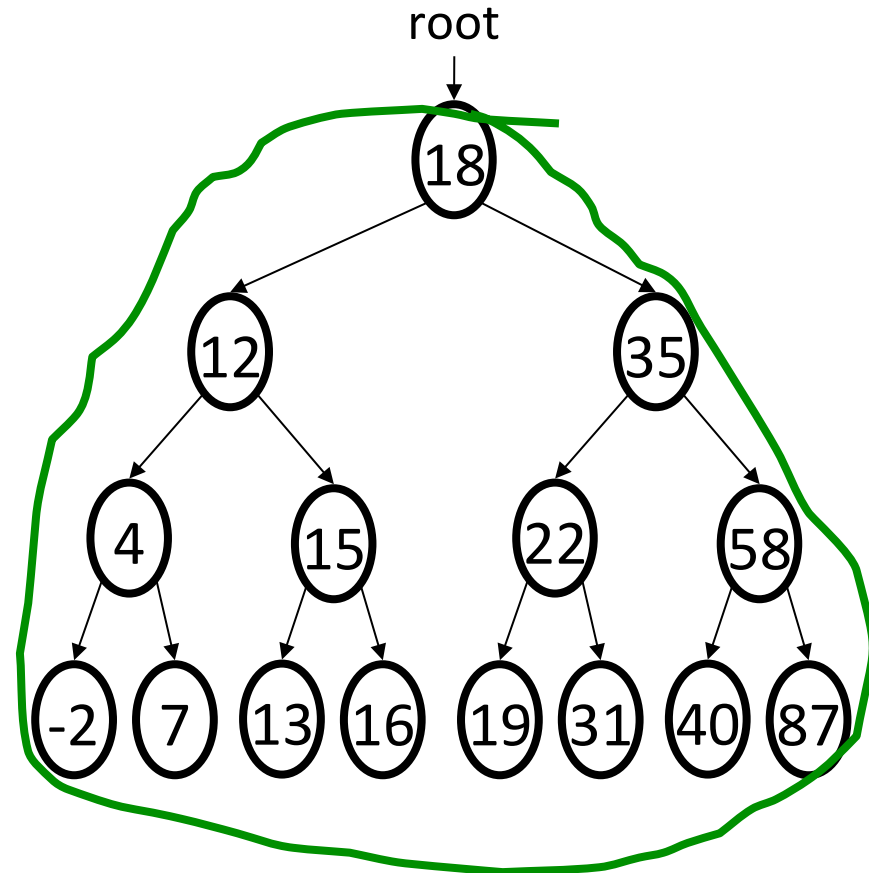


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```

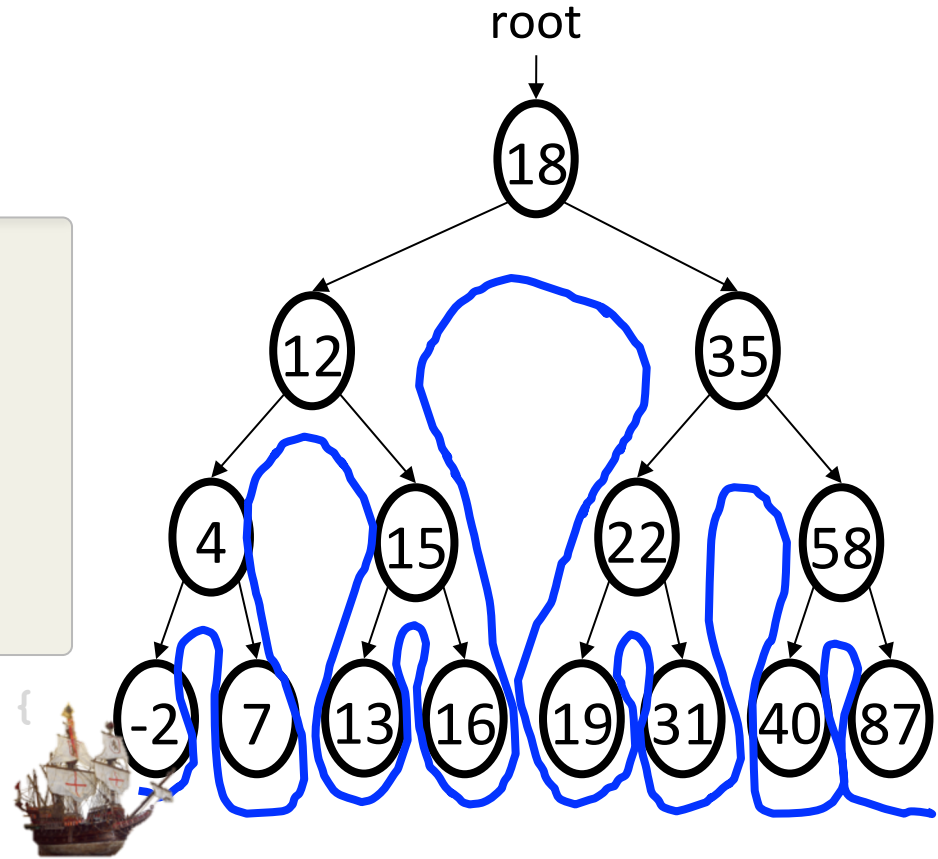


Tree Traversal

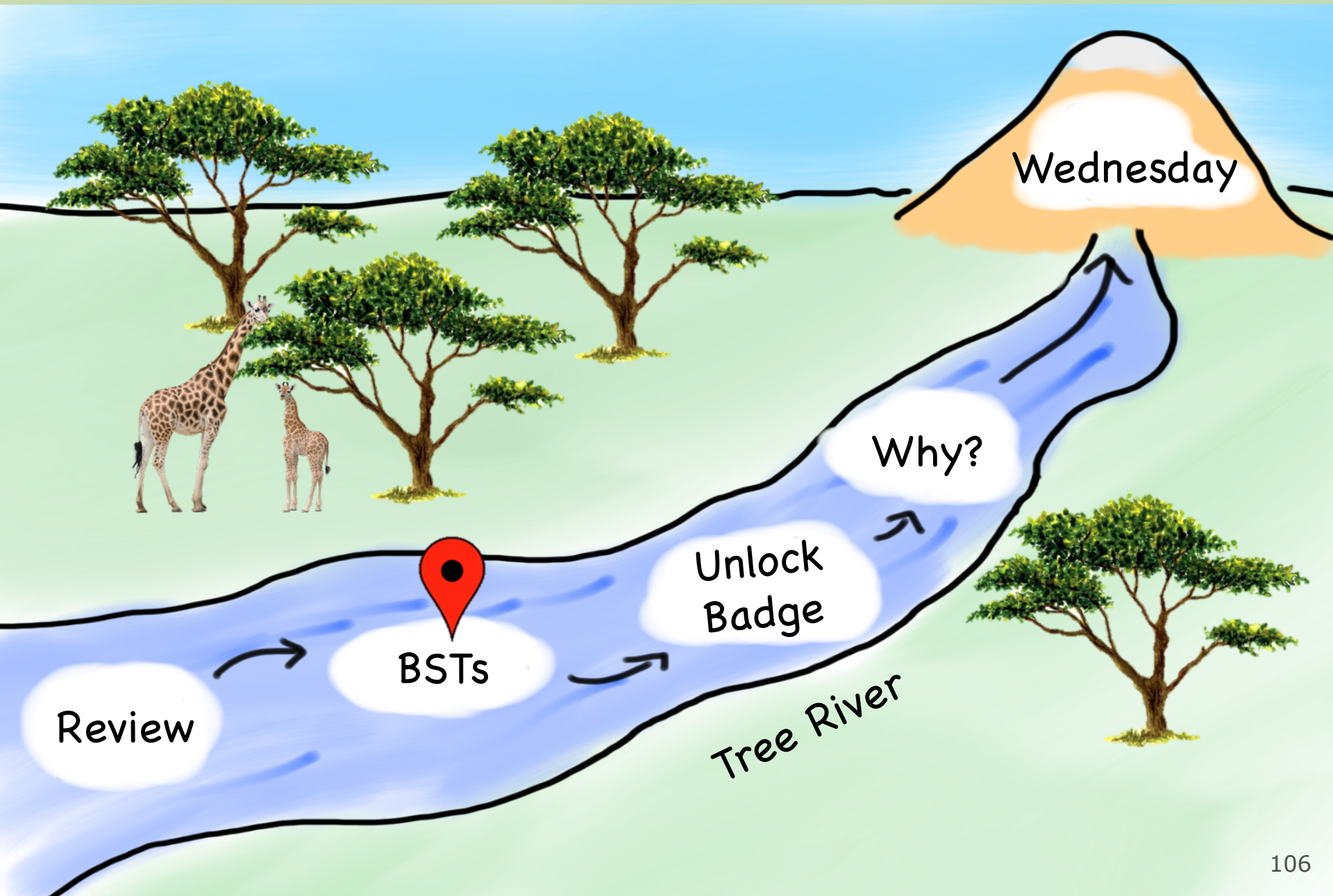
```
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}
```

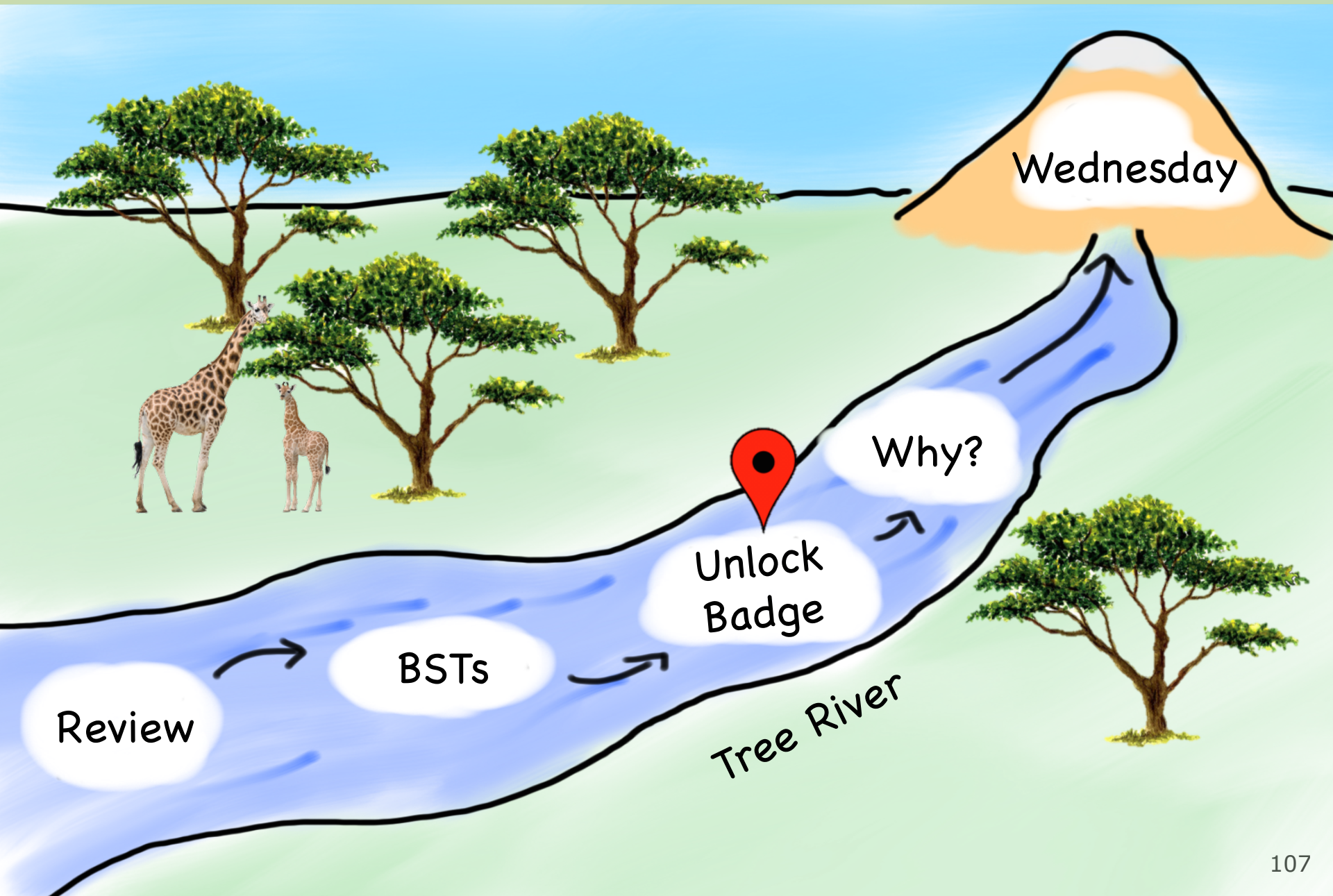
```
void postOrder(Tree * tree) {  
    if(tree == NULL) return;  
    postOrder(tree->left);  
    postOrder(tree->right);  
    cout<<tree->value<<" ";  
}
```



Today's Route



Today's Route




Where Am I?

Course Syllabus


Intro to Abstractions

ADTs



A stick figure stands next to a document with a checklist. A lightbulb is shown above the figure's head, indicating an idea or abstraction. A speech bubble next to the figure contains the text 'ADTs'.

Recursion




Three stick figures are shown holding hands in a line, representing a recursive sequence or a family tree.

Under the Hood

Vectors

Linked Lists


Hash Maps



Three circles are arranged horizontally, each containing one of the following terms: 'Vectors', 'Linked Lists', and 'Hash Maps'.

Graphs

Trees



A diagram showing a tree structure with nodes and arrows. A red location pin is placed over the word 'Trees' in a speech bubble, indicating the current position in the syllabus.

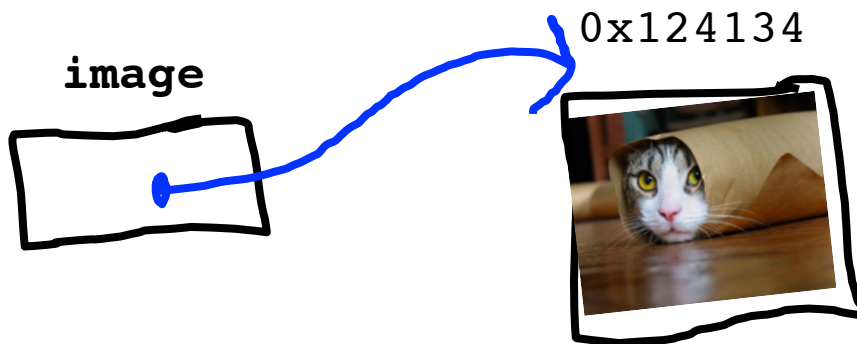


You are here

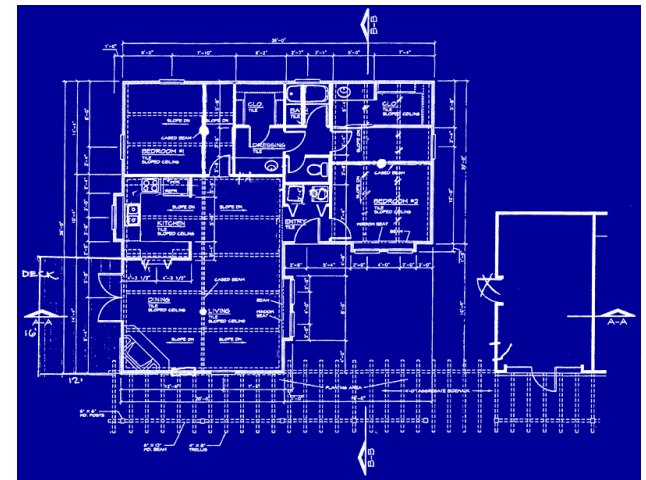
Building Blocks

Pointers

```
GImage * image =  
  new GImage("cat.png");
```



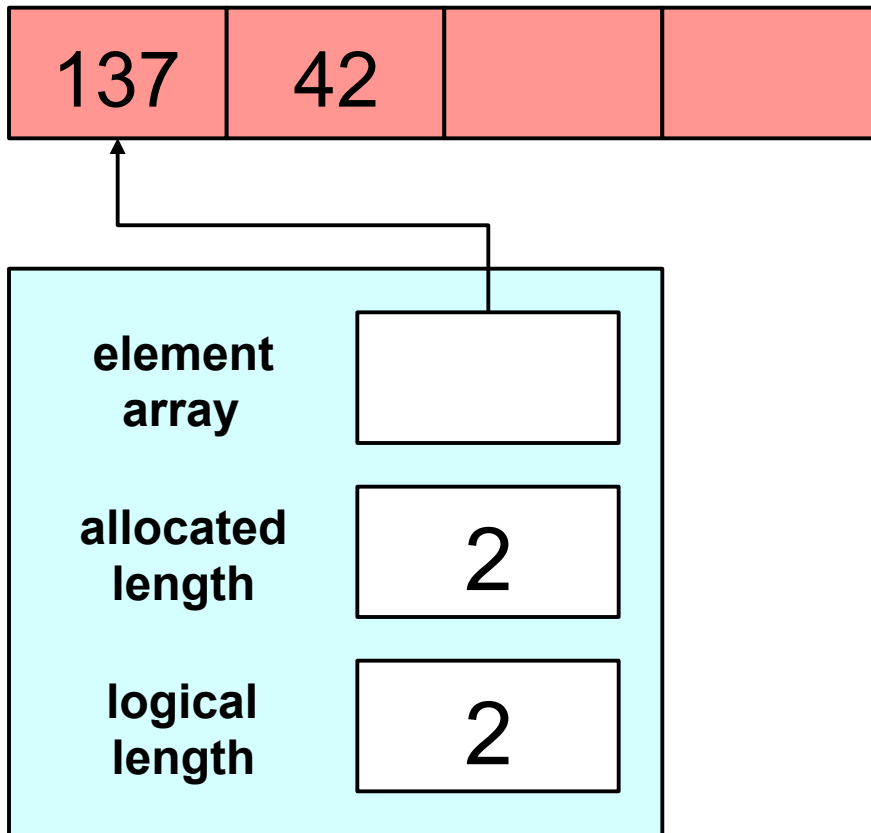
Classes / Structs



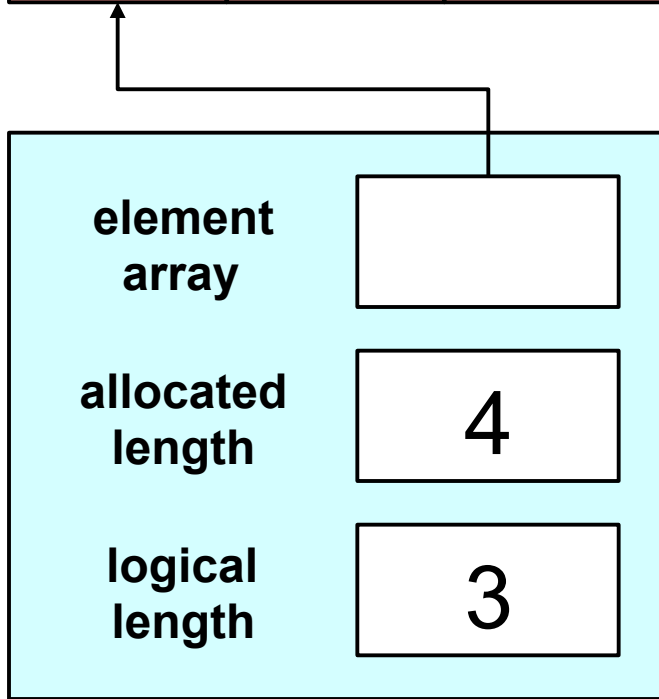
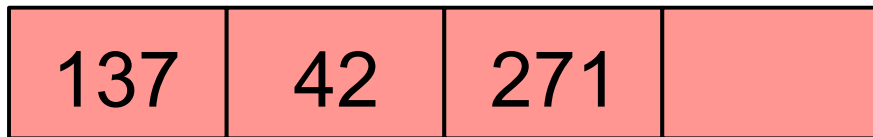
Blueprint for a new variable *type*

Vector

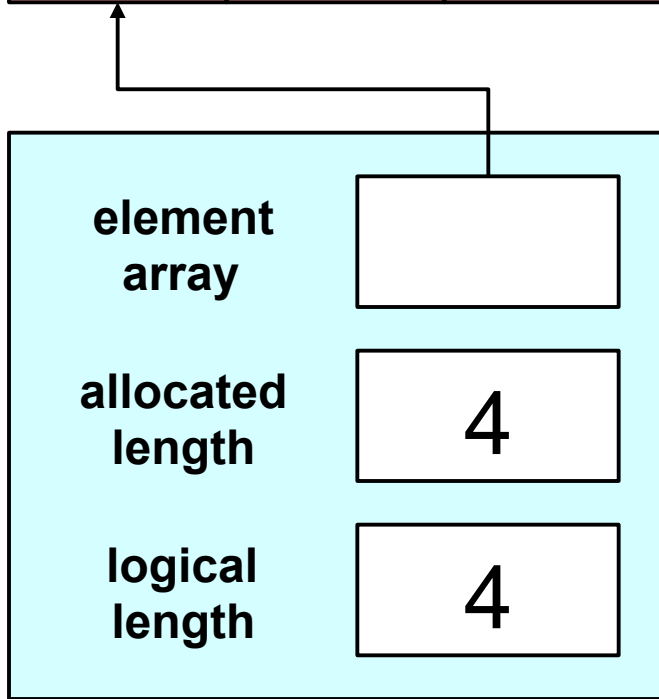
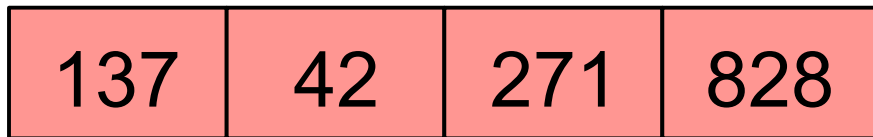
Vector



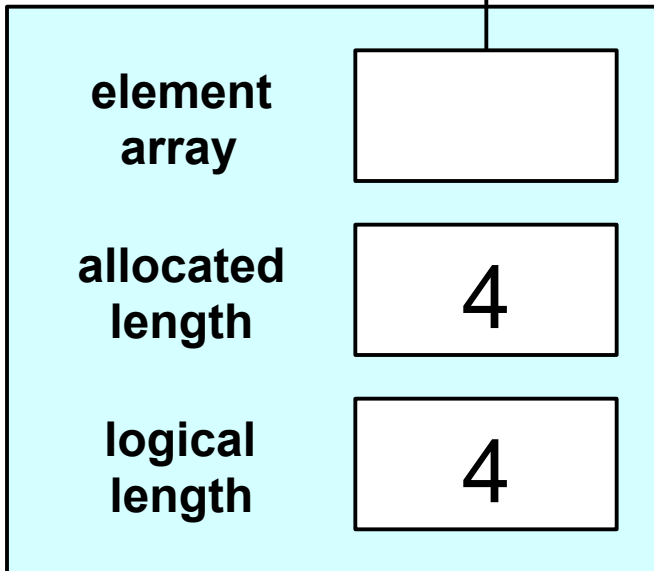
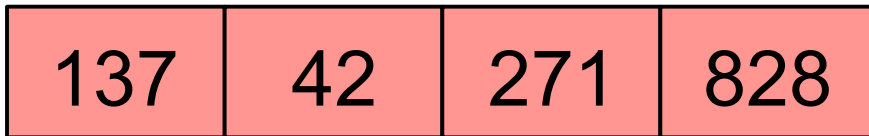
Actual Vector



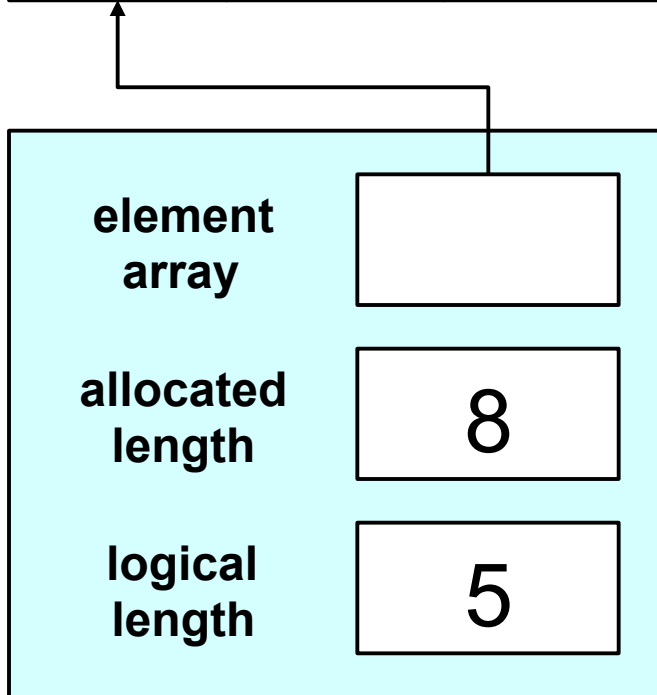
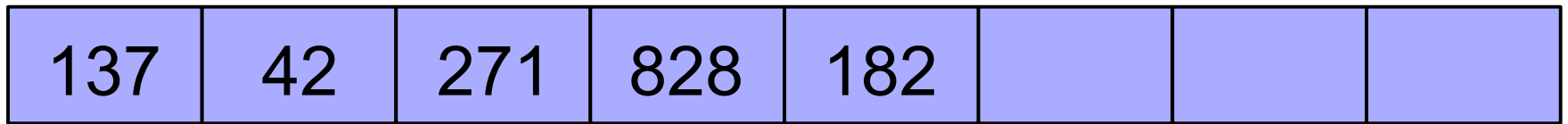
Actual Vector



Vector

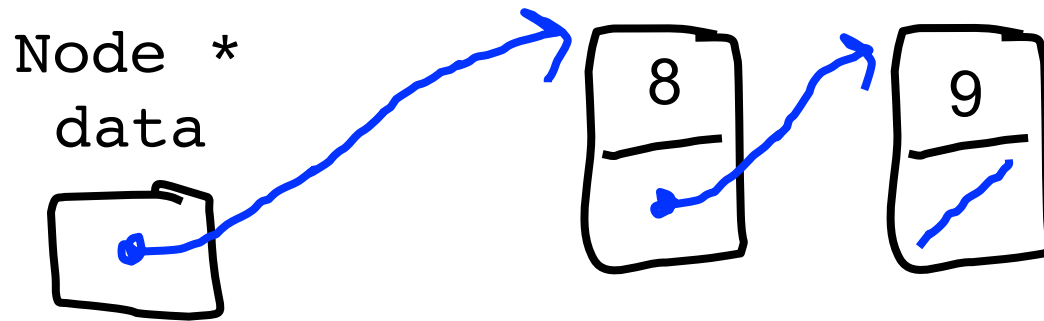


Vector



Stack

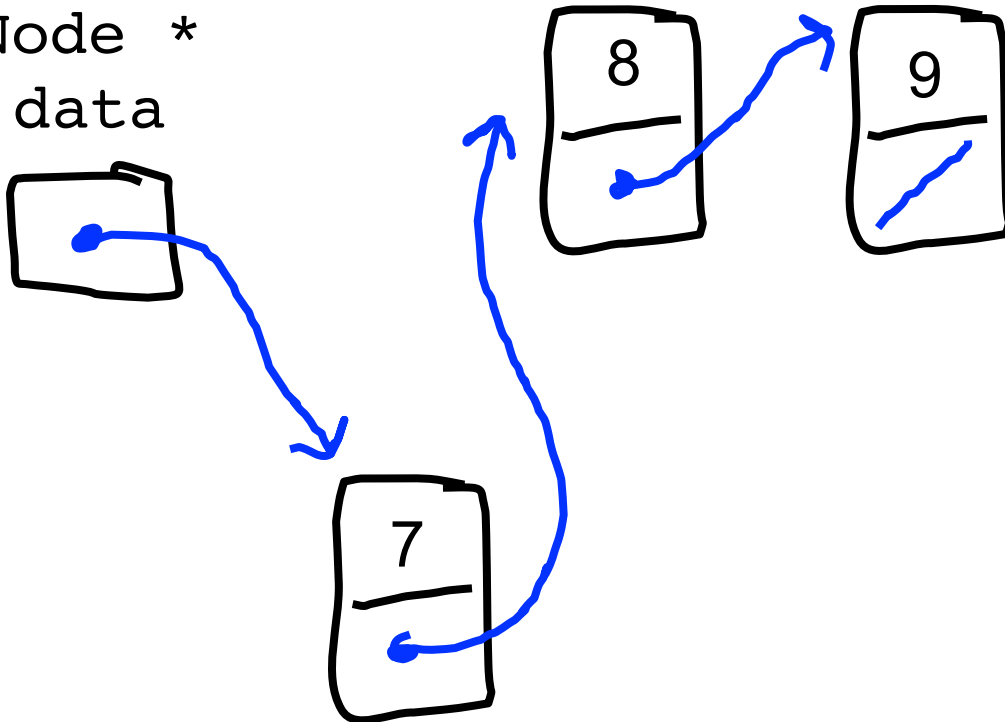
Stack



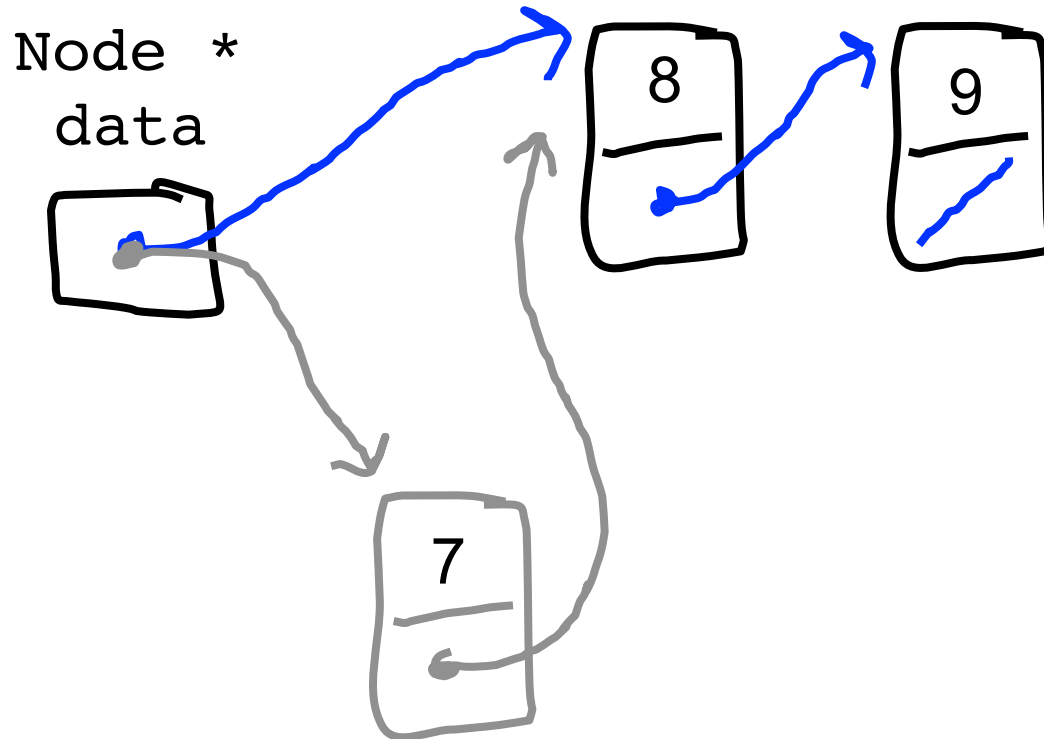
Stack Push

```
push(7);
```

Node *
data



Stack Pop



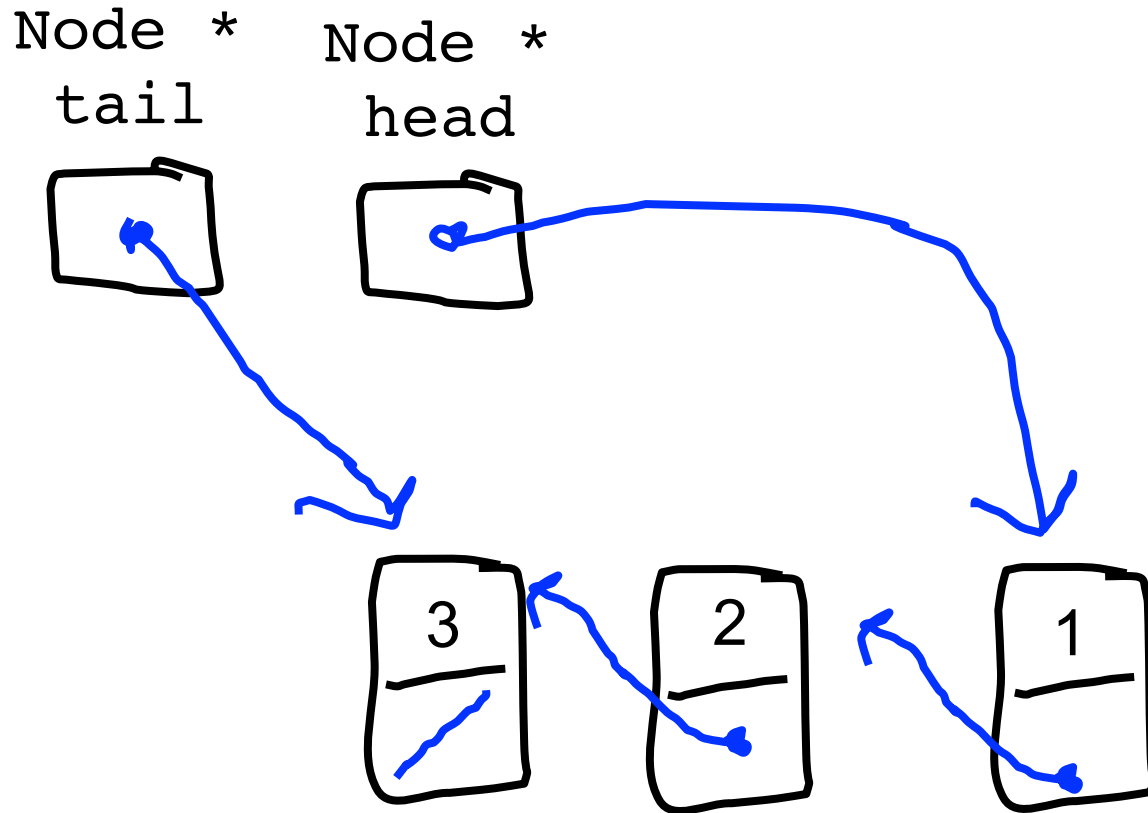
```
pop();
```

```
int return
```

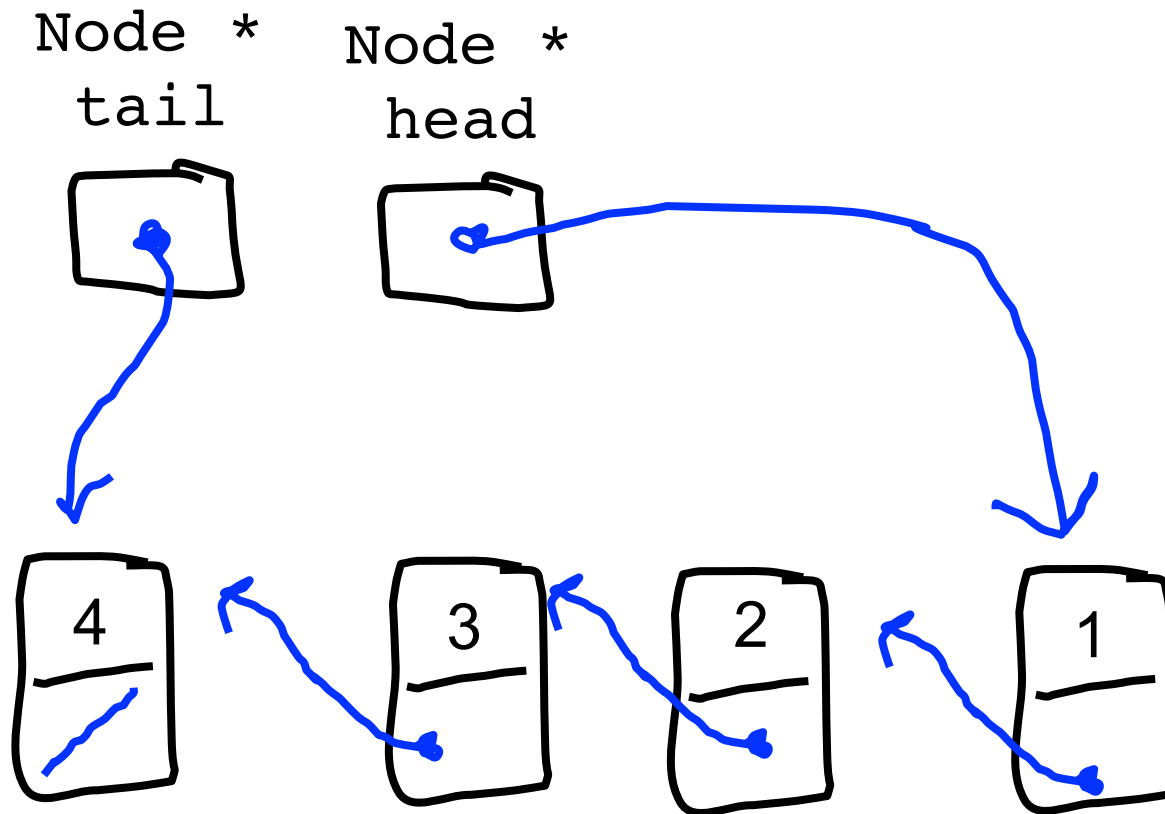
```
7
```


Queue

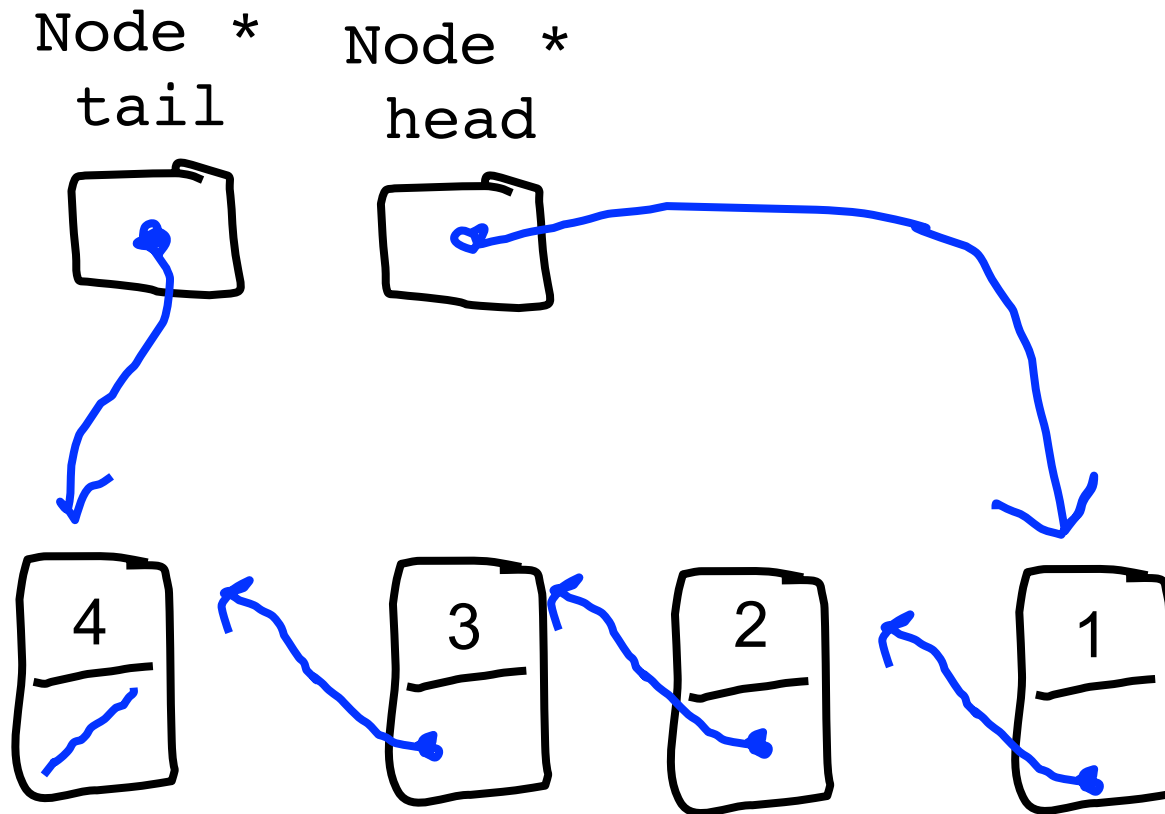
Queue



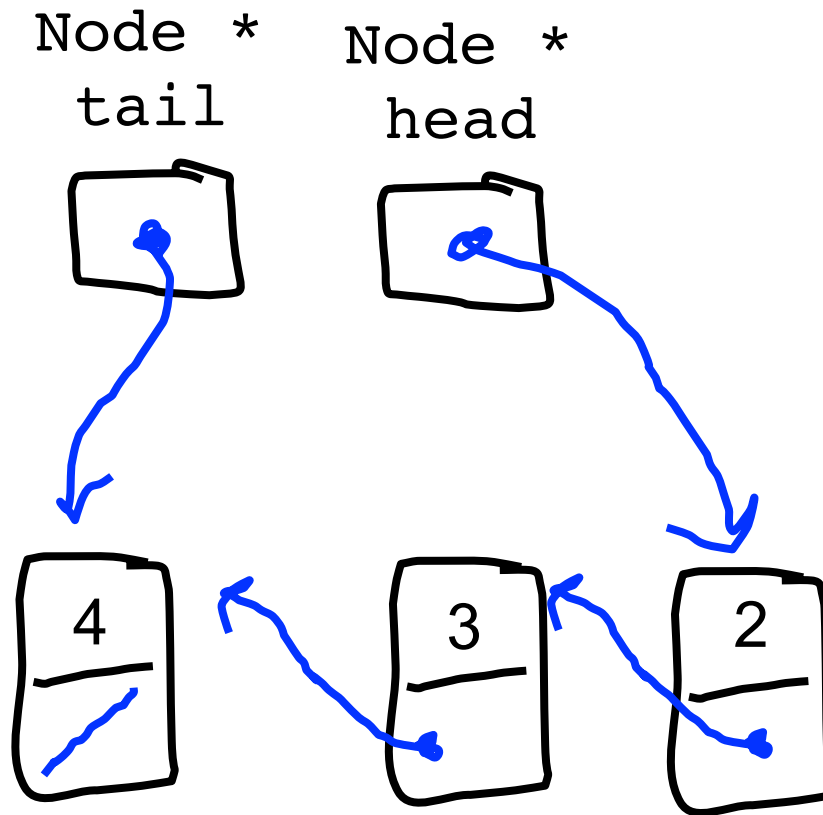
Queue Enqueue



Queue Dequeue



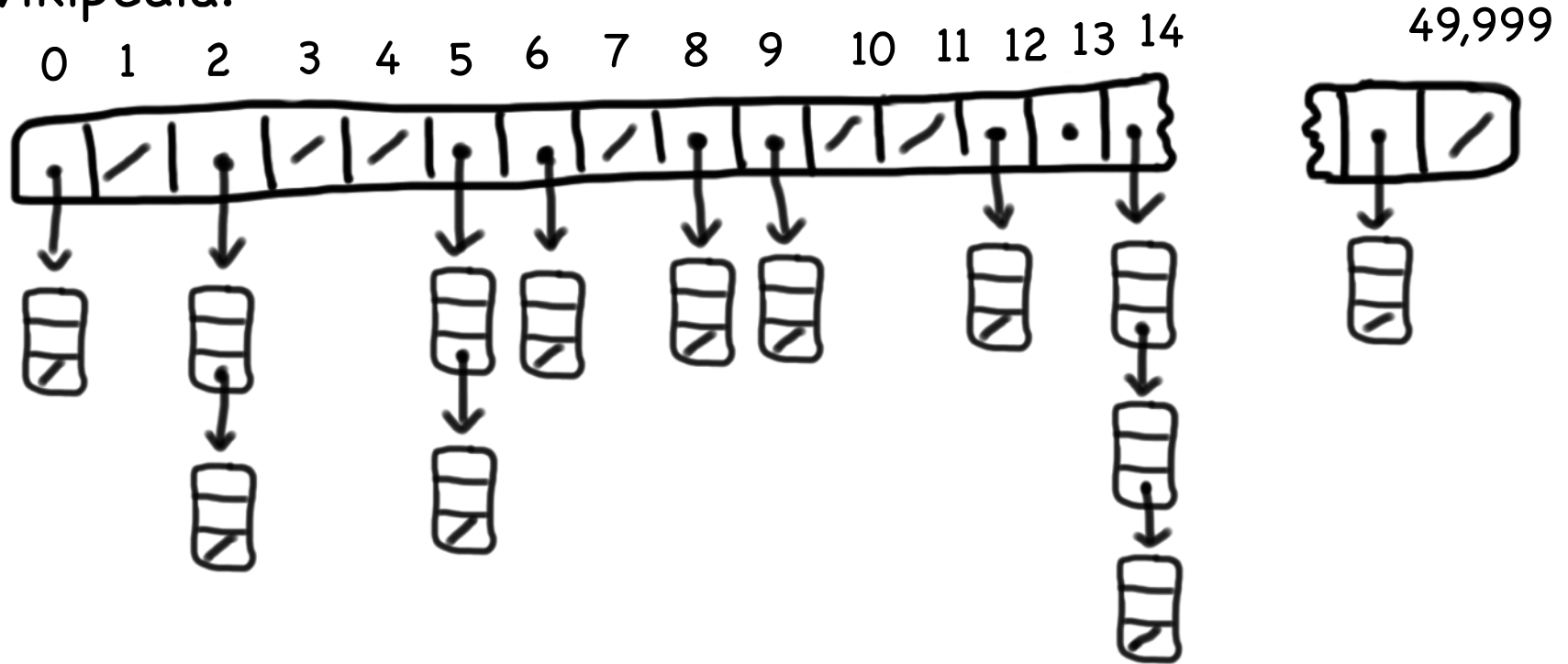
Queue Dequeue



HashMap / HashSet

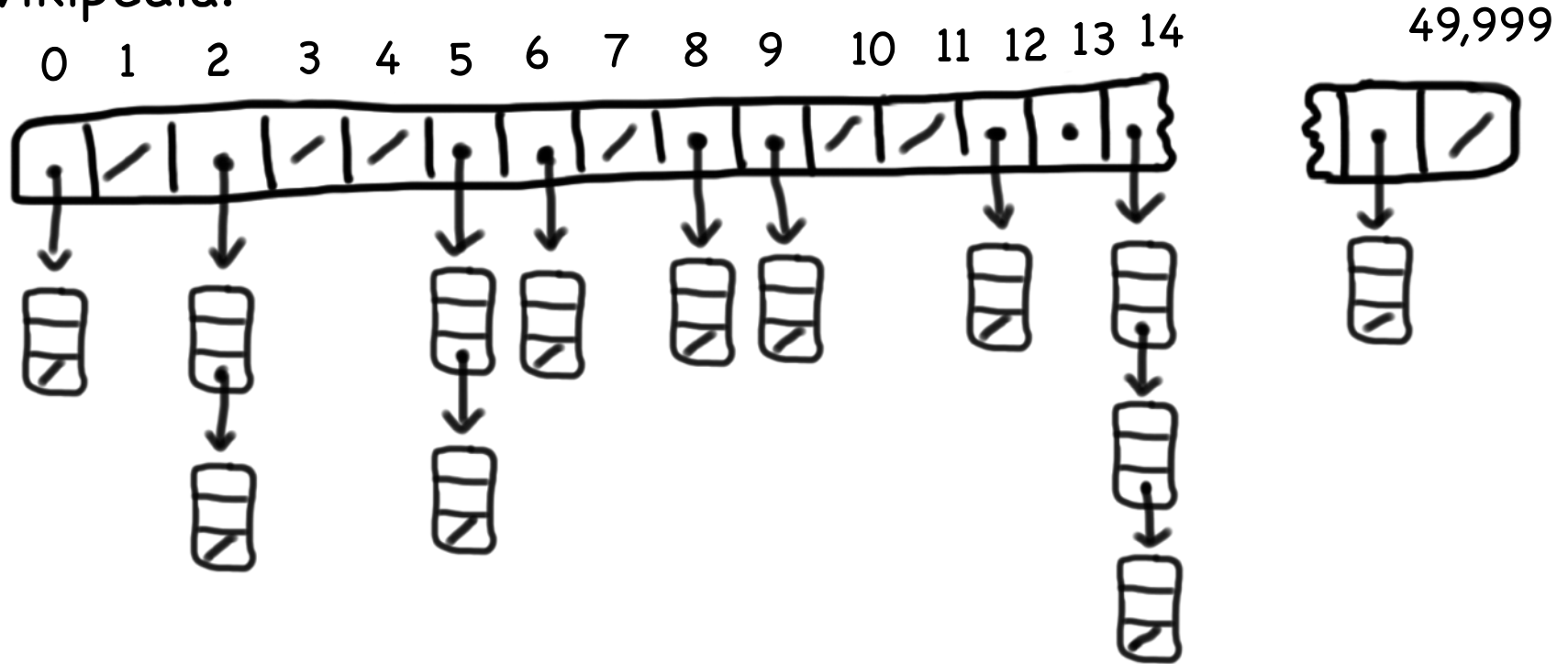
HashMap

Wikipedia:



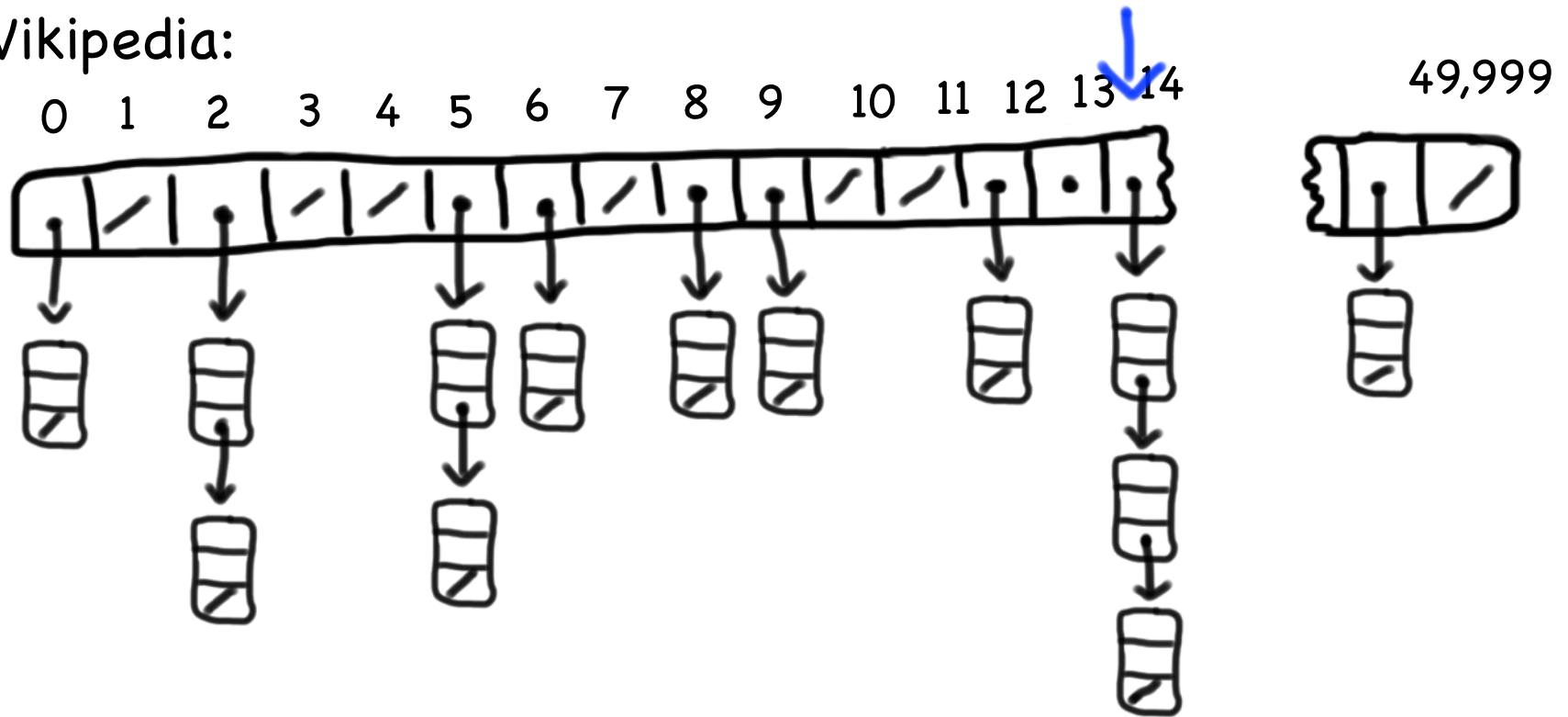
HashMap

Wikipedia:



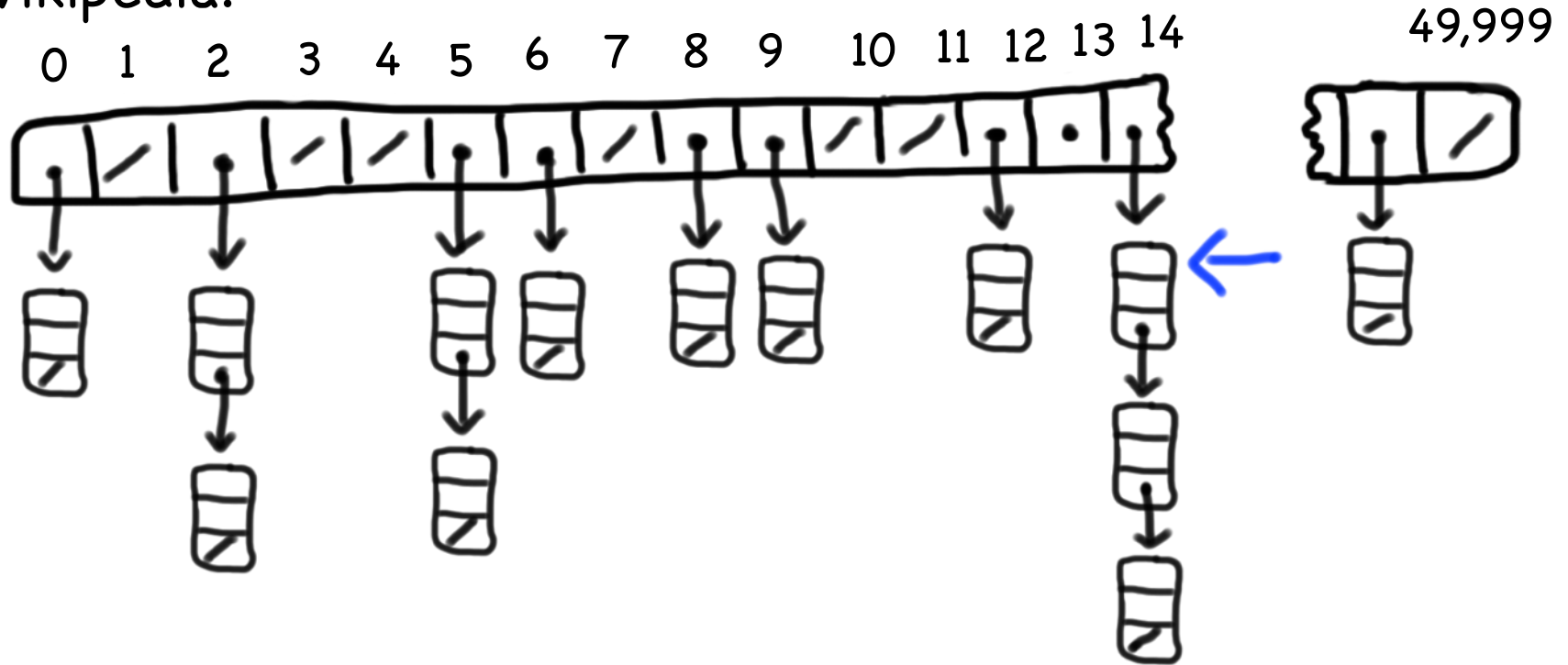
HashMap

Wikipedia:



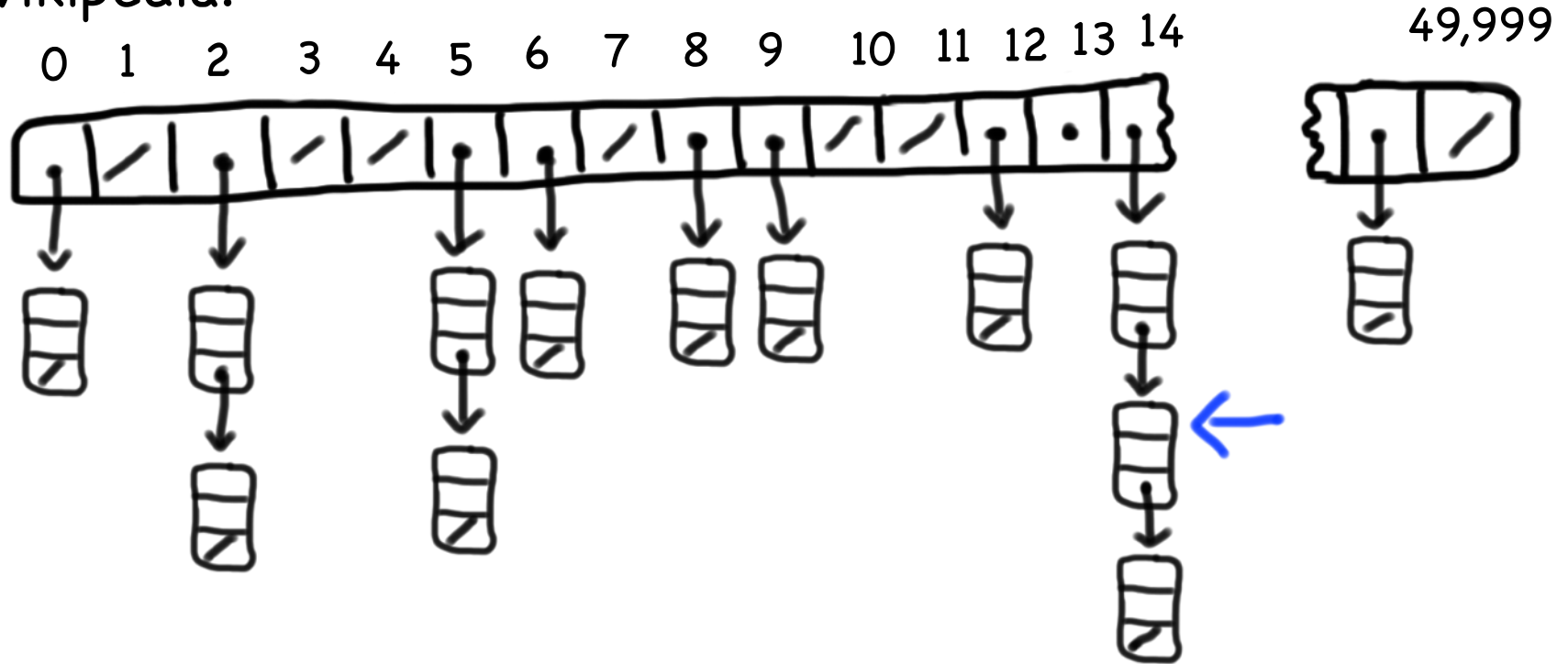
HashMap

Wikipedia:

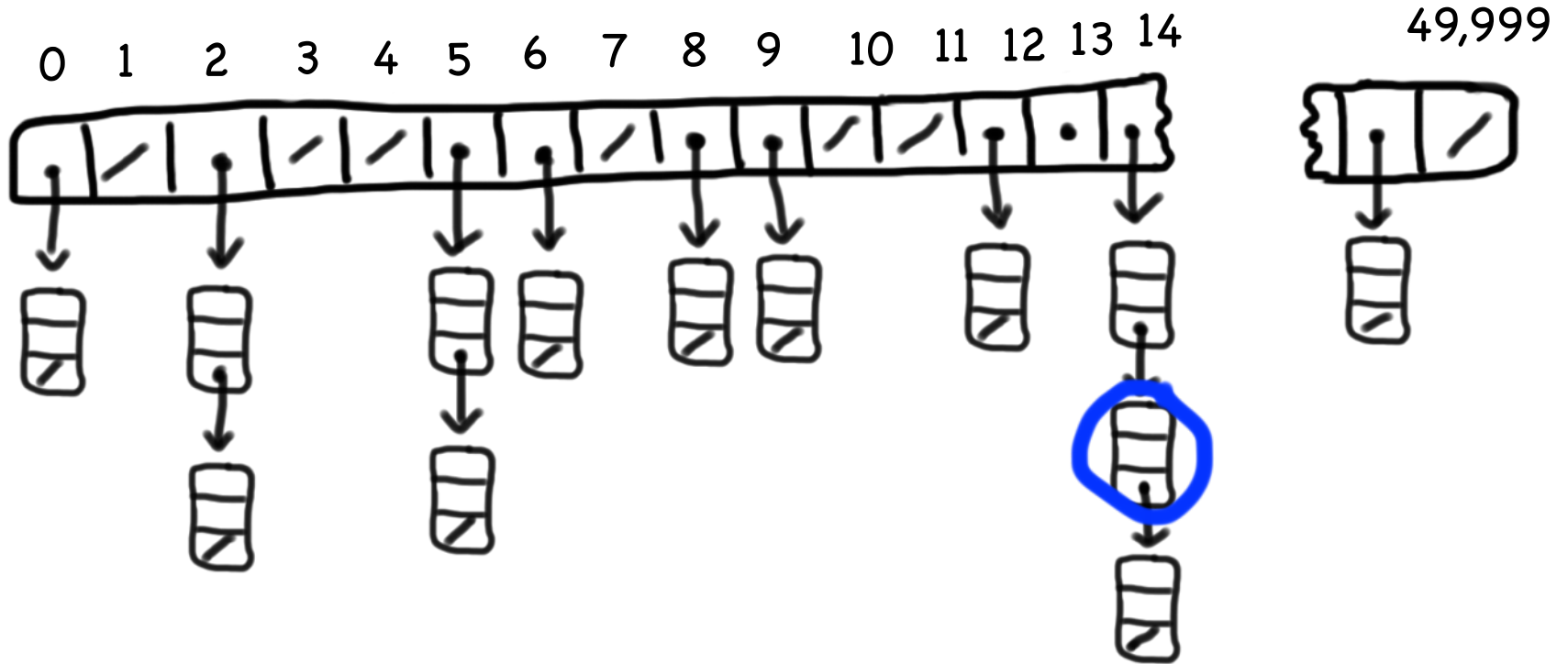


HashMap

Wikipedia:



HashMap



"Antelope Canyon" → Hash Fn → 14

PQueue

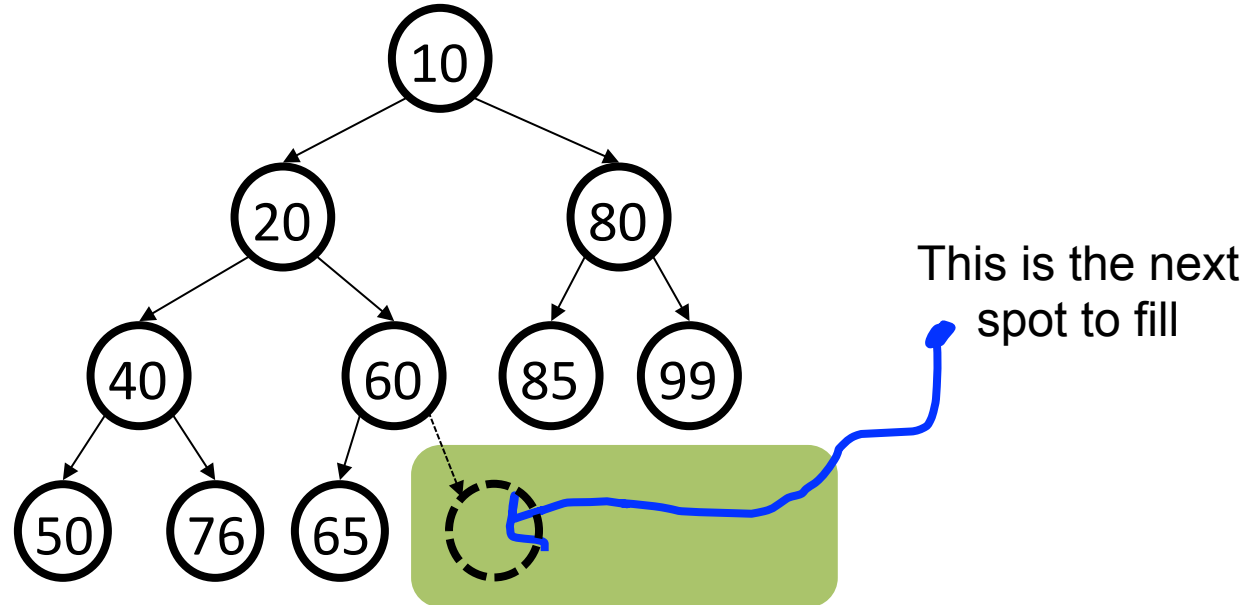
Priority Queue

Pqueue Tree

Heap Ordered: Every branch takes you to a “greater” node.

Binary: Every node has at most two children.

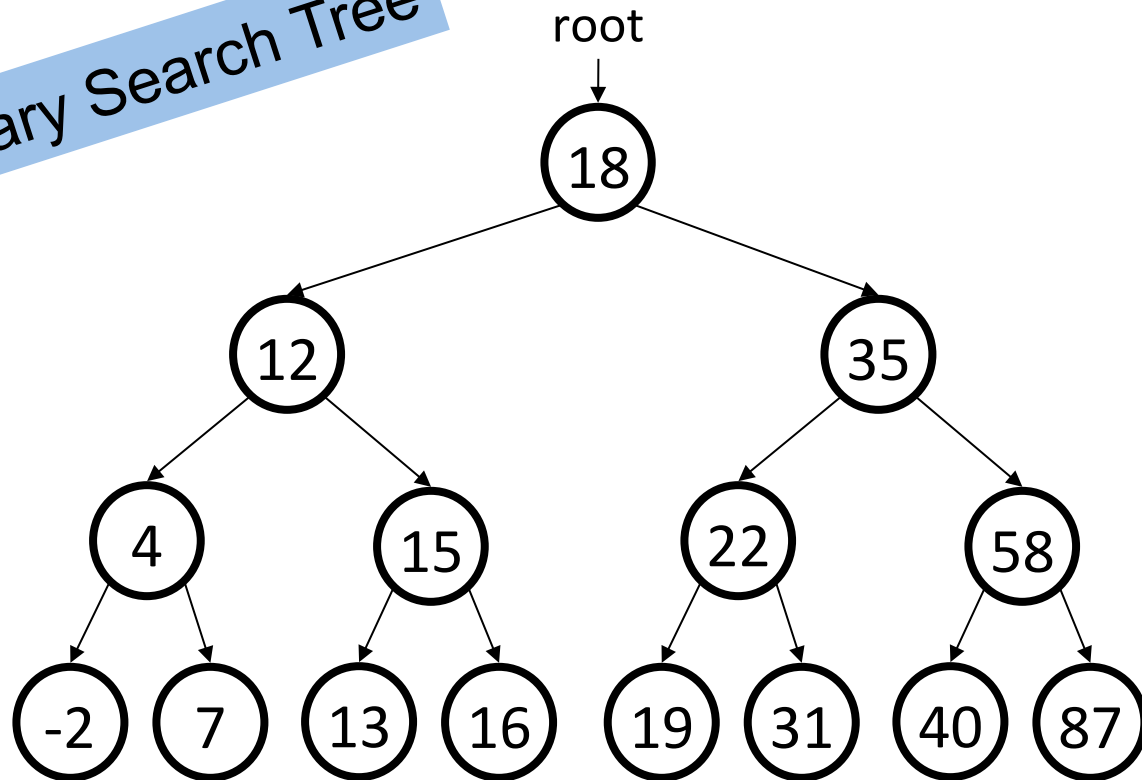
Complete: There are no “gaps” in the tree.



Sets + Maps

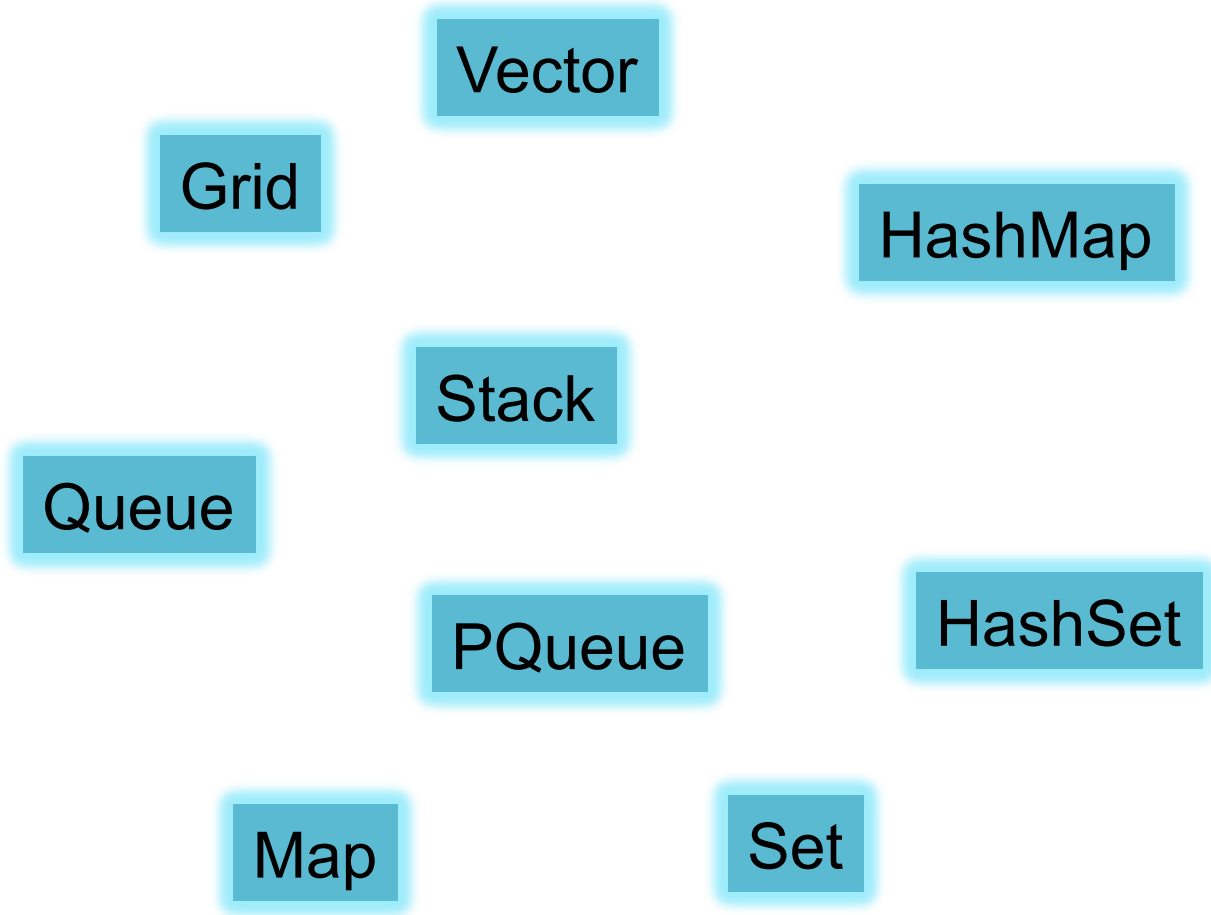
Sets and Maps

Binary Search Tree



That's all of them

Main CS Collections



Main CS Collections

Vector

Grid

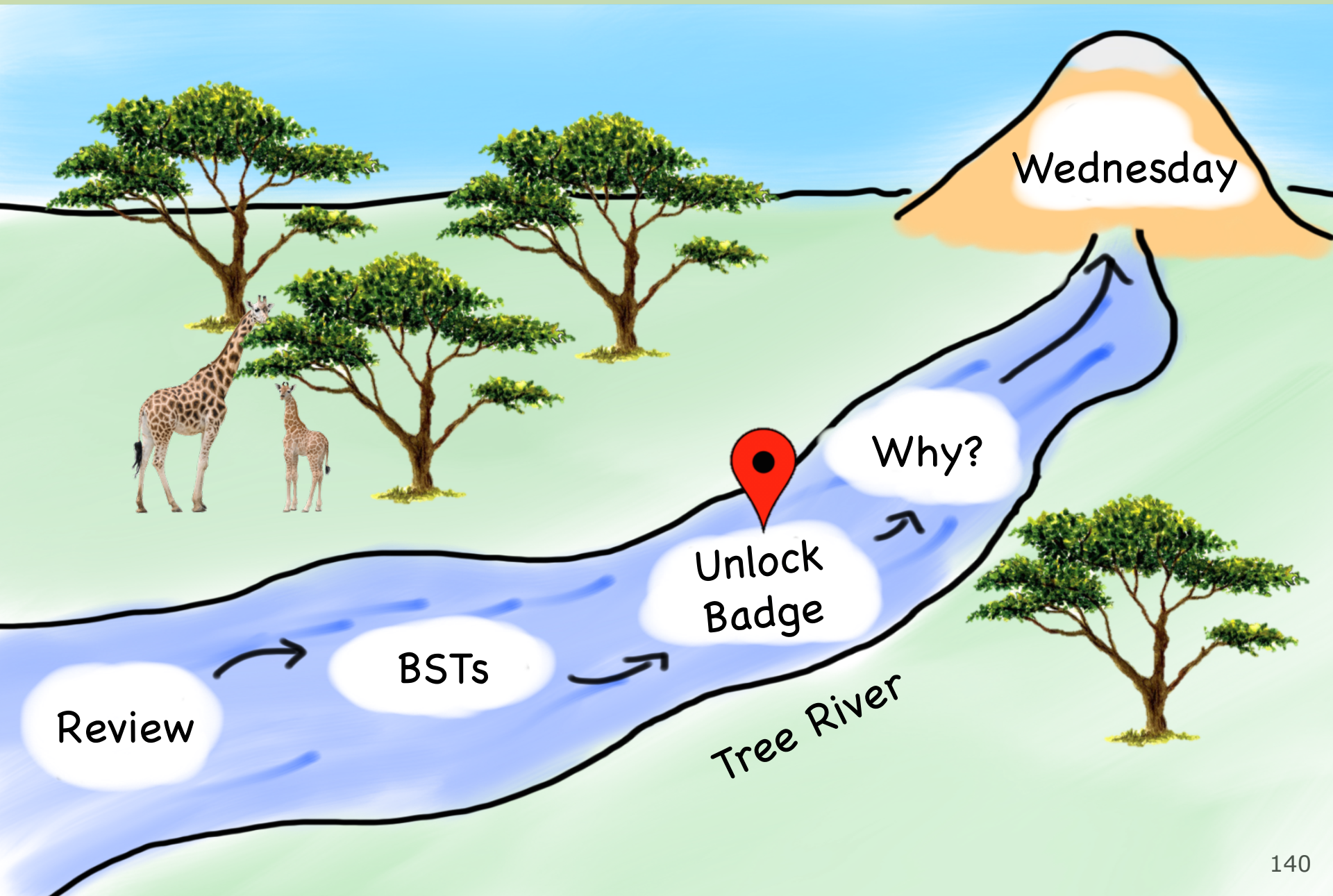
HashMap



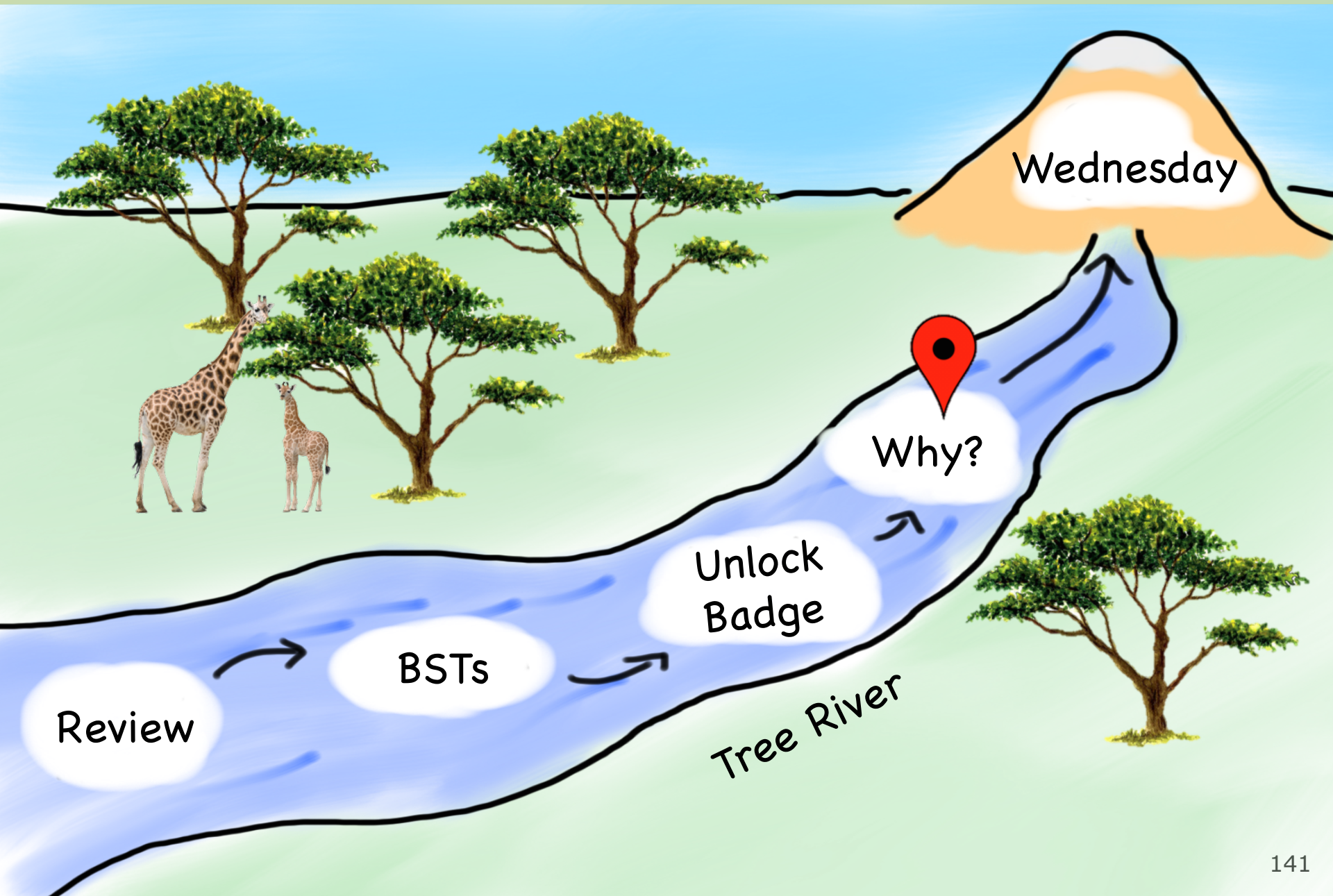
Map

Set

Today's Route



Today's Route



Great Ideas

Ok folks...


Let's Talk about YikYak

How do you think its implemented?

YikYak



Lol



Newsfeed?

151 New Hot

10h 3 Replies Share

Allegorical: of or related to former Vice President Al Gore 57

12h Reply Share

I honestly don't understand why Republicans don't want Obama to select the next Supreme Court Justice... Do they really want Trump to choose? 52

11h 6 Replies Share

TAPs playlist is every song that's been culturally relevant at any point in the last 25 years 51

9h 1 Reply Share

I hate it when guys moan while taking a dump... Like, wtf. 44


15h 6 Replies Share

There's vegetarian and there's "I won't kiss you on the mouth because you ate a burger last week" vegetarian 39

Home Herds Me More

Cynthia Bailey Lee shared Elizabeth Gilbert's photo. 1 hr · 🌐

Saving this to remind myself to show it as an example for Fauxtoshop assignment next quarter.



Baby goats. Wearing sweaters. Riding pop tarts. In space.

Elizabeth Gilbert February 21 at 12:05pm · 🌐 Like Page

A friend sent this to me the other day. Because she understands that sometimes a person just needs to see baby goats, wearing sweaters, riding pop tarts in spac... See More

Like Comment Share

3 Write a comment... 📷 😊

Nikil Viswanathan Down to Happy Hour - 3rd Edition!! 14 hrs · San Francisco · 📧

Ran out of food during our 21 hour nonstop work day yesterday and for dinner at 3am the only thing left was a Soylent (which after 1 sip we had decided never to touch again). We were planning on buying mixers for the happy hour and then realized

Newsfeed?

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11h 6

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9h 1 Reply Share

I hate it when guys moan while taking a dump... Like, wtf. 44

15h 6 Replies

There's vegetarian and there's "I won't kiss you on the mouth because you ate a burger last week" vegetarian 39

Home Herds Me More

PriorityQueue? Need to iterate many times

Set? Duplicate priorities

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Like Comment Share

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Priority Based with Iteration

151 New Hot

10h 3 Replies Share

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12h Reply Share

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11h 6 Replies Share

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9h 1 Reply Share

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15h 6 Replies Share

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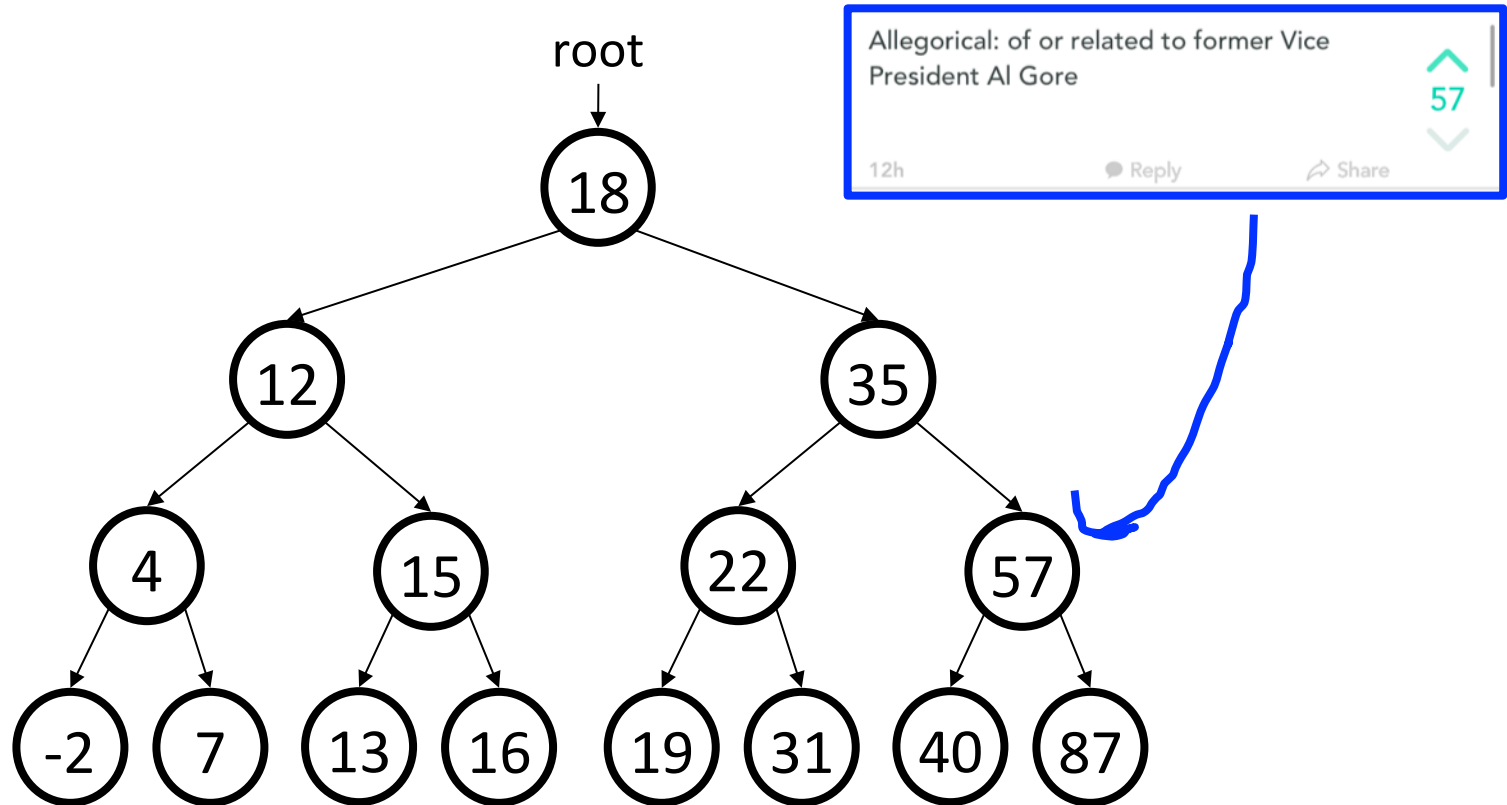
Like Comment Share

3 Write a comment...

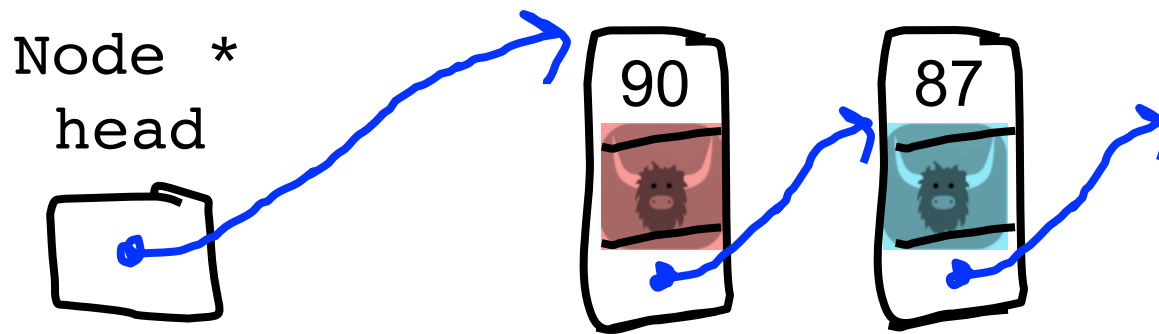
Nikil Viswanathan Down to Happy Hour - 3rd Edition!! 14 hrs · San Francisco · 📧

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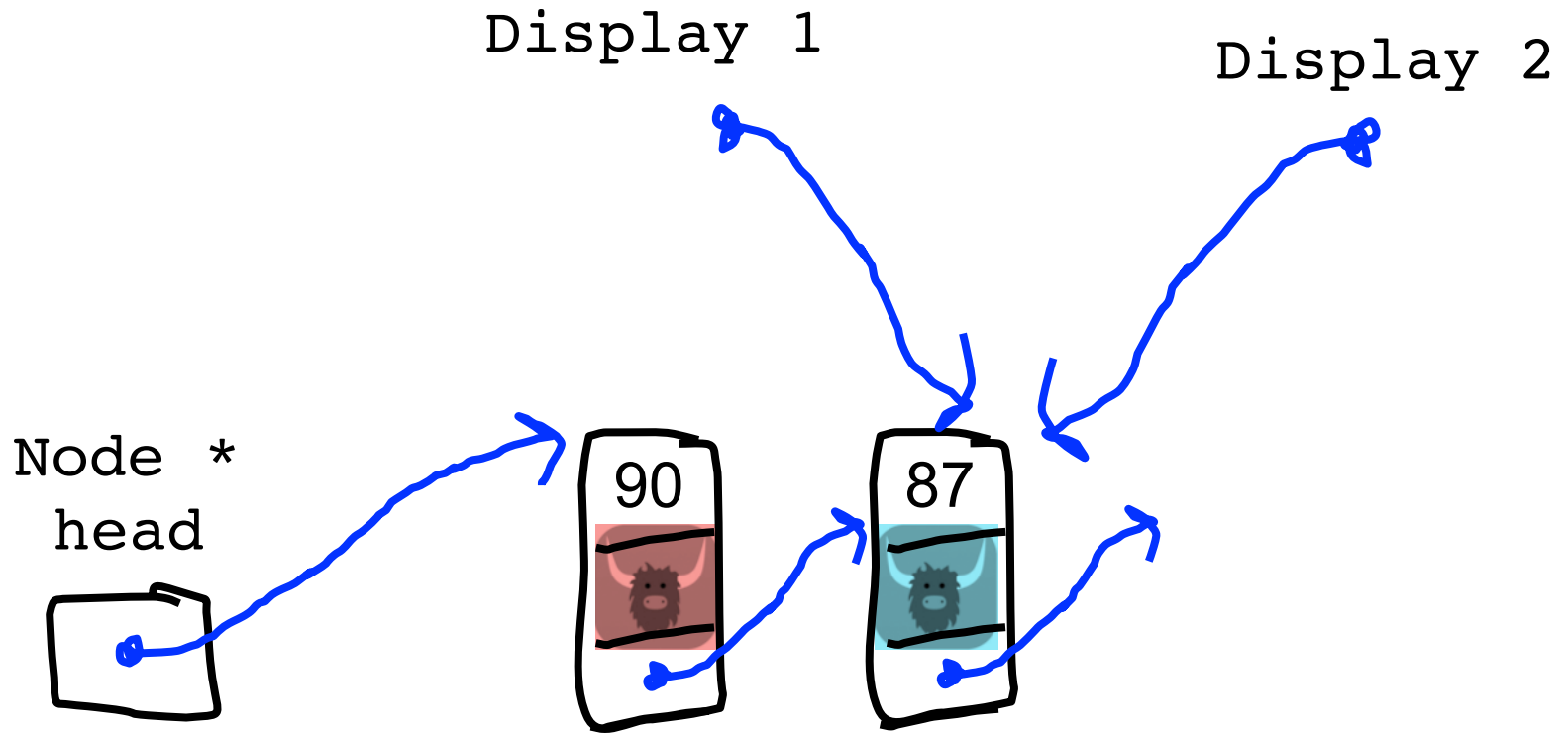
BST that Allows Duplicates?



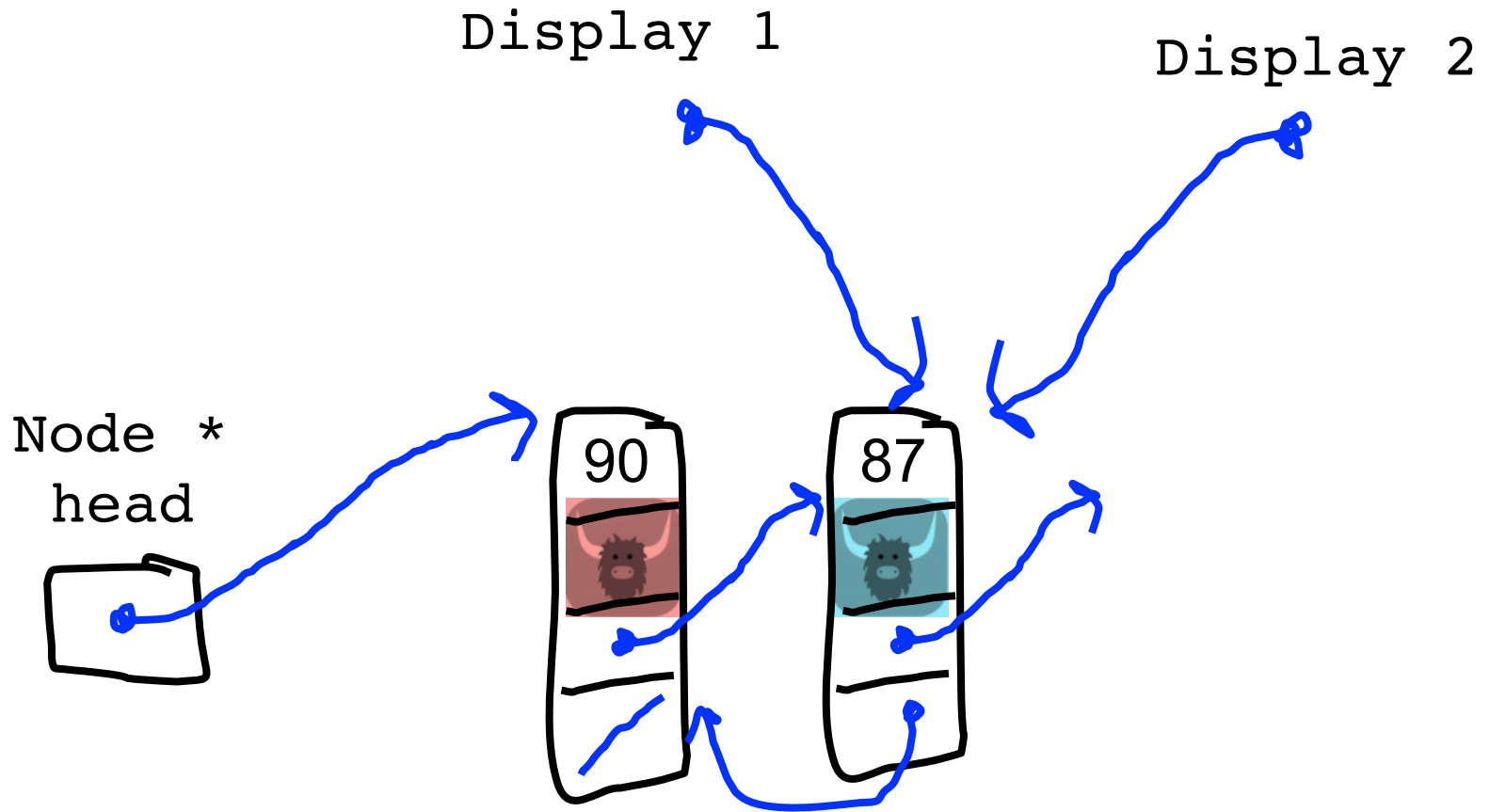
Linked List?



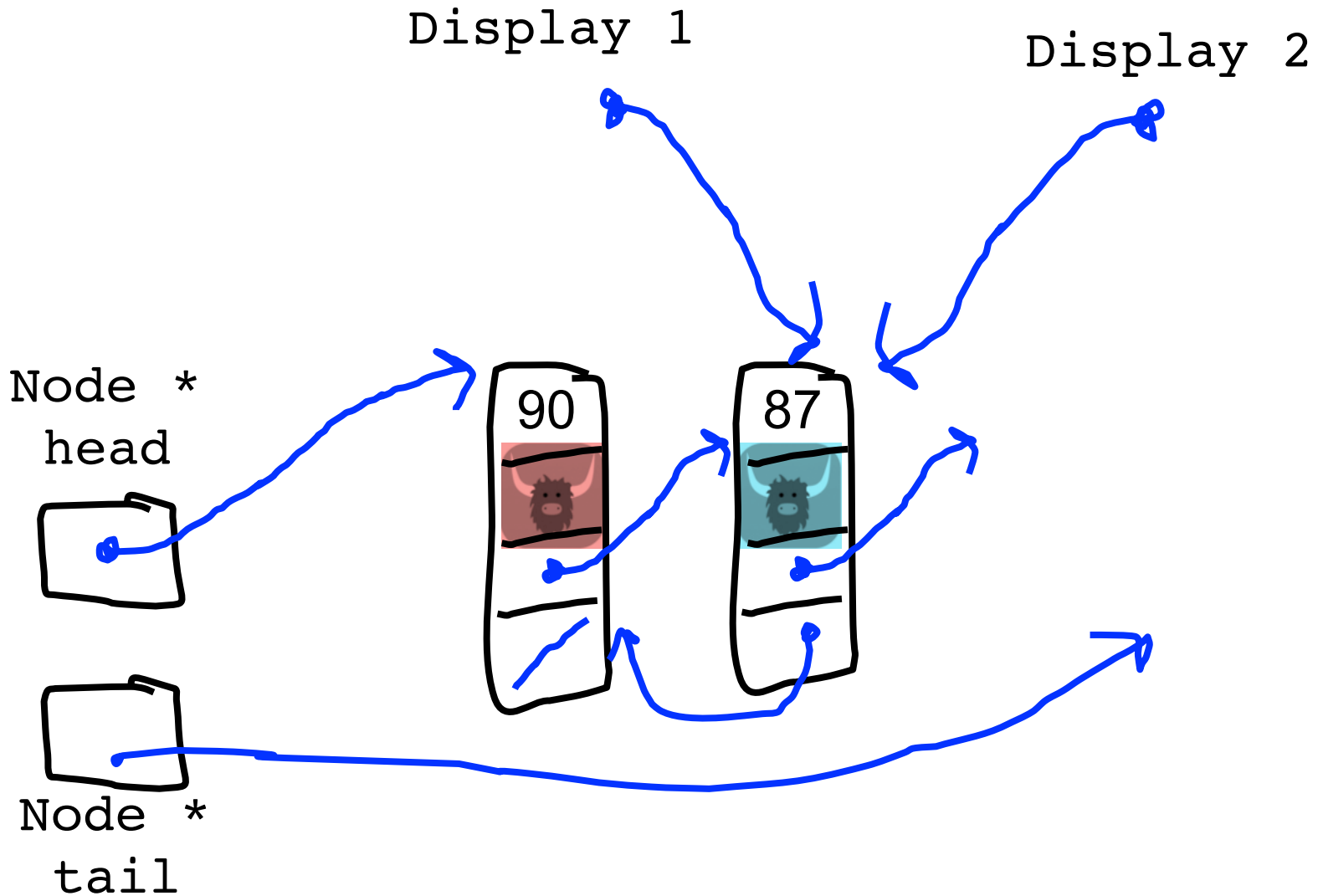
Linked List?



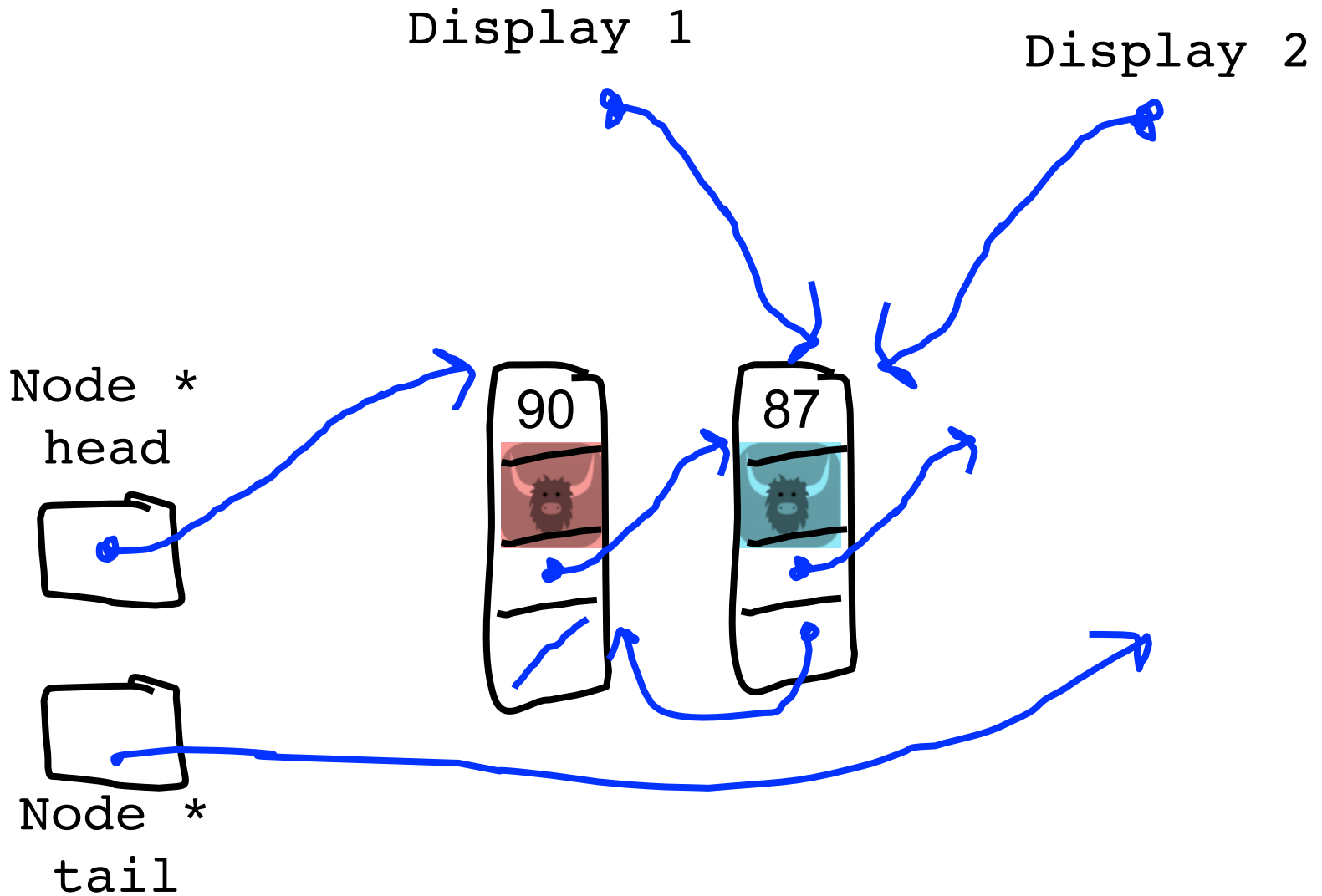
Linked List?



Linked List?

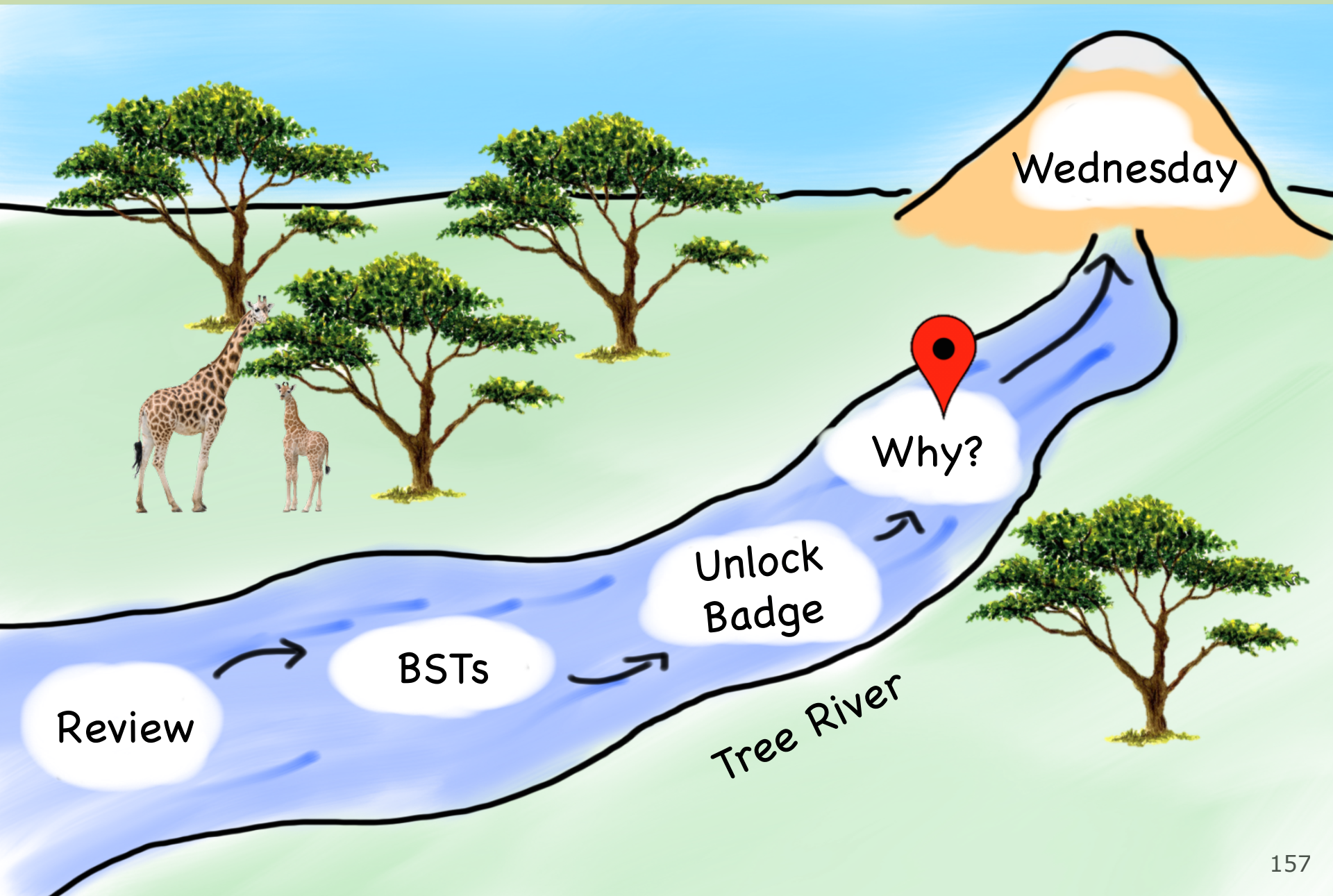


Yakray

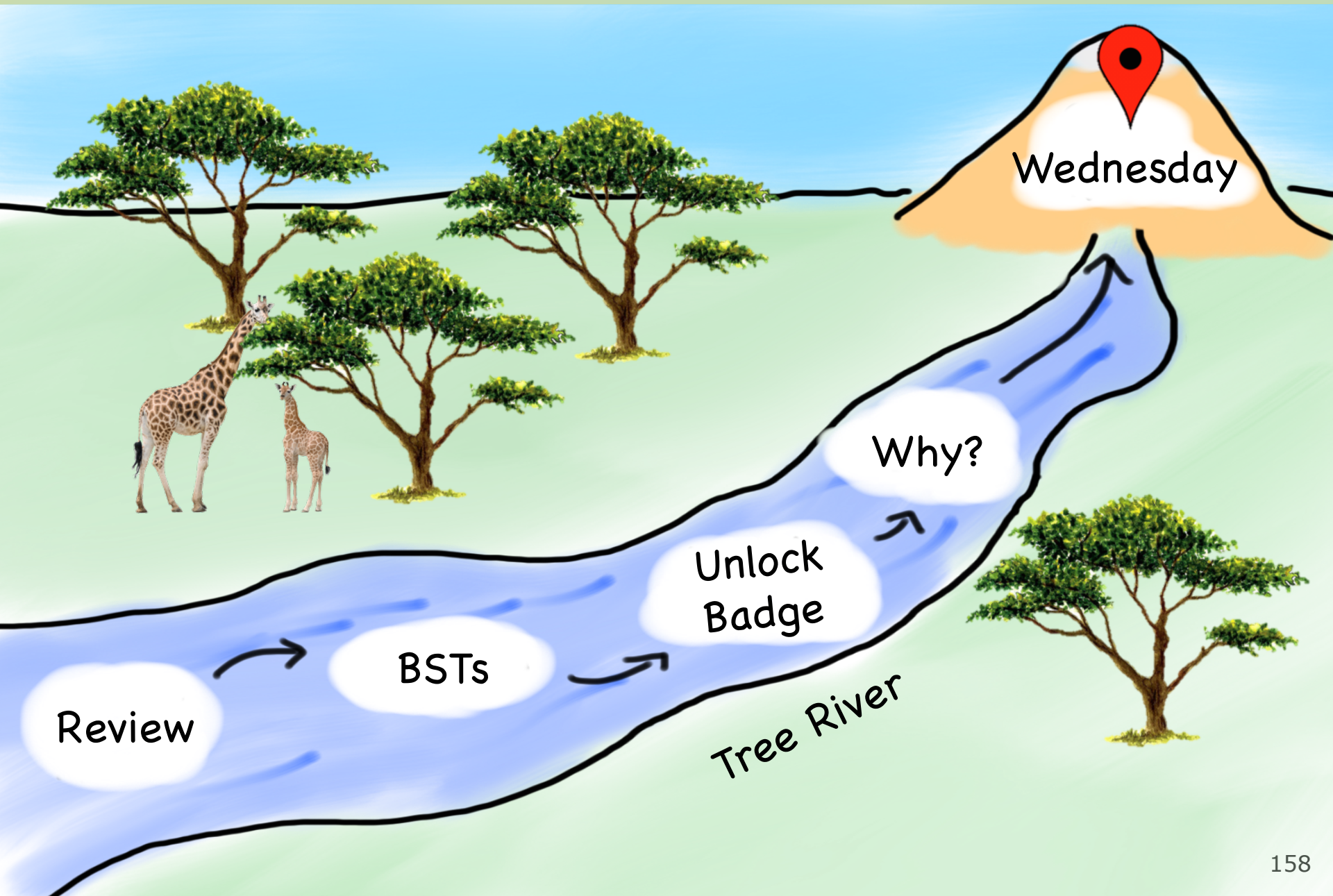


Happy with that

Today's Route



Today's Route



Today's Goal


1. Binary Search Trees
2. Review Under the Hood



Course Syllabus


Intro to Abstractions

ADTs



A stick figure stands next to a document with a checklist. A lightbulb is shown above the figure's head, indicating an idea or abstraction. A speech bubble next to the figure contains the text 'ADTs'.

Recursion




Three stick figures of decreasing size are shown holding hands in a line, representing the concept of recursion.

Under the Hood

Vectors

Linked Lists


Hash Maps



Three circles containing the text 'Vectors', 'Linked Lists', and 'Hash Maps' are arranged horizontally within a purple box.

Graphs

Trees



A diagram of a tree graph with a root node and three child nodes, connected by arrows. A red location pin is placed over the word 'Trees'.

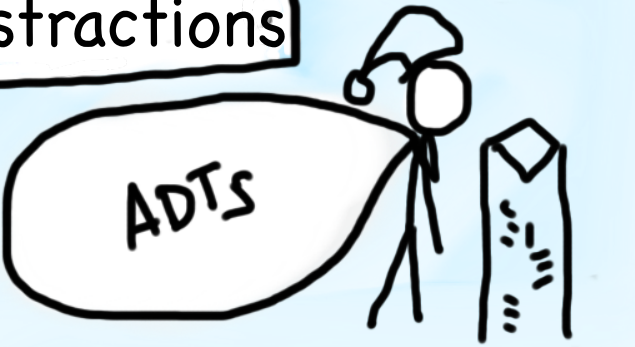


You are here


Course Syllabus

Intro to Abstractions

ADTs



Recursion




Under the Hood

Vectors


Linked Lists

Hash Maps



Graphs

Trees



You are here

[Drops mic, walk away]

Incase of extra time, pick up mic

Supervised Machine Learning

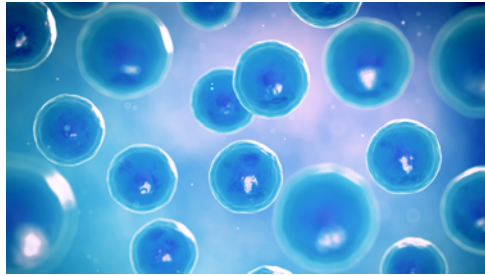
*High dimensional
vector*



Label

Not on Final

Supervised Machine Learning



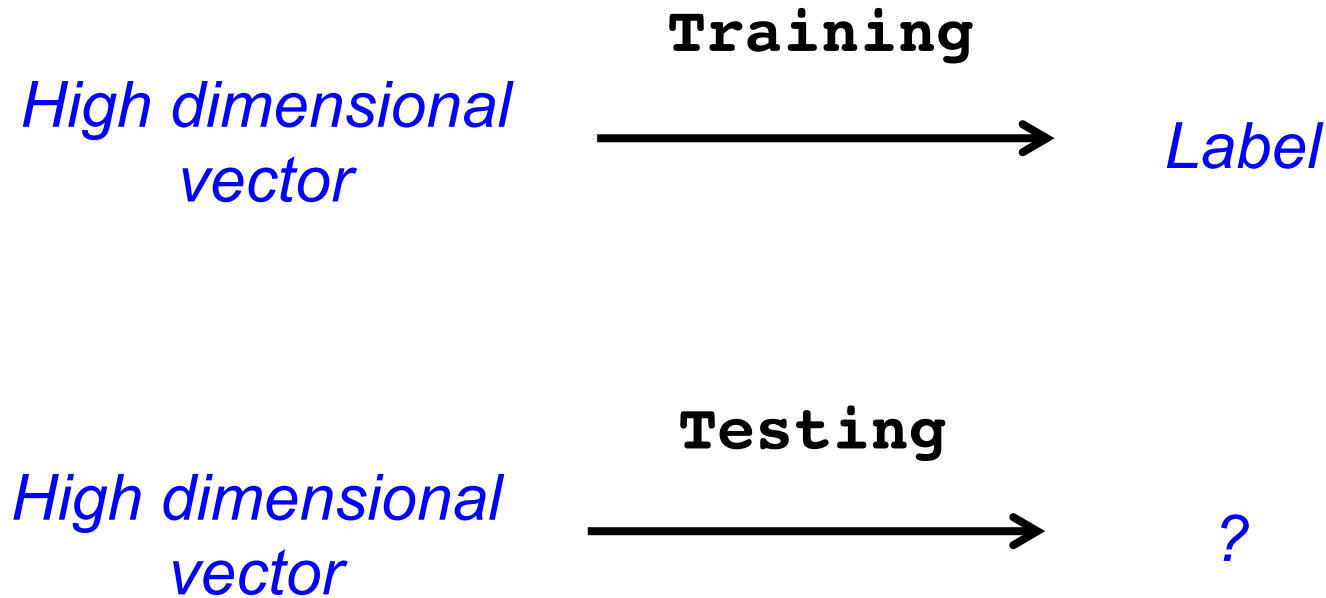
*High dimensional
vector*



Label

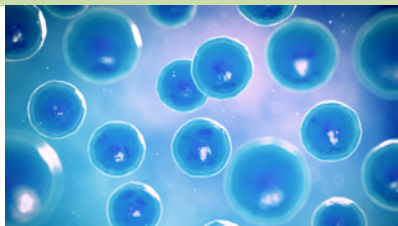
Not on Final

Supervised Machine Learning



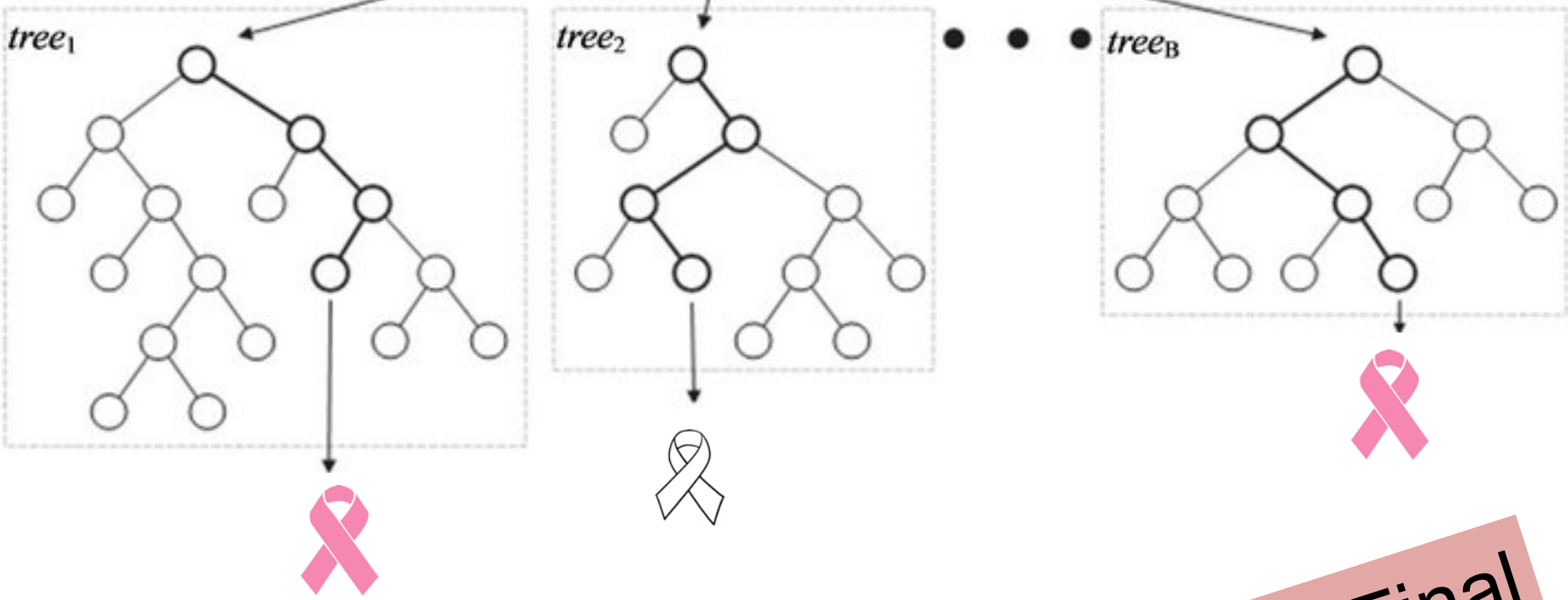
Not on Final

Random Forest



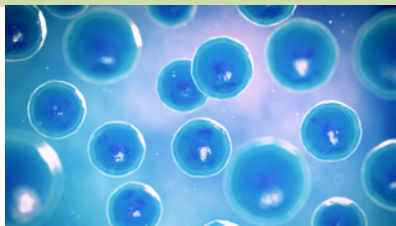
High dimensional vector

x



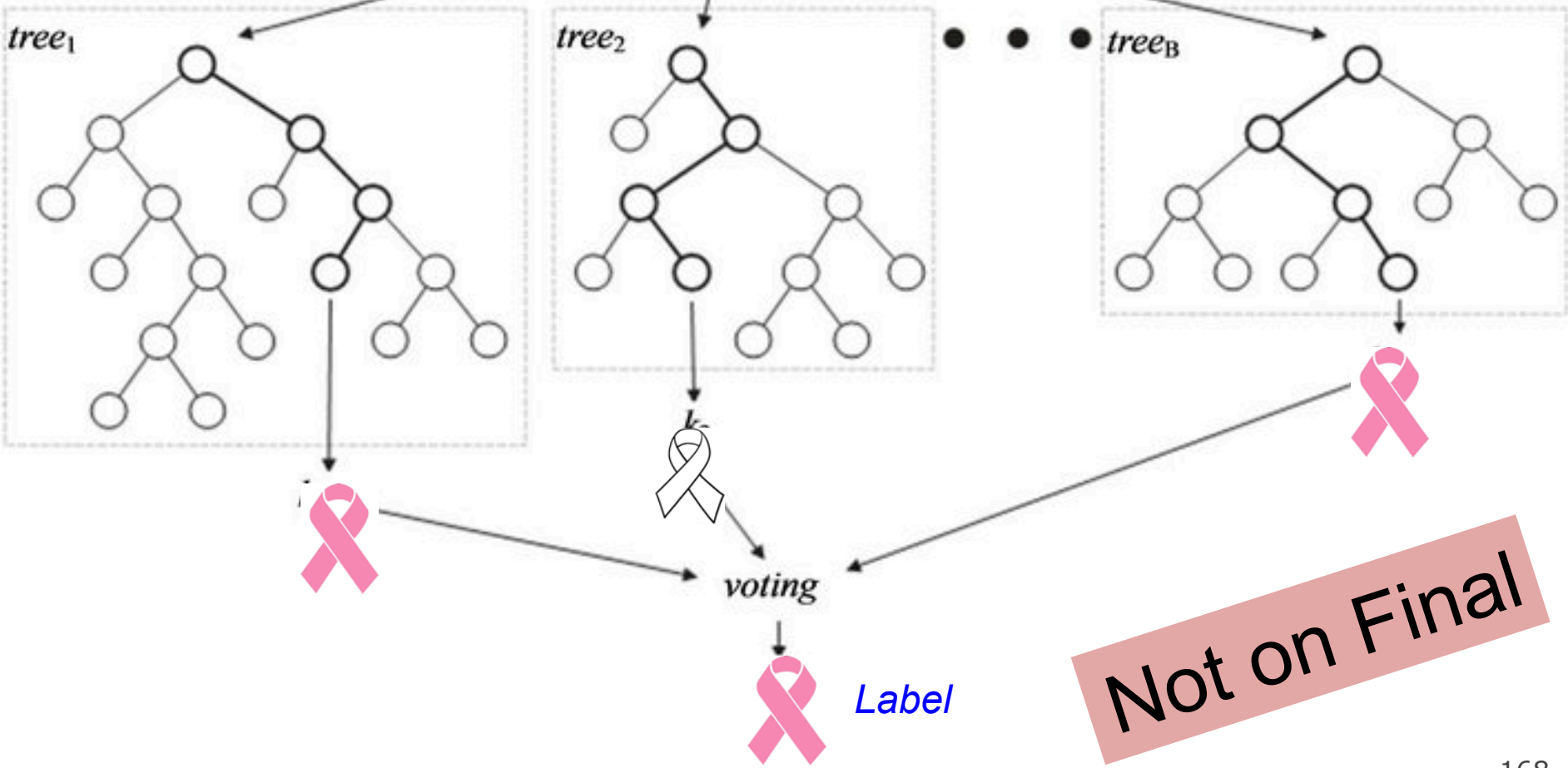
Not on Final

Random Forest



High dimensional vector

x



Not on Final