

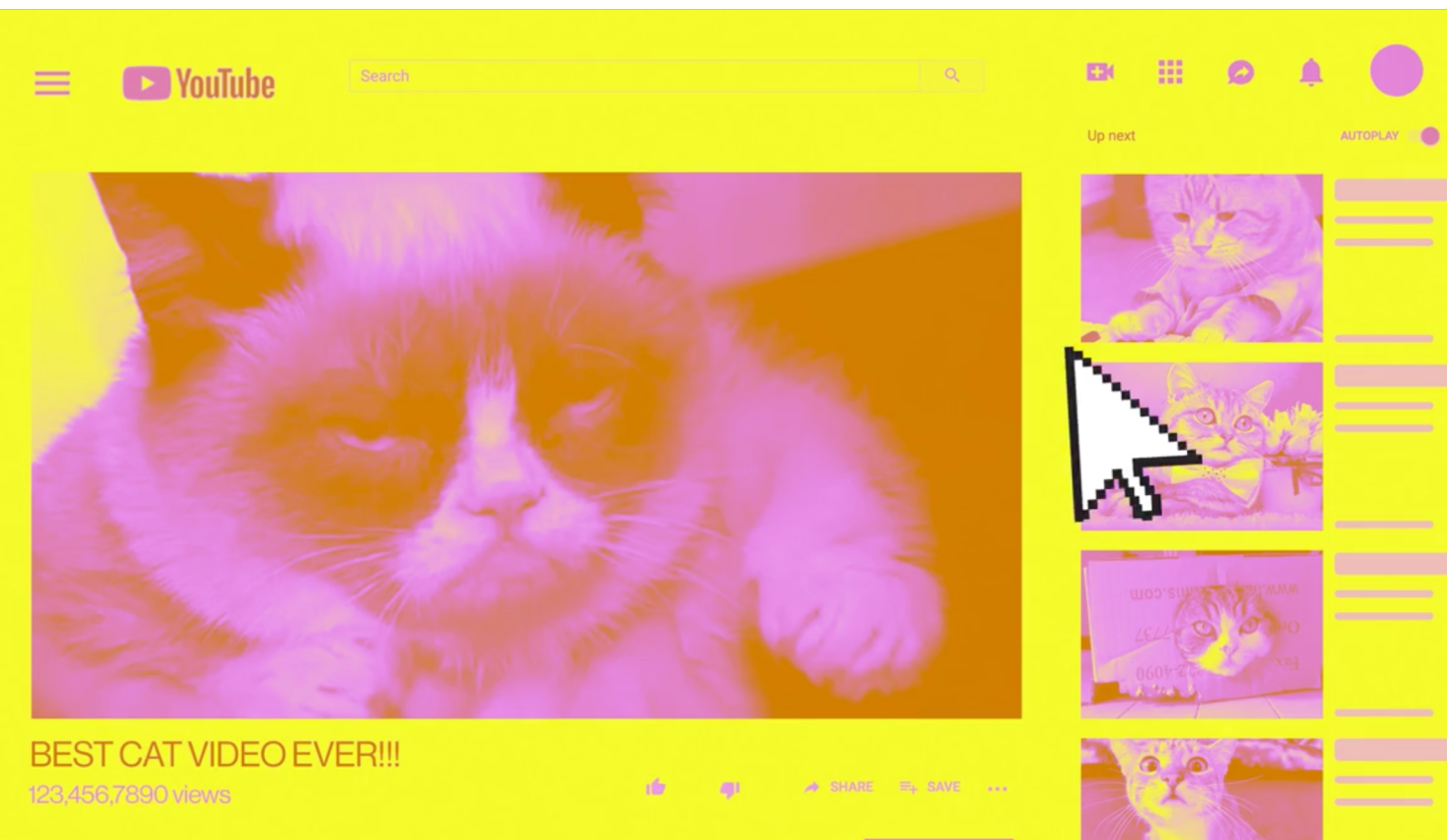
DeepMind is asking how Google helped turn the internet into an echo chamber

www.technologyreview.com/s/613083/deepmind-is-asking-how-google-helped-turn-the-internet-into-an-echo-chamber/

“One of the most common applications of machine learning today is in **recommendation algorithms**. Netflix and YouTube use them to push you new shows and videos; Google and Facebook use them to rank the content in your search results and news feed. While these algorithms offer a great deal of convenience, they have some undesirable side effects. You’ve probably heard of them before: filter bubbles and echo chambers.

Researchers found that the more accurately a recommendation engine pegs your interests, the faster it traps you in an information bubble.

...**the best way to combat** filter bubbles or echo chambers **is to design the algorithms to be more exploratory, showing you things that are less certain to capture your interest**. Expanding the overall set of information from which the recommendations are drawn from can also help.”

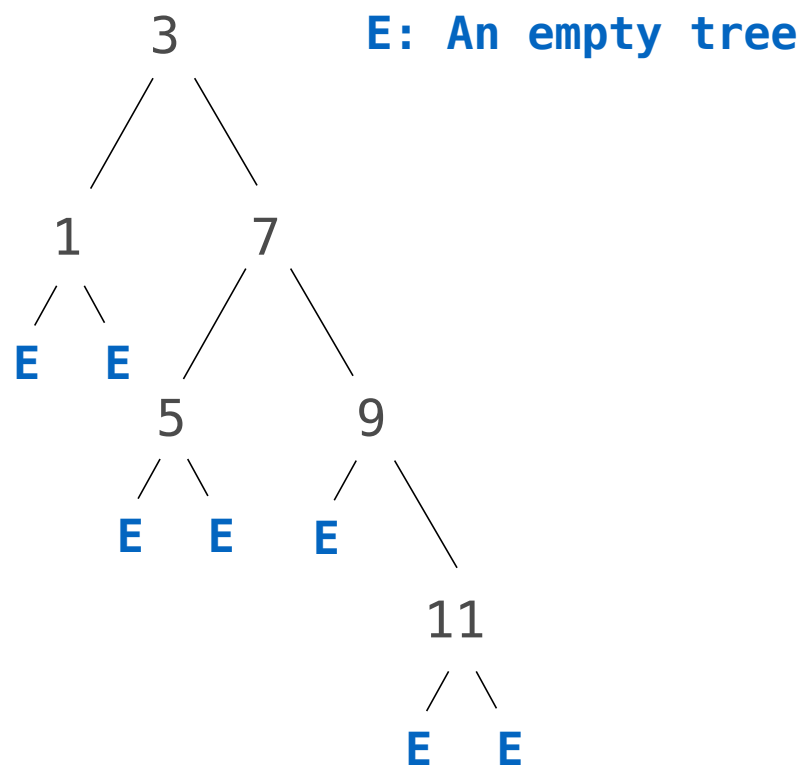


Binary Tree Class

A binary tree is a tree that has a left branch and a right branch

Idea: Fill the place of a missing left branch with an empty tree

Idea 2: An instance of BTree always has *exactly* two branches



```
class BTree(Tree):  
    empty = Tree(None)  
  
    def __init__(self, label, left=empty, right=empty):  
        Tree.__init__(self, label, [left, right])
```

```
@property  
def left(self):  
    return self.branches[0]
```

```
@property  
def right(self):  
    return self.branches[1]
```

```
t = BTree(3, BTree(1),  
            BTree(7, BTree(5),  
                  BTree(9, BTree.empty,  
                          BTree(11))))
```

(Demo)

Binary Search

A strategy for finding a value in a sorted list: check the middle and eliminate half

20 in [1, 2, 4, 8, 16, 32, 64]



[1, 2, 4, 8, 16, 32, 64]



[1, 2, 4, 8, 16, 32, 64]



False

4 in [1, 2, 4, 8, 16, 32]



[1, 2, 4, 8, 16, 32]



[1, 2, 4, 8, 16, 32, 64]



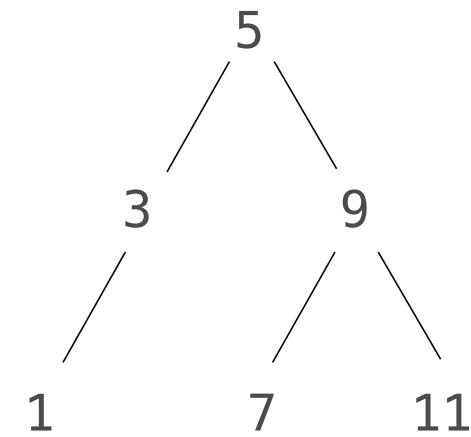
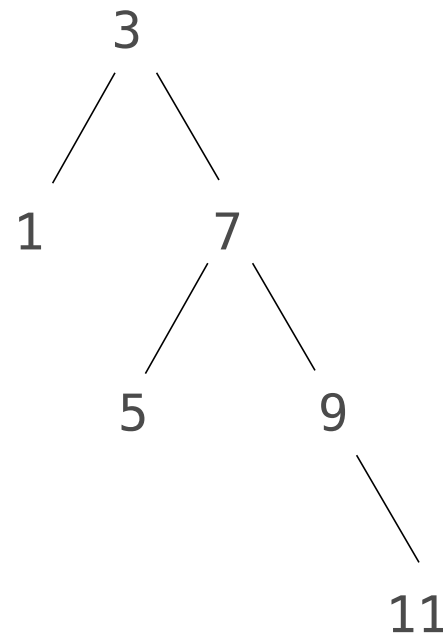
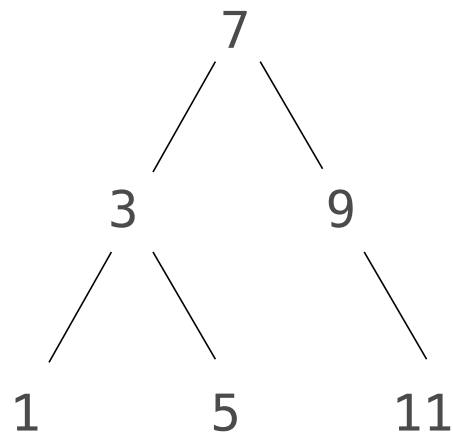
True

For a sorted list of length n , what Theta expression describes the time required? $\Theta(\log n)$

Binary Search Trees

A binary search tree is a binary tree where each node's label is:

- Larger than all node labels in its left branch and
- Smaller than all node labels in its right branch



(Demo)

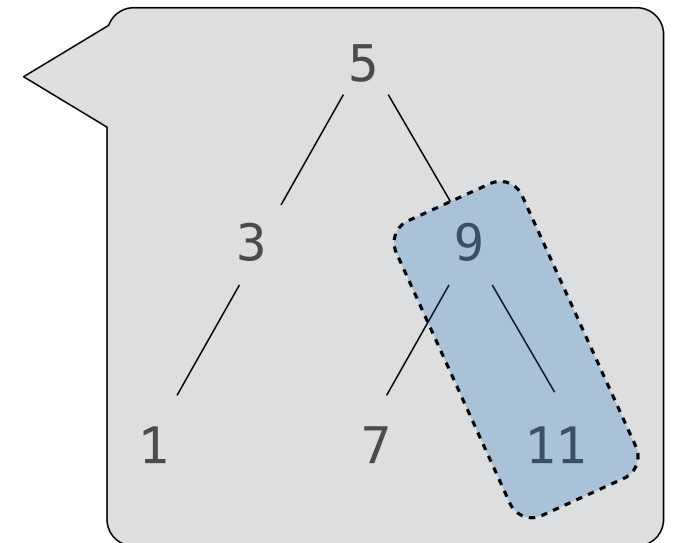
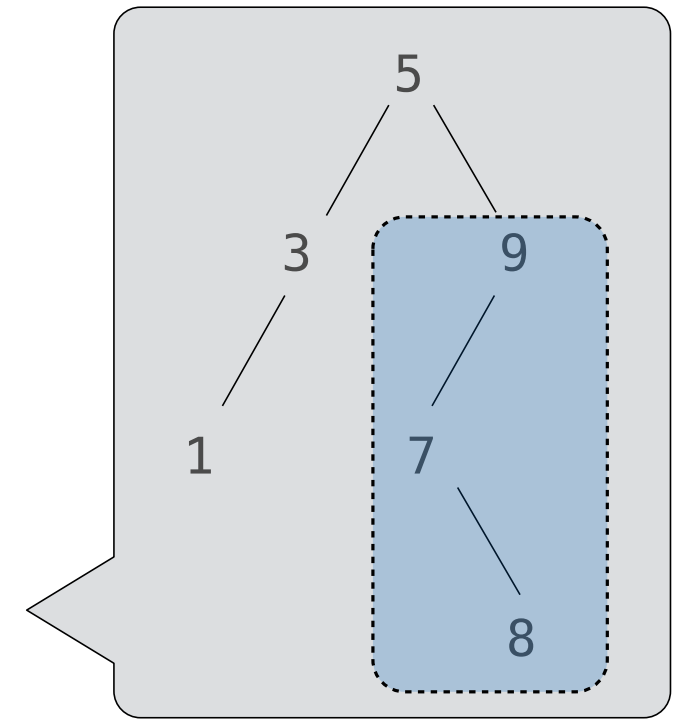
Discussion Questions

What's the largest element in a binary search tree?

```
def largest(t):  
    if t.right is BTree.empty:  
        return t.label  
    else:  
        return largest(t.right)
```

What's the second largest element in a binary search tree?

```
def second(t):  
    if t.is_leaf():  
        return None  
    elif t.right is BTree.empty:  
        return largest(t.left)  
    elif t.right.is_leaf():  
        return t.label  
    else:  
        return second(t.right)
```



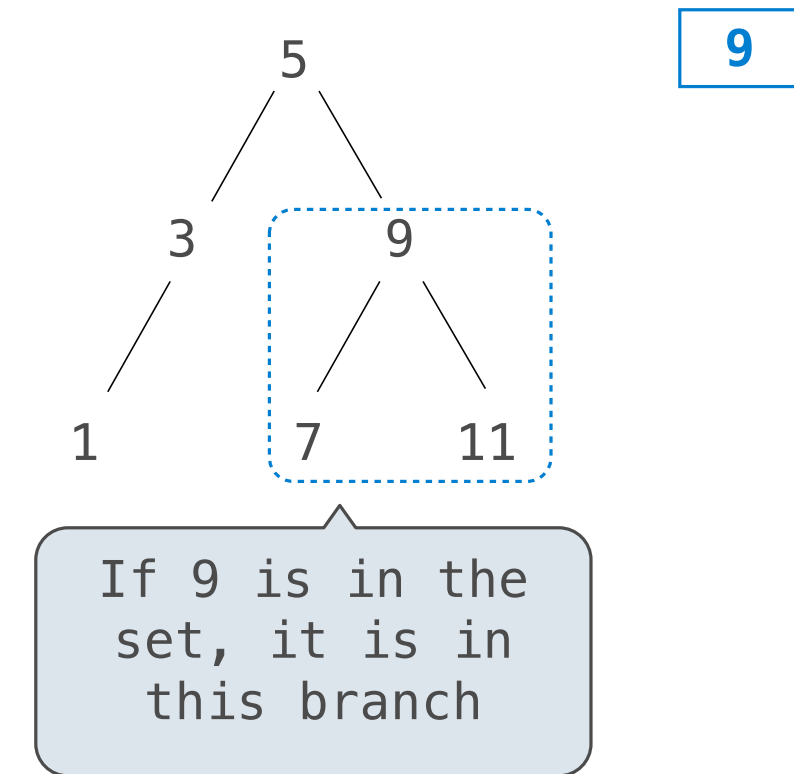
Sets as Binary Search Trees

Membership in Binary Search Trees

contains traverses the tree

- If the element is not at the root, it can only be in either the left or right branch
- By focusing on one branch, we reduce the set by the size of the other branch

```
def contains(s, v):  
    if s is BTree.empty:  
        return False  
    elif s.label == v:  
        return True  
    elif s.label < v:  
        return contains(s.right, v)  
    elif s.label > v:  
        return contains(s.left, v)
```



Order of growth? $\Theta(h)$ on average $\Theta(\log n)$ on average for a balanced tree

Adjoining to a Tree Set

