

# Binary Search Trees

CSE 332 Spring 2021

**Instructor:** Hannah C. Tang

## Teaching Assistants:

Aayushi Modi Khushi Chaudhari

Patrick Murphy

Aashna Sheth Kris Wong

Richard Jiang

Frederick Huyan Logan Milandin

Winston Jodjana

Hamsa Shankar Nachiket Karmarkar

# Announcements

- ❖ Quiz 1 is due 11am PDT (not midnight!) tomorrow
- ❖ Also tomorrow: P2 partner matching survey
  - Must fill out even if you keep the same partner
- ❖ Thanks to your TAs, P1 is now due FRIDAY at 8pm PDT
  - Late policy is percentage-off, not late days
- ❖ We are always available for 1:1 meetings! Let us know how we can help!

- ❖ For a binary tree of height  $h$ :
  - max # of leaves:
  
  - max # of nodes:
  
  - min # of leaves:
  
  - min # of nodes:
  
- ❖ Bonus question: What is the difference between a plain *binary tree*, a *binary **search** tree*, and a *binary **min-heap** tree*?

# Lecture Outline

- ❖ **Redo: Floyd's buildHeap**
  
- ❖ Review: Dictionary and Set ADTs
  
- ❖ Binary Trees != Binary Search Trees
  - Tree traversals
  
- ❖ Binary Search Trees as Dictionary/Set Data Structures
  - Find/Contains
  - Add/Remove

# buildHeap

- ❖ `buildHeap()` takes an array of size  $N$  and applies the heap-ordering principle to it
  - Faster than naïve call-`add()`- $N$ -times algorithm  $\Theta(n \log n)$
- ❖ Intuition:
  - Start in the *middle* of the array (ie, the first non-leaf node) and work *backwards* (ie, up the tree)
  - Percolate *down* to fix each node's position relative to its valid subheaps
- ❖ Correctness and Efficiency:
  - Can prove correctness inductively
  - Most `percolateDown` calls don't "go far", summation shows  $\Theta(n)$

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# Dictionary ADT: Data Structures

- ❖ For a dictionary with  $n$  key/value pairs, what is the runtime for:

	insert	find	delete
Unsorted linked list	$O(1)^*$	$O(n)$	$O(n)$
Unsorted array	$O(1)^*$	$O(n)$	$O(n)$
Sorted linked list	$O(n)$	$O(\log n)$	$O(n)$
Sorted array	$O(n)$	$O(\log n)$	$O(n)$

- ❖ \* *Note:* If we allow duplicates keys to be inserted, you could do these in  $O(1)$  because you do not need to check for a key's existence before insertion

**Reminder:** a dictionary maps *keys* to *values*;  
an *item* or *data* refers to the (key, value) pair

# Dictionary ADT: Better Data Structures

- ❖ We will spend the next several lectures looking at dictionaries:
  - Binary Search Trees
  - AVL trees
    - Binary search trees with guaranteed balancing
  - B-Trees
    - Also always balanced, but different and shallower
    - “B” != “Binary”; B-Trees generally have large branching factor
  - Hash Tables
    - Not tree-like at all
  
- ❖ Skipping: Other balanced binary search trees
  - Eg, red-black tree (and LLRBs), splay tree



# Lecture Outline

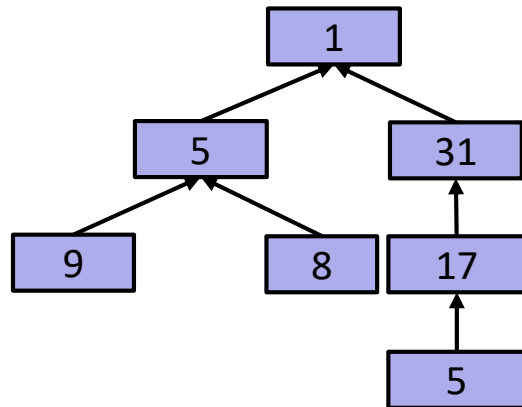
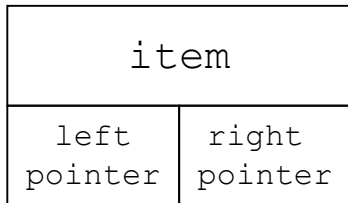
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# Binary Tree

- ❖ A **Binary Tree** is empty or
  - a root (*with item*)
  - a left subtree (*maybe empty*)
  - a right subtree (*maybe empty*)

*recursive defn!*

- ❖ Representation:



- ❖ For a dictionary, `item` will include a key and a value

# Binary Tree: Some Numbers

- ❖ Recall: height of a tree = longest path from root to leaf
  - Count # of edges!

- ❖ For a binary tree of height  $h$ :

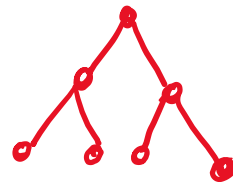
- max # of leaves:  $2^h$

- max # of nodes:  $2^{h+1} - 1$

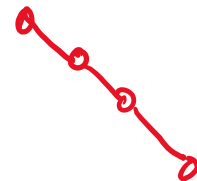
- min # of leaves:  $1$

- min # of nodes:  $h+1$

perfect tree



degenerate linked list tree



# Calculating Tree Height

- ❖ What is the height of a tree with root  $r$ ?
- ❖ What is the runtime for your algorithm?

```
int treeHeight(Node root) {  
    if (root == null)  
        return -1;  
    return 1 + max(treeHeight(root.left),  
                  treeHeight(root.right));  
}
```

- ❖ *Note:* non-recursive is painful – need your own stack of pending nodes
  - Much easier to use recursion's call stack

# Lecture Outline

- ❖ Redo: Analyzing Recursive Code
- ❖ Review: Dictionary and Set ADTs
- ❖ Binary Trees != Binary Search Trees
  - **Tree traversals**
- ❖ Binary Search Trees as Dictionary/Set Data Structures
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# Tree Traversals

❖ A *traversal* is an order for visiting all the nodes of a tree

▪ *Pre-order*: root, left subtree, right subtree

•  $+ * 2 4 5$

▪ *In-order*: left subtree, root, right subtree

•  $2 * 4 + 5$

▪ *Post-order*: left subtree, right subtree, root

•

❖ Sometimes order doesn't matter

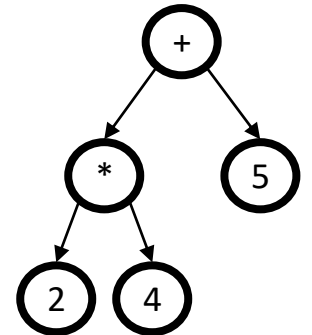
▪ Eg: sum all elements

▪ Eg: find an element

❖ Sometimes order matters

▪ Eg: print tree with indented children (pre-order)

▪ Eg: evaluate an expression tree (post-order)



(an expression tree)

PrintIndented:

+

  \*

    2

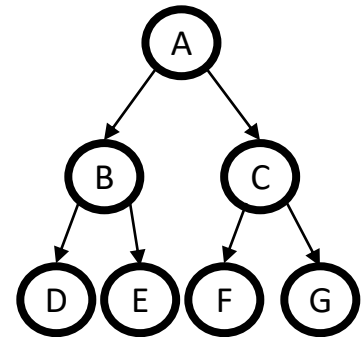
    4

  5

# Traversals: Recursive Implementation

```
void inOrdertraversal(Node t) {  
    if (t != null) {  
        traverse(t.left);  
        process(t.element);  
        traverse(t.right);  
    }  
}
```

becomes postOrder!



Post order: DEBFGCA

- ❖ The difference between the 3 traversals (in their recursive implementations) is *when process() gets called*
- ❖ Again, non-recursive implementation is painful

# Lecture Outline

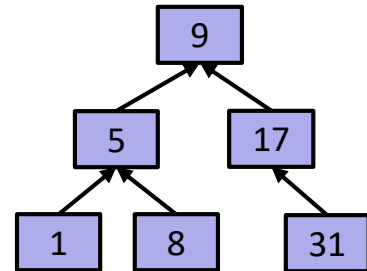
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  - Find/Contains
  - Add/Remove



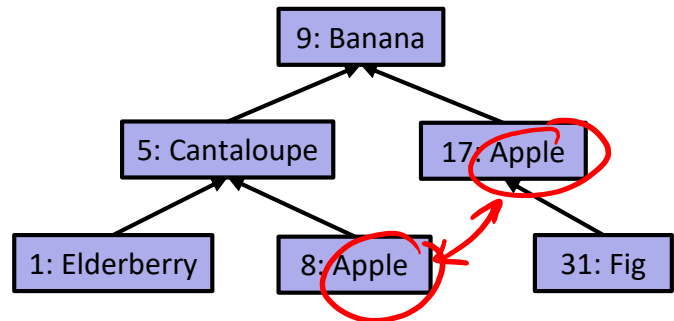
# Binary Search Trees

❖ A **Binary Search Tree** is a binary tree with the following invariant: for every node with key  $k$  in the BST:

- The left subtree only contains keys  $<k$
- The right subtree only contains keys  $>k$



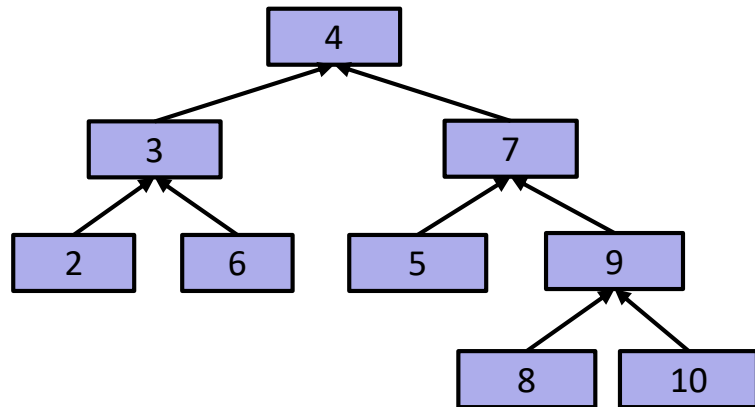
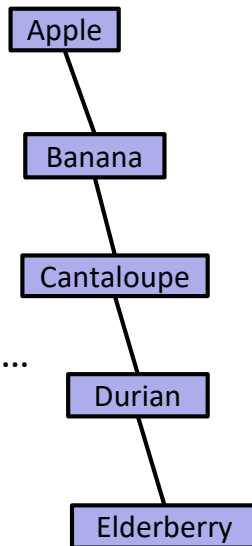
❖ Reminder: BSTs can also contain (key, value) pairs



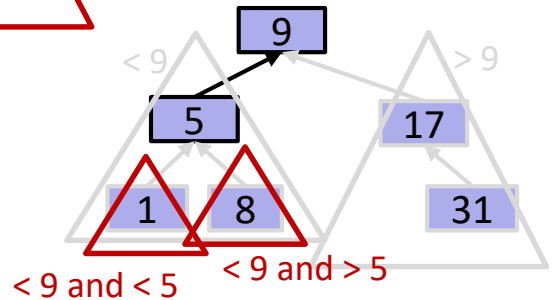
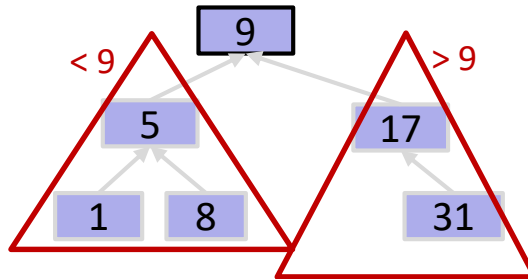
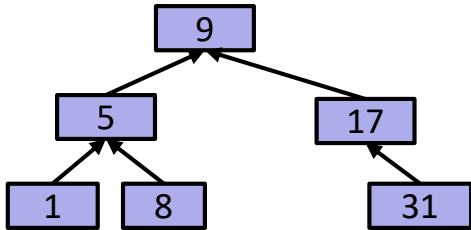
*The BST ordering applies recursively to the entire subtree*

❖ Are these Binary Search Trees?

- A. Yes / Yes
- B. Yes / No
- C. No / Yes
- D. No / No
- E. I'm not sure ...



# BST Ordering Applies *Recursively*



# Lecture Outline

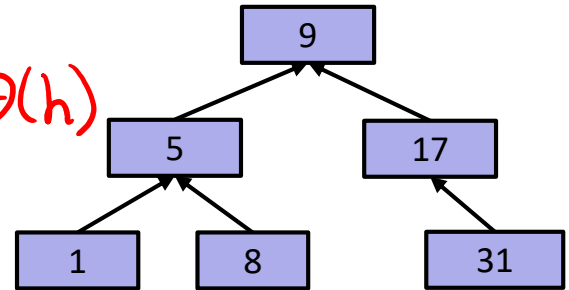
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  - Add/Remove

# Binary Search Trees: Find/Contains

- ❖ Unsurprisingly, this looks a lot like binary search
- ❖ Can you implement contains() by putting the following statements in the correct order?
  - Hint: remember BST's invariants
- ❖ What is find's worst-case runtime?  $\Theta(h)$

```
boolean contains(BSTNode n,
                Key k) {
}

```



A

```
if (n == null)
    return false;

```

B

```
if (k.equals(n.key))
    return true;

```

C

```
if (k < n.k) {
    return contains(
        n.left, k);
}

```

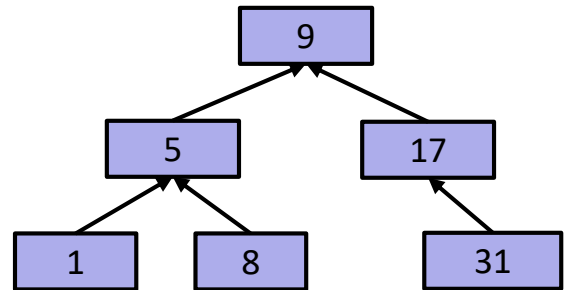
D

```
if (k >= n.k) {
    return contains(
        n.right, k);
}

```

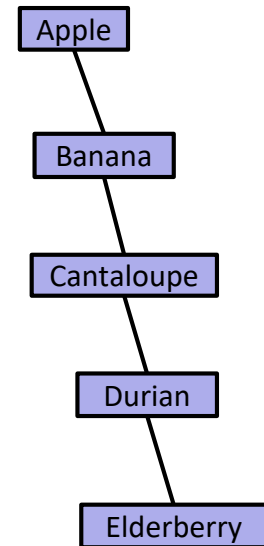
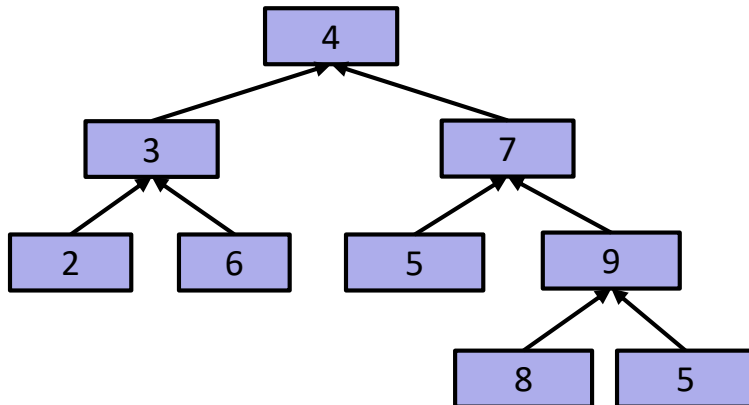
# BST Find/Contains: Iterative

```
boolean contains(BSTNode n,  
                Key k) {  
    while (n != null  
           && n.key != k) {  
        if (k < n.key)  
            n = n.left;  
        else( k > n.key)  
            n = n.right;  
    }  
    if (n == null)  
        return false;  
    return true;  
}
```



# BST Find/Contains's runtime

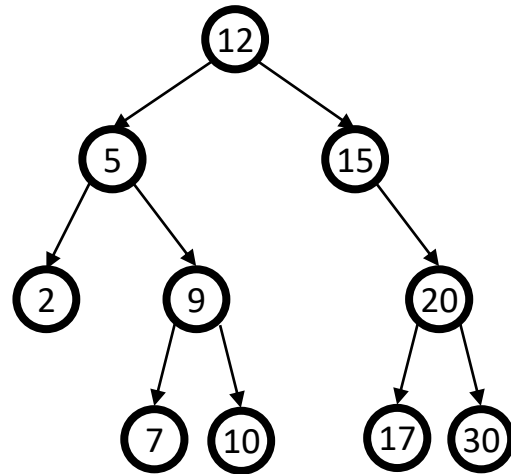
- ❖ What is find's worst-case runtime, as a function of  $n$ ?  $\Theta(n)$
- ❖ What is find's worst-case runtime, as a function of *height*?  $\Theta(h)$



# Other “finding operations”

- ❖ Find *minimum* node
- ❖ Find *maximum* node

```
BSTNode largest(BSTNode n) {  
    while (n.right != null) {  
        n = n.right;  
    }  
    return n;  
}
```



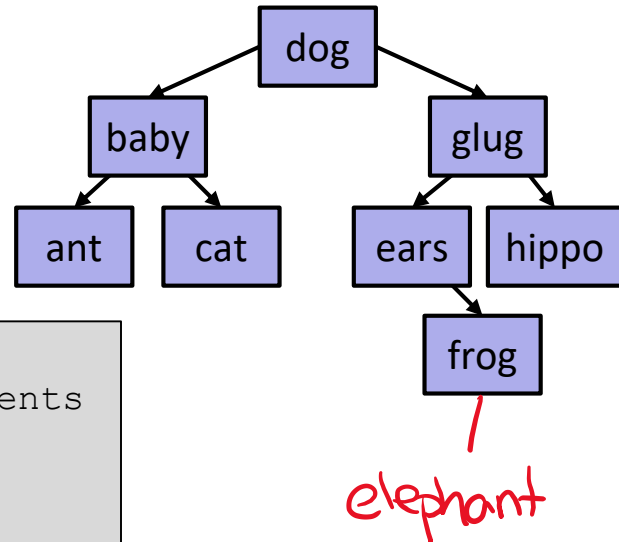


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  - Find/Contains
  - **Add/Remove**

# Binary Search Trees: Add

- ❖ Where does the new item belong?  
*at a leaf!*
- ❖ How do we use BST invariants to ensure the leaf is added correctly?



```

BSTNode add(BSTNode t, Item i) {
    // Implement by putting statements
    // in the correct order
  
```

*D, {B,C}, A*

A

B

C

D

```
return t;
```

```
if (k < i.key) {
    t.left
    = add(t.left, i);
}
```

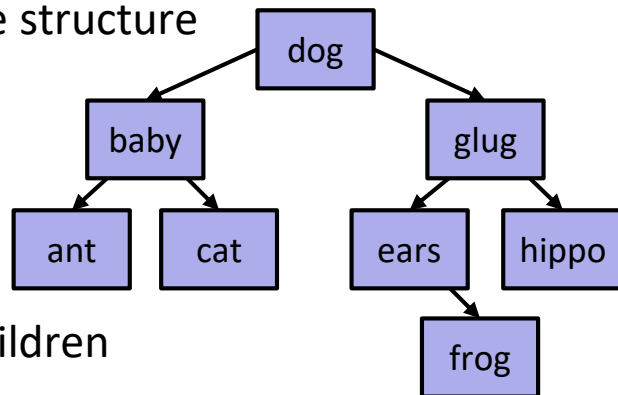
```
if (k > i.key) {
    t.right
    = add(t.right, i);
}
```

```
if (t == null) {
    return
    new BSTNode(i);
}
```

# Binary Search Trees: Remove

- ❖ Removing an item disrupts the tree structure

- **find** the node to be removed
- Remove it
- “Fix” the tree so that it is still a BST



- ❖ 3 cases based on the number of children

1. Node has no children
2. Node has one child
3. Node has two children

- ❖ In each case, we must maintain the **BST Ordering!**

**Reminder:** a dictionary maps *keys* to *values*;  
an *item* or *data* refers to the (key, value) pair

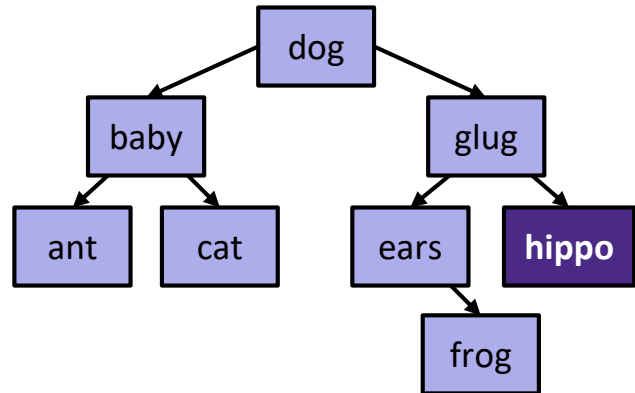
# BST Remove: Case #1: Leaf

❖ Remove the node with the key **hippo**

❖ Runtime?  $\Theta(h)$

```
BSTNode remove(BSTNode n) {
```

```
}
```

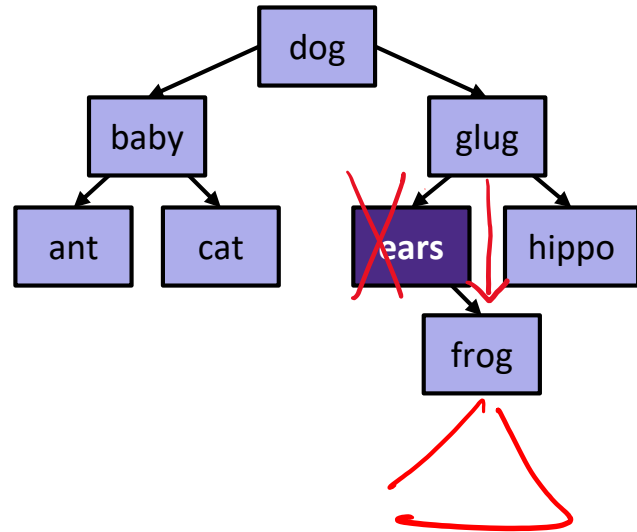


# BST Remove: Case #2: One Child

- ❖ Remove the node with the key **ears**
  - What does the BST invariant say about the descendant's keys?
- ❖ Runtime?  $\Theta(h)$

```
BSTNode remove(BSTNode n) {
```

```
}
```

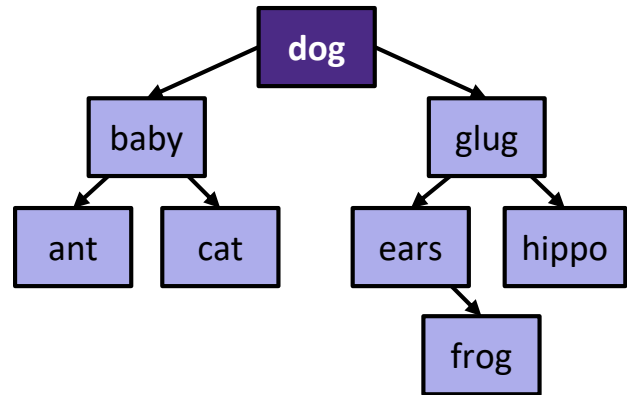


# BST Remove: Case #3: Two Children

❖ Remove the node with the key **dog**

❖ The replacement node's key:

- Must be  $>$  than all keys in left subtree *cat*
- Must be  $<$  than all keys in right subtree *ears*

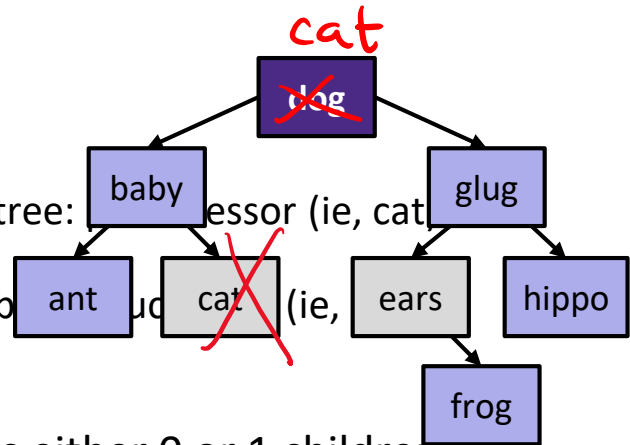


## BST Remove: Case #3: Two Children

- ❖ Remove the node with the key dog

- ❖ The replacement node's key:

- Must be  $>$  than all keys in left subtree: predecessor (ie, cat)
- Must be  $<$  than all keys in right subtree: successor (ie, ears)



- ❖ The predecessor or successor has either 0 or 1 children
  - Why?

# BST Remove: Case #3: Two Children

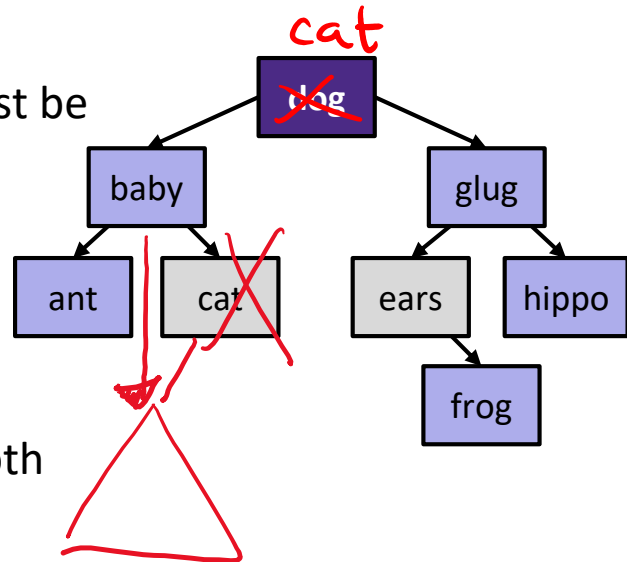
- ❖ Remove the node with the key **dog**

- ❖ The replacement node's key must be

- > all keys in the left subtree (ie, predecessor **cat**), or
- < all keys in the right subtree (ie, successor **ears**)

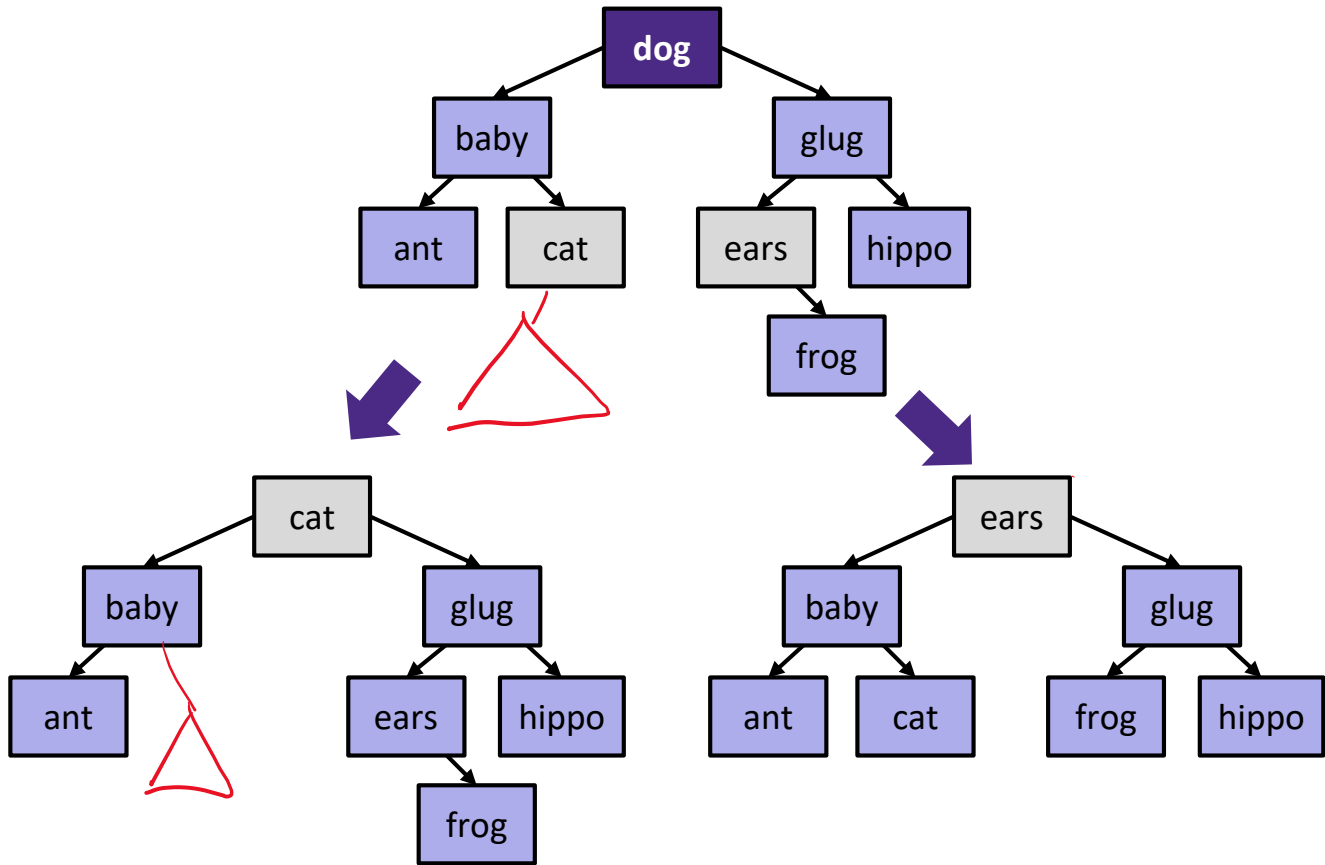
- ❖ The predecessor or successor both have <2 children

- Why?





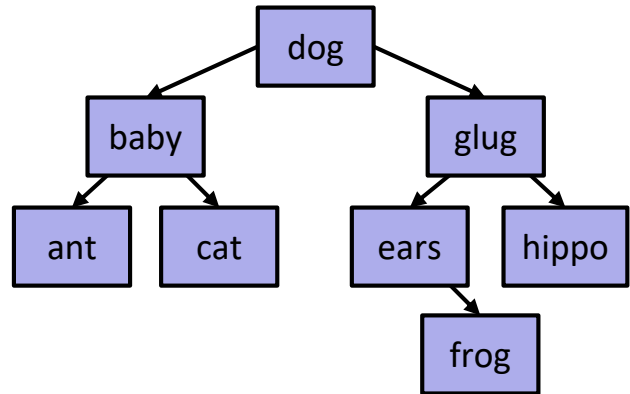
# BST Remove: Case #3: Two Children



## Aside: Finding the largest (or smallest) node

- ❖ The **predecessor** is the largest item in the left subtree
- ❖ The **successor** is the smallest item in the right subtree
- ❖ How do you find the largest (and smallest) item in a tree?
  - Remember that subtrees are trees too

```
BSTNode largest(BSTNode n) {  
    while (n.right != null) {  
        n = n.right;  
    }  
    return n;  
}
```



# BST Summary

- ❖ Binary Search Trees implement both Set and Dictionary ADTs
- ❖ Binary Search Trees are *recursively defined*
- ❖ There is no bound on the BST's height as a function of its size

	LinkedList Dictionary, Worst Case	BST Dictionary, Average Case	BST Dictionary, Worst Case
Find	$\Theta(N)$	$\Theta(h)$ aka $\Theta(\log N)$	$\Theta(h)$ aka $\Theta(N)$
Add	$\Theta(N)$	$\Theta(h)$ aka $\Theta(\log N)$	$\Theta(h)$ aka $\Theta(N)$
Remove	$\Theta(N)$	$\Theta(h)$ aka $\Theta(\log N)$	$\Theta(h)$ aka $\Theta(N)$



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