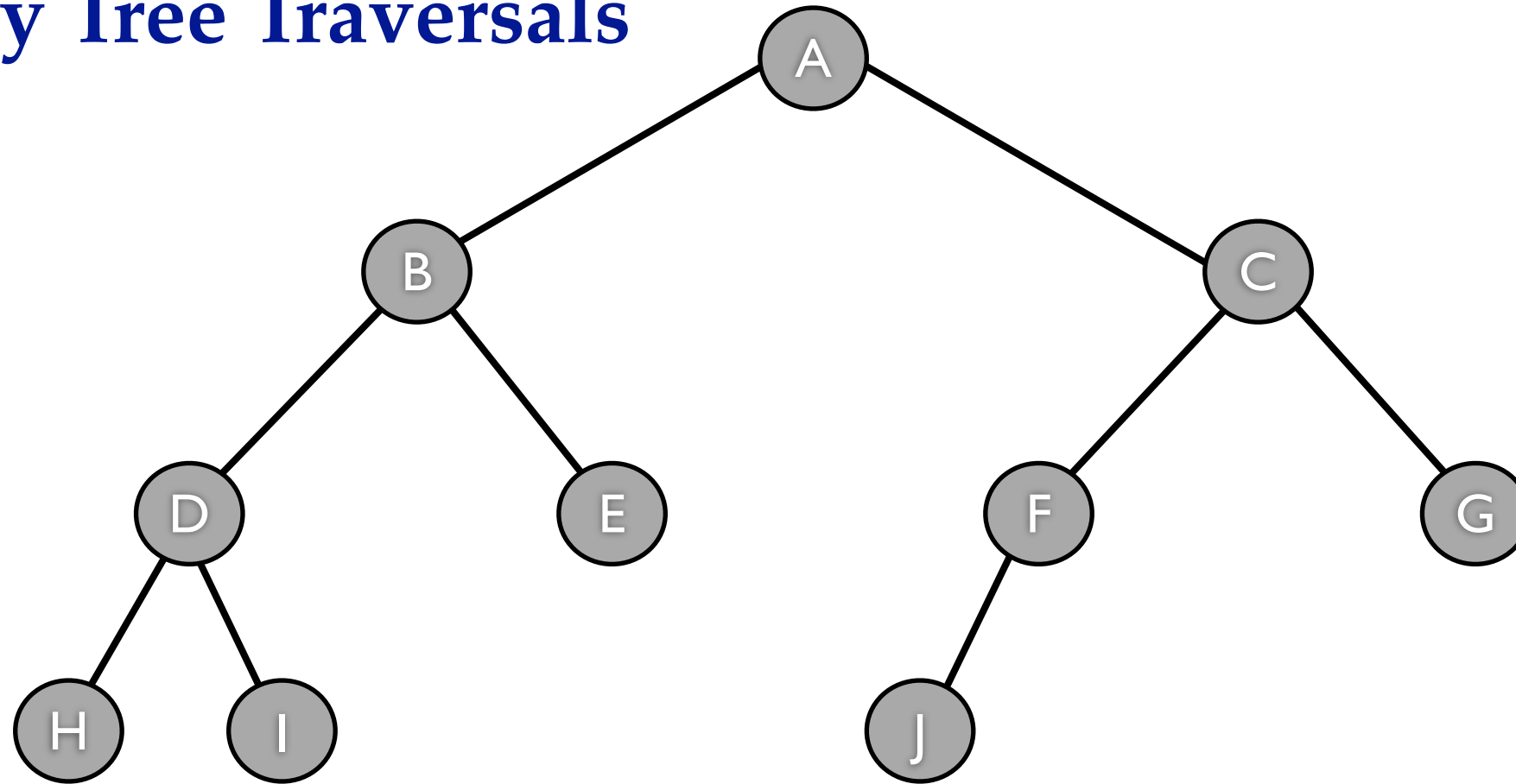


Binary Search Trees

CMSC 420: Lecture 6

Binary Tree Traversals



inorder: HDIBEAJFCG

preorder: ABEHIECFJG

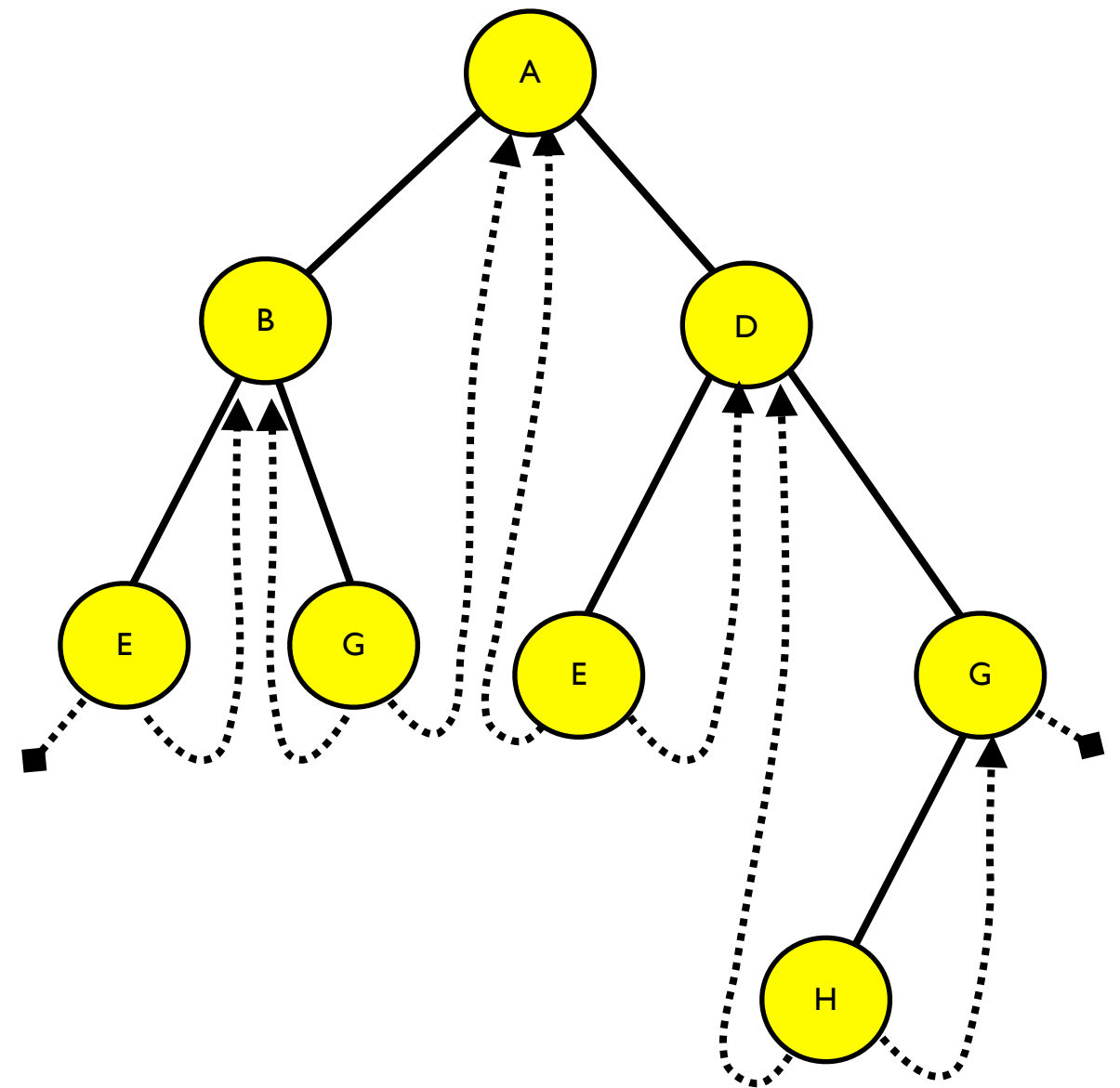
postorder: HIDEBJFGCA

```
void traverse(BinNode *T) {  
    if(T != NULL) {  
        PREORDER(T);  
        traverse(T->left());  
        INORDER(T);  
        traverse(T->right());  
        POSTORDER(T);  
    }  
}
```

How much space is used?

Threaded Trees

- Traversals:
 - Require extra memory, and
 - Must be started from the root
- Use NULL pointers to store in-order predecessors and successors.
- Extra bit associated with each pointer marks whether it is a thread.



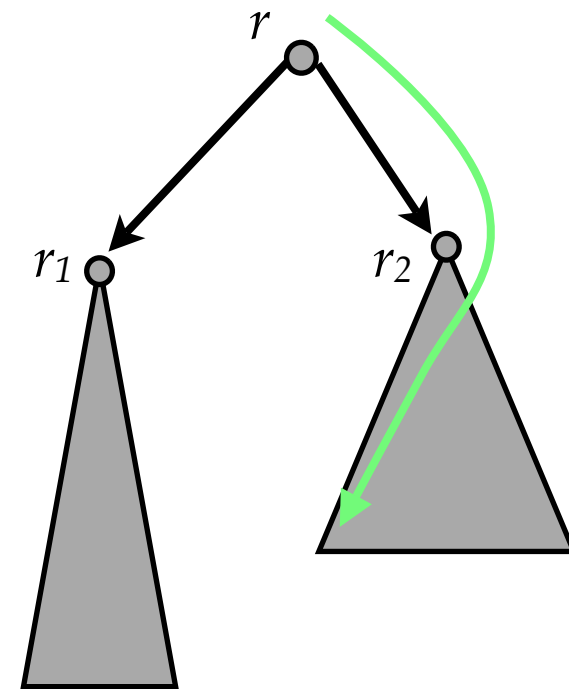
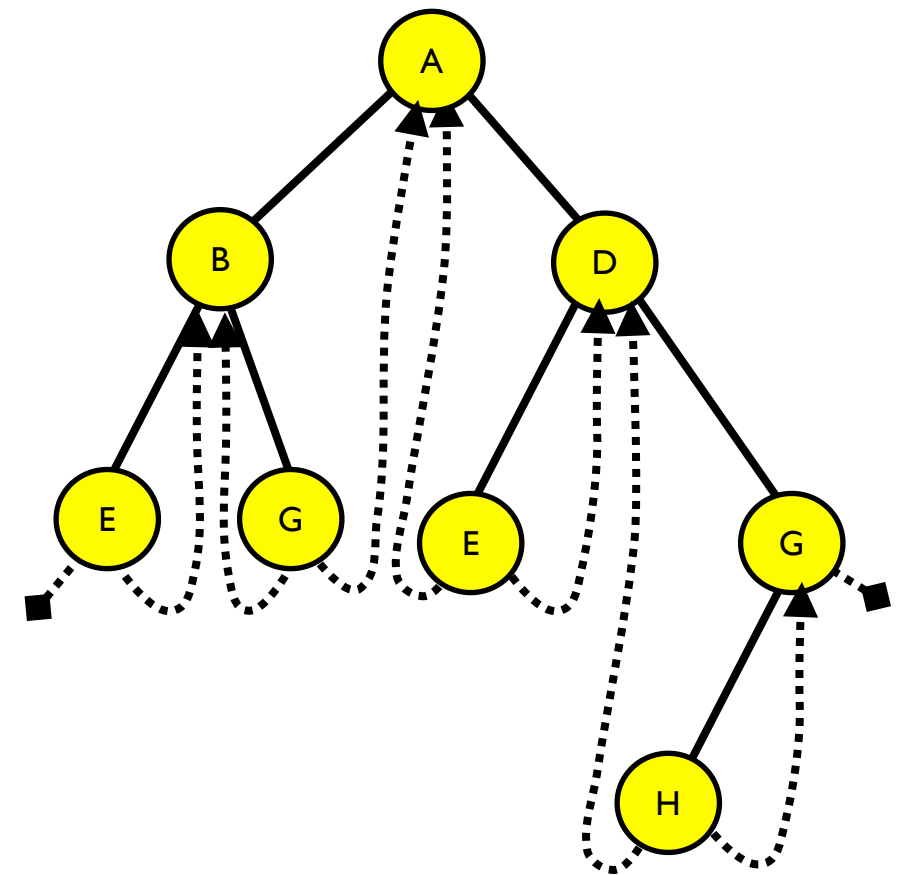
Threaded Trees

```
void inorder_succ(BinNode *T)
{
    BinNode * next = T->right();

    if(!next) return NULL;

    if(!is_thread(T->right))
    {
        while(next->left() &&
              is_thread(next->left())
              ) next = next->left();
    }

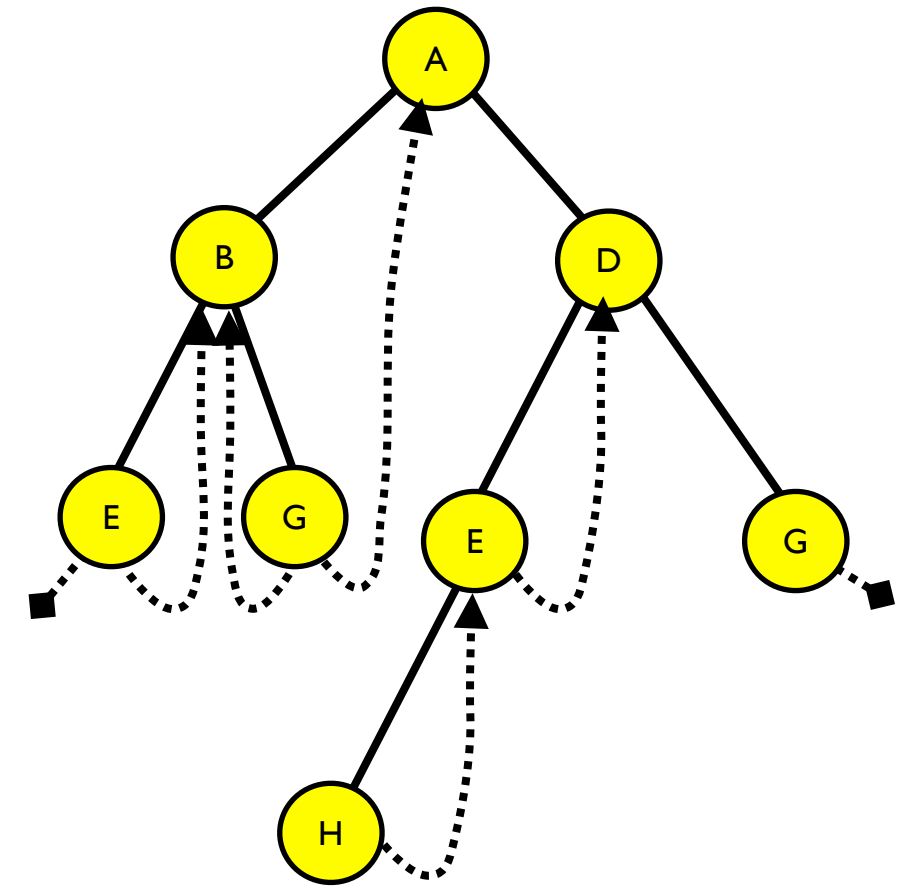
    return next;
}
```



In general, in order
successor = *leftmost*
item in right subtree

Using Threads for Preorder

$\text{preorder_succ}(H)$ = right child of the lowest ancestor of H that both has H in its left subtree and has a right child.



```
void preorder_succ(BinNode *T)
{
    if(T->left() &&
        !is_thread(T->left) return T->left();

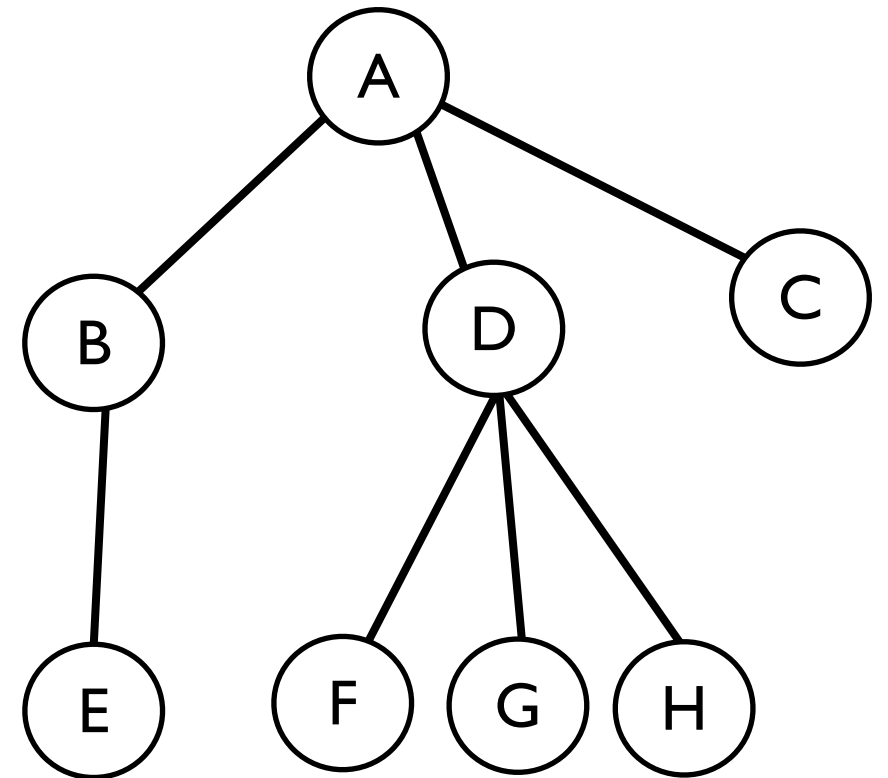
    for(BinNode* next = T->right();
        is_thread(next->right);
        next = next->right()) {}

    return RC(P);    Return right child
}
```

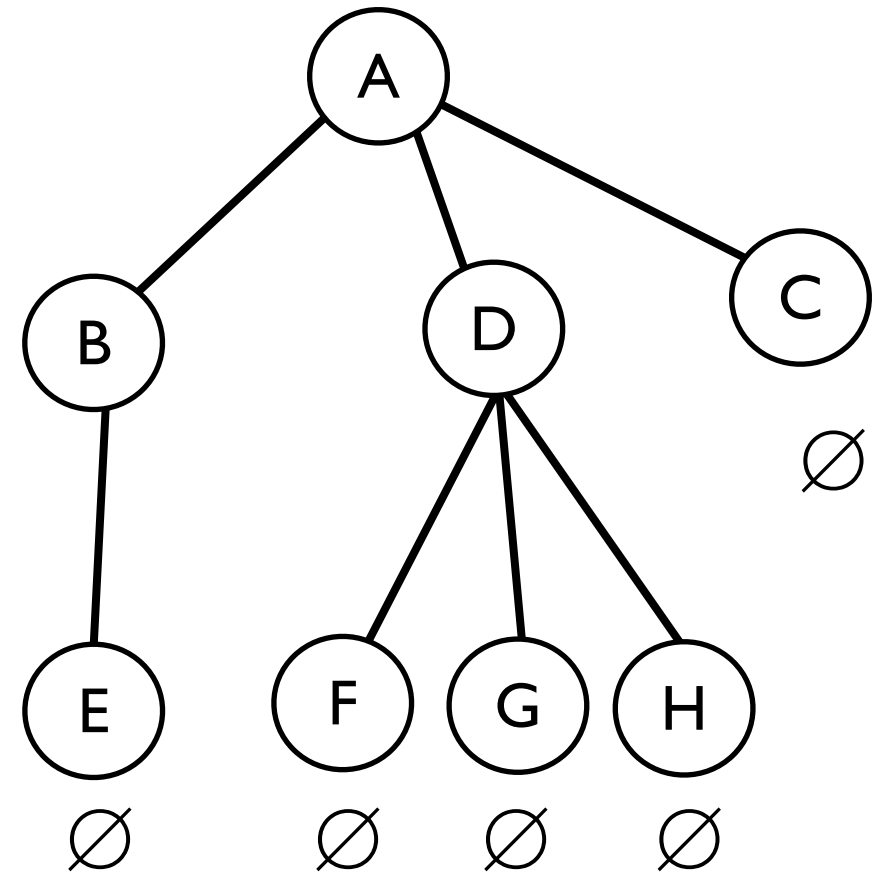
Walk up right
threads

Serializing Trees

- Often want to write trees out to disk in a space efficient way.
- Preorder traversal will let you store the nodes.
 - What's the preorder traversal of this tree?
- Need to encode the structure somehow.



Serializing Trees



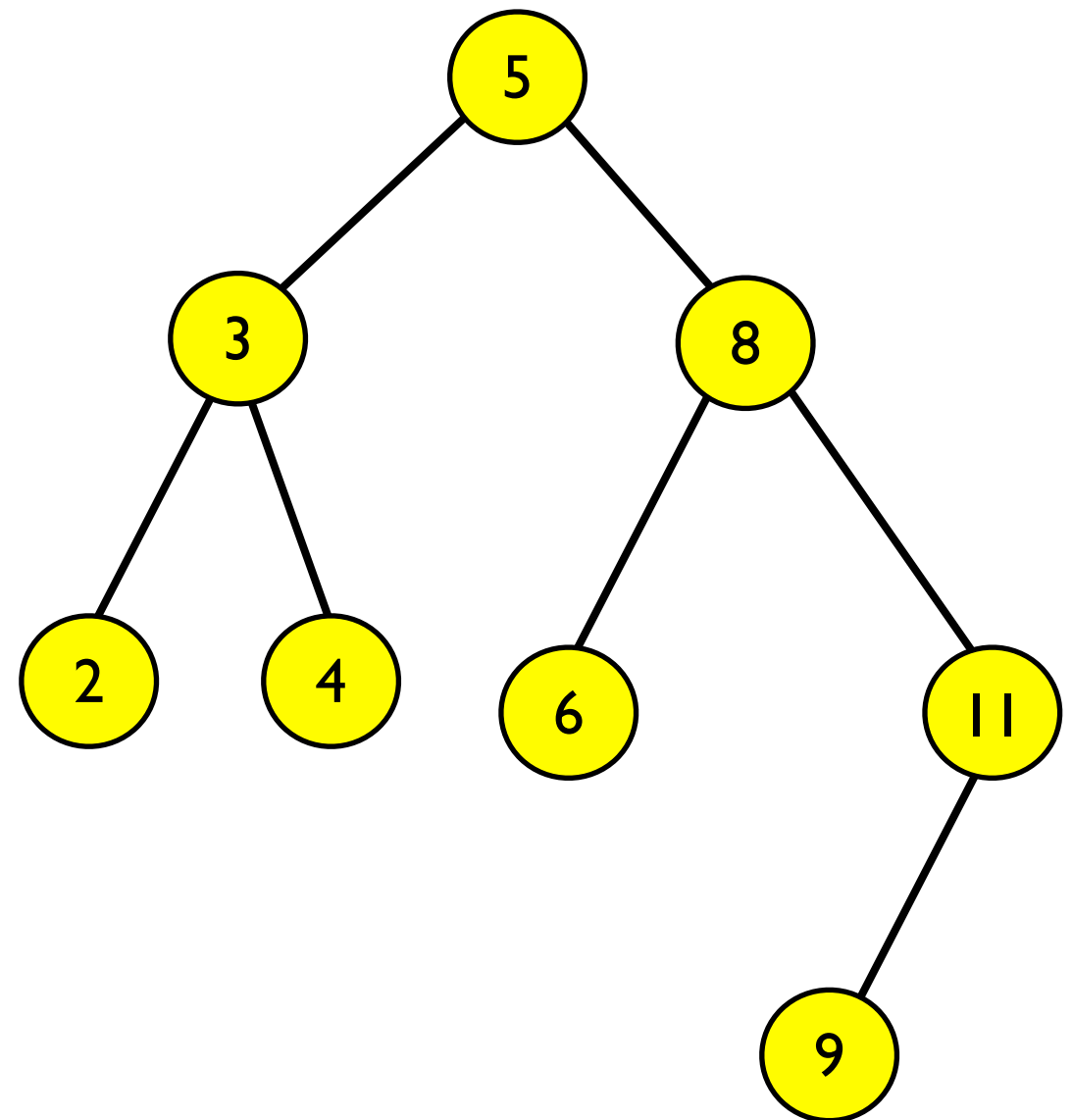
- In preorder traversal, output a mark when you finish processing a node's children.
- Leaves = empty children lists: \emptyset

A B E \emptyset)) D F \emptyset) G \emptyset) H \emptyset)) C \emptyset))
e b f g h d c a

- \emptyset symbols are redundant:
 - ABE))C)D)F)G)H))
- “)” means “go up one level”.

Binary Search Trees

- **BST Property:** If a node has key k then keys in the **left** subtree are $< k$ and keys in the **right** subtree are $> k$.
- We disallow duplicate keys.
- Generalization of the binary search process we saw before:
 - ordering
 - partitioning
 - linking
- Good for implementing the *dictionary ADT* we've already seen: insert, delete, find.



Sorted Set Problem

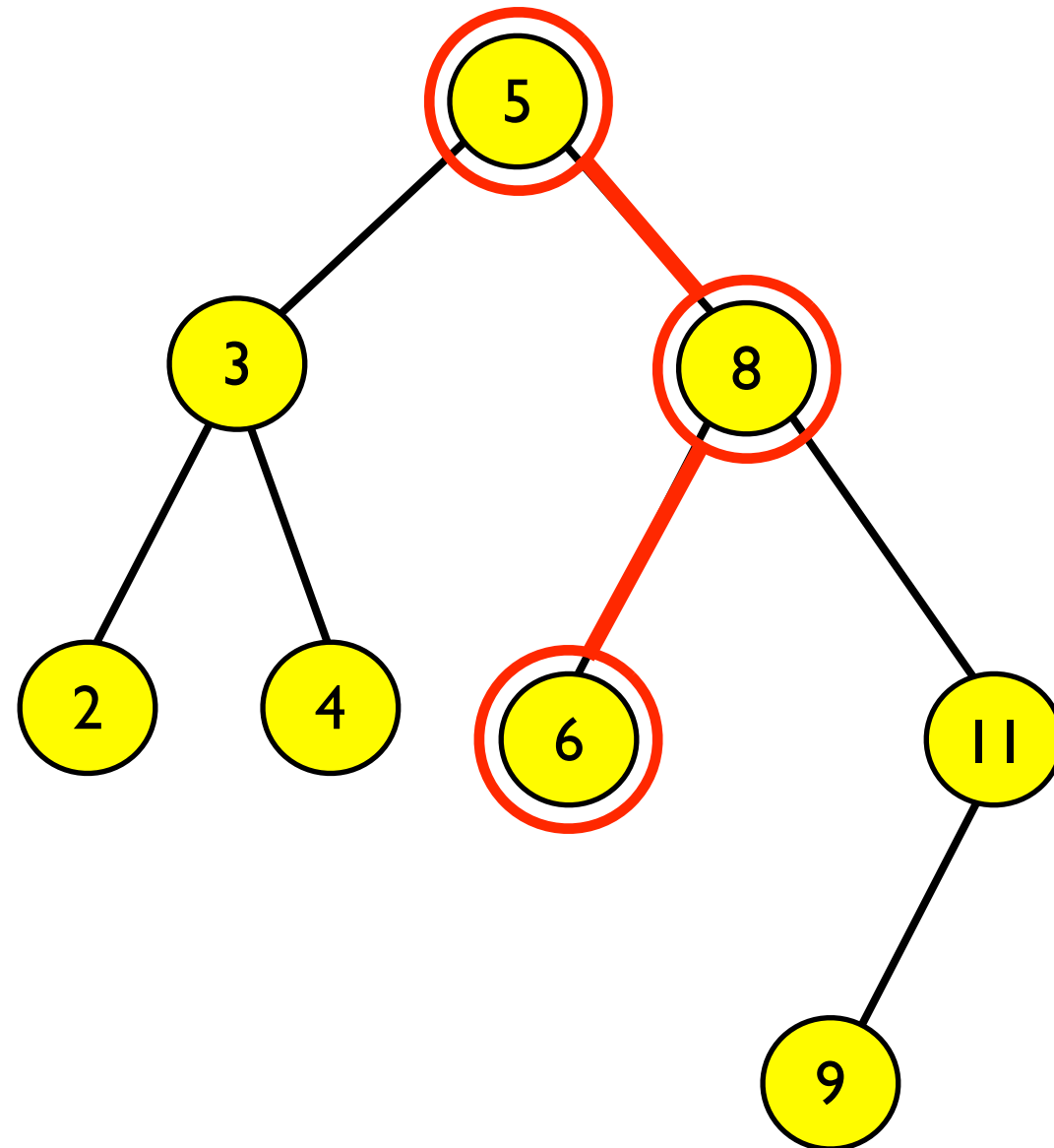
- If keys are *totally ordered*, dictionary ADT is sometimes extended to a “sorted set ADT.”
 - Totally ordered means: for every pair (a,b) either $a < b$ or $b < a$.
 - Operations:
 - $s = \text{make_sorted_set}$
 - $\text{find}(s, k)$ *Dictionary*
 - $\text{insert}(s, k)$ *operations*
 - $\text{delete}(s, k)$
 - $\text{join}(s_1, k, s_2)$: make a new sorted set from $s_1, \{k\}, s_2$; destroy s_1 and s_2 . Assumes every item in $s_1 < k$ and $k < \text{every item in } s_2$.
 - $\text{split}(s, k)$: return 3 new sorted sets: s_1 with items $< k$, $\{k\}$, and s_2 with items $> k$.

BST Find

Find $k = 6$:

Is $k < 5$? No, go right

Is $k < 8$? Yes, go left



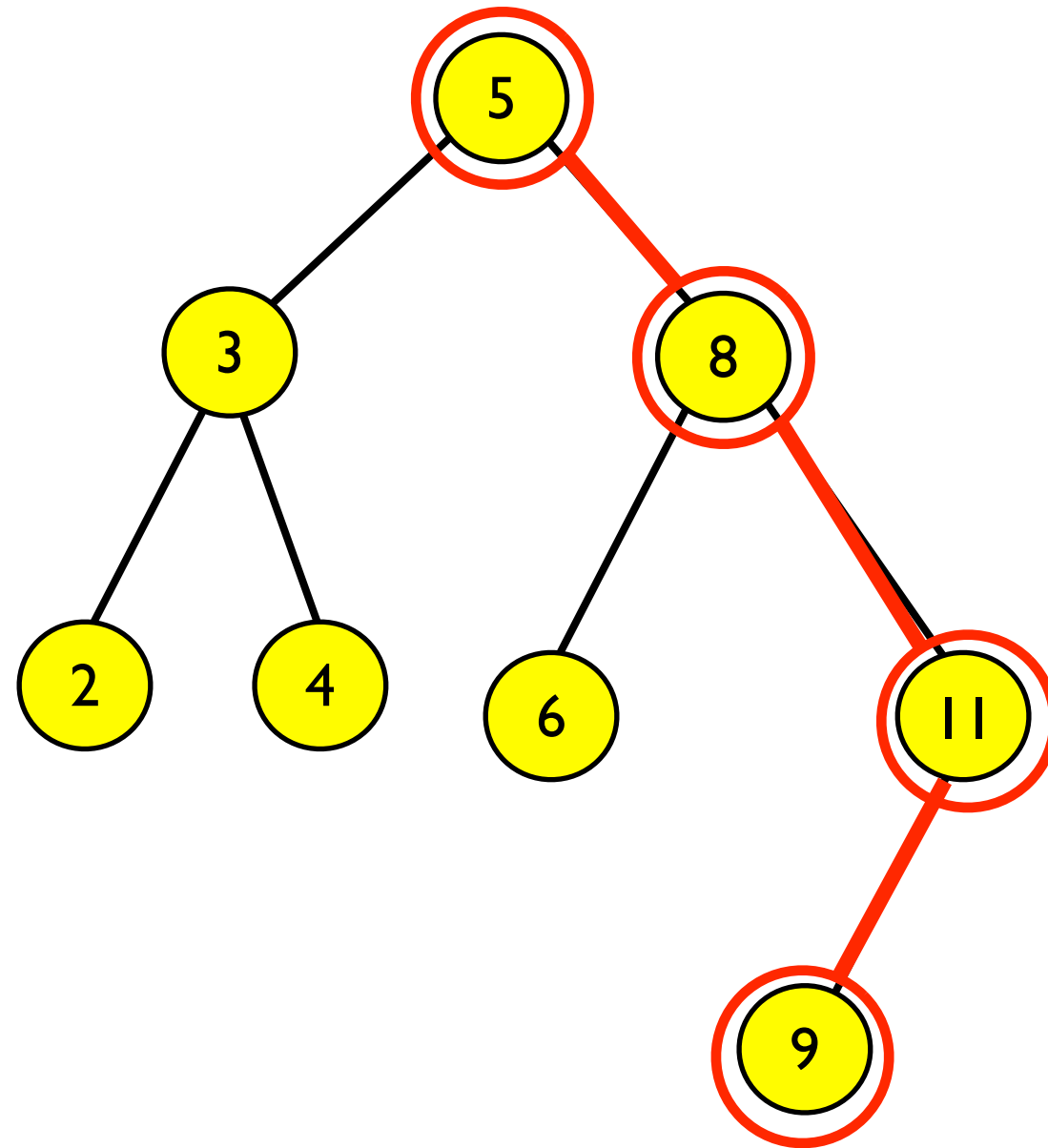
BST Find

Find $k = 9$:

Is $k < 5$? No, go right

Is $k < 8$? No, go right

Is $k < 11$? Yes, go left



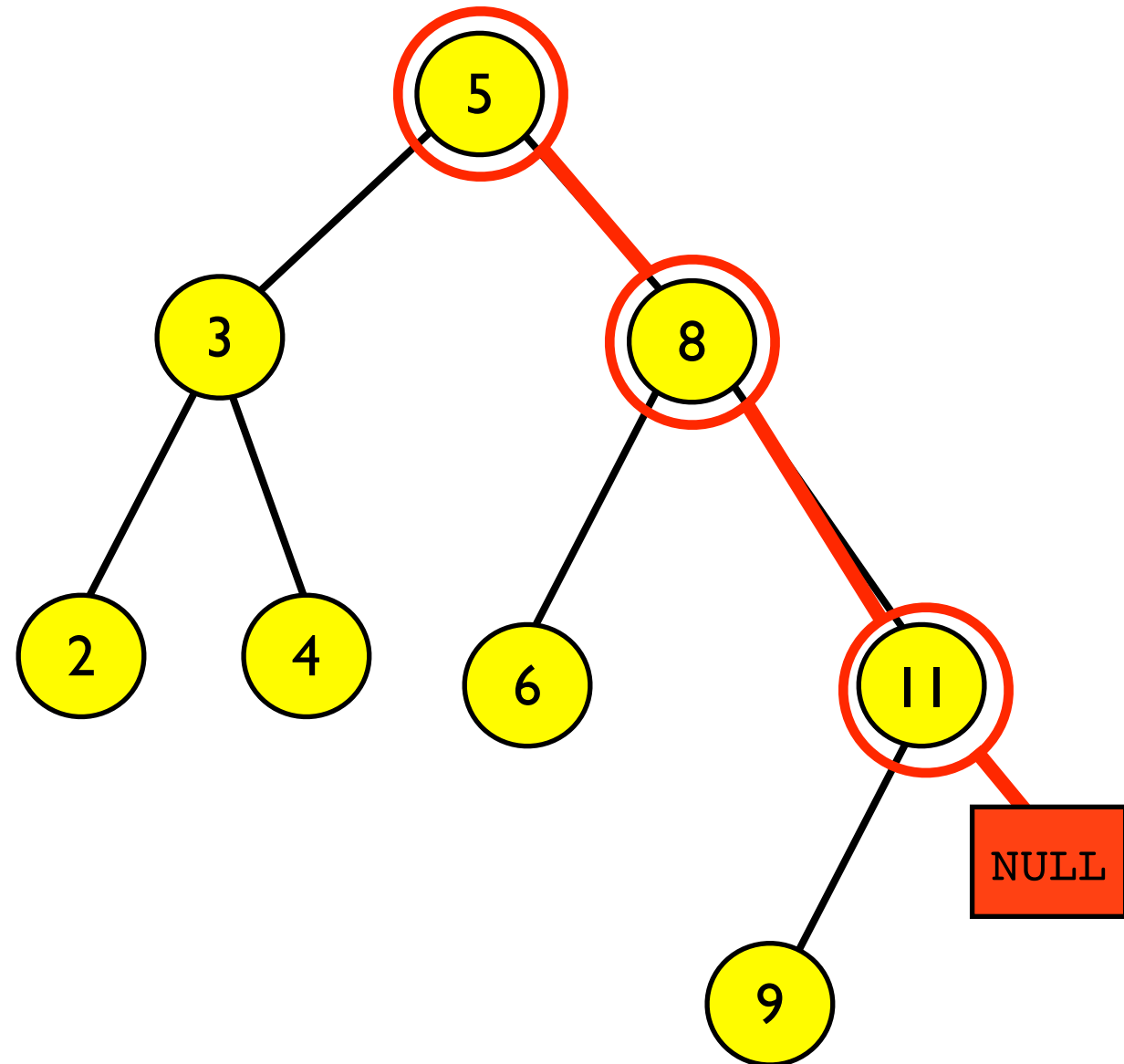
BST Find

Find $k = 13$:

Is $k < 5$? No, go right

Is $k < 8$? No, go right

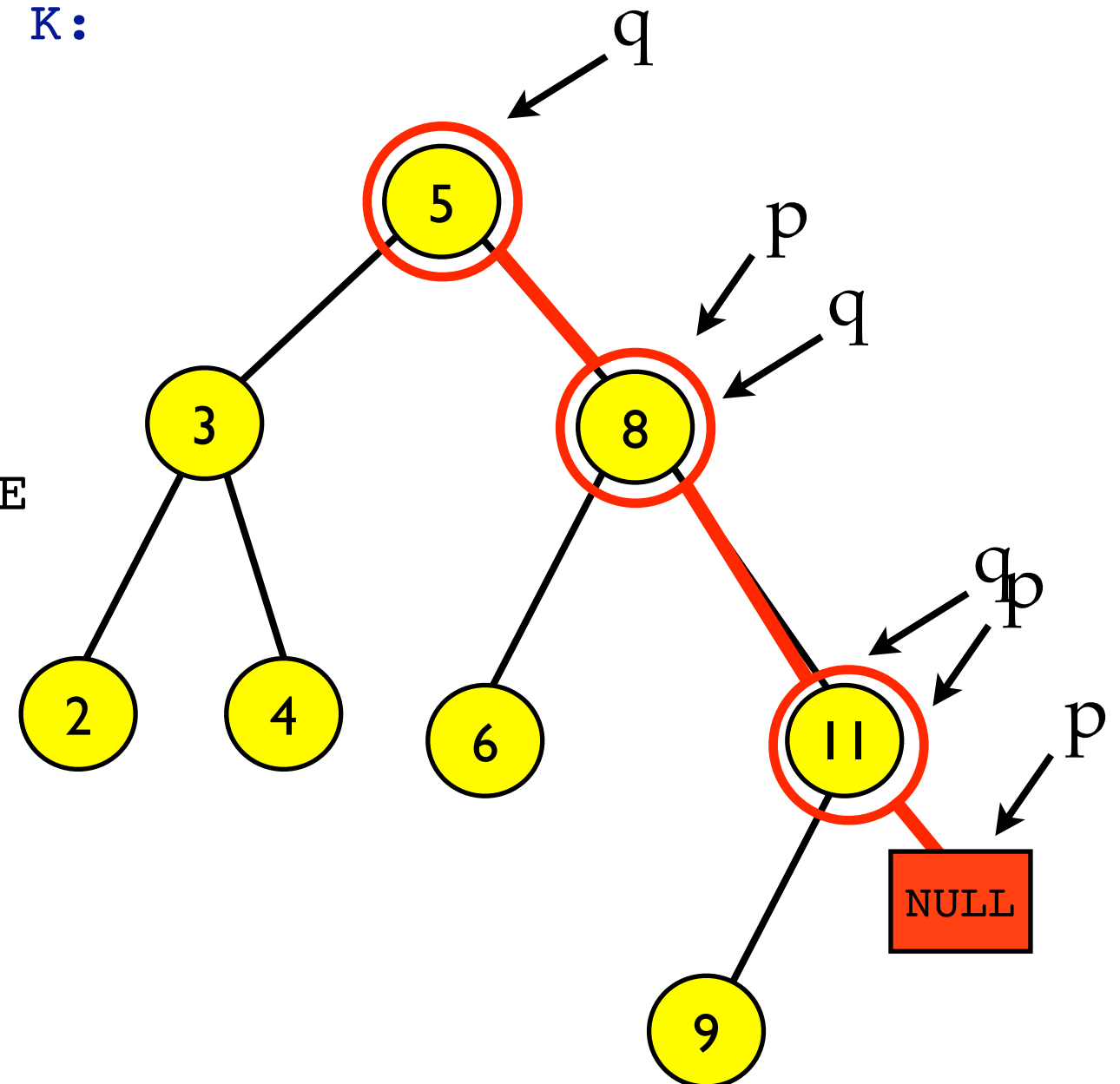
Is $k < 11$? No, go right



BST Insert

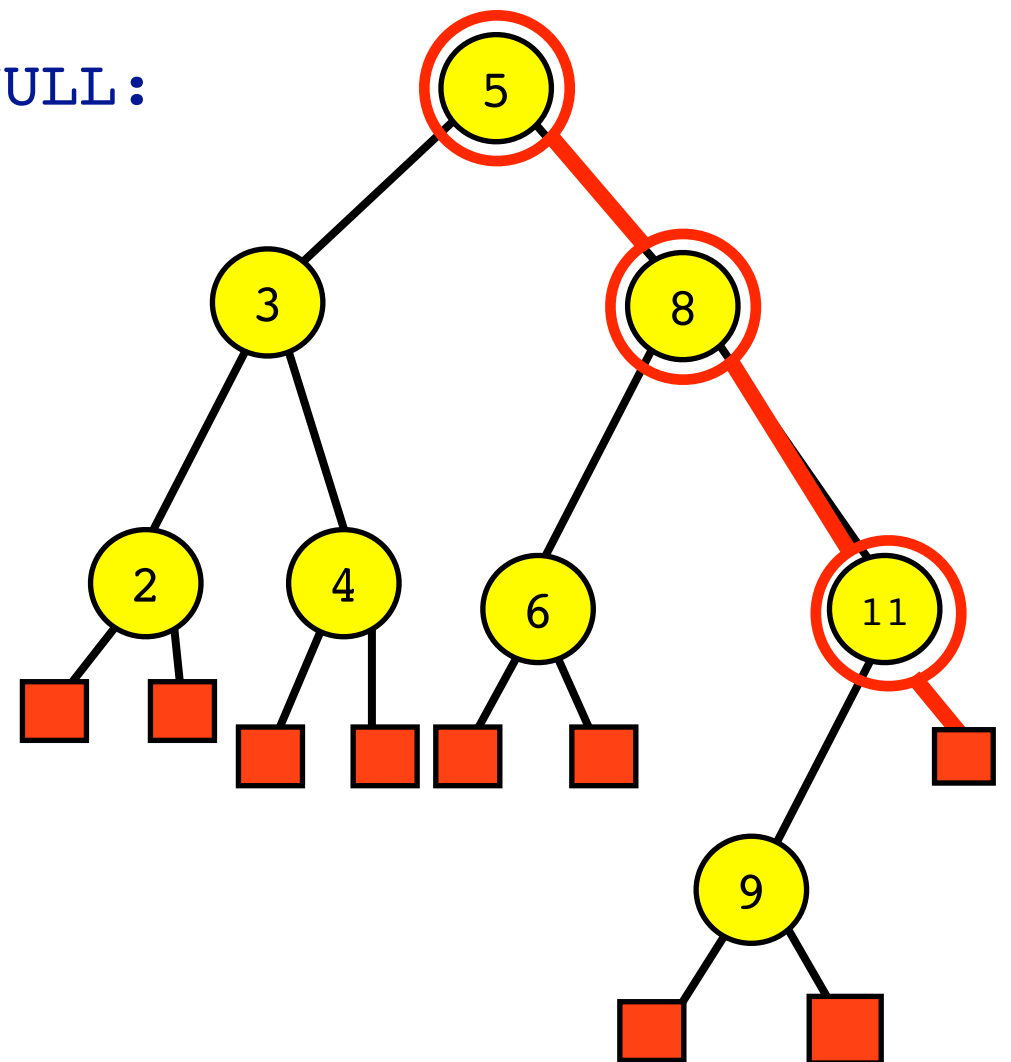
```
insert(T, K):  
  q = NULL  
  p = T  
  while p != NULL and p.key != K:  
    q = p  
    if p.key < K:  
      p = p.left  
    else if p.key > K:  
      p = p.right  
  
  if p != NULL: error DUPLICATE  
  
  N = new Node(K)  
  if q.data > K:  
    q.left = N  
  else:  
    q.right = N
```

← *Same idea as BST Find*

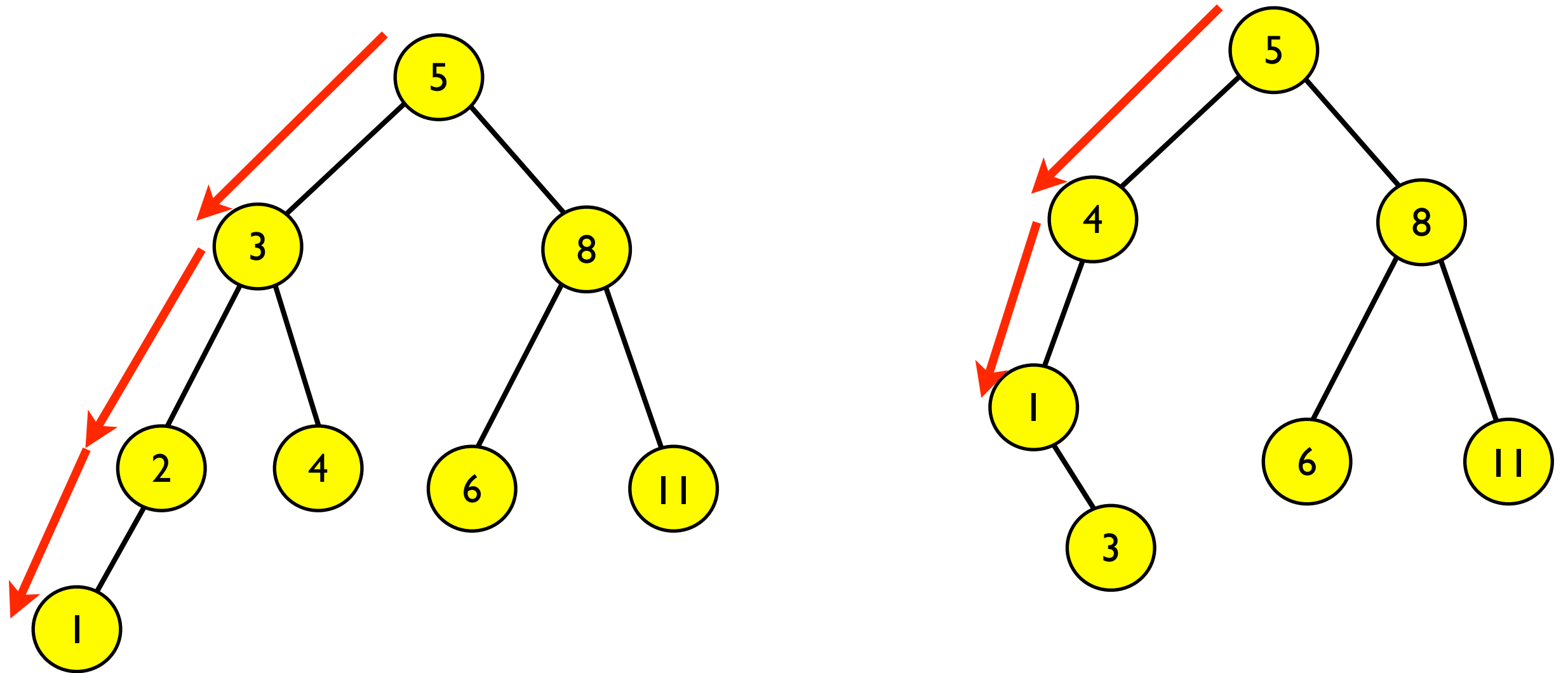


BST Insert with Extended Binary Trees

```
insert(T, K):  
  if T == NULL:  
    T = new_node(K)  
    T.left = new_external_node()  
    T.right = new_external_node()  
  else  
    p = T  
    while p.key != K and p.left != NULL:  
      if p.key < K:  
        p = p.left  
      else if p.key > K:  
        p = p.right  
  
    if p.left != NULL:  
      error DUPLICATE  
  
  p.key = K  
  p.left = new_external_node()  
  p.right = new_external_node()
```



BST FindMin

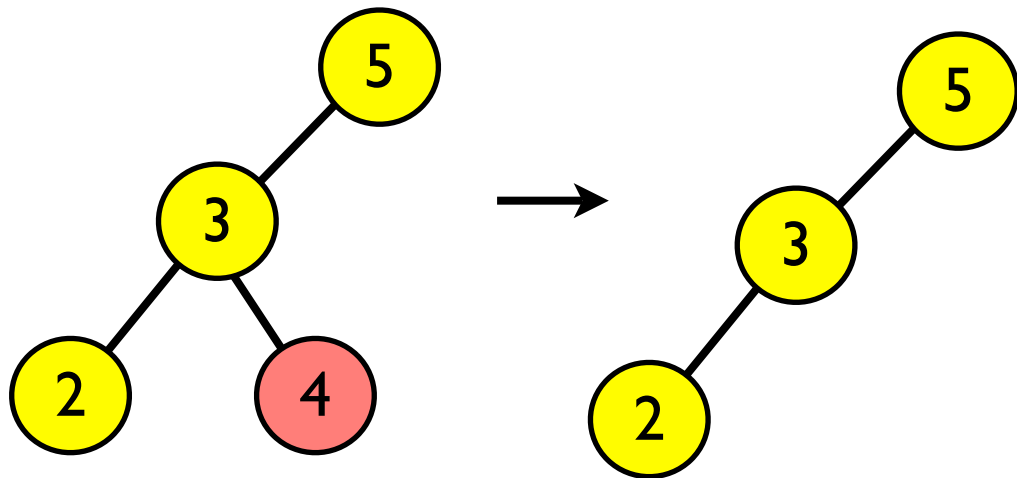


Walk left until you can't go left any more

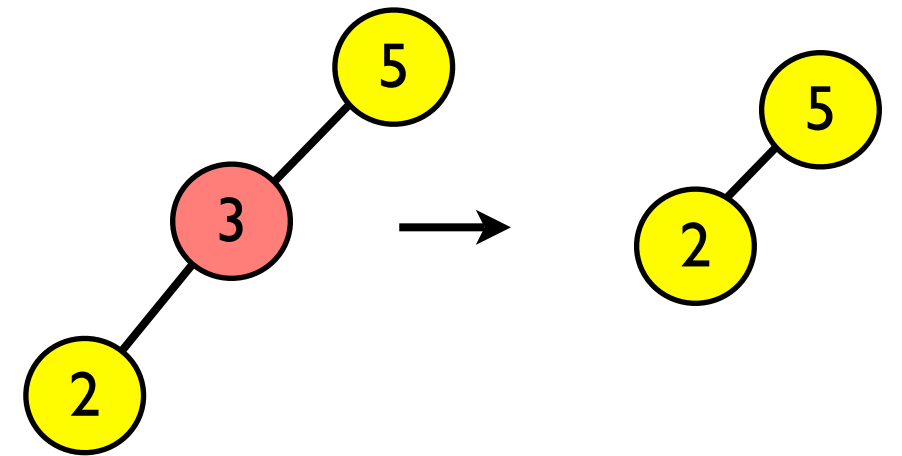
Can you express `inorder_successor` using `find_min`?

BST Delete

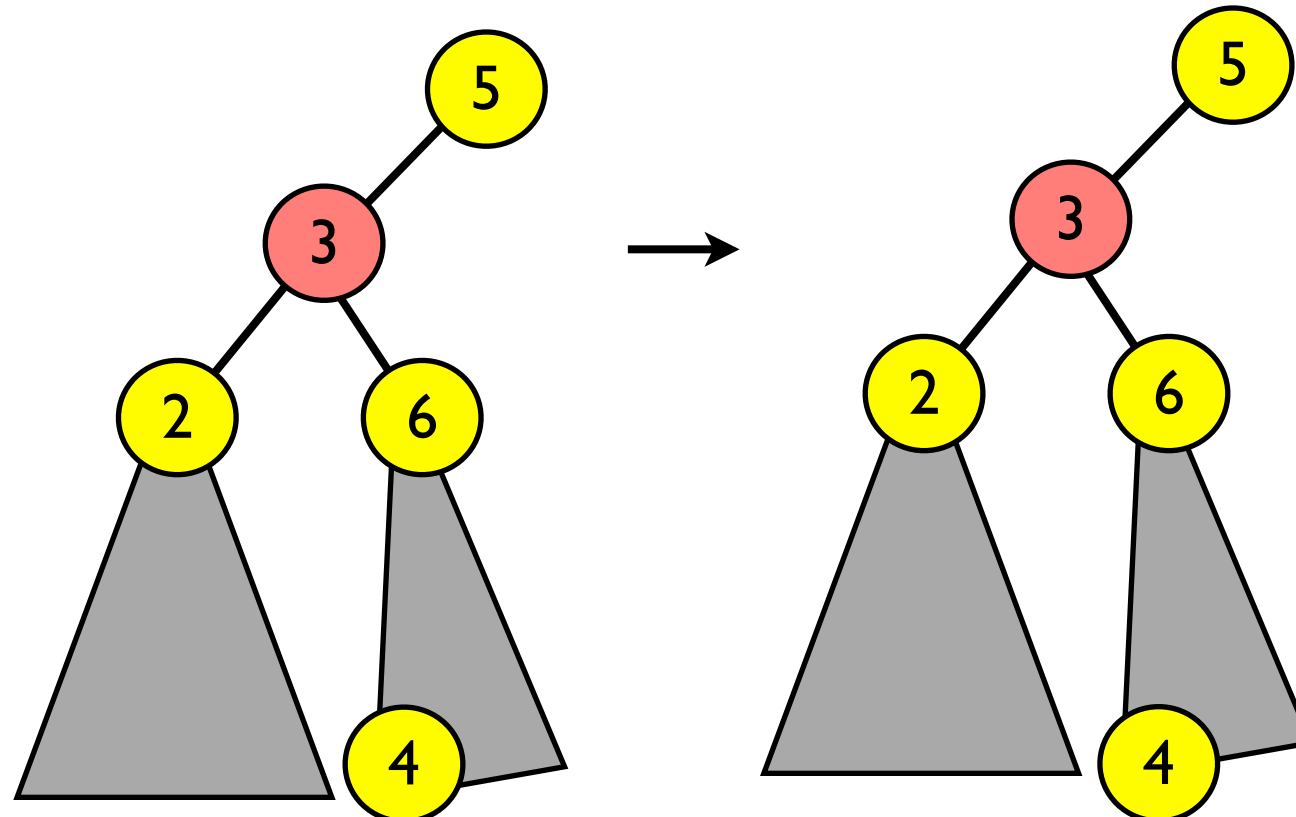
Node is leaf:



Node has 1 child:



Node has 2 children:

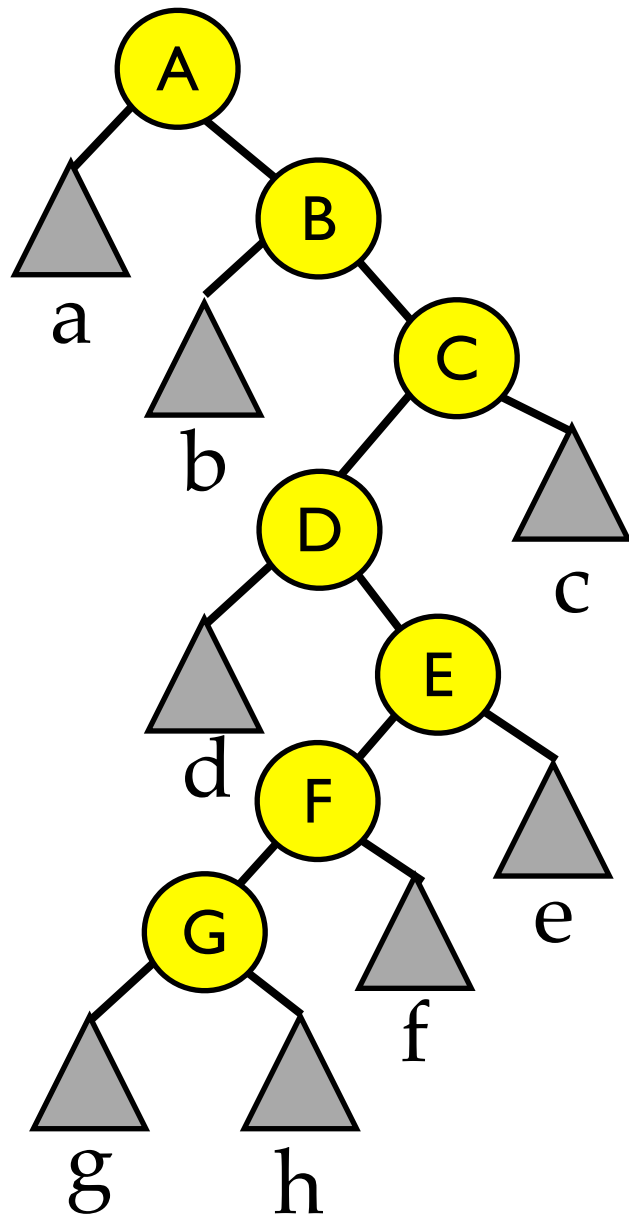


Python Implementation of BST

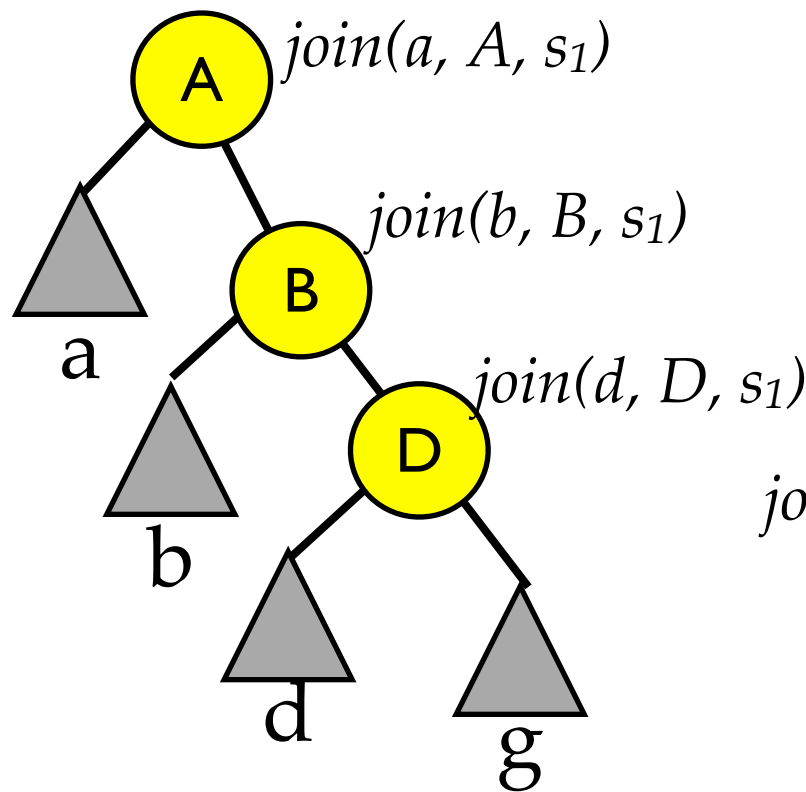
How would you implement join and split?

Split(G)

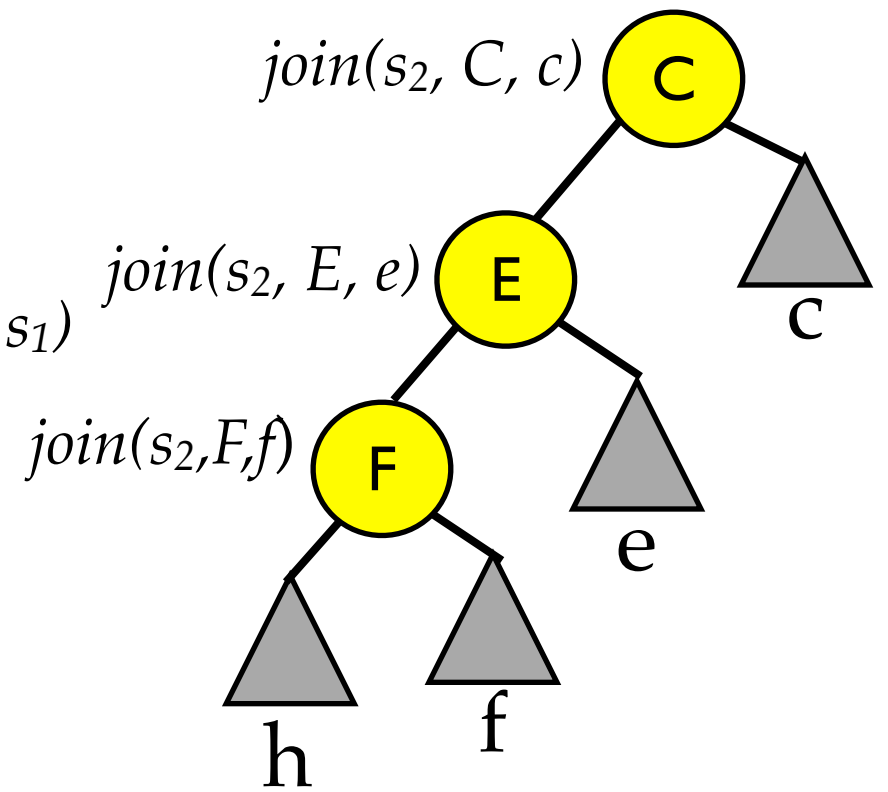
$i = \textcircled{G}$



Letters represent
labels not keys



S_1



S_2

- What's the worst possible insertion order?
- What's the best possible insertion order?

Expected Path Length of Random BST

- Suppose the keys $k_1, k_2, k_3, \dots, k_n$ are inserted in a random order (every permutation equally likely).
- What is the expected path length to a node in the BST built by inserting these keys?
- **Idea:** consider the leftmost path as a representative path.
- New key k_i added to left-most path when it is the smallest encountered so far ($k_i < k_j$ for $j < i$).
- In a random permutation, how often does the minimum change?
[This is the length of the leftmost path]

Expected Path Length of Random BST

$$k_1, k_2, k_3, k_4, k_5, k_6, k_7, k_8$$

- What's the probability that k_i is the smallest so far?
- $\Pr[k_i \text{ is smallest among } k_1, \dots, k_i] = 1/i$
- Why?
- In a random permutation of k_1, \dots, k_i , the minimum is equally likely to be in any one of the i positions.
- Probability it is in the last position = $1/i$.

Expected Path Length of Random BST

keys = $k_1, k_2, k_3, k_4, k_5, k_6, k_7, k_8$

random variables = $x_1, x_2, x_3, x_4, x_5, x_6, x_7, x_8$

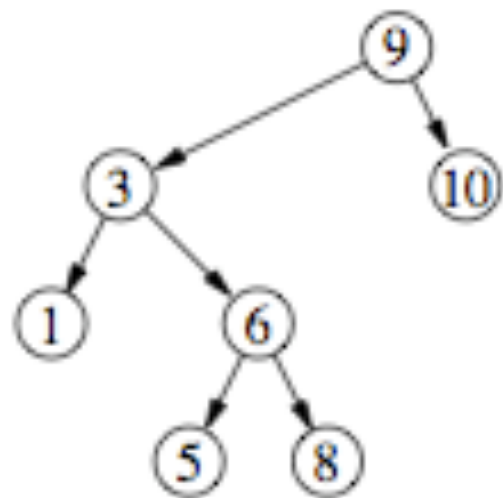
$x_i = 1$ if k_i is smallest among k_1, \dots, k_i

0 otherwise

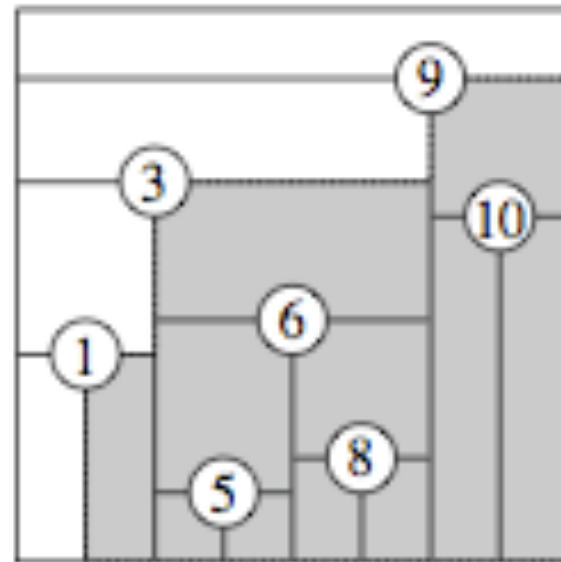
- sum of $x_i =$ length of leftmost path.
- Expected length = $E[\sum x_i] = \sum E[x_i]$
 $= \sum [(1/i)1 + 0(1-1/i)]$
 $= \sum (1/i) = H_n = O(\log n)$

Expected Path Length of Random BST

Insertion order: 9 3 10 6 1 8 5

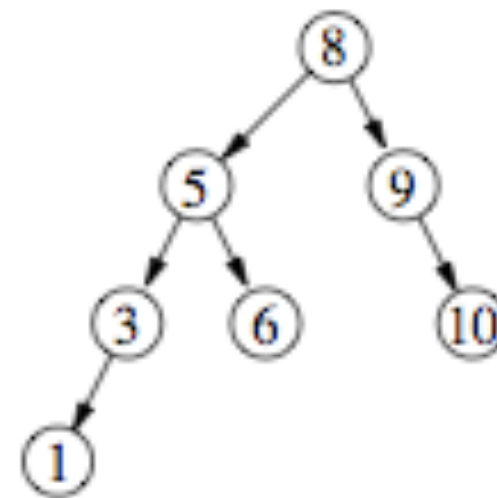


Left chain has 3 nodes



Minimum changes 3 times

Insertion order: 8 9 5 10 3 6 1



Left chain has 4 nodes



Minimum changes 4 times

Optimal Static BSTs – Cost of trees

$k_1, k_2, k_3, k_4, k_5, k_6, k_7, k_8$
 $p_1, p_2, p_3, p_4, p_5, p_6, p_7, p_8$

- Define the cost of a tree built on keys k_j, \dots, k_m :

$$C(T) = \sum_{i=1}^m p_i (\text{Depth}(T, k_i) + 1)$$

*Why is it
Depth + 1?*

- **T** is **optimal** if **C(T)** is smallest among any possible **T** containing the same keys.
- **C(T)** = expected cost of searching for a key in **T**.

Subtrees of optimal tree are optimal trees

- **Goal:** find tree that minimizes $C(T)$.
- **Claim:** every subtree of optimal tree is optimal.
- **Proof:** Let T be an optimal tree on k_j, \dots, k_m , with root = k_r ($j \leq r \leq m$)

$$C(T) = p_r + \sum_{i=j}^{r-1} p_i (\text{Depth}(T, k_i) + 1) + \sum_{i=r+1}^m p_i (\text{Depth}(T, k_i) + 1)$$

$$\sum_{i=j}^{r-1} p_i + \sum_{i=j}^{r-1} p_i \text{Depth}(T, k_i) \qquad \sum_{i=j}^{r-1} p_i + \sum_{i=j}^{r-1} p_i \text{Depth}(T, k_i)$$

$C(T_{\text{left}})$ $C(T_{\text{right}})$

$$C(T) = \sum_{i=j}^m p_i + C(T_{\text{left}}) + C(T_{\text{right}})$$

So,

$$C(T) = \sum_{i=j}^m p_i + C(T_{left}) + C(T_{right})$$

- If there were a lower cost T_{left} or T_{right} we could reduce the total cost of T , contradicting that T is optimal.
- Hence, T_{left} and T_{right} must be optimal.

Dynamic Programming to Find OPT Tree

$$C[j, m] = \begin{cases} 0 & \text{if } m < j \text{ (tree is empty)} \\ p_j & \text{if } j = m \text{ (tree is single node)} \\ \sum_{i=j}^m p_i + \min_r \{ C[j, r-1] + C[r+1, m] \} & \text{if } j < m \end{cases}$$

$$\begin{array}{ccccccc} k_2, & k_3, & k_4, & k_5, & k_6, & k_7, & k_8 \\ \uparrow & \uparrow & & & & & \uparrow \\ j & r & & & & & m \end{array}$$

So: if you fill in the $C[j, m]$ table from in order of increasing $m-j$, you'll always have the value of $C[j, m]$ computed when you need it.

*Dynamic
Programming*

The chosen values of r partition the nodes and give you the optimal tree structure.

