

**CSC263H**

**Data Structures and Analysis**

**Prof. Bahar Aameri & Prof. Marsha Chechik**

Winter 2024 – Week 3

## ADT: Dictionaries

### Dictionary ADT:

- **Objects:** A collection of **key-value pairs** (keys are *unique*).
- **Operations:**
  - ***Search*( $D, k$ )**: return  $x$  in  $D$  s.t.  $x.key = k$ , or NIL if no such  $x$  is in  $D$ .
  - ***Insert*( $D, x$ )**: insert  $x$  in  $D$ ; if some  $y$  in  $D$  has  $y.key$  equal to  $x.key$ , replace  $y$  by  $x$ .
  - ***Delete*( $D, x$ )**: remove  $x$  from  $D$ .

**Note:**  $k$  is a key,  $x$  is a node.

## Data Structures for Dictionaries: Lists

### Unsorted List:

- $\text{Search}(D, k)$ :  $\Theta(n)$
- $\text{Insert}(D, x)$ :  $\Theta(1)$
- $\text{Delete}(D, x)$ :  $\Theta(n)$

## Data Structures for Dictionaries: Lists

### Sorted List (by keys):

- $\text{Search}(D, k)$ :  $\Theta(\log n)$
- $\text{Insert}(D, x)$ :  $\Theta(n)$
- $\text{Delete}(D, x)$ :  $\Theta(n)$

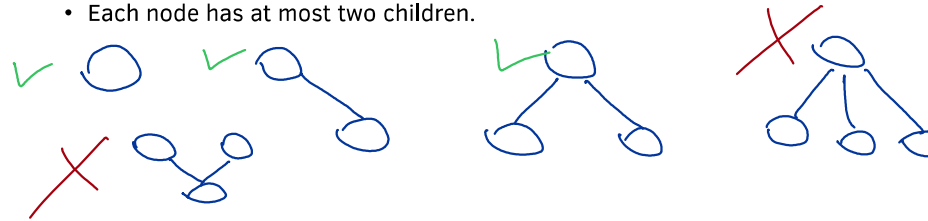
## Data Structures for Dictionaries: Lists

- Searching the list randomly is slow and sub-optimal.
- Using binary search on a sorted list, we can reduce the run-time of the search to  $\mathcal{O}(\log n)$ .
- Is there a data structure that stores and organizes keys in a dictionary in such a way?

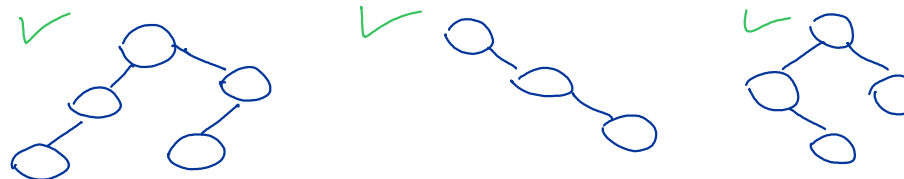
## Properties of Binary Search Trees (BSTs)

**Binary Search Tree (BST):** A binary tree that satisfies the binary search tree property: for every node  $x$ ,  $x.key$  is **greater than** every key in **left sub-tree** of  $x$ , and  $x.key$  is **less than** every key in **right sub-tree** of  $x$ .

- Each node has at most two children.

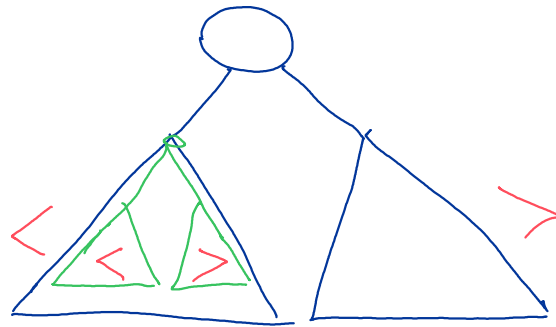


- Nodes don't have to be full, unlike binary heaps.



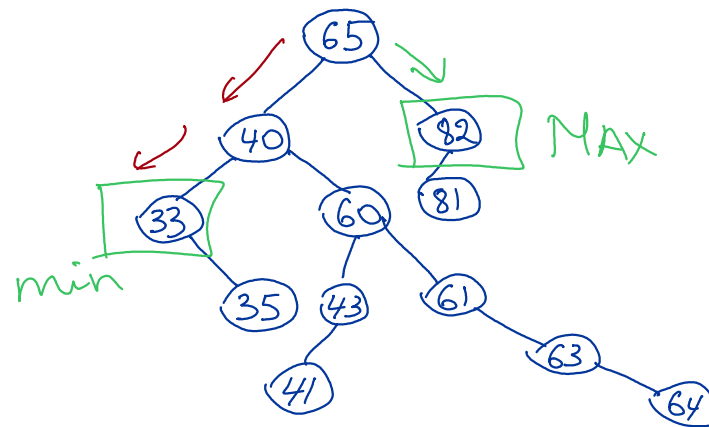
## Properties of Binary Search Trees (BSTs)

BST property is recursive!



## Properties of Binary Search Trees (BSTs)

- **Minimum** value of a BST: **left-most** node with no left child
- **Maximum** value of a BST: **right-most** node with no right child





## Properties of Binary Search Trees (BSTs)

Information at each node  $x$ :

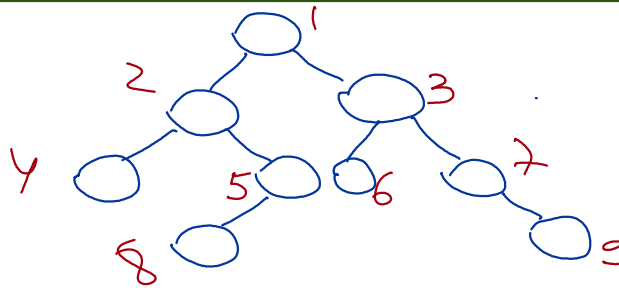
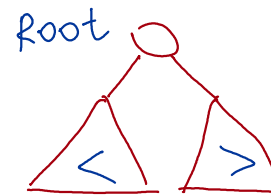
- $x.key$ : the key
- $x.left$ : the left child (node)
- $x.right$ : the right child (node)
- $x.p$ : the parent (node)

## Properties of Binary Search Trees (BSTs)

Because of BST property, we can say that the keys in a BST are **sorted**.

How to obtain a **sorted list** from a BST?

- Inorder traversal (Depth First: Left, Root, Right)
- Preorder traversal (Depth First: Root, Left, Right)
- Postorder traversal (Depth First: Left, Right, Root)
- Level-by-level traversal (Breadth-First)



## BSTs: Inorder Traversal

*InorderTraversal(x):* ← passing a tree by passing its root node  
# print all keys in BST rooted at x in ascending order

if  $x \neq \text{NIL}$   
    InorderTraversal ( $x.\text{left}$ )  
    Print ( $x.\text{key}$ )  
    InorderTraversal ( $x.\text{right}$ )

**Worst-case Running Time:**

$\Theta(n)$

## BSTs: Finding Minimum

*BSTMin*(*x*): Return the node with the minimum key in the tree rooted at *x*.

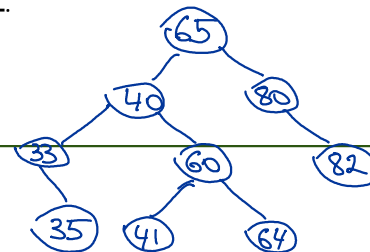
*BSTMin*(*x*):

1. Start from the *x*.
2. keep going **left**, until the left child is **NIL**.
3. **return** the final node.

**Worst-case Running Time:**

$\Theta(n)$

*BSTMin*(*x*):  
1 **while** *x*.left  $\neq$  NIL:  
2     *x* = *x*.left,  
3 **return** *x*



## BSTs: Search

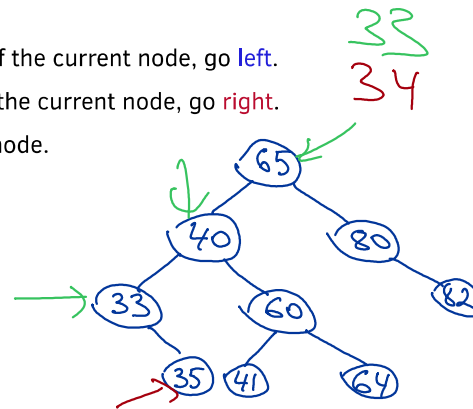
$\text{Search}(D, k)$ : return  $x$  in  $D$  s.t.  $x.\text{key} = k$ , or NIL if no such  $x$  is in  $D$ .

$\text{BSTSearch}(\text{root}, k)$ :

1. Start from the **root**.
2. If  $k$  is **smaller** than the key of the current node, go **left**.
3. If  $k$  is **larger** than the key of the current node, go **right**.
4. If equal, **return** the current node.
5. If going to **NIL**, not found.

**Worst-case Running Time:**

$\Theta(h)$   
 $h$  can be as  
big as  $n$



## BSTs: Search

```
BSTSearch(root, k):  
1   if root == NIL:  
2       return NIL  
3   else if root.key == k:  
4       return root  
5   else if root.key > k:  
6       return BSTSearch(root.left, k)  
7   else :  
8       return BSTSearch(root.right, k)
```

## BSTs: Insert

*Insert*(*D*, *x*): insert *x* in *D*; if some *y* in *D* has *y.key* equal to *x.key*, replace *y* by *x*.

*BSTInsert*(*root*, *x*):

1. Start from the **root**.
2. Go down, left and right like what we do in *BSTSearch*
3. When next position is NIL, insert there.
4. If find equal key, replace the node.

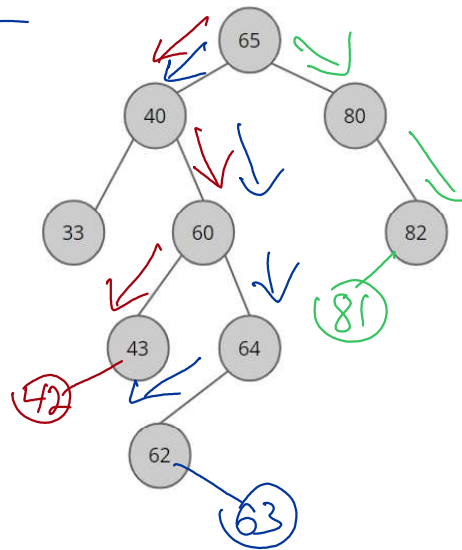
**Worst-case Running Time:**

$$\Theta(h) = \Theta(n)$$

*h can be as big as n*

## BSTs: Insert

Insert 42, 81, 63





## BSTs: Insert

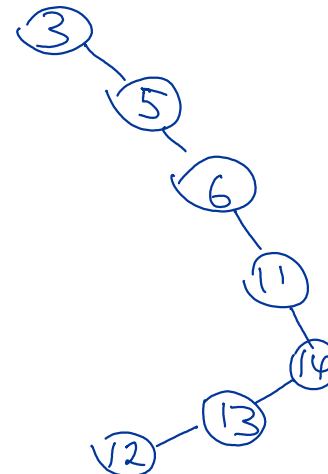
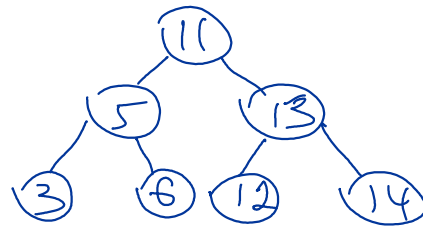
```
BSTInsert(root, x):  
1   if root == NIL:  
2       root = x  
3   else if root.key > x.key:  
4       root.left = BSTInsert(root.left, x)  
5   else if root.key < x.key:  
6       root.right = BSTInsert(root.right, x)  
7   else: # x.key == root.key  
8       replace root with x    # update x.left, x.right  
9   return root
```

## BSTs: Insert

If inserting the same set of data, but in a different sequence, will the shape of the BST be the same?

**Insert sequence 1:** 11, 5, 13, 12, 6, 3, 14

**Insert sequence 2:** 3, 5, 6, 11, 14, 13, 12



## BSTs: Successor

*Successor*( $x$ ): Find the node which is the successor of  $x$  in the *sorted list* obtained by *inorder traversal* (i.e., node with the smallest key larger than  $x$ ).

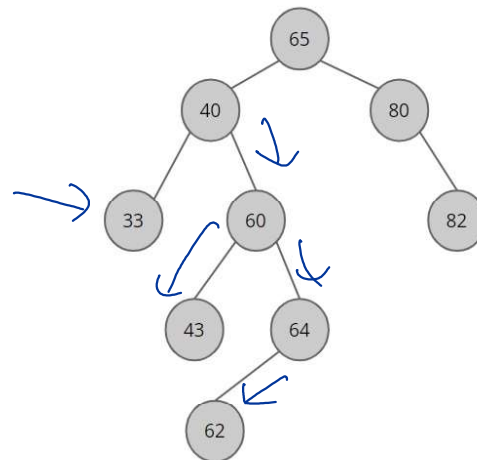
Successor of 33 is 40

Successor of 40 is 43

Successor of 60 is 62

Successor of 64 is 65

Successor of 65 is 80



## BSTs: Successor

**Case 1:**  $x$  has a right child.

- $\text{Successor}(x)$  must be the *minimum* in the *right subtree* of  $x$ .

**Case 2:**  $x$  does **not** have a right child.

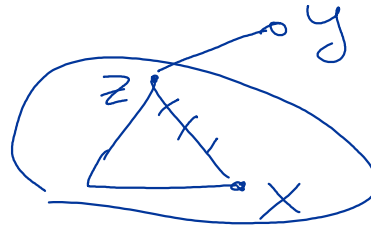
## BSTs: Successor

**Case 1:**  $x$  has a right child.

- $\text{Successor}(x)$  must be the **minimum** in the **right subtree** of  $x$ .

**Case 2:**  $x$  does **not** have a right child.

- $x$  is the **maximum** in some subtree  $A$  (because  $x$  has no right child).
- Maximum of a subtree is the last node visited in the subtree in an inorder traversal. So, the successor  $y$  of  $x$  is visited **right after finishing  $A$** .
- Right after finishing visiting a left subtree, its parent is visited. So  $A$  must be the **left subtree of  $y$** .



## BSTs: Successor

**Case 1:**  $x$  has a right child.

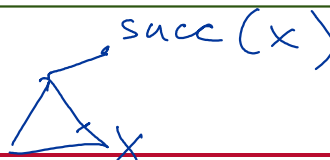
- $\text{Successor}(x)$  must be the **minimum** in the **right subtree** of  $x$ .

**Case 2:**  $x$  does **not** have a right child.

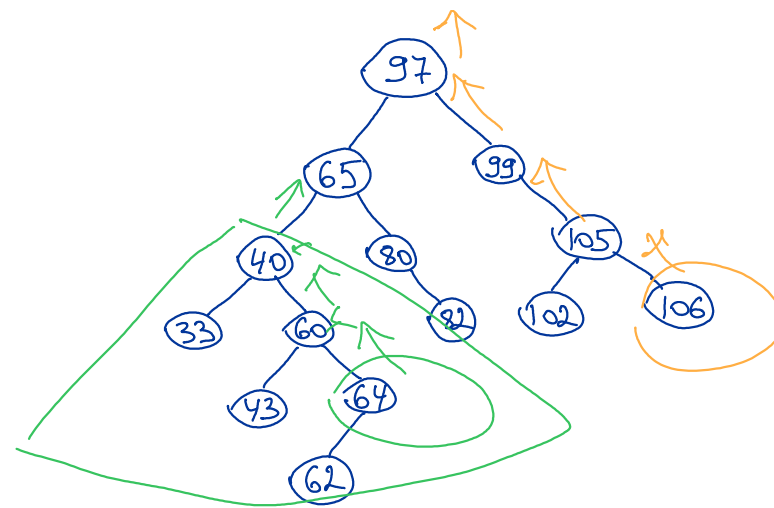
- $x$  is the **maximum** in some subtree  $A$  (because  $x$  has no right child).
- So, the successor  $y$  of  $x$  is visited **right after finishing  $A$**  in inorder traversal.
- So  $A$  must be the **left subtree of  $y$** .

- Go up to  $x.p$ .
- If  $x$  is a right child of  $x.p$ , keep going up.
- If  $x$  is a left child of  $x.p$ , stop,  $x.p$  is the guy!

what if we reach the root of the tree?



Then  $x$  is already Max so it does not have successor



65 is Successor  
of 64

## BSTs: Successor

```
Successor(x):  
1  if x.right ≠ NIL:  
2      return BSTMinimum(x.right)  
3  y = x.p  
4  while y ≠ NIL and x == y.right:  #x is right child  
5      x = y  
6      y = y.p  #keep going up  
7  return y
```

$h \in O(n)$

Worst case running time:

Case 1: Bst Minimum — takes  $\Theta(h)$  or  $\Theta(n)$

Case 2: Going from a leaf at height  $h$  to root. Also  $\Theta(n)$



## BSTs: Delete

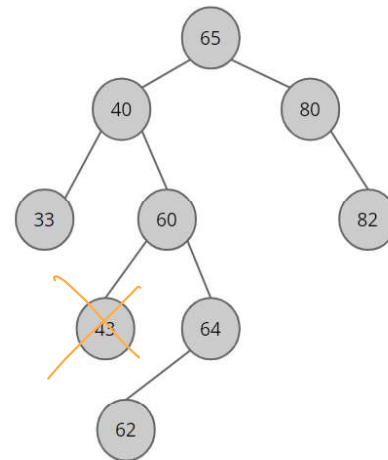
*Delete*( $D, x$ ): remove  $x$  from  $D$ .

**Case 1:**  $x$  has **no** child.

- Just delete it

**Case 2:**  $x$  has **one** child.

**Case 3:**  $x$  has **two** children.



## BSTs: Delete

*Delete*( $D, x$ ): remove  $x$  from  $D$ .

**Case 1:**  $x$  has **no** child.

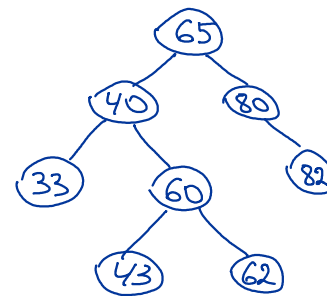
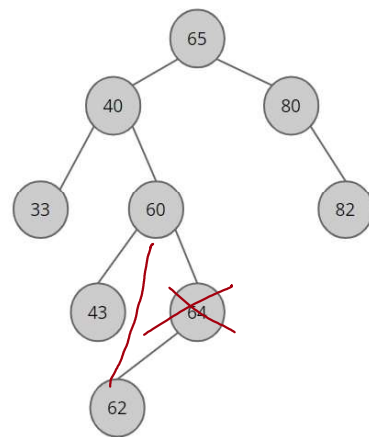
- Just delete it

**Case 2:**  $x$  has **one** child.

- Delete  $x$ ;
- **Promote**  $x$ 's only child to  $x$ 's spot, together with the the child's subtree.

**Case 3:**  $x$  has **two** children.

Delete 64



## BSTs: Delete

```
BSTTransplant(root, x, y):  
    # promote y to x's position  
1   if x.p == NIL :    # if x is the root  
2       root = y      # y replaces x as root  
3   else if x == x.p.left:    # if x is its parent's left child  
4       x.p.left = y      # make y the new left child of the parent  
5   else:    # if x is its parent's right child  
6       x.p.right = y      # make y the new right child of the parent  
7   if y ≠ NIL :  
8       y.p = x.p      # update the parent of y
```

## BSTs: Delete

*Delete*( $D, x$ ): remove  $x$  from  $D$ .

**Case 1:**  $x$  has **no** child.

- Just delete it

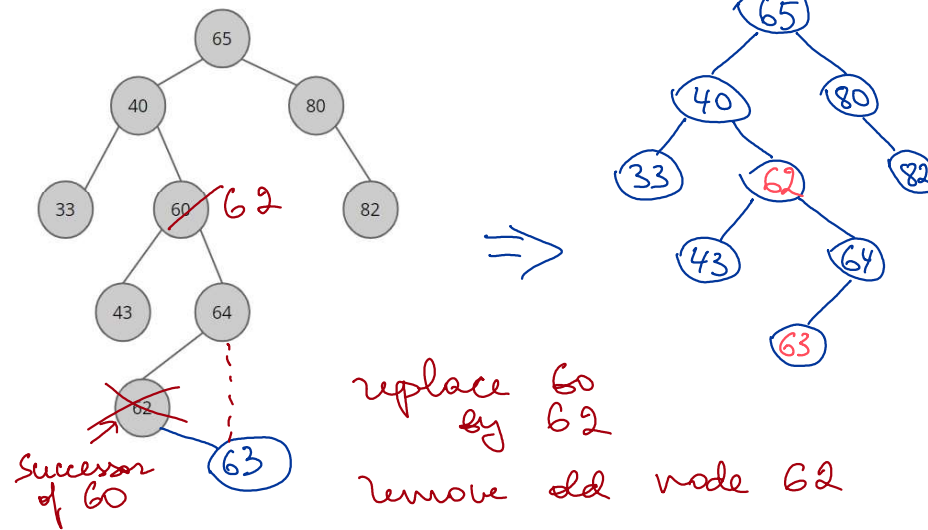
**Case 2:**  $x$  has **one** child.

- Delete  $x$ ;
- **Promote**  $x$ 's only child to  $x$ 's spot, together with the child's subtree.

**Case 3:**  $x$  has **two** children.

- Delete  $x$ ;
- Replace  $x$  by its **successor**  $y$ ;
- **Remove**  $y$  from its **original position**;
  - $y$  must be the minimum of right subtree of  $x$ .  
So  $y$  has **at most one child**.

Delete 60



### Side Note: Thinking Process



I can see that it works, pretty clever!

But HOW ON EARTH can I come up with this kind of clever algorithms!

**Thinking Process:**

- Understand the BST property (the invariant).
- predict the final shape of the tree.
- see how to get there.

## BSTs: Delete

```
BSTDelete(root, x):  
1  if root == NIL:  
2      pass    # do nothing  
3  else if root.key == x.key:  Successor of x.key  
4      root = BSTExtractMin(root.right) # or root = BSTExtractMax(root.left)  
5  else if root.key > x.key:  
6      BSTDelete(root.left, x)  predecessor of x.key  
7  else:  
8      BSTDelete(root.right, x)
```

$O(n)$



## Running Time Analysis of BST Operations

### Worst-case Running Time:

- BSTSearch:  $\Theta(h)$
  - BSTInsert:  $\Theta(h)$
  - BSTDelete:  $\Theta(h)$
- but  $h \in O(n)$   
so all  
three  
are  
 $\Theta(n)$

A BST is **NOT** necessarily complete (unlike binary heap).

## After Lecture

- Review BSTs in the Course Notes (first part of Chapter 3) and CLRS (CLRS Chapter 12.3).
- Relevant exercises in the Course Notes and CLRS.
- Complete implementation of BSTExtractMin and BSTExtractMax.