

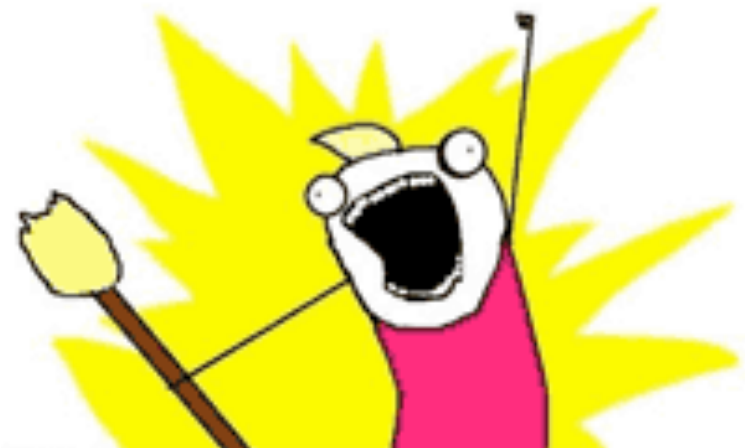
# **CSC263 Week 3**

# Announcements

**Problem Set 2 is out today!**

Due Tuesday (Oct 13)

More challenging so start early!



# **NOT EVERY GROUP PROJECT**



**IN SCHOOL YOU HAVE EVER DONE**

# This week

→ ADT: Dictionary

→ Data structure:

- ◆ Binary search tree (BST)
- ◆ Balanced BST - AVL tree

# Dictionary

## What's stored:

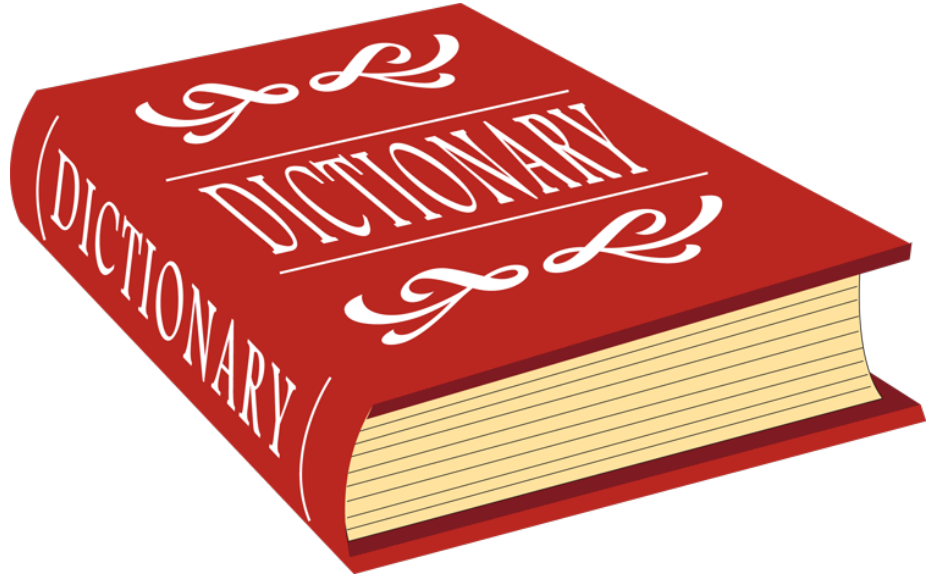
→ words

## Supported operations

→ Search for a word

→ Insert a word

→ Delete a word



# Dictionary, more precisely

## What's stored

- A set **S** where each node **x** has a field **x.key**  
(assumption: keys are distinct, unless o.w. specified)

## Supported operations

- **Search(S, k)**: return **x** in **S**, s.t., **x.key = k**
  - ◆ return NIL if no such **x**
- **Insert(S, x)**: insert node **x** into **S**
  - ◆ if already exists node **y** with same key , replace **y** with **x**
- **Delete(S, x)**: delete a given **node x** from **S**

A thing to note: **k** is a key, **x** is a node.

## More on Delete

Why Delete(S, **x**) instead of Delete(S, **k**)?

Delete(S, **k**) can be implemented by:

1.  $x = \text{Search}(S, k)$
2. Delete(S,  $x$ )

We want separate different operations, i.e., each operation focuses on only one job.

**Implement a Dictionary using  
simple data structures**



40 -> 33 -> 18 -> 65 -> 24 -> 25

## Unsorted (doubly) linked list

### → Search(S, k)

- ◆  $O(n)$  worst case
- ◆ go through the list to find the key

### → Insert(S, x)

- ◆  $O(n)$  worst case
- ◆ need to check if **x.key** is already in the list

### → Delete(S, x)

- ◆  $O(1)$  worst case
- ◆ Just delete,  $O(1)$  in a doubly linked list

**Sorted array**     [ 18 , 24 , 25 , 33 , 40 , 65 ]

→ **Search(S, k)**

- ◆  **$O(\log n)$**  worst case
- ◆ binary search!

→ **Insert(S, x)**

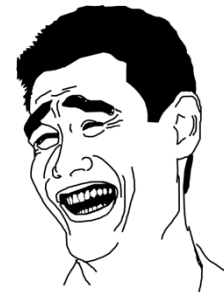
- ◆  **$O(n)$**  worst case
- ◆ insert at front, everything has to shift to back

→ **Delete(S, x)**

- ◆  **$O(n)$**  worst case
- ◆ Delete at front, everything has to shift to front

# We can do better using smarter data structures, of course

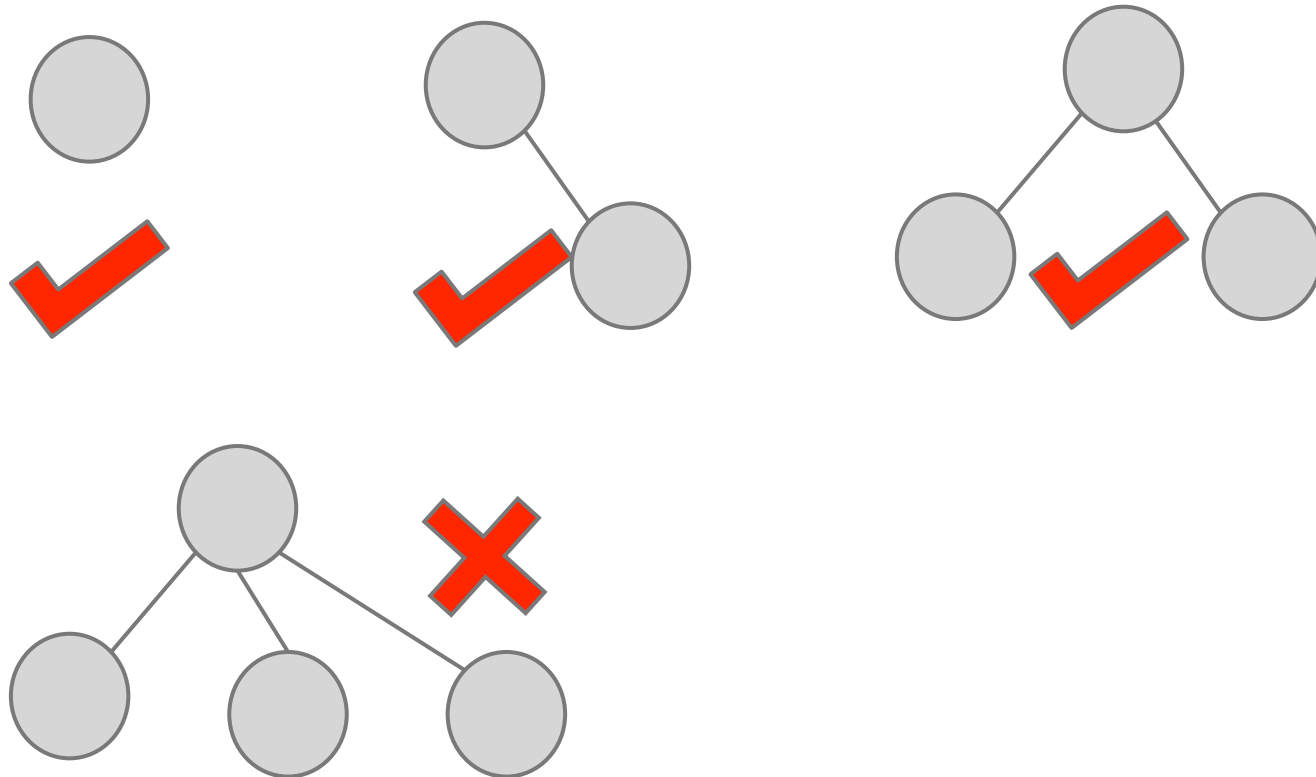
	unsorted list	sorted array	<b>BST</b>	<b>Balanced BST</b>
<b>Search(S, k)</b>	$O(n)$	$O(\log n)$	<b><math>O(n)</math></b>	<b><math>O(\log n)</math></b>
<b>Insert(S, x)</b>	$O(n)$	$O(n)$	<b><math>O(n)</math></b>	<b><math>O(\log n)</math></b>
<b>Delete(S, x)</b>	$O(1)$	$O(n)$	<b><math>O(n)</math></b>	<b><math>O(\log n)</math></b>



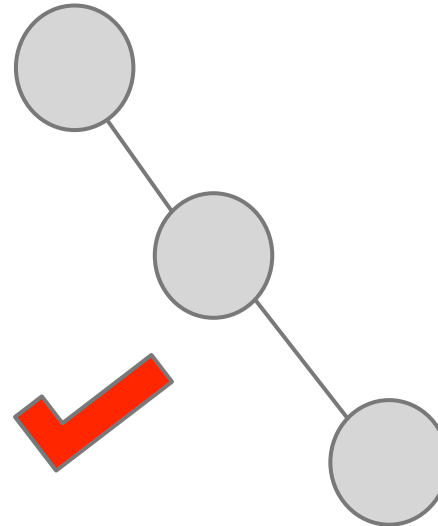
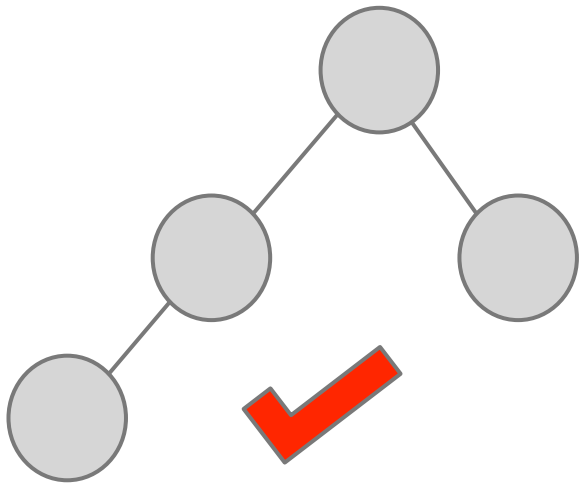
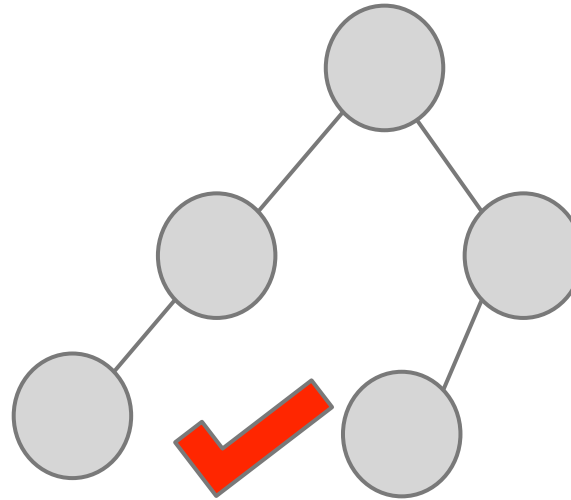
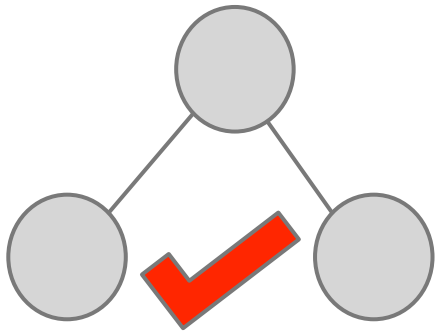
# Binary Search Tree

It's a **binary** tree, like binary heap

Each node has **at most 2** children



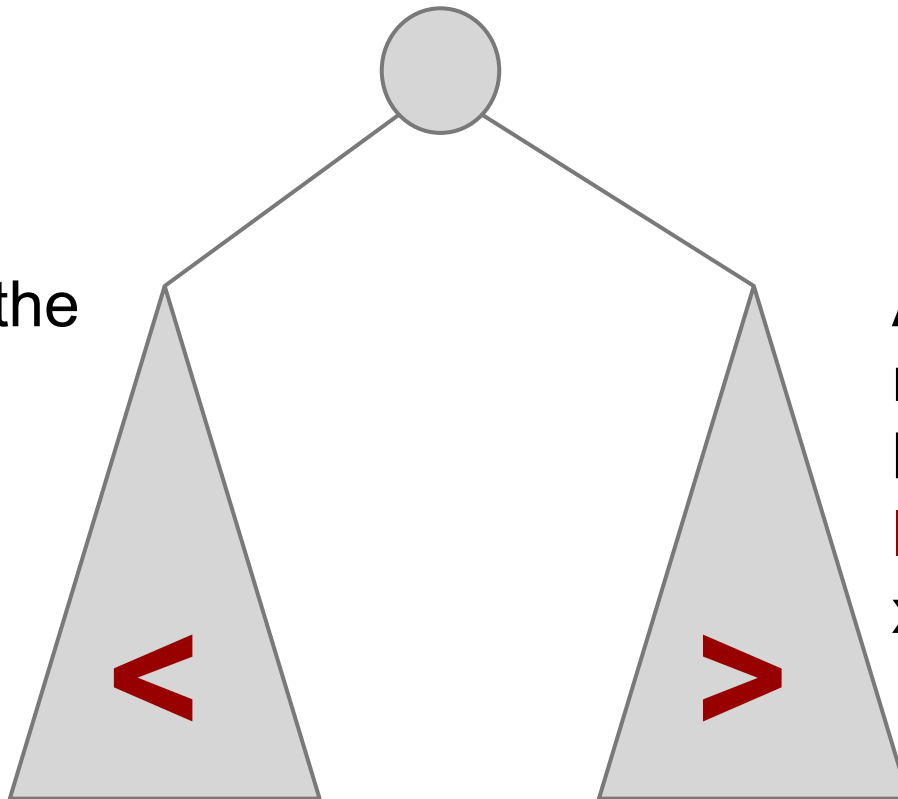
need **NOT** be **nearly-complete**, unlike binary heap



# It has the **BST** property

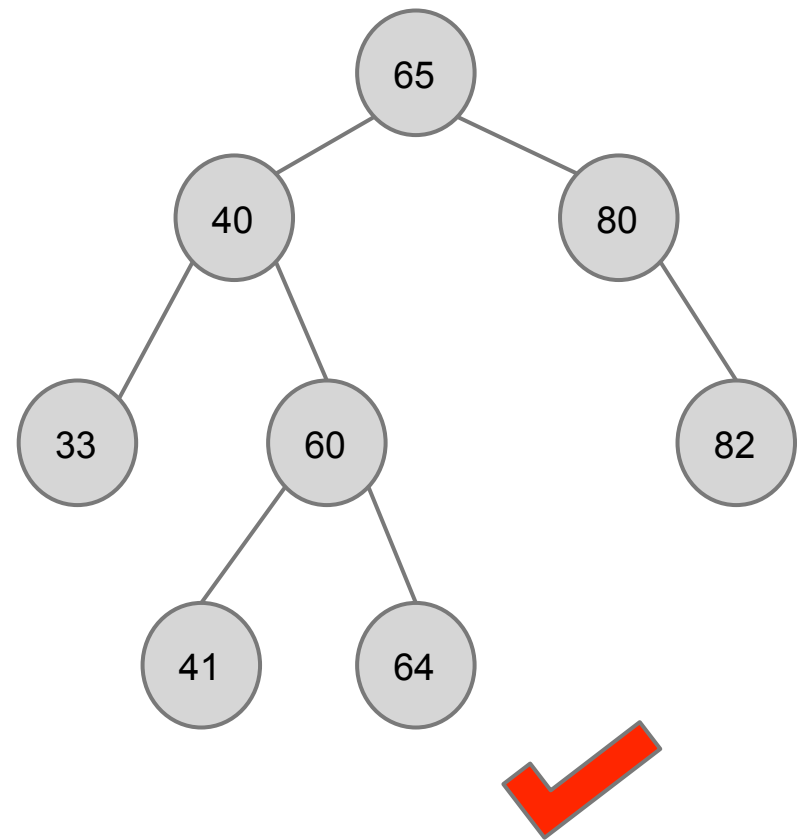
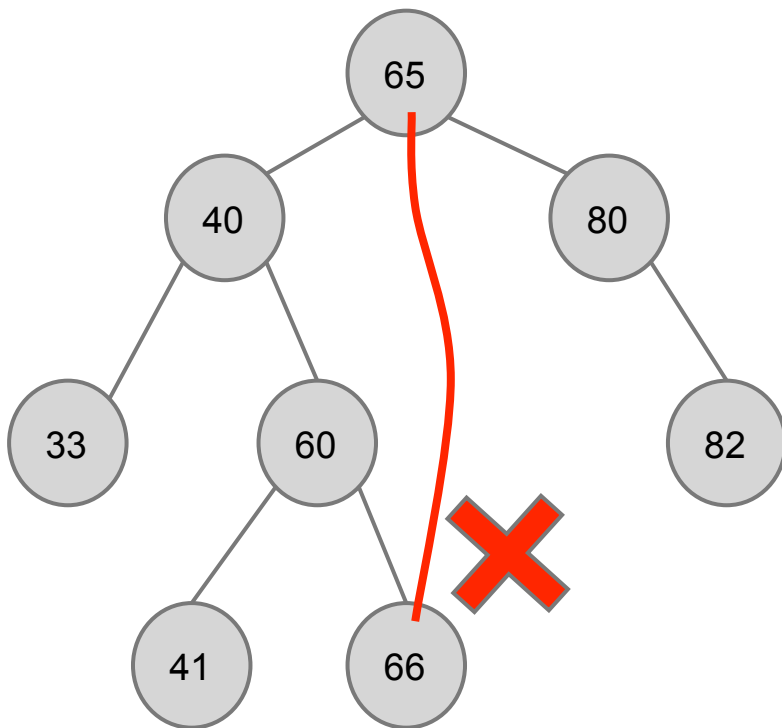
For **every** node **x** in the tree

All nodes in the **left** subtree have keys **smaller** than **x.key**



All nodes in the **right** subtree have keys **larger** than **x.key**

# BST or NOT?





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

**CSC148 Quiz: How to obtain a **sorted** list from a BST?**

**Perform an **inorder traversal**.**

We pass a BST to a function by passing its **root** node.

```
InorderTraversal(x):  
# print all keys in BST rooted at x in ascending order  
  
if x ≠ NIL:  
    InorderTraversal(x.left)  
    print x.key  
    InorderTraversal(x.right)
```

Worst case running time of InorderTraversal:  
**O(n)**, because visit each node exactly once.

# Operations on a BST

## **First, 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)

# Operations on a BST

## read-only operations

- $\text{TreeSearch}(\text{root}, k)$
- $\text{TreeMinimum}(x) / \text{TreeMaximum}(x)$
- $\text{Successor}(x) / \text{Predecessor}(x)$

## modifying operations

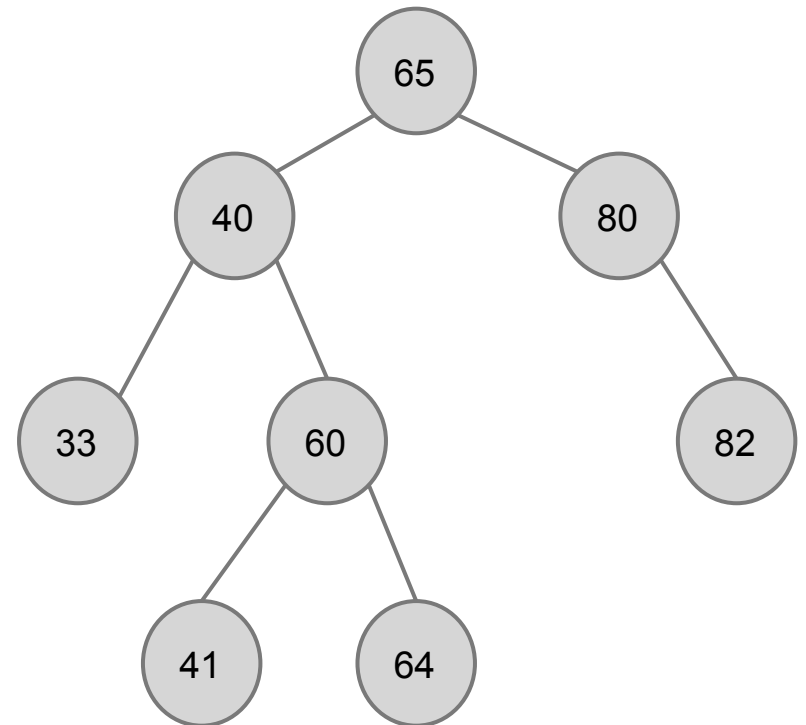
- $\text{TreeInsert}(\text{root}, x)$
- $\text{TreeDelete}(\text{root}, x)$

# **TreeSearch(root, k)**

Search the BST rooted at root, return the node with key k; return NIL if not exist.

# TreeSearch(root, k)

- start from root
- if **k** is **smaller** than the key of the current node, go **left**
- if **k** is **larger** than the key of the current node, go **right**
- if equal, **found**
- if going to **NIL**, **not found**



# TreeSearch(root, k): Pseudo-code

```
TreeSearch(root, k):
```

```
    if root = NIL or k = root.key:
```

```
        return root
```

```
    if k < root.key:
```

```
        return TreeSearch(root.left, k)
```

```
    else:
```

```
        return TreeSearch(root.right, k)
```

Worst case running time:

**O(h)**, height of tree, going at most from root to leaf

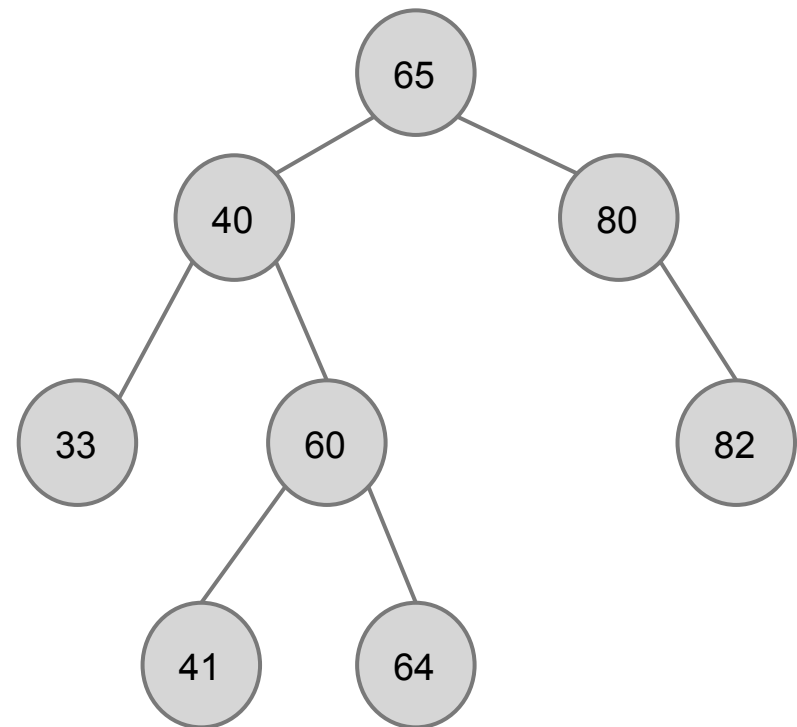


# **TreeMinimum(x)**

Return the node with the minimum key of the tree rooted at x

# TreeMinimum(x)

- start from root
- keep going to the left, until cannot go anymore
- return that final node



## TreeMinimum(x): pseudo-code

```
TreeMinimum(x):  
  
    while x.left ≠ NIL:  
        x ← x.left  
    return x
```

Worst case running time:

**O(h)**, height of tree, going at most from root to leaf

**TreeMaximum(x)** is exactly the same, except that it goes to the right instead of to the left.

# Successor(x)

Find the node which is the successor of  $x$  in the sorted list obtained by inorder traversal

or, node with the smallest key larger than  $x$

# Successor(x)

→ The successor of 33 is...

◆ 40

→ The successor of 40 is...

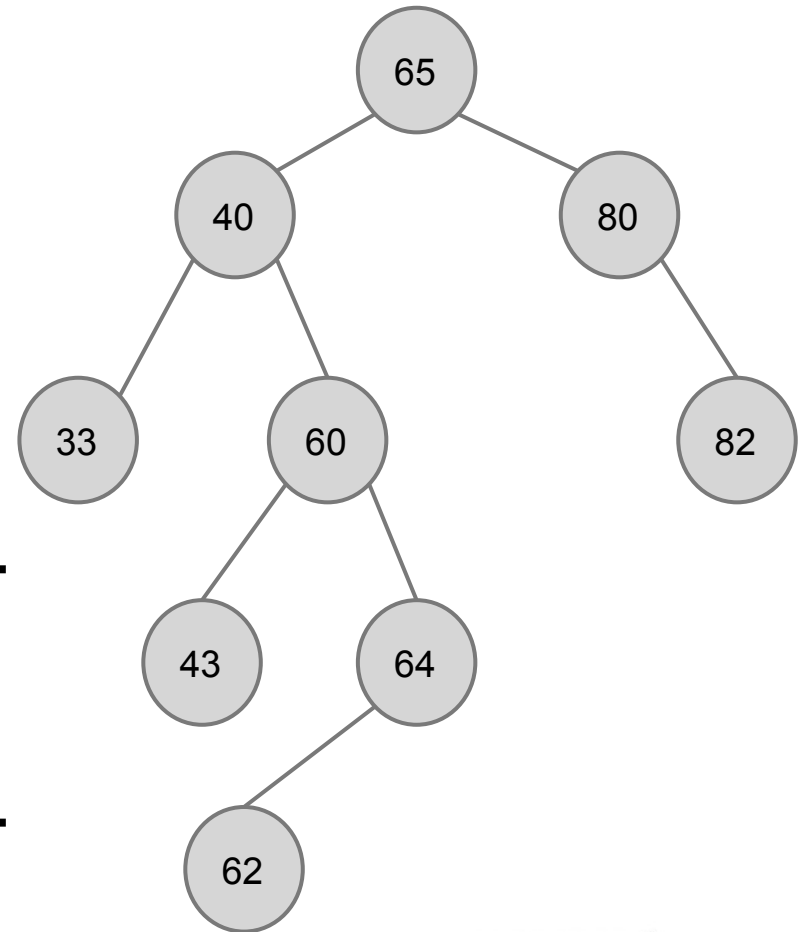
◆ 43

→ The successor of 64 is...

◆ 65

→ The successor of 65 is ...

◆ 80



# **Successor(x):**

## **Organize into two cases**

→x has a right child

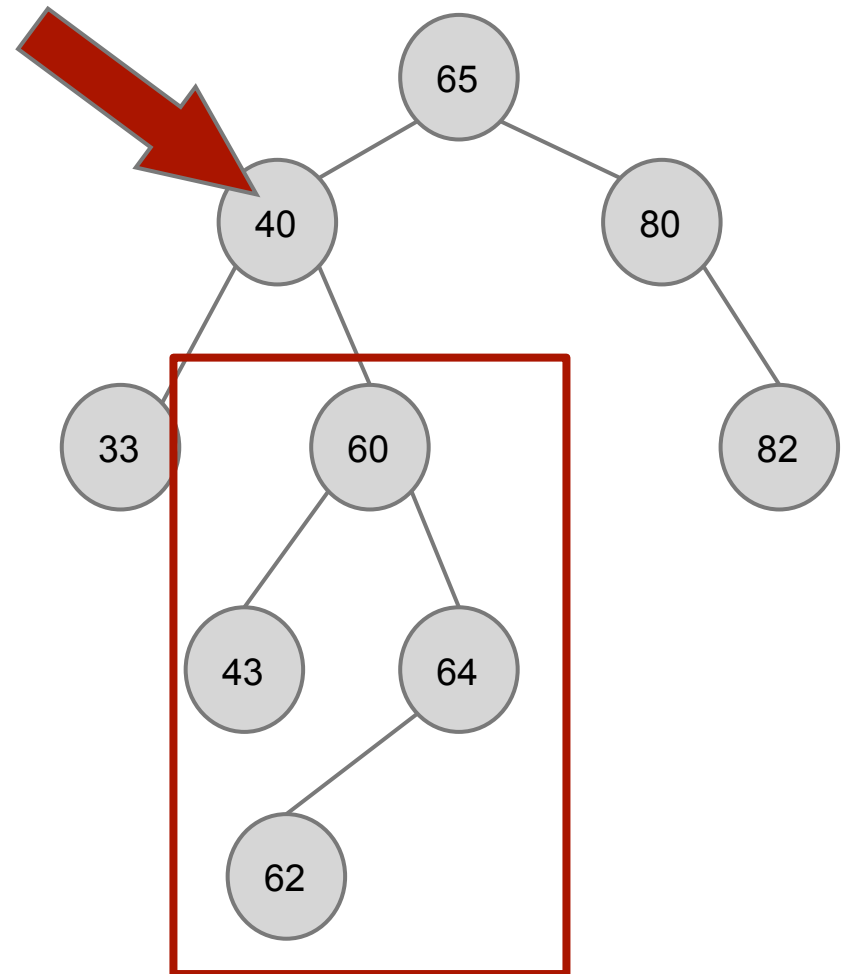
→x does not have a right child

## **x has a right child**

Successor(x) must be in  
x's **right subtree** (the  
nodes **right after x** in  
the inorder traversal)

It's the **minimum** of x's  
right subtree, i.e.,  
TreeMinimum(x.right)

**The first (smallest) node among what's right after x.**



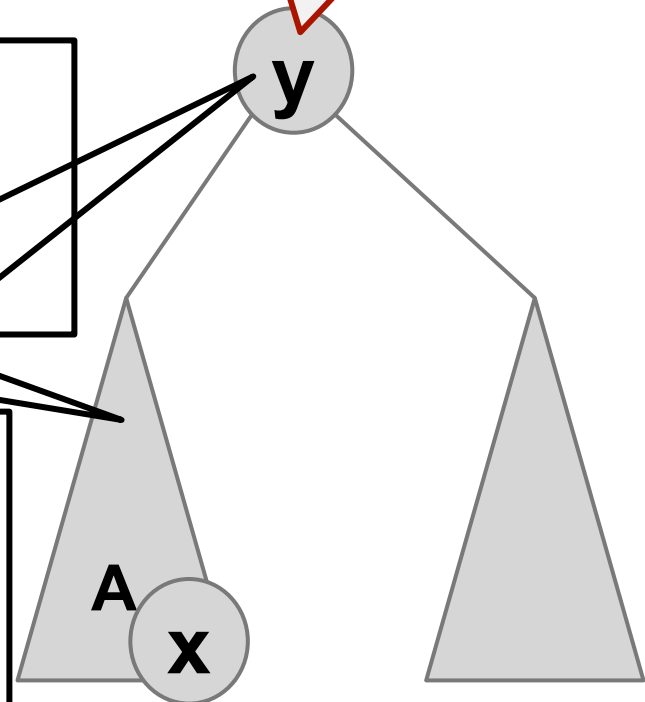
# x does not have a right child

Consider the **inorder traversal**  
(left subtree -> root -> right subtree)

x is the **last one** visited in some  
**left subtree A**  
(because no right child)

The successor **y** of x is the **lowest ancestor** of x whose **left subtree** contains x  
(y is visited right after finishing subtree **A** in inorder traversal)

Find this guy!

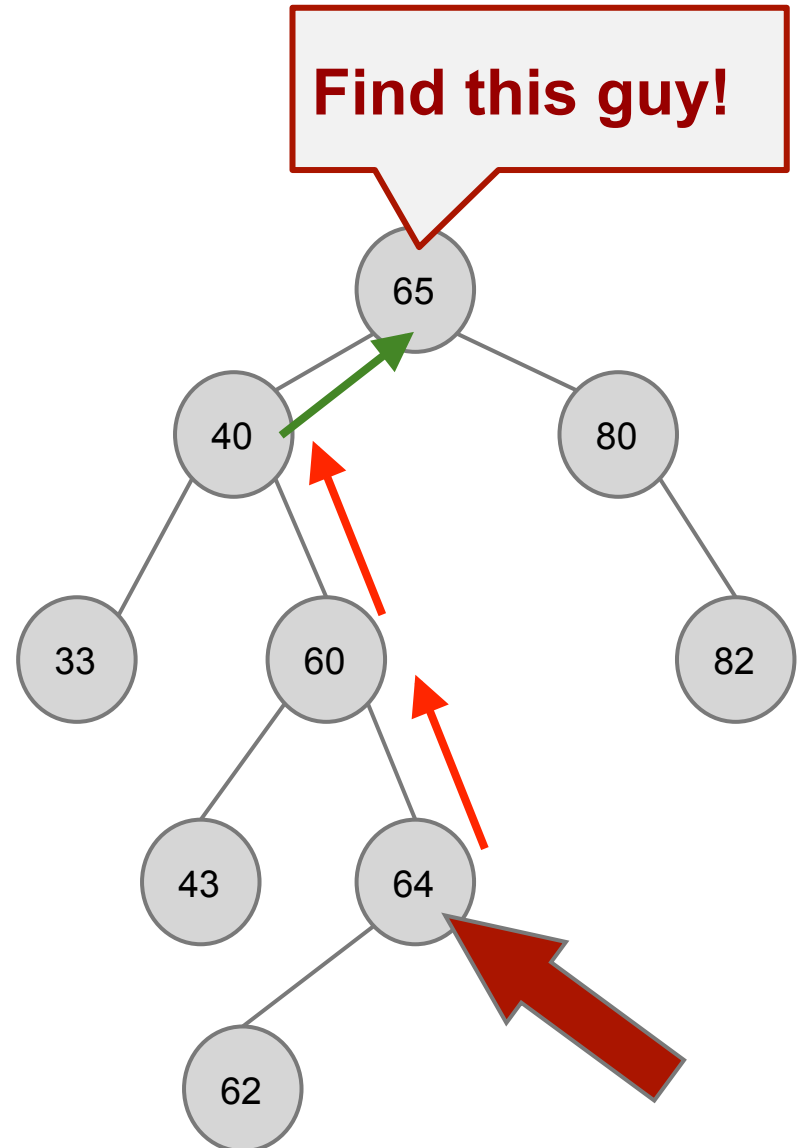




# x does not have a right child

How to find:

- 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!**



## Summarize the two cases of Successor(x)

→ If x has a right child

◆ return TreeMinimum(x.right)

→ If x does not have a right child

◆ keep going up to x.p while x is a right child, stop when x is a left child, then return x.p

◆ if already gone up to the root and still not finding it, return NIL.

# Successor(x): pseudo-code

```
Successor(x):  
  if x.right ≠ NIL:  
    return TreeMinimum(x.right)  
  y ← x.p  
  while y ≠ NIL and x = y.right: #x is right child  
    x = y  
    y = y.p # keep going up  
  return y
```

Worst case running time

**O(h)**, Case 1: TreeMin is  $O(\log n)$ ; Case 2: at most leaf to root

Predecessor(x) works symmetrically the same way as Successor(x)

# **TreeInsert(root, x)**

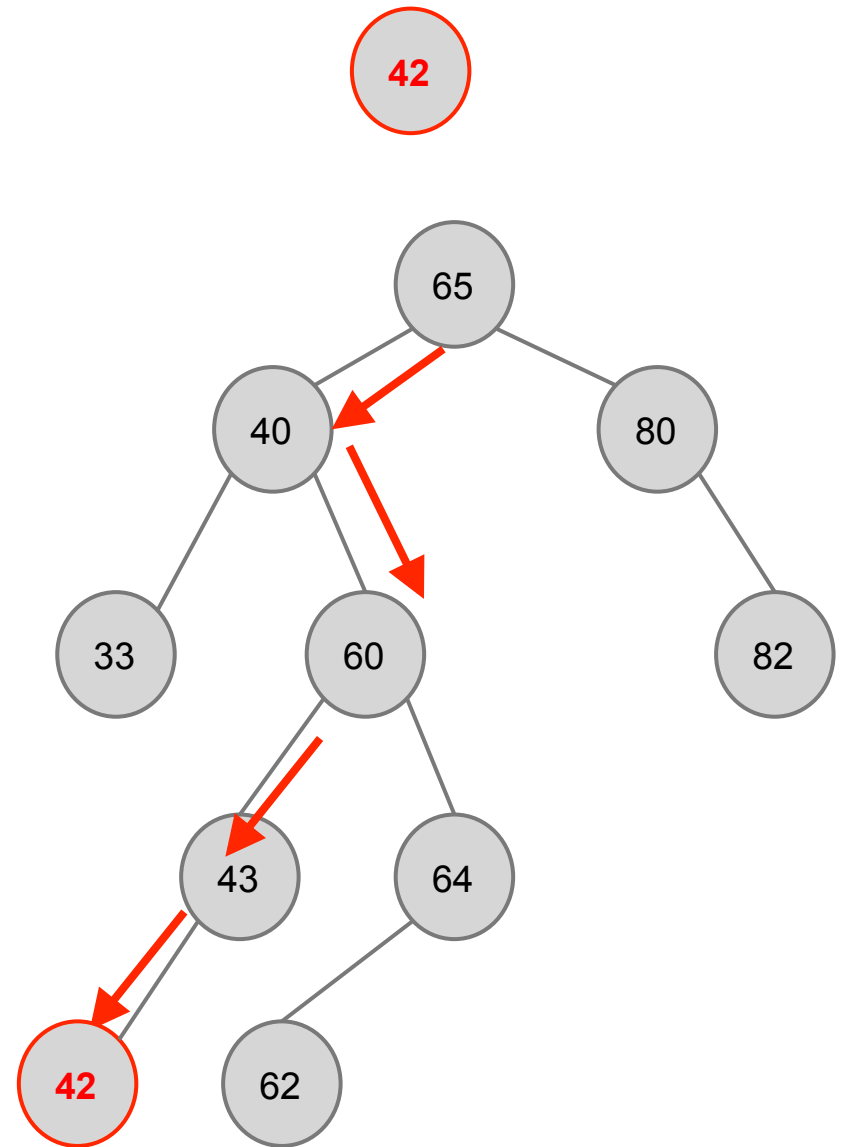
Insert node  $x$  into the BST rooted at  $root$   
return the new root of the modified tree  
if exists  $y$ , s.t.  $y.key = x.key$ , replace  $y$  with  $x$

# TreeInsert(root, x)

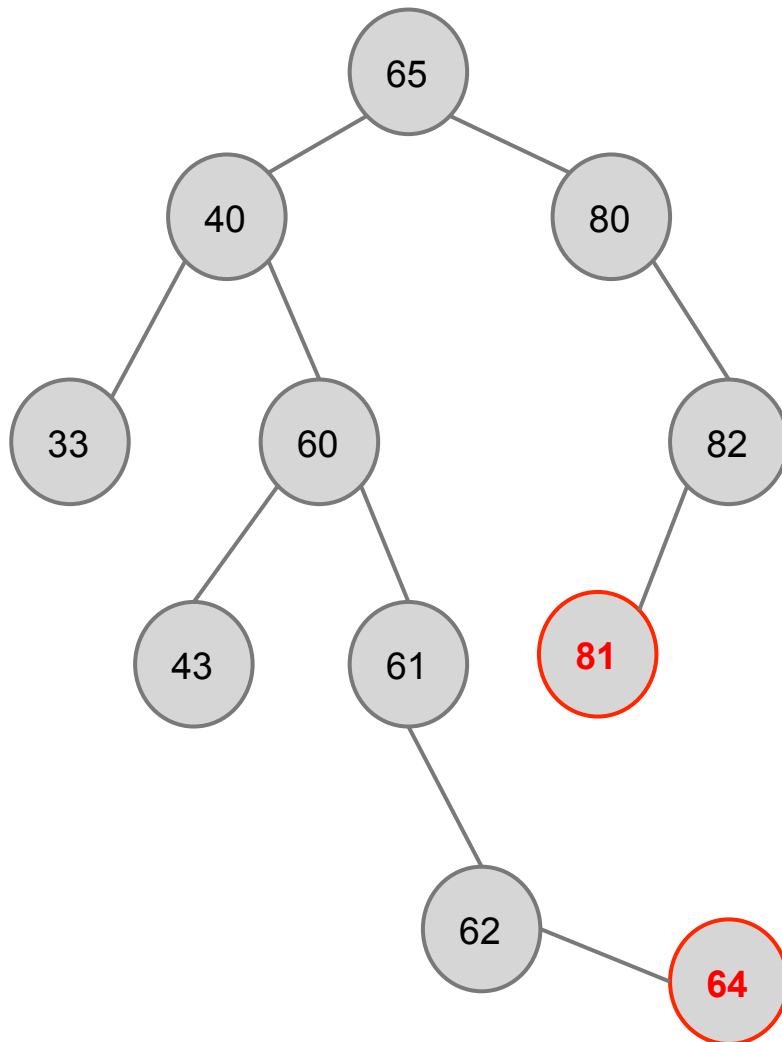
Go down, left and right  
like what we do in  
TreeSearch

When next position is  
NIL, insert there

If find equal key, replace  
the node



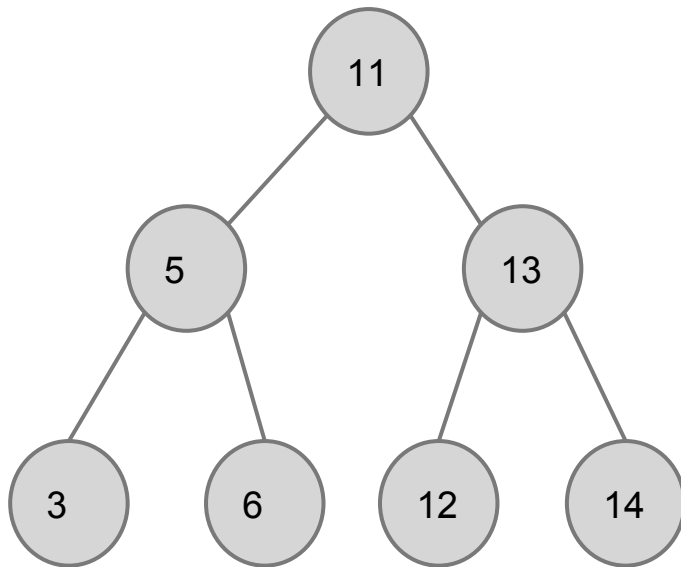
# Exercise



## Ex 2: Insert sequence into an empty tree

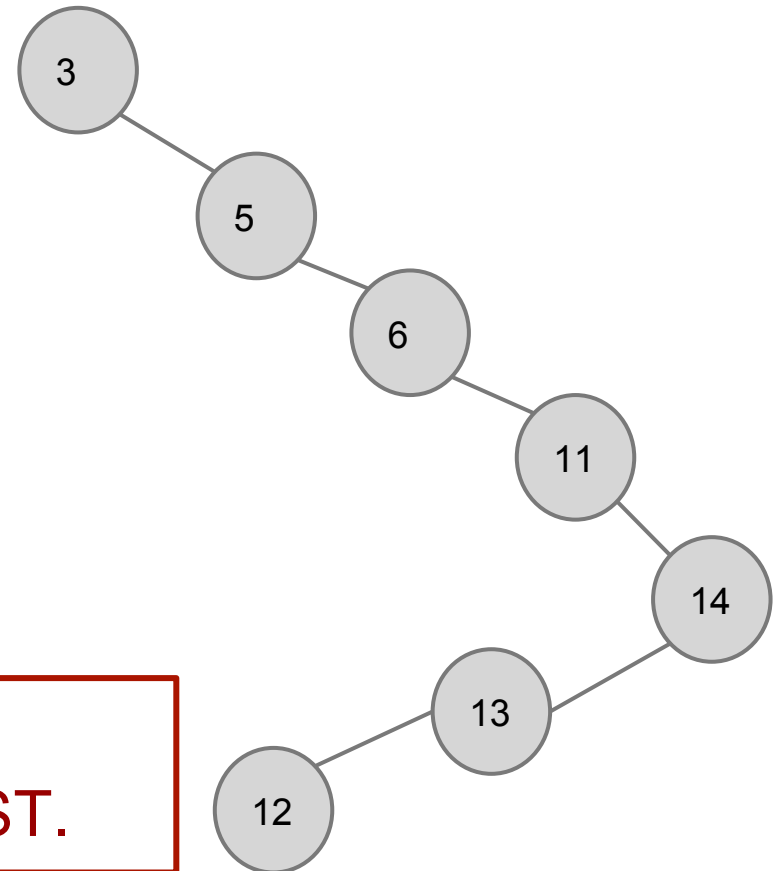
**Insert sequence 1:**

11, 5, 13, 12, 6, 3, 14



**Insert sequence 2:**

3, 5, 6, 11, 14, 13, 12



Different insert sequences result in different “shapes” (heights) of the BST.



# TreeInsert(root, x): Pseudo-code

```
TreeInsert(root, x):  
# insert and return the new root  
  if root = NIL:  
    root ← x  
  elif x.key < root.key:  
    root.left ← TreeInsert(root.left, x)  
  elif x.key > root.key:  
    root.right ← TreeInsert(root.right, x)  
  else # x.key = root.key:  
    replace root with x # update x.left, x.right  
  return root
```

**Worst case  
running time:  
 $O(h)$**

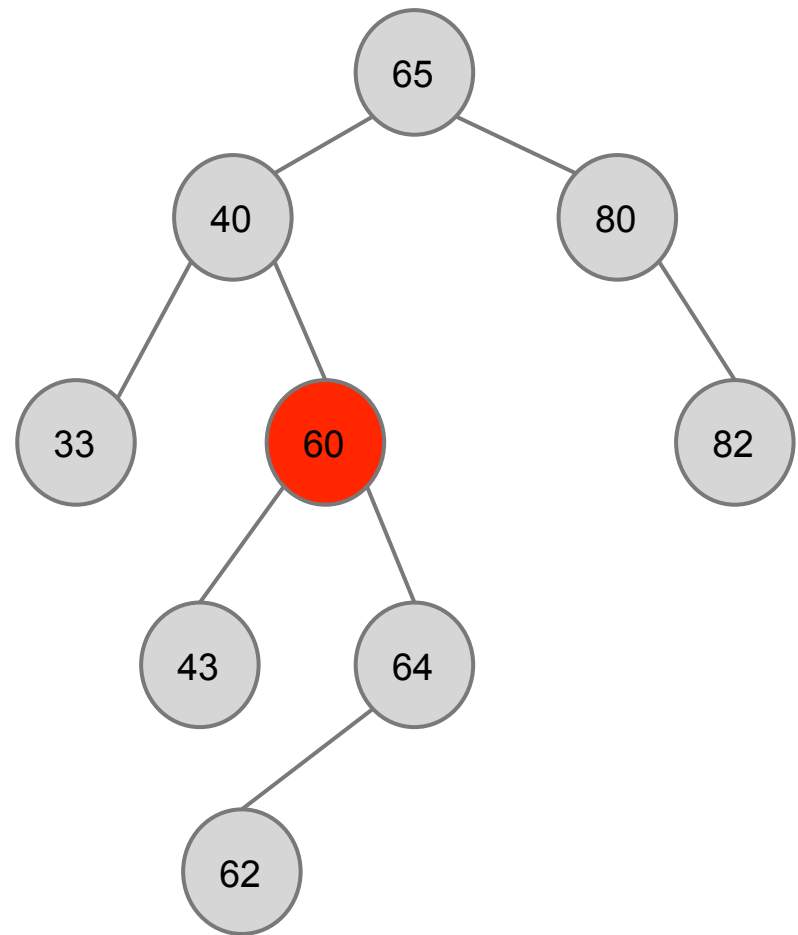


# **TreeDelete(root, x)**

Delete node  $x$  from BST rooted at root while maintaining BST property,  
return the new root of the modified tree

# What's tricky about deletion?

Tree might be **disconnected** after deleting a node, need to **connect** them back together, while maintaining the **BST** property.



# Delete(root, x): Organize into 3 cases

Case 1: x has **no** child

Easy

Case 2: x has **one** child

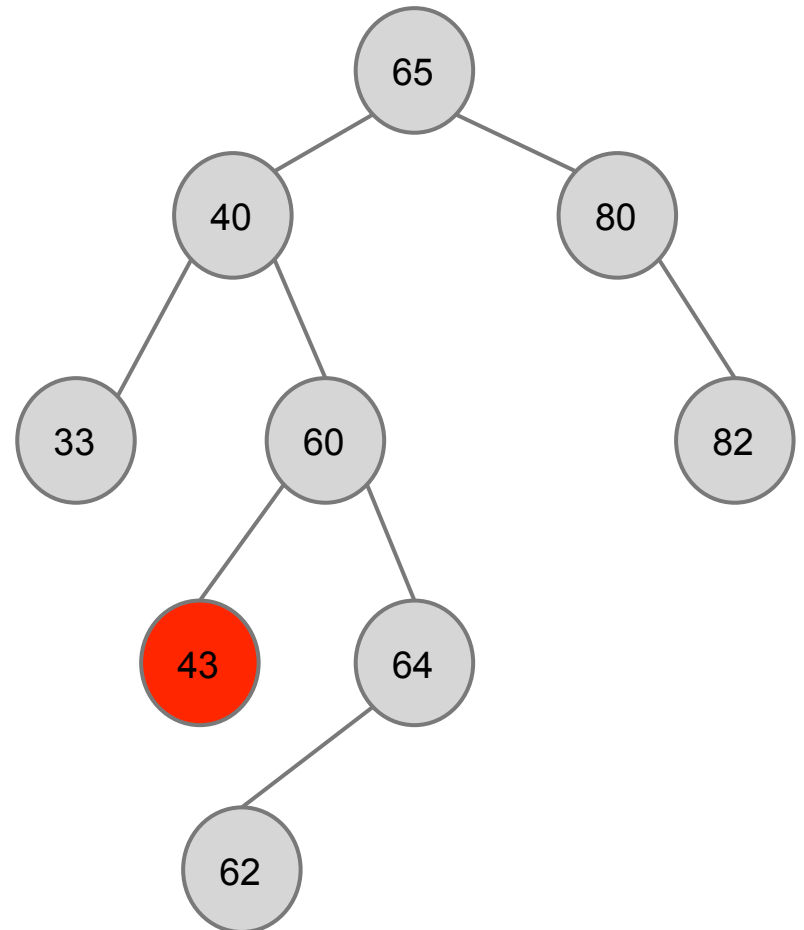
Easy

Case 3: x has **two** children

less easy

# Case 1: x has no child

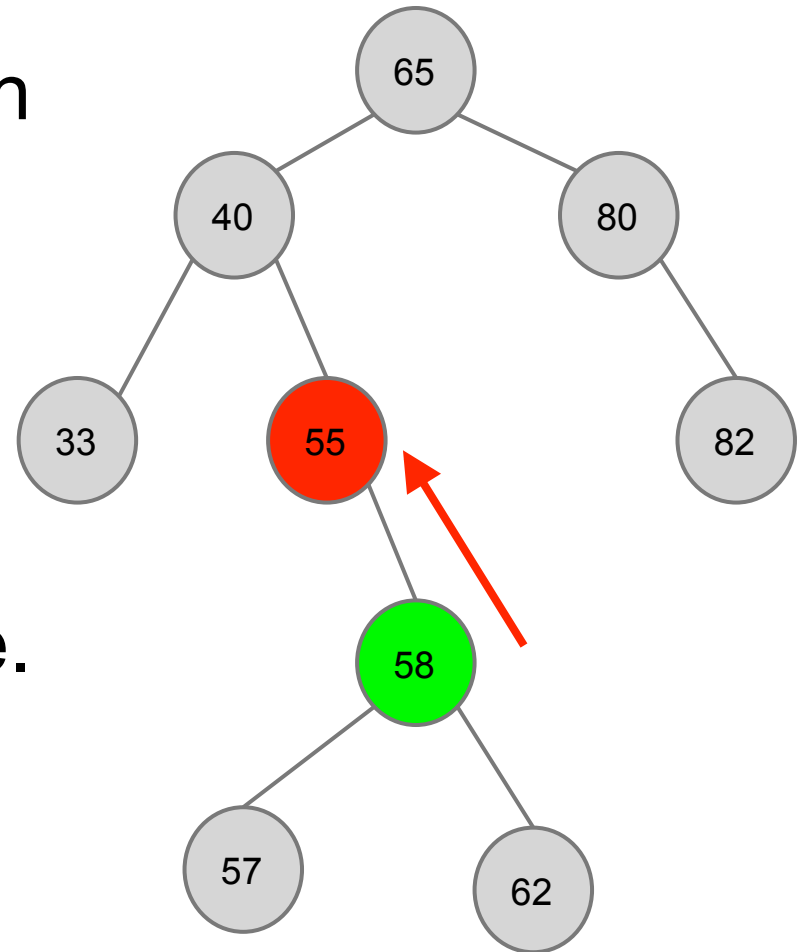
Just delete it,  
nothing else need  
to be changed.



## Case 2: x has one child

First delete that node, which makes an **open spot**.

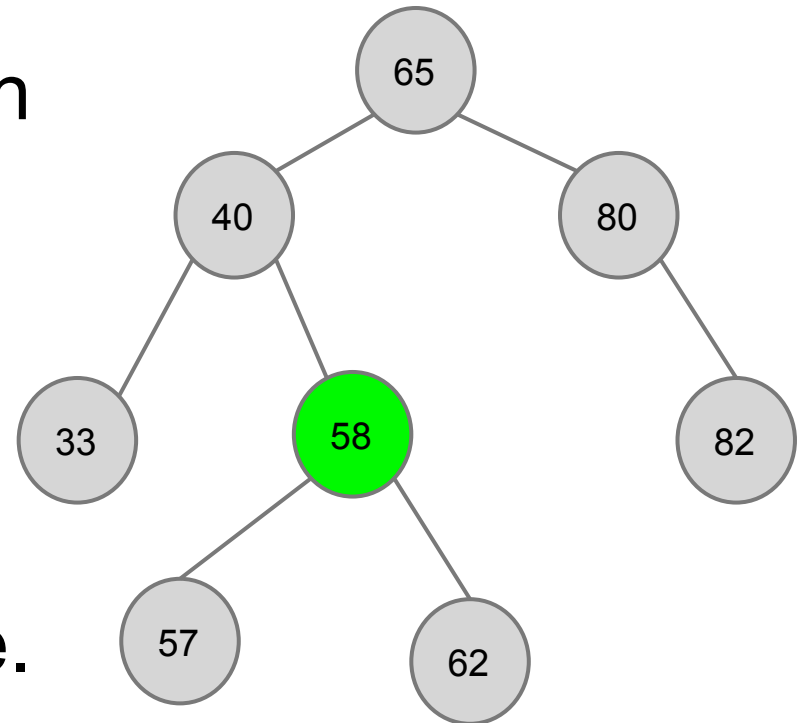
Then **promote** x's **only child** to the spot, together with the only child's subtree.



## Case 2: x has one child

First delete that node, which makes an **open spot**.

Then **promote** x's **only child** to the spot, together with the only child's subtree.

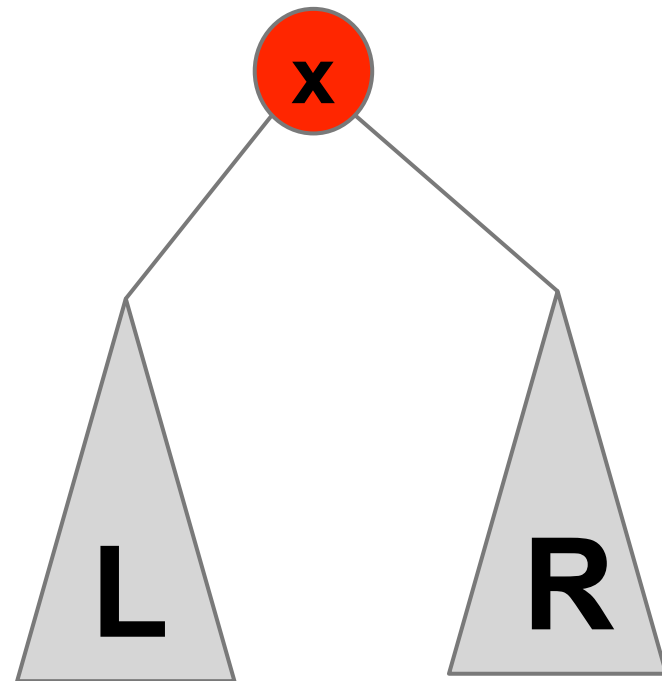
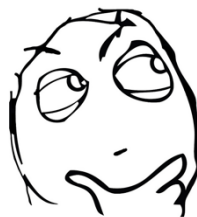


## Case 3: $x$ has two children

Delete  $x$ , which makes an open spot.

A node  $y$  should fill this spot, such that  $L < y < R$ ,

**Who should be  $y$ ?**



**$y \leftarrow$  the minimum of  $R$ , i.e.,  $\text{Successor}(x)$**

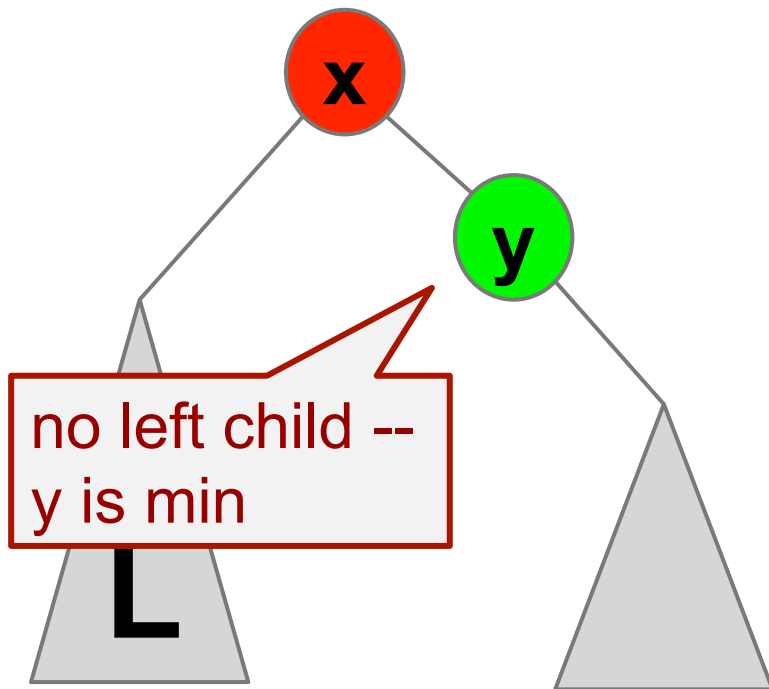
$L < y$  because  $y$  is in  $R$ ,  $y < R$  because it's minimum



# Further divide into two cases

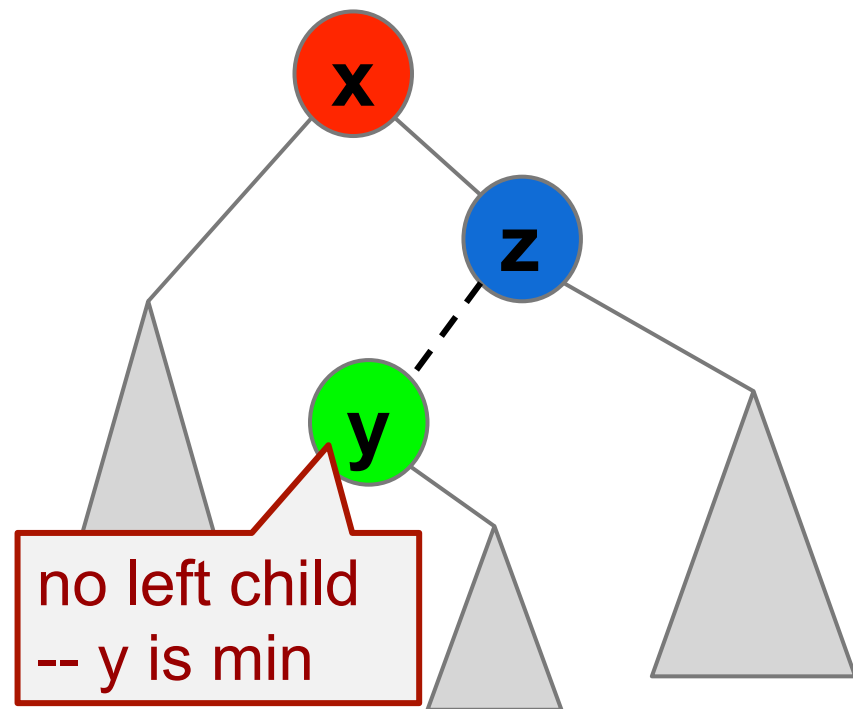
## Case 3.1:

$y$  happens to be the right child of  $x$



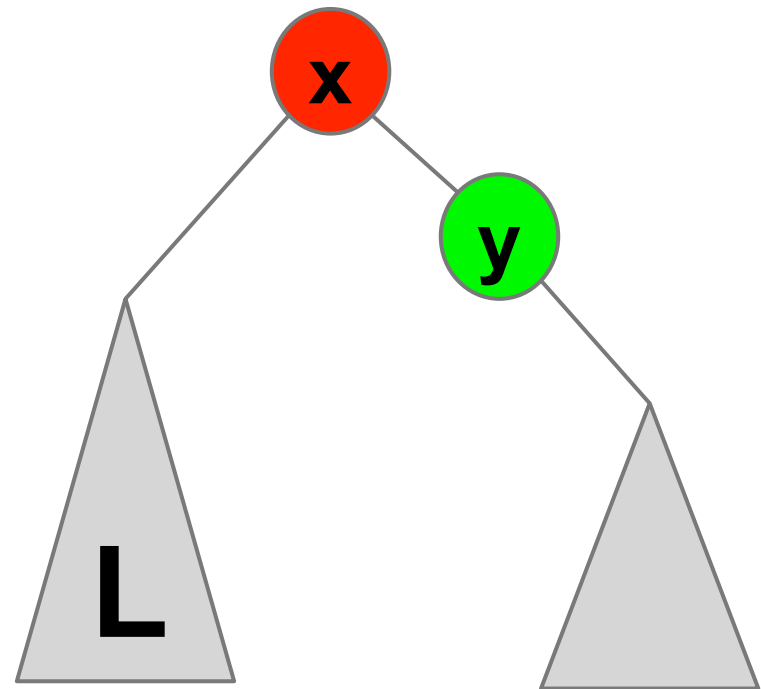
## Case 3.2:

$y$  is not the right child of  $x$



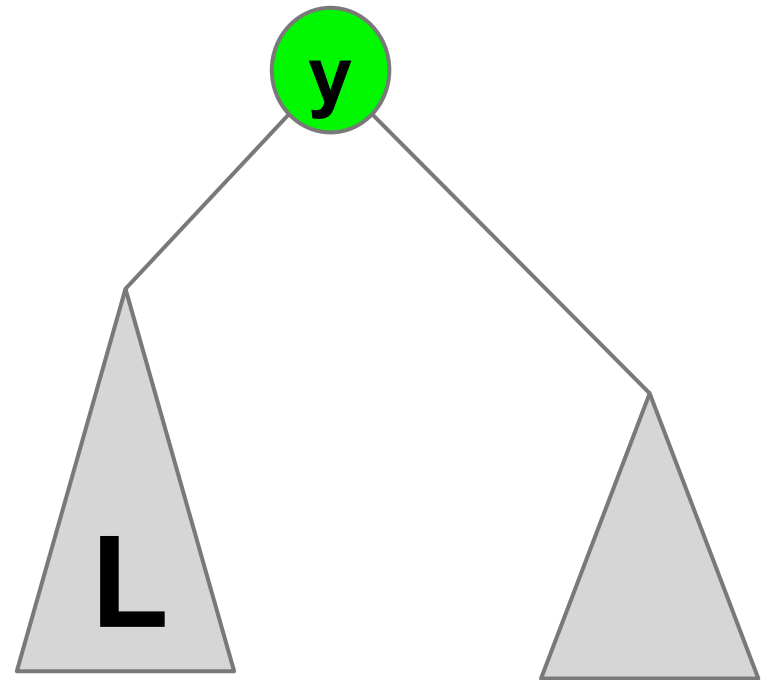
## Case 3.1: $y$ is $x$ 's right child

Easy, just **promote**  
 $y$  to  $x$ 's spot



## Case 3.1: $y$ is $x$ 's right child

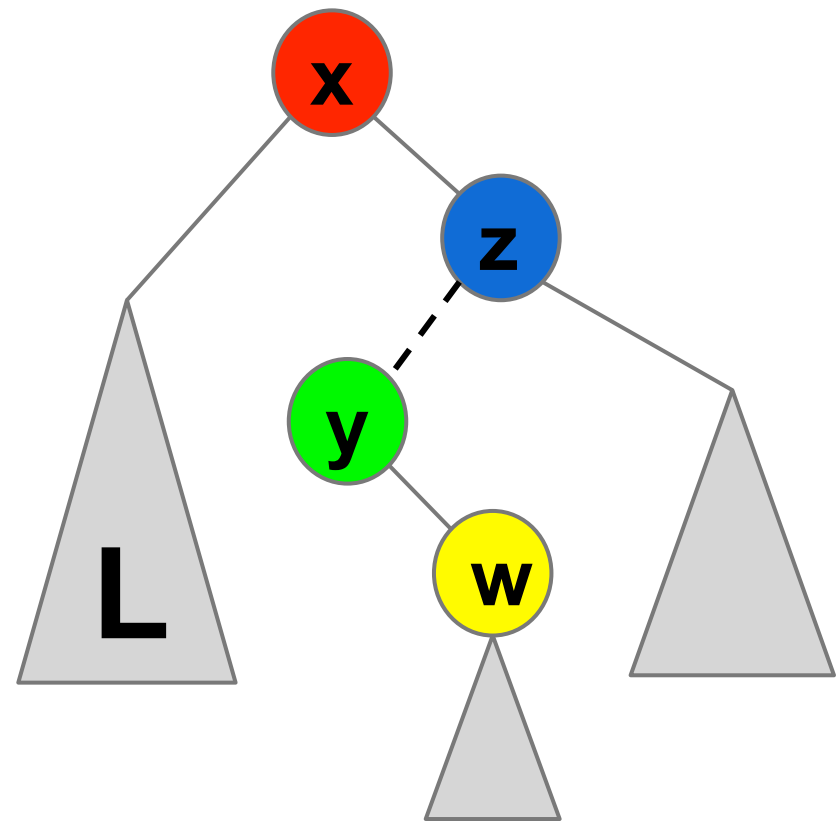
Easy, just **promote**  
 $y$  to  $x$ 's spot



## Case 3.2: $y$ is NOT $x$ 's right child

1. Promote  $w$  to  $y$ 's spot,  $y$  becomes free.

Order:  $y < w < z$

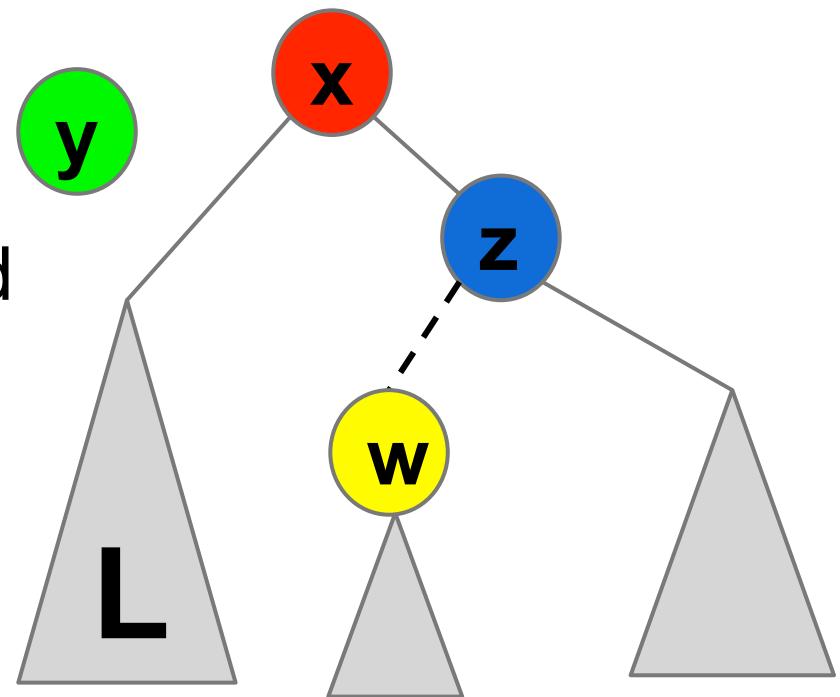


## Case 3.2: $y$ is NOT $x$ 's right child

1. Promote  $w$  to  $y$ 's spot,  $y$  becomes free.

2. Make  $z$  be  $y$ 's right child ( $y$  adopts  $z$ )

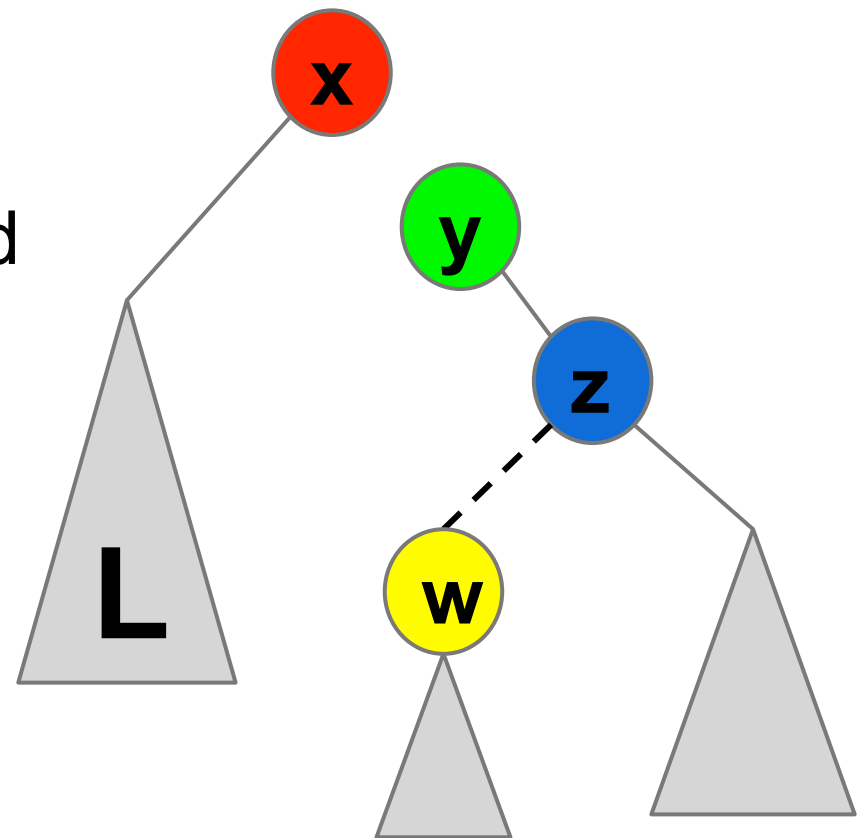
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## Case 3.2: $y$ is NOT $x$ 's right child

1. Promote  $w$  to  $y$ 's spot,  $y$  becomes free.
2. Make  $z$  be  $y$ 's right child ( $y$  adopts  $z$ )
3. Promote  $y$  to  $x$ 's spot

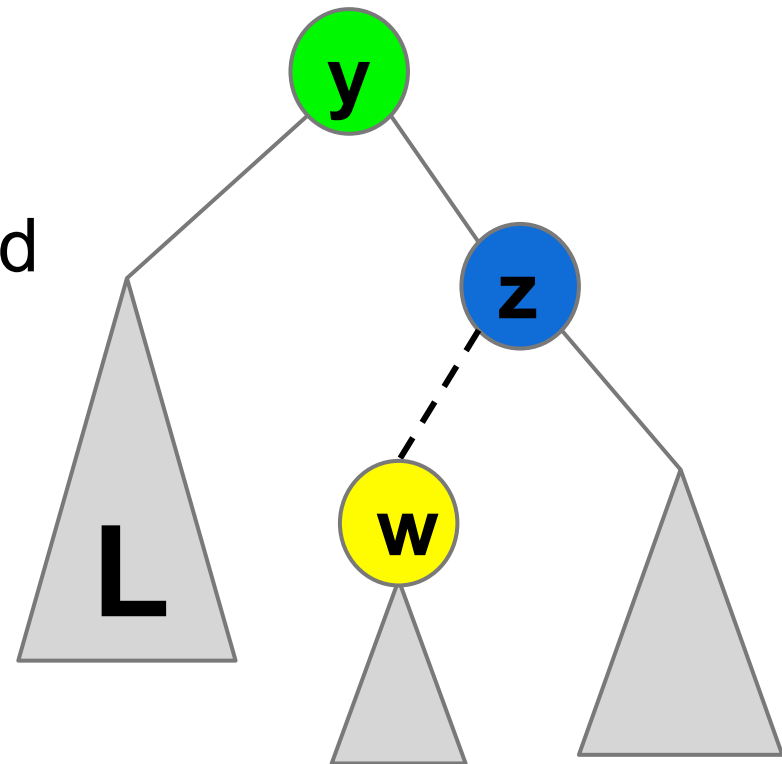
Order:  $y < w < z$



## Case 3.2: $y$ is NOT $x$ 's right child

1. Promote  $w$  to  $y$ 's spot,  $y$  becomes free.
2. Make  $z$  be  $y$ 's right child ( $y$  adopts  $z$ )
3. Promote  $y$  to  $x$ 's spot

Order:  $y < w < z$



**$x$  deleted, BST order maintained, all is good.**

# Summarize TreeDelete(root, x)

→ Case 1: x has no child, **just delete**

→ Case 2: x has one child, **promote**

→ Case 3: x has two children,  $y = \text{successor}(x)$

◆ Case 3.1: y is x's right child, **promote**

◆ Case 3.2: y is NOT x's right child

- **promote** y's right child

- y **adopt** x's right child

- **promote** y

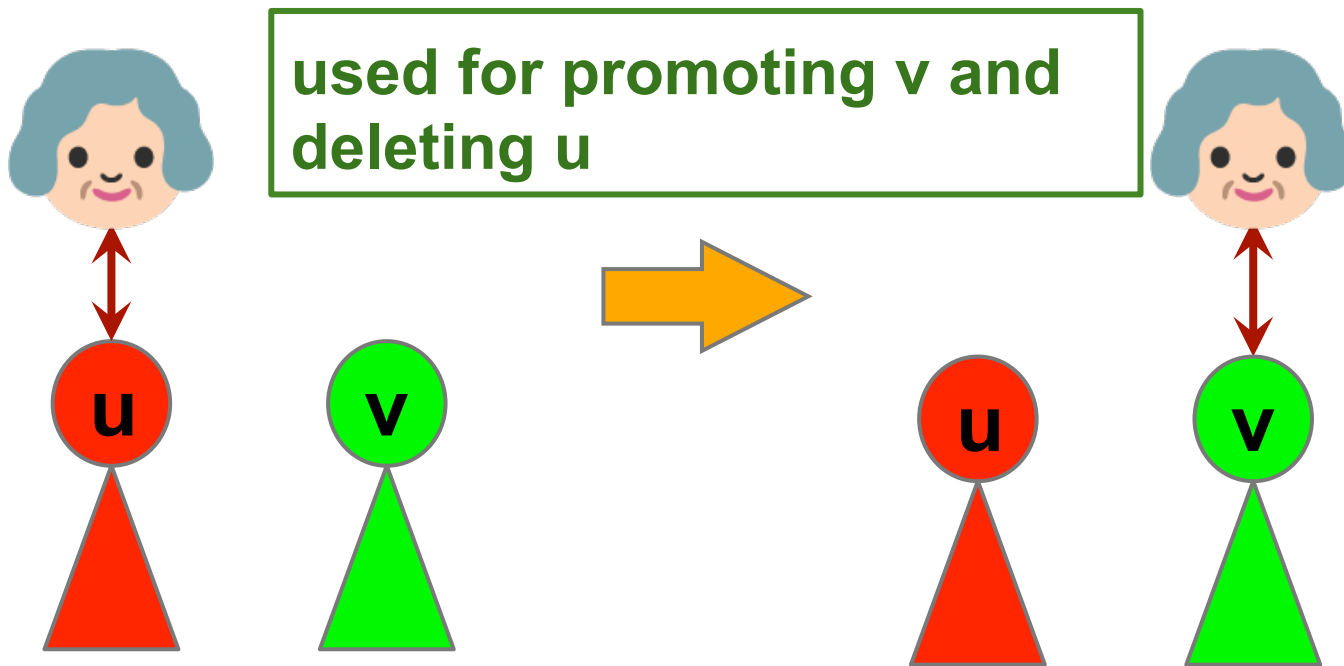


# TreeDelete(root, x): pseudo-code

Textbook Chapter 12.3

**Key:** Understand **Transplant(root, u, v)**

**# v takes away u's parent**



**Transplant(root, u, v):**

**# v takes away u's parent**

**if u.p = NIL: # if u is root**

**root ← v # v replaces u as root**

**elif u = u.p.left: # if u is mom's left child**

**u.p.left ← v #mom accepts v as left child**

**else: # if u is mom's right child**

**u.p.right ← v #mom accept v as right child**

**if v ≠ NIL:**

**v.p ← u.p # v accepts new mom**

**# u can cry now...**



# TreeDelete(root, x):

```
if x.left = NIL:
```

```
    Transplant(root, x, x.right)
```

Promote right child

```
elif x.right = NIL:
```

```
    Transplant(root, x, x.left)
```

Promote left child

```
else:
```

```
    y ← TreeMinimum(x.right)
```

```
    if y.p ≠ x:
```

get successor(x)

```
        Transplant(root, y, y.right)
```

```
        y.right ← x.right
```

y is not right child of x

```
        y.right.p ← y
```

```
    Transplant(root, x, y)
```

promote w

```
    y.left ← x.left
```

```
    y.left.p ← y
```

y adopts z

```
return root
```

promote y

update pointers

Case 1 & 2

Case 3

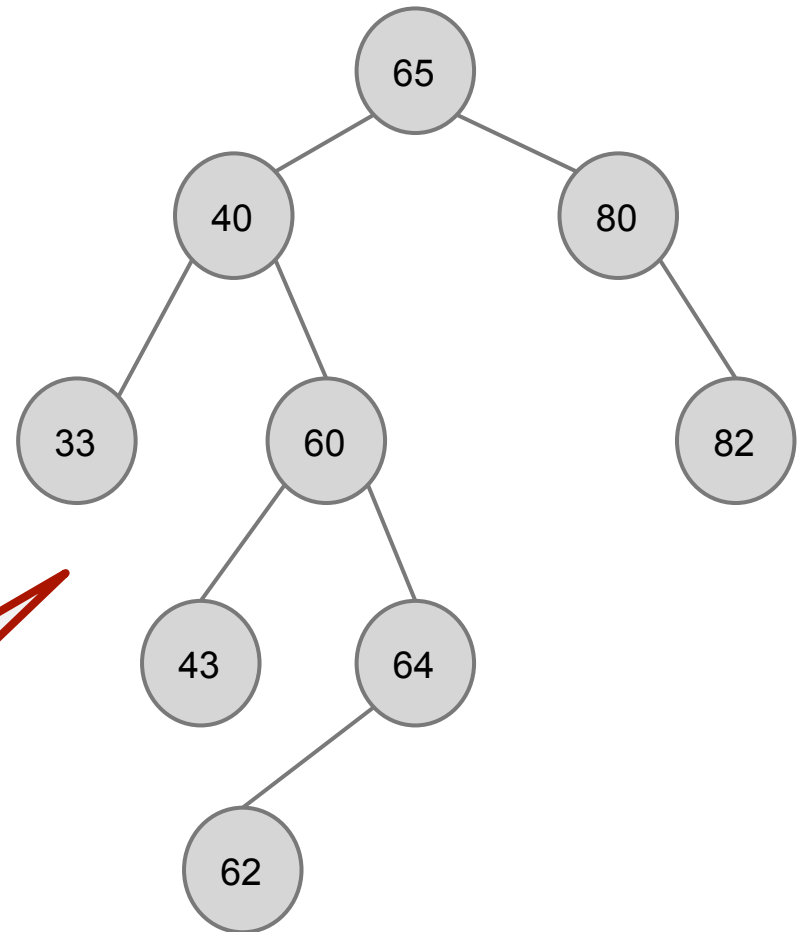
Case 3.2

TreeDelete(root, x) worst case running time  
 **$O(h)$**  (time spent on TreeMinimum)

**Now, about that  $h$   
(height of tree)**

# Definition: height of a tree

The longest path from the root to a leaf, in terms of number of edges.



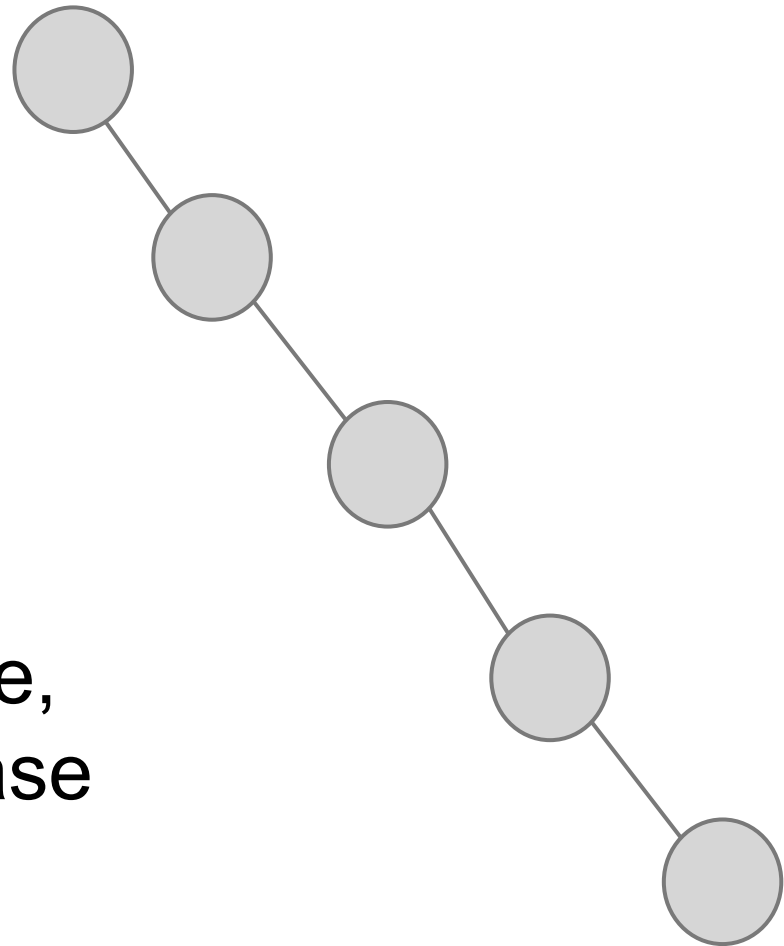
Consider a BST with **n** nodes,  
what's the highest it can be?

$$h = n - 1$$

i.e, in worst case

$$h \in \Theta(n)$$

so all the operations we  
learned with  $O(h)$  runtime,  
they are  $O(n)$  in worst case

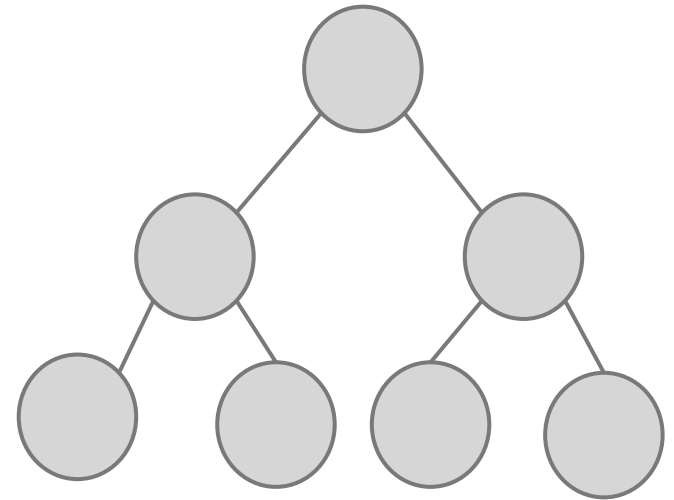


**So, what's the best case for  $h$  ?**

In best case,  $h \in \Theta(\log n)$

**A Balanced BST**

guarantees to have height  
in  $\Theta(\log n)$



Therefore, all the  $O(h)$  become  $O(\log n)$



**Next week**

A Balanced BST called an **AVL tree**