



Dictionary: **Binary Search Tree**

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Lecture 3

Announcements

- Midterm:
 - [LECo101, LEC2003](#): Fri, Oct 27, 10:00-11:00
 - [LECo201, LEC2000, LEC2201](#): Fri, Oct 27, 13:00-14:00
 - Location will be announced.
- Tutorial on Friday:

Textbook exercise: 12.2-6, 12.2-7, 12.2-8, 12-2
and problem 6-3 from Chapter 6.

Dictionary

Search



Today

- Dictionary
- **Binary Search Tree** (BST)
 - Tree Traversals (**Inorder**, Preorder and Postorder)
 - Successor and Predecessor
 - Operations
 - Search
 - Insert
 - Delete
 - Height of a BST

Reading Assignments

Part III (introduction), Sections 12.1, 12.2, 12.3

Abstract Data Type: Dictionary

Objects:

Set of elements where each element x has field $x.key$.

Keys are some **totally ordered value**, the keys are **distinct**.

Operations:

- **SEARCH(S, k)**: return x in S s.t. $x.key = k$, or NIL if no such x
- **INSERT(S, x)**: insert x in S ; if some y in S has $y.key = x.key$, replace y by x .
- **DELETE(S, x)**: remove **node** x from S

Implement a Dictionary using
simple data structures

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

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

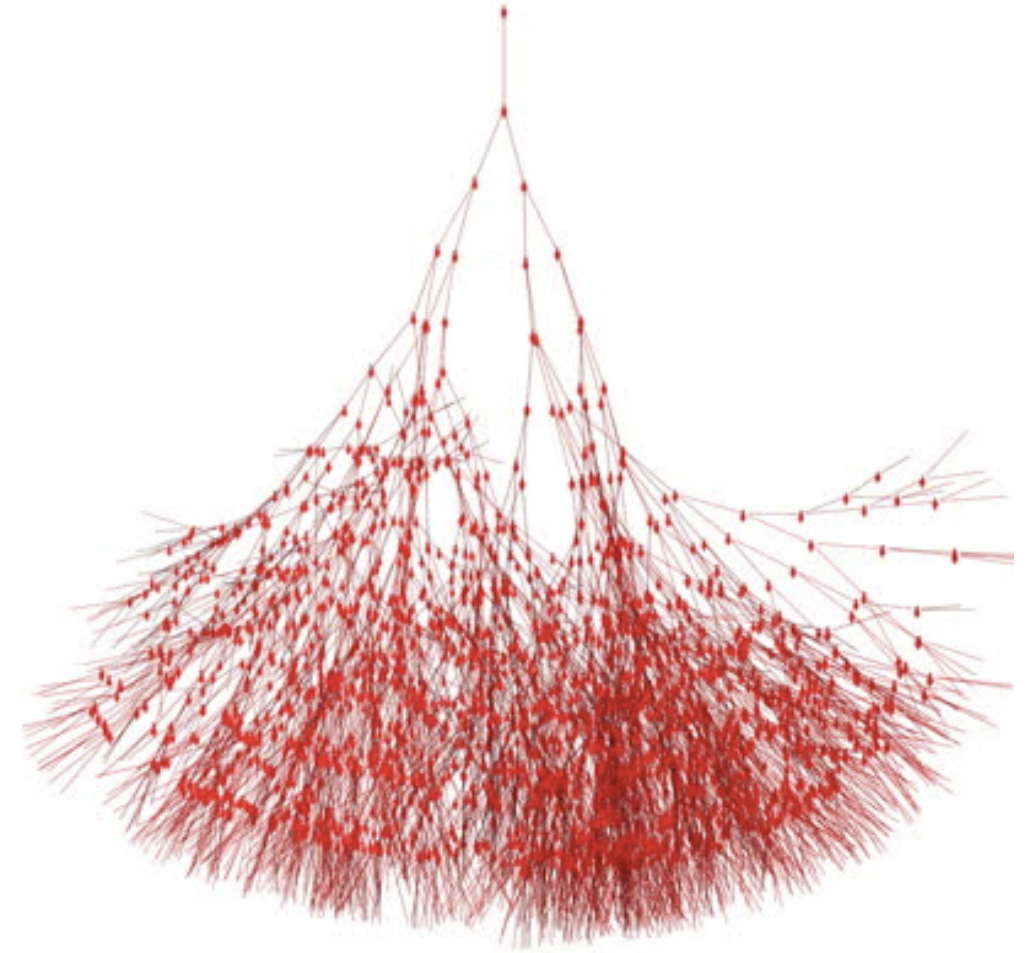
Delete(S , x)

- $O(1)$ worst case
- Delete at front, everything has to shift to front

Better data structures?

	Unsorted list	Sorted Array	BST	Balanced BST
Search	$O(n)$	$O(\log n)$	$O(n)$	$O(\log n)$
Insert	$O(n)$	$O(n)$	$O(n)$	$O(\log n)$
Delete	$O(1)$	$O(n)$	$O(n)$	$O(\log n)$

Binary Search Tree



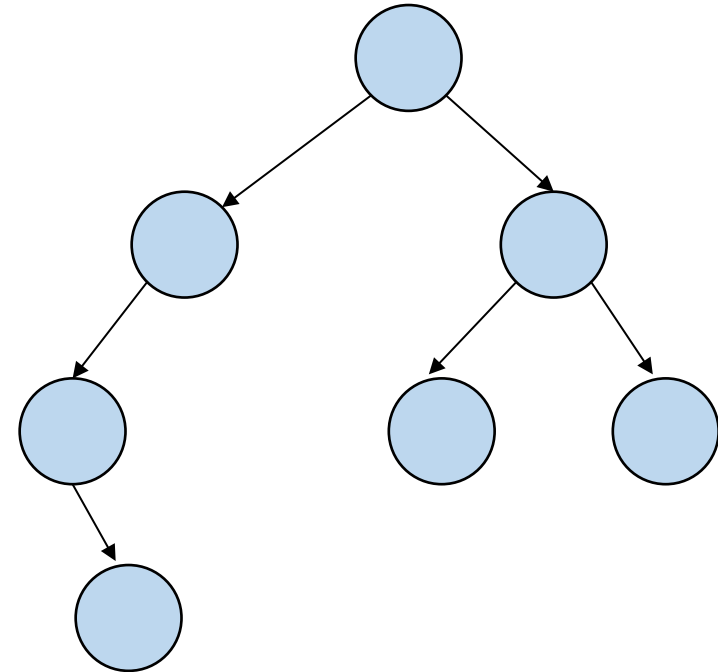
Binary Tree

Binary tree is a linked structure with

- root
- left subtree (*maybe empty*)
- right subtree (*maybe empty*)
- Parent (*maybe empty*)

Representation:

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



Binary Search tree property

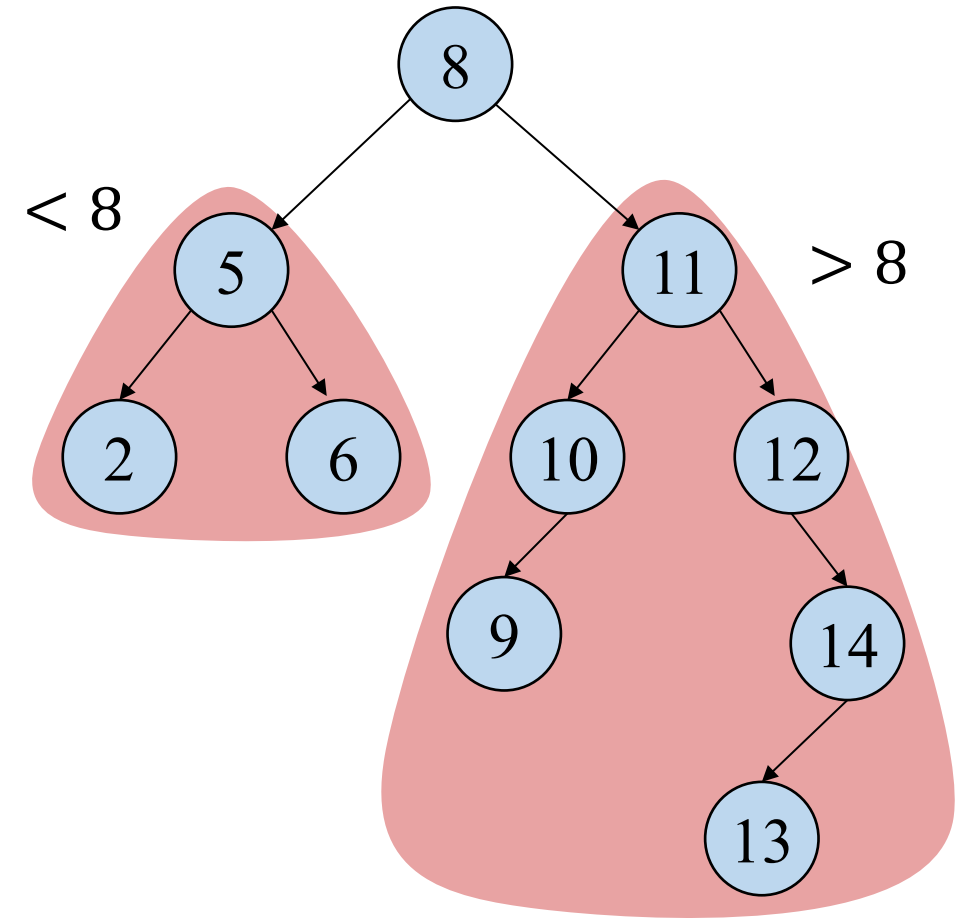
All keys in left subtree smaller than root's key

All keys in right subtree larger than root's key

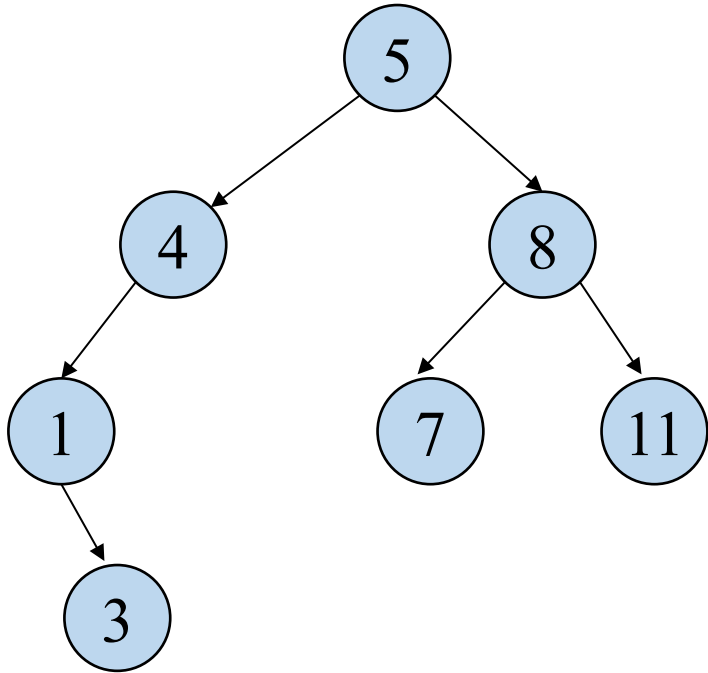
Therefore:

easy to find any given key

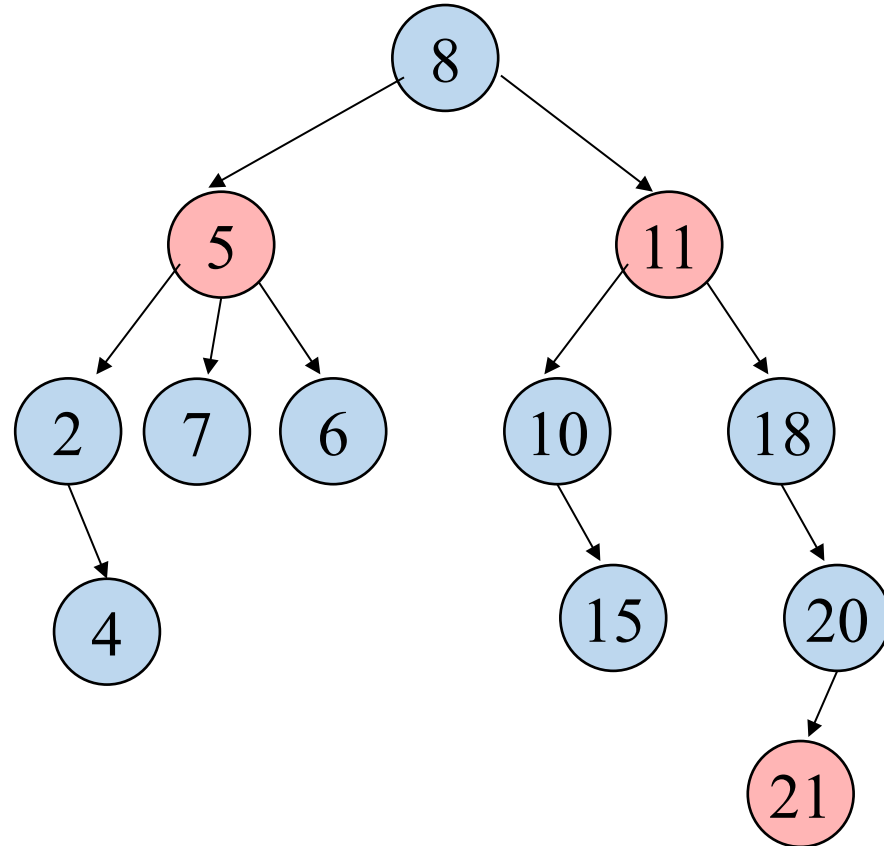
Insert/delete by changing links



Binary Search Tree - Example



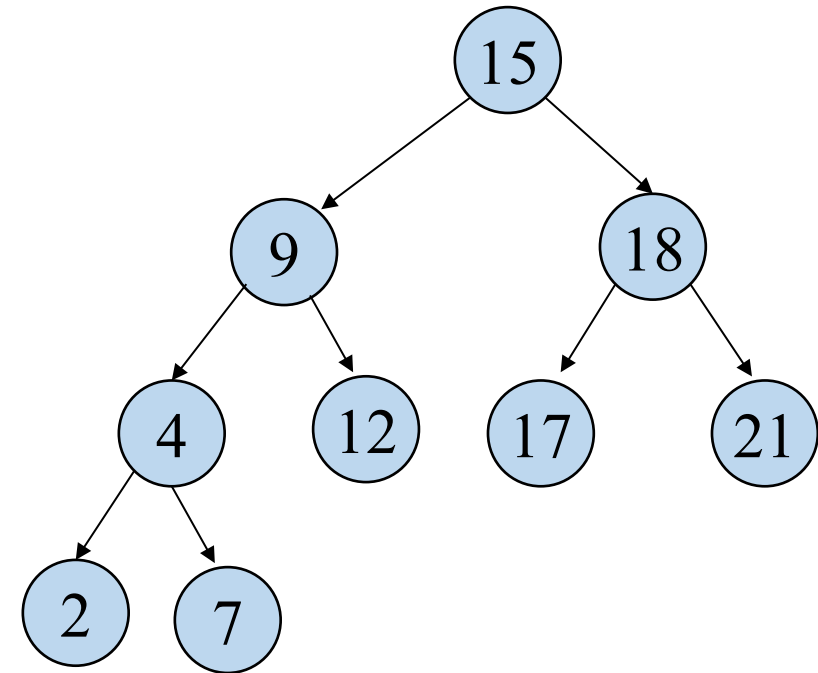
BINARY SEARCH TREE



NOT A
BINARY SEARCH TREE

Complete Binary Search Tree

Links are completely filled, except possibly bottom level, which is filled left-to-right.



Tree Traversal

Tree Traversal refers to the process of visiting each node in a tree, exactly once.

- **Inorder**: visits the root of a subtree between visiting the nodes in its left subtree and visiting those in its right subtree.

The binary-search-tree property allows us to print out all the keys in a binary search tree in sorted order by **inorder tree** walk.

- **Preorder**: visits the root before the elements in either subtree,
- **Postorder**: visits the root after the elements in its subtrees.

Inorder Walk

visit **left** subtree

visit **node**

visit **right** subtree

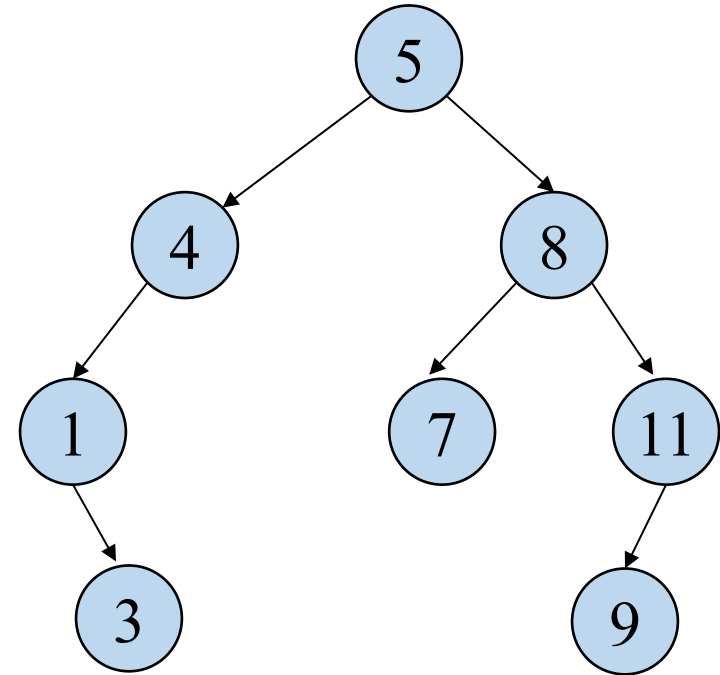
INORDER-TREE-WALK(x)

if $x \neq NIL$

INORDER-TREE-WALK($x.left$)

print $x.key$

INORDER-TREE-WALK($x.right$)



In order listing:

$1 \rightarrow 3 \rightarrow 4 \rightarrow 5 \rightarrow 7 \rightarrow 8 \rightarrow 9 \rightarrow 11$

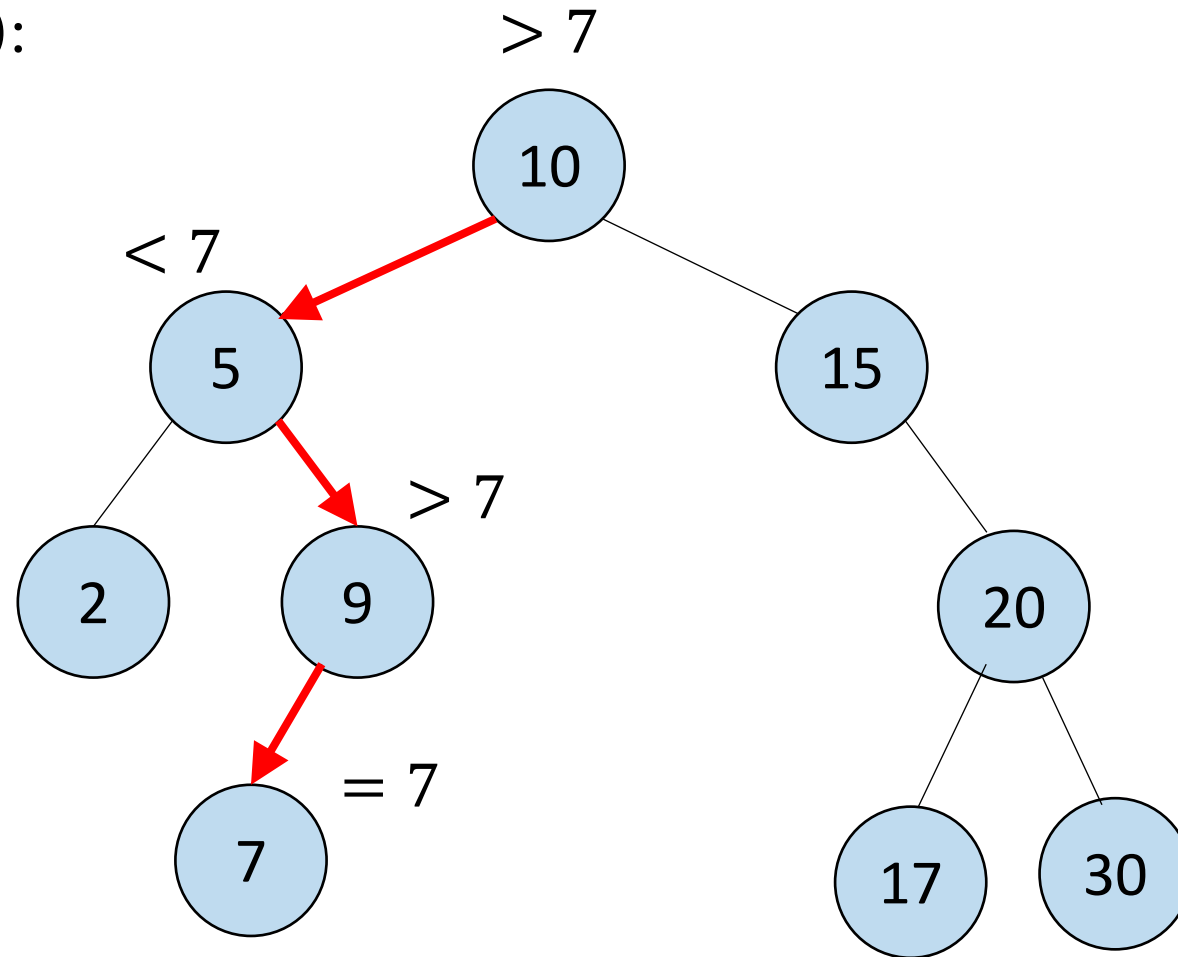
What does this guarantee with a BST?

Operations on a BST

- read-only operations
 - TreeSearch(root, k)
 - TreeMinimum(x) / TreeMaximum(x)
 - Successor(x) / Predecessor(x)
- modifying operations
 - TreeInsert(root, x)
 - TreeDelete(root, x)

Search in a BST - Example

TreeSearch(root, 7):



Search in a BST - Recursive

TreeSearch(root, k):

if root = NIL or k = root.key:

return root

if k < root.key:

return TreeSearch(root.left, k)

else:

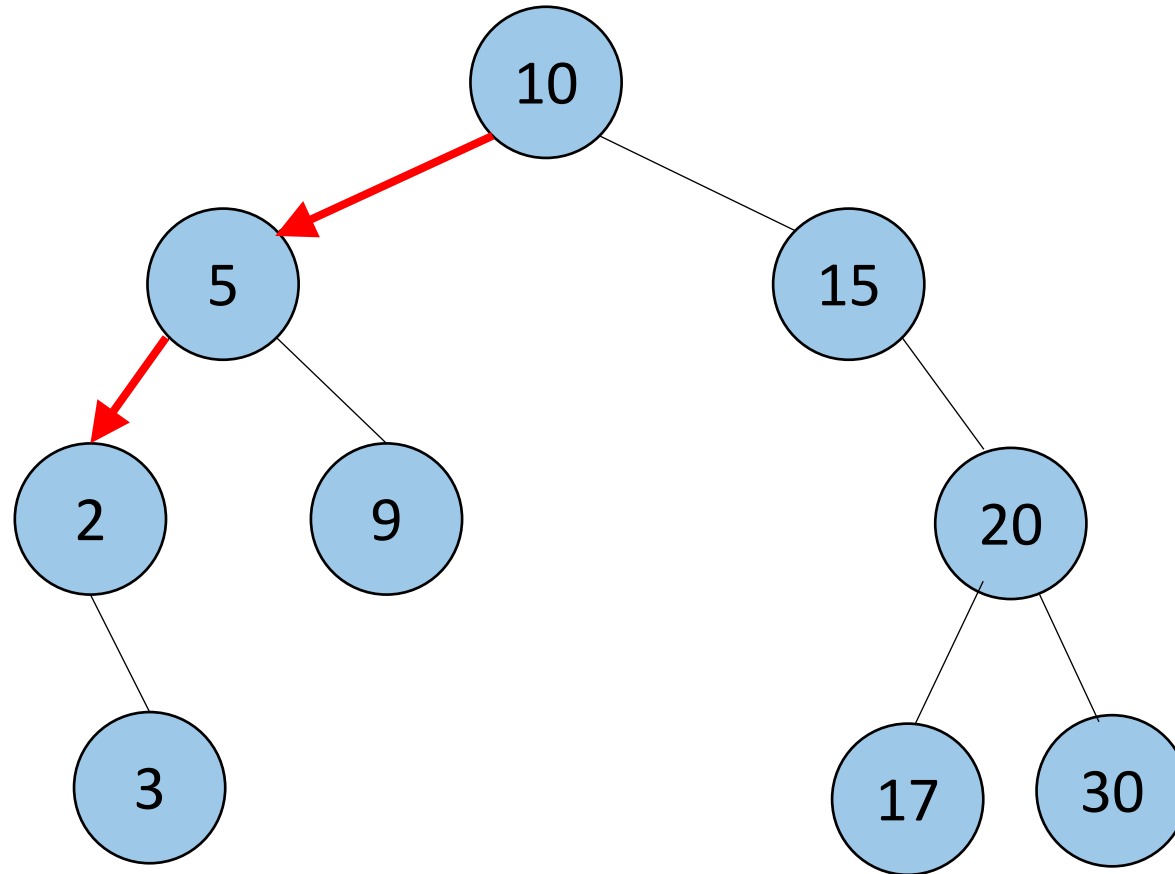
return TreeSearch(root.right, k)

Runtime:

- Worst case
 $\Theta(h)$

TreeMinimum(x): Example

TreeMinimum(root):



TreeMinimum(x): pseudo-code

TreeMinimum(x):

```
while  $x.left \neq NIL$ :  
     $x \leftarrow x.left$   
return  $x$ 
```

Runtime:

- Worts case
 $\Theta(h)$

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

Successor(x) and Predecessor

- Successor(x):

Find the node with the smallest key larger than x . (The node which is the successor of x in the sorted list obtained by inorder traversal.)

- Predecessor(x)

Find the node with the largest key smaller than x . (The node which is the predecessor of x in the sorted list obtained by inorder traversal.)

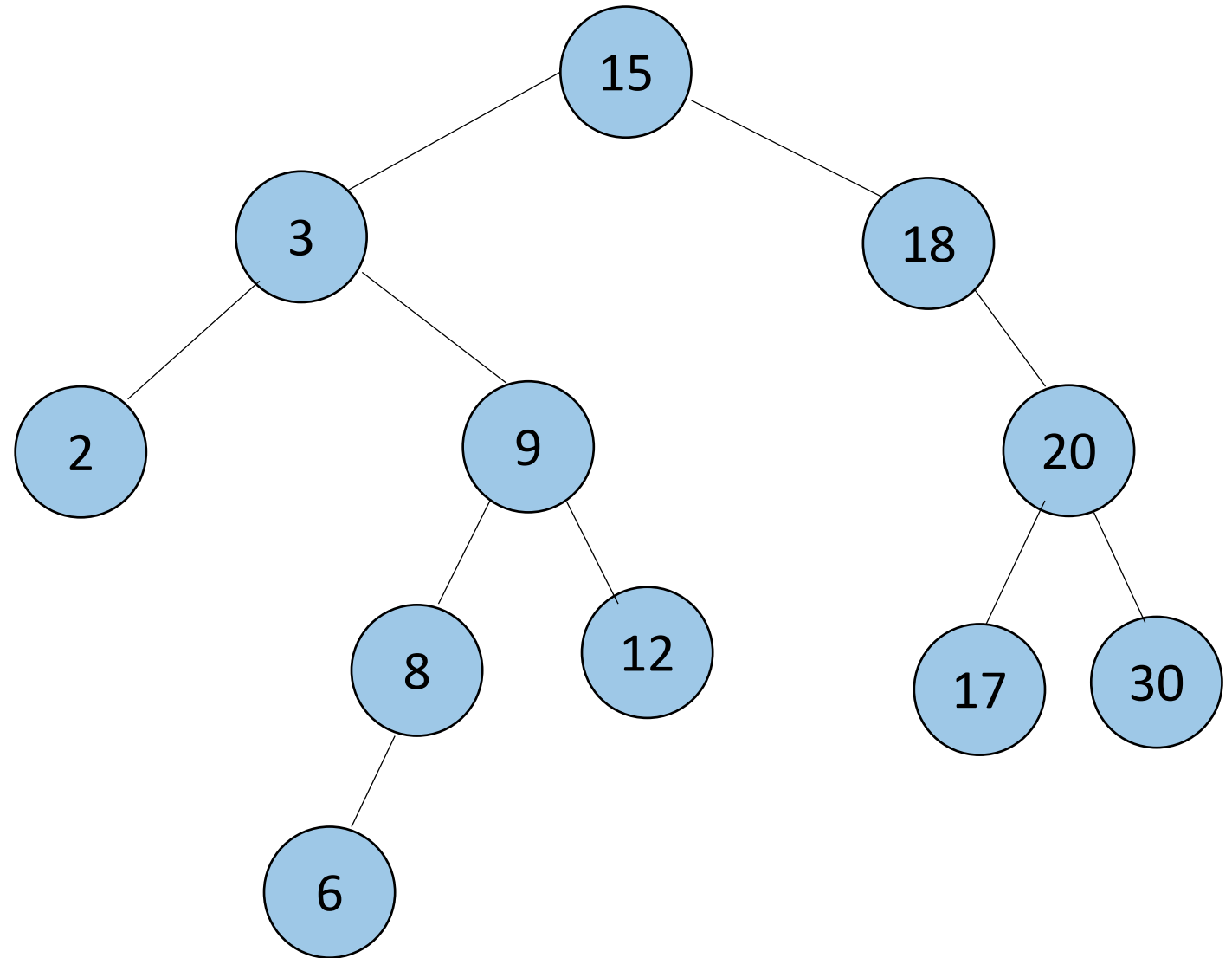
Successor(x) - Example

Successor(2)?

Successor(3)?

Successor(12)?

Successor(18)?



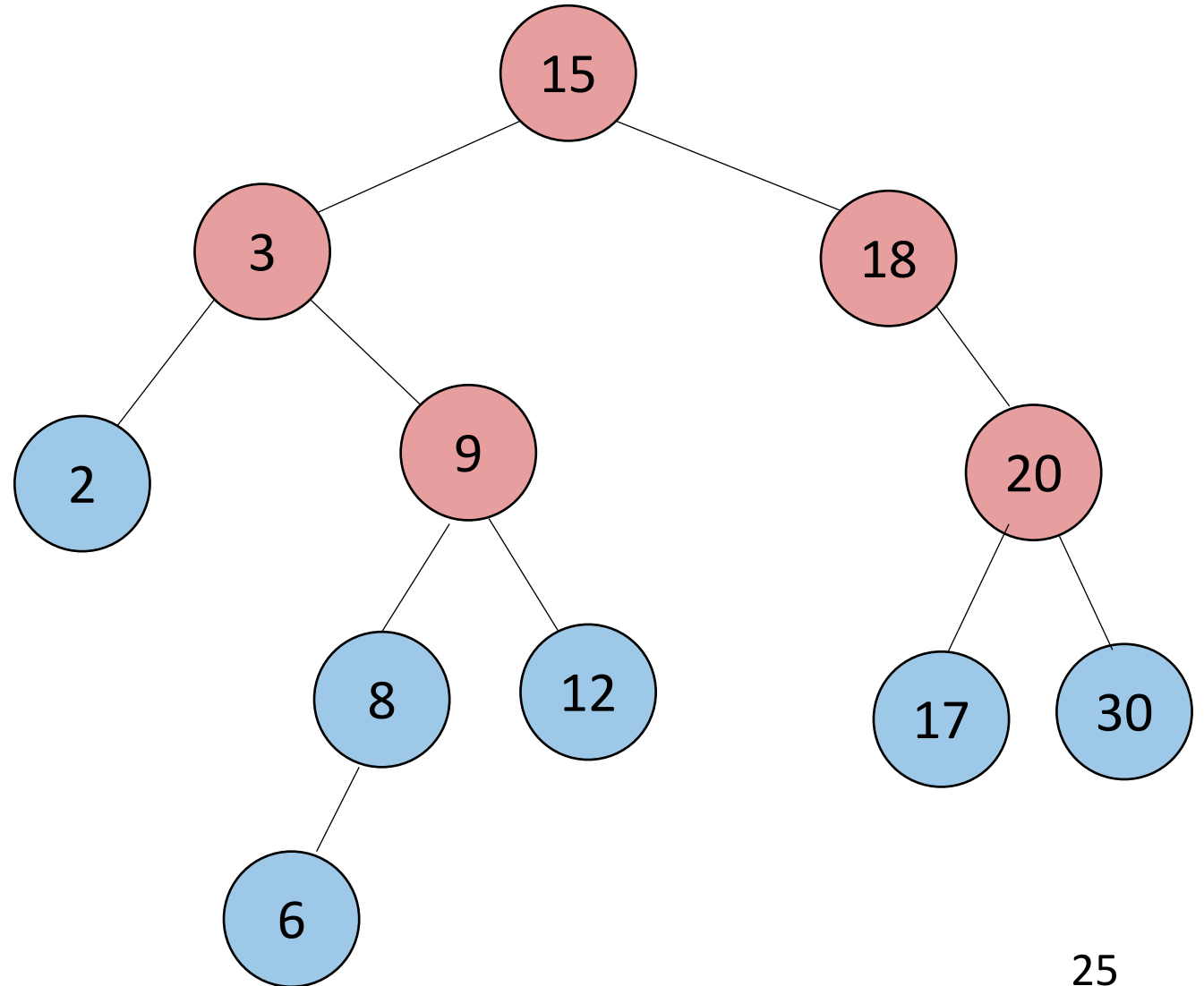
It is all over
the place!!



Successor(x) - Cases

Successor(x) Organize into two cases

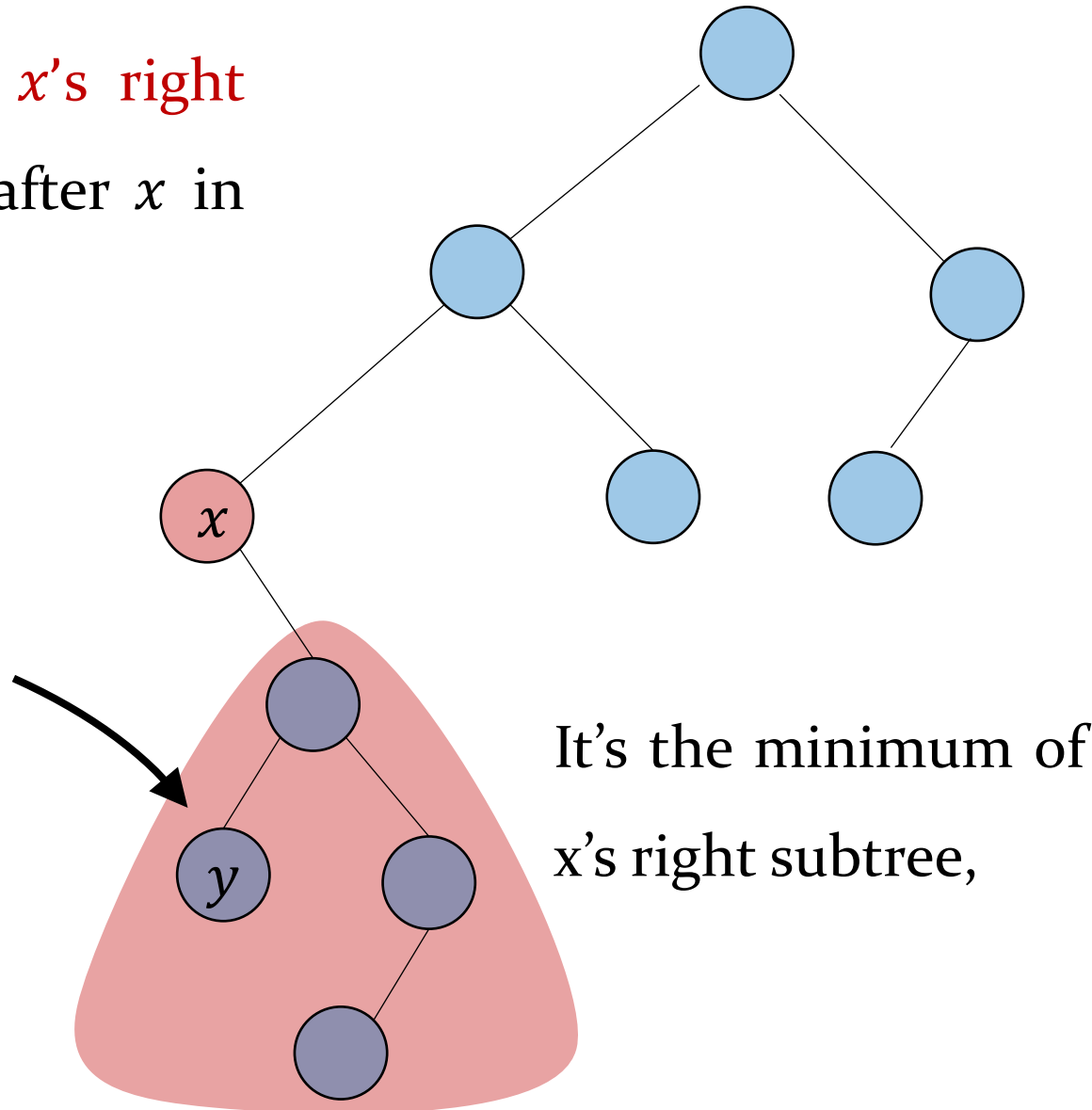
- x has a right child
- x does not have a right child



Case 1: x has a right child

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

TreeMinimum($x.right$)

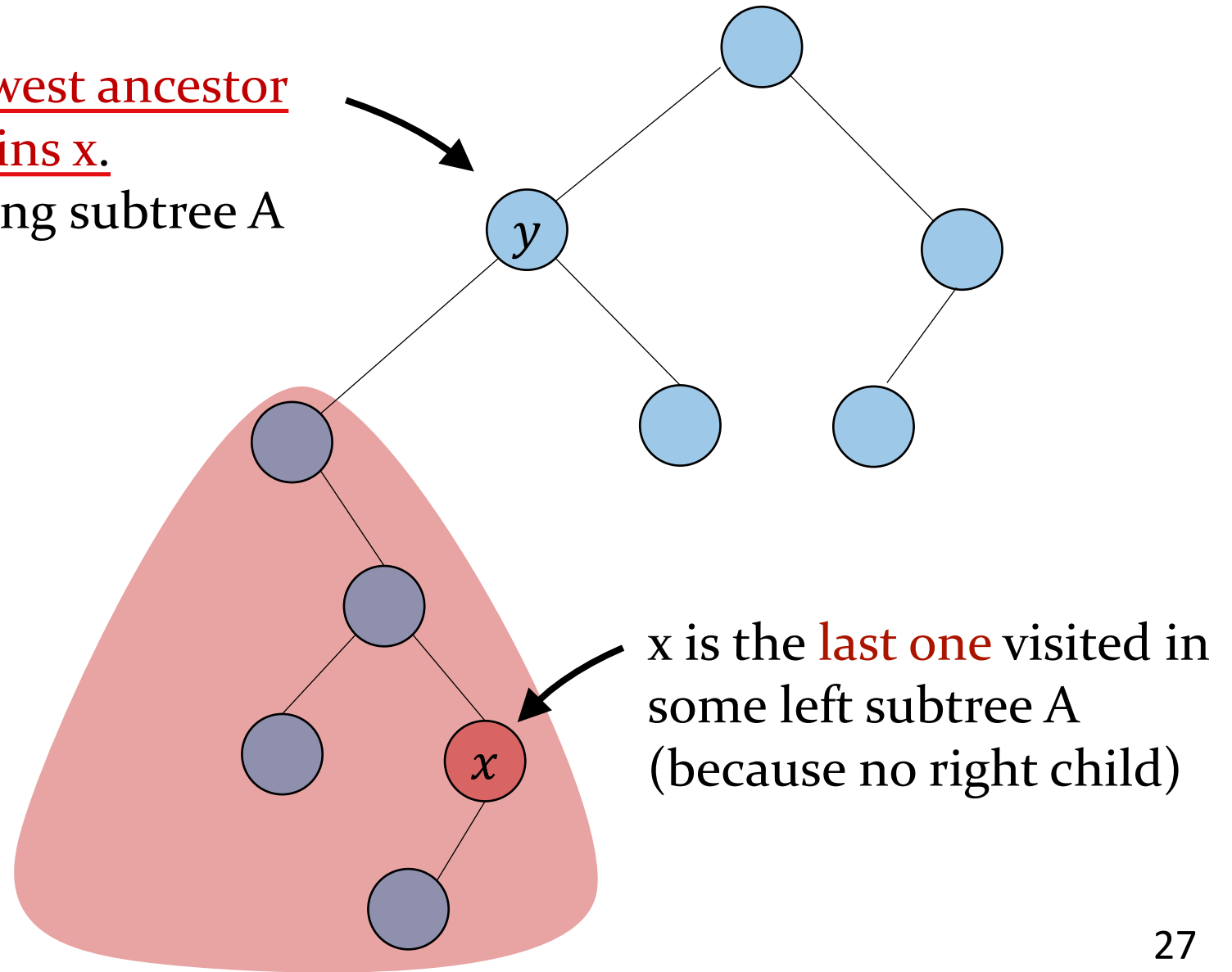


It's the minimum of x 's right subtree,

Case 2: x does not have a right child

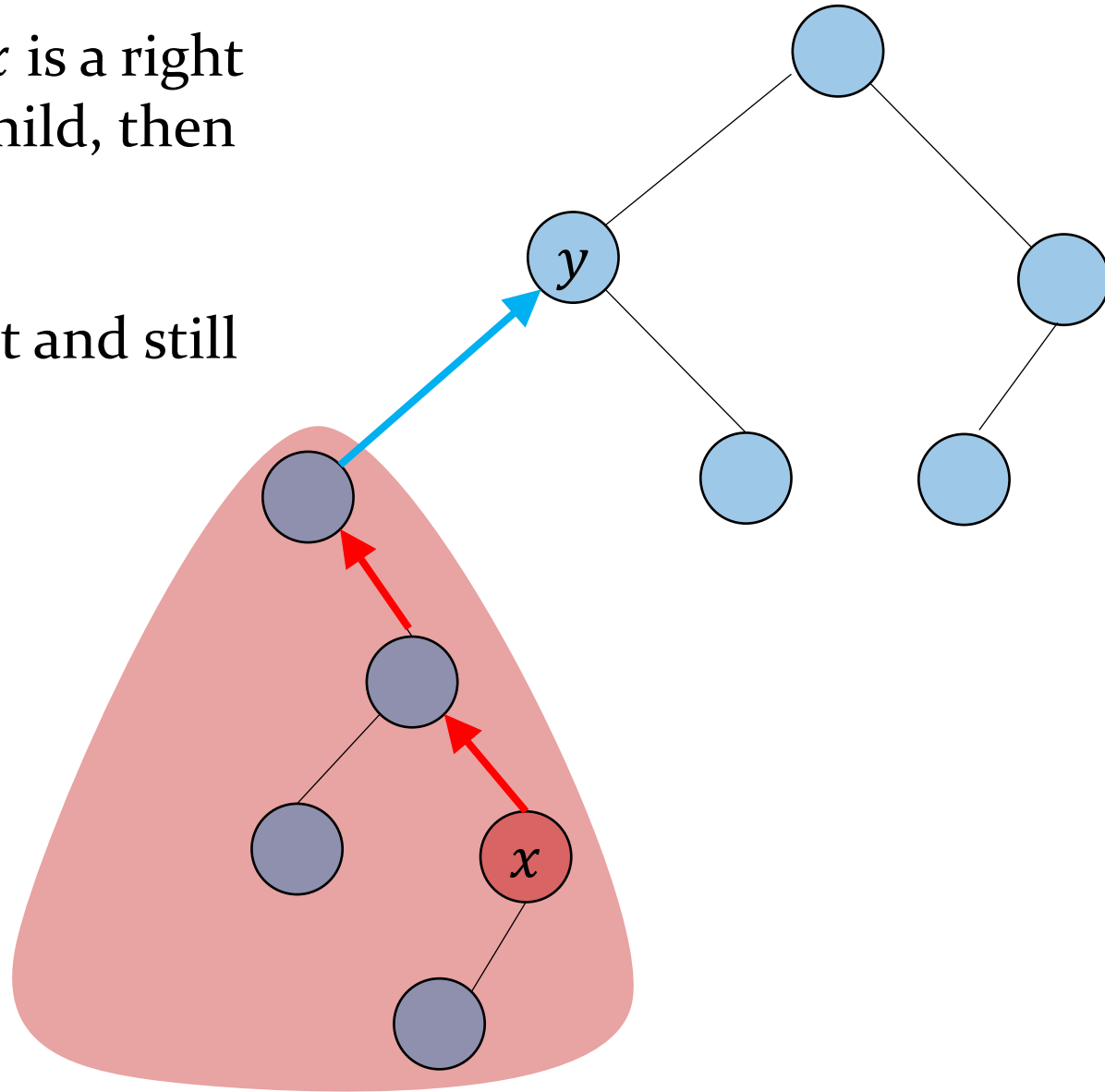
The successor y of x is the lowest ancestor of x whose left subtree contains x .

(y is visited right after finishing subtree A in inorder traversal)



Case 2: 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) - Sudocode

Successor(x):

if x.right \neq NIL:

 return TreeMinimum(x.right)

y \leftarrow x.p

while y \neq NIL and x = y.right #x is right child

 x = y

 y = y.p # keep going up

return y

Worstcase Runtime:

$O(h)$

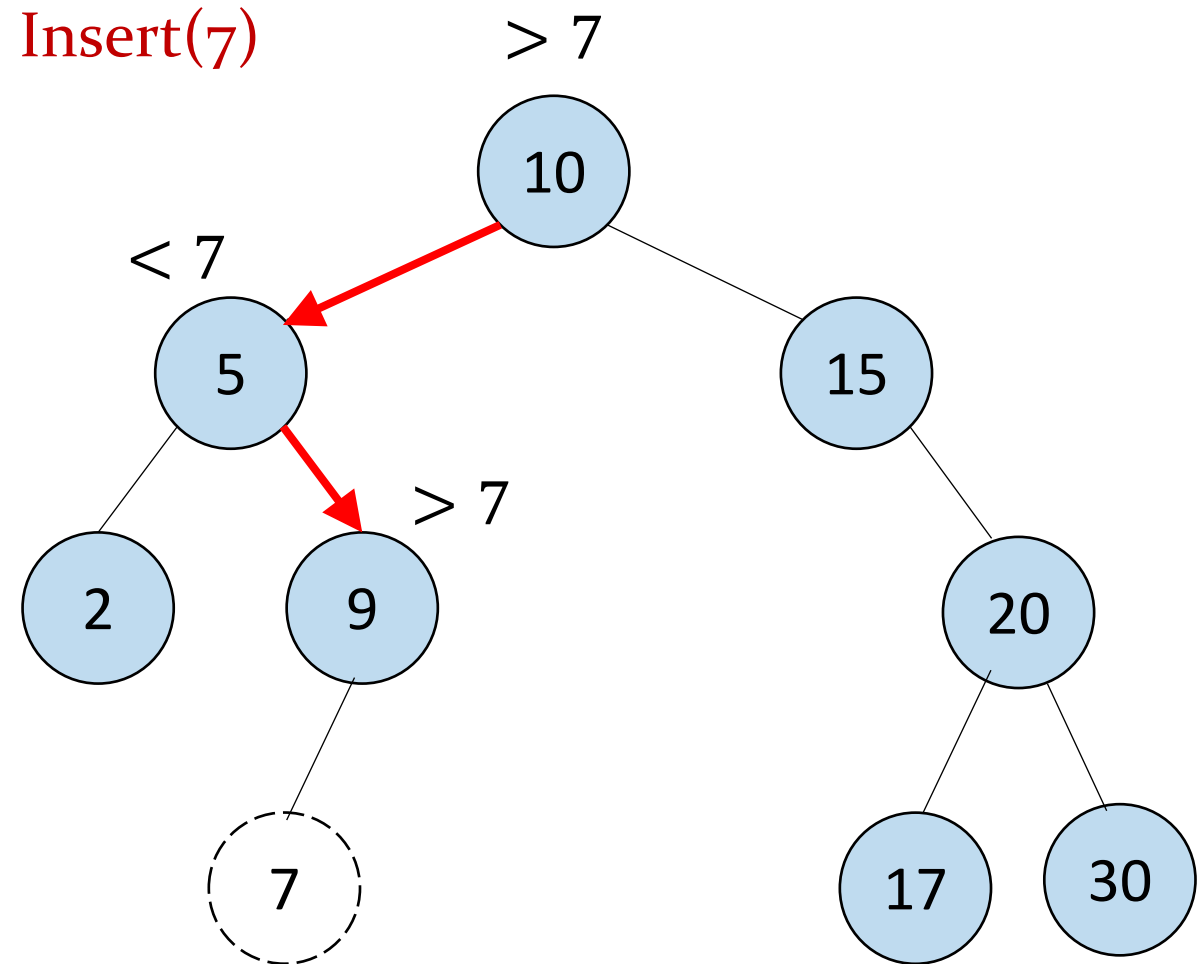
TreeInsert(root, x)

Insert node x into the BST

if $\exists y, \ y.key = x.key$, replace y with x

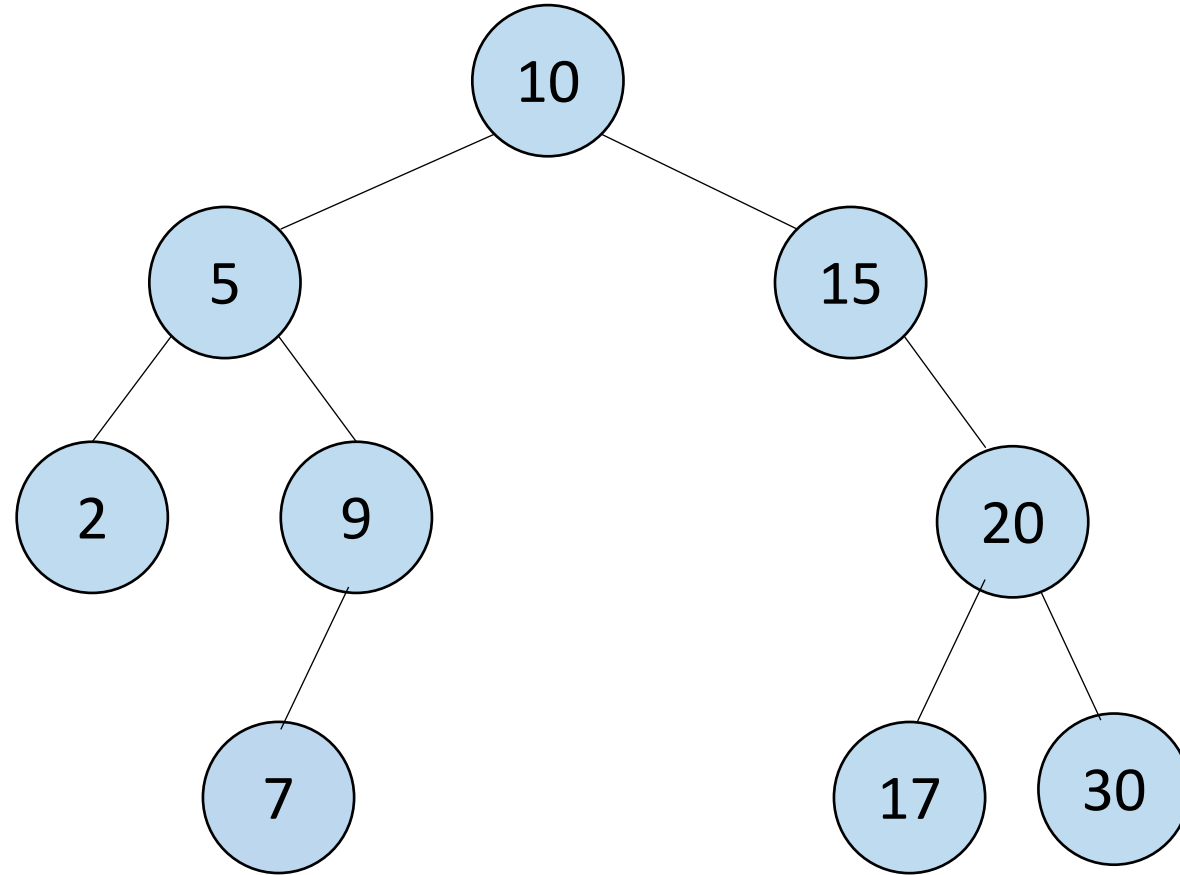
TreeInsert($root, x$) - example

- Proceed down tree as in Find
- If the key is found replace with the new element
- If new key not found, then insert a new node at last spot traversed



TreeInsert ($root, x$) – Practice example 1

Insert(18)



TreeInsert($root, x$) – Pseudocode

TreeInsert($root, x$): # insert and return the new root

if $root = NIL$:

$root \leftarrow x$

elif $x.key < root.key$

$root.left \leftarrow TreeInsert(root.left, x)$

elif $x.key > root.key$:

$root.right \leftarrow TreeInsert(root.right, x)$

else

$x.key = root.key$:

replace $root$ with x

update $x.left, x.right$

return $root$

Worst case running time:
 $O(h)$

Insert sequence - Practice

Question 1: Is it possible that a different BST results when we try to insert the same sequence in an empty binary tree in a different order?

Question 2: Insert the following sequence number in an empty binary search tree. 14, 8, 16, 15, 9, 3, 17

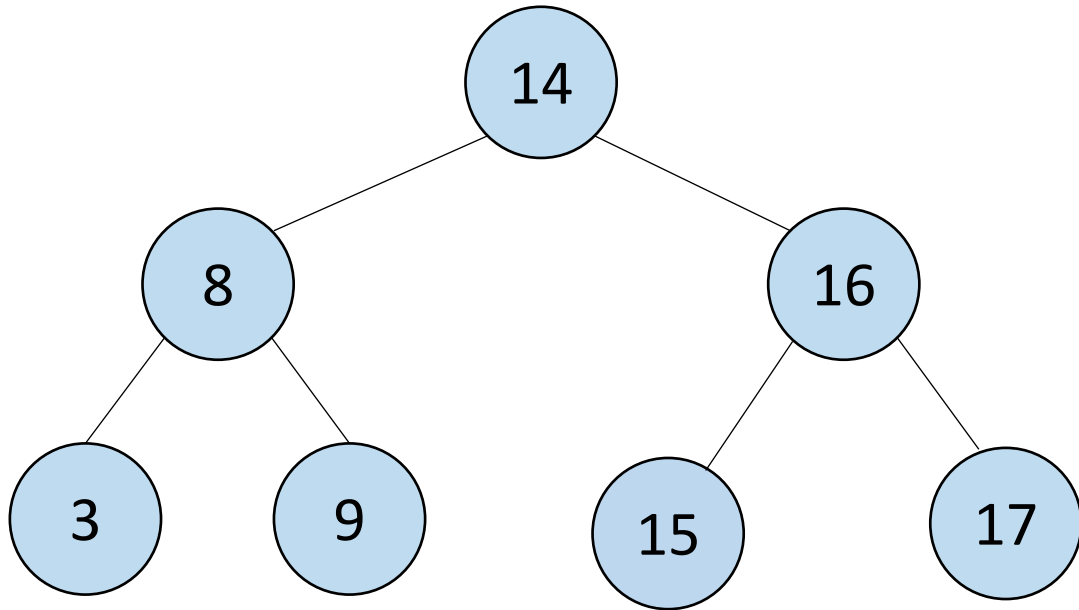
What is the height of the tree?

Question 3: Insert the following sequence number in an empty binary search tree. 3, 8, 9, 14, 17, 16, 15

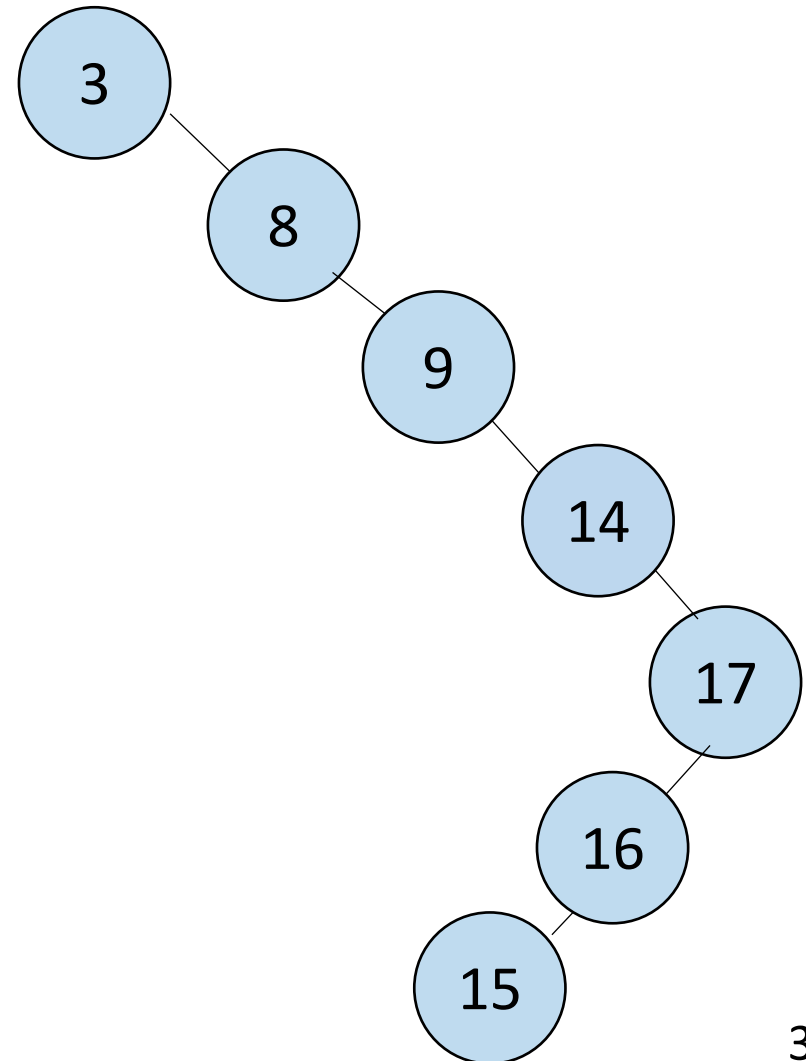
What is the height of the tree?

Insert sequence

Insert sequence: 14, 8, 16, 15, 9, 3, 17



Insert sequence: 3, 8, 9, 14, 17, 16, 15



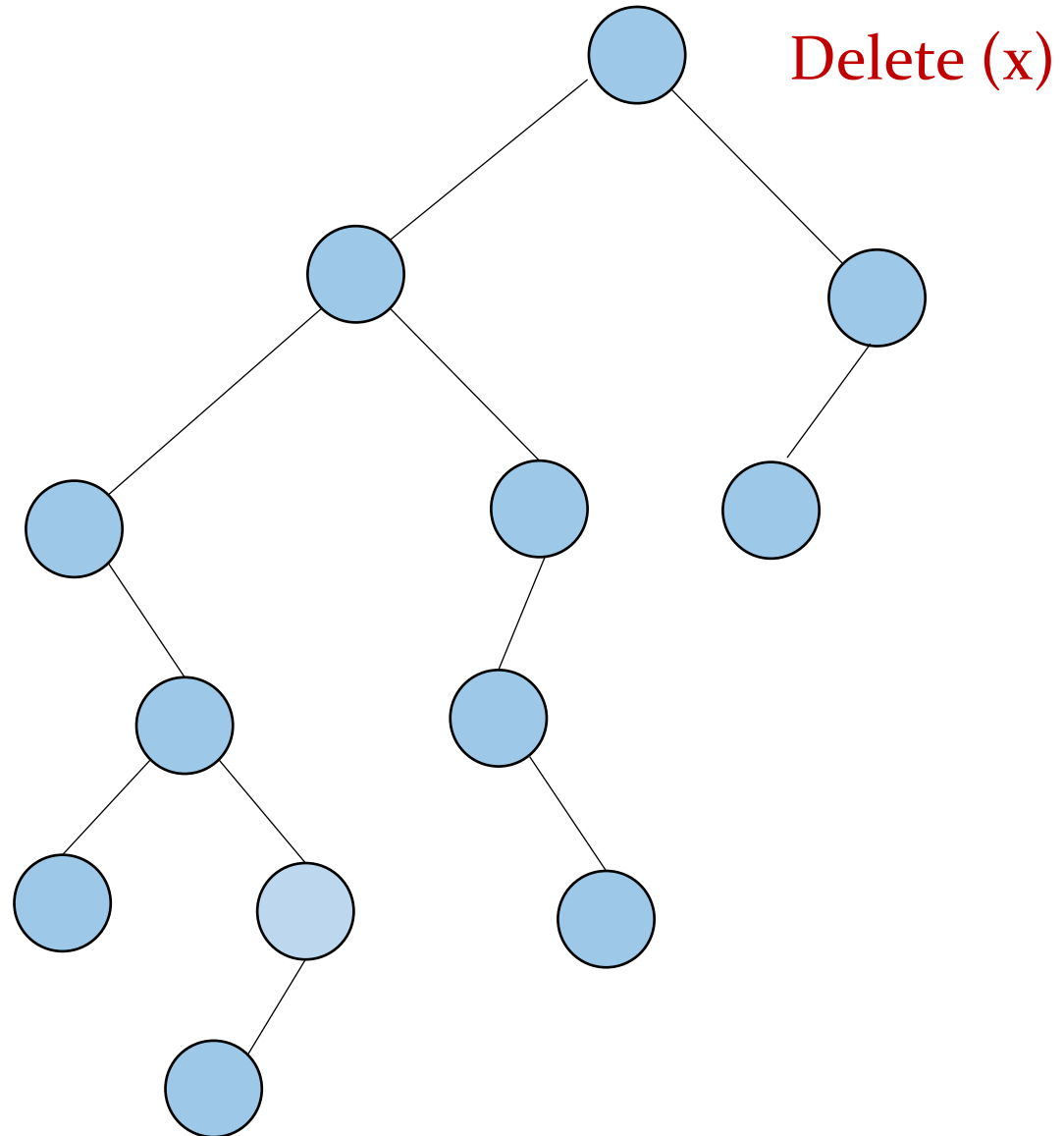
TreeDelete(root, x)

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

TreeDelete ($root, x$) - cases

Tree Cases:

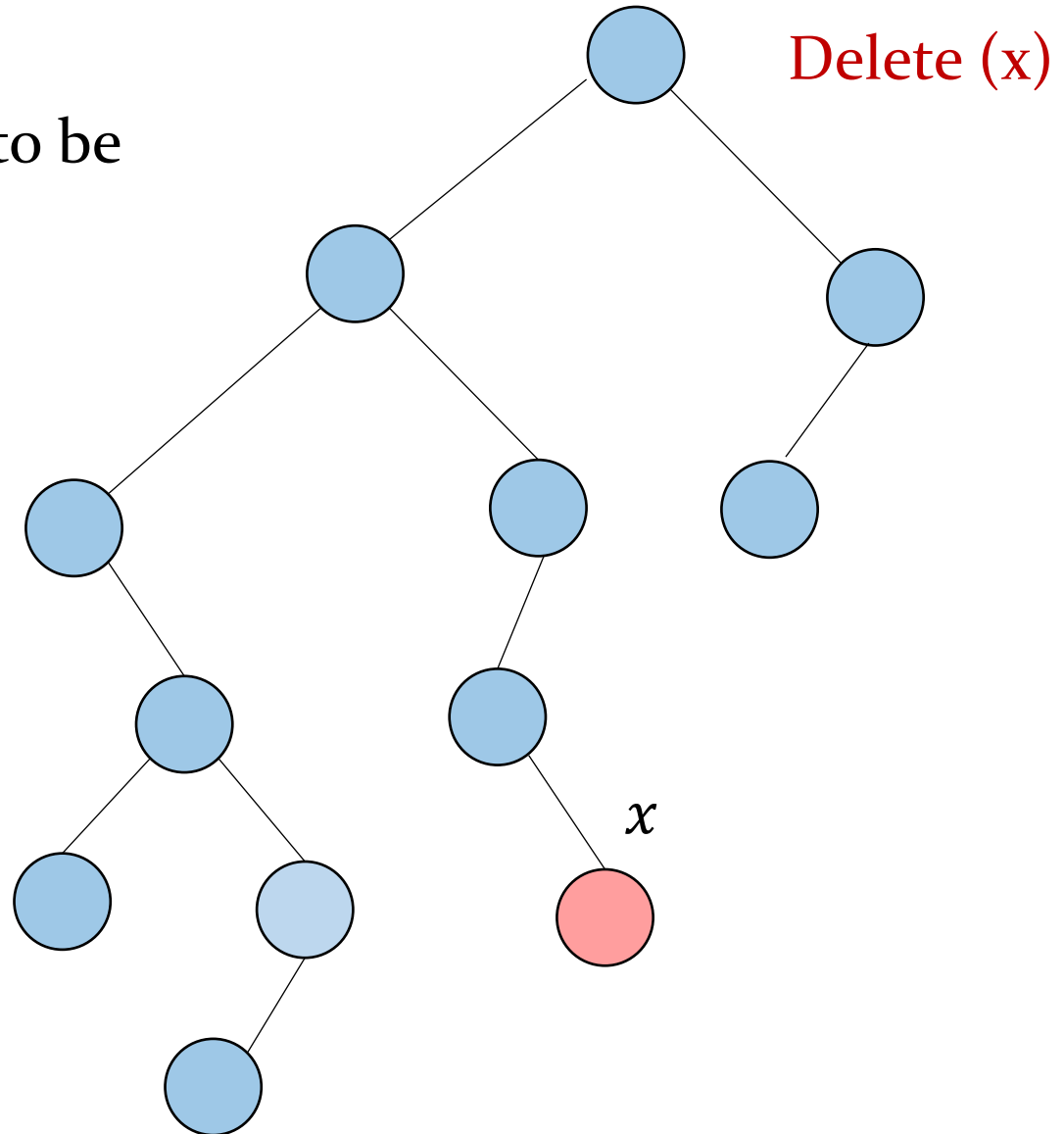
- Case 1: x has **no** child
- Case 2: x has **one** child
- Case 3: x has **two** children



Case 1

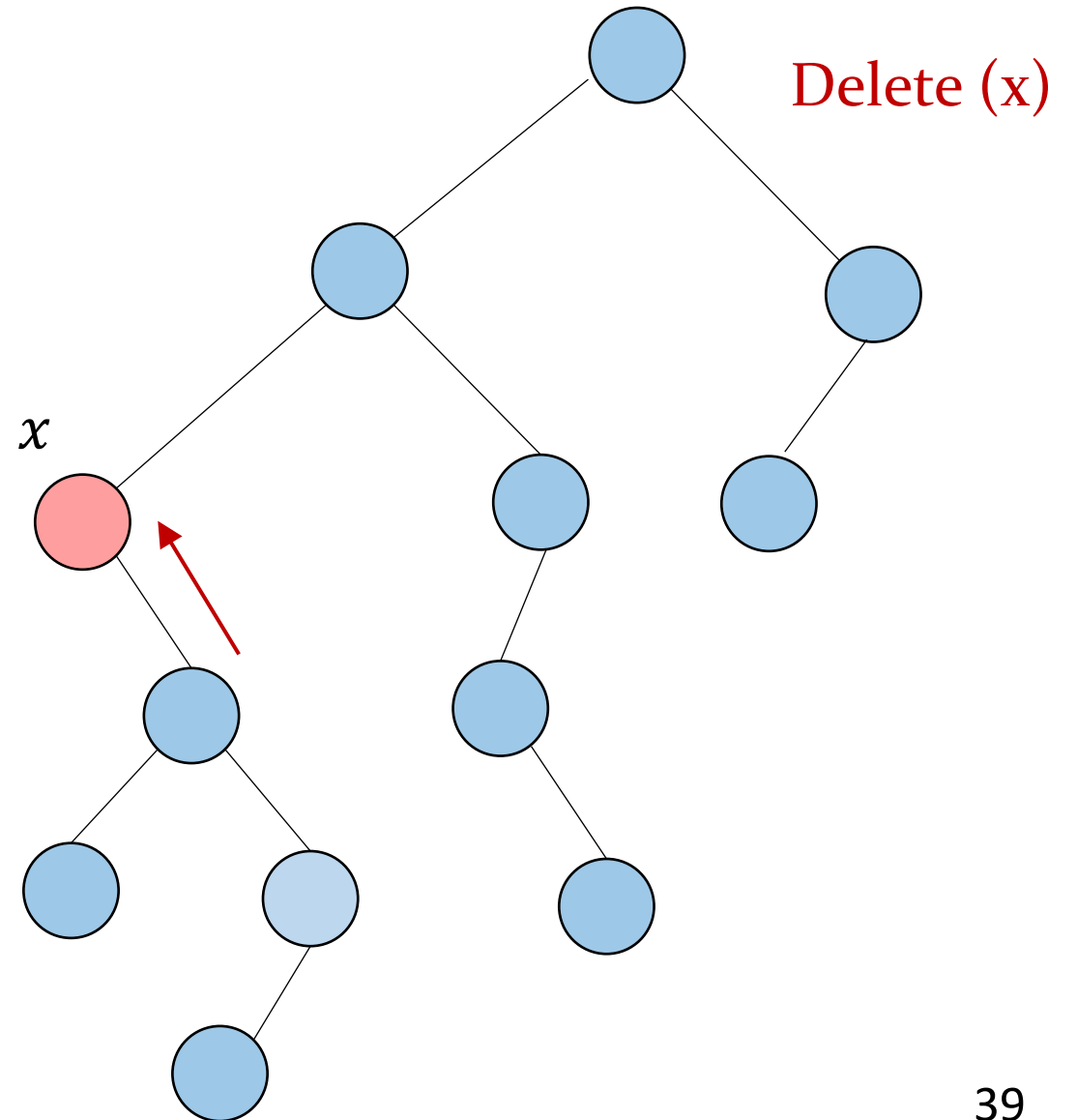
- **x has no child**

Just delete it, nothing else need to be changed.



Case 2

- 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.
 - The procedure is called Transplant in the textbook.



Case 1, 2 - pseudocode

TRANSPLANT(*T*, *x*, *y*)

if *x.p* == *NIL*

T.Root = *y*

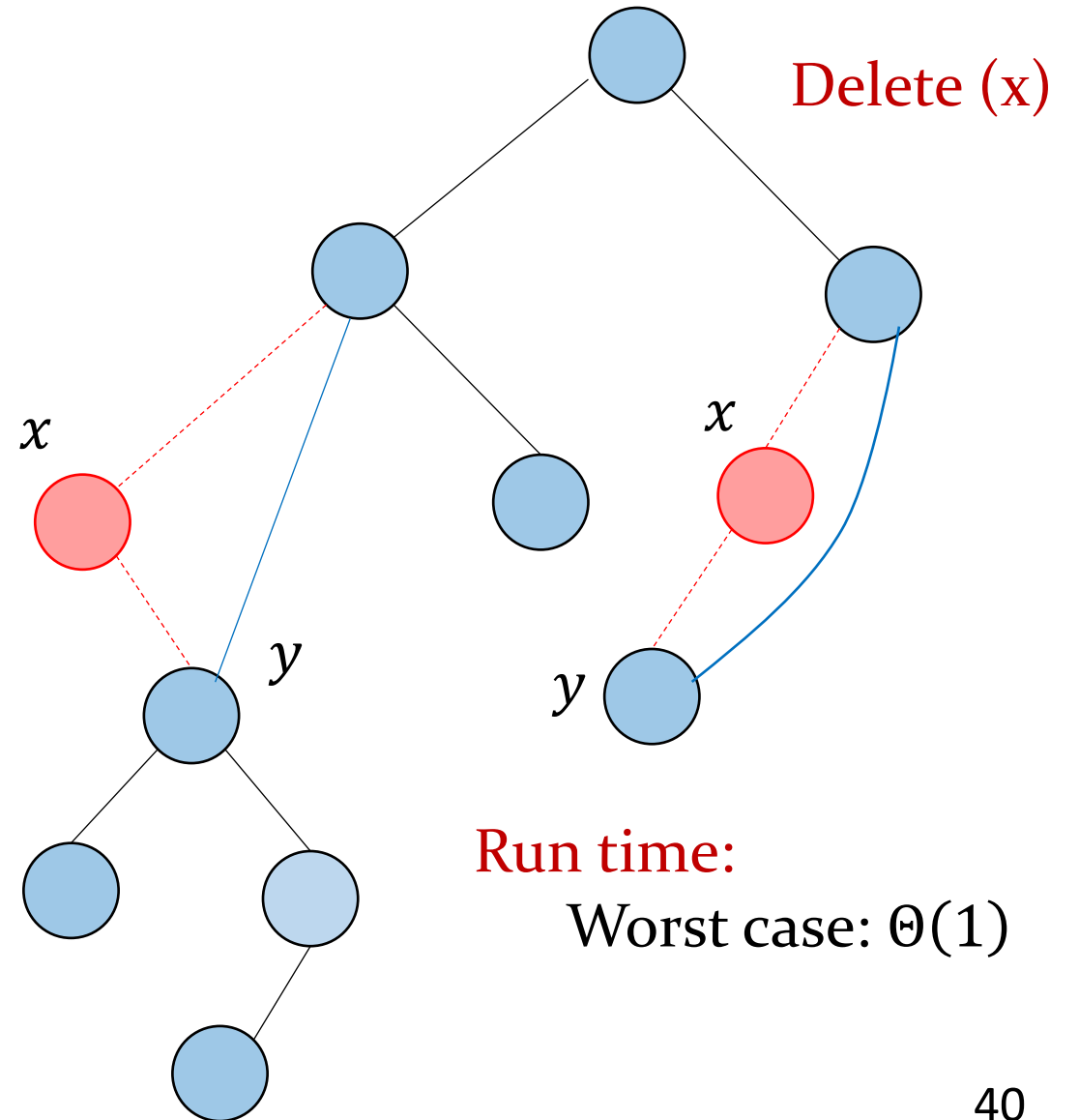
elseif *x* == *x.p.left*

x.p.left = *y*

else *x.p.right* = *y*

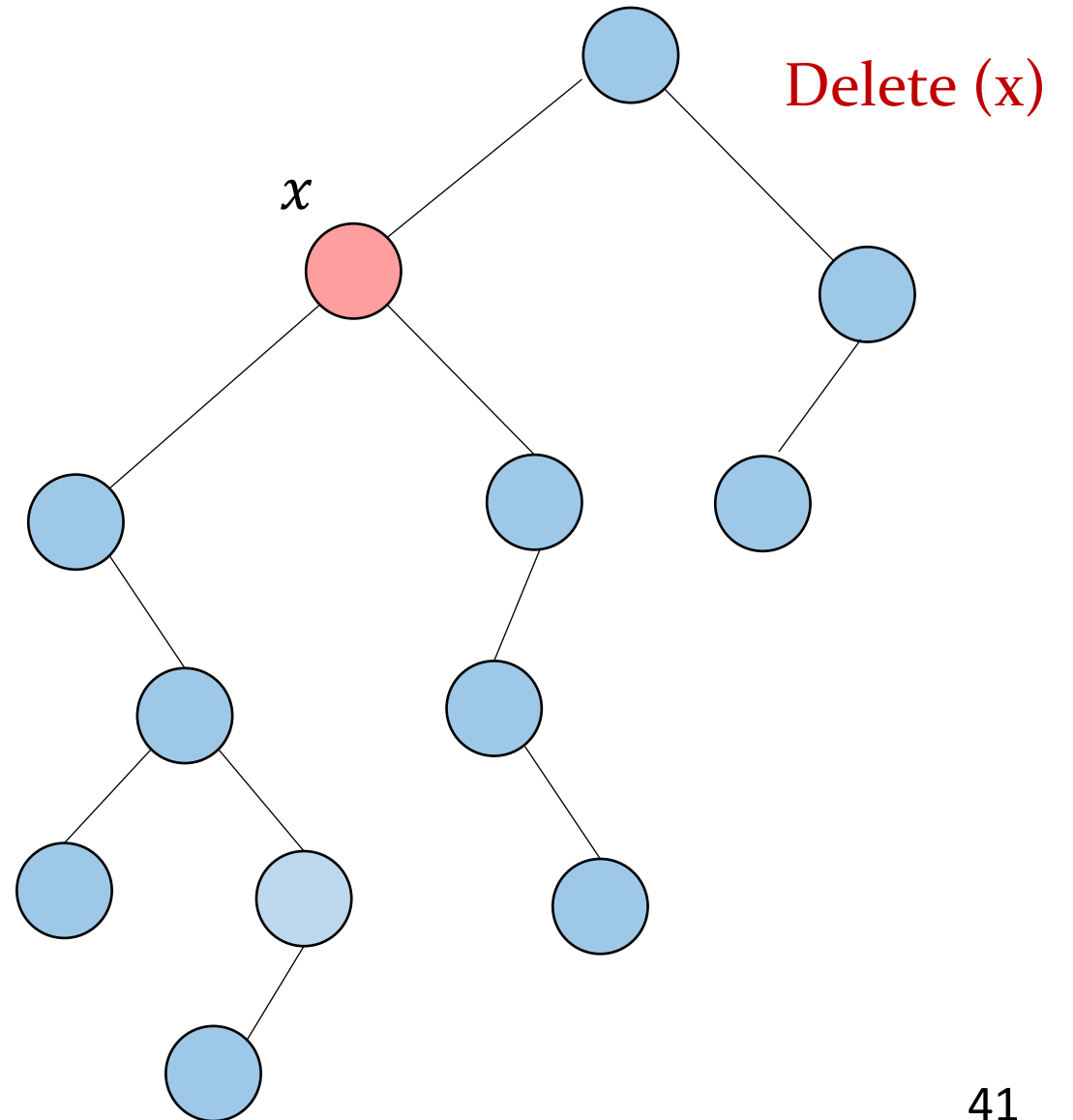
if *y* ≠ *NIL*

y.p = *x.p*



Case 3

- Case 2: x has **two** child
 - Delete x, which makes an open spot.
 - A node y should fill this spot,
Who should be y?

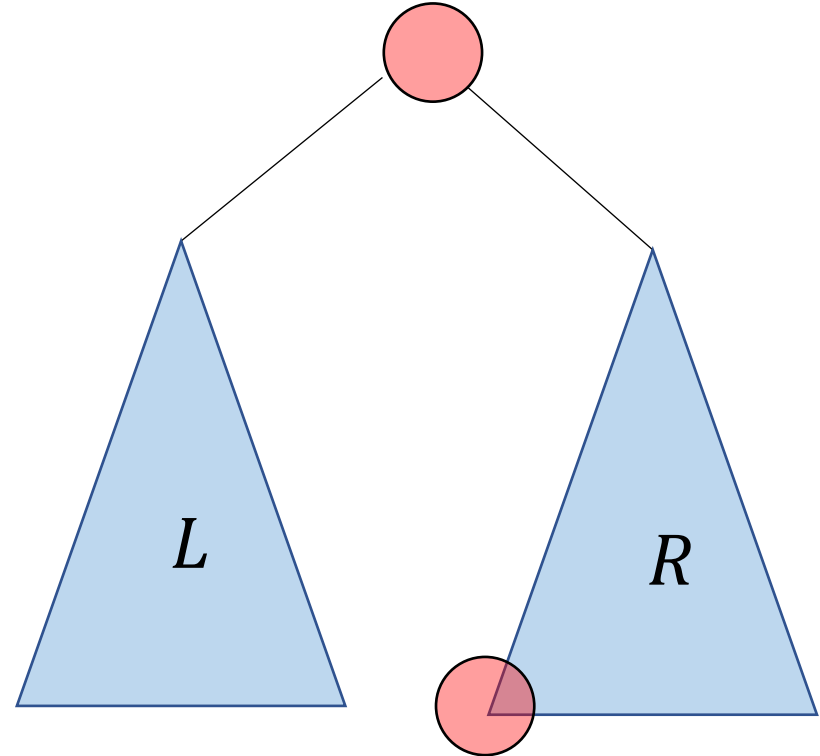


Case 3

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

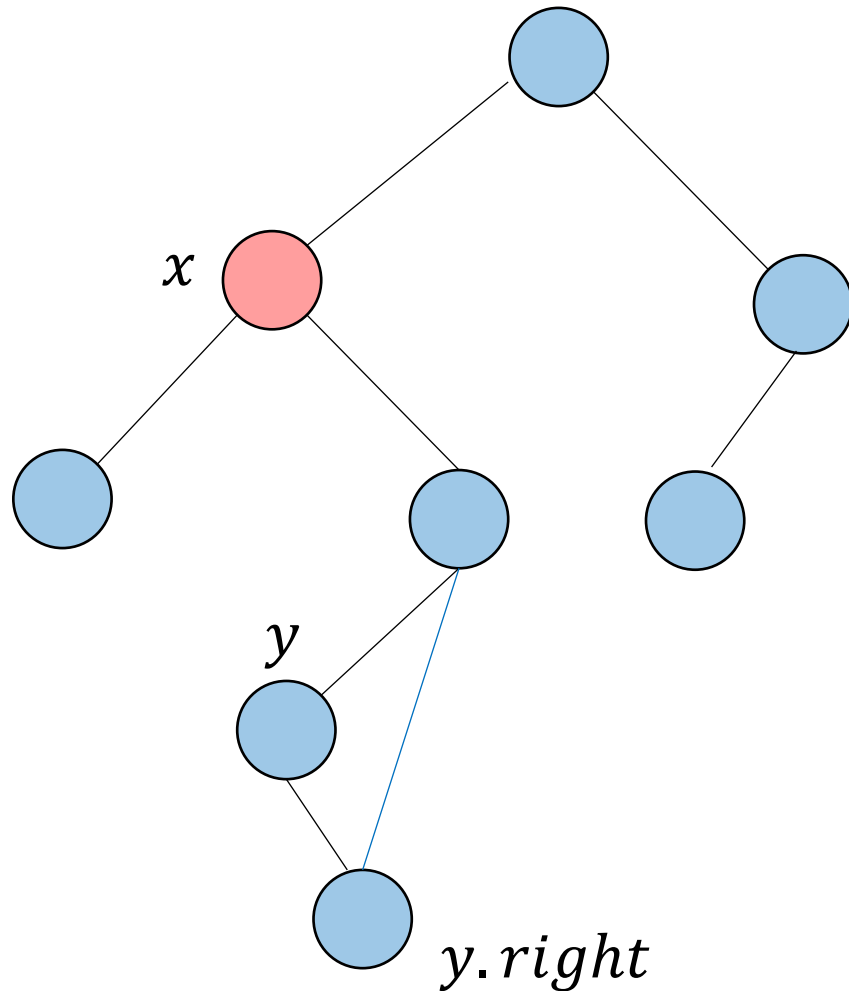
$y \leftarrow \text{the minimum of } R, \text{ i.e., } \text{Successor}(x)$

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

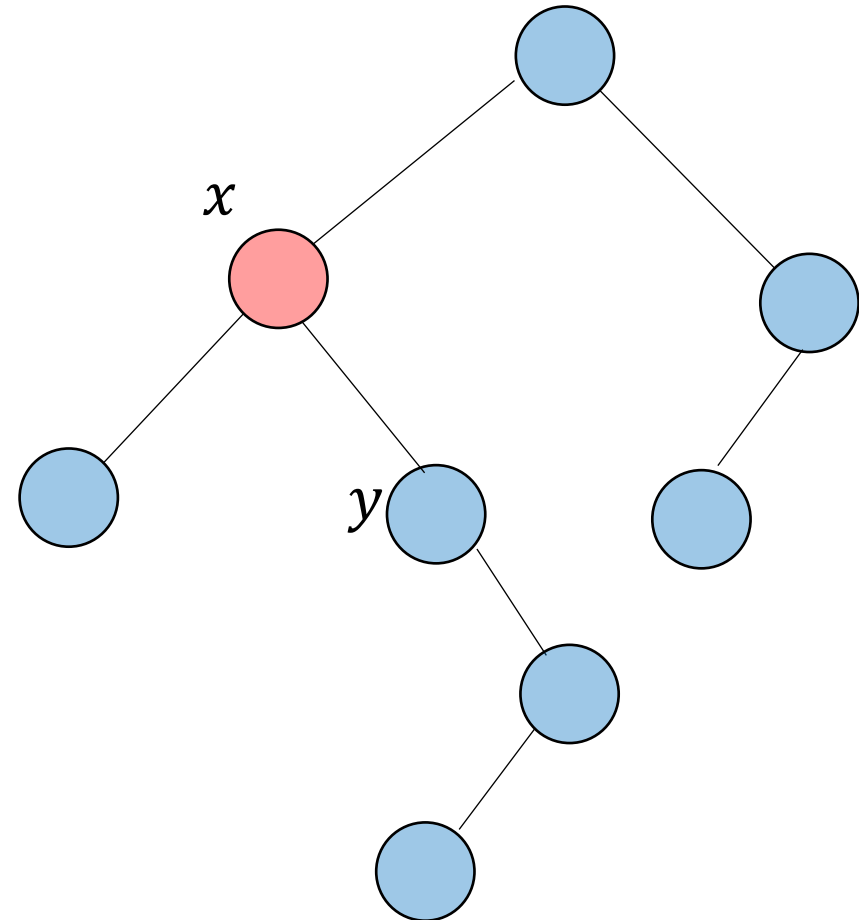


Sub cases for Case 3:

3.1: x is not y 's parent

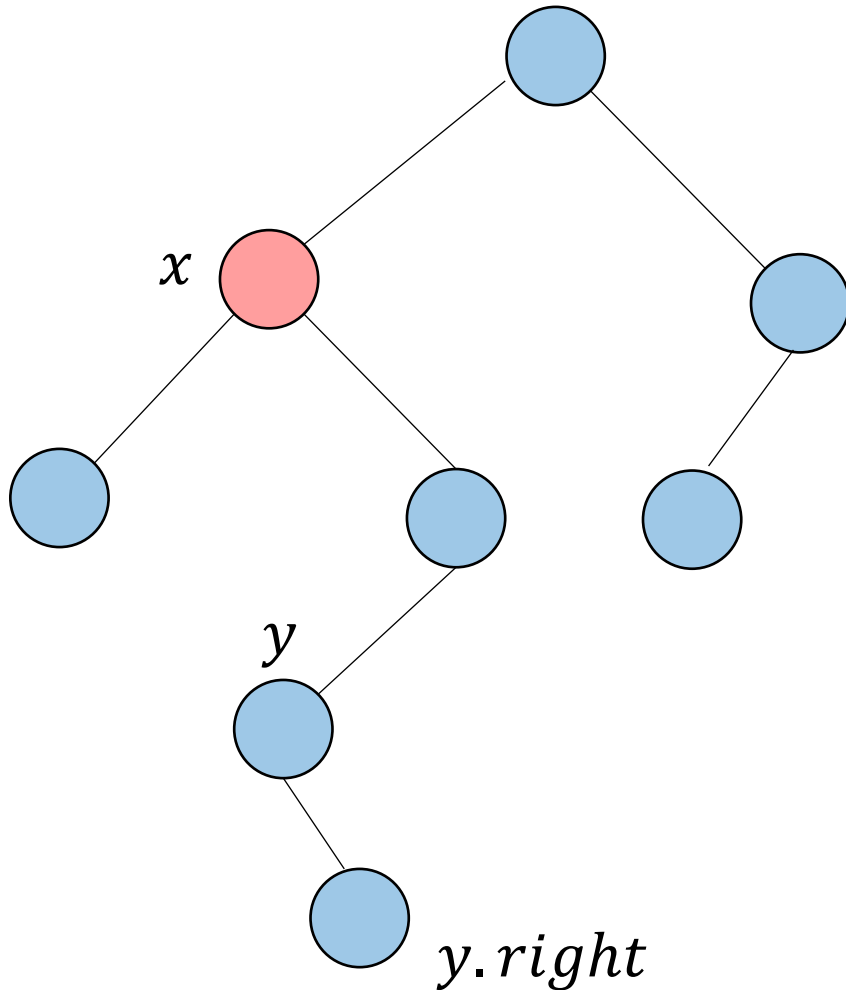


3.2: x is y 's parent

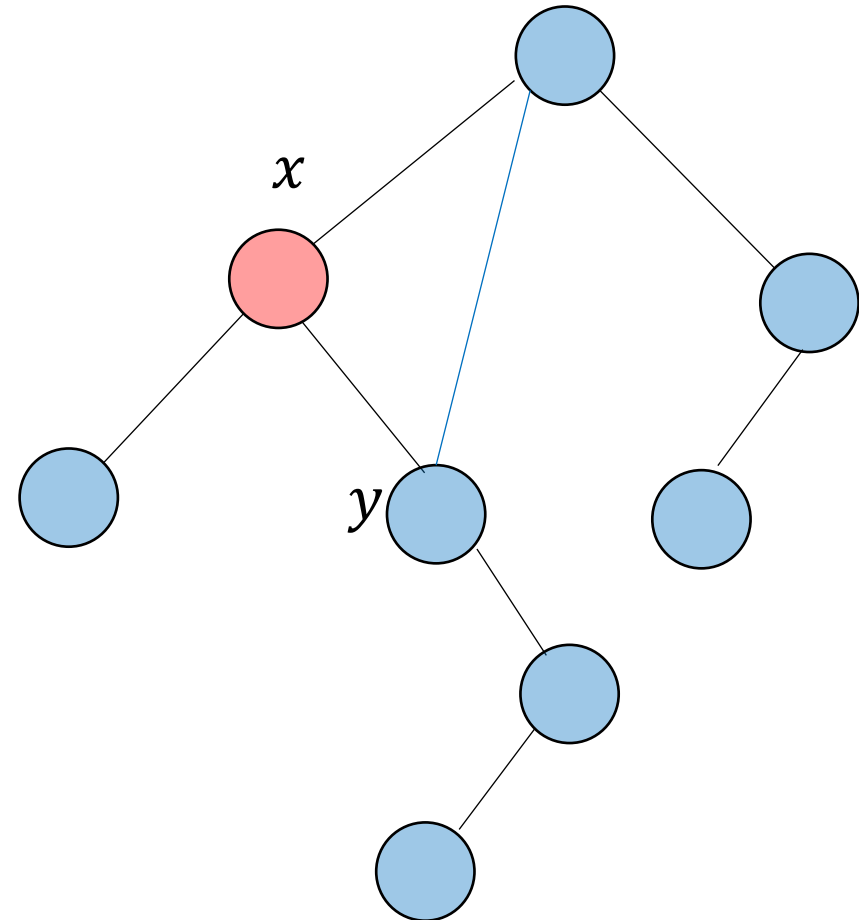


Sub cases for Case 3:

3.1: x is not y 's parent

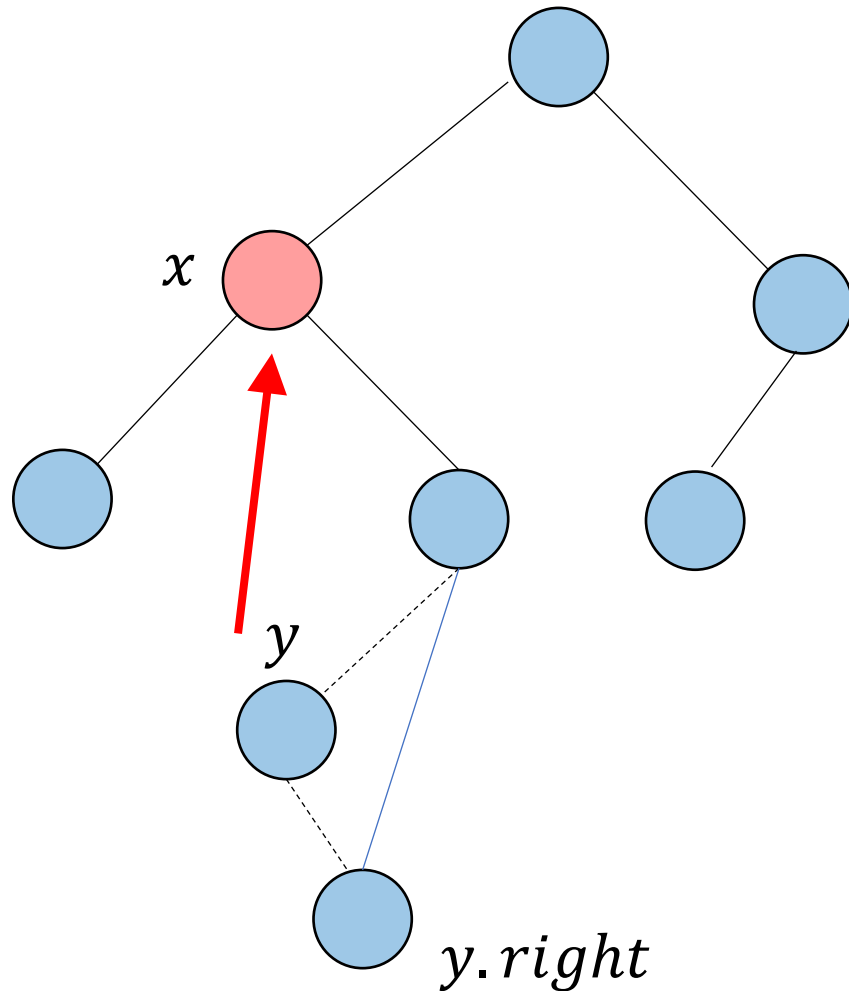


3.2: x is y 's parent

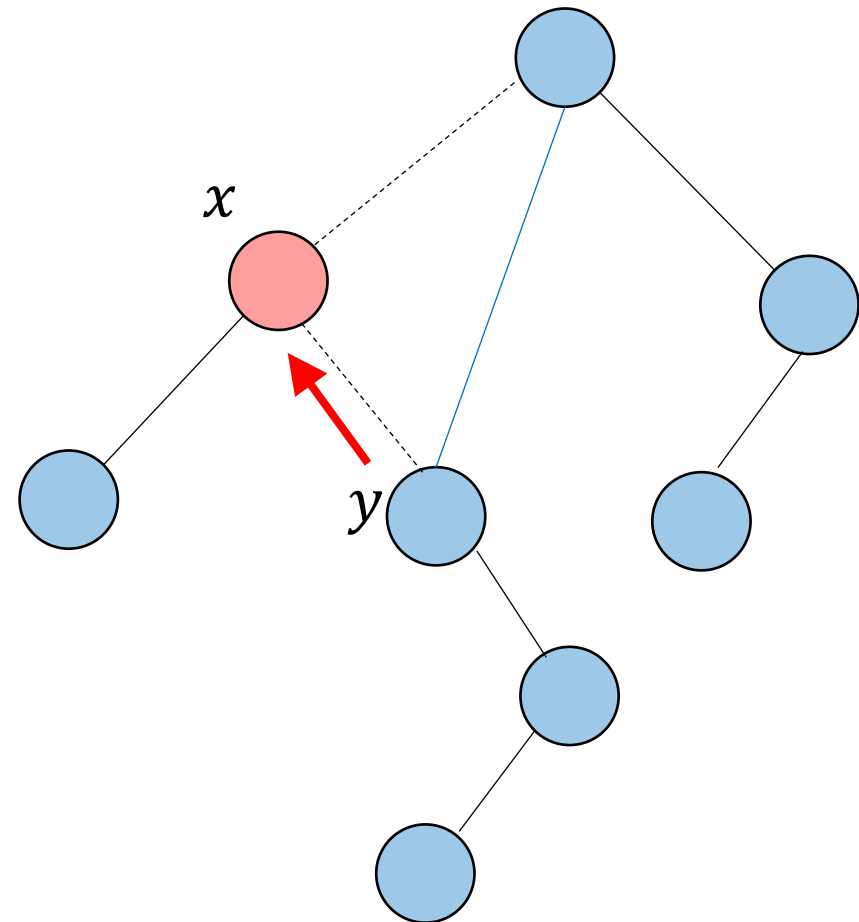


Sub cases for Case 3:

3.1: x is not y 's parent



3.2: x is y 's parent



TreeDelete(T, x) - pseudocode

TREE – DELETE(T, x)

if $x.left == NIL$

TRANSPLANT($T, x, x.right$)

elseif $x.right == NIL$

TRANSPLANT($T, x, x.left$)

else $y = \textit{TREE – MINIMUM}(x.right)$

if $y.p \neq x$

TRANSPLANT($T, y, y.right$)

$y.right = x.right$

$y.right.p = y$

TRANSPLANT(T, x, y)

$y.left = x.left$

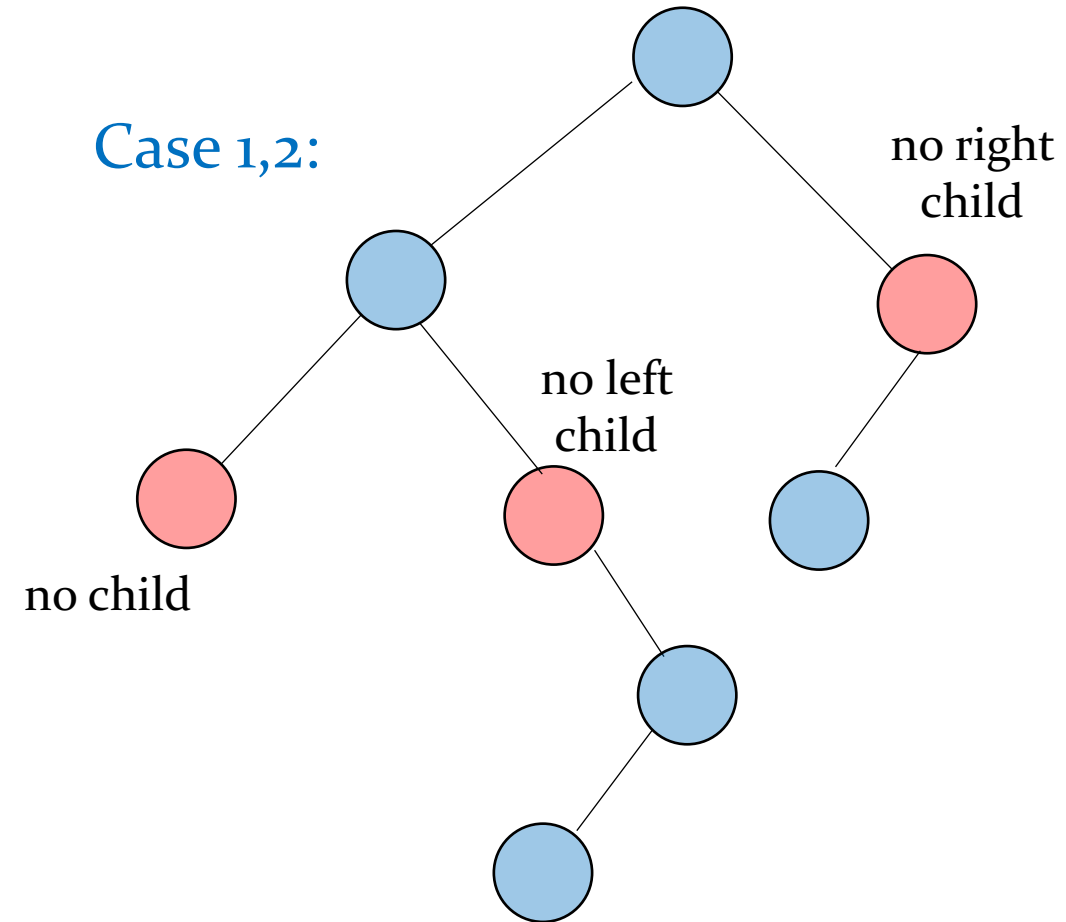
$y.left.p = y$

TreeDelete(T, x) - review

TREE - DELETE(T, x)

```
if  $x.left == NIL$   
    TRANSPLANT( $T, x, x.right$ )  
elseif  $x.right == NIL$   
    TRANSPLANT( $T, x, x.left$ )
```

```
else  $y = TREE - MINIMUM(x.right)$   
    if  $y.p \neq x$   
        TRANSPLANT( $T, y, y.right$ )  
         $y.right = x.right$   
         $y.right.p = y$   
    TRANSPLANT( $T, x, y$ )  
     $y.left = x.left$   
     $y.left.p = y$ 
```

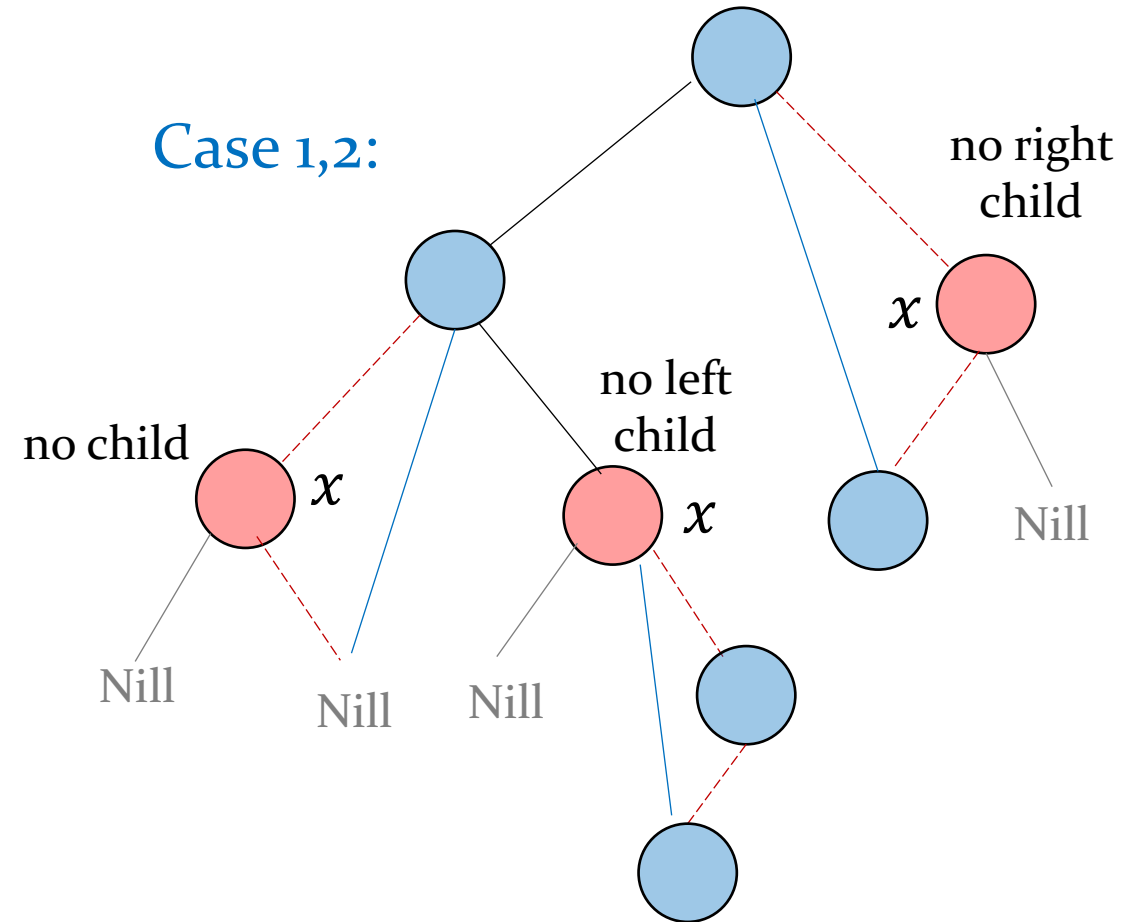


TreeDelete(T, x) - review

TREE - DELETE(T, x)

```
if  $x.left == NIL$   
    TRANSPLANT( $T, x, x.right$ )  
elseif  $x.right == NIL$   
    TRANSPLANT( $T, x, x.left$ )
```

```
else  $y = TREE - MINIMUM(x.right)$   
    if  $y.p \neq x$   
        TRANSPLANT( $T, y, y.right$ )  
         $y.right = x.right$   
         $y.right.p = y$   
        TRANSPLANT( $T, x, y$ )  
         $y.left = x.left$   
         $y.left.p = y$ 
```



TreeDelete(T, x) - review

TREE - DELETE(T, x)

if $x.left == NIL$

TRANSPLANT($T, x, x.right$)

elseif $x.right == NIL$

TRANSPLANT($T, x, x.left$)

else $y = \text{TREE-MINIMUM}(x.right)$

if $y.p \neq x$ **Case 3.1:**

TRANSPLANT($T, y, y.right$)

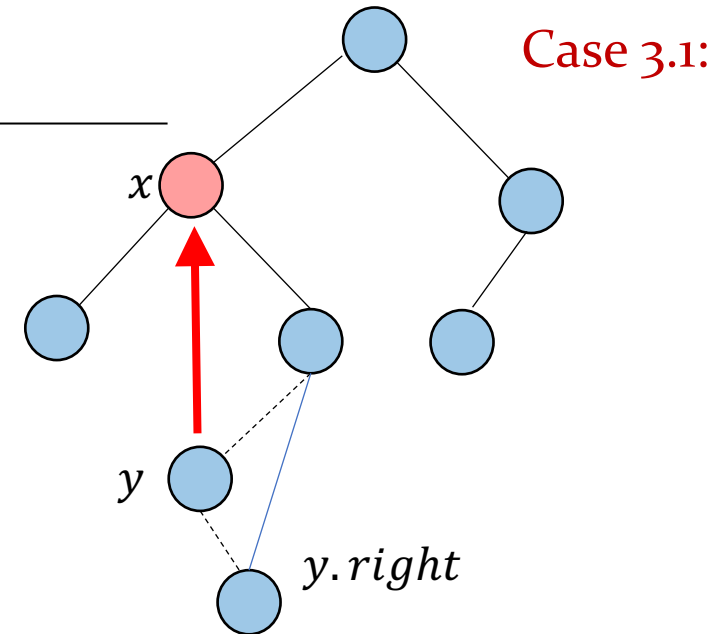
$y.right = x.right$

$y.right.p = y$

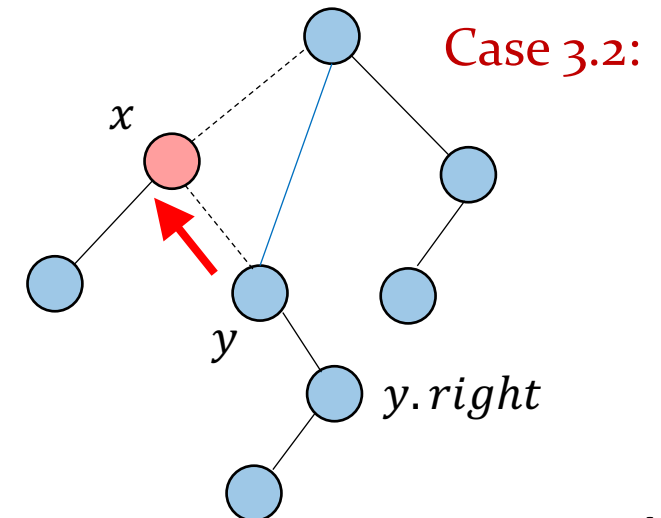
TRANSPLANT(T, x, y) **Case 3.2**

$y.left = x.left$

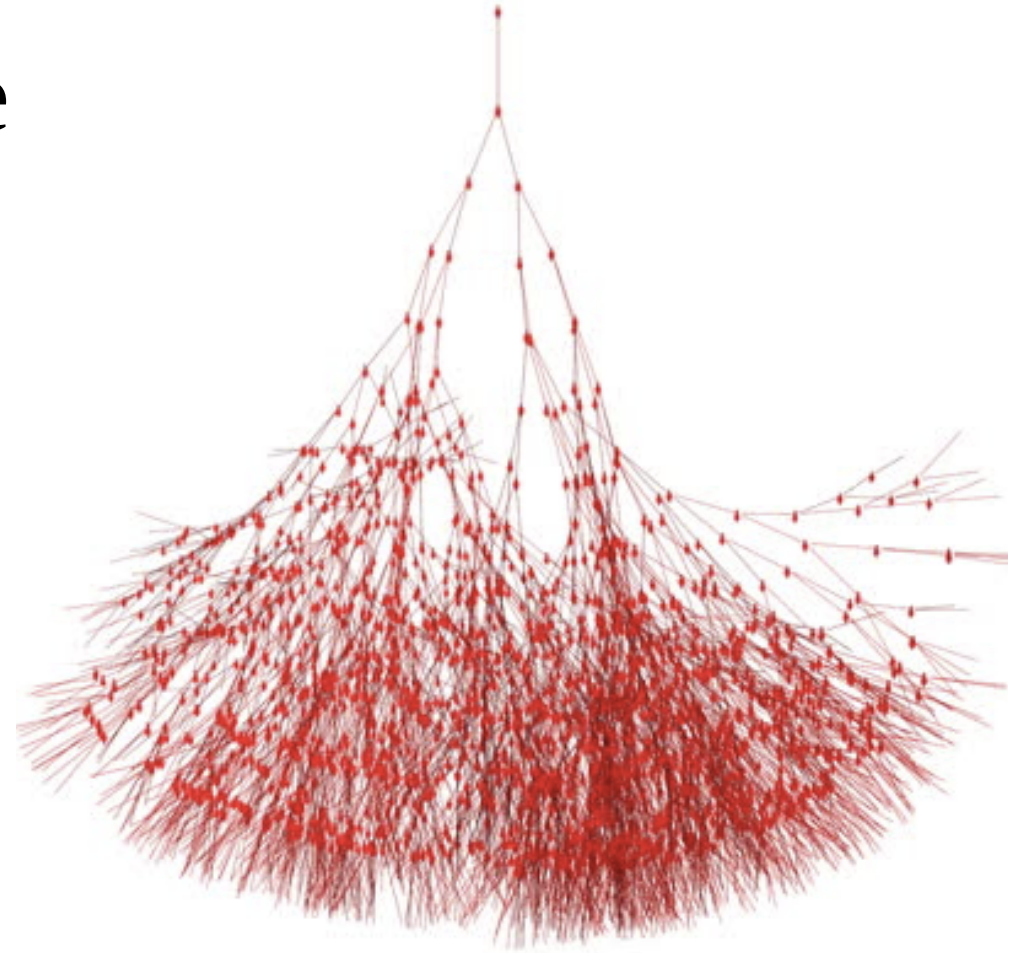
$y.left.p = y$



Case 3: x has two child



About **height** of a tree



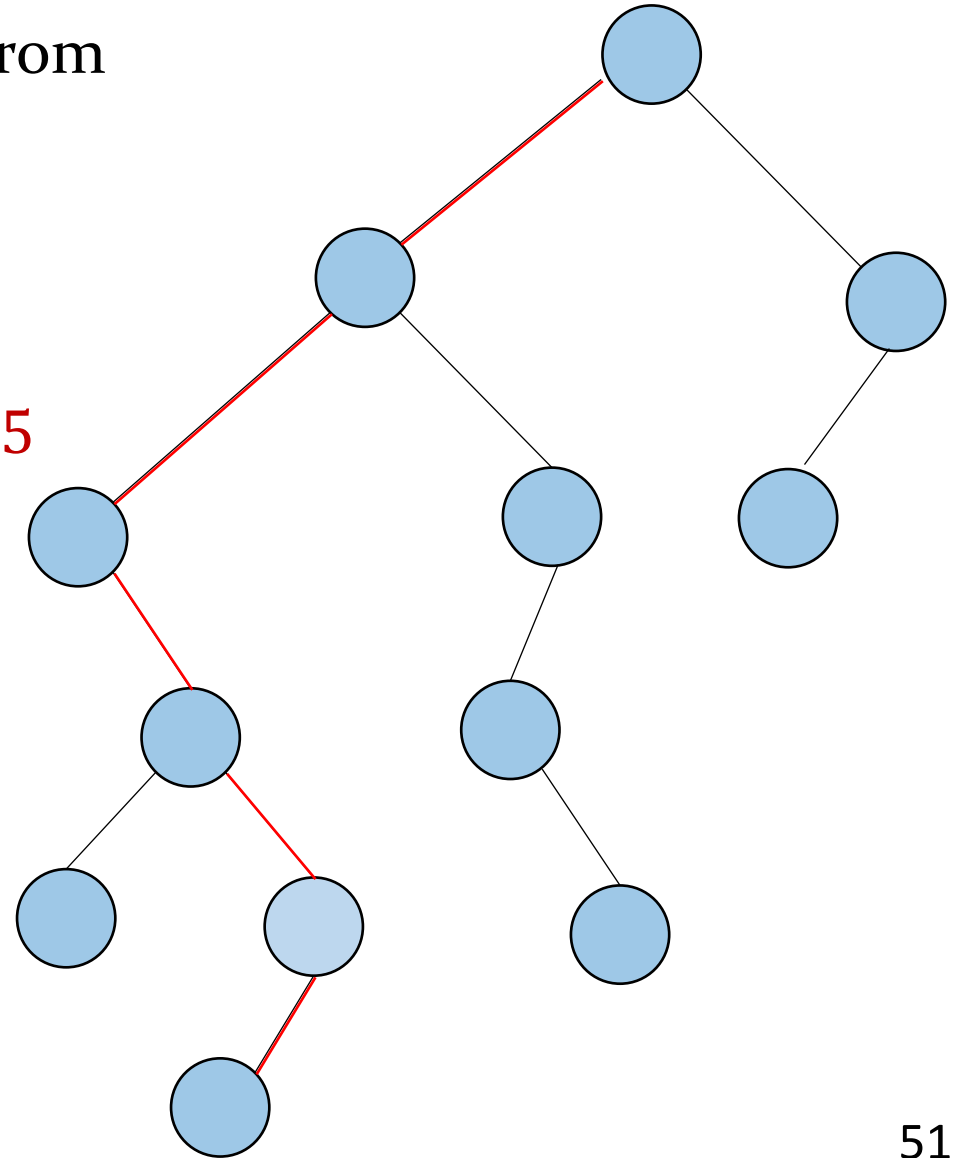
Height of a tree

Definition: Height of a tree is the longest path from the root to a leaf, in terms of number of edges.

Question: Consider a BST with n nodes, what's the highest and lowest it can be?

Answer: highest, $n - 1 = \Theta(n)$
 Lowest, $\log n - 1 = \Theta(\log n)$ when complete

So, all algorithms with time complexity $\Theta(h)$ are $\Theta(n)$ in the **worst case**.



Height of a tree

Average height of a tree: $\Theta(\log n)$

For proof see the textbook, chapter 12.4.

Can we change the BST data structure such that the height of the tree is $\Theta(\log n)$ in the worst case?

A **Balanced BST** guarantees to have height in $\Theta(\log n)$.

We will talk about balanced Trees next week.

Questions