

BST = BT + Search property  $\leftarrow$  Organize data within BT

# Data Structures and Algorithms

## Lecture 22: Binary Search Trees

search data structure

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# Outlines

- Basics of binary search trees
  - Binary-search-tree property
  - Traversals of binary search trees
- Common search operations on binary search trees
- Update operations on binary search trees

# Binary Search Trees

- A *binary search tree* is a data structure organized in a *binary tree*

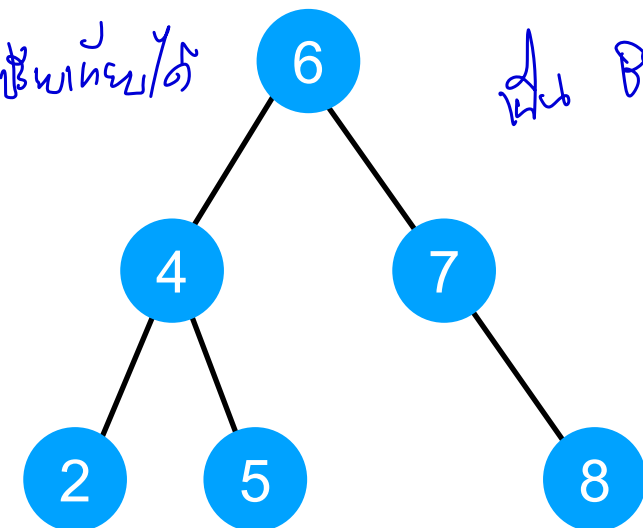
- Let  $S$  be a set of keys with a total order on  $S$ . For example,  $S$  is a set of integers. A **binary search tree** whose nodes are associated with keys in  $S$  is a *binary tree*  $T$  such that:

- Each node  $x$  of  $T$  stores an element of  $S$ , denoted with  $x.key$

- For each internal node  $x$  of  $T$ , the elements stored in the left subtree of  $x$  are less than or equal to  $x.key$  and the elements stored in the right subtree of  $x$  are greater than to  $x.key$

node 2 สามารถไปขวาได้

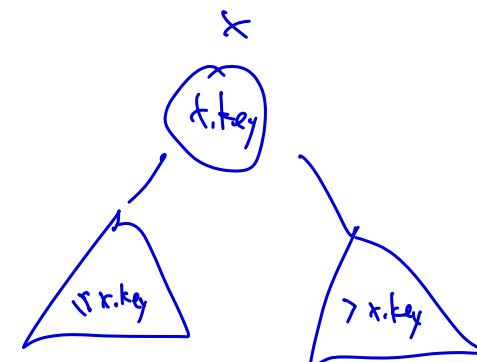
นี่ BST



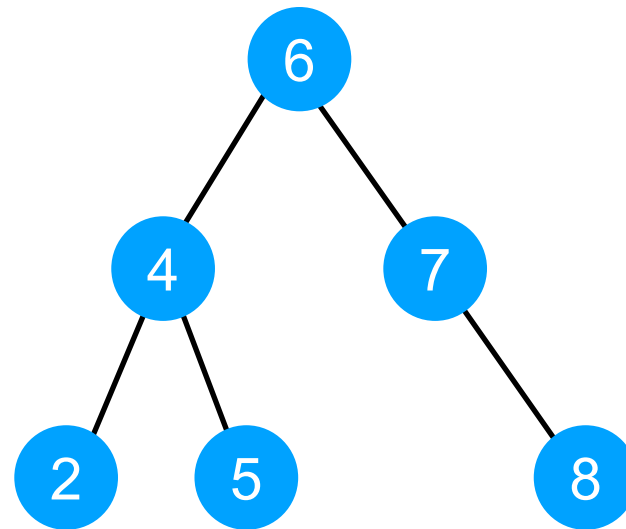
Node เก็บไว้ได้ Total order key

สำหรับ BST

internal node



# Binary-Search-Tree Property



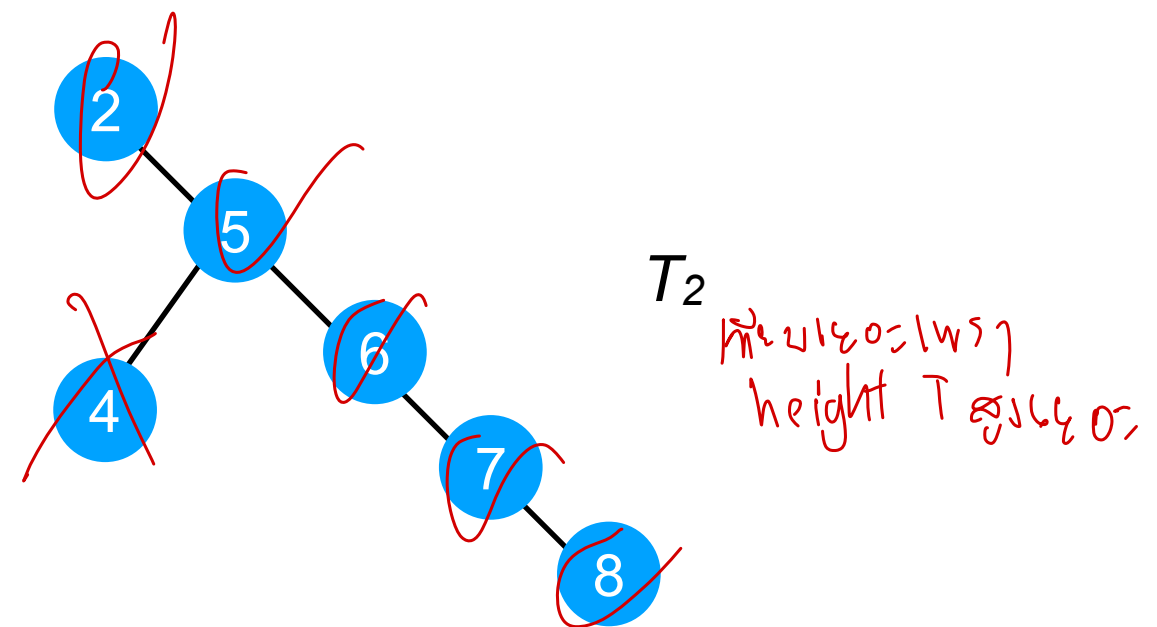
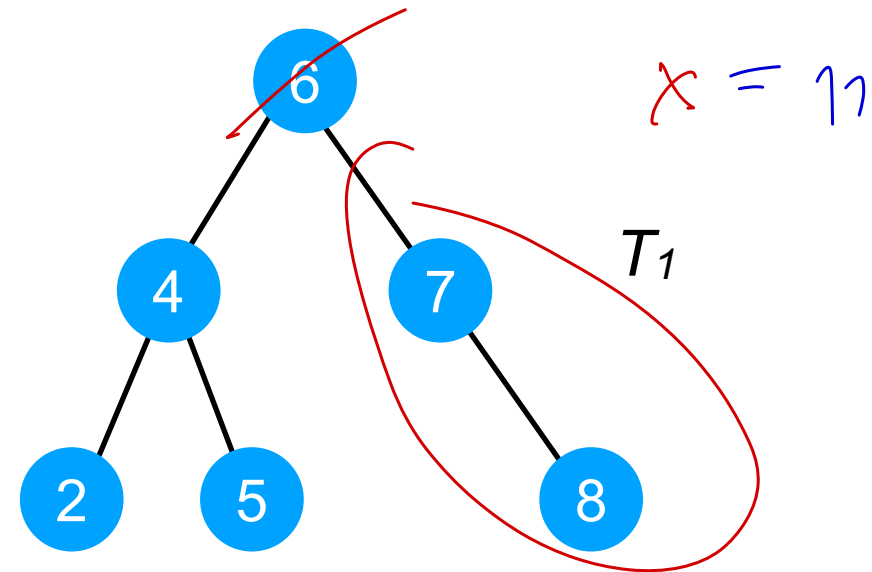
- The keys (elements) in a binary search tree are always stored in such a way as to satisfy the **binary-search-tree property**:

*“Let  $x$  be a node in a binary search tree. If  $y$  is a node in the left subtree of  $x$ , then  $y.key \leq x.key$ . If  $y$  is a node in the right subtree of  $x$ , then  $y.key > x.key$ .”*

*or  $y.key \leq x.key$  if  $y$  is a subtree of  $x$*

# Examples of Binary Search Trees

- For any node  $x$ , the keys in the left subtree of  $x$  are at most  $x.key$ , and the keys in the right subtree of  $x$  are greater than  $x.key$
- Different binary search trees can represent the same set of key values
- The worst-case running time of most binary-search-tree operations is proportional to the height of the tree.
  - $T_1$  is a binary search of height 2
  - $T_2$  is considered as a less efficient binary search tree as the height of  $T_2$  is 4



# Traversals of Binary Search Trees

- Preorder traversal:

- $T_1$ : 6, 4, 2, 5, 7, 8

- $T_2$ : 2, 5, 4, 6, 7, 8

- Postorder traversal:

- $T_1$ : 2, 5, 4, 8, 7, 6

- $T_2$ : 4, 8, 7, 6, 5, 2

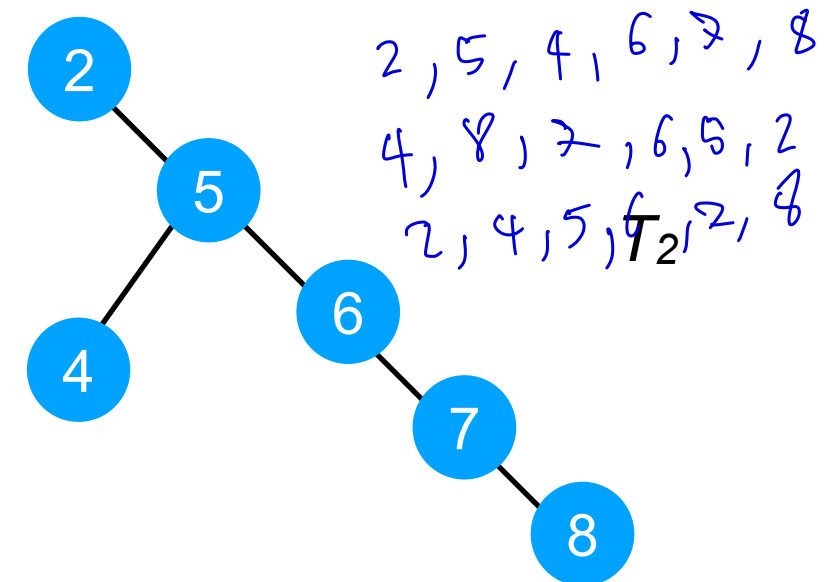
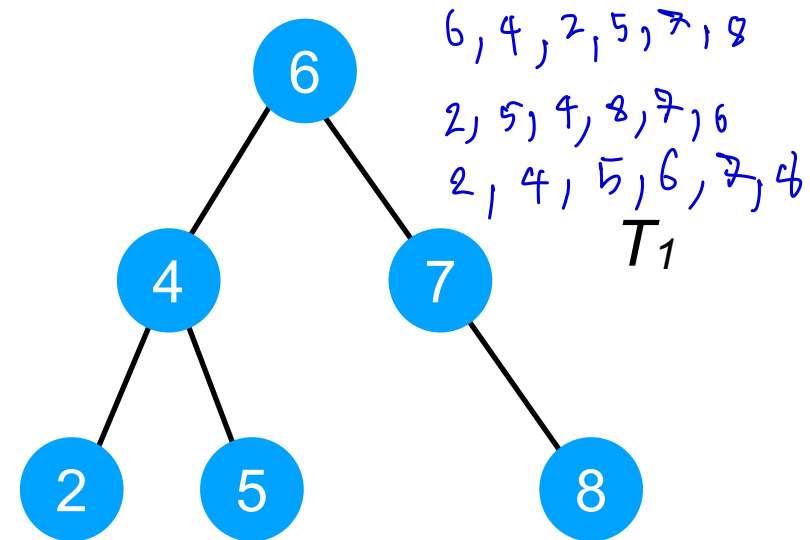
- \*\*Inorder traversal:

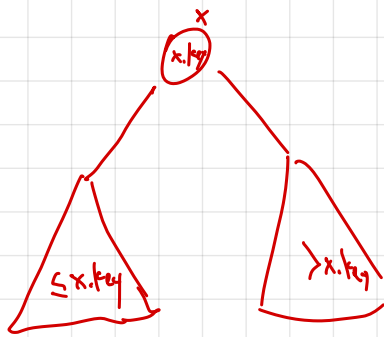
- $T_1$ : 2, 4, 5, 6, 7, 8

- $T_2$ : 2, 4, 5, 6, 7, 8

- *Remark*: By the binary-search-tree property, an *inorder traversal* of a binary search tree  $T$  always visits the elements in *sorted order* of keys.

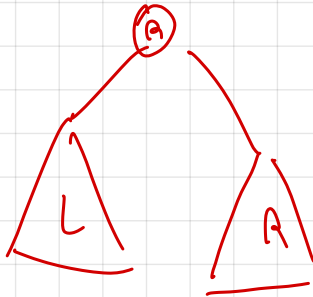
Q: ทำไม Inorder traversal ถึง visit Node ตามลำดับเพิ่มของ key





In order:

1. Recursively traverse left subtree
2. visit  $x$
3. Recursively traverse right subtree

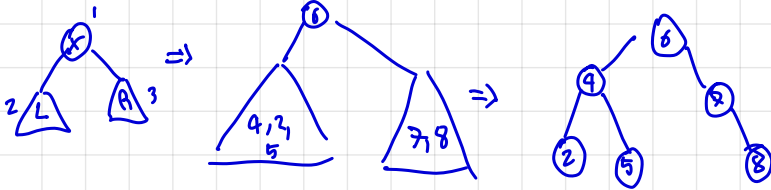


$(L \leq x \leq R)$

$\Rightarrow L \leq x \leq R$

$L' \leq x \leq R'$

Pre-order result  $\Rightarrow$   
6, 4, 2, 5, 7, 8



Reconstruct BST from preorder result.

# Common Search Operations on Binary Search Trees

- Common operations performed on a binary search tree  $T$ :
  - $\text{search}(k, T)$ : return an object of a node whose key value is  $k$  in  $T$
  - $\text{minimum}(T)$ : return an object of a node with the smallest key value in  $T$
  - $\text{maximum}(T)$ : return an object of a node with the largest key value in  $T$
  - $\text{successor}(x, T)$ : return an object of the successor of node  $x$  (the node with the smallest key value greater than  $x.\text{key}$ )
  - $\text{predecessor}(x, T)$ : return an object of the predecessor of node  $x$  (the node with the largest key smaller than  $x.\text{key}$ )



# Operation: Search

- $\text{search}(k, T)$ : return an object of a node whose key value is  $k$  in  $T$

```
struct node
{
    int key;
    struct node* parent;
    struct node* left;
    struct node* right;
};
```

```
struct node* search(int key, struct node* node)
{
    if ((node == NULL) || (key == node->key))
        return node;
    if (key < node->key)
        return search(key, node->left); // recurse on left subtree
    else
        return search(key, node->right);
}
```

*Handwritten notes:*  
A blue arrow points from the text "is Root" to the `node` parameter in the function signature.  
Red circles highlight `node` in the function signature, `NULL`, `key == node->key`, `node->left`, and `node->right`.

# Operation: Minimum

ଏକ Node ରେ ଥିବା key ମଧ୍ୟରେ

- `minimum( $T$ )`: return an object of a node with the smallest key value in  $T$

ସର୍ବନିମ୍ନ ମୂଲ୍ୟ

```
struct node
{
    int key;
    struct node* parent;
    struct node* left;
    struct node* right;
};
```

```
struct node* minimum(struct node* node)
{
    while(node->left != NULL)
        node = node->left;
    return node;
}
```

# Operation: Maximum

- $\text{maximum}(T)$ : return an object of a node with the largest key value in  $T$

```
struct node
{
    int key;
    struct node* parent;
    struct node* left;
    struct node* right;
};
```

9/10/04 12:10:27

```
struct node* maximum(struct node* node)
{
    while(node->right != NULL)
        node = node->right;
    return node;
}
```

# Operation: Successor

- $\text{successor}(x, T)$ : return an object of the successor of node  $x$  (the node with the smallest key value greater than  $x.\text{key}$ )

```
struct node* successor(struct node* node)
{
    if(node->right != NULL)
        return minimum(node->right);
    struct node* ancestor = node->parent;
    while((ancestor != NULL) && (node == ancestor->right))
    {
        node = ancestor;
        ancestor = node->parent;
    }
    return ancestor;
}
```

successor :=  $\frac{1}{2} \frac{1}{\sqrt{2}} \frac{1}{\sqrt{2}}$ ,  $\frac{1}{2} \frac{1}{\sqrt{2}} \frac{1}{\sqrt{2}}$

Prete ce ssoz  $\frac{1}{2}$  mion

$$\text{successor}(x) :=$$

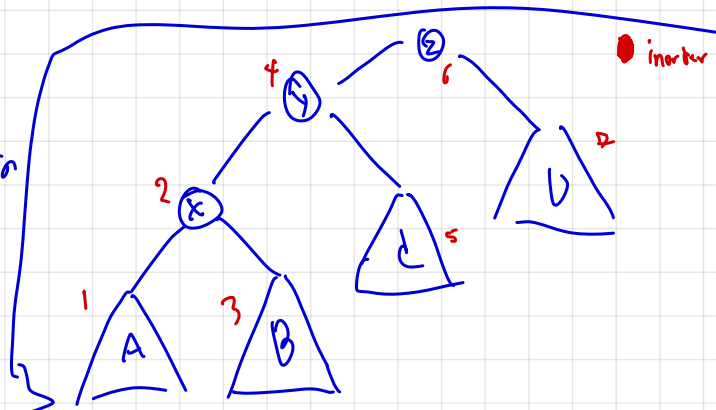
↑ Obj of Node x

ขอทราบหน้าที่สำคัญๆ ของ x-key และ y-key ที่ใช้

$$S = \{2, 4, 6, 0, 7\}$$

$$0 \leq 2 \leq 4 \leq 6 \leq 7$$

$x$                        $\uparrow$   
successor( $x$ )



successor(x), volles a,

Case 1: root is 0 left is empty, root is 0 no right subtree  $0 \neq x$

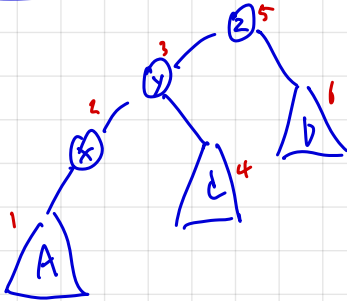
$\Rightarrow$  on trouve un  $\alpha$  minimal dans  $B$

case 2: root is also empty

$\Rightarrow$  in inorder traversal we get 9 min

left ancestor  $v_0 \geq x$

left ancestor: ancestor von  $x$  nicht ancestor von  $x$   
 ohne idempotenzmutationen



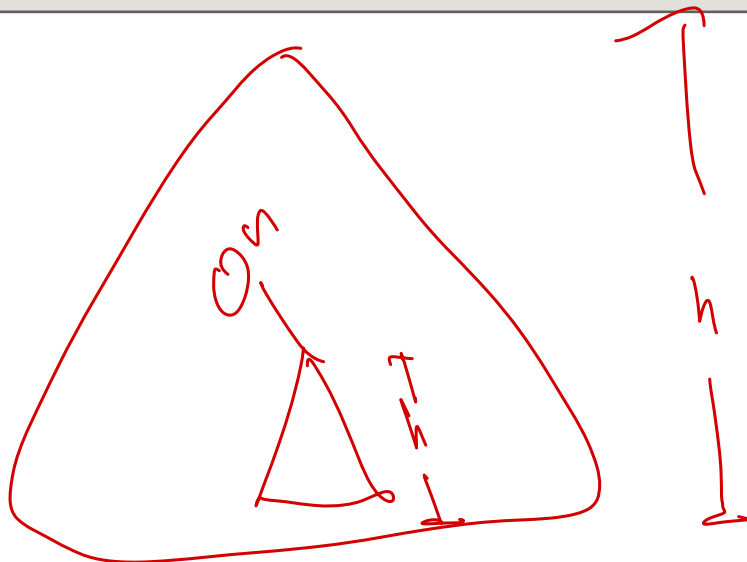
# Operation: Predecessor

- predecessor( $x, T$ ): return an object of the predecessor of node  $x$  (the node with the largest key smaller than  $x.key$ )

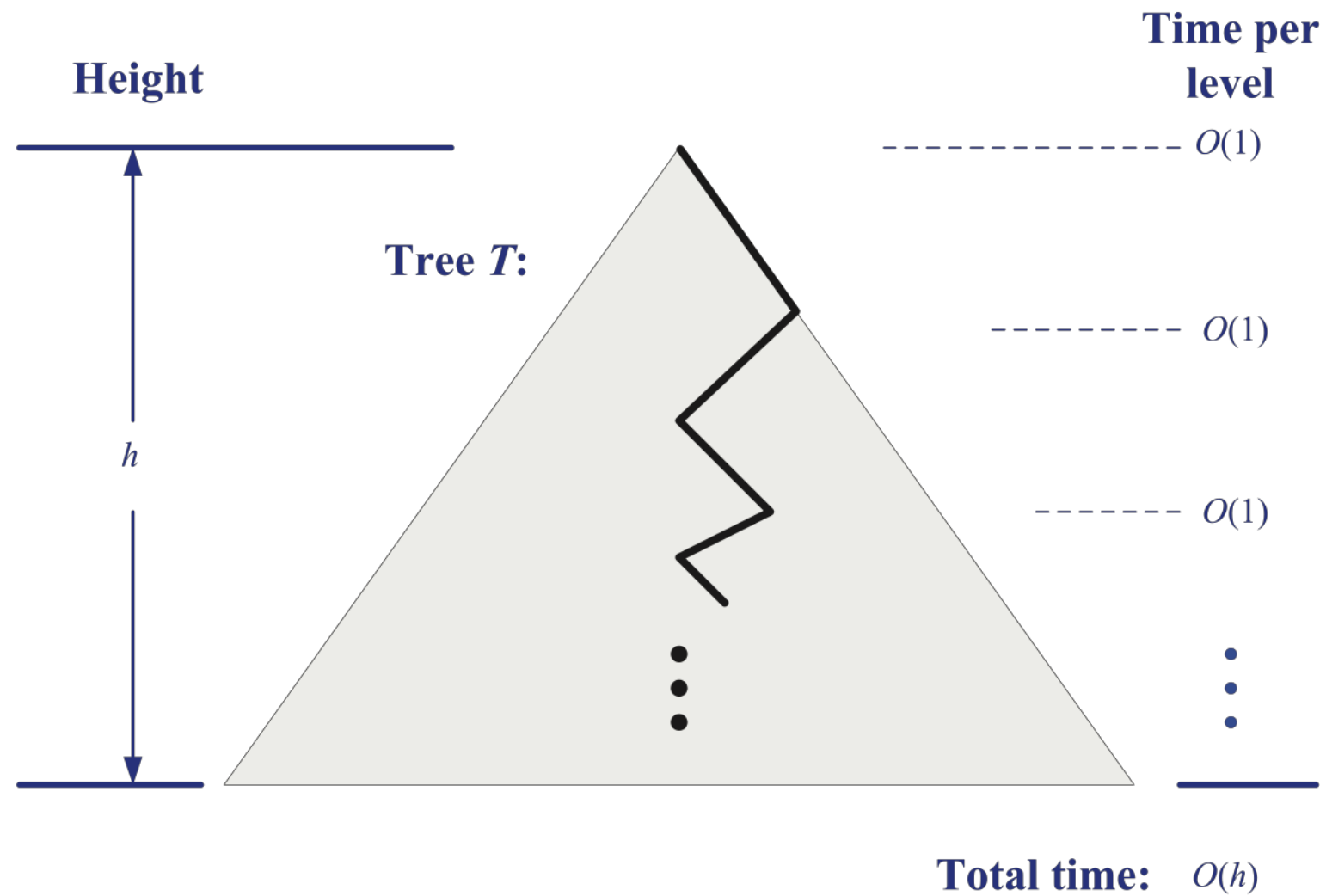
```
struct node* predecessor(struct node* node)
{
    if(node->left != NULL)
        return maximum(node->left);
    struct node* ancestor = node->parent;
    while((ancestor != NULL) && (node == ancestor->left))
    {
        node = ancestor;
        ancestor = node->parent;
    }
    return ancestor;
}
```

# Complexity of Search Operations on Binary Search Trees (1)

Operations	Complexity
Search	$O(h)$
Minimum	$O(h)$
Maximum	$O(h)$
Successor	$O(h)$
Predecessor	$O(h)$
	<p><u>Remark:</u> <math>h</math> is the height of a binary tree</p> <ul style="list-style-type: none"><li>- At worst, <math>h</math> can be <math>n-1</math></li><li>- At best, <math>h</math> can be <math>\log_2(n+1)-1</math></li></ul>



# Complexity of Search Operations on Binary Search Trees (2)





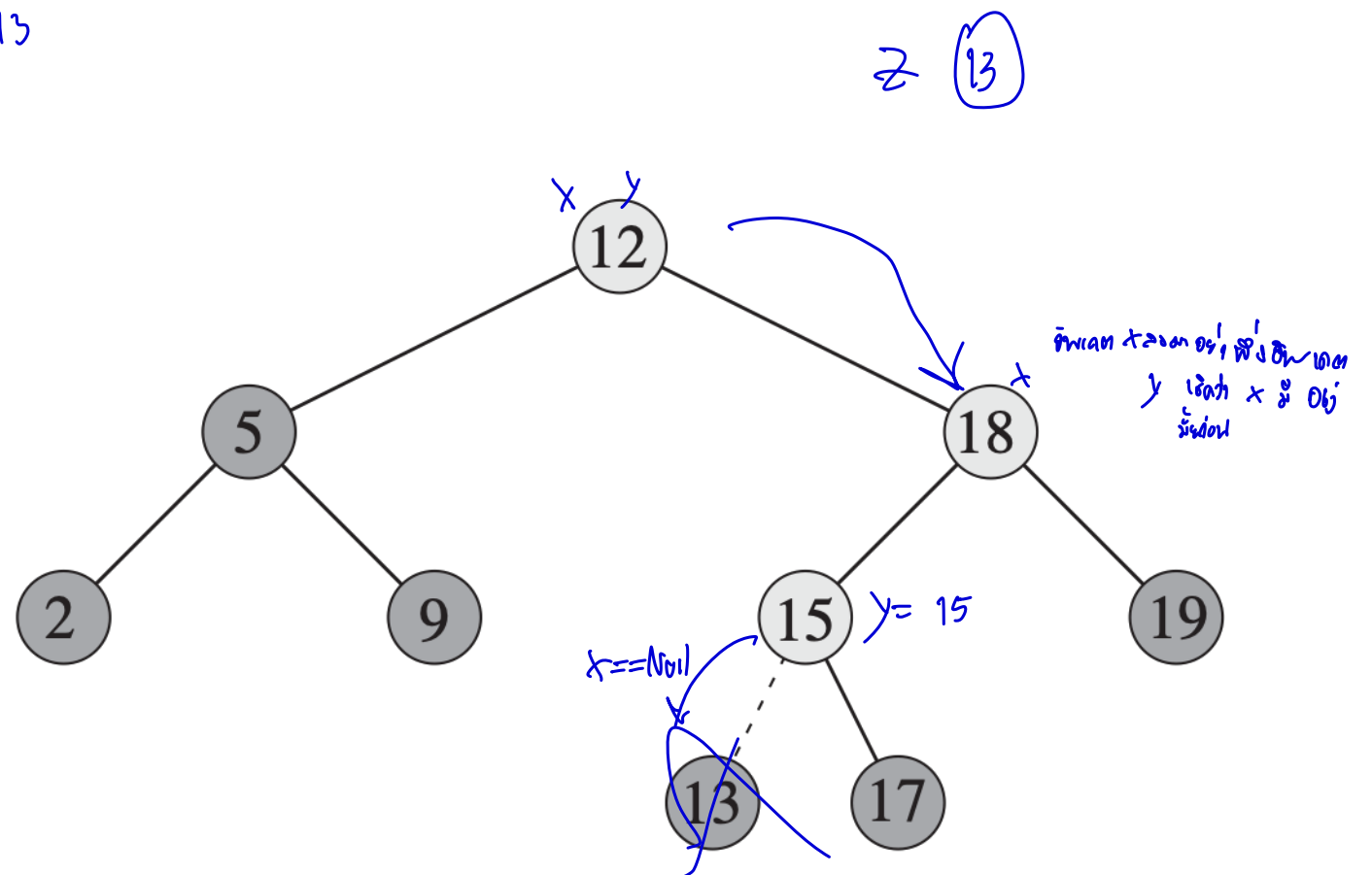
# Update Operations on Binary Search Trees

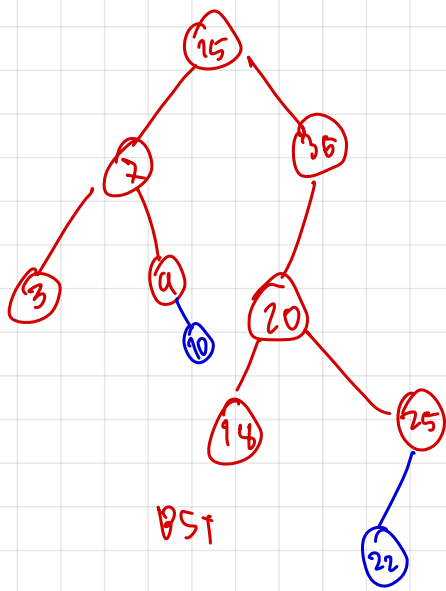
- Update operations performed on a binary search tree  $T$ :
  - **Tree-Insert( $k, T$ )**: insert a new node object with key  $k$  into an appropriate position in  $T$
  - **Tree-Delete( $z, T$ )**: delete an existing node object  $z$  from  $T$

# Operation: Tree-Insert (1)

- Tree-Insert( $k, T$ ): insert a new node object with key  $k$  into an appropriate position in  $T$

$k = 13$   
 Tree-Insert( $k, T$ ):  
      $z = \text{createNode}(k)$   
      $y = \text{NULL}$  *trailing pointer → keep store parent*  
      $x = T.\text{root}$  *again → pointer → start node by T.root*  
     while ( $x \neq \text{NULL}$ ):  
          $y = x$   
         if  $z.\text{key} < x.\text{key}$ :  
              $x = x.\text{left}$   
         else:  
              $x = x.\text{right}$   
      $z.\text{parent} = y$  *→ set parent*  
     if  $y \neq \text{NULL}$ : *with pointer to node to be inserted*  
         if  $z.\text{key} < y.\text{key}$ :  
              $y.\text{left} = z$   
         else:  
              $y.\text{right} = z$





insert(10)  
insert(22)

BST

# Operation: Tree-Insert (2)

- After the new node  $z$  is created, we begin at the root of the tree. The pointer  $x$  traces a simple path downward looking for a NULL to replace it with  $z$
- We maintain the trailing pointer  $y$  as the parent of  $x$
- After initialization, the while loop causes the pointers  $x$ ,  $y$  moving down along the tree, going left or right depending on the comparison of  $z.key$  with  $x.key$ , until  $x$  becomes NULL.
- This NULL occupies the position where we wish to place the new node  $z$
- We need the trailing pointer  $y$ , because by the time we find the NULL, the search has proceeded one step beyond the position that needs to be replaced

```
Tree-Insert(k, T):
    z = createNode(k)
    y = NULL
    x = T.root
    while (x != NULL):
        y = x
        if z.key < x.key:
            x = x.left
        else:
            x = x.right
    z.parent = y
    if y != NULL:
        if z.key < y.key:
            y.left = z
        else:
            y.right = z
```

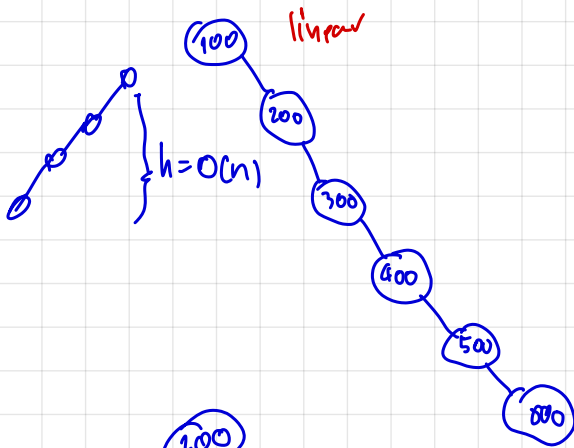
# Operation: Tree-Insert (3)

```
Tree-Insert(k, T):
    z = createNode(k)
    y = NULL
    x = T.root
    while (x != NULL):
        y = x
        if z.key < x.key:
            x = x.left
        else:
            x = x.right
    z.parent = y
    if y != NULL:
        if z.key < y.key:
            y.left = z
        else:
            y.right = z
```

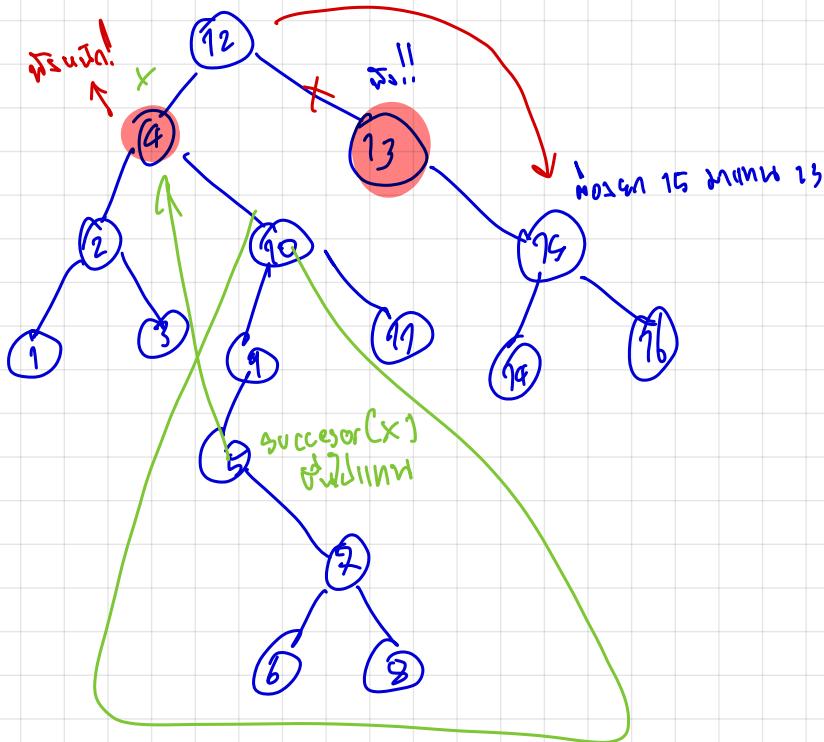
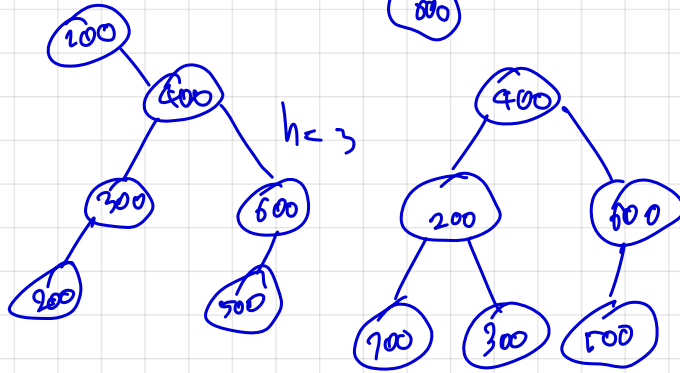
```
struct node* treeInsert(int key, struct node* root)
{
    struct node* new_node = createNode(key);
    struct node* trail_pt = NULL;
    struct node* node = root;

    while(node != NULL) {
        trail_pt = node;
        if(new_node->key <= node->key)
            node = node->left;
        else
            node = node->right;
    }
    new_node->parent = trail_pt;
    if(trail_pt != NULL){
        if(new_node->key <= trail_pt->key)
            trail_pt->left = new_node;
        else
            trail_pt->right = new_node;
    }
    return new_node;
}
```

Insert 200, 300, 400, 500, 600  
 4 2 1 5 3



Random  
BST



# Quiz N :

กิตติคุณ, น ปุณณมัย 6510405334

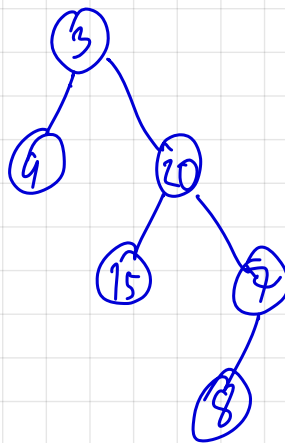
1. การท่องผ่านโครงสร้างของ BT ที่เป็นการเดินจากบนลงล่าง  
traverse ใดบ้าง

Pre-order 3, 9, 20, 15, 7, 8      Post-order 9, 15, 8, 7, 20, 3

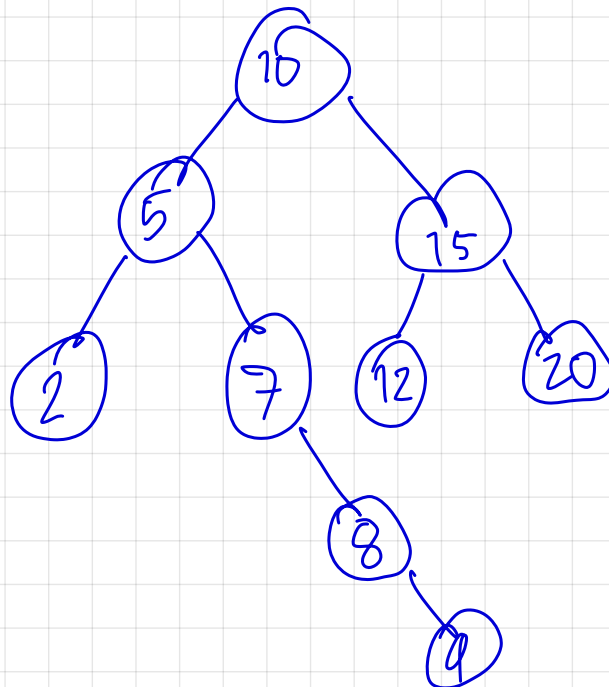
2. การท่องผ่านโครงสร้างของ BST ที่เป็นการเดินจากบนลงล่าง หรือ traverse ใดบ้าง

Pre-order : 10, 5, 2, 7, 8, 9, 15, 12, 20

1.



2.



# Operation: Tree-Delete (1)

- Tree-Delete( $z, T$ ): delete an existing node object  $z$  from  $T$ .
- The strategy for deleting  $z$  is divided into three basic cases:
  - **Case A.1**: If  $z$  has no children, then we simply remove  $z$  by placing NULL in the position of  $z$
  - **Case A.2**: If  $z$  has just one child, then we elevate that child to take the position of  $z$ .
  - **Case A.3**: If  $z$  has two children, we first find  $z$ 's successor, called  $y$  ( $y$  must be the leftmost ~~ancestor~~ descendant in  $z$ 's right subtree) and let  $y$  take  $z$ 's position. Then, the rest of  $z$ 's original right subtree becomes  $y$ 's new right subtree, and  $z$ 's left subtree becomes  $y$ 's new left subtree.



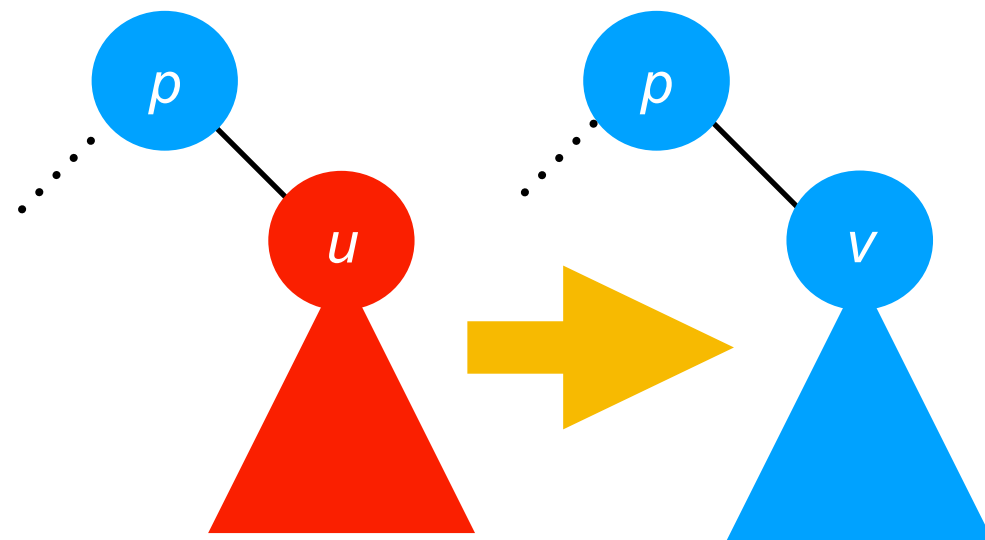
# Operation: Tree-Delete (2)

- In actual implementation, we organize the cases a bit differently from what outlined previously:
  - **Case B.1:** If  $z$  has no left child, then we replace  $z$  by its right child, which may or may not be NULL
    - If  $z$ 's right child is NULL, this case deals with the situation in which  $z$  has no children at all
    - If  $z$ 's right child is not NULL, this case handles the situation in which  $z$  has just right child
  - **Case B.2:** If  $z$  has just one child, which is its left child, then we replace  $z$  by its left child
  - **Case B.3:** If  $z$  has both left and right children, we find the successor  $y$  of  $z$ . Then, we splice  $y$  out of its current location and let  $y$  take the position of  $z$ 
    - **Case B.3.1:** If  $y$  is  $z$ 's right child, then we replace  $z$  with  $y$
    - **Case B.3.2:** If  $y$  is not  $z$ 's right child, we first replace  $y$  with its own right child. Then, we replace  $z$  with  $y$

# Operation: Tree-Delete (3)

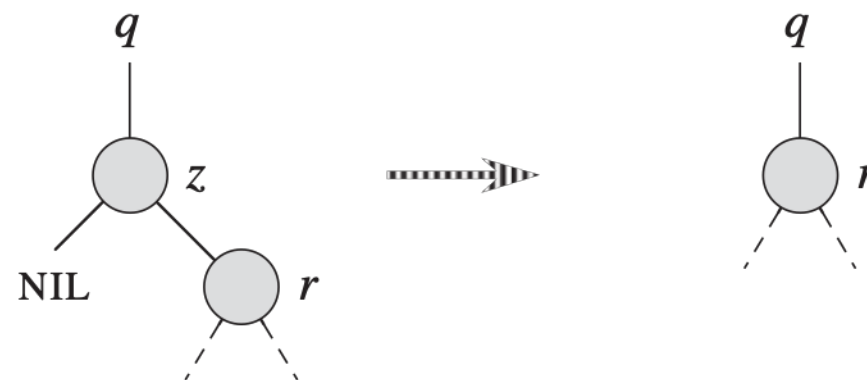
- To be able to move subtrees around within a binary search tree, we define a subroutine Transplant which can be used to replace one subtree with another subtree
- <sup>u → v</sup>transplant( $u, v, T$ ): replace the subtree rooted at node  $u$  with the subtree rooted at node  $v$ . So, node  $u$ 's parent becomes node  $v$ 's parent, and  $u$ 's parent ends up having  $v$  as its appropriate child

```
transplant(u, v, T):  
    p = u.parent  
    if (p != NULL):  
        if u == p.left:  
            p.left = v  
        else:  
            p.right = v  
    if (v != NULL):  
        v.parent = p
```



# Operation: Tree-Delete (4)

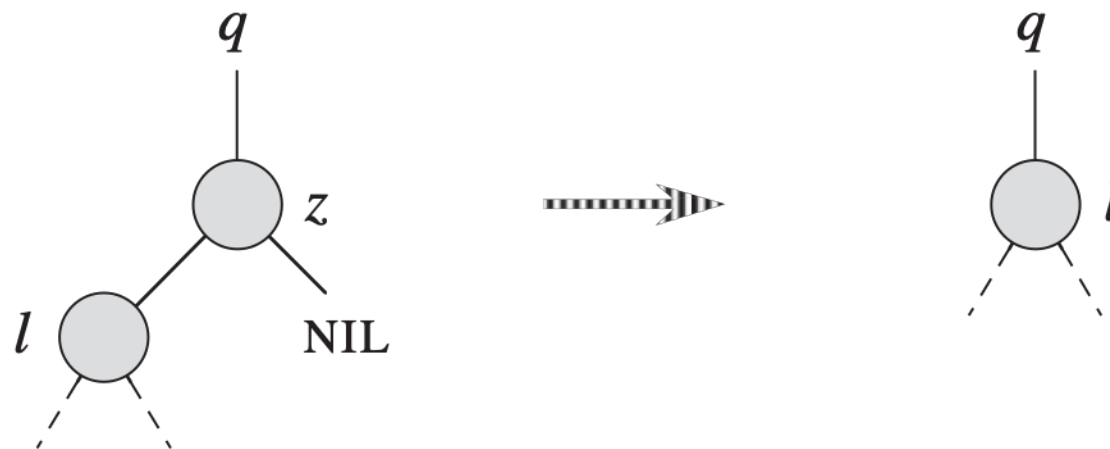
- **Case B.1**: If  $z$  has no left child, then we replace  $z$  by its right child, which may or may not be NULL
  - If  $z$ 's right child is NULL, this case deals with the situation in which  $z$  has no children at all
  - If  $z$ 's right child is not NULL, this case handles the situation in which  $z$  has just right child



```
//Case B.1  
if z.left == NULL:  
    transplant(z, z.right, T)
```

# Operation: Tree-Delete (5)

- **Case B.2**: If  $z$  has just one child, which is its left child, then we replace  $z$  by its left child

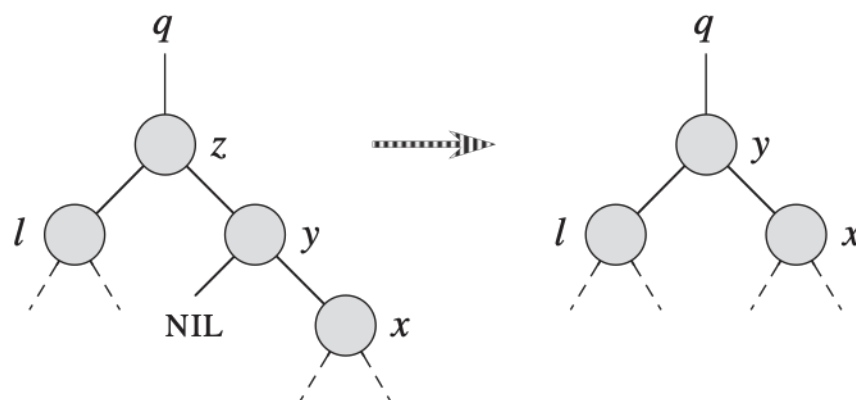


```
//Case B.2  
if z.right == NULL:  
    transplant(z, z.left, T)
```

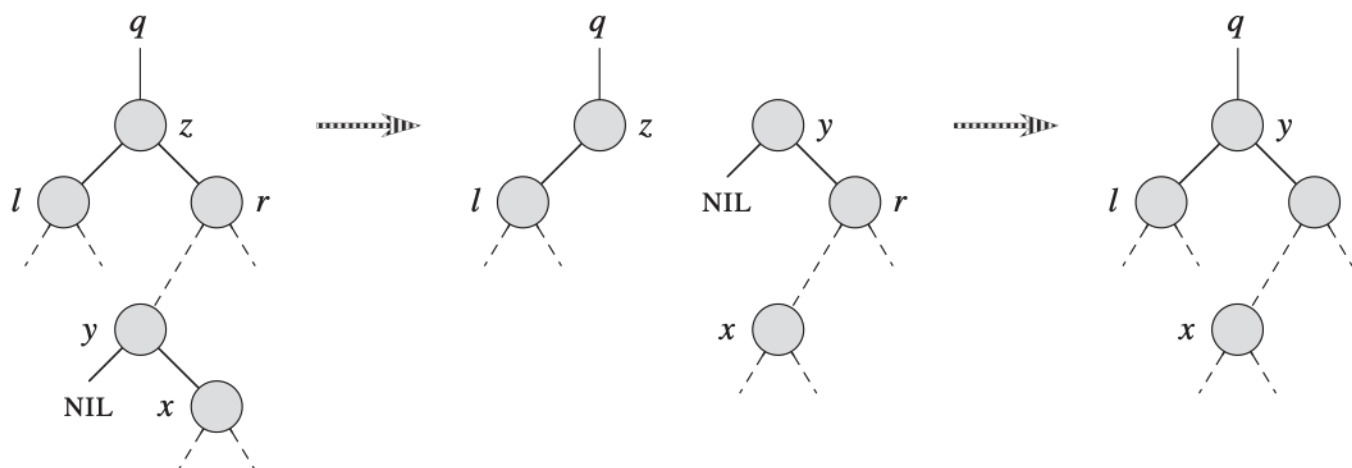
# Operation: Tree-Delete (6)

- **Case B.3:** If  $z$  has both left and right children, we find the **successor  $y$  of  $z$** . Then, we splice  $y$  out of its current location and let  $y$  take the position of  $z$

- **Case B.3.1:** If  $y$  is  $z$ 's right child, then we replace  $z$  with  $y$



- **Case B.3.2:** If  $y$  is not  $z$ 's right child, we first replace  $y$  with its own right child. Then, we replace  $z$  with  $y$



//Case B.3

if  $z.left \neq \text{NULL}$  and  $z.right \neq \text{NULL}$ :

$y = \text{minimum}(z.right)$

if ( $y.parent == z$ ): //Case B.3.1

$\text{transplant}(z, y, T)$

$\text{transplant}(y.left, l=z.left, T)$

else: //Case B.3.2

$\text{transplant}(y, x=y.right, T)$

$\text{transplant}(y.right, r=z.right, T)$

$\text{transplant}(z, y, T)$

$\text{transplant}(y.left, l=z.left, T)$

# Operation: Tree-Delete (7)

- Tree-Delete( $z, T$ ): delete an existing node object  $z$  from  $T$

```
Tree-Delete( $z, T$ ):  
    //Case B.1  
    if  $z.left == NULL$ :  
        transplant( $z, z.right, T$ )  
    //Case B.2  
    if  $z.right == NULL$ :  
        transplant( $z, z.left, T$ )  
    //Case B.3  
    if  $z.left != NULL$  and  $z.right != NULL$ :  
         $y = \text{minimum}(z.right)$   
        if ( $y.parent == z$ ):           //Case B.3.1  
            transplant( $z, y, T$ )  
            transplant( $y.left, l=z.left, T$ )  
        else:                          //Case B.3.2  
            transplant( $y, x=y.right, T$ )  
            transplant( $y.right, r=z.right, T$ )  
            transplant( $z, y, T$ )  
            transplant( $y.left, l=z.left, T$ )
```

# Operation: Tree-Delete (8)

```
struct node* treeDelete(struct node* node)
{
    if(node->left==NULL)    //Case B.1
        transplant(node, node->right);
    if(node->right==NULL)    //Case B.2
        transplant(node, node->left);
    if((node->left!= NULL)&&(node->right!=NULL)) //Case B.3
    {
        struct node* y = minimum(node->right);
        if(y->parent == node) {    // Case B.3.1
            transplant(node, y);
            transplant(y, node->left);
        } else {    // Case B.3.1
            transplant(y, y->right);
            transplant(y->right, node->right);
            transplant(node, y);
            transplant(y, node->left);
        }
    }
}
```

```
void transplant(struct node* u,
struct node* v)
{
    struct node* p = u->parent;
    if(p!=NULL) {
        if(u == p->left)
            p->left = v;
        else
            p->right = v;
    }
    if(v!=NULL)
        v->parent = p;
}
```

# Complexity of Operations on Binary Search Trees

Operations	Complexity
Search	$O(h)$
Minimum	$O(h)$
Maximum	$O(h)$
Successor	$O(h)$
Predecessor	$O(h)$
Tree-Insert	$O(h)$
Tree-Delete	$O(h)$
	<p><u>Remark:</u> <math>h</math> is the height of a binary tree.</p> <ul style="list-style-type: none"><li>- At worst, <math>h</math> can be <math>n-1</math>.</li><li>- At best, <math>h</math> can be <math>\log_2(n+1)-1</math>.</li></ul>