



# Lecture 5: Tree

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# 저작권 안내

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**(주)업스테이지가 제공하는 모든 교육 콘텐츠의 지식재산권은  
운영 주체인 (주)업스테이지 또는 해당 저작물의 적법한 관리자에게 귀속되어 있습니다.**

콘텐츠 일부 또는 전부를 복사, 복제, 판매, 재판매 공개, 공유 등을 할 수 없습니다.

유출될 경우 지식재산권 침해에 대한 책임을 부담할 수 있습니다.

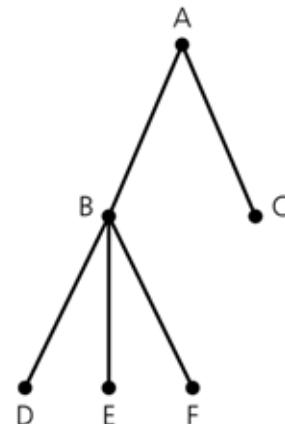
유출에 해당하여 금지되는 행위의 예시는 다음과 같습니다.

- 콘텐츠를 재가공하여 온/오프라인으로 공개하는 행위
- 콘텐츠의 일부 또는 전부를 이용하여 인쇄물을 만드는 행위
- 콘텐츠의 전부 또는 일부를 녹취 또는 녹화하거나 녹취록을 작성하는 행위
- 콘텐츠의 전부 또는 일부를 스크린 캡쳐하거나 카메라로 촬영하는 행위
- 지인을 포함한 제3자에게 콘텐츠의 일부 또는 전부를 공유하는 행위
- 다른 정보와 결합하여 Upstage Education의 콘텐츠임을 알아볼 수 있는 저작물을 작성, 공개하는 행위
- 제공된 데이터의 일부 혹은 전부를 Upstage Education 프로젝트/실습 수행 이외의 목적으로 사용하는 행위

# Definition of Tree

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- A general tree  $T$  is partitioned into disjoint subsets:
  - A single node  $r$ , the **root**
  - Sets of general trees, called **subtrees** of  $r$

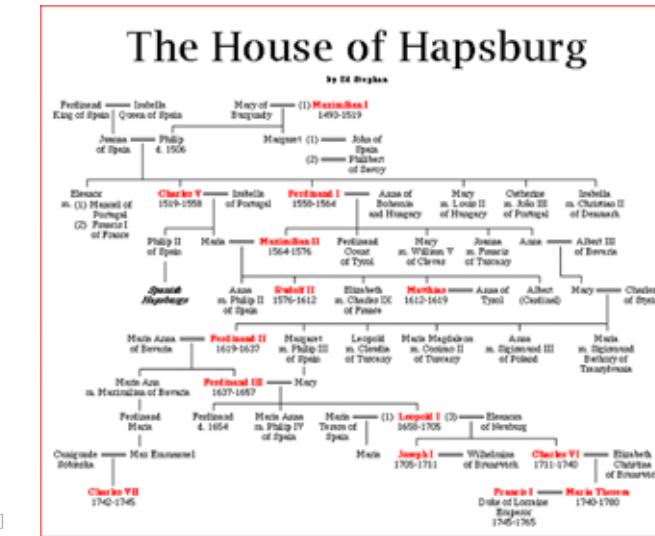


- Terminology
  - node (vertex)
  - edge
  - parent
  - child
  - siblings
  - root
  - leaf
  - ancestor
  - descendant
  - subtree

# Tree Examples



[1]



[2]

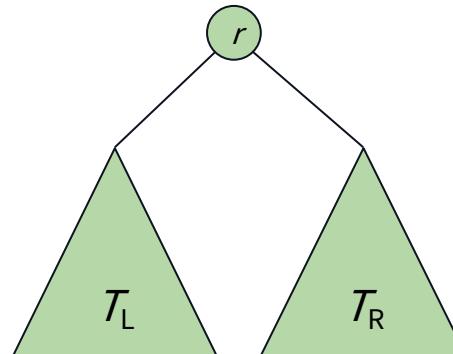
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# Binary Tree

# Definition of Binary Tree

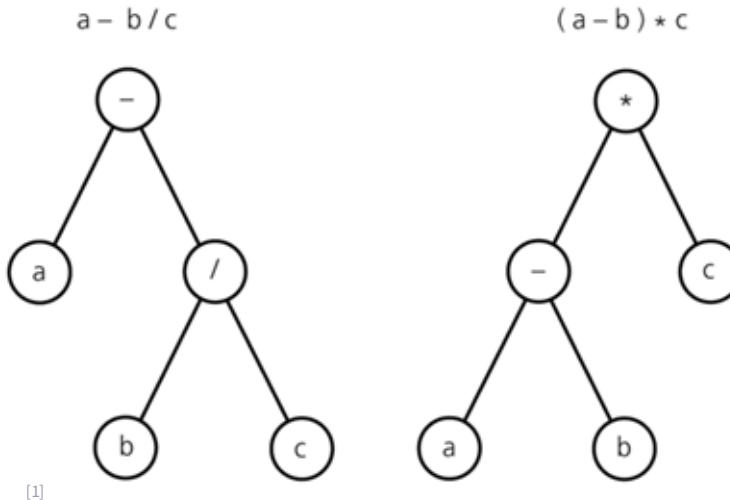
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- $T$  is **binary tree**, if
  - $T$  is empty, or
  - $T$  is partitioned into three disjoint subsets:
    - A single node  $r$ , the root
    - Up to two sets that are **binary trees**, called left and right subtrees of  $r$



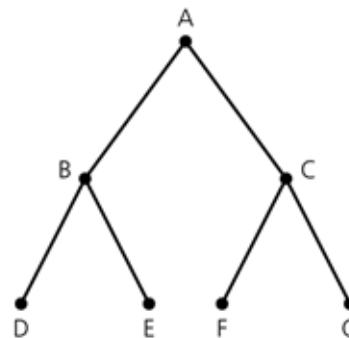
# An Example of Binary Tree

- Algebraic expressions

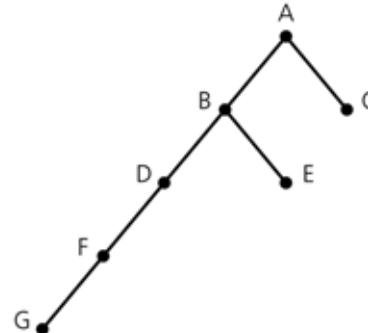


# Height of a Tree

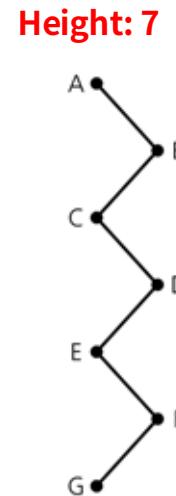
- Def. **Height** of a Tree: the **number of nodes** on the longest path from the root to a leaf.



Height: 3



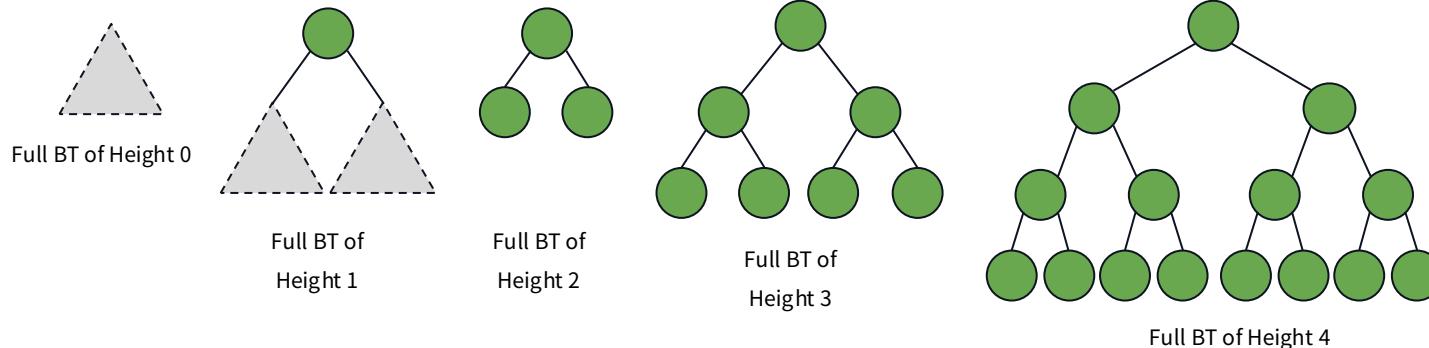
Height: 5



Height: 7

# Full Binary Tree

- Def. A binary tree  $T$  of height  $h$  is called **Full binary tree**, if
  - it is empty ( $h=0$ ), or
  - both its left and right subtrees are full (of height  $h-1$ ).

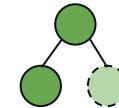


So now, you may feel why this is called **full** binary tree:

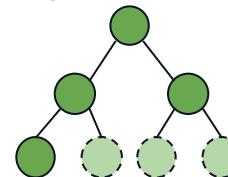
it is **filled with nodes at all possible positions!**

# Complete Binary Tree

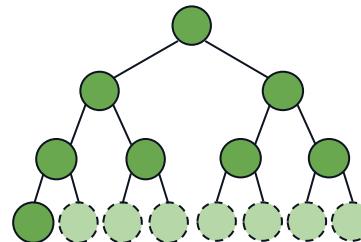
- Def. A binary tree  $T$  is called **Complete binary tree**, if
  - $T$  is full down to level  $h - 1$ , and
  - with level  $h$  filled in from left to right.



Complete BT of Height 2



Complete BT of Height 3



Complete BT of Height 4



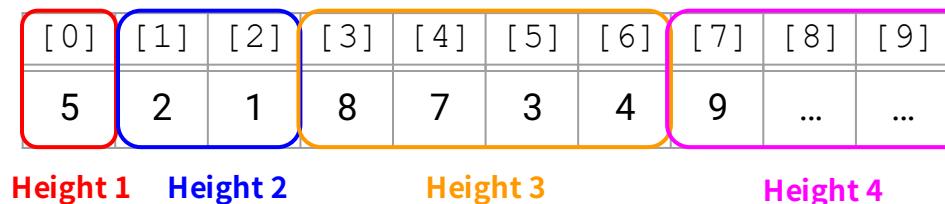
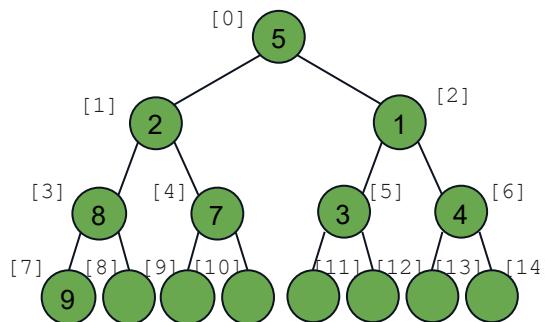
Must be filled (to be complete)



Optionally filled (to be complete)

# Array-based Implementation

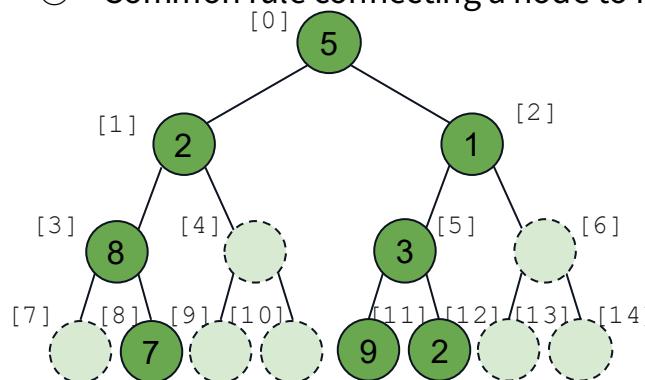
- Recall: Array is a fundamental data structure with **contiguous fixed-length chunk** of memory space.
  - When we implement `List` with an array, it was straightforward to map the indices.
  - How can we assign designated indices for a binary tree?
    - Let's assume the tree is full, and assign the indices from root, left to right.



This implementation is efficient if the tree is (almost) full or complete.

# Array-based Implementation

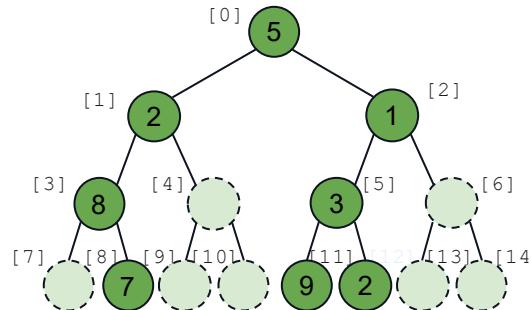
- One more thing to consider: How can we figure out **direct children** of a node?
  - With a tree, we usually access data from the root to the leaf.
  - Common rule connecting a node to its children?



- From parent, its **left child**:  
 $[parent\ index] * 2 + 1$  😊
- **Right child**:  
 $[parent\ index] * 2 + 2$  😊
- Similarly, from a child, its **parent**:  
 $[child\ index - 1] // 2$

# Array-based Implementation

- Now, think about more general case: the tree may not be close to complete.
  - If we don't have a node, we may set `None` (or some other indicator for emptiness).



[0]	[1]	[2]	[3]	[4]	[5]	[6]	[7]	[8]	[9]
5	2	1	8	None	3	None	None	7	...

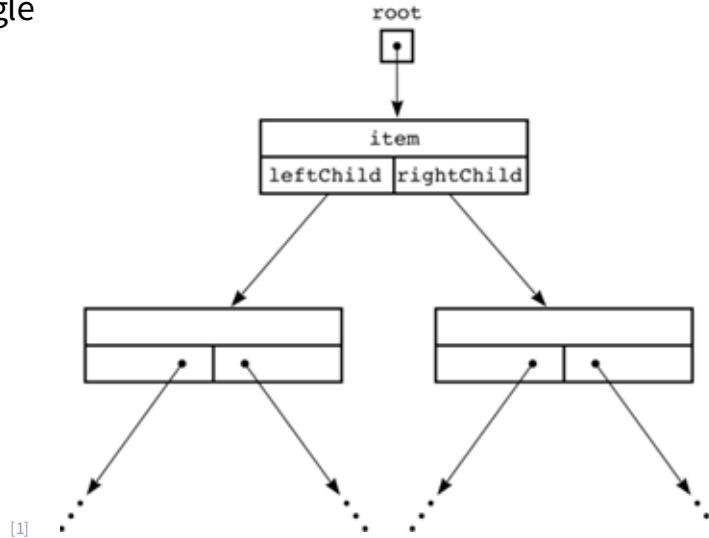
- This implementation becomes **less efficient** if the tree gets **far from full or complete**.

# Reference-based Implementation

- It is similar to the linked list; instead of having a single link to another node, Binary Tree Node has **two references** to other nodes!

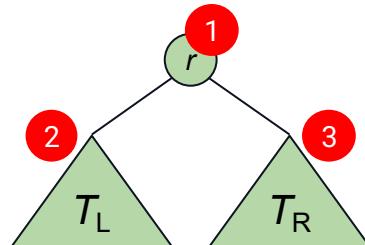
```
class TreeNode():
    def __init__(self, x):
        self.item = x
        self.left = None
        self.right = None
```

```
class BinaryTree():
    def __init__(self, node):
        self.root = node
```



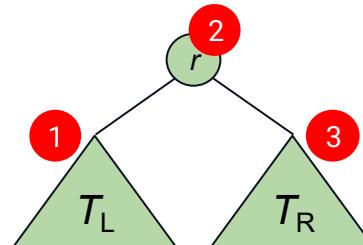
# Tree Traversal

- Traversal: **visiting all nodes once**
  - It is not straightforward to visit all nodes in a given tree, unlike an array or a linked list.
- There can be many different ways of traversal. We cover a few widely-used ones:



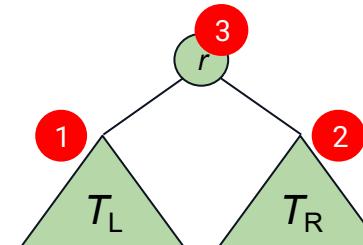
**Preorder**

Root - Left - Right



**Inorder**

Left - Root - Right



**Postorder**

Left - Right - Root

- Inside each subtree, the same rule applies recursively.

# Tree Traversal Example

- Preorder traversal?

60 {20 subtree} 70

60 20 10 {40 subtree} 70

60 20 10 40 30 50 70

- Inorder traversal?

{20 subtree} 60 70

10 20 {40 subtree} 60 70

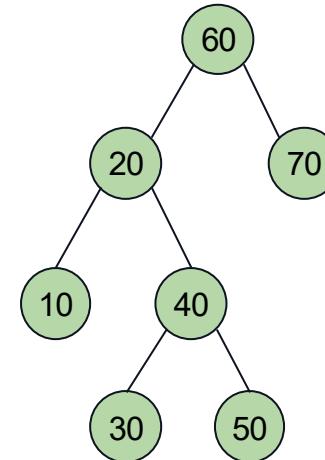
10 20 30 40 50 60 70

- Postorder traversal?

{20 subtree} 70 60

10 {40 subtree} 20 70 60

10 30 50 40 20 70 60



# Tree Traversal Implementation

- Use recursion!

- Base case: empty tree. Do nothing!
- General case: 2 recursive calls + visiting the root.
- The order depends on {pre, in, post}-order.

```
def preorder(node):  
    if node is not None:  
        print(node.item)  
        preorder(node.left)  
        preorder(node.right)  
  
preorder(root)
```

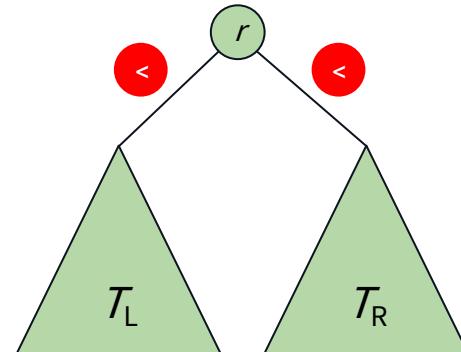
```
def inorder(node):  
    if node is not None:  
        inorder(node.left)  
        print(node.item)  
        inorder(node.right)  
  
inorder(root)
```

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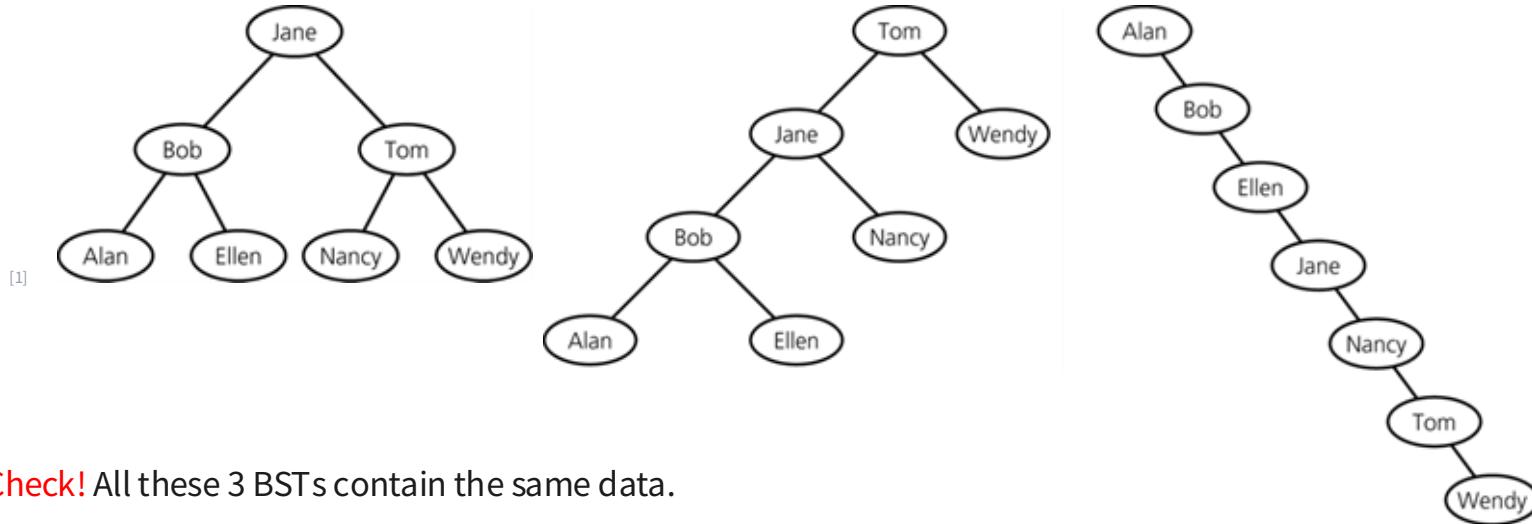
# Binary Search Tree

# Definition of Binary Search Tree

- Each node has a **search key**.
  - There are **no duplicates** among the search keys in a binary search tree.
- For each node  $n$ , it satisfies:
  - $n$ 's key is greater than all keys in its left subtree  $T_L$ .
  - $n$ 's key is less than all keys in its right subtree  $T_R$ .
  - Both  $T_L$  and  $T_R$  are binary search trees.



# Binary Search Tree Examples



**Check!** All these 3 BSTs contain the same data.

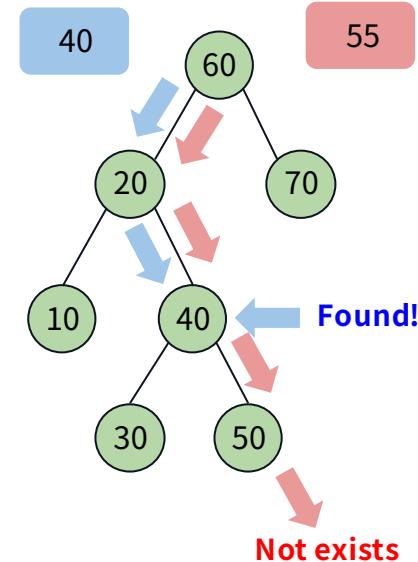
# Binary Search Tree Operations

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- **Insert** a new item into a binary search tree.
- **Retrieve (search)** the item with a given search key from a binary search tree.
- **Delete** the item with a given search key from a binary search tree.
- For all, according to the rule that  $\{\text{left subtree}\} < \text{root} < \{\text{right subtree}\}$  at all levels!

# Search (Retrieval)

- Task: Search if there is a node with the given key, and output the item if so.
  - If the given key is not in the tree, we should be able to figure it out as well.
- Main Idea: At each node, decide which subtree to search further. Only 3 cases:
  - [Case 1] If the **search key = item** at the node, we **found it!**
  - [Case 2] If the **search key < item** at the node, the target must be in its **left subtree** if exists.
  - [Case 3] If the **search key > item** at the node, the target must be in its **right subtree** if exists.
  - For Case 2 & 3, move to the corresponding subtree, then repeat the same testing.
  - Repeat until you reach at a leaf. If you still do not meet Case 1, we conclude the key is **not in the tree**.



# Search (Retrieval): Implementation

- Implementation based on recursive calls:

```
def search(root, key):  
    if root is None:  
        return None # Not found  
    elif key == root.item:  
        return root # Found  
    elif key < root.item:  
        return search(root.left, key)  
    else: # key > root.item  
        return search(root.right, key)
```

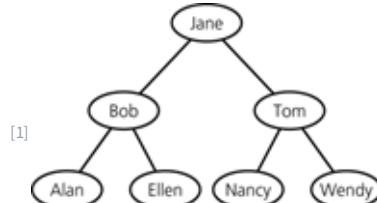


Base case (empty BST): Not found!

General case: case 1, 2, 3

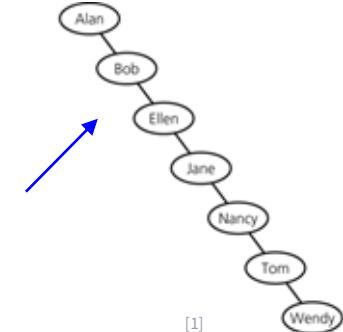
# Search (Retrieval): Time Complexity

- Time complexity of search operation?
  - At each node, we compare two values once, and decide where to go.  $\rightarrow O(1)$
  - How many times? **Length from the root to the leaf!**
- Thus, the worst time performance = tree height!
- In terms of  $N$ (the number of data points in the tree), what's the asymptotic (Big O) complexity of tree search?



If the tree is **balanced** (close to full), the height gets closer to  **$O(\log N)$** .

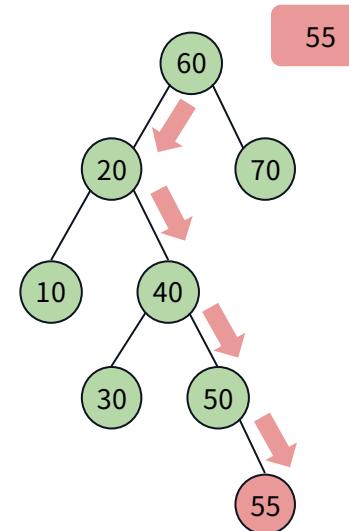
If the tree is unbalanced (close to linked list), the height gets closer to  **$O(N)$** .



Then, how the shape of a tree is determined? We will revisit this soon.

# Insertion

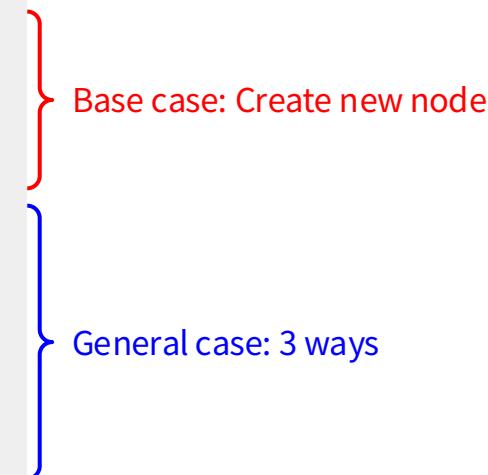
- Task: Insert a new key into the BST, preserving BST conditions.
  - We need to find the right location to put the new node.
- Main Idea: Insertion is basically a **failed search**. When we conclude the item does not exist, insert the new node right there!
  - [Case 1] If the **search key = item** at the node, we **found it!**
  - [Case 2] If the **search key < item** at the node, the target must be in its **left subtree** if exists.
  - [Case 3] If the **search key > item** at the node, the target must be in its **right subtree** if exists.
  - For Case 2 & 3, move to the corresponding subtree, then do the same testing.
  - Repeat until you reach at a leaf. **Insert the new node there!**



# Insertion: Implementation

- Implementation based on recursive calls:

```
def insert(root, item):  
    if root is None:  
        new_node = TreeNode(item)  
        return new_node  
    elif key == root.item:  
        # ERROR: already exists  
    elif key < root.item:  
        new_subtree = insert(root.left, item)  
        root.left = new_subtree  
        return root  
    else: # key > root.item  
        new_subtree = insert(root.right, item)  
        root.right = new_subtree  
        return root
```



# Deletion

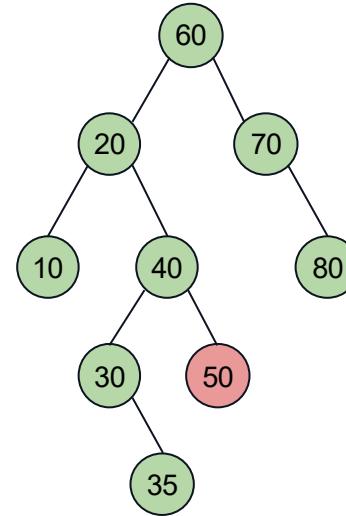
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- Task: Delete a node with the given key, **preserving BST conditions** after deletion.
  - After deletion of an intermediate node, the tree will be broken 😢.
- Main Idea:
  - [Case 1] If the node to delete is a **leaf**, simply remove it.
  - [Case 2] If the node to delete has a **single child**, the subtree will take it over.
  - [Case 3] If the node to delete has **both children**, elect the leftmost item in the right subtree as the new root.

# Deletion (Case 1)

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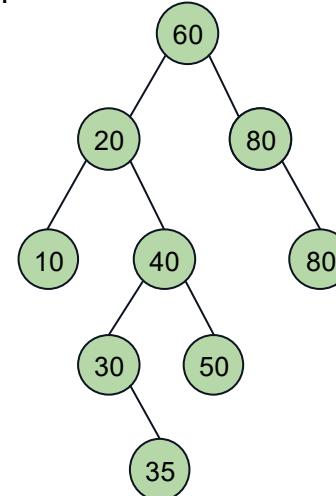
- When the target node is a **leaf**, we can simply remove it.
- After deletion, the resulting tree
  - is still **connected**, and
  - still **satisfies the BST conditions**.



## Deletion (Case 2)

- When the target node **has one child**, the existing child takes the position of the target node, taking its descendants (subtree).
- After the right subtree takes over, the resulting tree
  - is **no longer broken**,
  - still satisfies the BST conditions.
- After deletion, the resulting tree
  - is **broken**,
  - still satisfies the BST conditions.

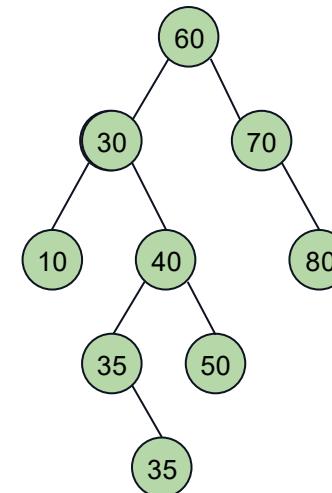
This slide is best seen with animations.



## Deletion (Case 3)

- When the target node **has both children**, we elect the target's immediate successor (=left-most node in the right subtree) as the new root.
- After deletion, the resulting tree is **broken**.
  - Cannot simply take one subtree as new root, since we have two.
- To make the resulting tree satisfy BST conditions, we elect the **immediate successor** of the deleted node. The resulting tree, however, is still **broken**!
  - Why immediate successor? With it, it's guaranteed to satisfy the BST conditions!
- The deleted immediate successor node may need to adopt its orphan right child (if any).
  - Here, it is guaranteed that no left child exists.

Similarly, we may nominate the **immediate predecessor** (=right-most item in the left subtree.)



# Deletion: Implementation

```
def delete(root, key):
    if root is None:
        return root

    if key < root.key:
        root.left = delete(root.left, key)
    elif key > root.key:
        root.right = delete(root.right, key)
    else:
        ... (to be continued)
```

Locating the target

delete function returns the subtree to  
replace the target node to be deleted.

# Deletion: Implementation

```
... (continuing)

else:
    if root.left is None:
        new_root = root.right
        root = None
        return new_root
    elif root.right is None:
        new_root = root.left
        root = None
        return new_root
    else:
        im_su = get_immediate_successor(root)
        root.key = im_su.key
        root.right = delete(root.right, im_su.key)

return root
```

Case 1: no child if `root.right` is also `None`

Case 2: single child

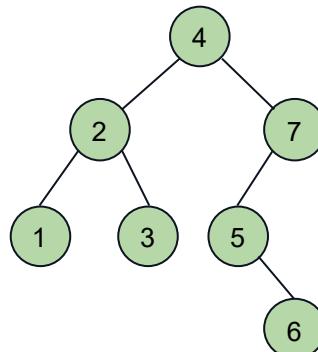
```
def get_immediate_successor(target):
    curr = target.right
    while curr.left is not None:
        curr = curr.left
    return curr
```

Case 3: both children

After this line, we now  
delete the node `im_su`.

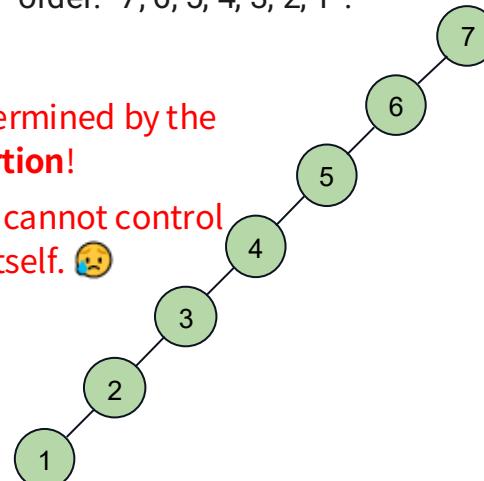
# Revisiting the shape of BST

- For a given data, how is the shape of BST determined?
  - Let's try to insert "4, 7, 2, 3, 5, 1, 6":
  - Suppose the same data is given in a different order: "7, 6, 5, 4, 3, 2, 1":



Shape of the tree is determined by the  
order of insertion!

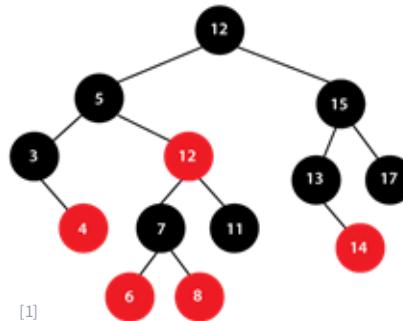
Unfortunately, we often cannot control  
the datastream itself. 😢



# Balanced Trees

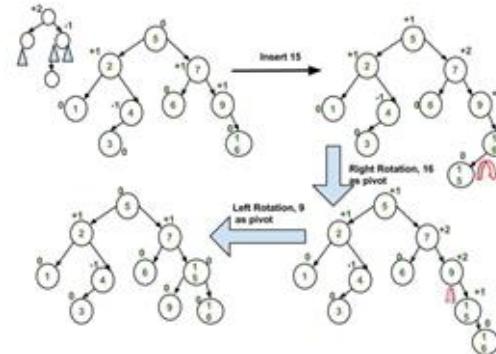
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- We desire to make the tree **more balanced** for faster operations.
- There are some special trees that **guarantee balance** up to some level, but details of them are beyond of this course.



**Red-black tree**

: guarantees that the height is lower than  $2 \log(N+1)$ .

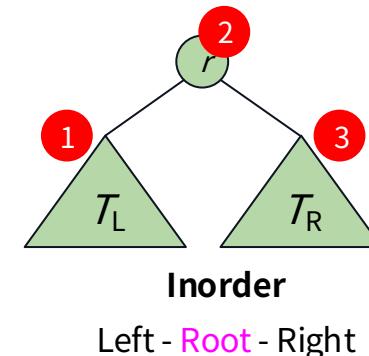


**AVL tree**

: guarantees that heights of the two child subtrees of any node differ by at most 1.

# Tree Sort

- **Inorder traversal** on a binary search tree lists the data in sorted order.
  - Due to the BST conditions, all values in the left subtree  $<$  root value  $<$  all values in the right subtree, at all nodes.
  - Inorder traversal visits nodes in the order of left - root - right!
- Time complexity?
  - We first need to insert all data into a BST.  
→  $O(\log N)$  per each element  $\times N$  of them =  $O(N \log N)$   
(This assumes use one of the balanced trees!)
  - Then, inorder traversal:  $O(N)$   
← we visit one node at a time.
  - Overall,  $O(N \log N)$  if the tree is balanced.  
Otherwise, worst performance will be  $O(N^2)$ .



# Time Complexity

- Time complexity of Binary Search Tree operations?

Task	Average-case	Worst-case
Insertion	$O(\log N)$	$O(N)$
Retrieval	$O(\log N)$	$O(N)$
Deletion	$O(\log N)$	$O(N)$
Traversal	$O(N)$	$O(N)$

When?

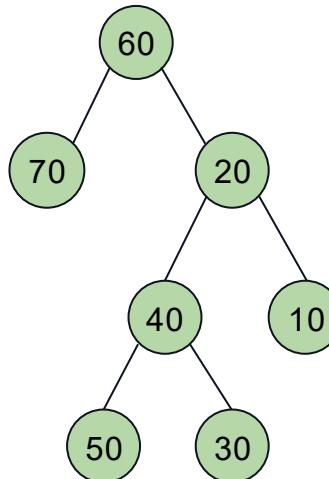
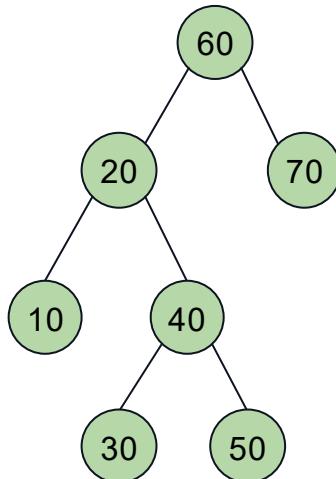
= When the tree is significantly unbalanced.

# Applications of Binary Search Trees

# Problem 1

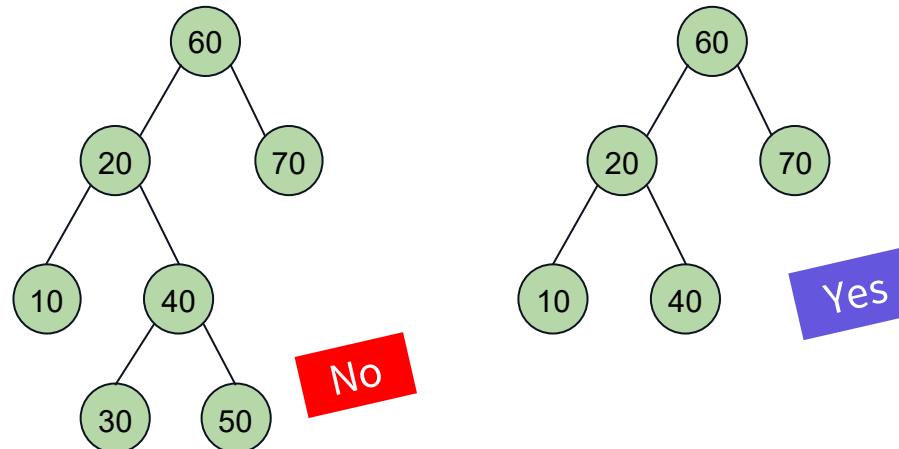
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- Test if two binary trees are symmetric.



## Problem 2

- Test if a binary tree is balanced.
  - A binary tree is balanced if the difference in the height of its left and right subtrees is at most 1 for all nodes in the tree.



# Problem 3

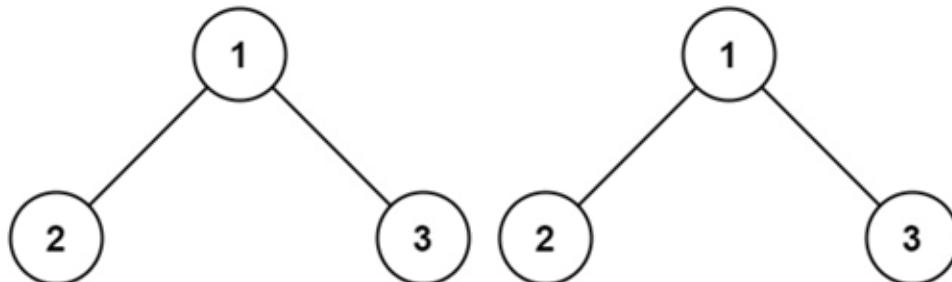
## 100. Same Tree

Easy Topics Companies

Given the roots of two binary trees  $p$  and  $q$ , write a function to check if they are the same or not.

Two binary trees are considered the same if they are structurally identical, and the nodes have the same value.

Example 1:

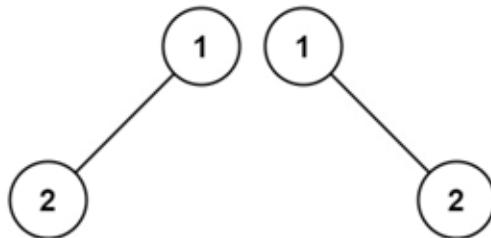


Input:  $p = [1,2,3]$ ,  $q = [1,2,3]$

Output: true

## Problem 3

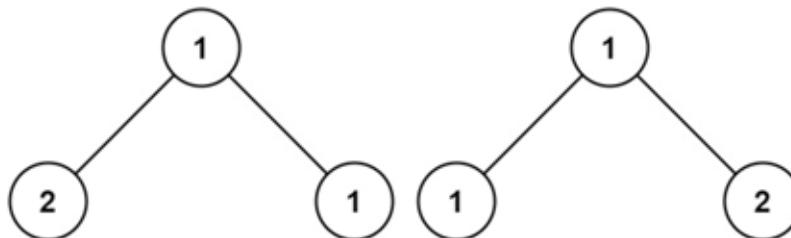
Example 2:



Input: p = [1,2], q = [1,null,2]

Output: false

Example 3:





# Building intelligence for the future of work