

# DATA STRUCTURES & ALGORITHMS

## Lecture 6: TREES – Part 1

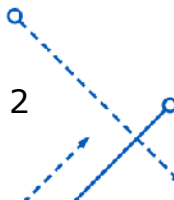
### Binary Tree, Binary Search Tree

Lecturer: Dr. Nguyen Hai Minh

# CONTENT

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- Introduction
  - Trees
  - Binary trees
  - Binary search trees
- Implementing binary trees
- Tree traversal
- Querying, insertion, deletion a binary search tree
- Balancing a tree
- Heap – Priority queue



# TREES

- The Tree ADT
- Tree Traversal

# Introduction

## □ Arrays:

- Static → inflexible
- Search:  $O(\log_2 n)$  (ordered array)

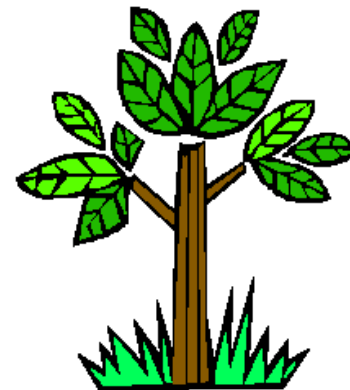
## □ Linked lists:

- Dynamic → difficult to represent the hierarchical structure of objects.
- Insert/delete:  $O(1)$

## □ Stacks, queues:

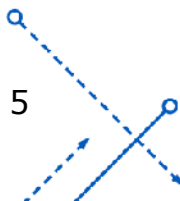
- Limited to one dimension

→ **Trees**



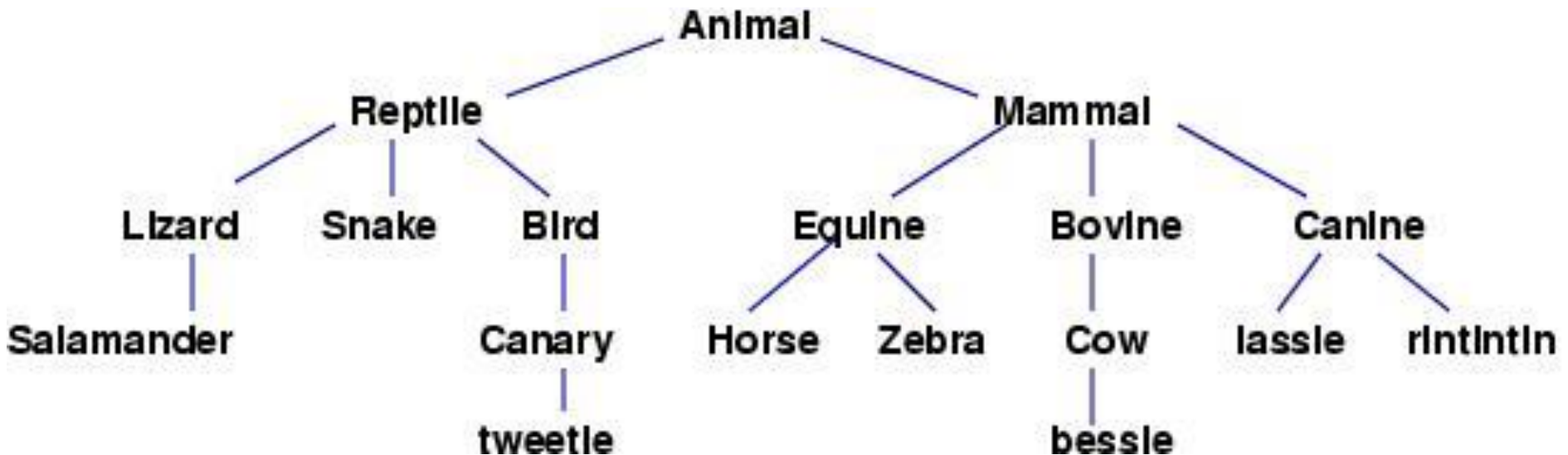
# Trees

- ❑ Fundamental data storage structures used in programming.
- ❑ Combines advantages of an ordered array and a linked list.
- ❑ Searching as fast as in ordered array.
- ❑ Insertion and deletion as fast as in linked list.



# Trees – Example

□ Species tree:

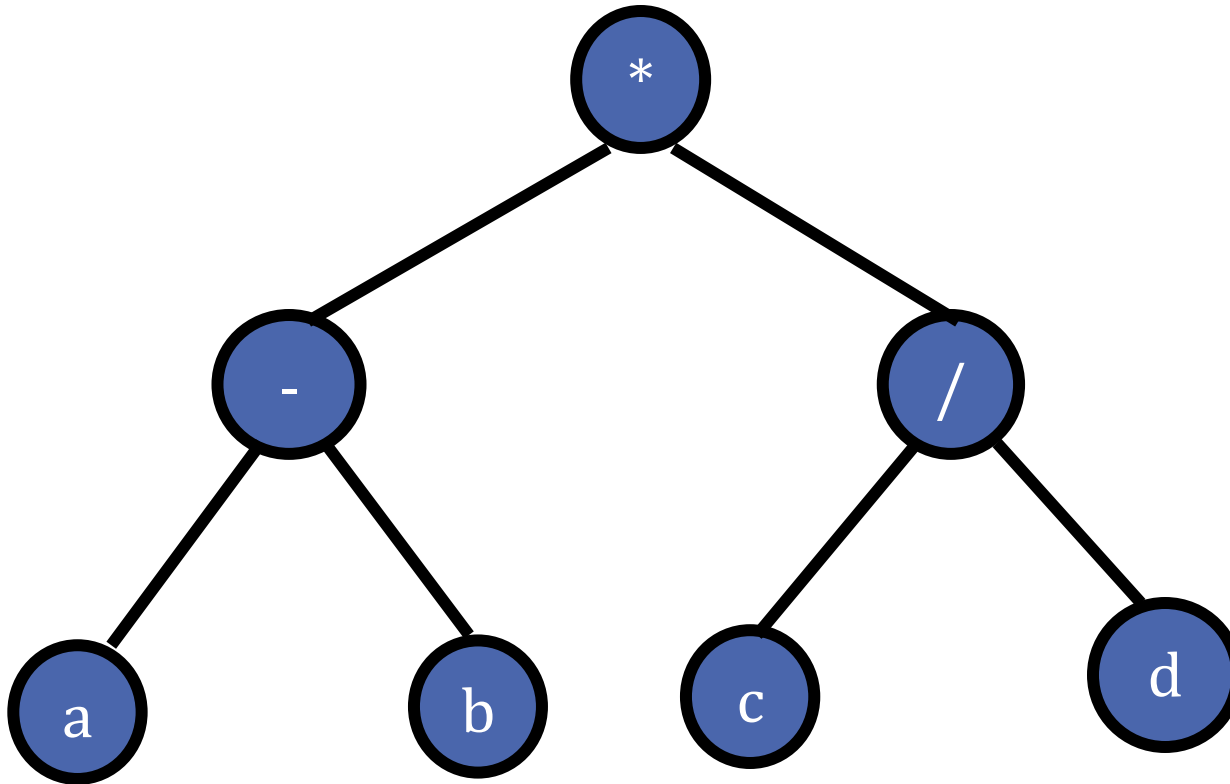


```

graph TD
    VP[VP] -.-> NP1[NP]
    VP --> Vbar1[V̄]
    NP1 --> N1[N]
    N1 --> He[He]
    Vbar1 --> Vbar2[V̄]
    Vbar1 -.-> PP[PP]
    Vbar2 --> V[V]
    V --> studies[studies]
    Vbar2 --> NP2[NP]
    NP2 --> N2[N]
    N2 --> N3[N]
    N3 --> linguistics[linguistics]
    PP --> Pbar[P̄]
    Pbar --> P[P]
    P --> at[at]
    Pbar --> NP3[NP]
    NP3 --> DetP[DetP]
    DetP --> Det[Det]
    Det --> the[the]
    NP3 --> N4[N]
    N4 --> N5[N]
    N5 --> university[university]
  
```

# Trees – Example

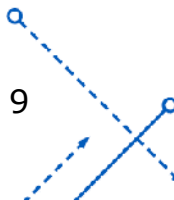
- A tree of the expression  $(a-b)^*(c/d)$ :



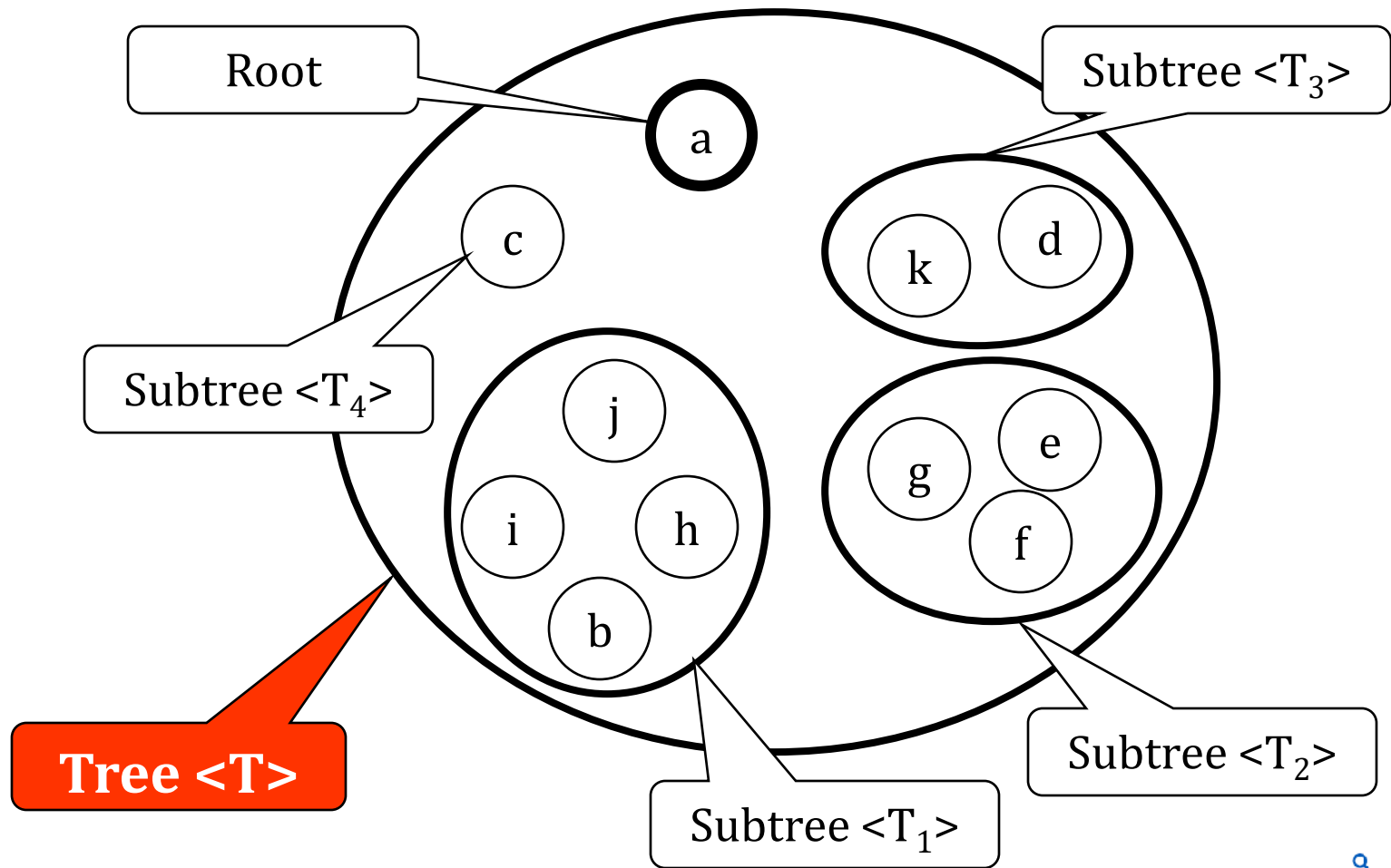


# Trees – Definition

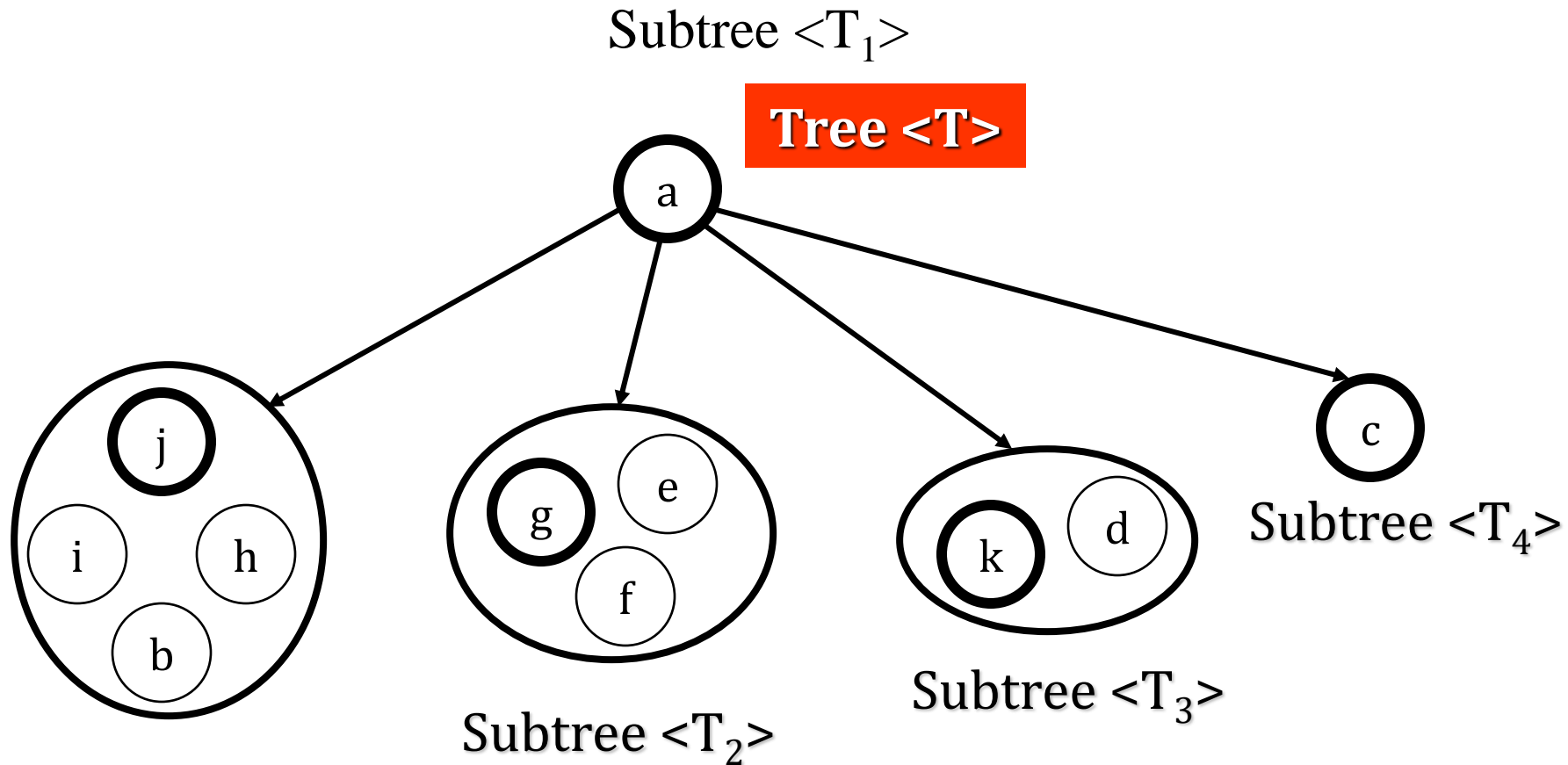
1. An *empty structure* is an *empty tree*
2. If  $T_1, \dots, T_k$  are disjoint trees, then the structure  $T$  whose root has as its children the roots of  $T_1, \dots, T_k$  is also a tree.
3. Only structures generated by 1 and 2 are trees.



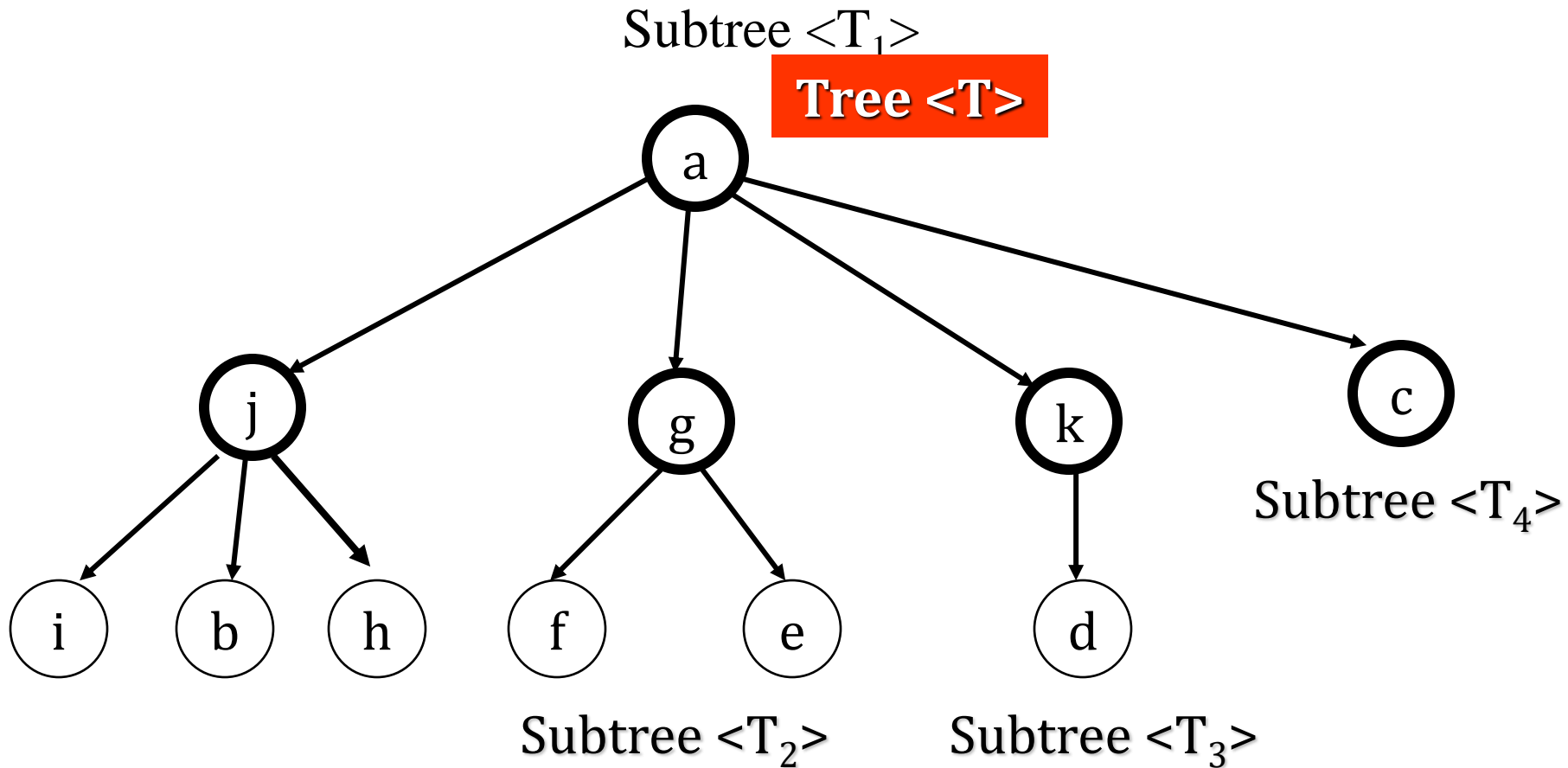
# Tree ADT – Example



# Tree ADT – Example



# Tree ADT – Example



# Trees characteristics

- Unlike natural trees, these trees are *upside down*
  - Root at the top
  - Leaves at the bottom
- Consists of *nodes* connected by *edges*.
  - Nodes often represent *entities* (complex objects) such as people, car parts etc.
  - Edges between the nodes represent the way the nodes are *related*.
- **No cycle**



# Trees – Terminology

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1. Node
2. Edge (Branch)
3. Parent node
4. Child node
5. Sibling nodes
6. Root node
7. Leaf node
8. Internal node
9. Degree of a node
10. Degree of a tree
11. Path
12. Subtree
13. Level/Depth
14. Height



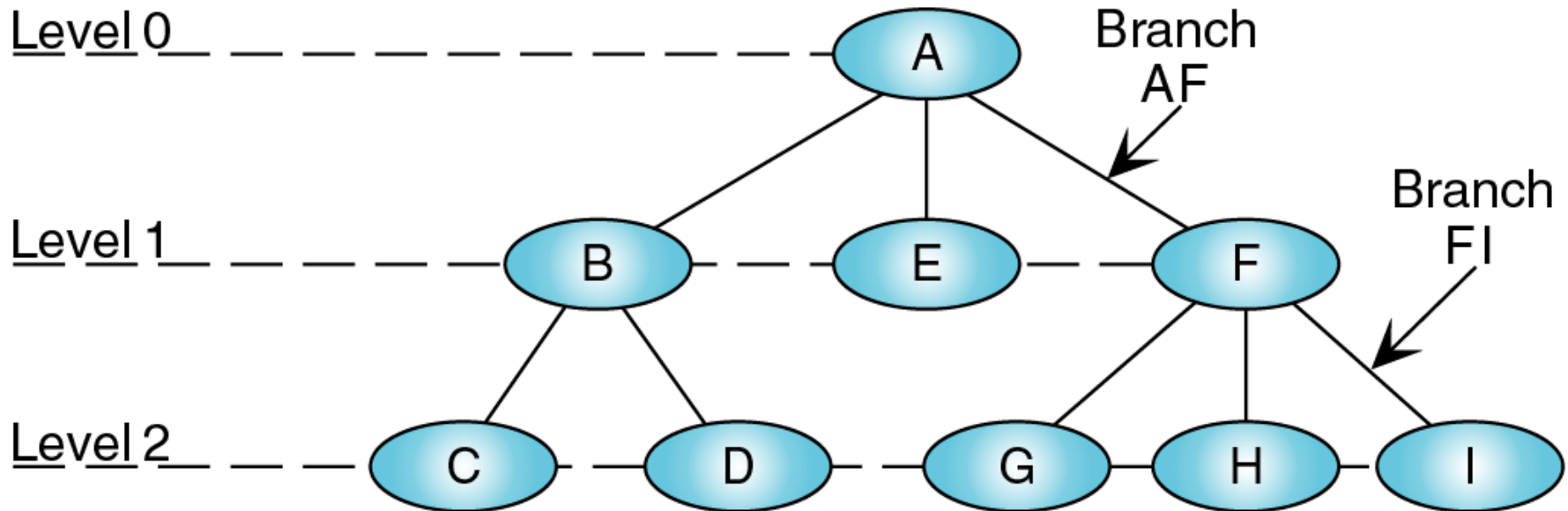
# Trees – Terminology

- 5. Sibling nodes: nodes that have the same parent.
- 8. Internal nodes: nodes that have both parent and children.
  - Special case: **root** is also an internal node unless it is a leaf.
- 9. Degree of a node: the number of its children
- 10. Degree of a tree: the max degree of all nodes
- 13. Level (or Depth) of a node  $p$ :
  - $\text{Level}(p) = 0$  if  $p = \text{root}$
  - $\text{Level}(p) = 1 + \text{Level}(\text{Parent}(p))$  if  $p \neq \text{root}$
- 14. Height of a tree: the number of edges on the longest path from the root to the farthest leaf.



# Trees – Terminology

□ A tree with height = 2



Root: A

Parents: A, B, F

Children: B, E, F, C, D, G, H, I

Siblings: {B, E, F}, {C, D}, {G, H, I}

Leaves: C, D, G, H, I

Internal nodes: A, B, F

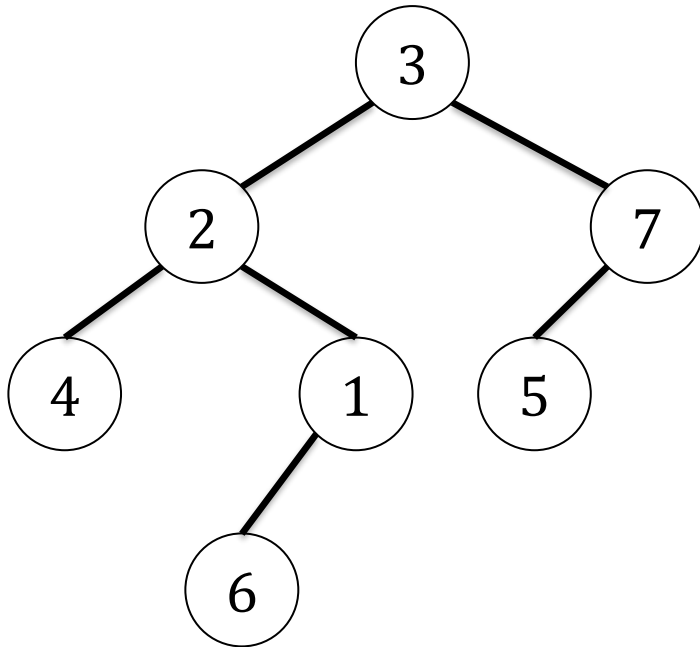


# Binary trees

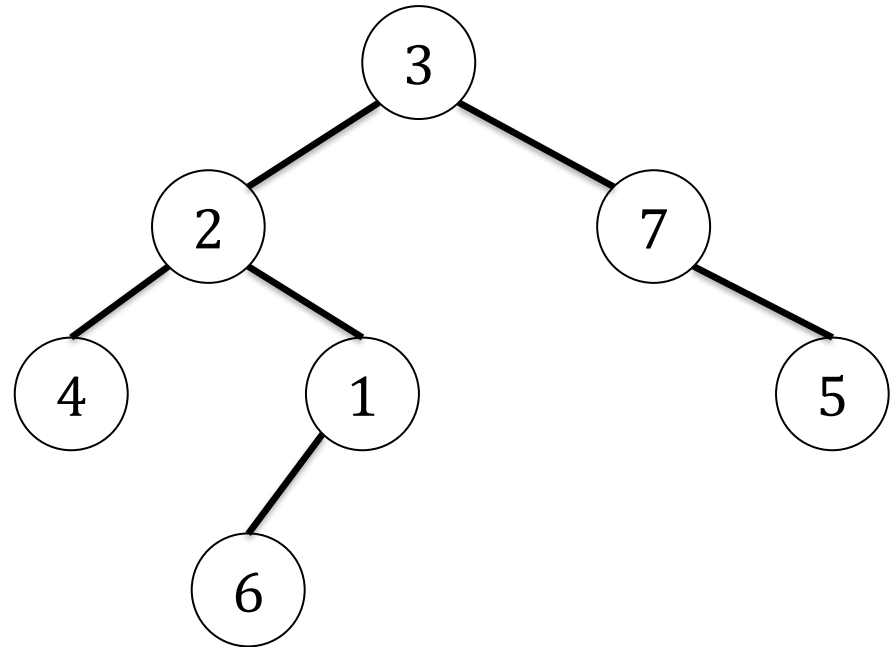
- **Definition:** A binary tree  $T$  is a structure defined on a finite set of nodes that either
  - contains no nodes, or
  - is composed of 3 disjoint sets of nodes:
    - a root node
    - a binary tree called its *left subtree*
    - a binary tree called its *right subtree*
- What about this definition:
  - $T$  is a binary tree if  $\text{Degree}(T) = 2$
- not enough since in a binary tree, if a node has just one child, the position of the child (*left* child/*right* child) matters.



# Binary trees – Example



(a)

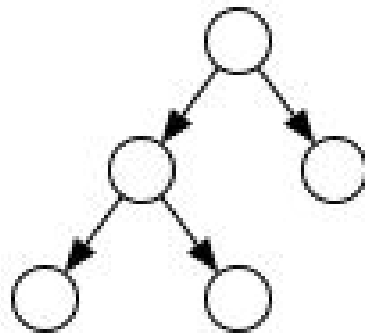


(b)

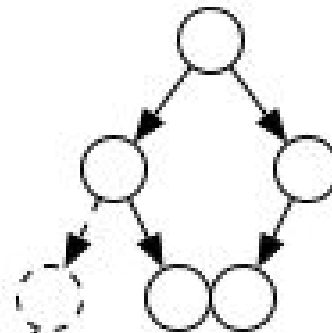
# Types of binary trees

## □ Complete binary tree:

- From level 0 to level  $h-1$ : the tree is completely full (maximum number of nodes)
- The nodes at the last level are filled from left to right.



Complete Tree



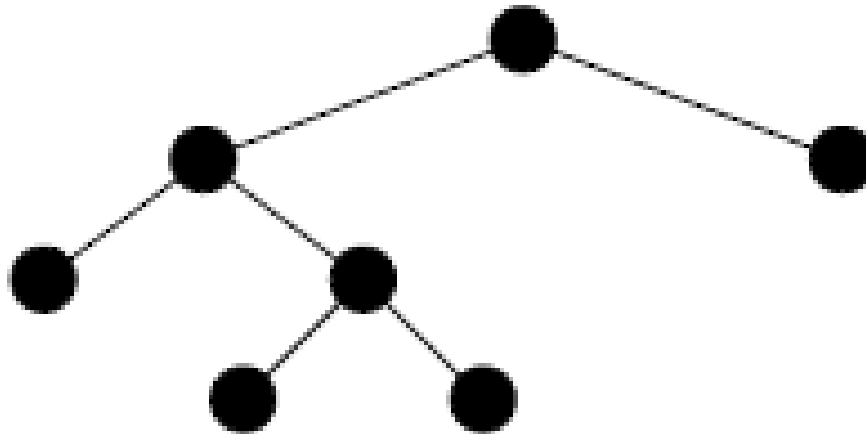
Incomplete Tree

Missing Node Here

# Types of binary trees

## □ Full binary tree:

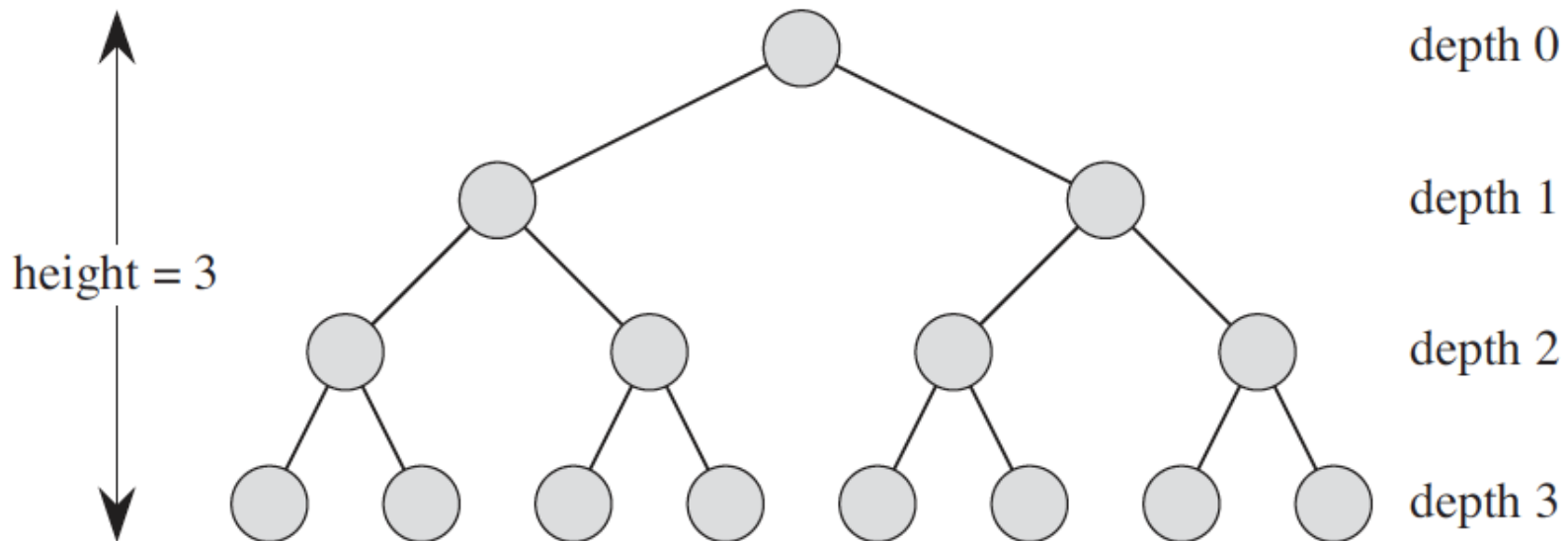
- Each node is either a leaf or has degree exactly 2.



# Types of binary trees

## □ Perfect binary tree:

- A full binary tree in which all leaf nodes are at the same level.



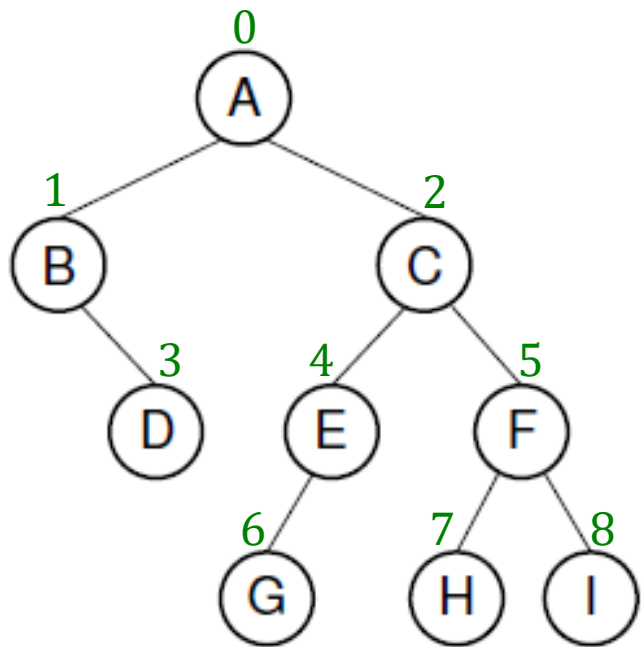
# Maximum number of nodes in binary trees

Height	Nodes at one level	Nodes at all levels
0	$2^0 = 1$	$1 = 2^1 - 1$
1	$2^1 = 2$	$3 = 2^2 - 1$
2	$2^2 = 4$	$7 = 2^3 - 1$
3	$2^3 = 8$	$15 = 2^4 - 1$
10	$2^{10} = 1,024$	$2,047 = 2^{11} - 1$
13	$2^{13} = 8,192$	$16,383 = 2^{14} - 1$
$h$	$2^h$	$n = 2^{h+1} - 1$



# Implement a binary tree

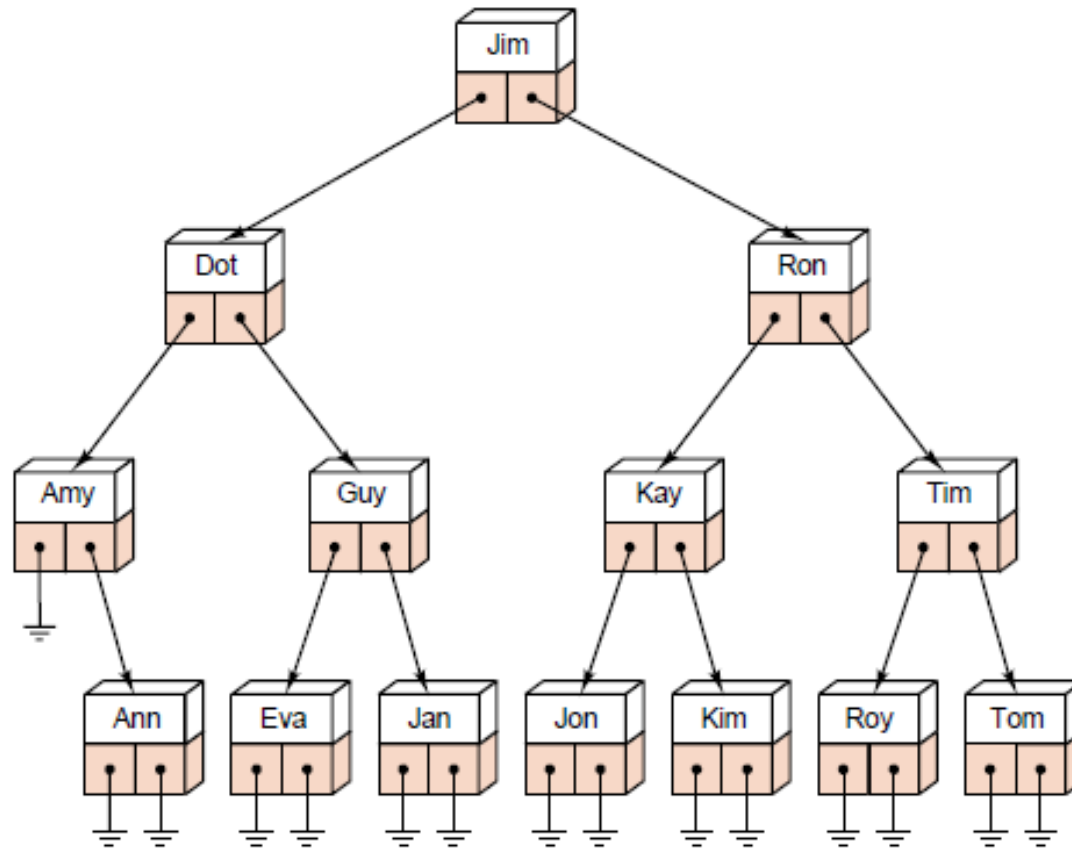
□ Using an array:



index	Node	Left	Right
0	A	1	2
1	B	-1	3
2	C	4	5
3	D	-1	-1
4	E	6	-1
5	F	7	8
6	G	-1	-1
7	H	-1	-1
8	I	-1	-1

# Implement a binary tree

□ Using pointers:

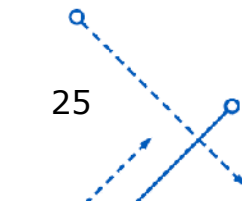




# Tree traversal

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- Tree traversal (or tree walk): allow us to print out all the keys in a tree.
- 3 strategies:
  - In-order traversal (LNR – Left Node Right)
  - Pre-order traversal (NLR – Node Left Right)
  - Post-order traversal (LRN – Left Right Node)



# Tree traversal

## INORDER-TREE-WALK( $x$ )

1. **if**  $x \neq \text{NIL}$
2.     **then** INORDER-TREE-WALK( $x.\text{left}$ )
3.         print  $x.\text{key}$
4.     INORDER-TREE-WALK( $x.\text{right}$ )

## PREORDER-TREE-WALK( $x$ )

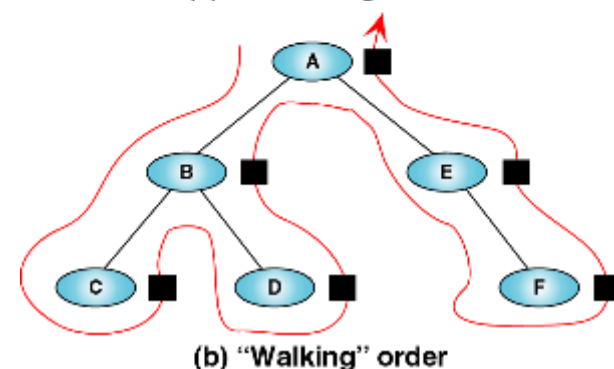
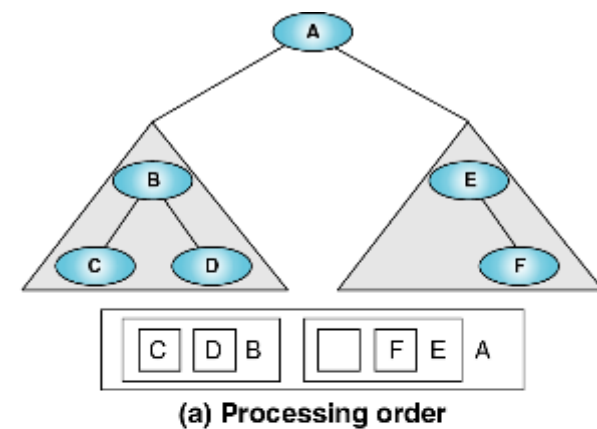
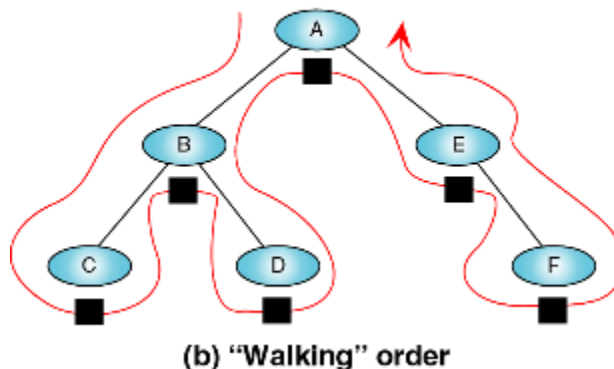
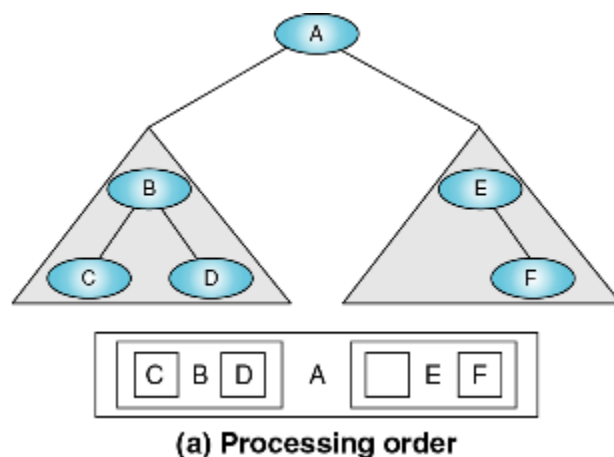
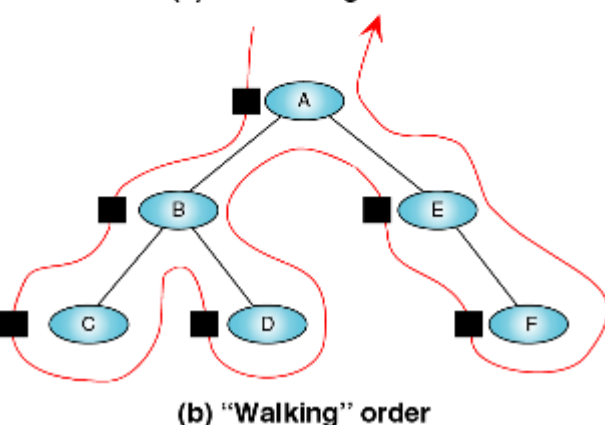
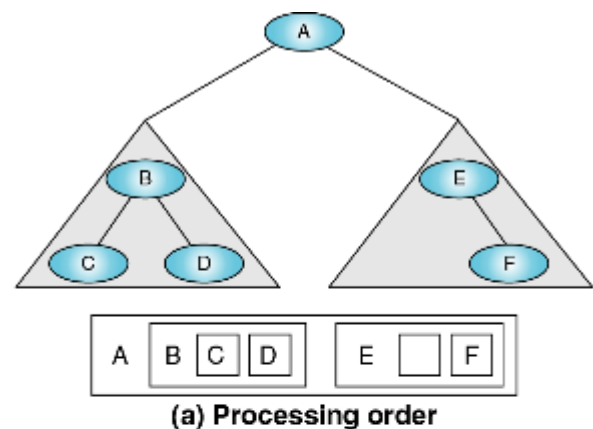
1. **if**  $x \neq \text{NIL}$
2.     **then** print  $x.\text{key}$
3.     PREORDER-TREE-WALK ( $x.\text{left}$ )
4.     PREORDER-TREE-WALK ( $x.\text{right}$ )

## POSTORDER-TREE-WALK( $x$ )

1. **if**  $x \neq \text{NIL}$
2.     **then** POSTORDER-TREE-WALK ( $x.\text{left}$ )
3.     POSTORDER-TREE-WALK ( $x.\text{right}$ )
4.     print  $x.\text{key}$



# Tree traversal



Pre-order tree walk  
7/7/2023 NLR

In-order tree walk  
nhminh@fit-hcmus

Post-order tree walk  
LRN 27

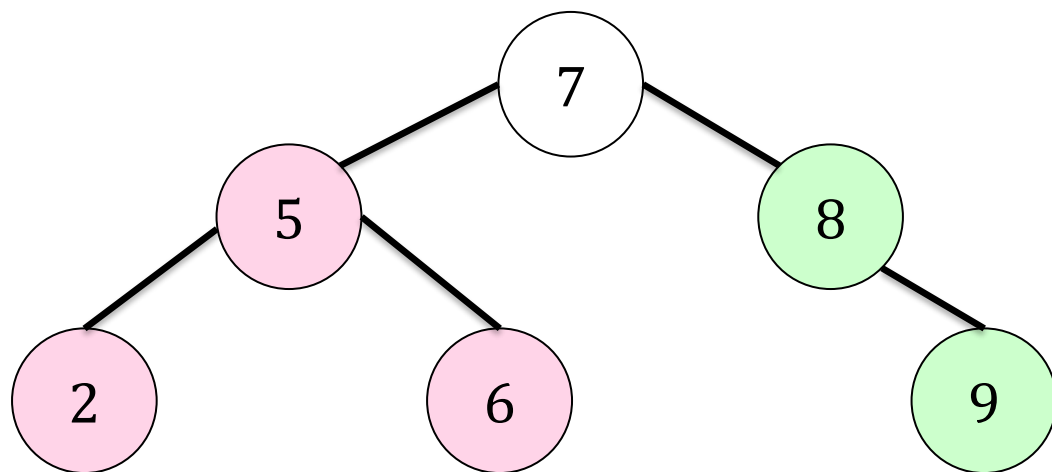
# BINARY SEARCH TREES

# Binary search trees

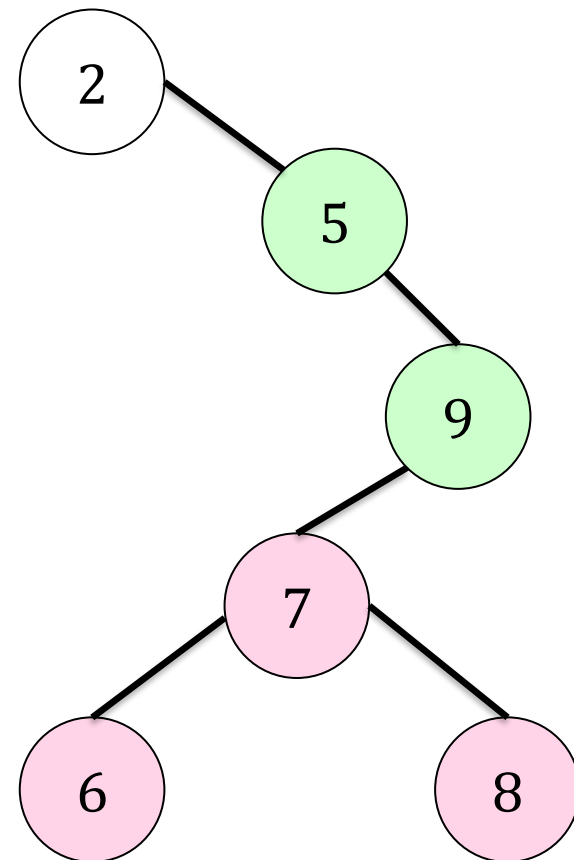
- **Definition:** A **binary search tree (BST)** is a binary tree which storing keys in a way that satisfies the ***binary-search-tree property***:
  - Let  $x$  be a node in a BST
  - If  $y$  is a node in the left subtree of  $x$ , then  $x.key \geq y.key$
  - If  $y$  is a node in the right subtree of  $x$ , then  $x.key < y.key$
- **Why using a BST?**
  - Fast for basic operations: insert, delete, search



# Binary search tree – Example



(a)



(b)

# Querying a binary search tree

## □ Operations:

- Searching
- Minimum and maximum
- Successor and predecessor
- Insertion and deletion

□ **Theorem.** We can implement the dynamic-set operations **SEARCH**, **MINIMUM**, **MAXIMUM**, **SUCCESSOR**, and **PREDECESSOR** so that each one runs in  $O(h)$  time on a BST of height  $h$ .



# Searching a BST

**TREE-SEARCH**( $x, k$ )

1. **if**  $x == NIL$  or  $k == x.key$
2.       **return**  $x$
3. **if**  $k < x.key$
4.       **return** TREE-SEARCH( $x.left, k$ )
5. **else return** TREE-SEARCH( $x.right, k$ )

$O(h)$

Recursive version





# Searching a BST

TREE-SEARCH( $x, k$ )

1. **while**  $x \neq NIL$  and  $k \neq x.key$
2.       **if**  $k < x.key$
3.          $x = x.left$
4.       **else**
5.          $x = x.right$
6. **return**  $x$

$O(h)$

Iterative version



# Minimum and maximum

**TREE-MINIMUM**( $x$ )

1. **while**  $x.left \neq \text{NIL}$
2.        $x = x.left$
3. **return**  $x$

$O(h)$

**TREE-MAXIMUM**( $x$ )

1. **while**  $x.right \neq \text{NIL}$
2.        $x = x.right$
3. **return**  $x$

$O(h)$



# Successor and predecessor

- If all keys are distinct, the **successor** of a node  $x$  is:
  - the node with the **smallest key greater** than  $x.key$ .
  - NIL if  $x$  has the largest key in the tree.
  
- If all keys are distinct, the **predecessor** of a node  $x$  is:
  - the node with the **largest key smaller** than  $x.key$ .
  - NIL if  $x$  has the smallest key in the tree.



# Successor and predecessor

## TREE-SUCCESSOR( $x$ )

1. **if**  $x.right \neq \text{NIL}$
2.     **return** TREE-MINIMUM( $x.right$ )
3.  $y = x.p$
4. **while**  $y \neq \text{NIL}$  and  $x == y.right$
5.      $x = y$
6.      $y = y.p$
7. **return**  $y$

$O(h)$

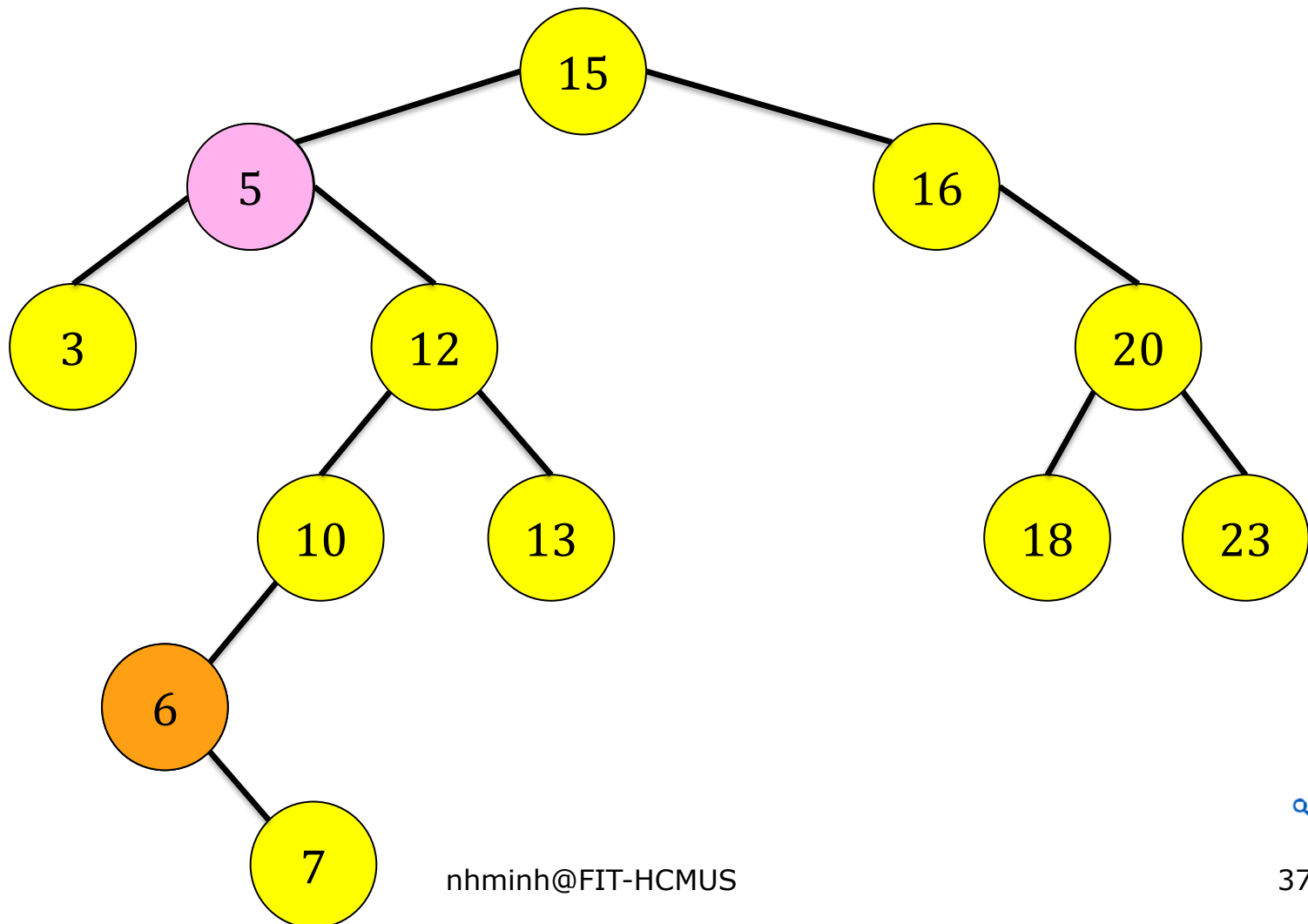
## TREE-PREDECESSOR( $x$ )

...



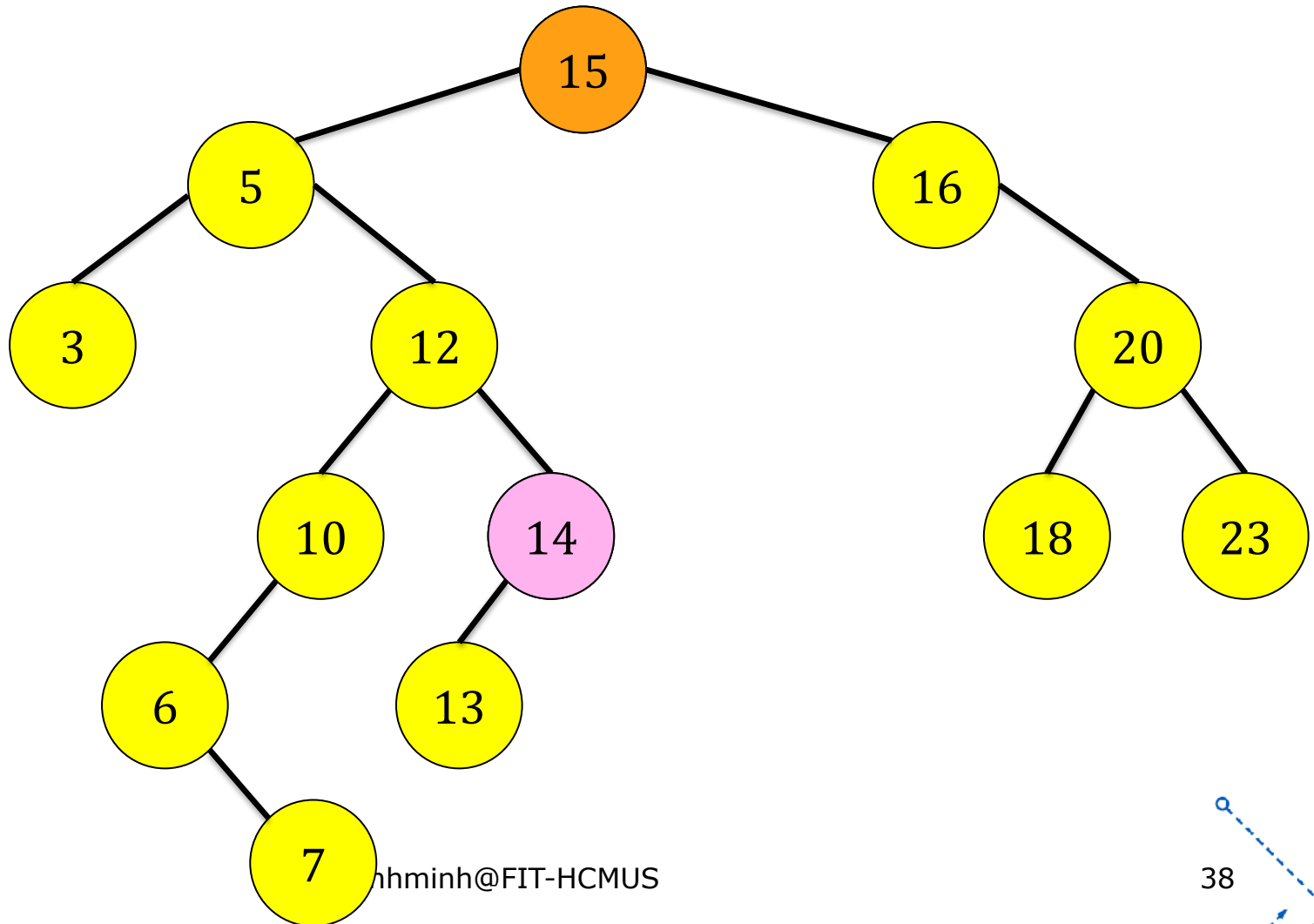
# Successor – Example

□ Successor of 5 is: 6



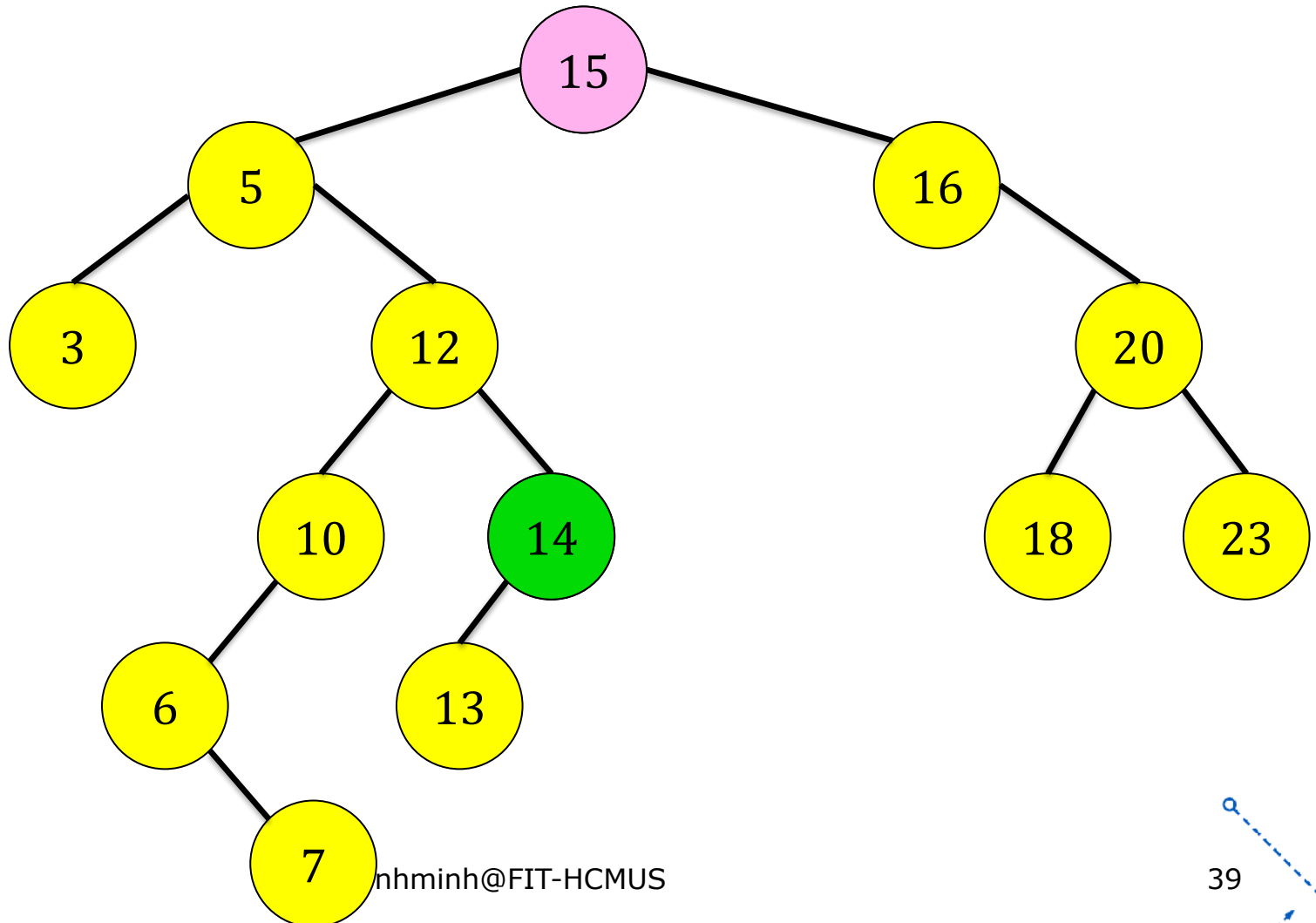
# Successor – Example

□ Successor of 14 is: 15



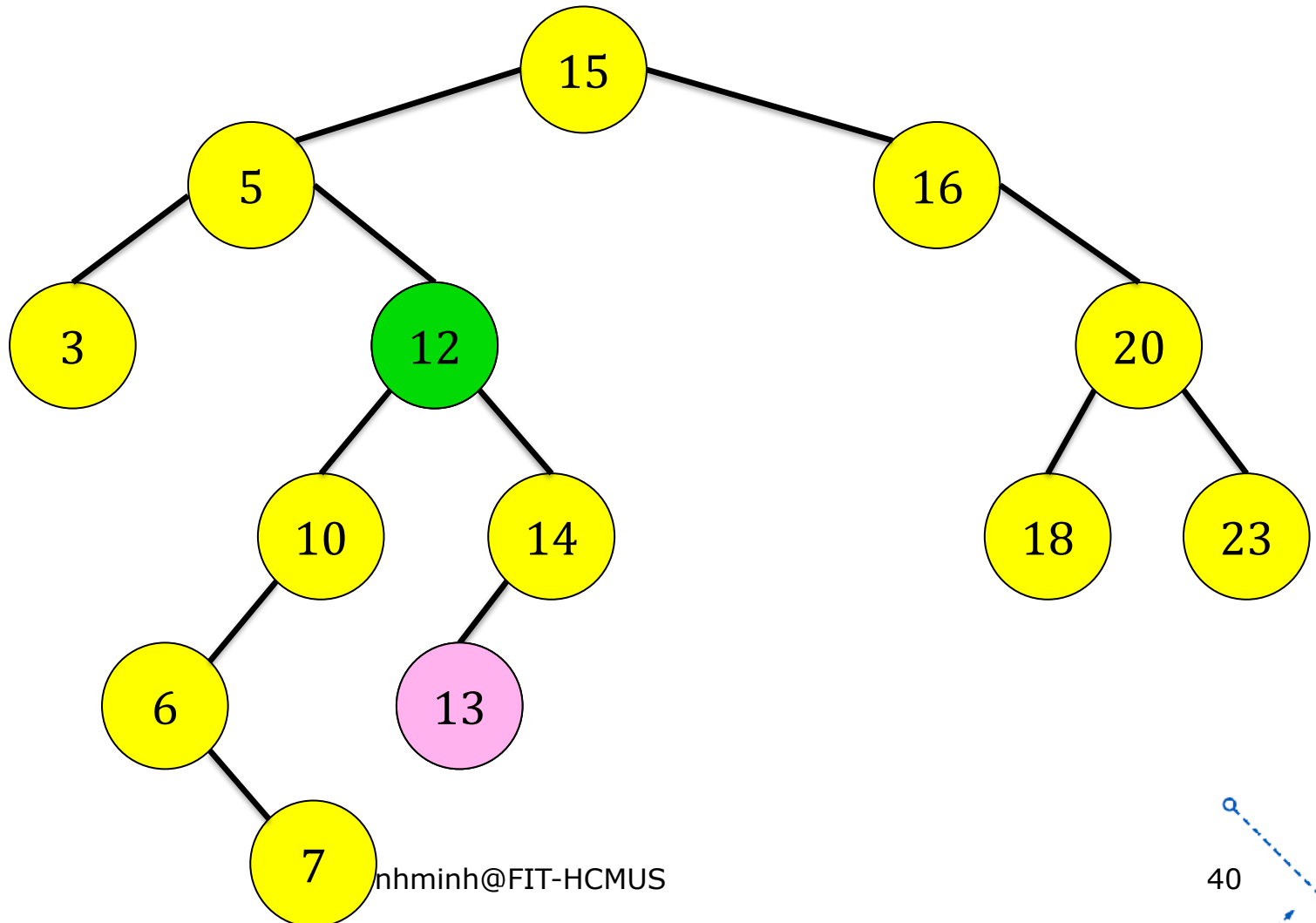
# Predecessor – Example

□ Predecessor of 15 is 14



# Predecessor – Example

□ Predecessor of 13 is 12





# Insertion and deletion

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- The operation of *insertion* and *deletion* cause the BST to change.
  - The data structure must be modified to reflect this change.
  - The BST property must be continued to hold.
- *Insertion*: straight-forward.
- *Deletion*: more intricate.



# Insertion

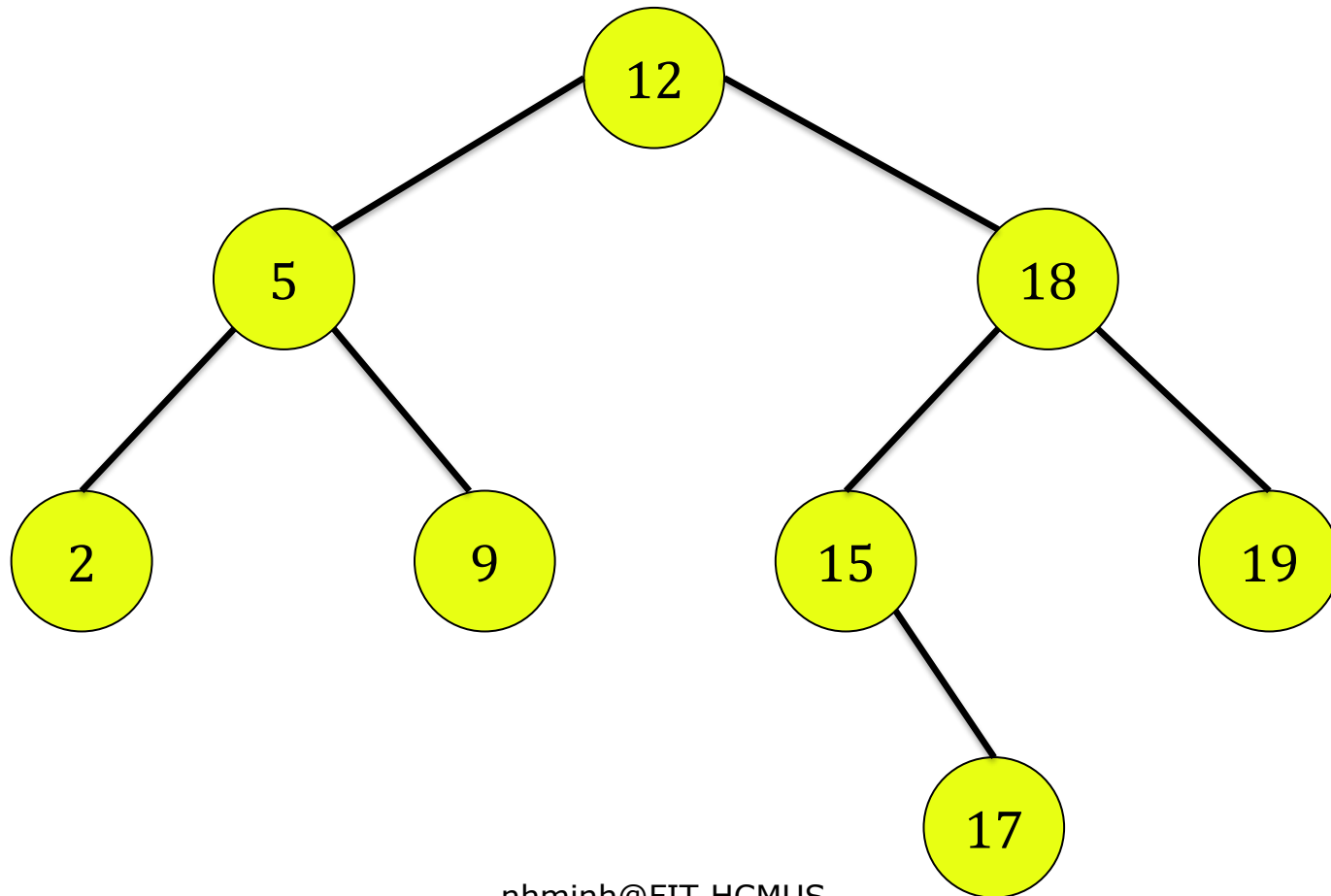
**TREE-INSERT**( $T, z$ )

```
1.   $y = \text{NIL}$ 
2.   $x = T.\text{root}$ 
3.  while  $x \neq \text{NIL}$ 
4.       $y = x$ 
5.      if  $z.\text{key} < x.\text{key}$ 
6.           $x = x.\text{left}$ 
7.      else  $x = x.\text{right}$ 
8.   $z.p = y$ 
9.  if  $y == \text{NIL}$ 
10.      $T.\text{root} = z$  // tree  $T$  was empty
11. elseif  $z.\text{key} < y.\text{key}$ 
12.      $y.\text{left} = z$ 
13. else  $y.\text{right} = z$ 
```



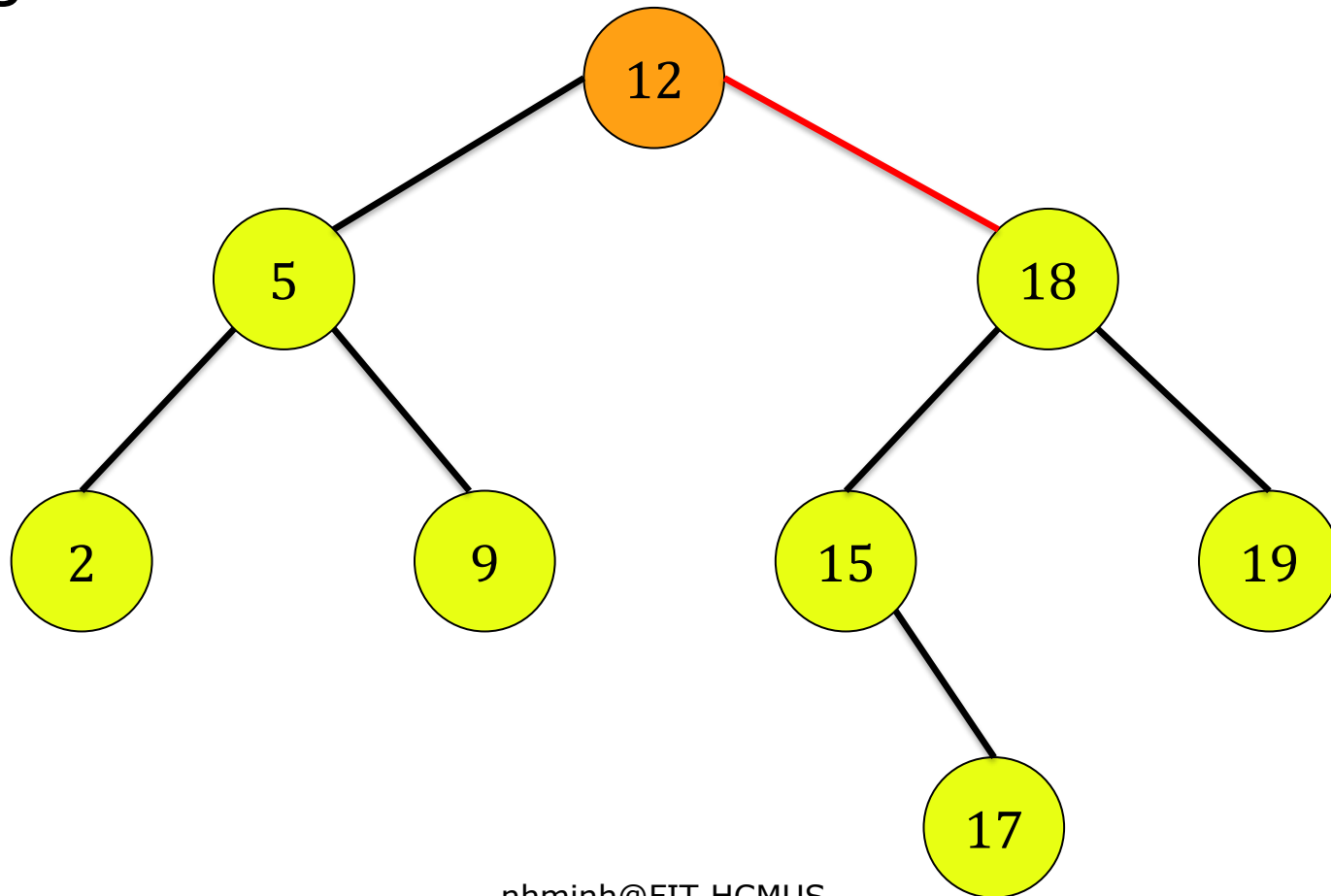
# Insertion – Example

□ Insert node 13 to the BST



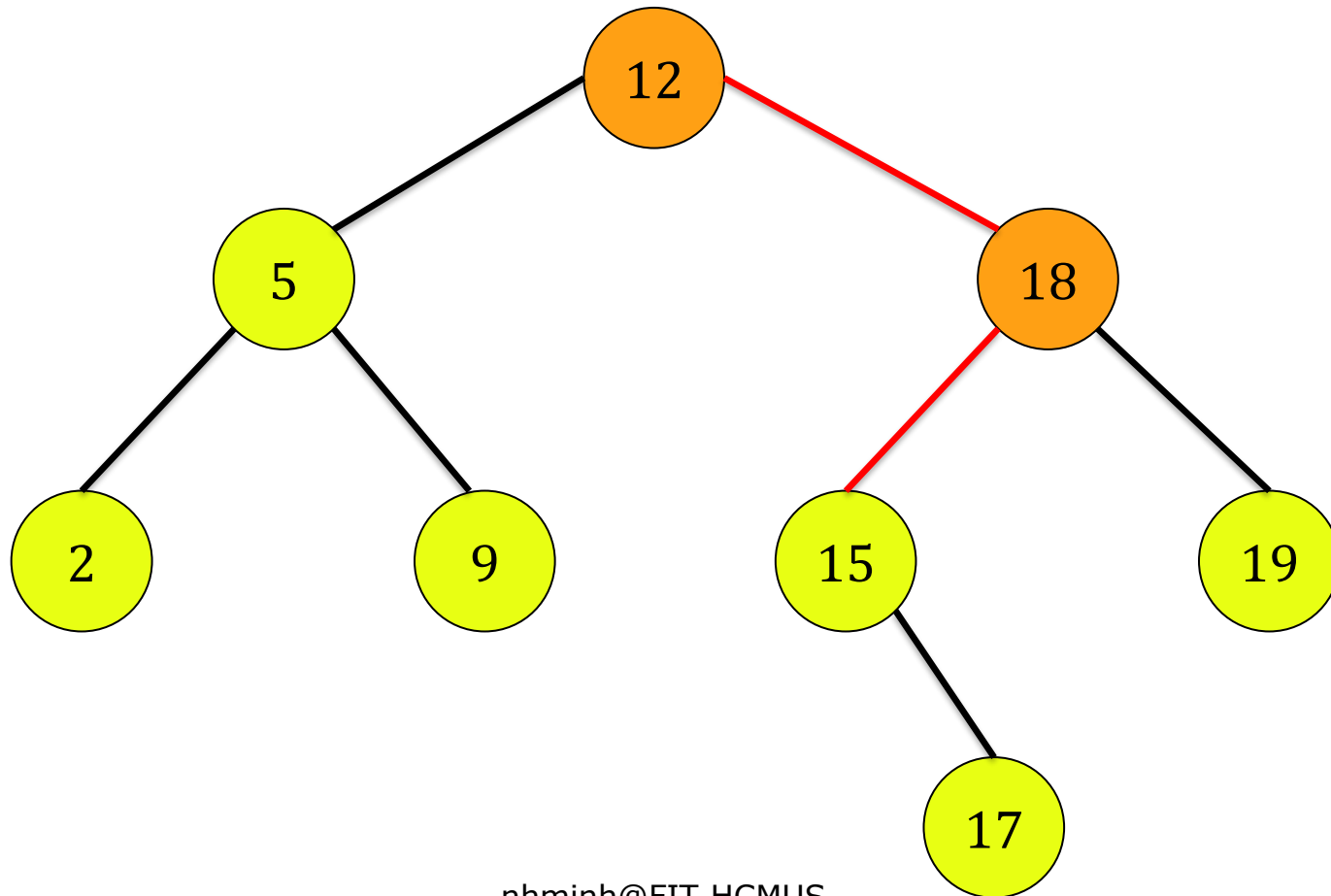
# Insertion – Example

- Insert node 13 to the BST:  $13 > 12 \rightarrow$  go to the right



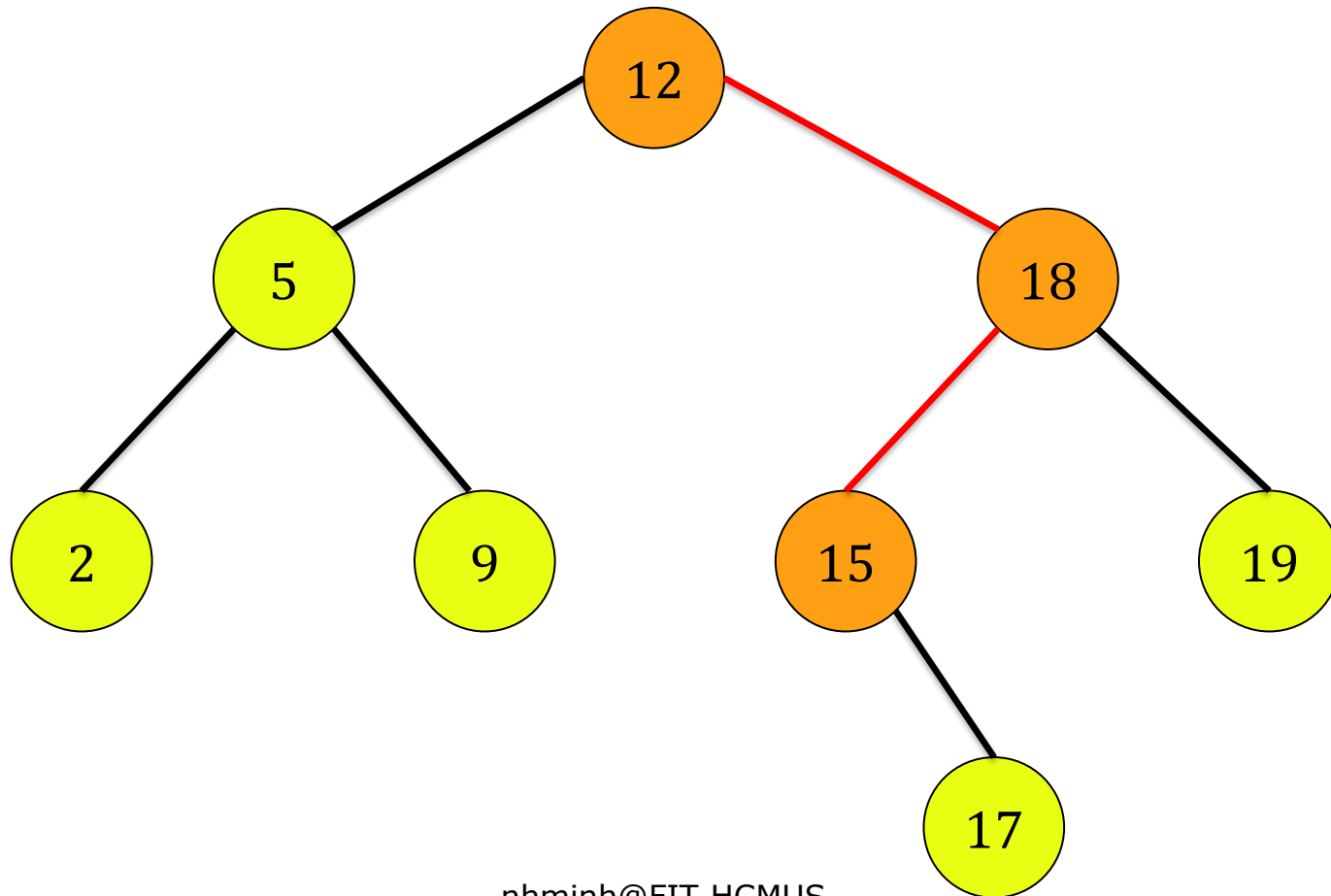
# Insertion – Example

- Insert node 13 to the BST:  $13 < 18 \rightarrow$  go to the left



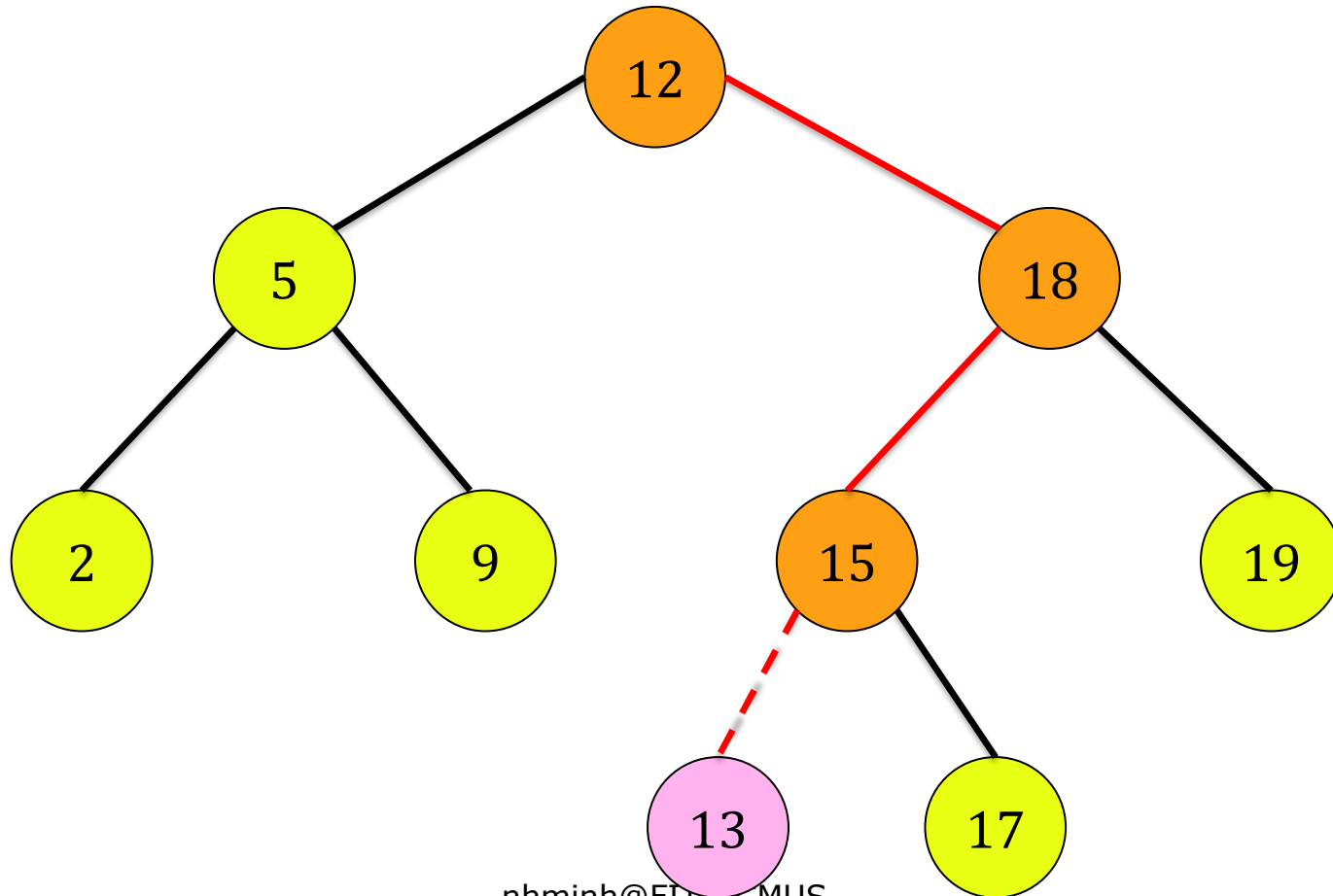
# Insertion – Example

- Insert node 13 to the BST:  $13 < 15 \rightarrow$  go to the left



# Insertion – Example

- Insert node 13 to the BST: left of 15 is NIL → insert 13 as the left child of 15



# Deletion

## □ Deleting a node $z$ : 3 cases:

1.  $z$  has no child (leaf node)

→ simply remove it

2.  $z$  has one child

→ replace  $z$  by its child

3.  $z$  has two children

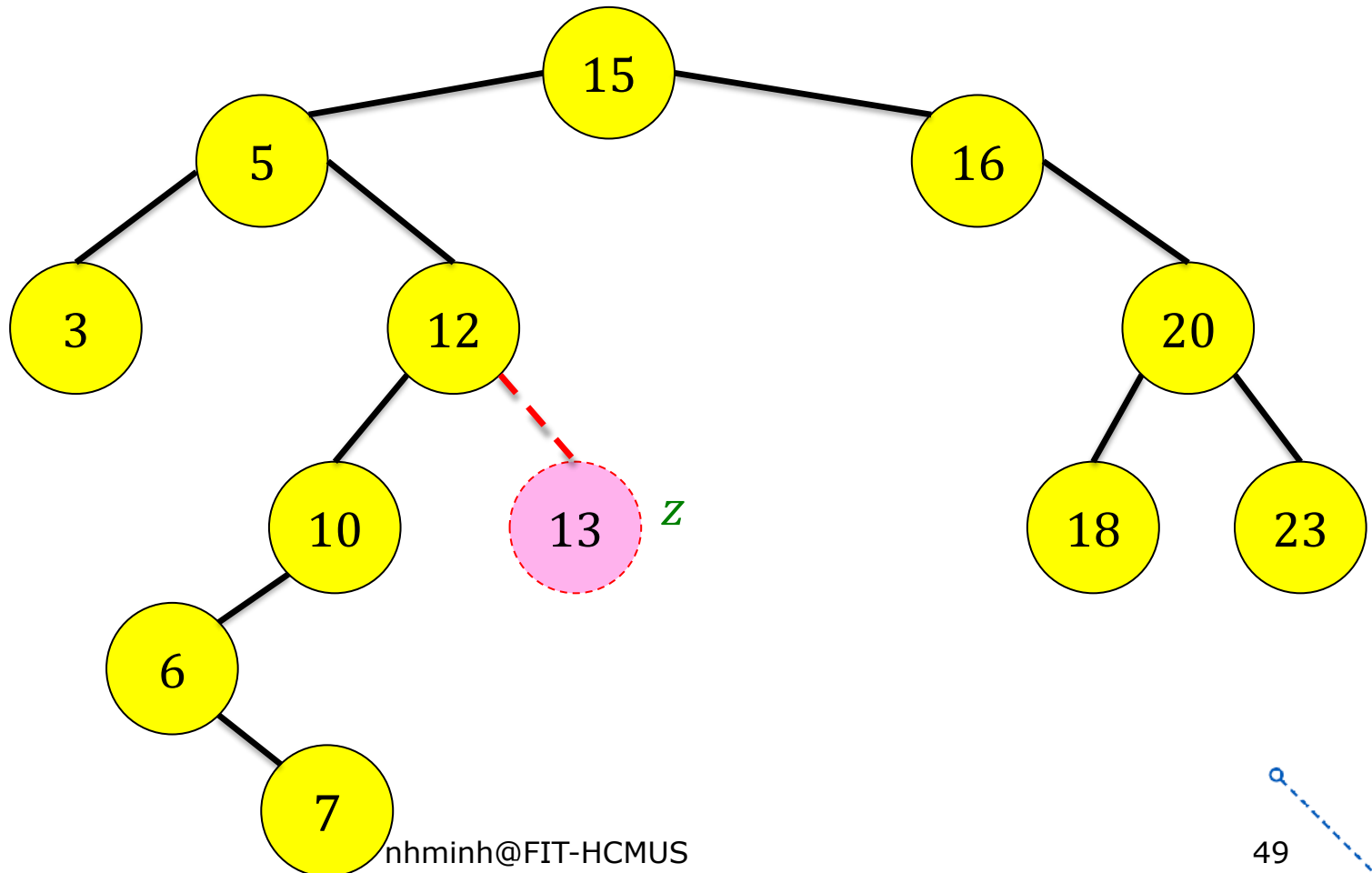
→ find its successor (or predecessor):  $y$  – must be in  $z$ 's right (or left) subtree and has no left (right) child. Replace  $z.key$  by  $y.key$ , then delete  $y$ .





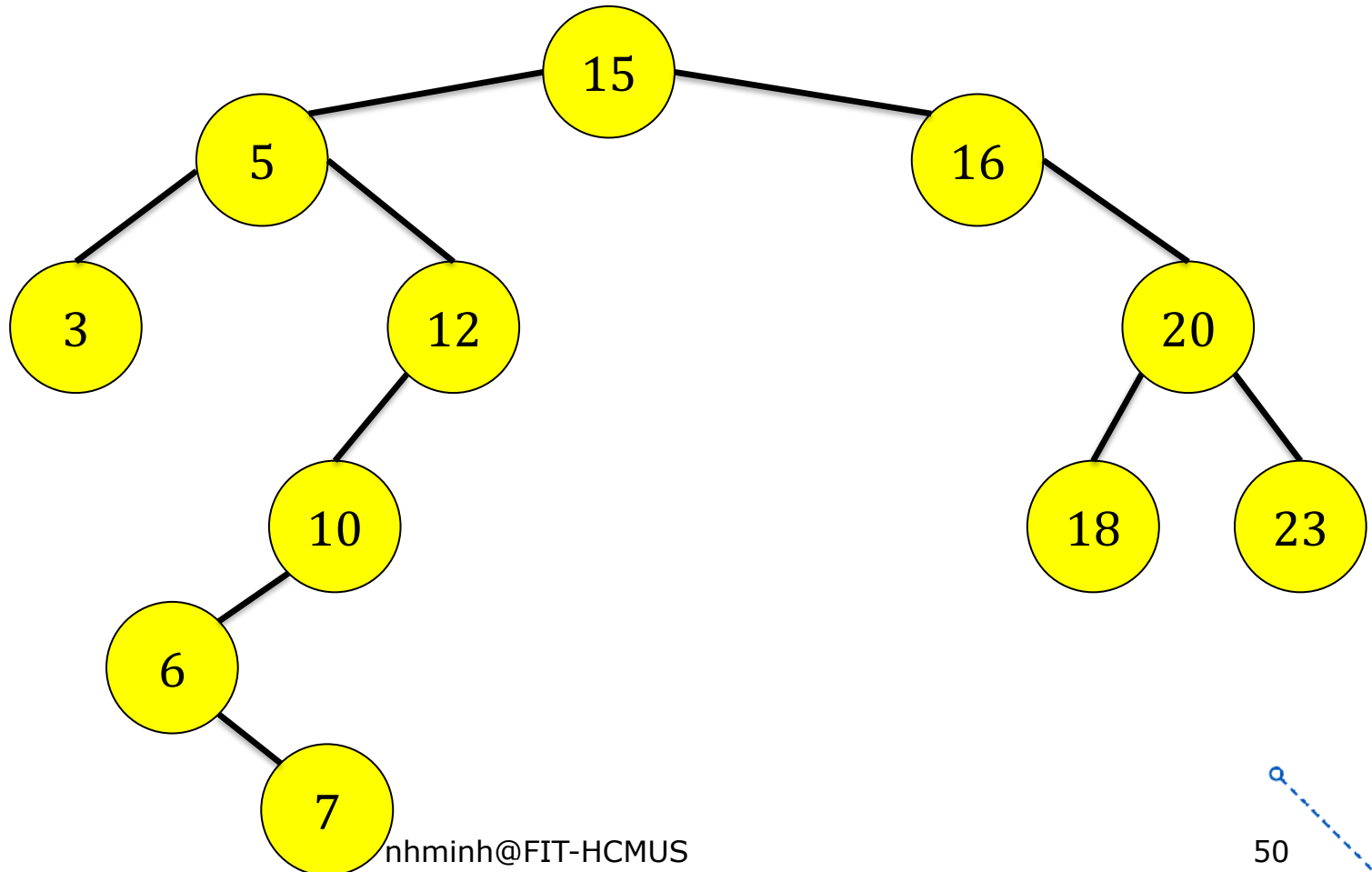
# Deletion

□ **z** has no child (leaf node): simply remove it



# Deletion – case 1

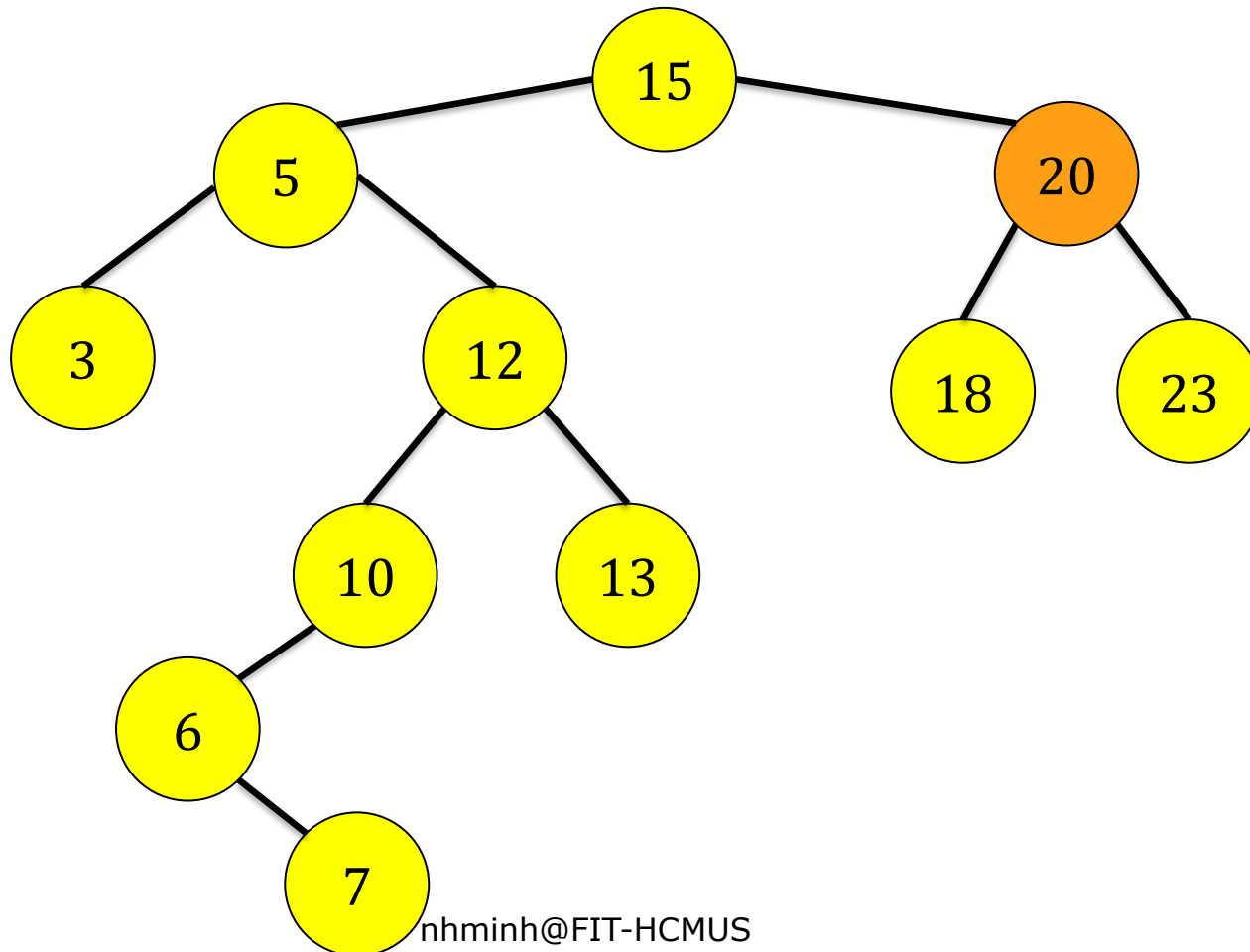
□ **z** has no child (leaf node): simply remove it



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- nhminh@FIT-HCMUS
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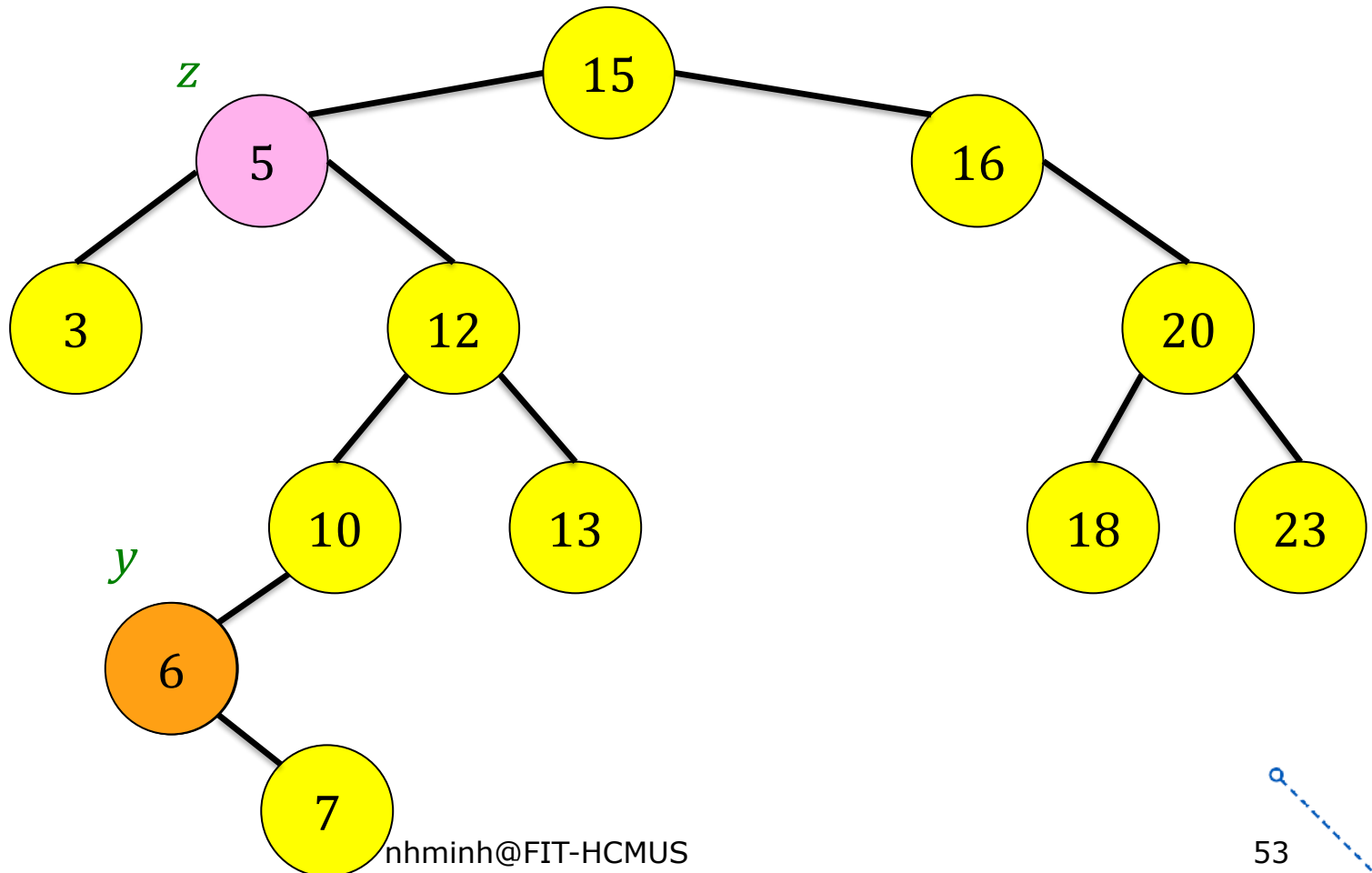
# Deletion – case 2

□  $z$  has 1 child: replace  $z$  by its subtree



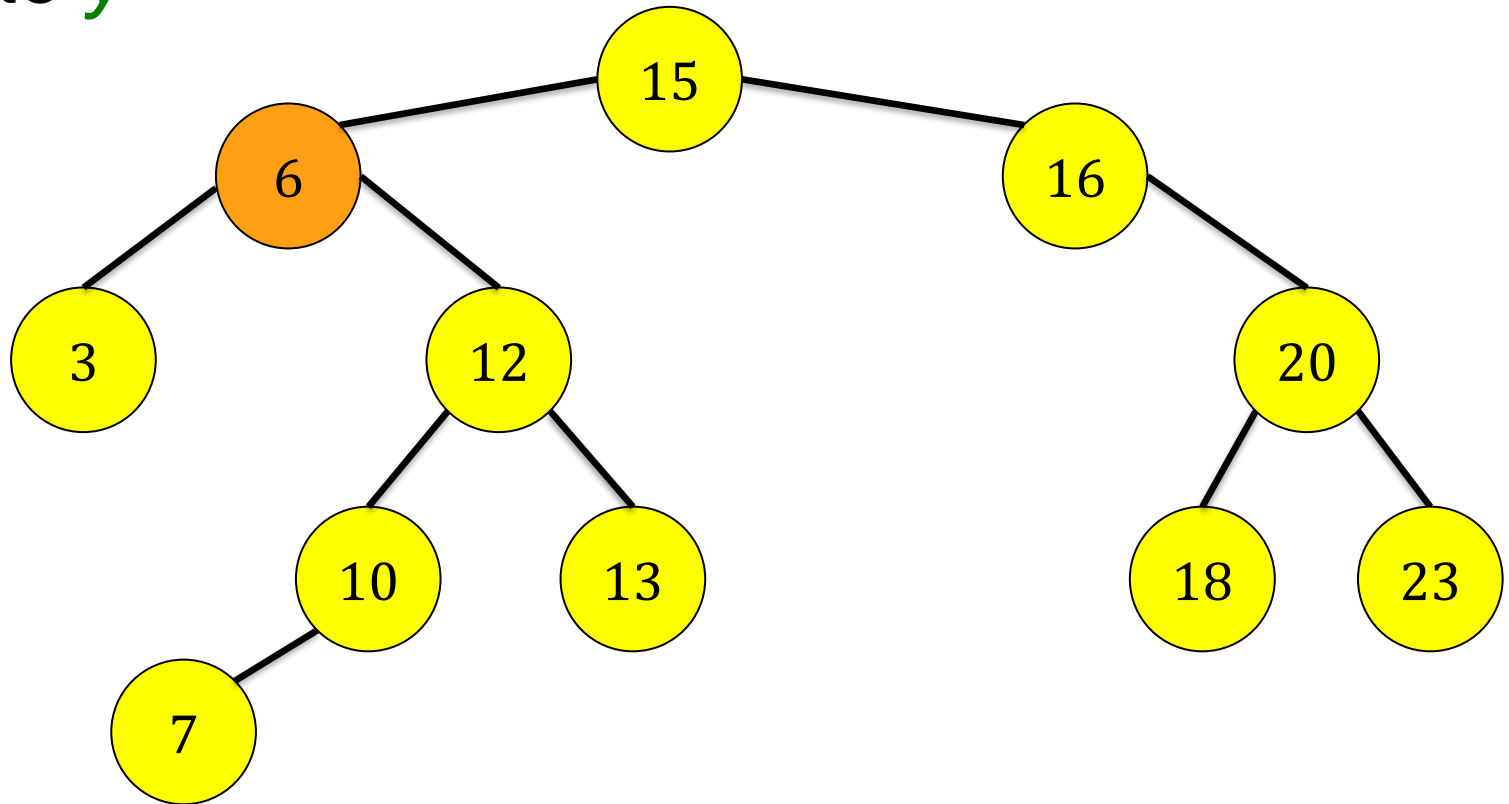
# Deletion – case 3

□  $z$  has 2 children: find  $z$ 's successor  $y$



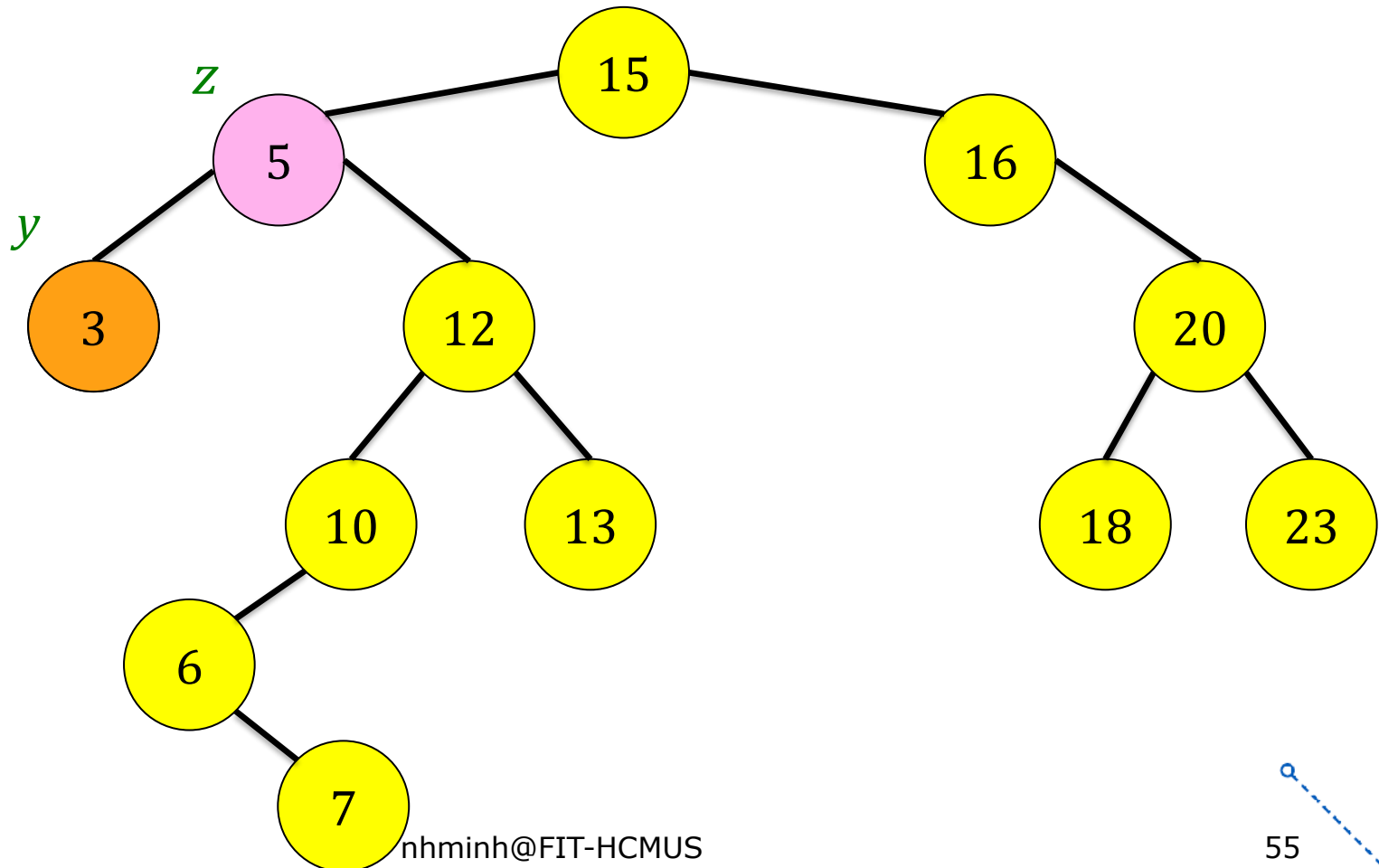
# Deletion – case 3

- $z$  has 2 children: replace  $z.key$  by  $y.key$ , then delete  $y$



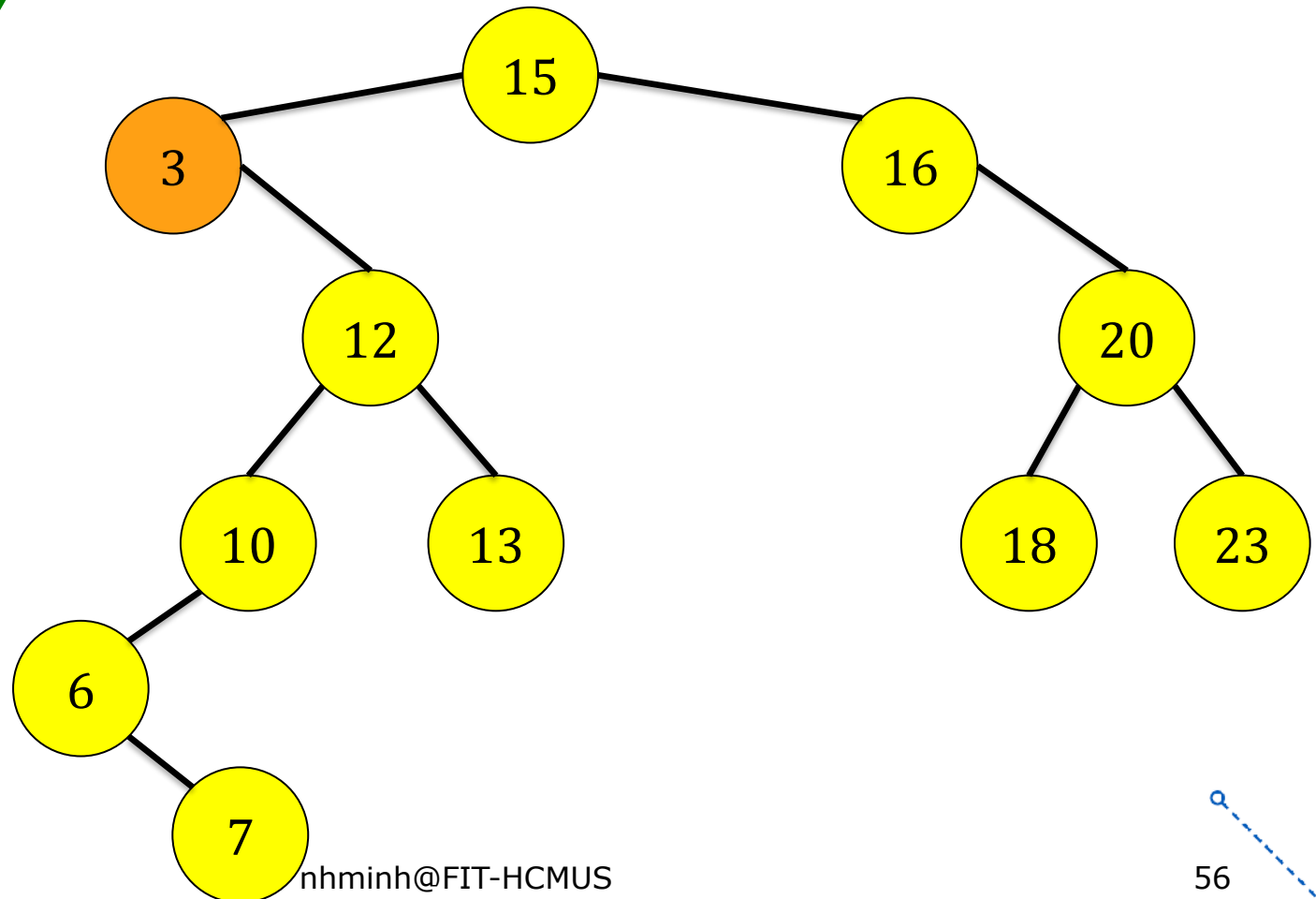
# Deletion – case 3

□  $z$  has 2 children: find  $z$ 's predecessor  $y$



# Deletion – case 3

- $z$  has 2 children: replace  $z.key$  by  $y.key$ , then delete  $y$



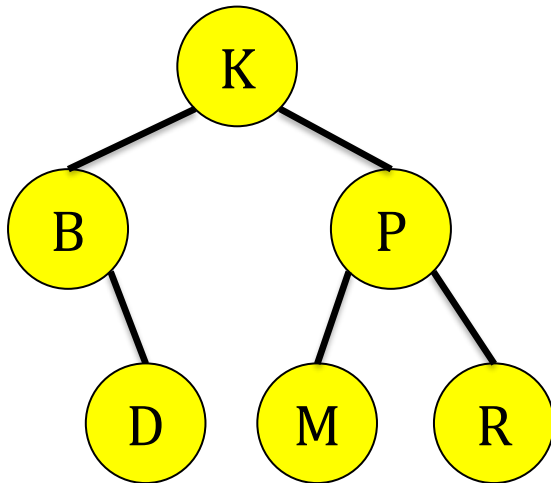


# BST Analysis

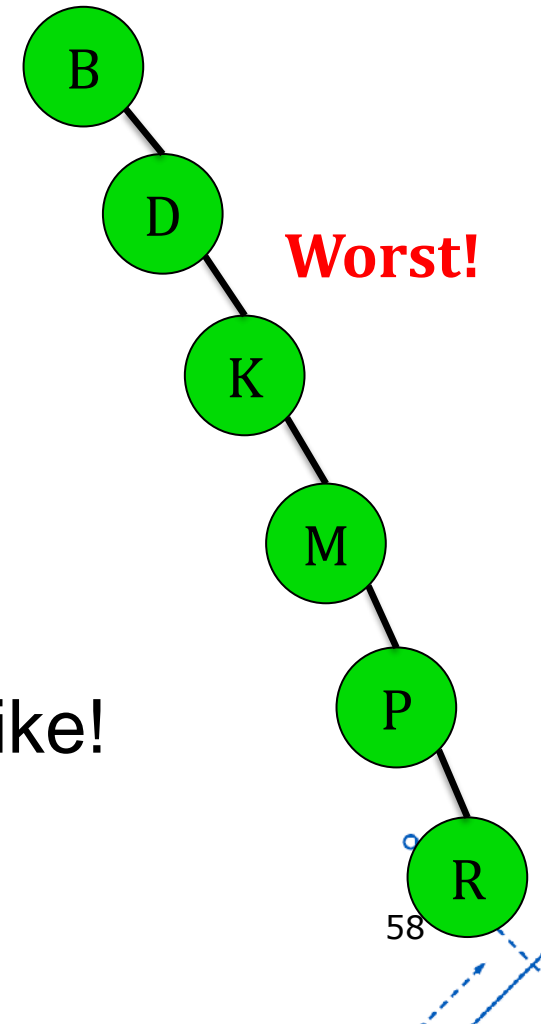
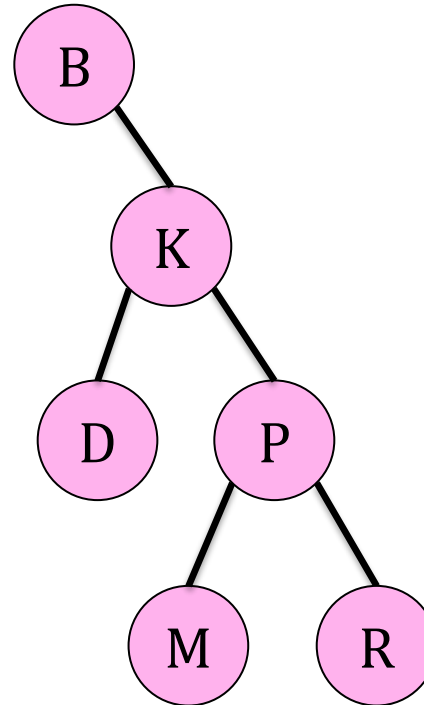
	BST (*)	Ordered array	Linked list
Searching	$O(\log_2 n)$	$O(\log_2 n)$	$O(n)$
Insertion	$O(\log_2 n)$	$O(n)$	$O(1)$
Deletion	$O(\log_2 n)$	$O(n)$	$O(1)$
Memory to store 1 element	$\text{Sizeof}(\text{key}) + 8$	$\text{Sizeof}(\text{key})$	$\text{Sizeof}(\text{key}) + 4$

# Balancing a tree

- Is searching a BST tree as fast as an ordered array?



**Best!**



- It depends on what the tree looks like!  
→ **Balanced tree** is the best!

# Balancing a tree

- **Definition.** A binary tree is *height-balanced* or simply *balanced* if the difference in height of both subtrees of any node in the tree is either zero or one.
- A tree is *perfectly balanced* if every path from root to leaf has same length.
- Techniques:
  1. Reordering data themselves and then building a tree.
  2. Constantly restructuring the tree when elements arrive and lead to an unbalanced tree.



# Balancing a tree – using sorted array

- Steps to balance a tree:
  - Store all data in an array.
  - Sort the array
  - The root is in the middle of the array.
  - The left child of the root is in the middle of the first subarray (from first element → root)
  - The right child of the root is in the middle of the second subarray (from the root → the last element)



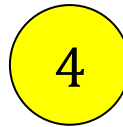
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



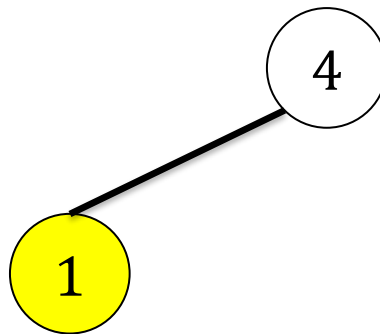
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



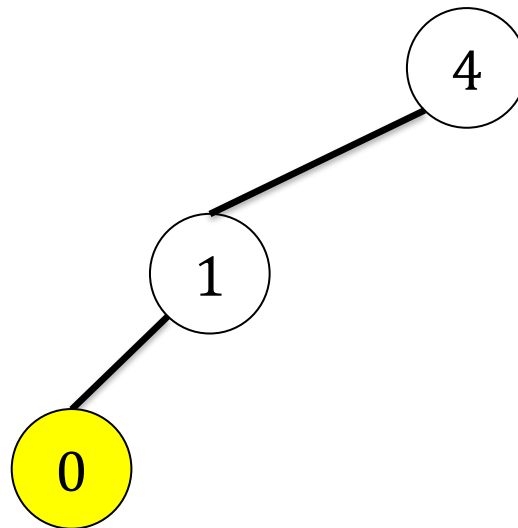
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



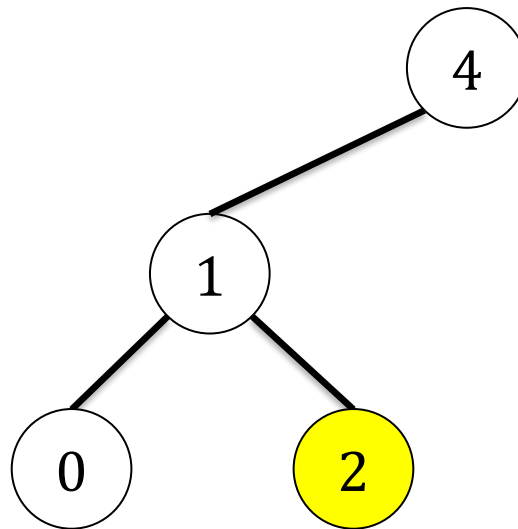
# Balancing a tree using sorted array – Example

□ Stream of data:

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5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---





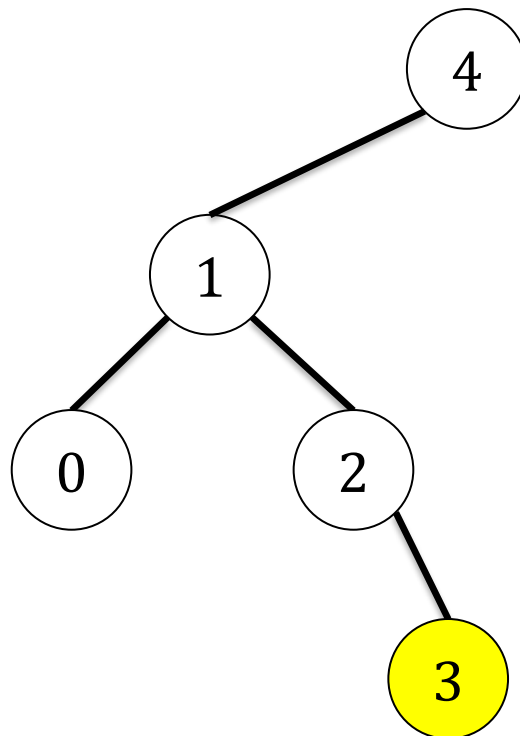
# Balancing a tree using sorted array – Example

□ Stream of data:

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5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



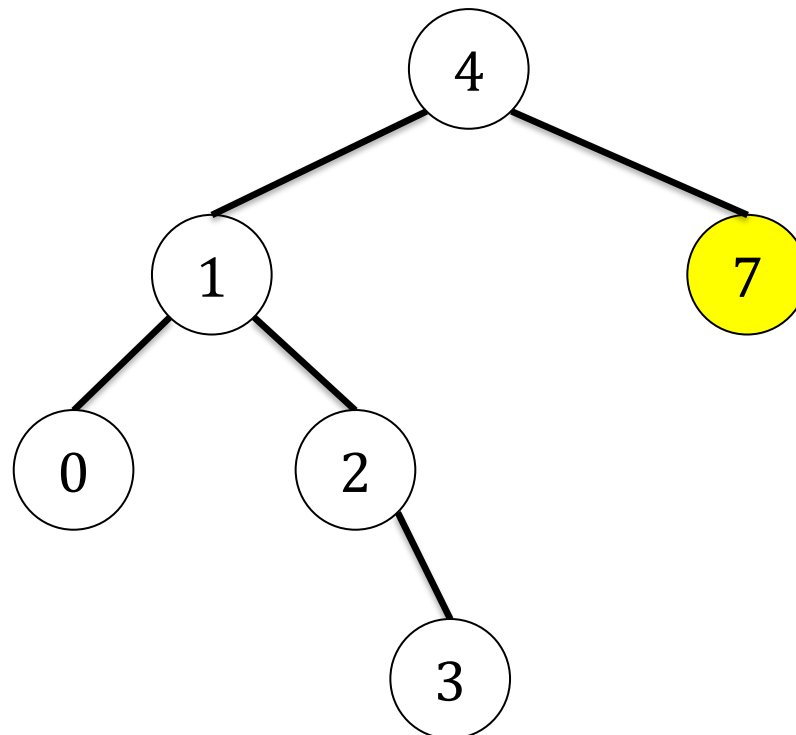
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



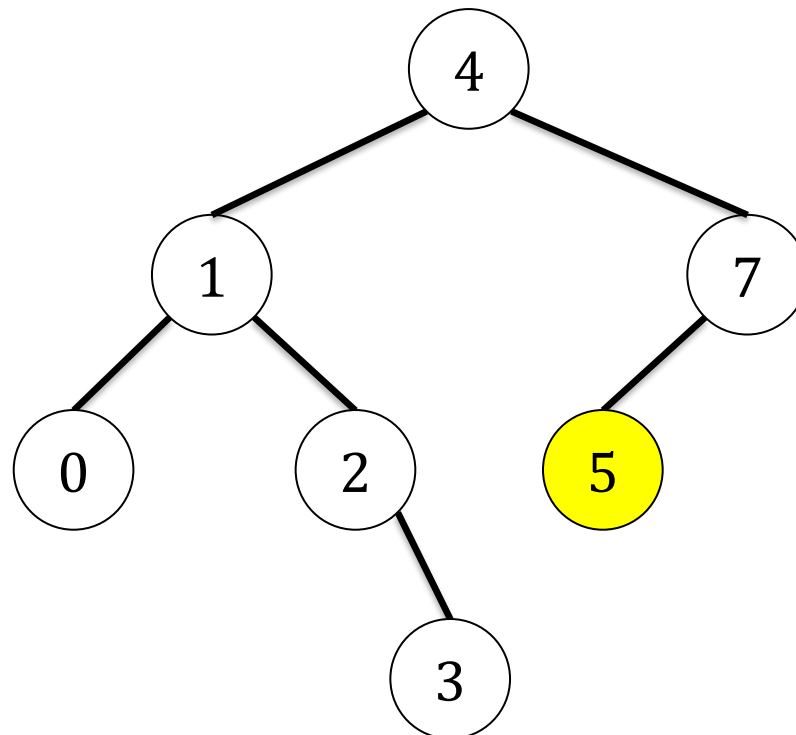
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



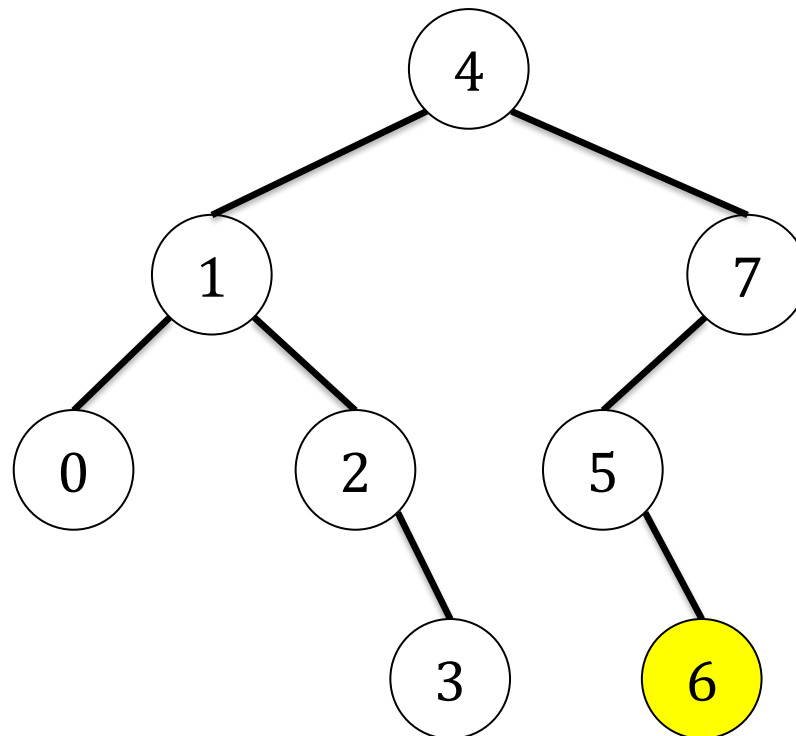
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



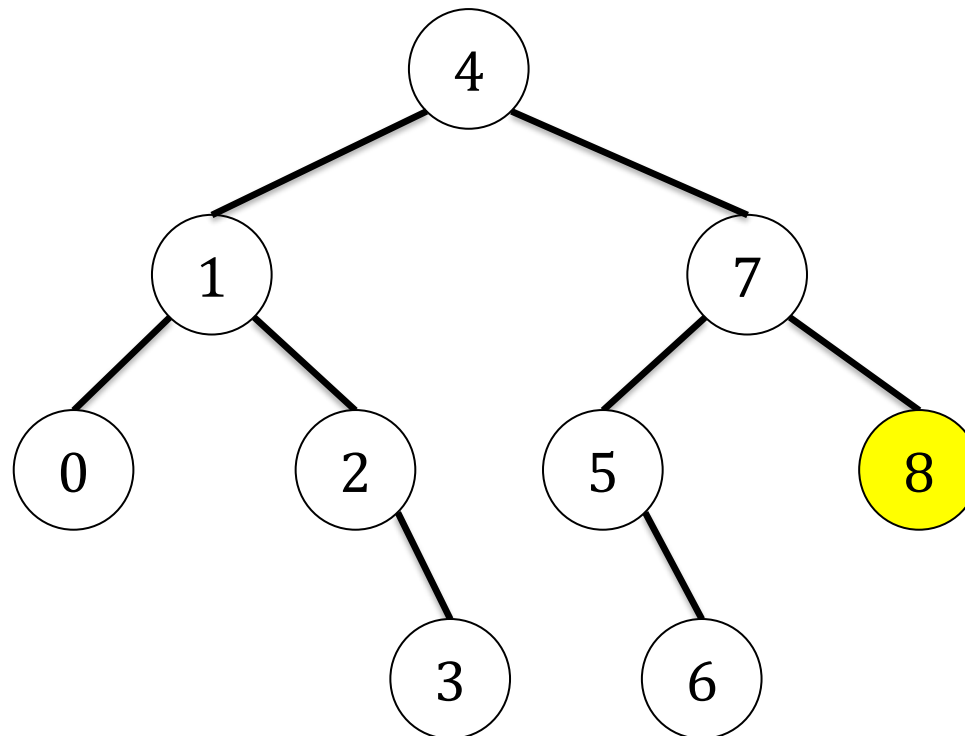
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



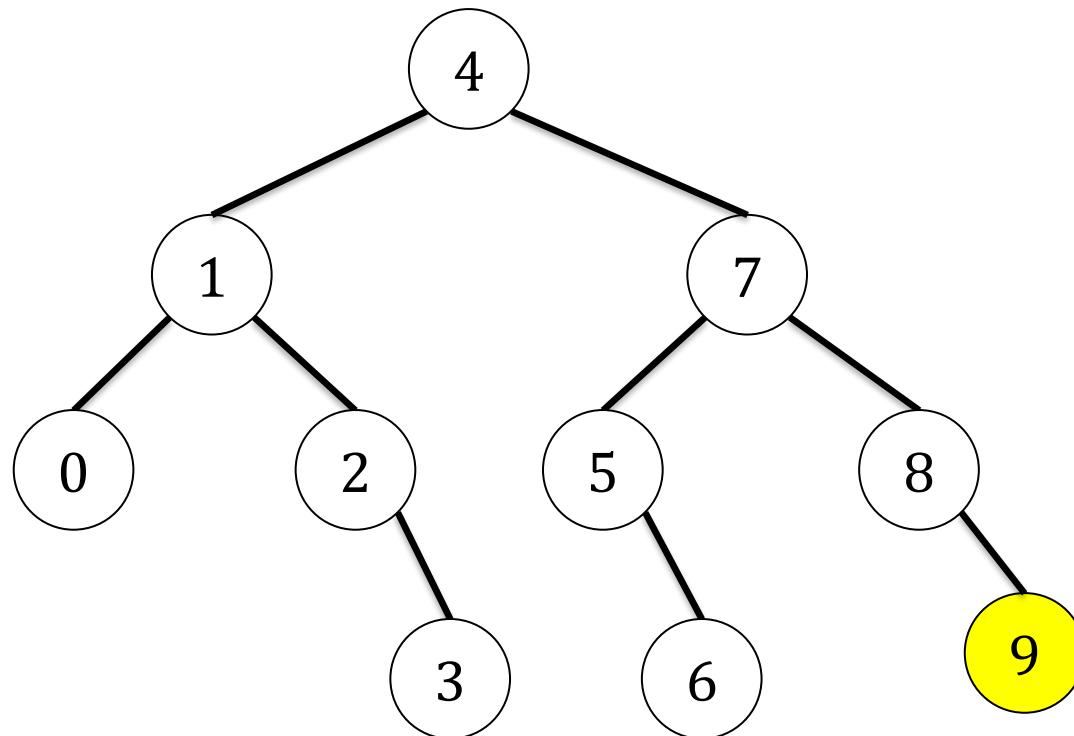
# Balancing a tree using sorted array – Example

□ Stream of data:

□ Sorted data:

5	1	9	8	7	0	2	3	4	6
---	---	---	---	---	---	---	---	---	---

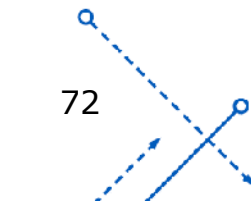
0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---



# Balancing a tree using sorted array

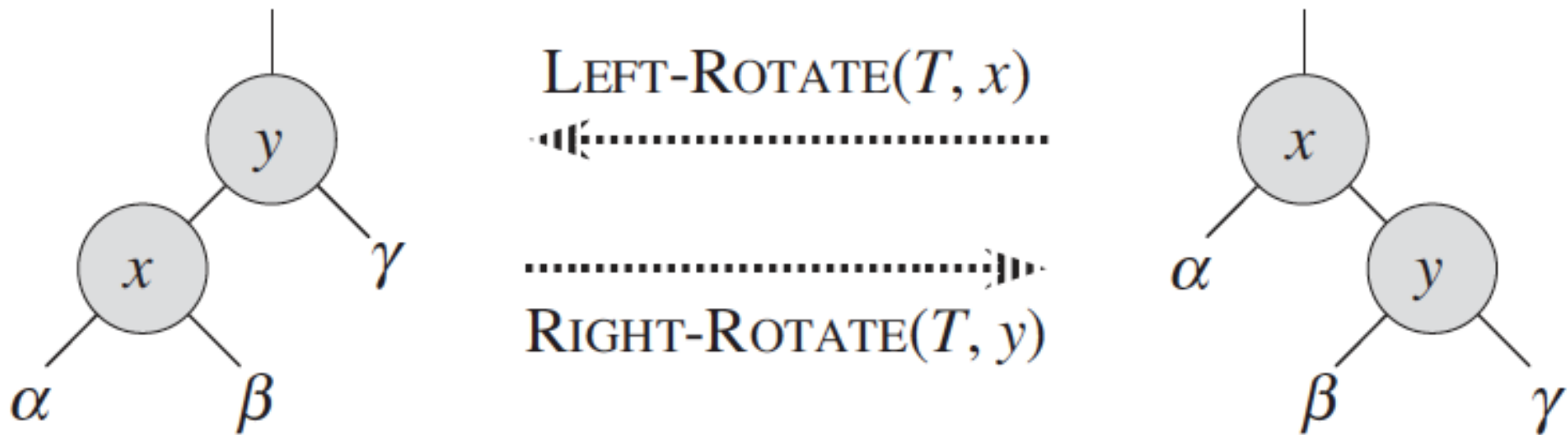
## □ Drawback:

- All data must be put in an array before the tree can be created.
- Unsuitable when the tree has to be used while the data are still coming.



# Balancing a tree – DSW algorithm

- Devised by Colin Day and later improved by Quentin F. Stout and Bette L. Warren.
  - No sorting required
  - Using tree rotation (left/right rotation)





# Balancing a tree – DSW algorithm

- Devised by Colin Day and later improved by Quentin F. Stout and Bette L. Warren.
  1. Transfigure an arbitrary BST into a linked list like tree called *backbone* or *vine*.
  2. This tree is transformed into a perfectly balanced tree by repeatedly rotating every second node of the backbone about its parent.



# Balancing a tree – DSW algorithm

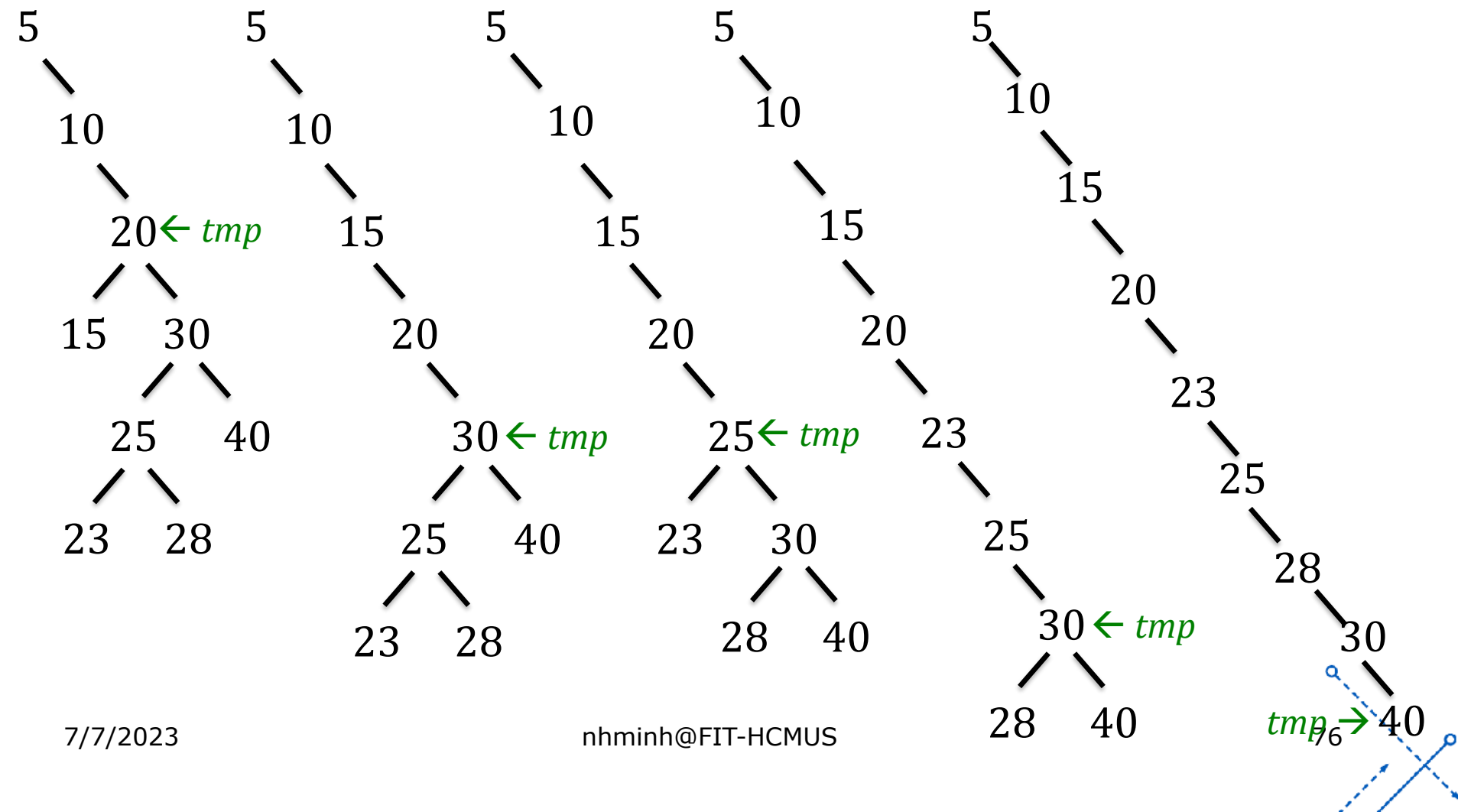
## □ Step 1: Transforming a BST into a backbone

```
createBackbone(root)
  tmp = root;
  while (tmp != 0)
    if tmp has a left child
      rotate this child about tmp // hence the left child
                                   // becomes parent of tmp;
      set tmp to the child that just became parent
    else set tmp to its right child
```



# Balancing a tree – DSW algorithm

## □ Step 1: Transforming a BST into a backbone



# Balancing a tree – DSW algorithm

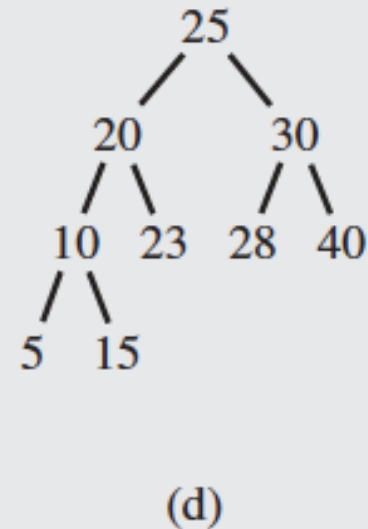
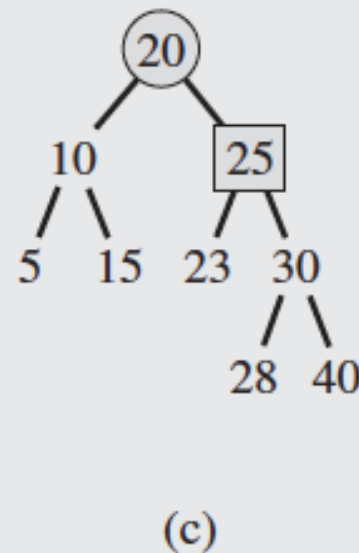
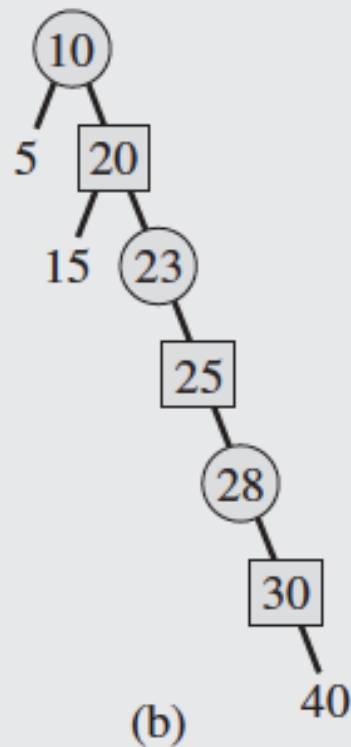
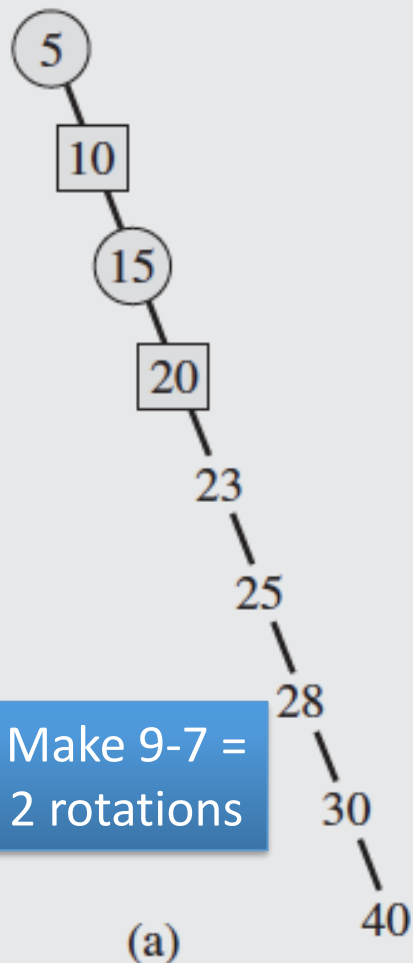
- Step 2: Transform the backbone into a perfectly balanced tree

```
createPerfectTree()  
   $n$  = number of nodes;  
   $m = 2^{\lfloor \log_2(n+1) \rfloor} - 1$ ;  
  make  $n-m$  rotations starting from the top of backbone;  
  while ( $m > 1$ )  
     $m = m/2$ ;  
    make  $m$  rotations starting from the top of backbone;
```

- $n-m$ : the number of nodes we expect on the bottommost level.



# Balancing a tree – DSW algorithm



# Rotate a tree

```
LEFT-ROTATE(T, x) //assume that x.right ≠ T.nil
1. y = x.right //set y
2. x.right = y.left //turn y's left subtree to x's right
   subtree
3. if y.left ≠ T.nil
4.     y.left.p = x
5. y.p = x.p //link x's parent to y
6. if x.p == T.nil
7.     T.root = y
8. elseif x == x.p.left
9.     x.p.left = y
10. else x.p.right = y
11. y.left = x //put x on y's left
12. x.p = y
```

$O(1)$

# Heap

- A particular kind of binary tree:
  - The value of each node  $\geq$  the values of its children (MAX-HEAP).
  - The tree is perfectly balanced, all leaves in the last level are all in the leftmost positions.
- Characteristics of heaps:
  - Review in Lecture 2 (Heapsort)
- Applications of a heap:
  - Heapsort
  - Priority queue



# Priority queue

- In which circumstances the FIFO of a queue is not good?
  - Pregnant women, the elderly, kids, disabled people
  - Emergency
  - Police
  - Fire fight
  - Elevator
  - ...
- A *priority queue* is necessary!





# Implementing a priority queue

## □ Ordered array:

- Insert:  $O(n)$
- Delete-min:  $O(1)$

## □ Linked list

- Insert:  $O(1)$
- Delete-min:  $O(n)$

■ Insert:  $O(\log_2 n)$

■ Delete-min:  $O(\log_2 n)$

(\*): *balanced BST*

## □ Heap:

■ Insert:  $O(\log_2 n)$

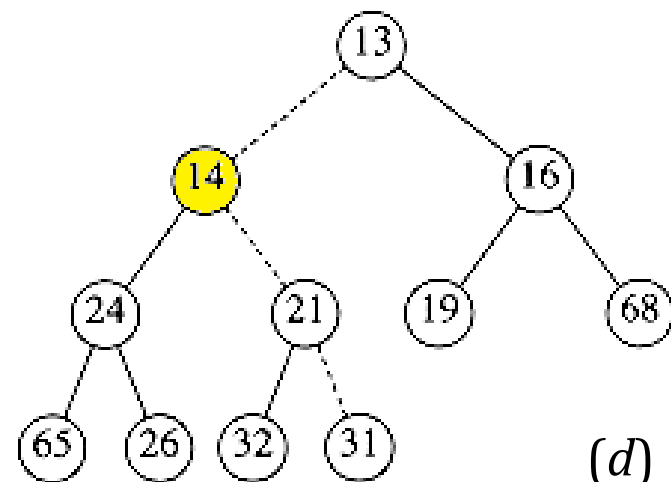
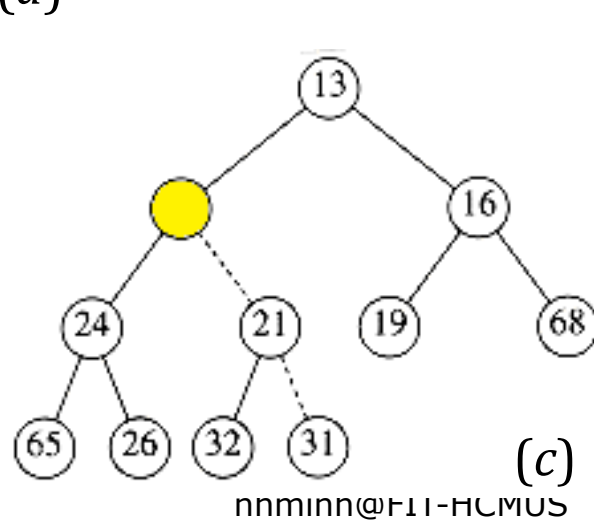
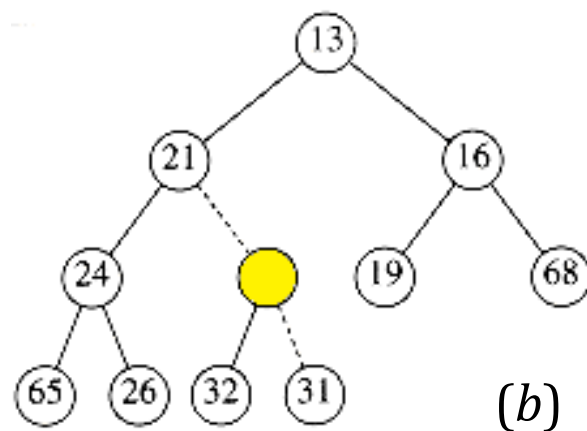
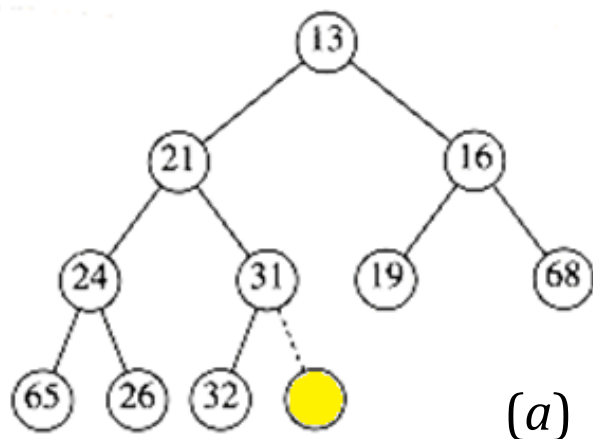
■ Delete-min:  $O(\log_2 n)$

## □ Binary search tree(\*)



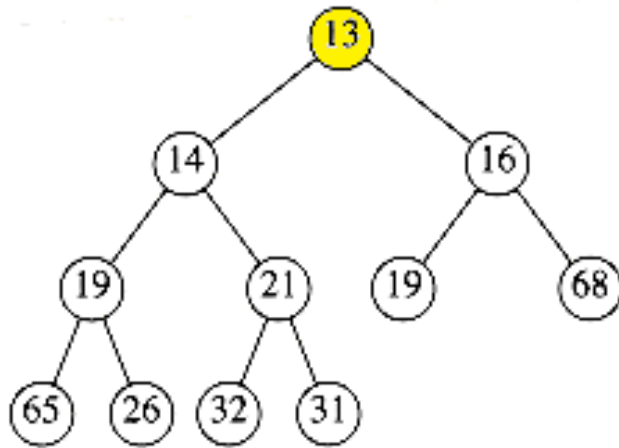
# Implementing a priority queue using a heap

□ Insert 14 to the heap:

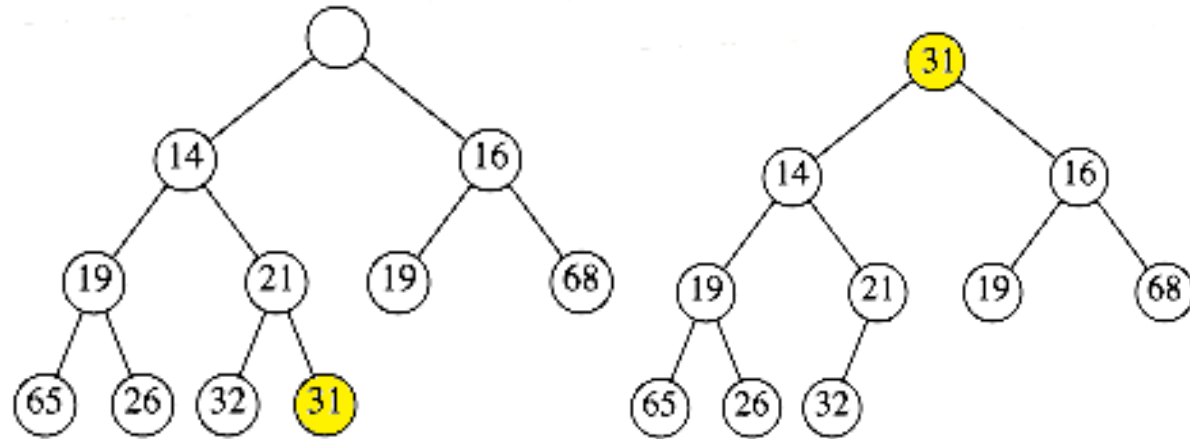


# Implementing a priority queue using a heap

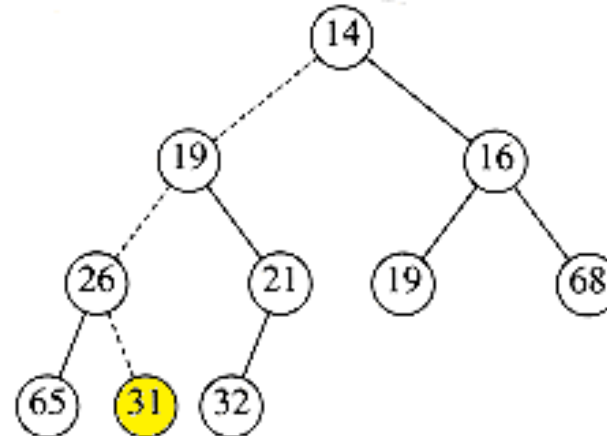
## □ Delete-min:



(a) Remove the root



(b) Replace by the last node



(c) HEAPIFY

# Q&A