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# CS2040 Data Structures and Algorithms

## Lecture Note #9

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### AVL Tree

An AVL tree – named for its inventors, **Adel'son-Vel'skii** and **Landis** – is a balanced binary search tree.

# Previously, on BST

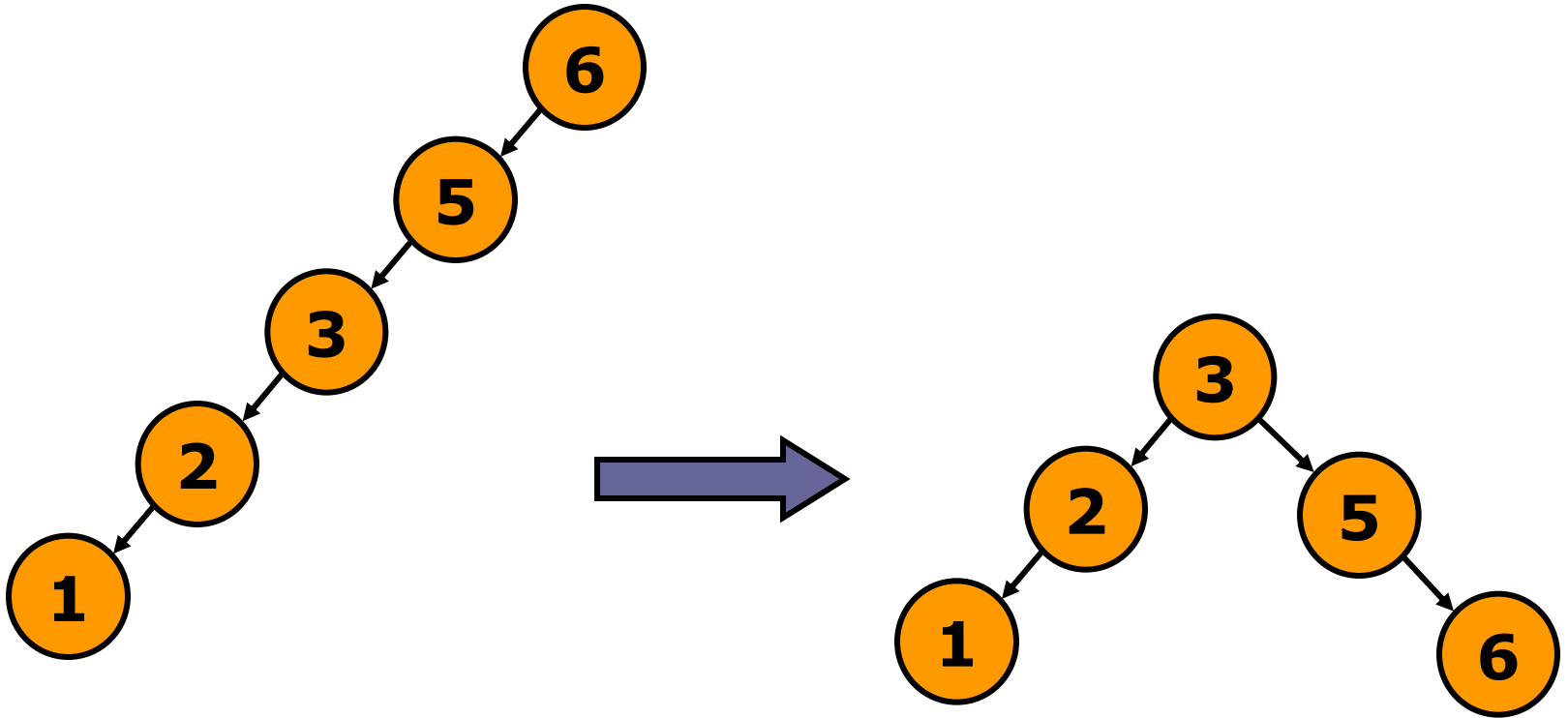
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- findMin  $O(h)$       where  $h$  = height of the tree
- search  $O(h)$
- insert  $O(h)$
- delete  $O(h)$

But  $h$  is not always  $O(\log_2 N)$ !

Best case is  $h=O(\log_2 N)$     and    worst case is  $h=O(N)$ !

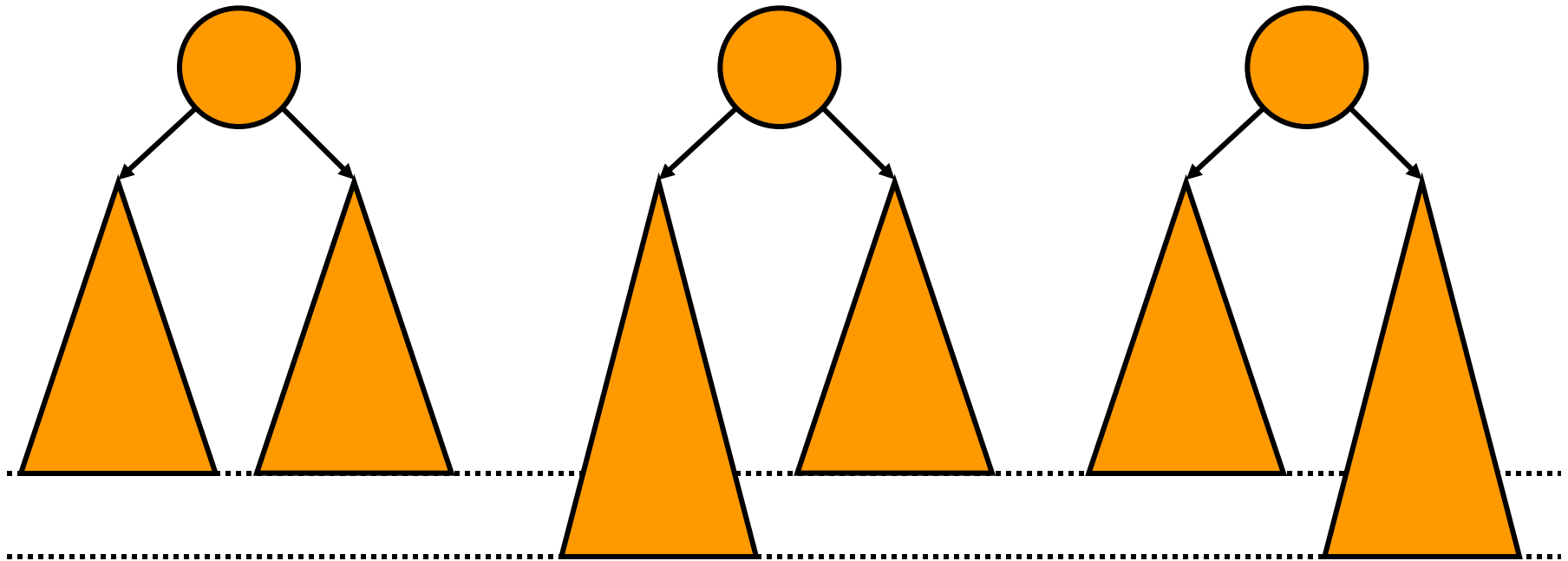
# Rotation



The **rotate** operation is an important operation for maintaining the balance of a BST.

For example, the **skewed tree** on the left can be converted into the “**balanced**” tree on the right through a **series of rotations**. **How?**

# AVL Tree Property

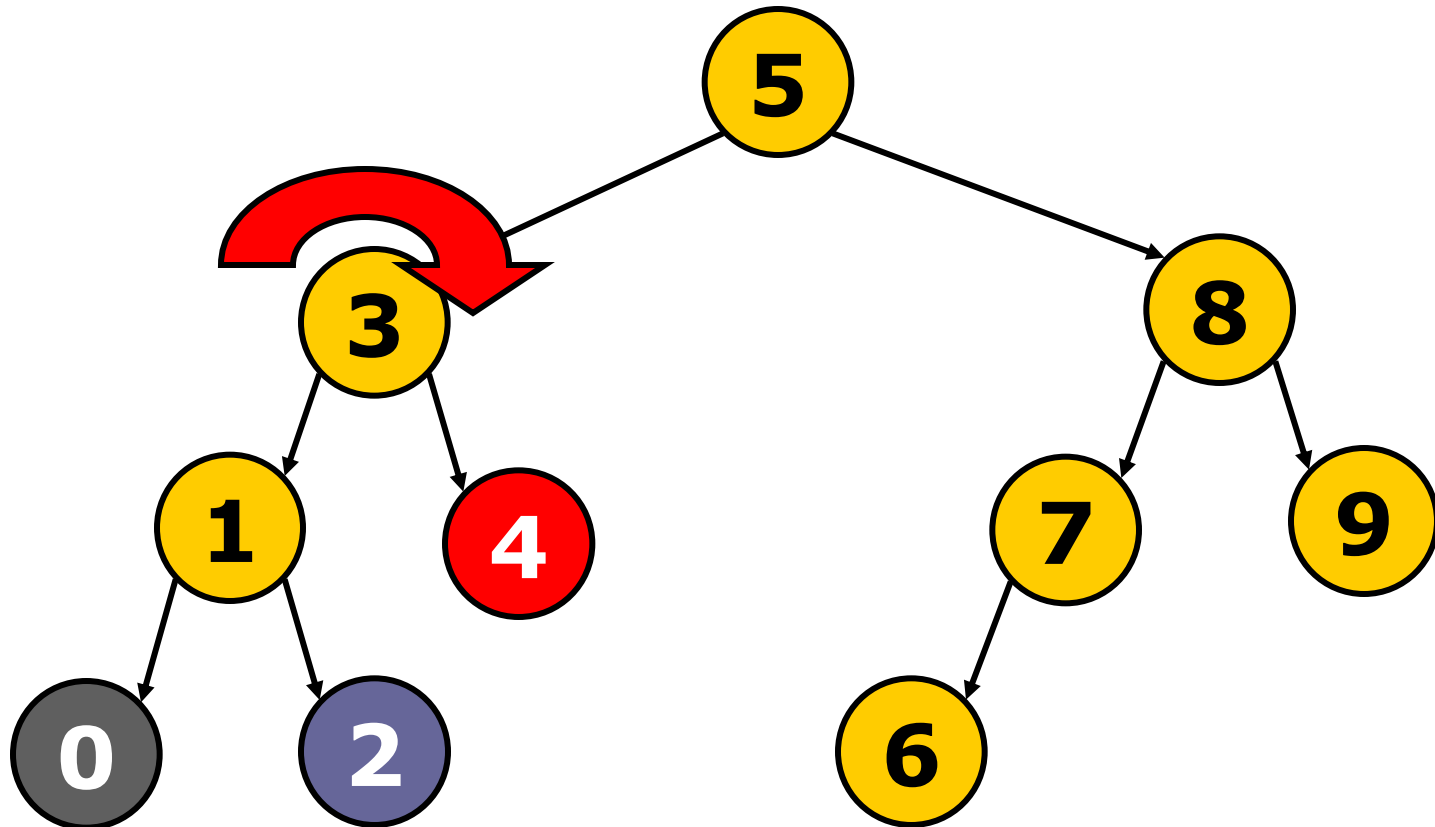


**Goal:** Keep the **height difference** between left and right subtrees  $\leq 1$ .  
Define an **invariant** (something that will not change).

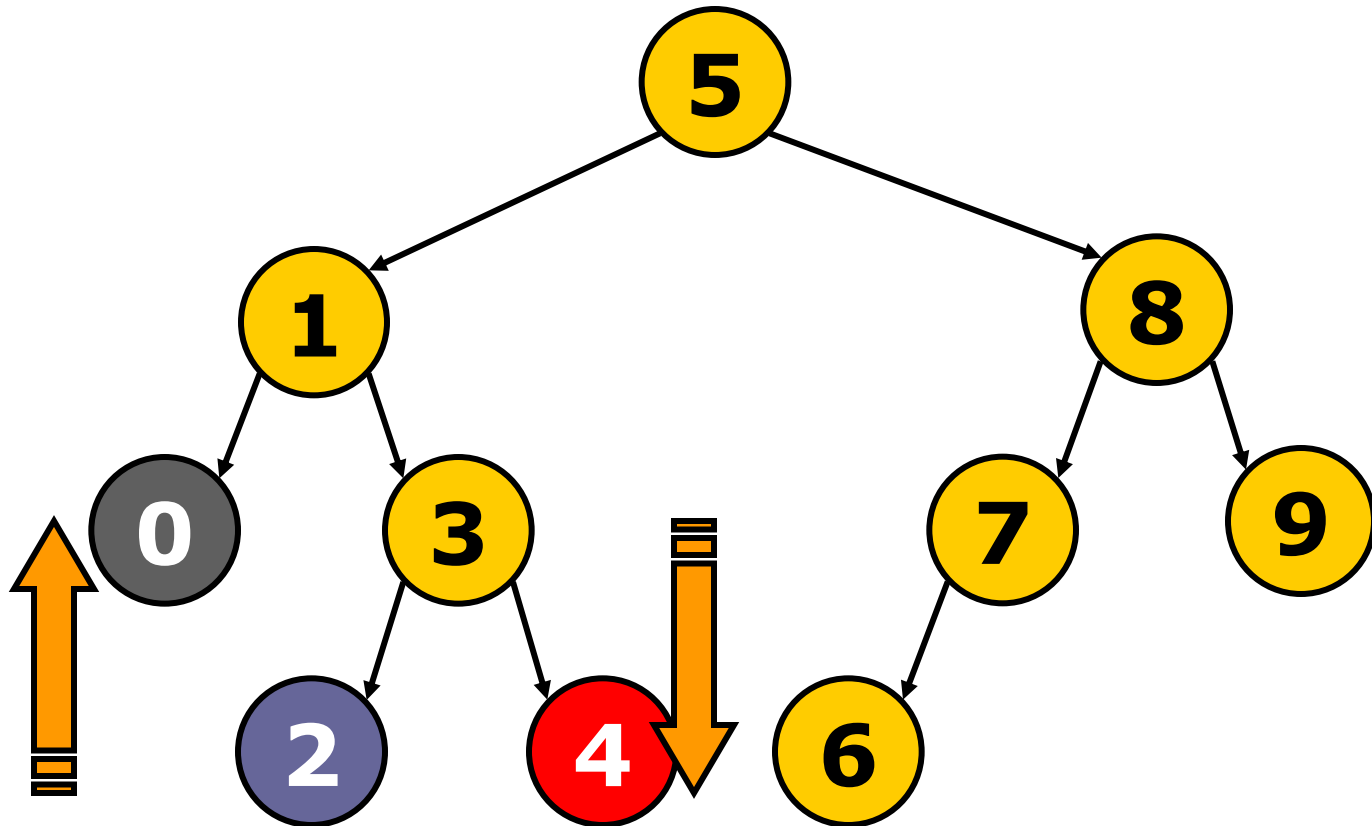
Figure: The difference between the levels of the two dotted lines is **one**.

# Rotate **Right** at 3

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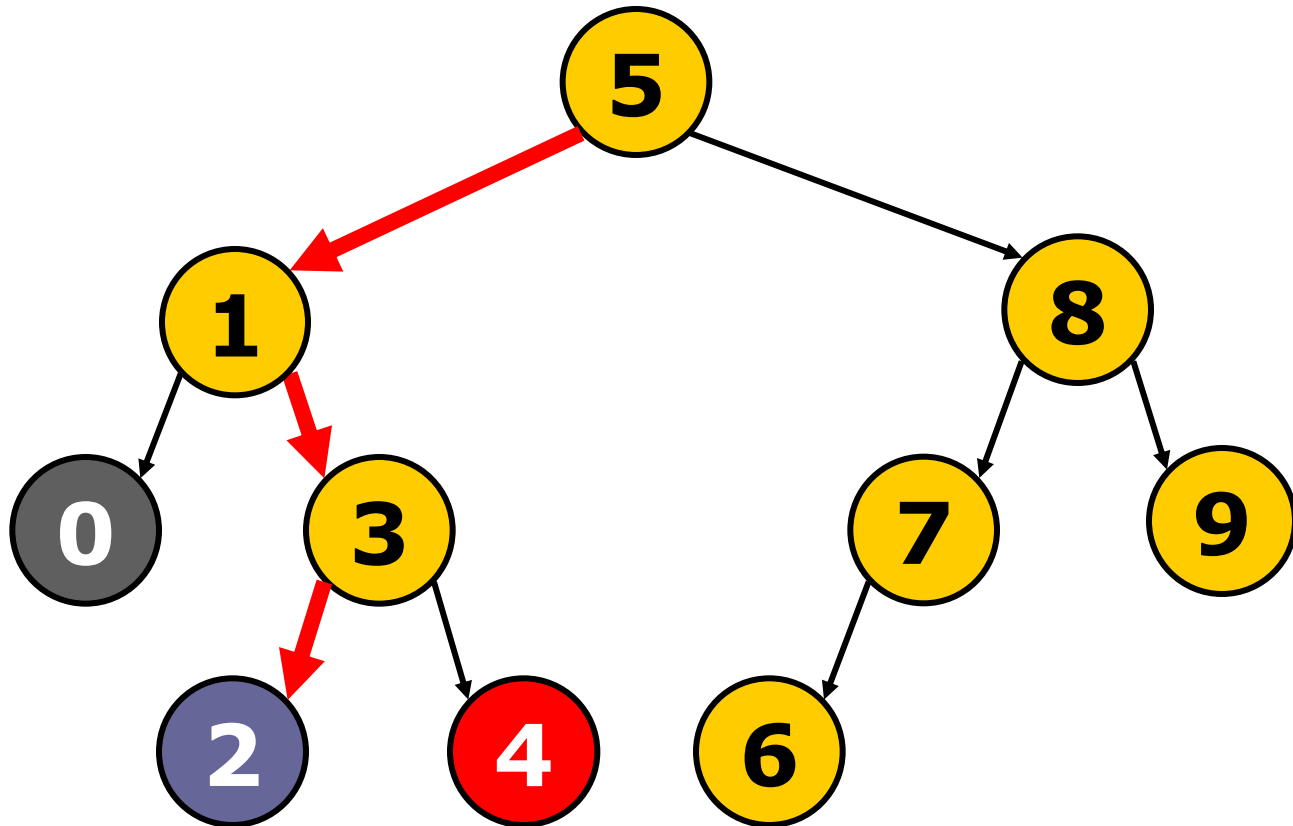


# After Rotate Right at 3 (cont.)



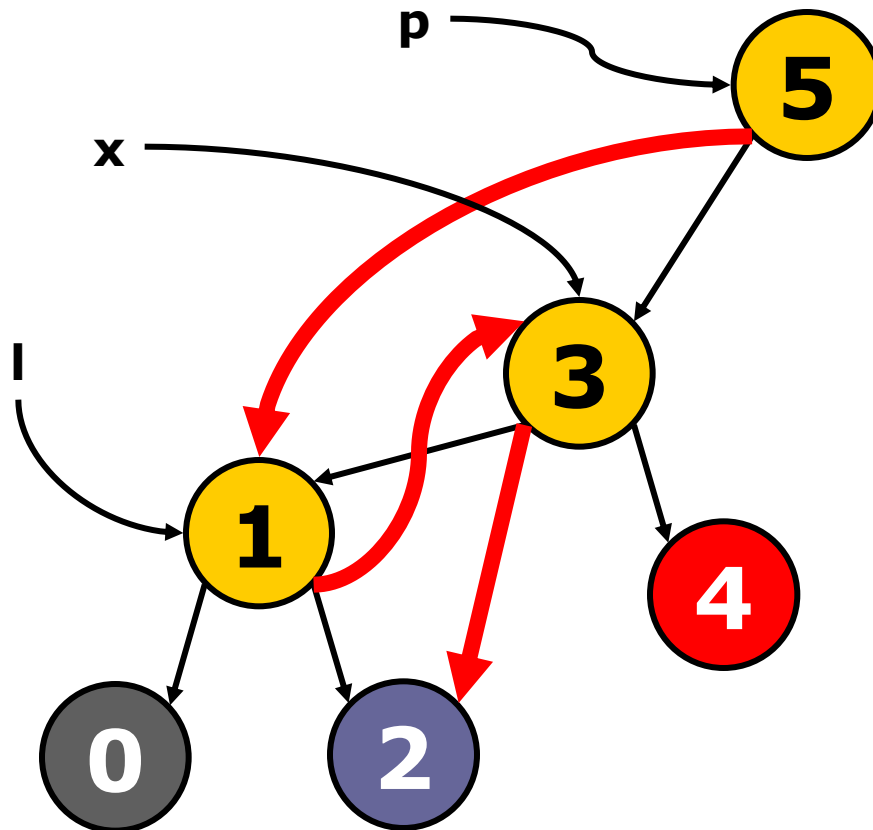
Rotation changes the **heights** of some nodes. In this example, the depth of node 4 increases by 1. The depth of node 0 decreases by 1. The depth of node 2 remains unchanged.

# After Rotate Right at 3 (cont.)



Rotation modifies the pointers shown in red.

# Rotate Right at 3 (cont.)



**rotateRight(x)**

$l = x.left$

**if**  $l$  is empty

**return**

$x.left = l.right$

$l.right = x$

$p = x.parent$

**if**  $x$  is a left child

$p.left = l$

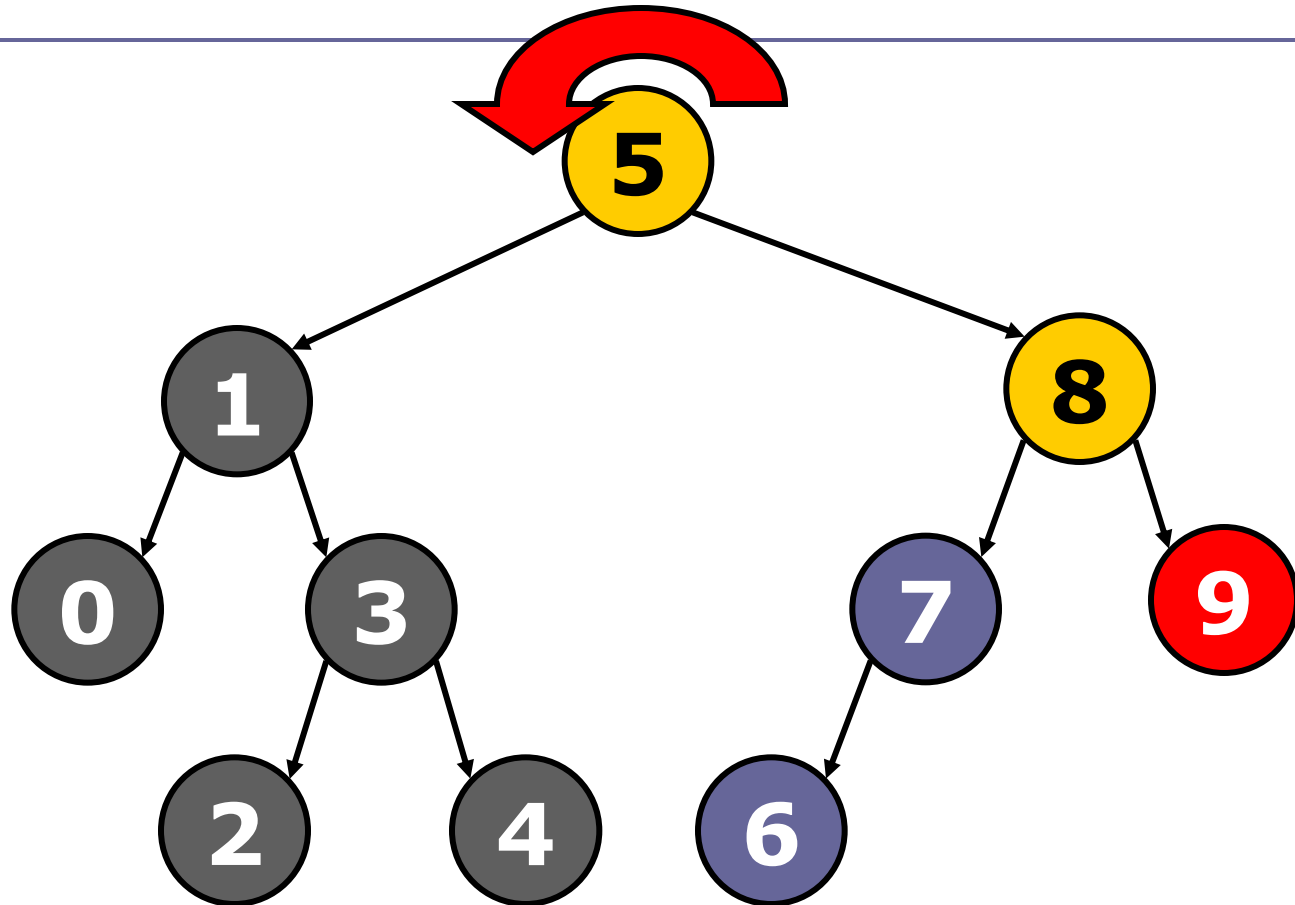
**else**

$p.right = l$

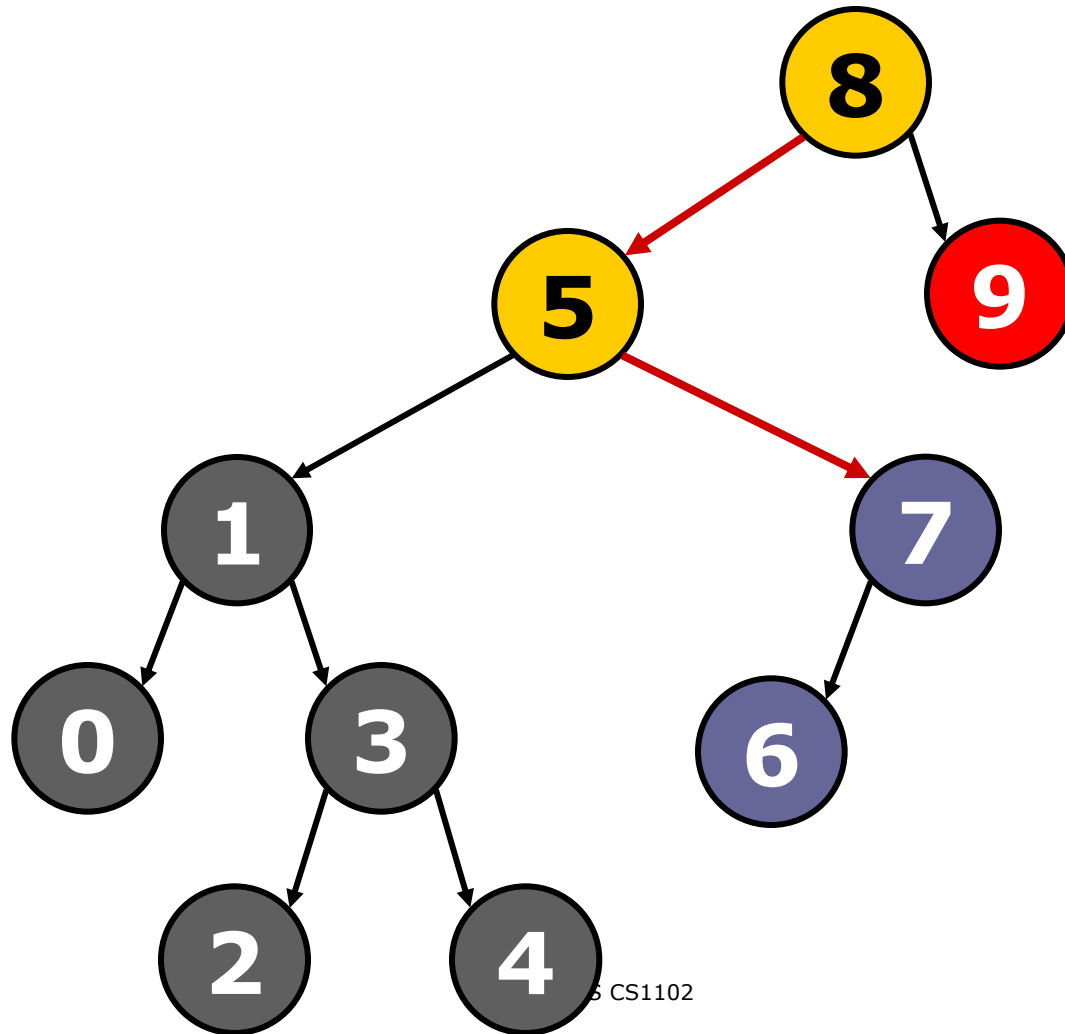
The pseudo code on the right shows how we rotate right at  $x$ .  
The red arrows are the pointers after modification.



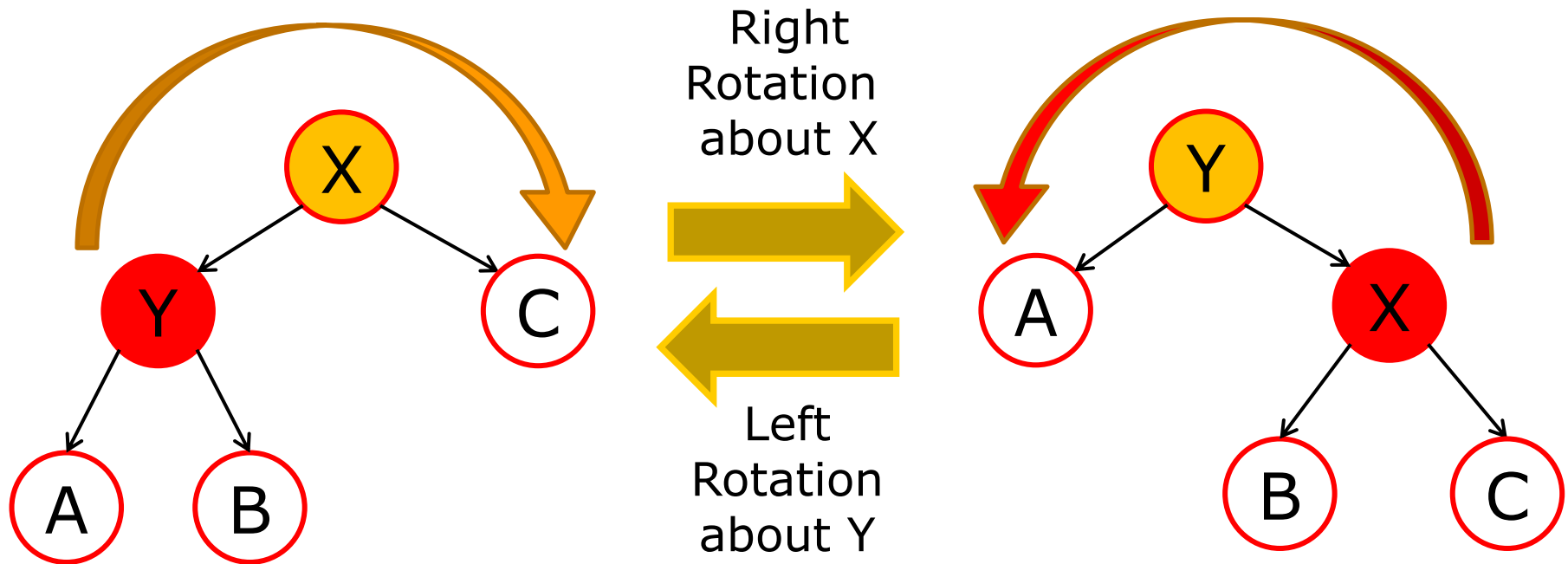
# Rotate **Left** at 5



# After Rotate Left at 5 (cont.)



# Right and Left Rotation



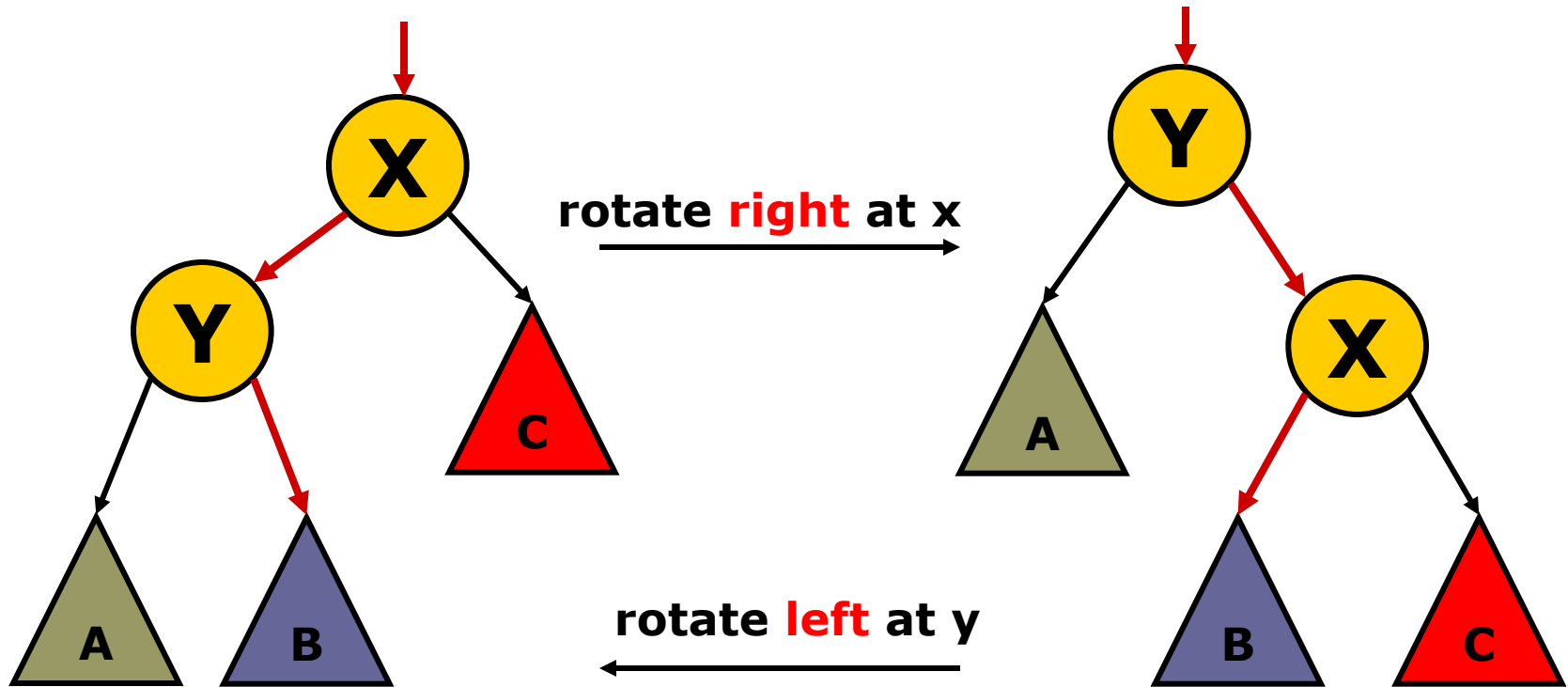
## Right Rotation

- Need X to have a left child Y
- Make X right child of Y
- **Make B (right child of Y) left child of X**

## Left Rotation

- Need Y to have a right child X
- Make Y left child of X
- **Make B (left child of X) right child of Y**

# Rotation Summary



# AVL Tree



An AVL tree – named for its inventors, **A**del'son-**V**el'skii and **L**andis- is a balanced binary search tree.

# AVL Tree Property

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- A binary search tree
- At any node, the difference in **height** between left and right subtree is at most **one (invariant)**.

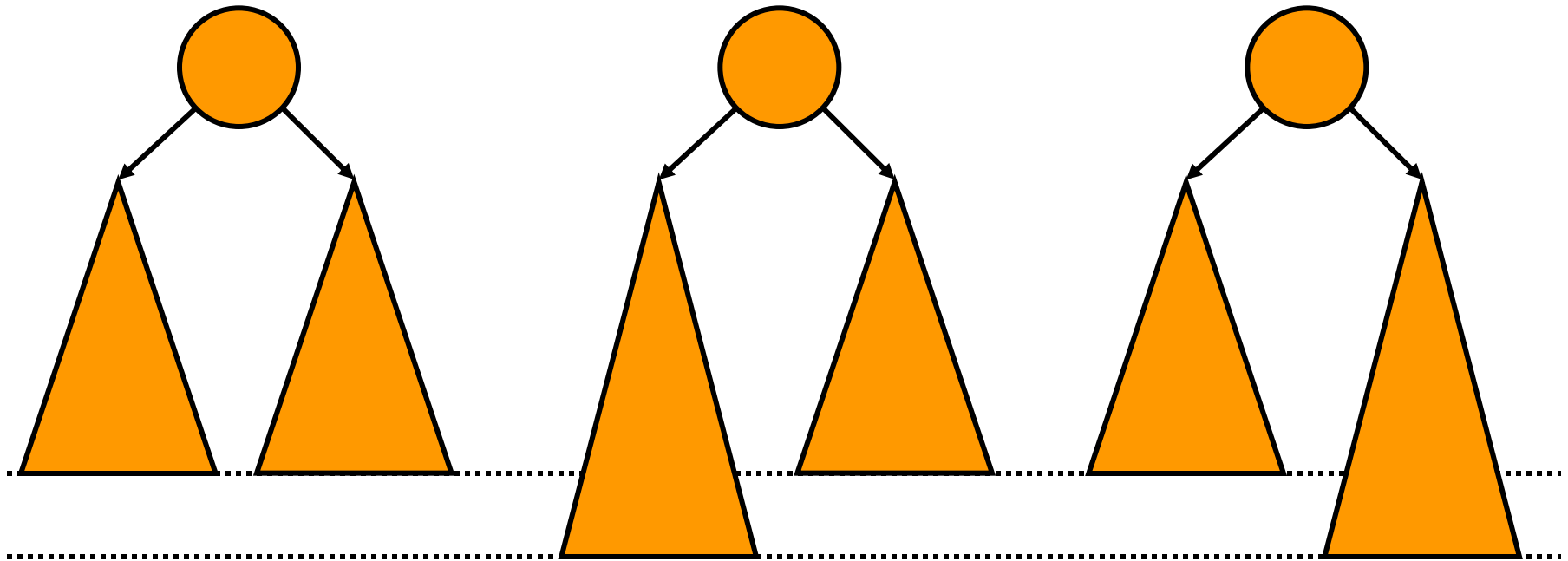
$$|h_l - h_r| \leq 1$$

Where  $h_l$  and  $h_r$  are the heights of the left and right subtrees of the node.

This property must hold recursively for **all subtrees**.

# AVL Tree Property

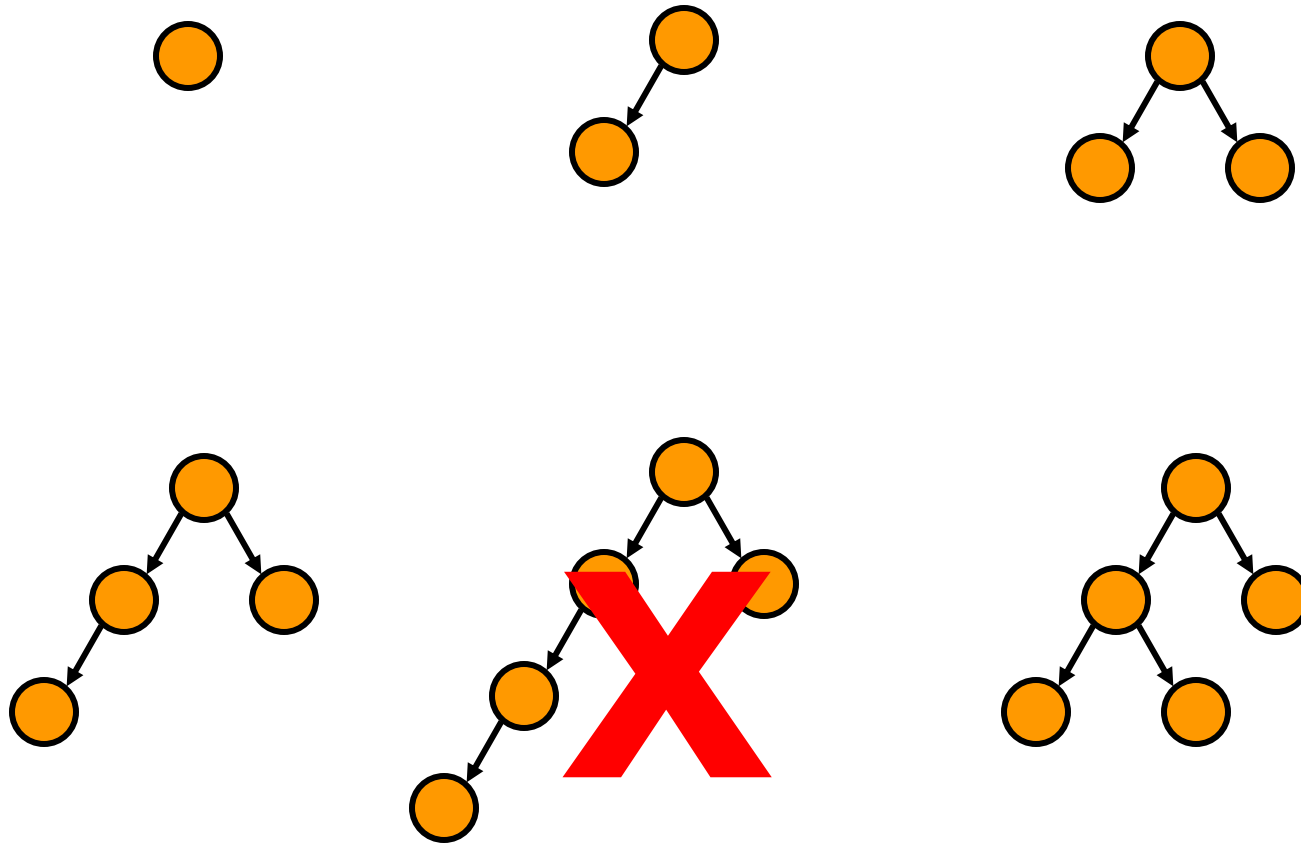
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The difference between the levels of the two dotted lines is one.

# AVL Tree Examples

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Why no?



# Height of an AVL Tree

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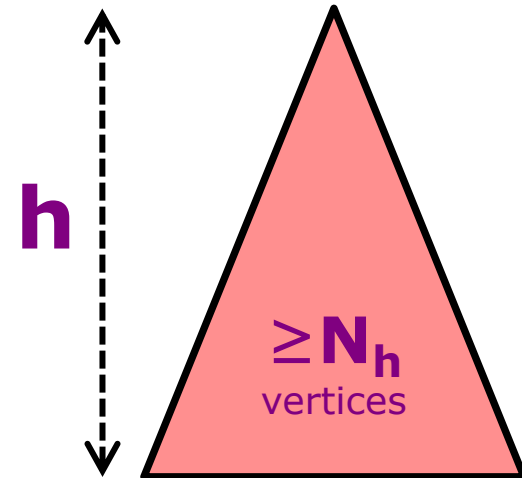
Claim:

A height-balanced tree with **N** vertices  
has height **h**  $< 2 * \log_2(\mathbf{N})$

Proof:

Let **N<sub>h</sub>** be the minimum number of vertices  
in a height-balanced tree of height **h**

The actual number of  
vertices **N**  $\geq \mathbf{N}_h$



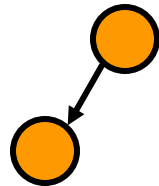
# Height of an AVL Tree

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- **Minimal** AVL trees of height  $h$ : AVL Trees having height  $h$  and **fewest** possible number of nodes
- Minimal AVL tree with height 1



- Minimal AVL tree with height 2



# Height of an AVL Tree

Proof:

Let  $N_h$  be the minimum number of vertices in a height-balanced tree of height  $h$

$$N_h = 1 + N_{h-1} + N_{h-2}$$

$$N_h > 1 + 2N_{h-2} \text{ (as } N_{h-1} > N_{h-2} \text{)}$$

$$N_h > 2N_{h-2} \text{ (obvious)}$$

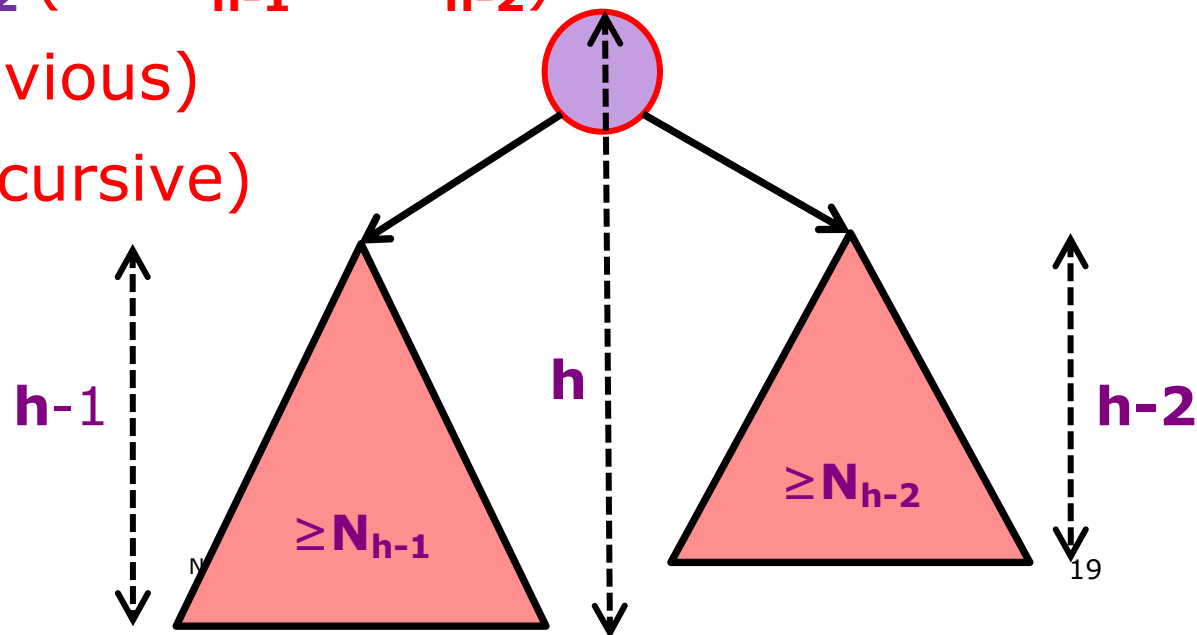
$$= 4N_{h-4} \text{ (recursive)}$$

$$= 8N_{h-6}$$

$$= \dots$$

Base case:

$$N_0 = 1$$



# Height of an AVL Tree

Proof:

Let  $N_h$  be the minimum number of vertices in a height-balanced tree of height  $h$

$$N_h = 1 + N_{h-1} + N_{h-2}$$

$$N_h > 1 + 2N_{h-2}$$

$$N_h > 2N_{h-2}$$

$$> 4N_{h-4}$$

$$> 8N_{h-6}$$

$$> \dots$$

As at each step we reduce  $h$  by 2, then we need to do this step  $h/2$  times to reduce  $h$  (assume  $h$  is even) to 0

Base case:

$$N_0 = 1$$

$$N_h > 2^{h/2} N_0$$

$$N_h > 2^{h/2}$$

# Height of an AVL Tree

Claim:

A height-balanced tree is balanced,  
i.e., it has height  $h = O(\log(N))$

We have shown that:  $N_h > 2^{h/2}$  and  $N \geq N_h$

$$N \geq N_h > 2^{h/2}$$

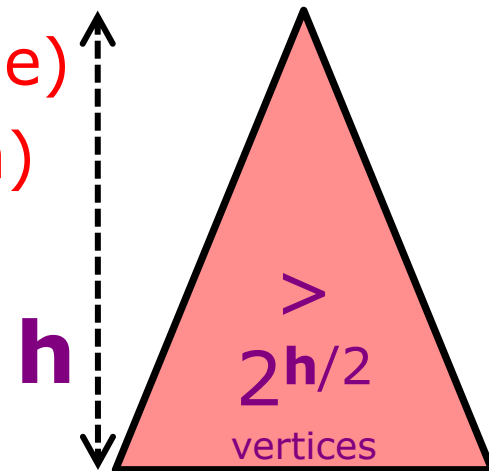
$$N > 2^{h/2}$$

$$\log_2(N) > \log_2(2^{h/2}) \text{ (}\log_2 \text{ on both side)}$$

$$\log_2(N) > h/2 \text{ (formula simplification)}$$

$$2 * \log_2(N) > h \text{ or } h < 2 * \log_2(N)$$

$$h = O(\log(N))$$

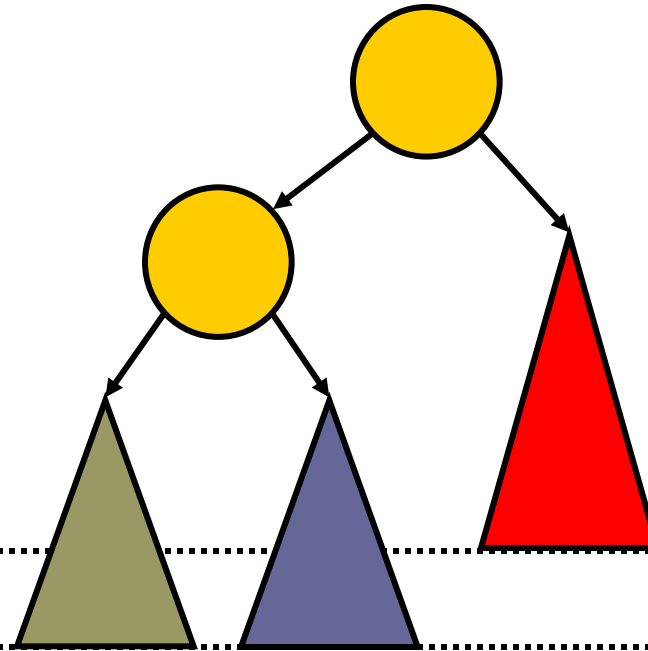


# AVL Tree Insertion



# Idea on Insertion

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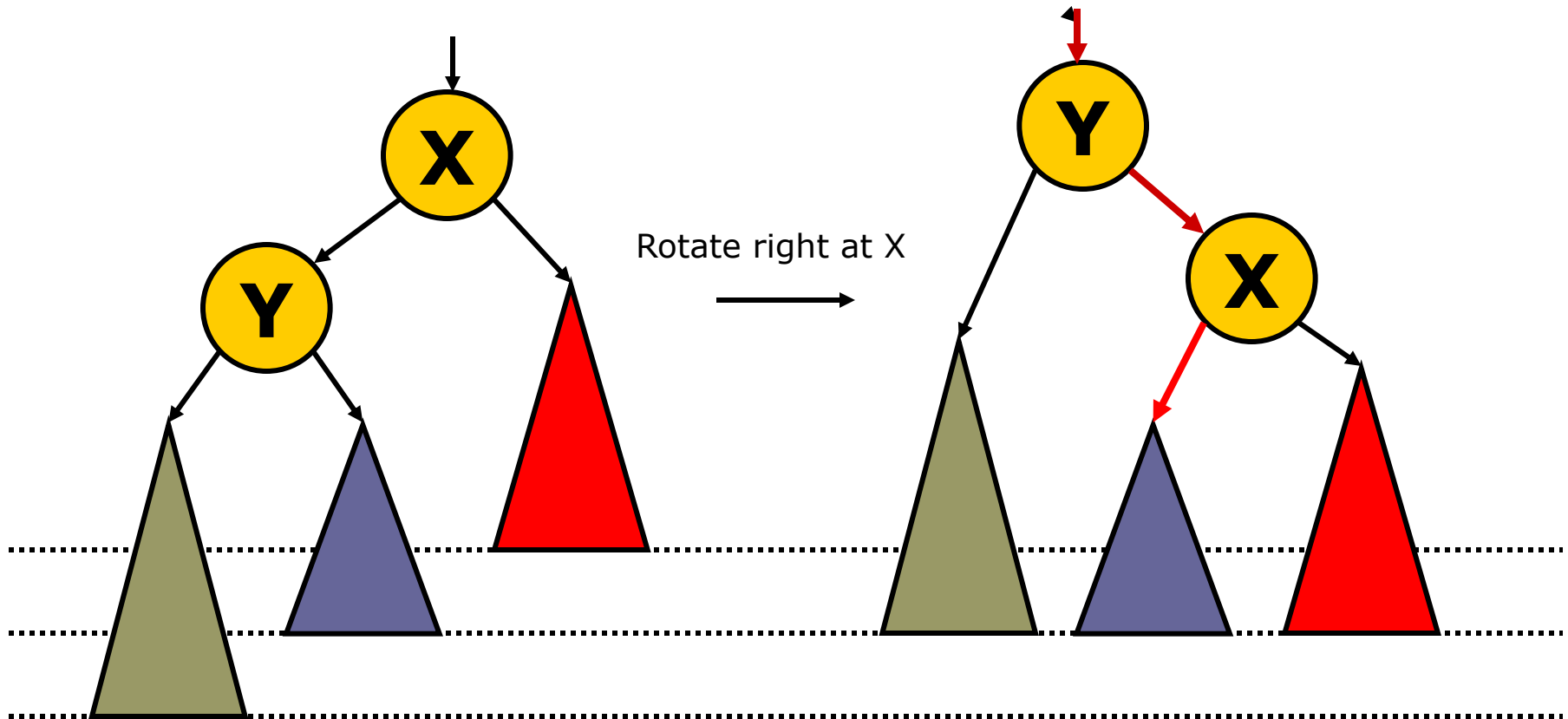


Insertion in red subtree never violates the AVL tree property. But insertion into blue and gray subtree may cause a violation.

To insert into an AVL tree, we insert the node as usual. After insertion, travel from new node back to the root. At each node, checks if  $|h_l - h_r| \leq 1$ . If violation occurs, rotate the tree based on the following cases.

# Case 1: Insert Outside

– insert into left subtree of Y



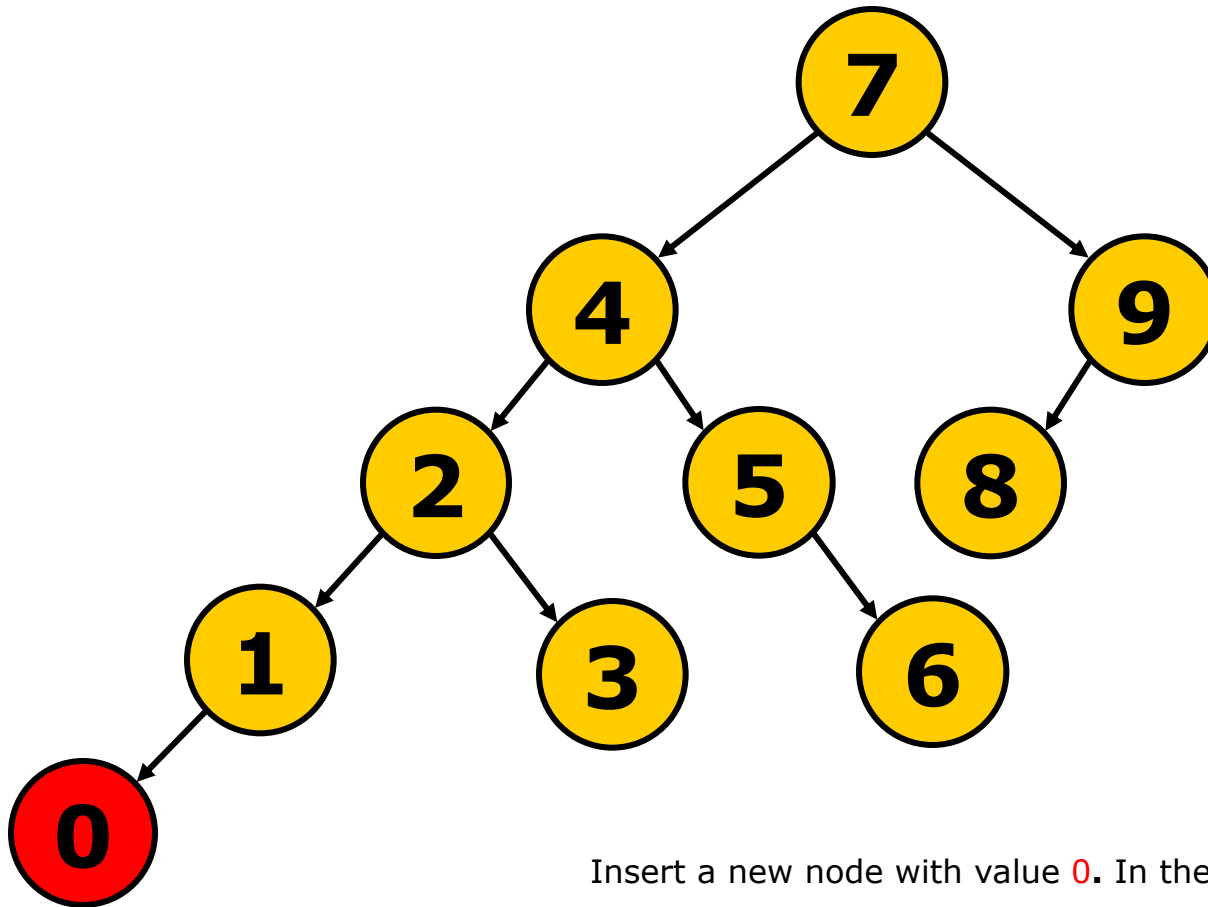
The difference between the levels of the **left subtree of Y** and the **right subtree of X** is **2**.

**Need to rotate right around X**



# Example: Insert Outside

e.g. insert 0



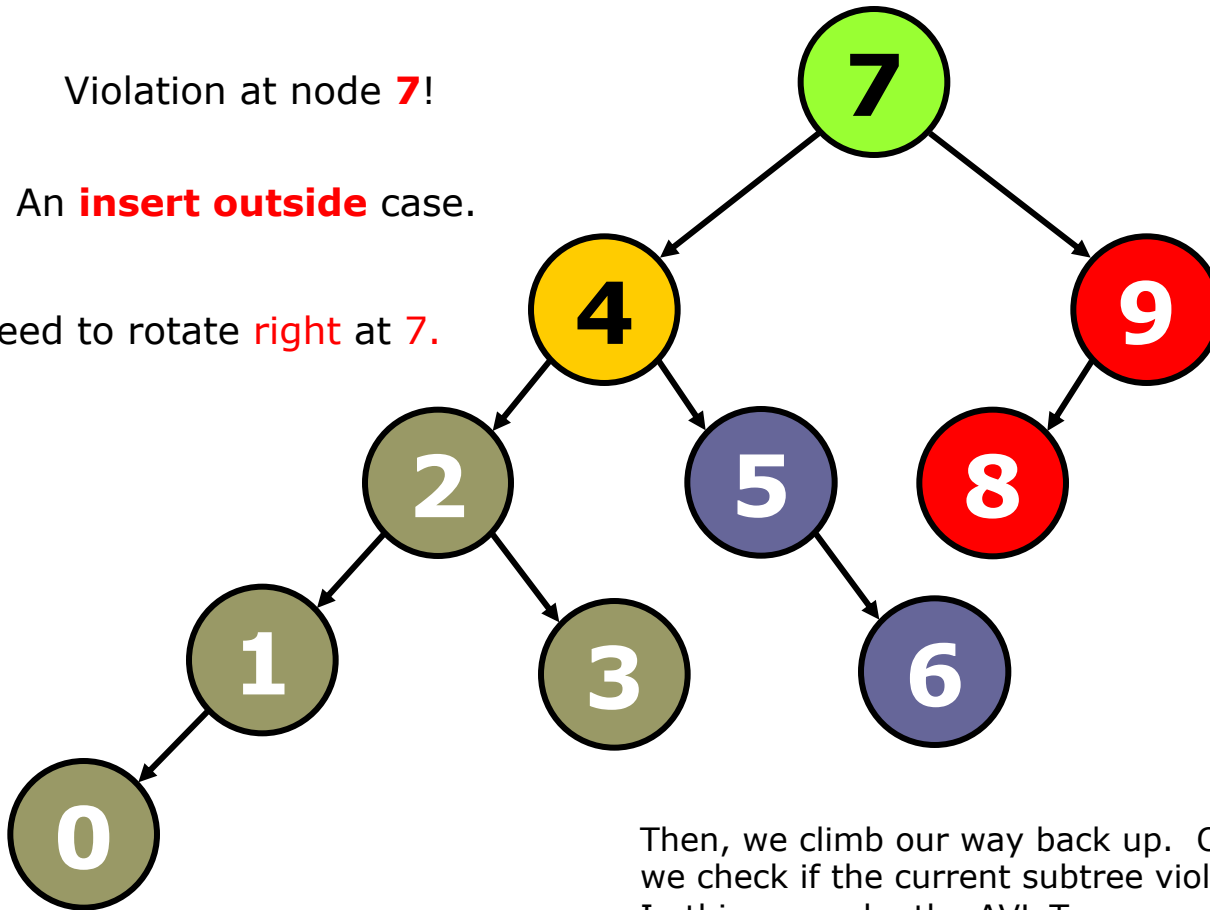
Insert a new node with value 0. In the first pass, we move down the tree just like insertion into a BST.

# Example: Insert Outside (cont.)

Violation at node **7**!

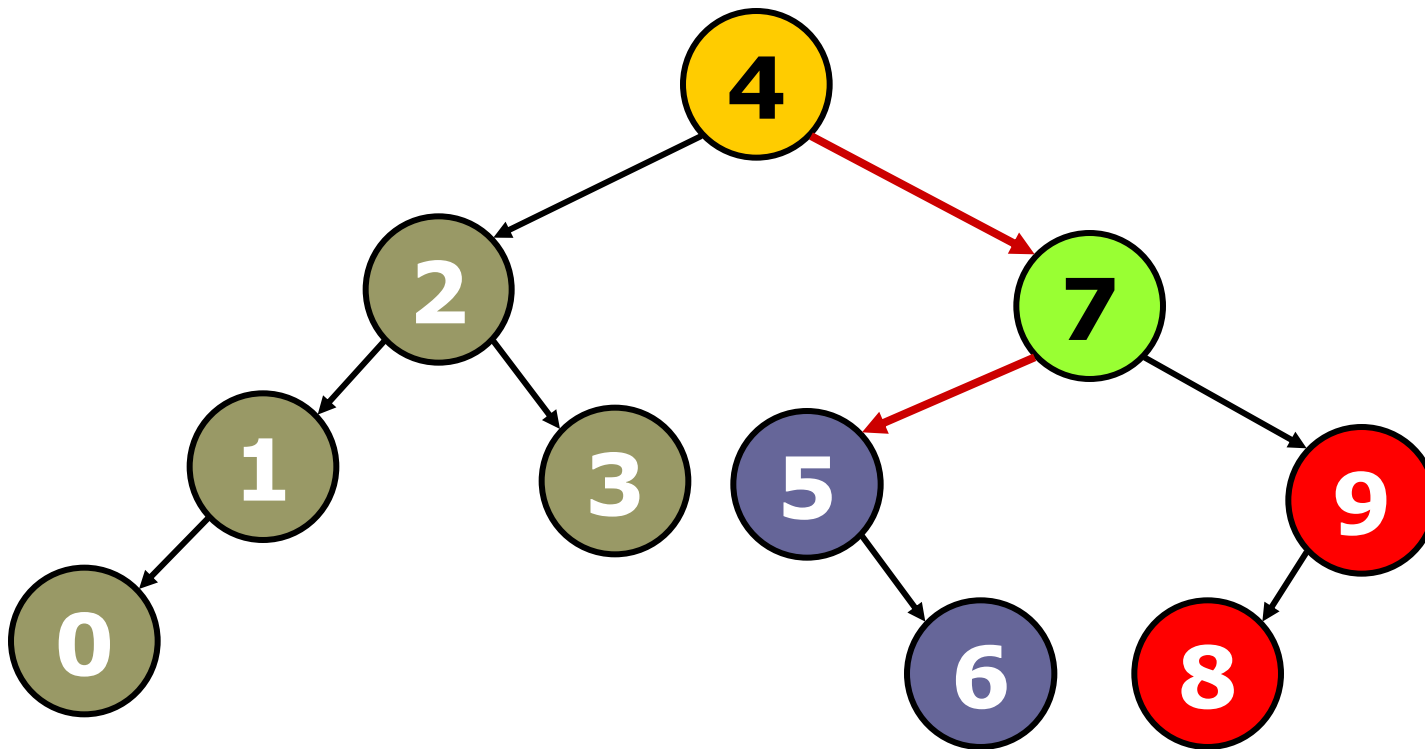
An **insert outside** case.

Need to rotate **right** at **7**.



Then, we climb our way back up. On our way towards the root, we check if the current subtree violates the AVL Tree properties. In this example, the AVL Tree property is **violated** at the **root 7**. **We perform a right rotation at 7.**

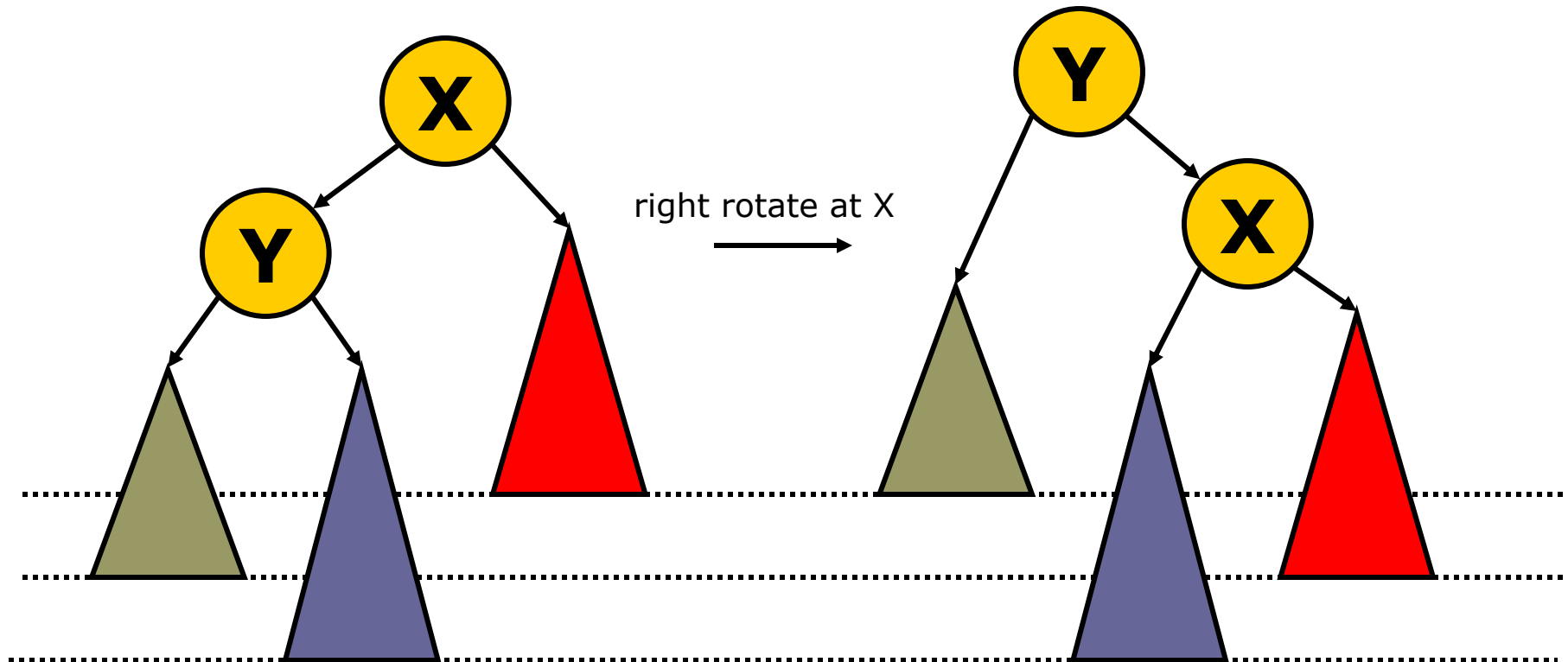
# Example: Insert Outside (cont.)



The tree after we performed a single **right rotation at 7** becomes an AVL tree.

# Case 2: Insert **Inside**

e.g., insert into blue sub-tree, i.e., the right subtree of Y



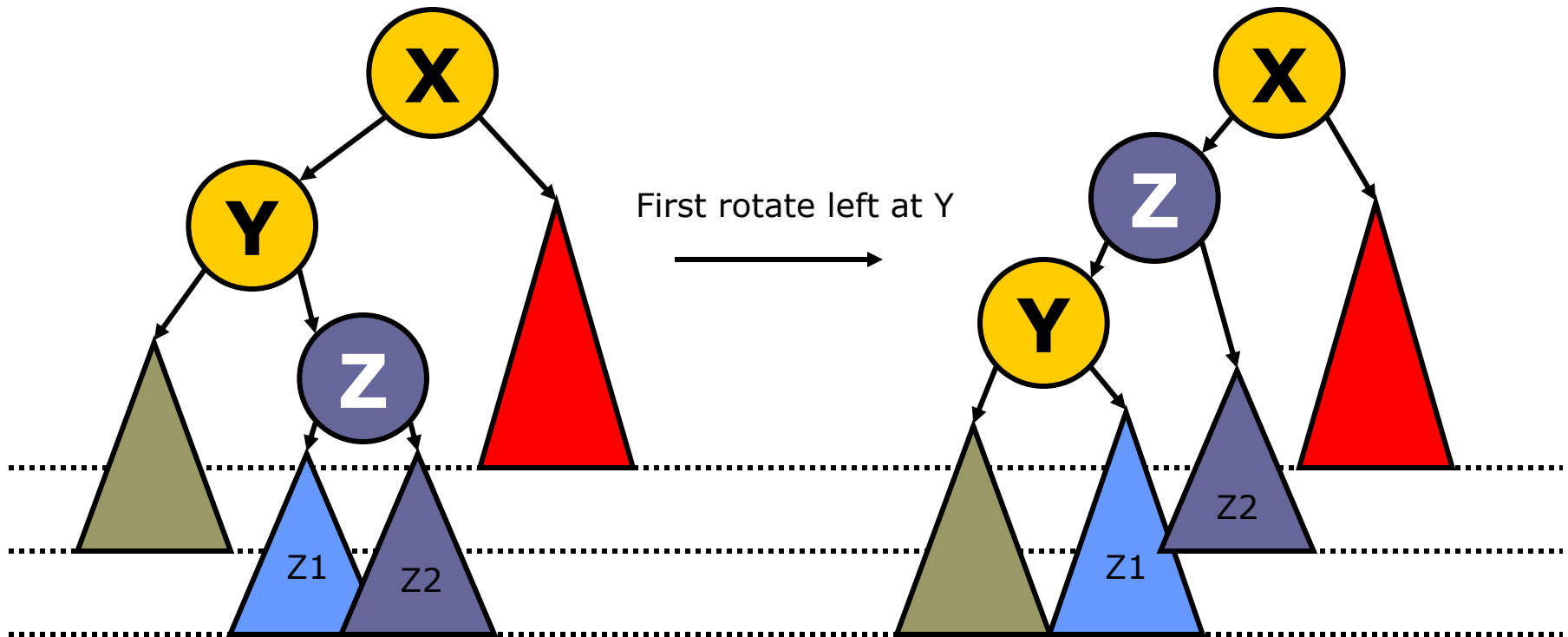
**does not work!**

The difference between the levels of the right subtree of Y and the right subtree of X is 2.

**Single** right rotation at **X** does **not** work if the new node that causes violation belongs in the blue sub-tree. The height of the blue subtree remains unchanged. We need double rotations.

# Case 2: Insert Inside (cont.)

(inserted node in the **blue** subtree)

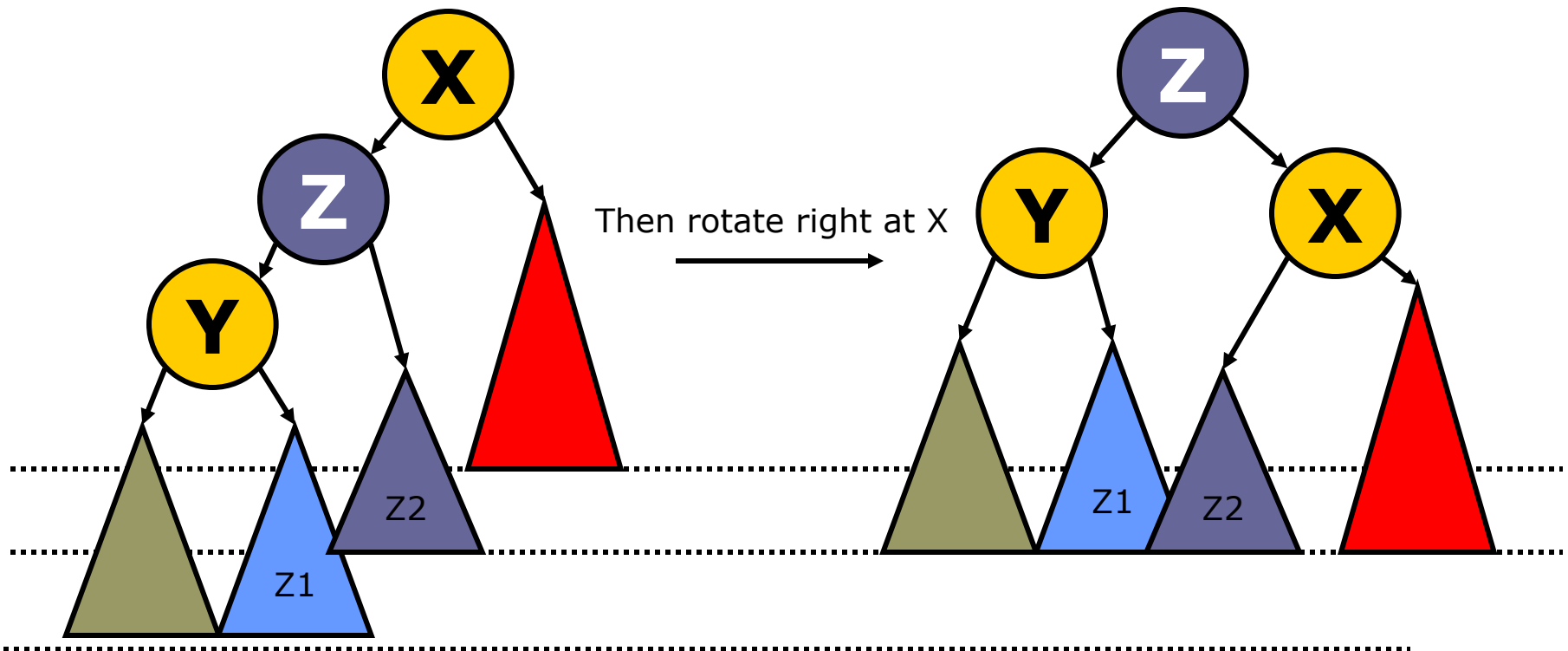


**First rotate left around Y** – become case 1

- Y is the left node of the unbalanced tree with root X.

# Case 2: Become Case 1

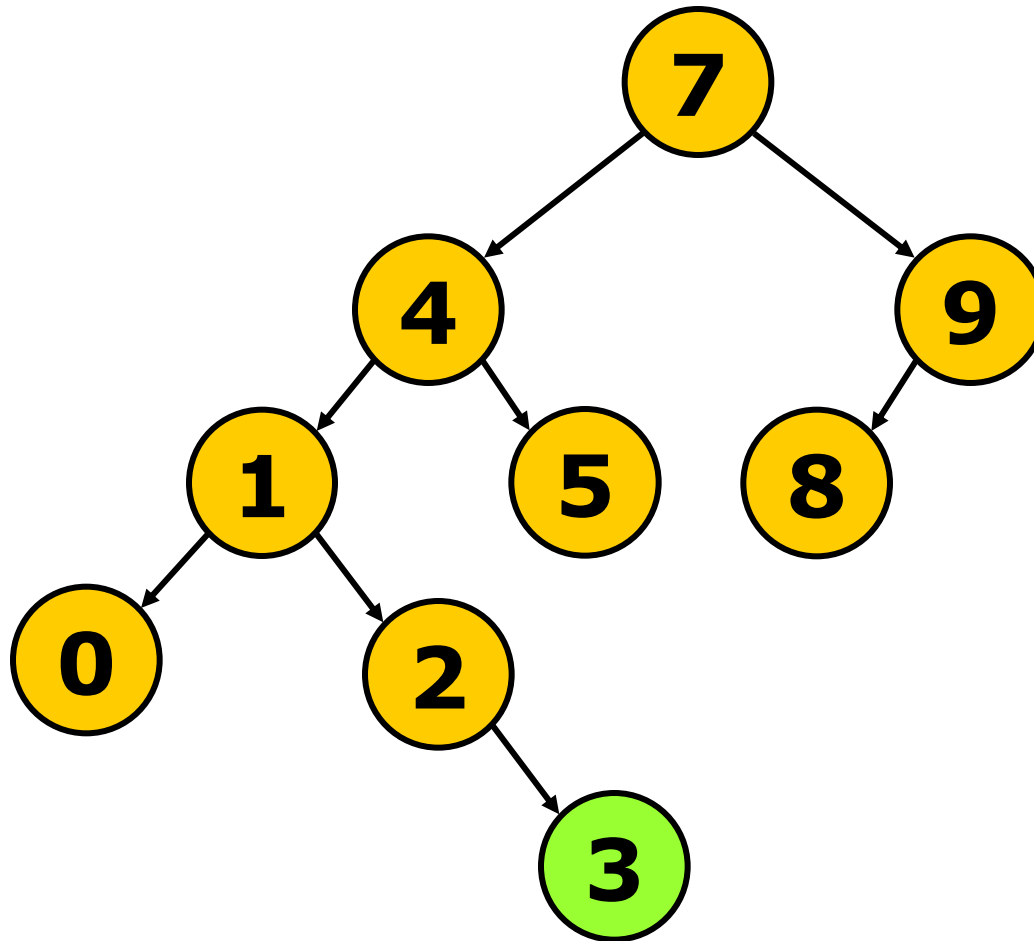
This is case 1.



Then rotate **right** around **X**

# Example: Insert Inside

e.g., insert 3

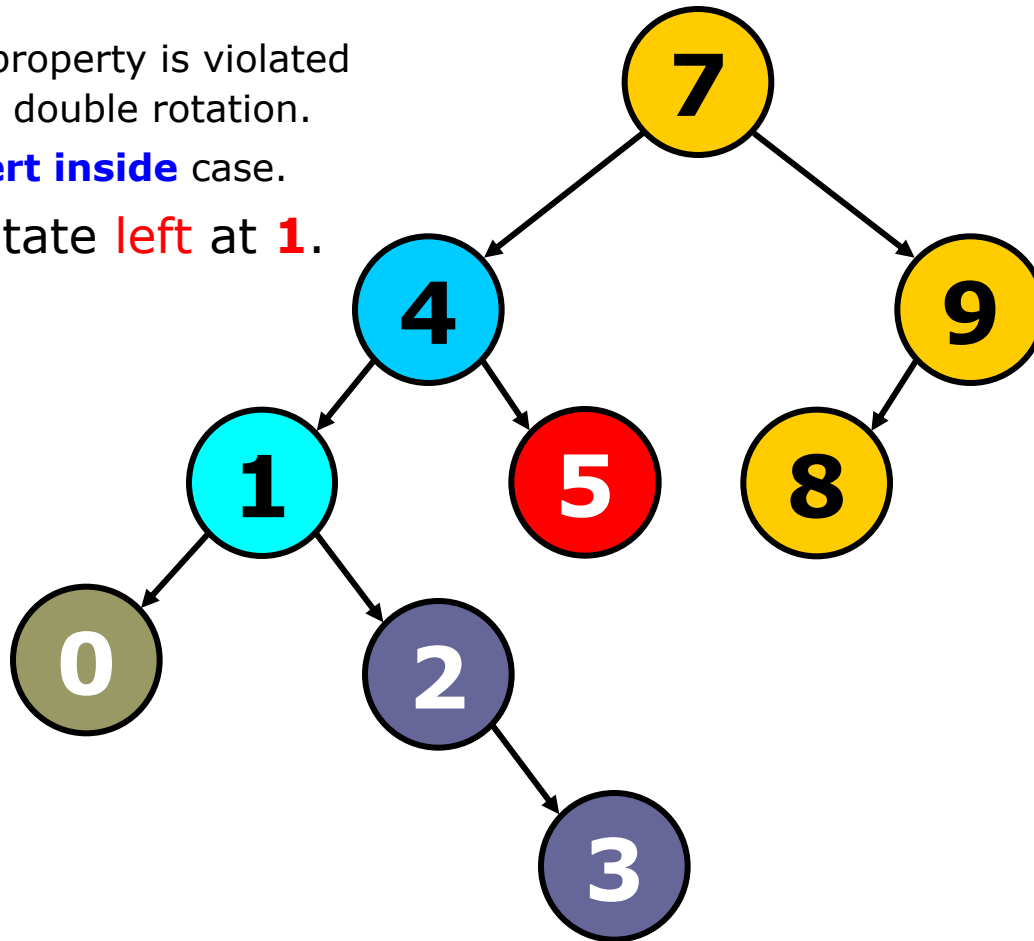


# Example: Insert Inside (cont.)

The AVL Tree property is violated at **4**. We do a double rotation.

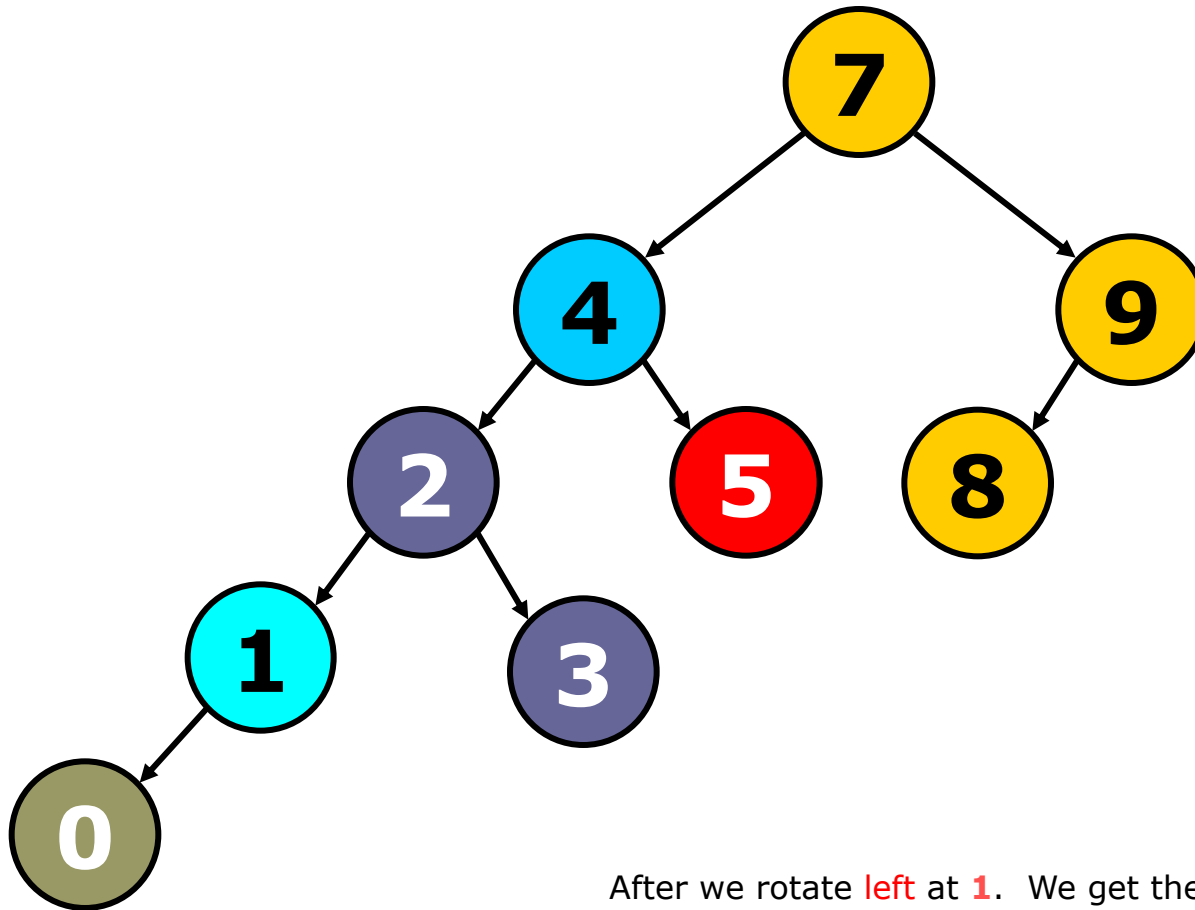
This is an **insert inside** case.

First, we rotate **left** at **1**.



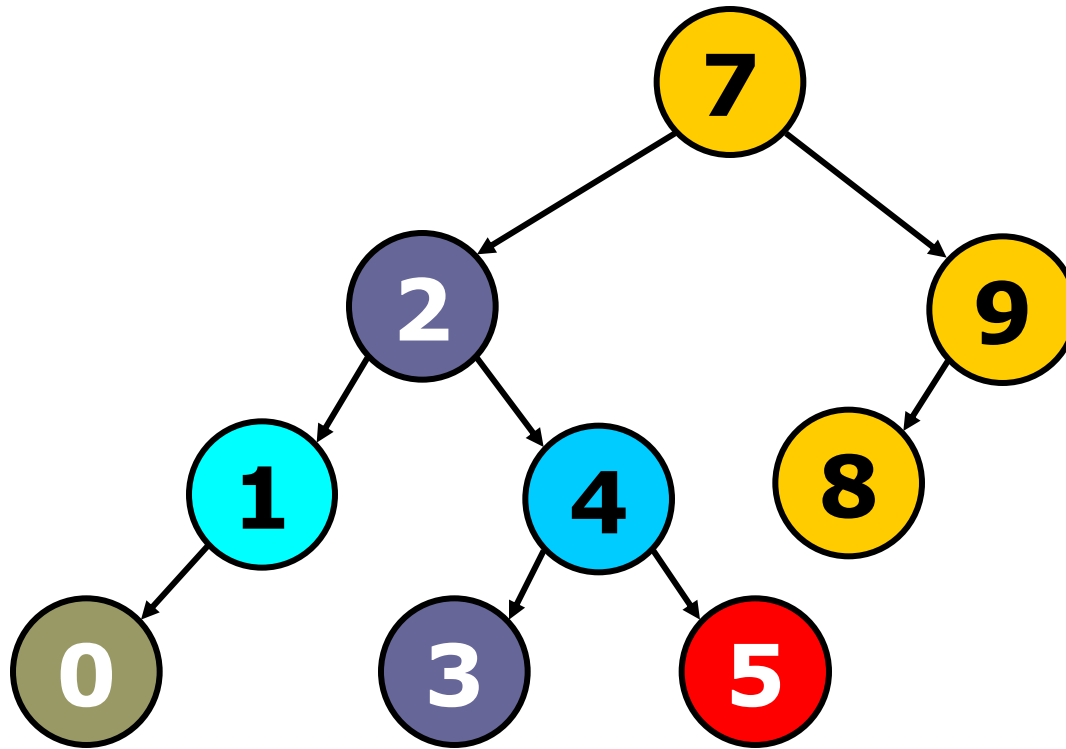


# Example: Insert Inside (cont.)



After we rotate **left** at **1**. We get the tree as shown above.  
Then rotate **right** around **4**.

# Example: Insert Inside (cont.)



After we rotate **right** around **4**, the tree becomes an AVL tree.

# Summary (1)

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- Insert **outside**: Single Rotation
- Insert **inside**: Double Rotation
- **Two** passes needed: first pass down to insert, second pass up to change violation and fix.

Q: How about deletion of nodes from an AVL tree?

[Animation](#)

# Summary (2)

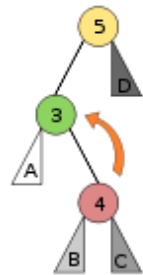
- Insert inside (on left):  
→ double rotation  
**Left-Right (LR) rotation**

- Insert outside (on left):  
→ single rotation  
**Right (R) rotation**

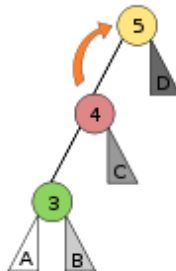
- Result:

Source: Wikipedia

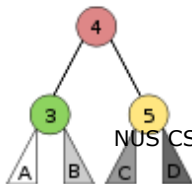
Left Right Case



Left Left Case



Balanced



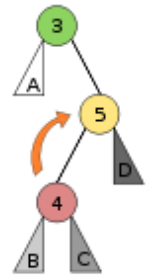
NUS CS1102

- Insert inside (on right):  
→ double rotation  
**Right-Left (RL) rotation**

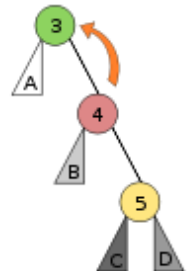
- Insert outside (on right):  
→ single rotation  
**Left (L) rotation**

- Result:

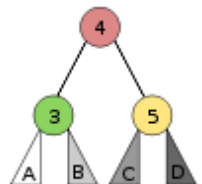
Right Left Case



Right Right Case



Balanced



# Order Statistics



# Dynamic Set ADT

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- **insert** (key, data)
- **delete** (key)
- data = **search** (key)
- key = **findMin** ()
- key = **findMax** ()
- key = **findKth** (k)
- data[] = **findBetween** (low, high)
- **successor** (key) (next larger)
- **predecessor** (key) (next smaller)

# Find **K-th** (Smallest) item

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**Example:** A list of numbers:

8 6 5 4 9 0 7 3

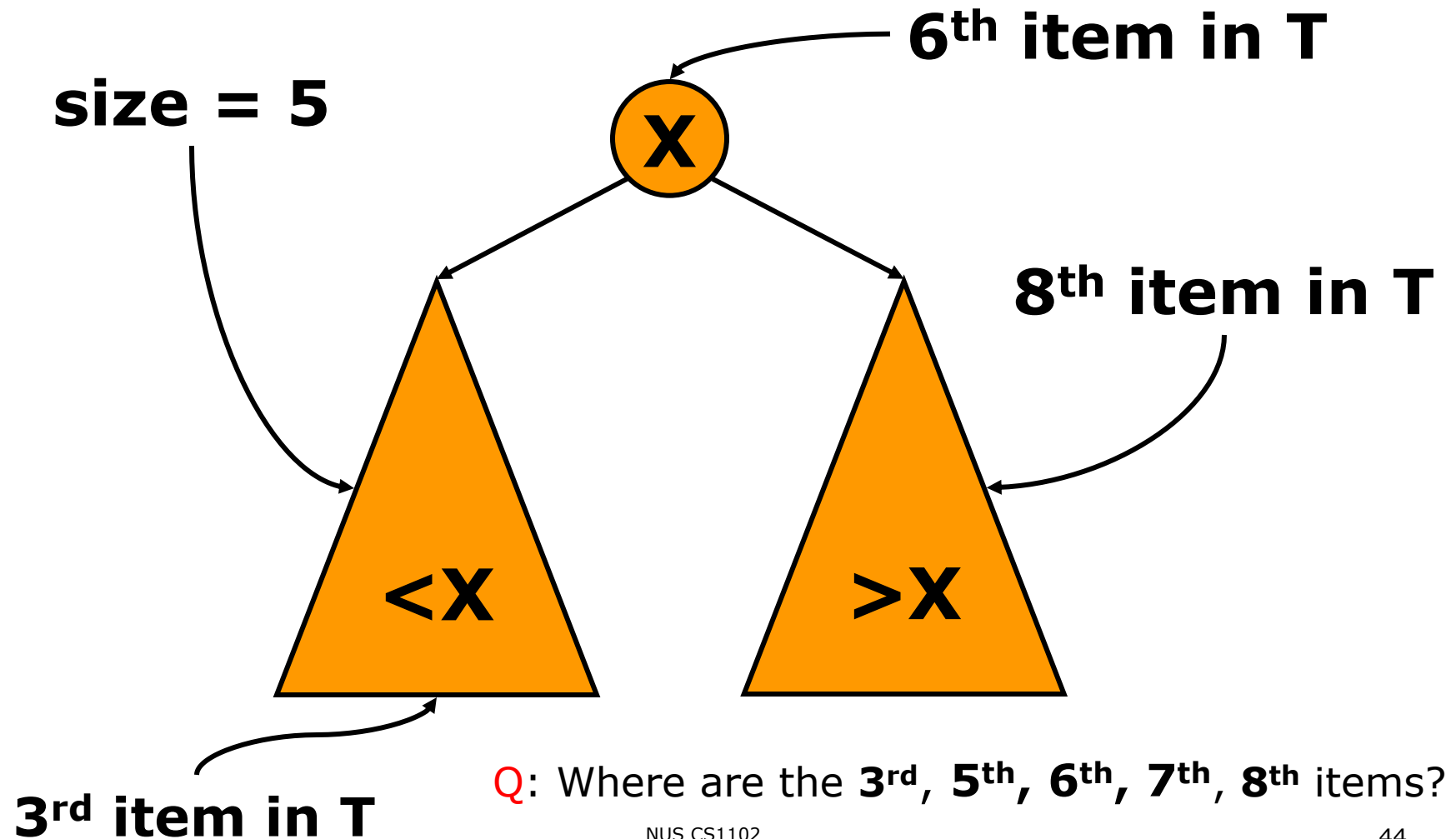
$\text{findKth}(1) = 0$

$\text{findKth}(2) = 3$

$\text{findKth}(5) = 6$

# Find **K-th** (Smallest) item

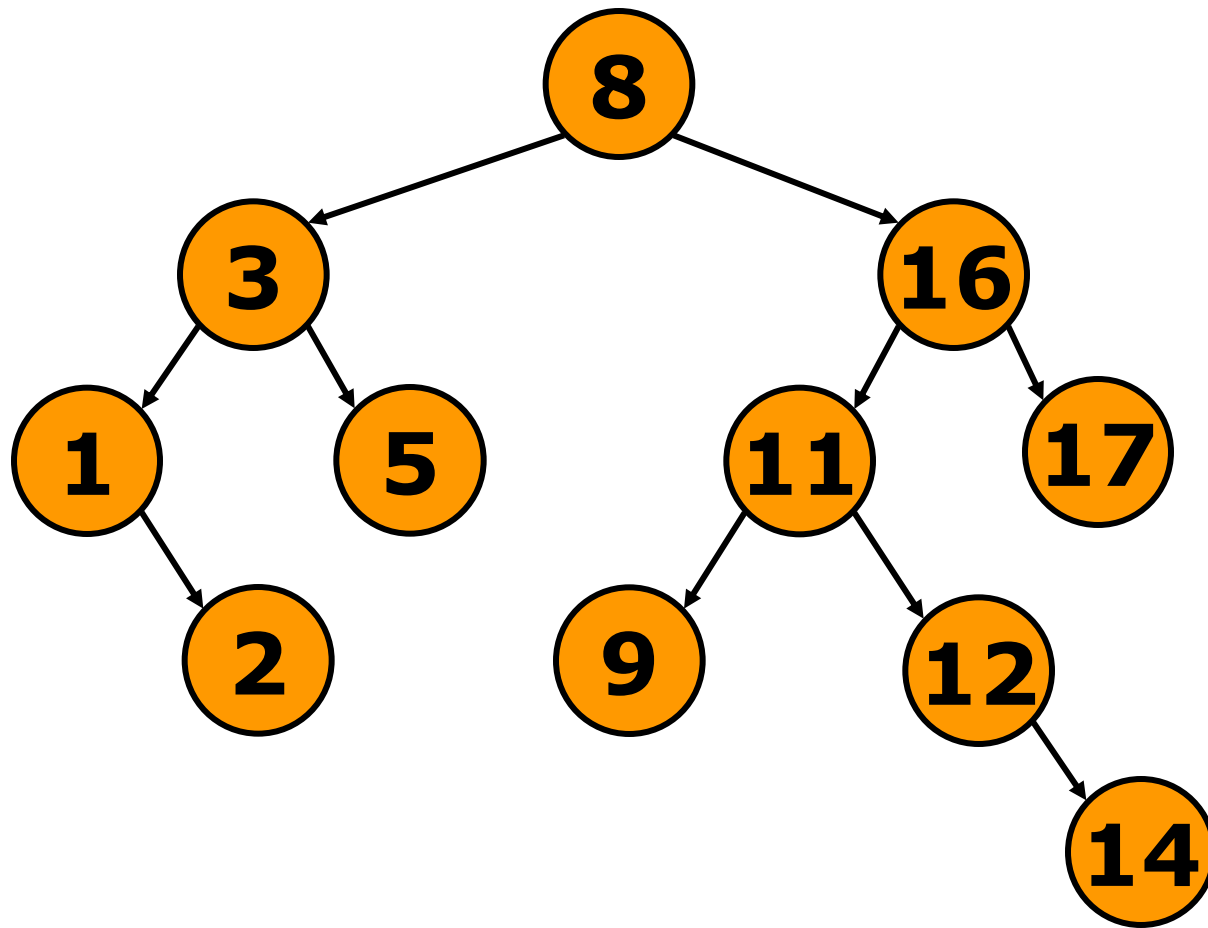
- by BST Property





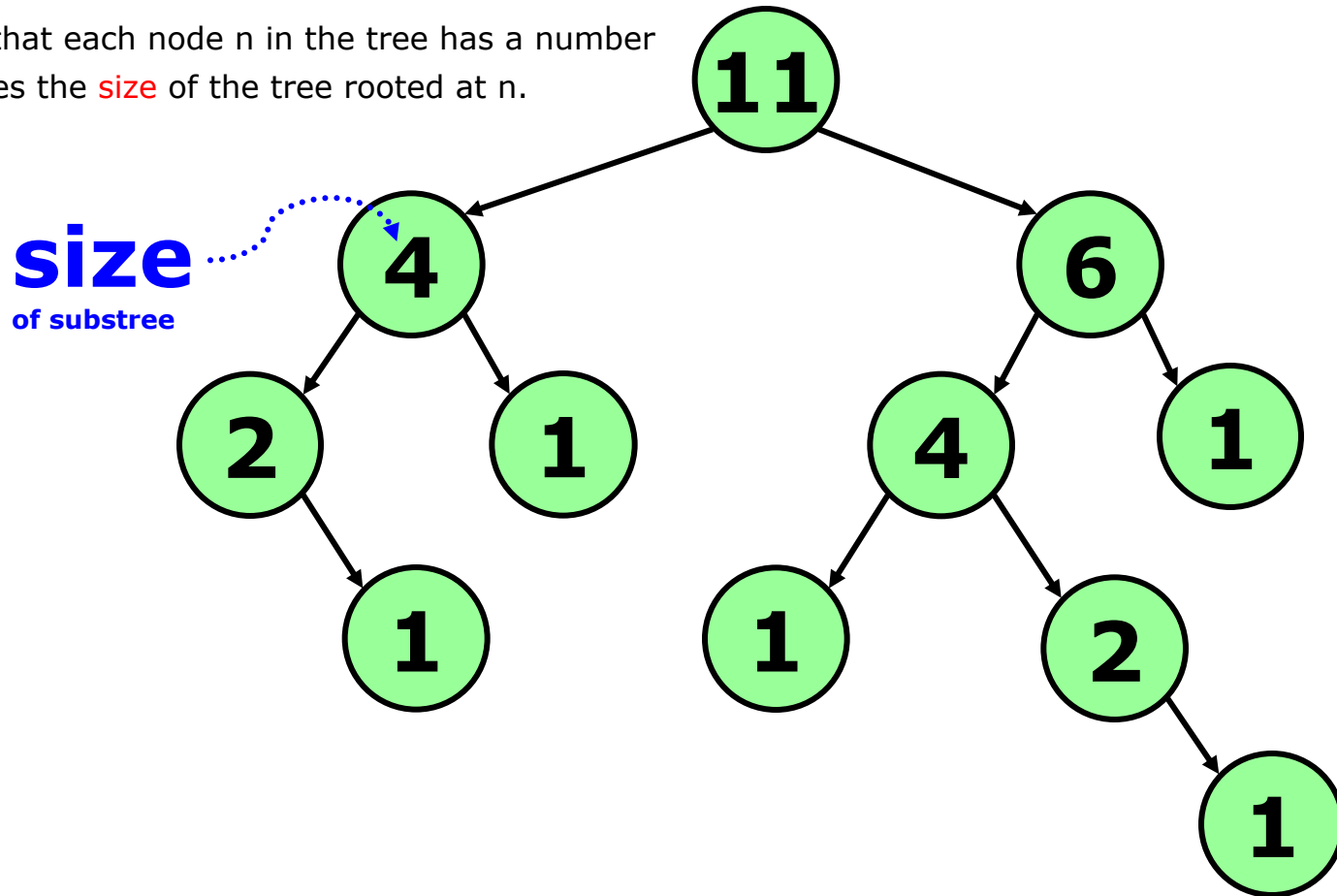
# findKth(T,K) on BST

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# Size of a Tree

Assume that each node  $n$  in the tree has a number that stores the **size** of the tree rooted at  $n$ .



# findKth (T,K) algorithm

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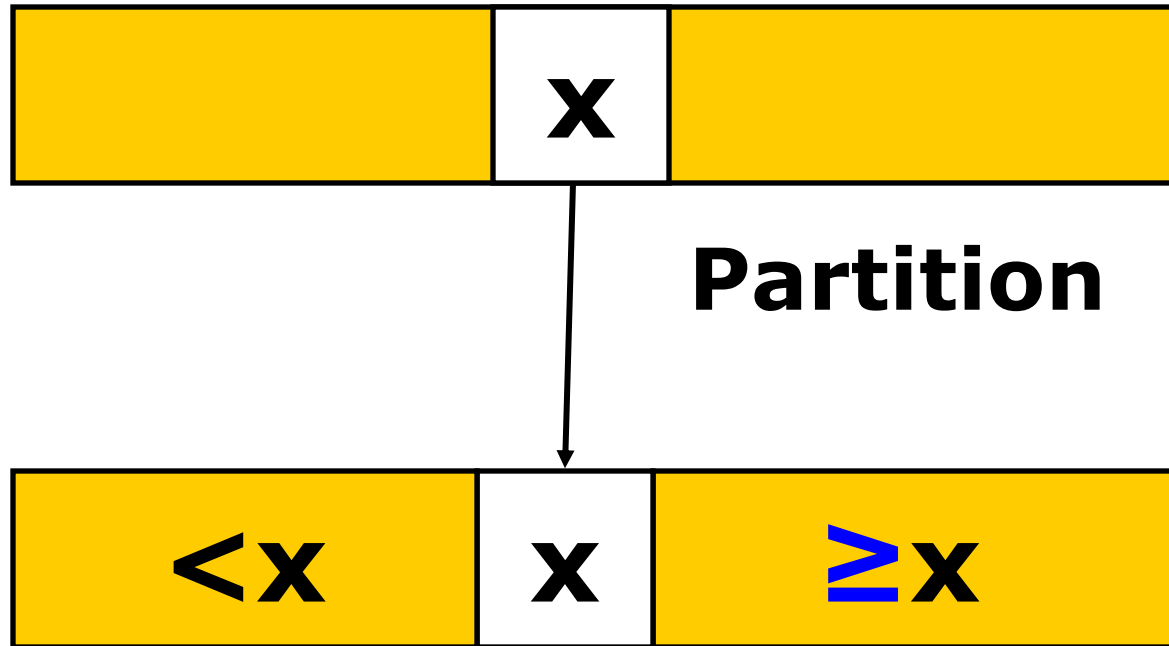
Using the **size** of the tree, we can find the K-th smallest item in a BST using the **recursive** code shown here.

```
if T is empty
    return null
let sizeL be the size of T.left
if K == sizeL + 1
    return T.item
else if K ≤ sizeL
    return findKth(T.left, K)
else
    return findKth(T.right, K - sizeL - 1)
```

# findKth() on an **unsorted** array

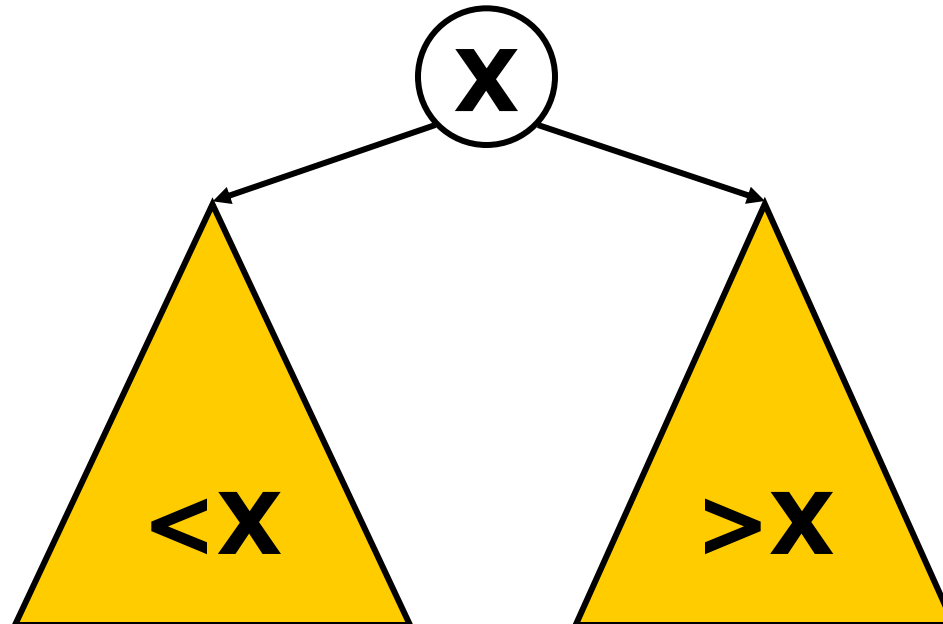
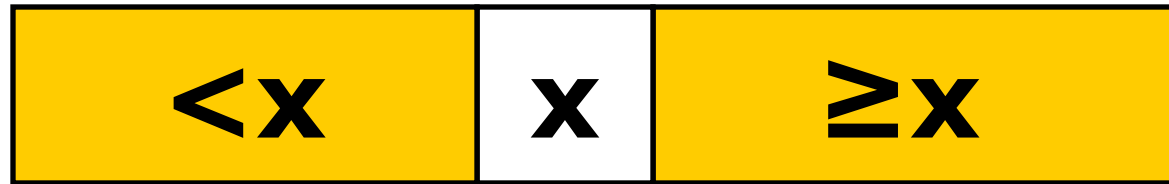
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To perform findKth() on an **unsorted** array, we make use of the **partition algorithm** you learned in quicksort.



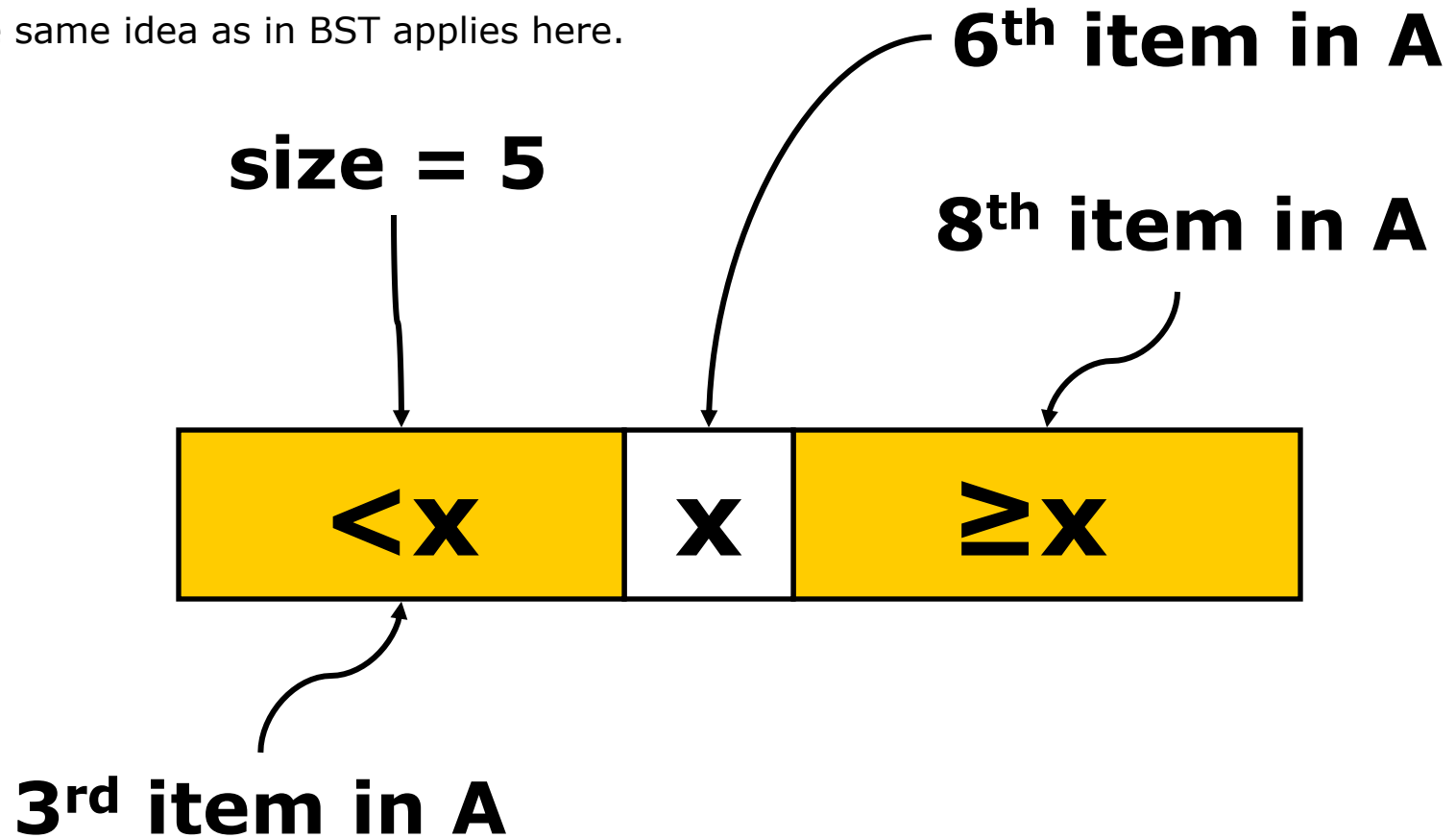
# findKth() on an array (cont.)

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# findKth() on an array (cont.)

The same idea as in BST applies here.



# findKth (A, i, j, K)

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This algorithm finds the k-th smallest element on an **unsorted array** is also called “quickselect”,  
Where **i** and **j** define the subset of the unsorted array between index i to index j.

```
if i > j return NOT FOUND
pivot = partition(A, i, j)
if pivot + 1 == K
    return A[pivot]
else if K ≤ pivot
    return findKth(A, i, pivot - 1, K)
else
    return findKth(A, pivot + 1, j, K-pivot - 1)
```

# Running Time for findKth()

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- On BST :  $O(h)$
- On **Unsorted** Array:
  - **worst** case  $O(N^2)$
  - **best** case  $O(N)$