
CS2040 Data Structures and Algorithms

Lecture Note #9

AVL Tree

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

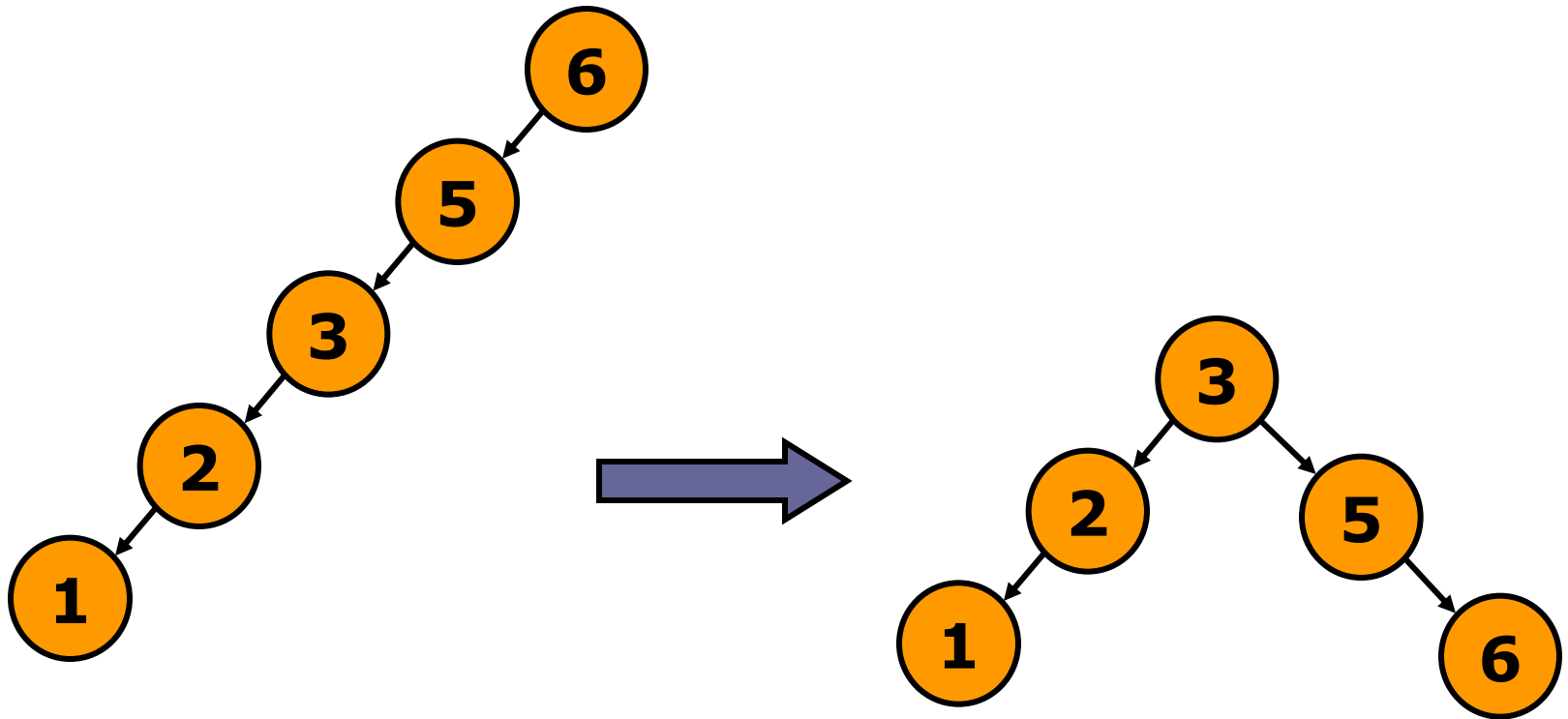
Previously, on BST

- 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 $h=O(N)$!

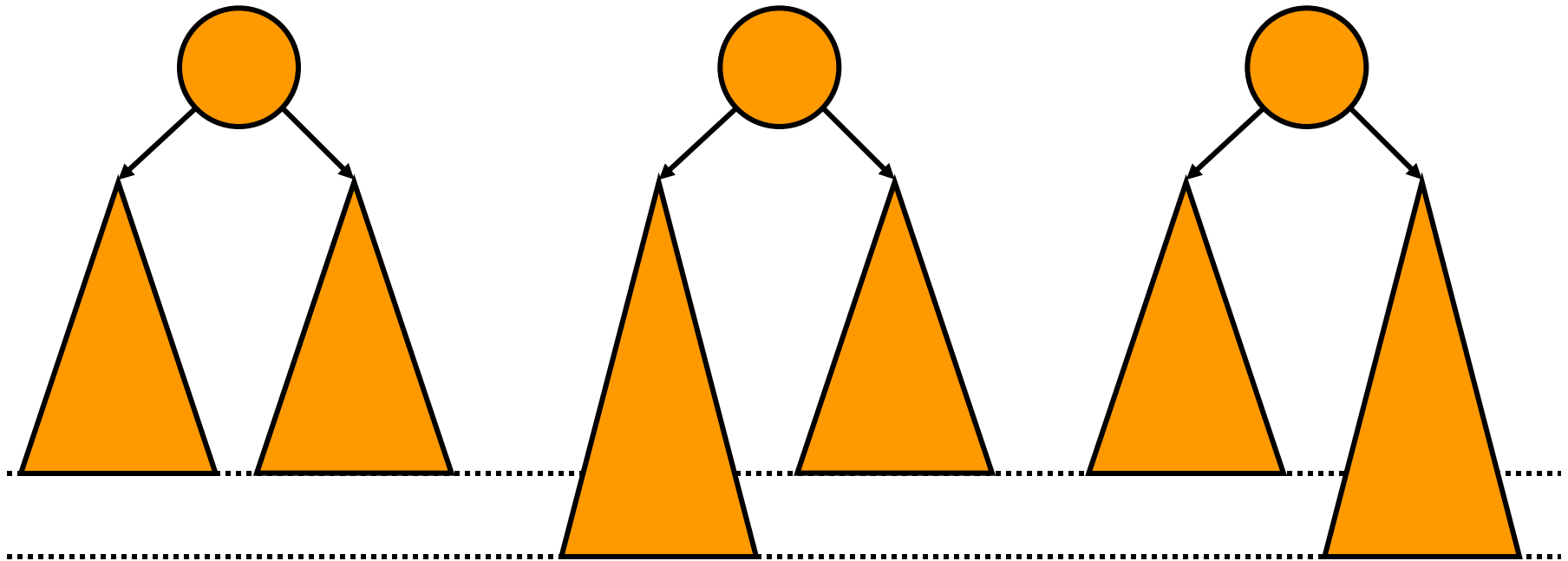
Rotation



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?**

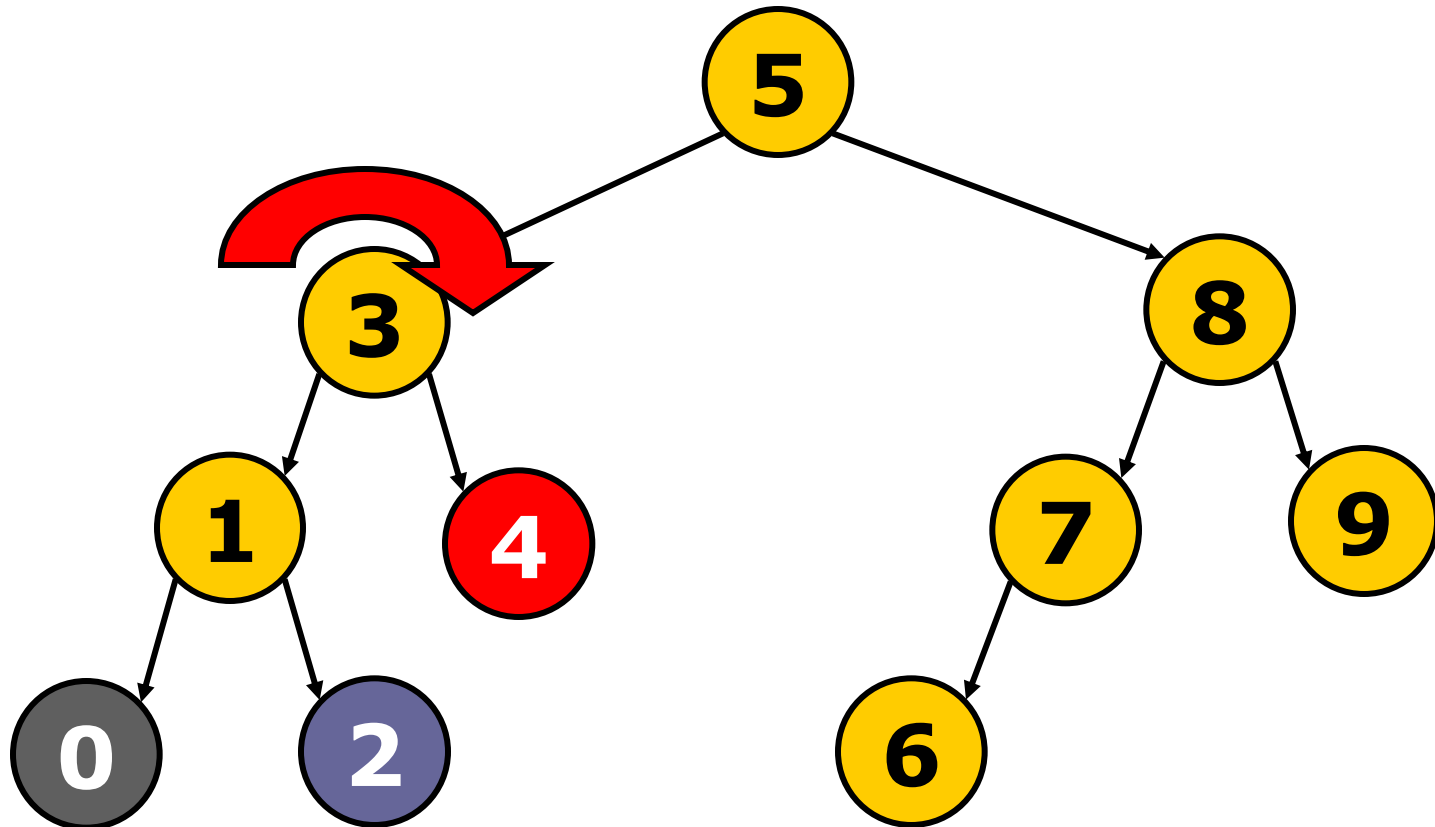
AVL Tree Property



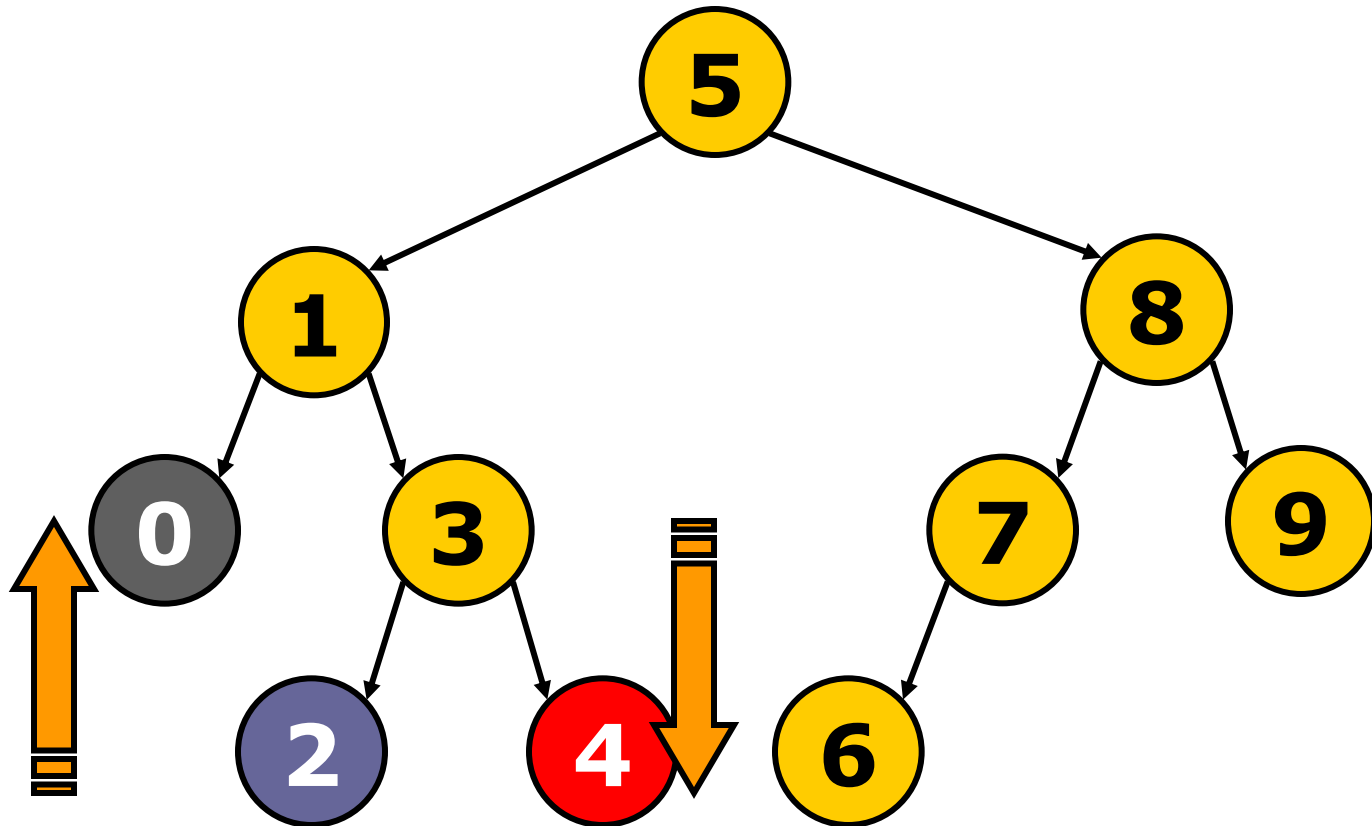
Goal: Keep the **height difference** between left and right subtrees ≤ 1 .
Define an **invariant** (something that will not change).

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

Rotate **Right** at 3

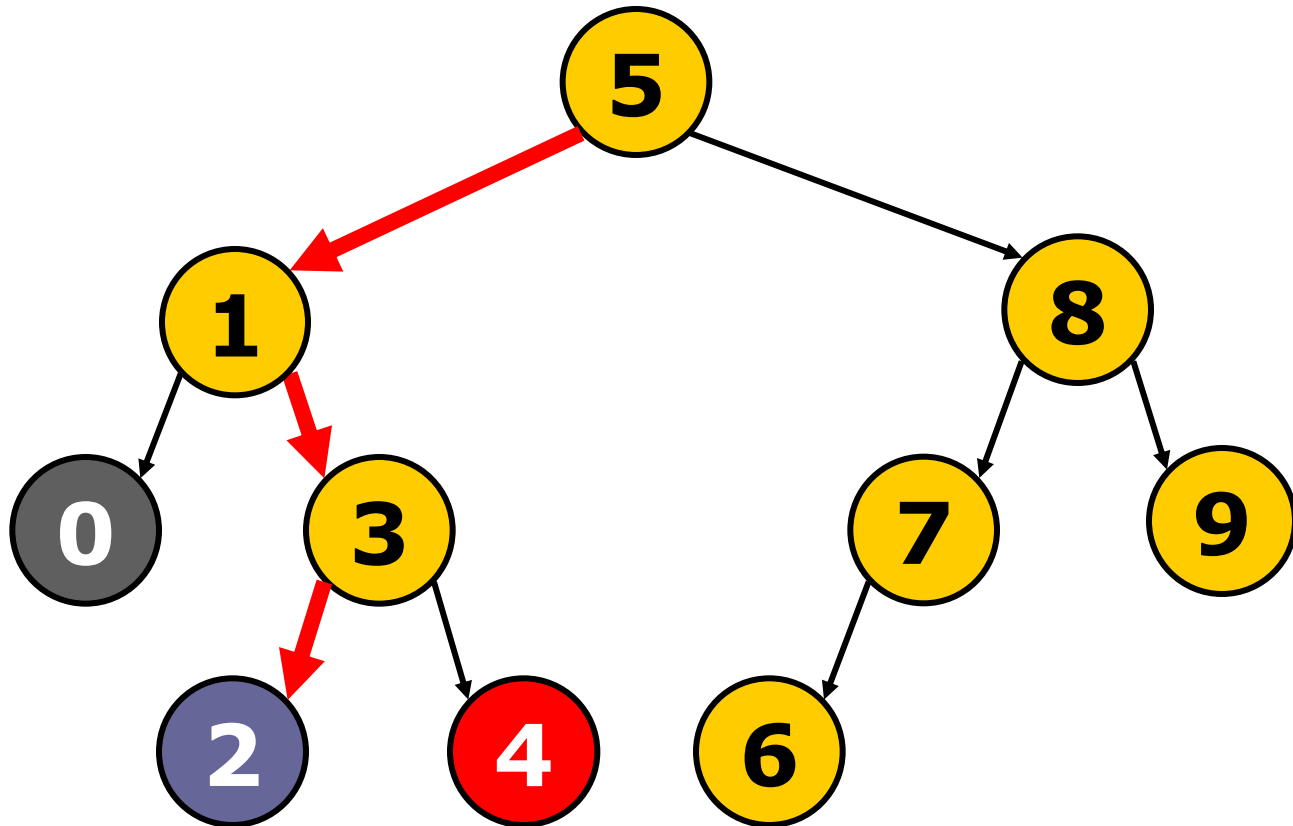


After Rotate Right at 3 (cont.)



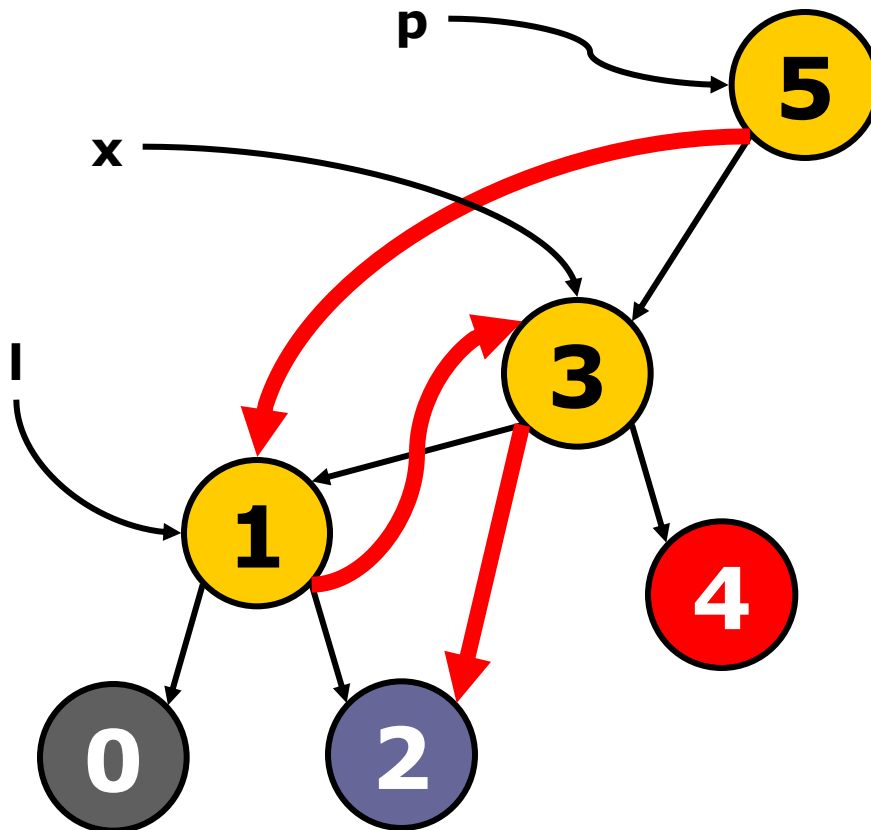
Rotation changes the **heights** of some nodes. In this example, the depth of node 4 increases by 1. The depth of node 0 decreases by 1. The depth of node 2 remains unchanged.

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

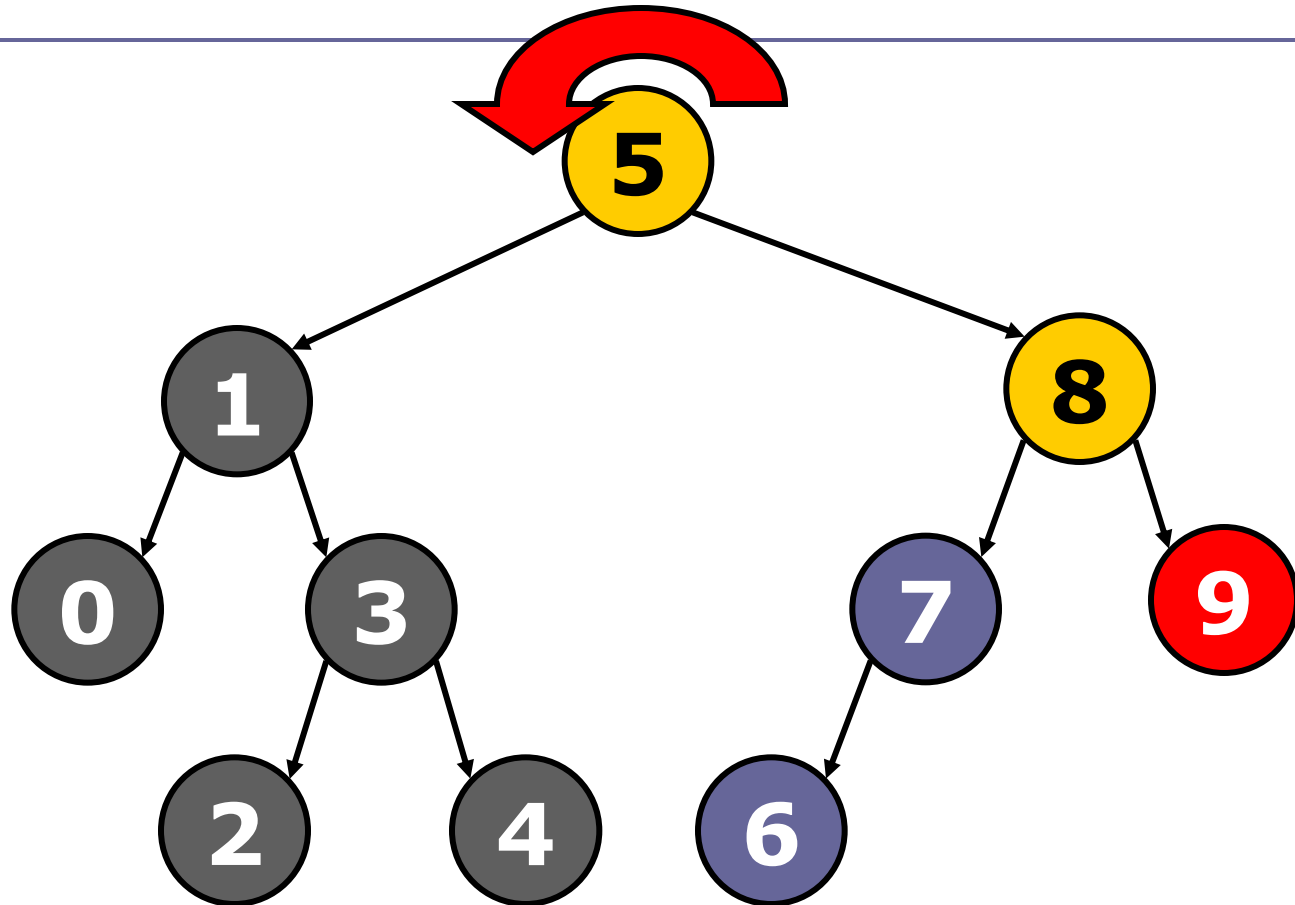
$p.left = l$

else

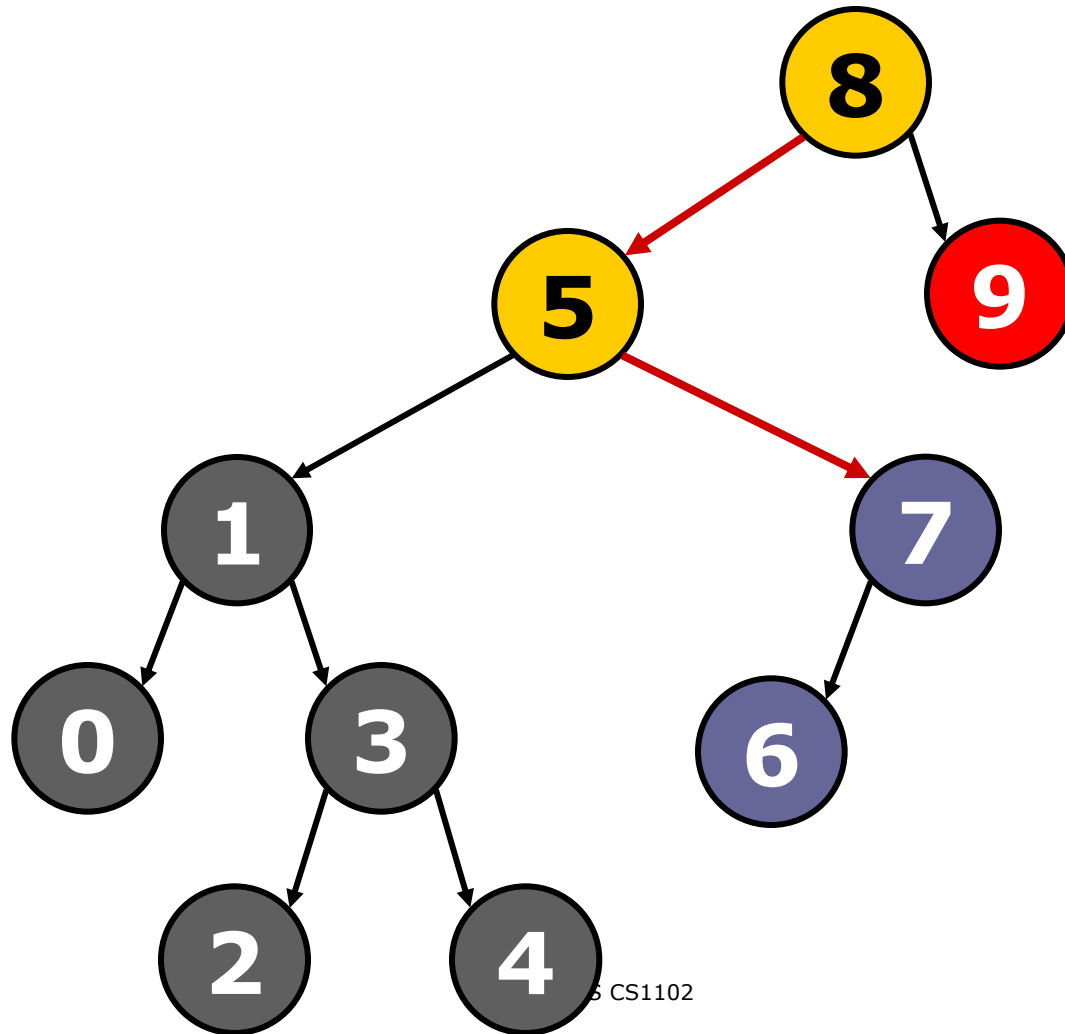
$p.right = l$

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

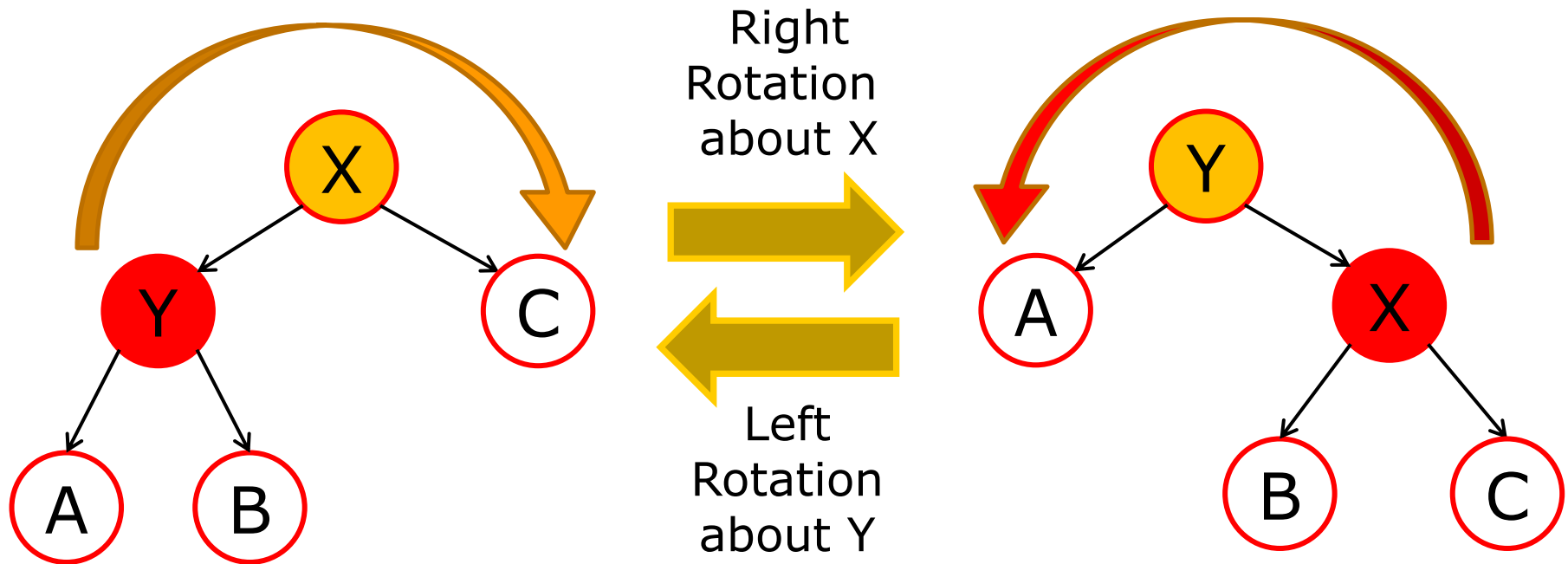
Rotate **Left** at 5



After Rotate Left at 5 (cont.)



Right and Left Rotation



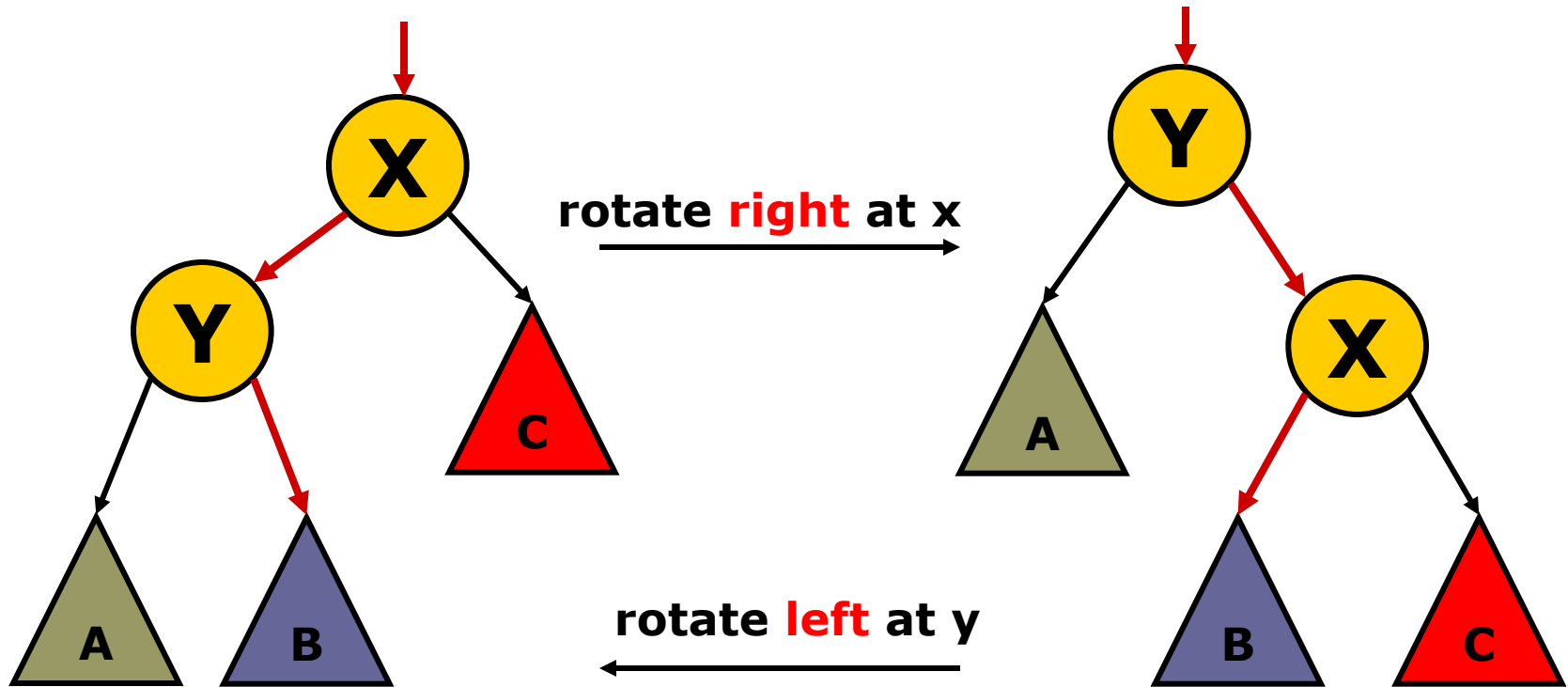
Right Rotation

- 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

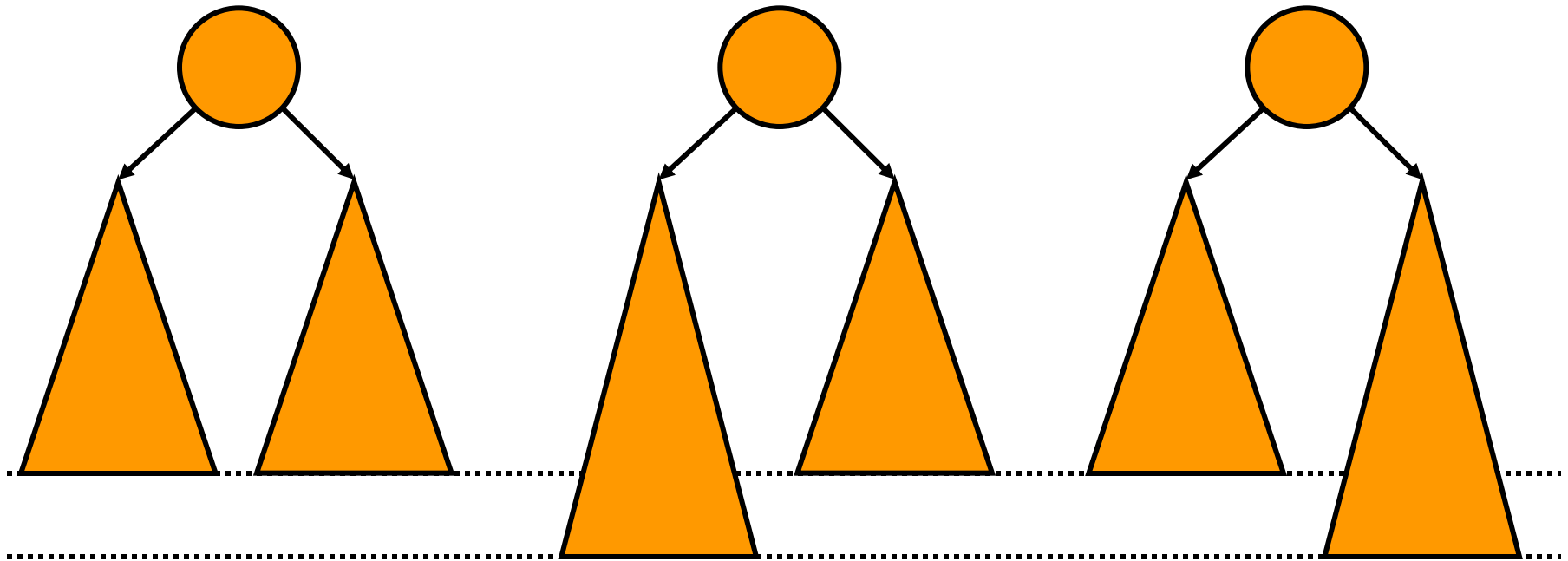
- A binary search tree
- At any node, the difference in **height** between left and right subtree is at most **one (invariant)**.

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

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

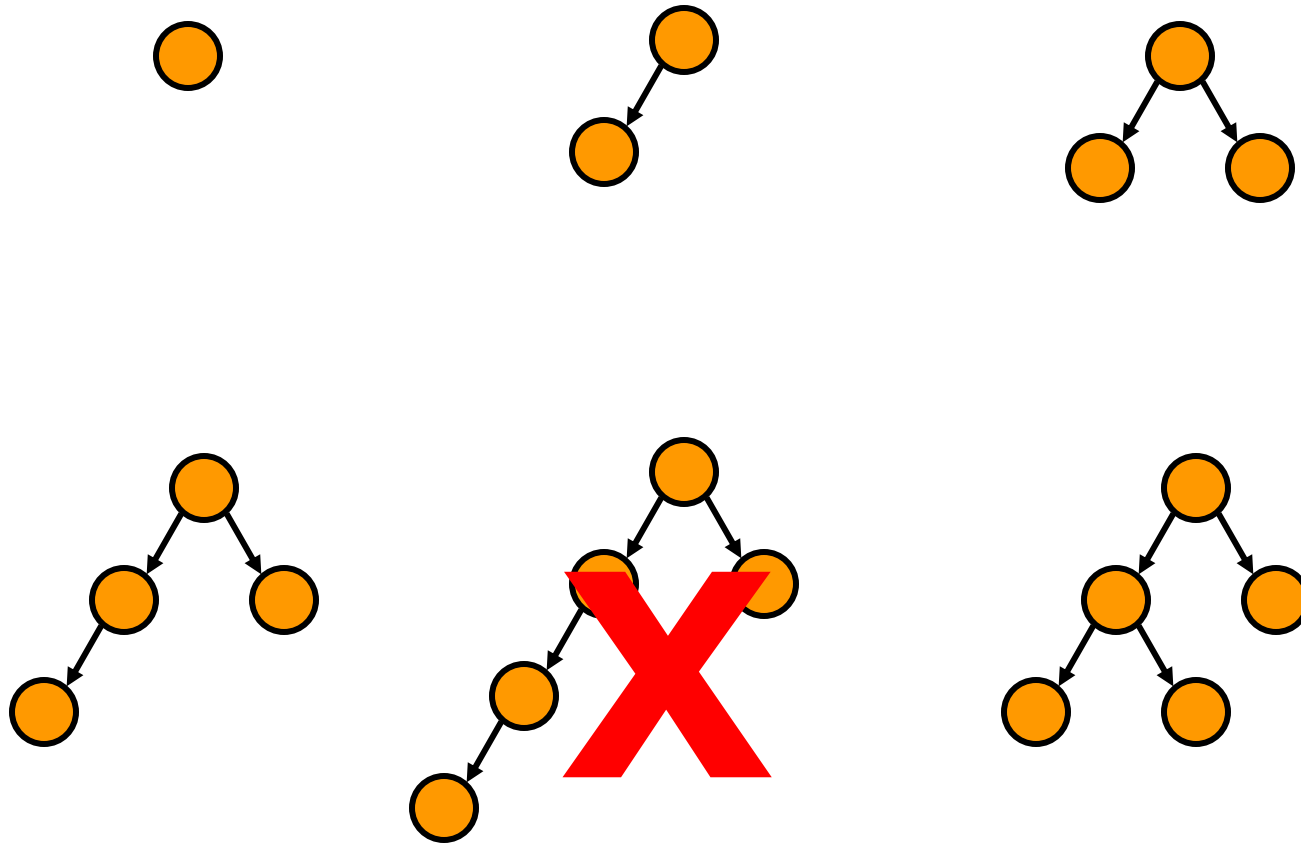
This property must hold recursively for **all subtrees**.

AVL Tree Property



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

AVL Tree Examples



Why no?

Height of an AVL Tree

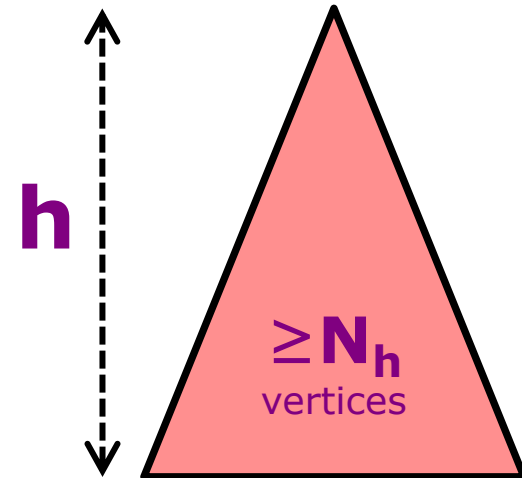
Claim:

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

Proof:

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

The actual number of
vertices $N \geq N_h$

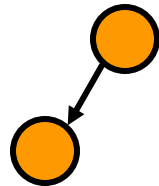


Height of an AVL Tree

- **Minimal** AVL trees of height h : AVL Trees having height h and **fewest** possible number of nodes
- Minimal AVL tree with height 0



- Minimal AVL tree with height 1



Height of an AVL Tree

Proof:

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

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

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

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

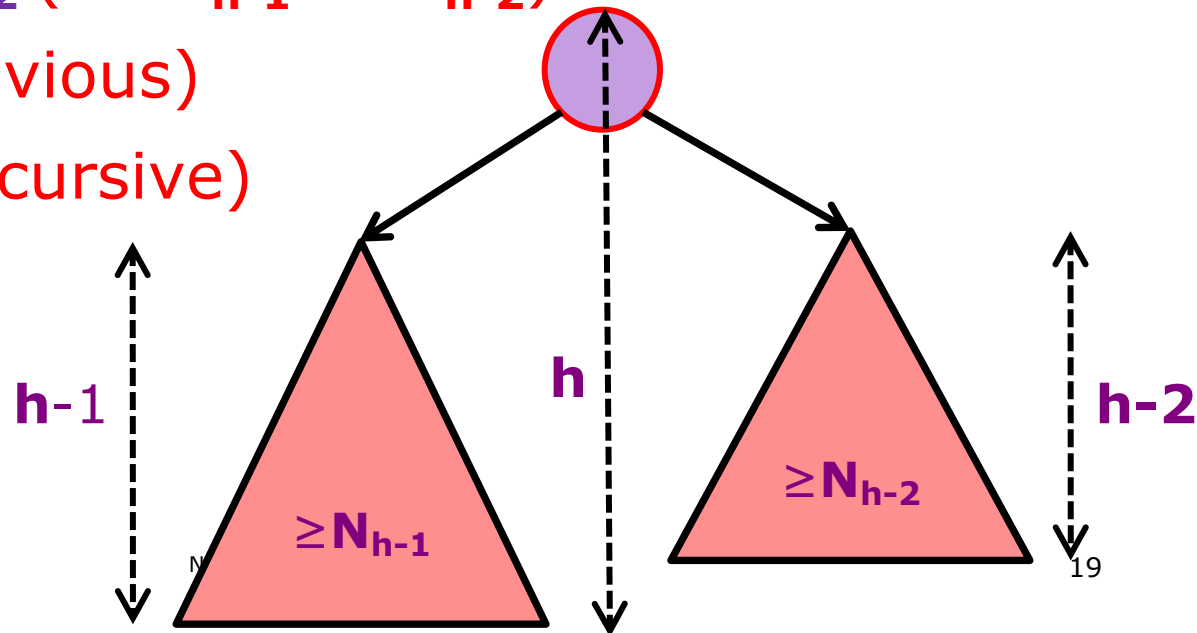
$$= 4N_{h-4} \text{ (recursive)}$$

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

$$= \dots$$

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 $N \geq N_h$

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

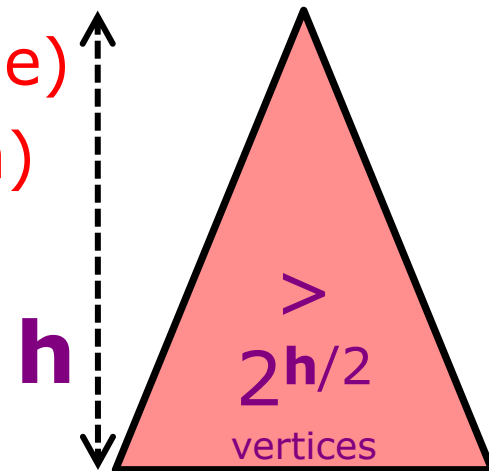
$$N > 2^{h/2}$$

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

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

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

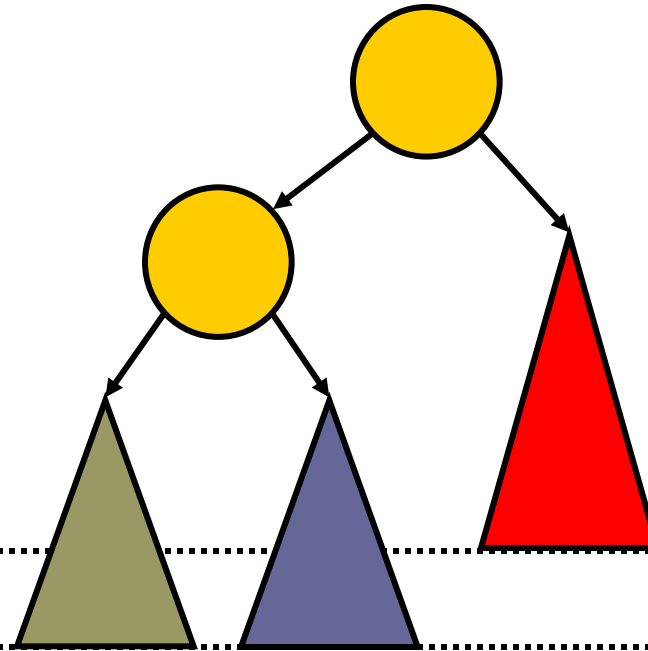
$$h = O(\log(N))$$



AVL Tree Insertion



Idea on Insertion

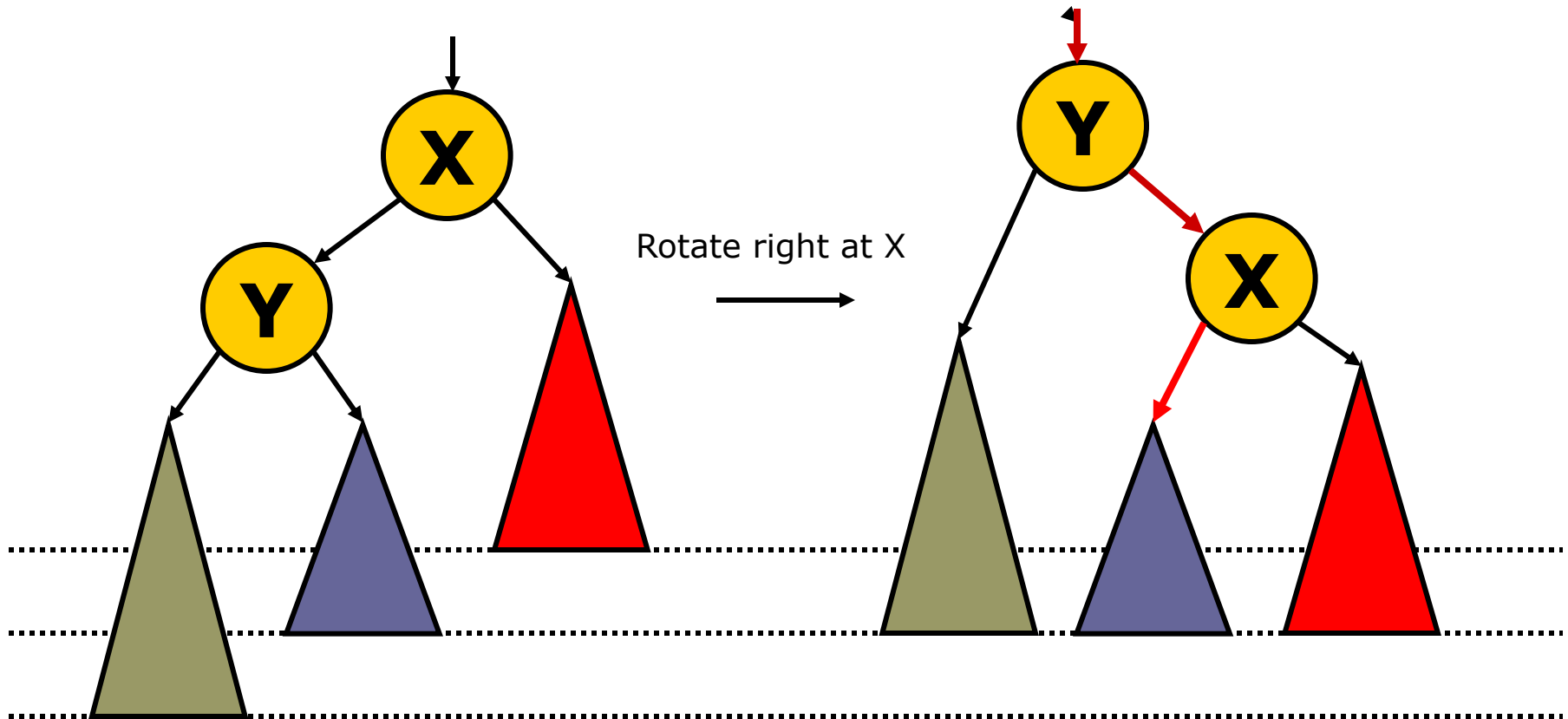


Insertion in red subtree never violates the AVL tree property. But insertion into blue and gray subtree may cause a violation.

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

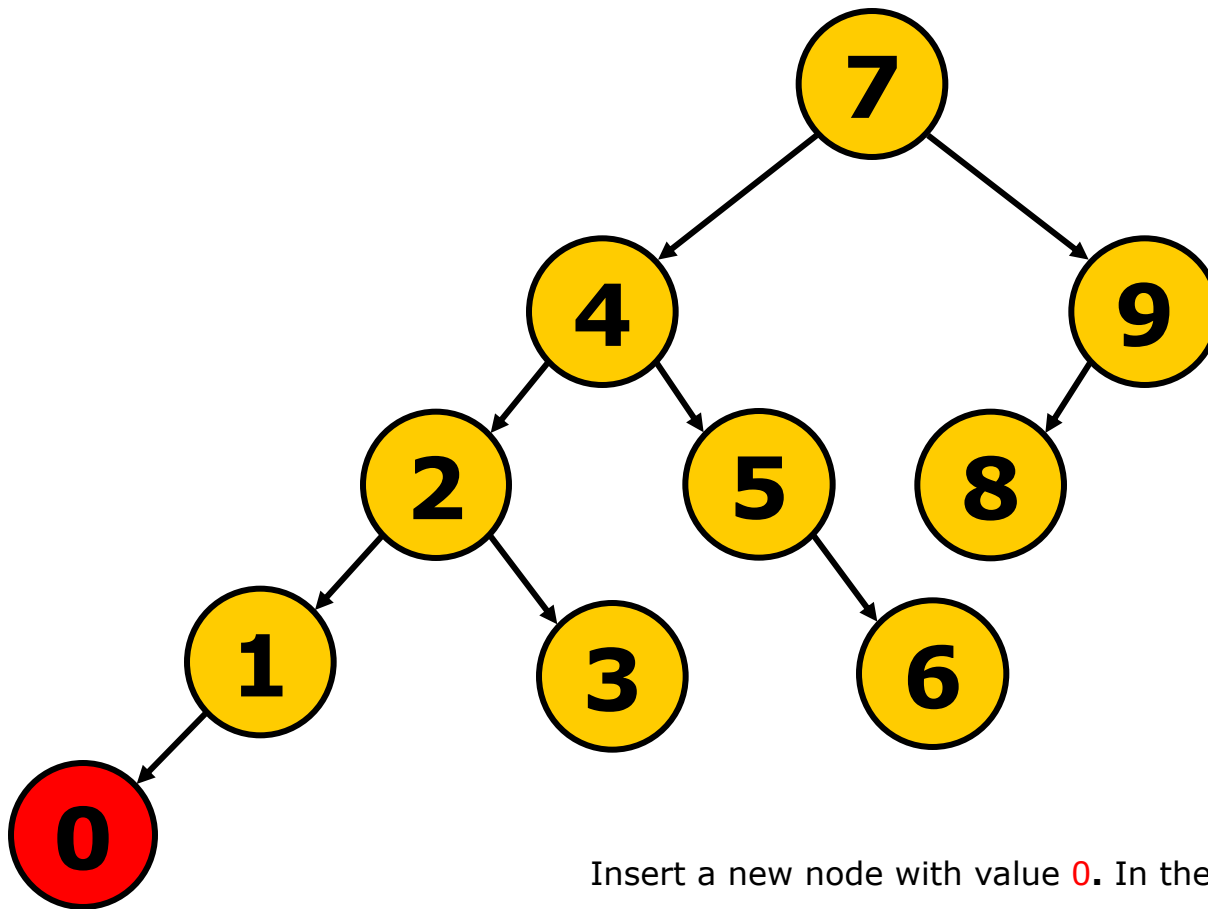


The difference between the levels of the **left subtree of Y** and the **right subtree of X** is **2**.

Need to rotate right around X

Example: Insert Outside

e.g. insert 0



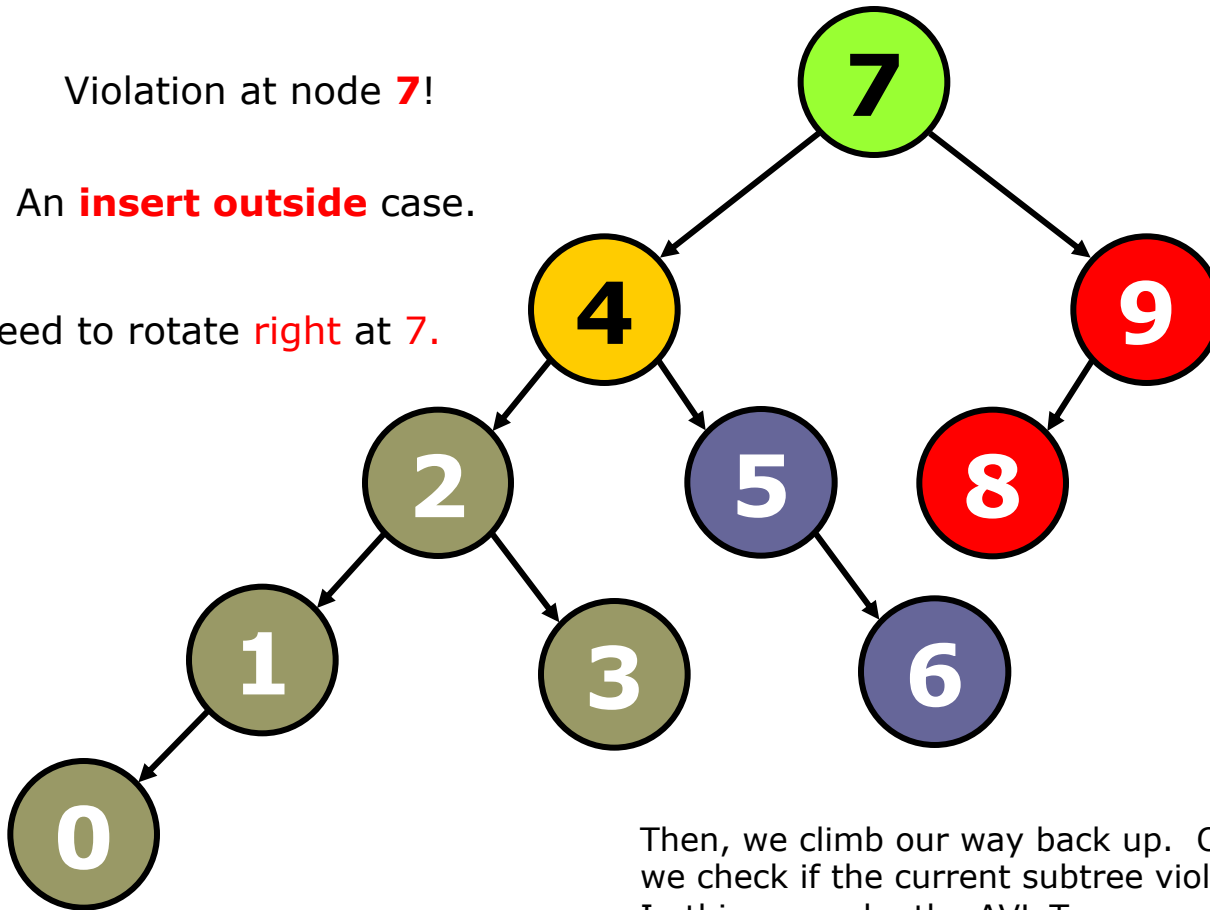
Insert a new node with value 0. In the first pass, we move down the tree just like insertion into a BST.

Example: Insert Outside (cont.)

Violation at node **7**!

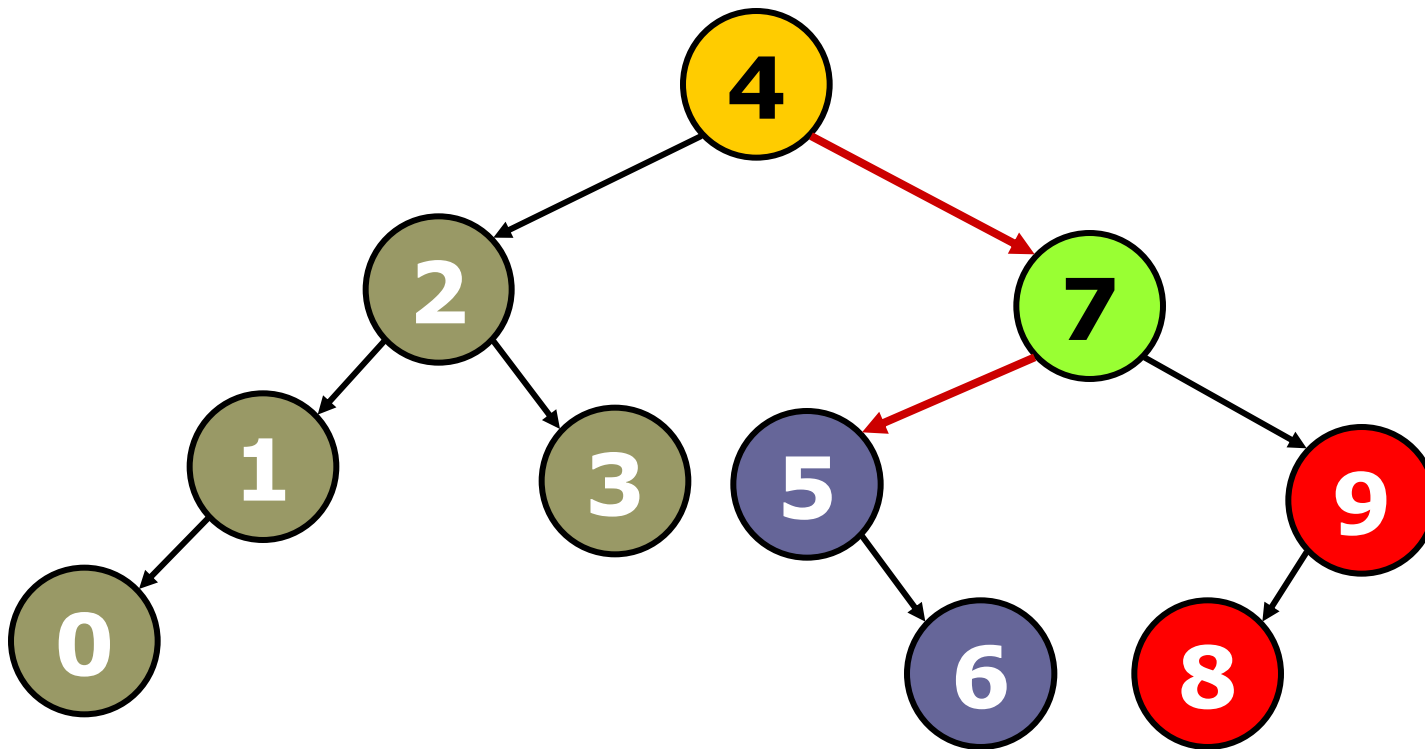
An **insert outside** case.

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.**

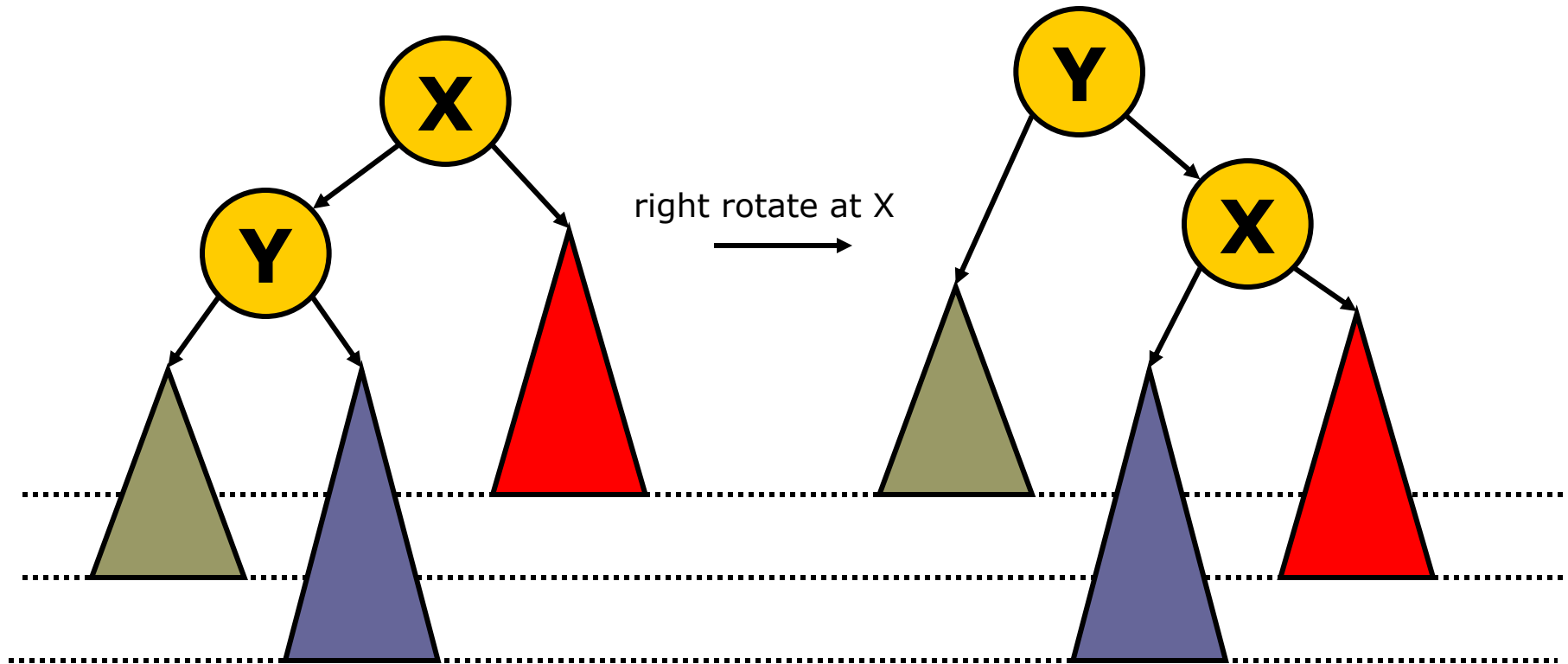
Example: Insert Outside (cont.)



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



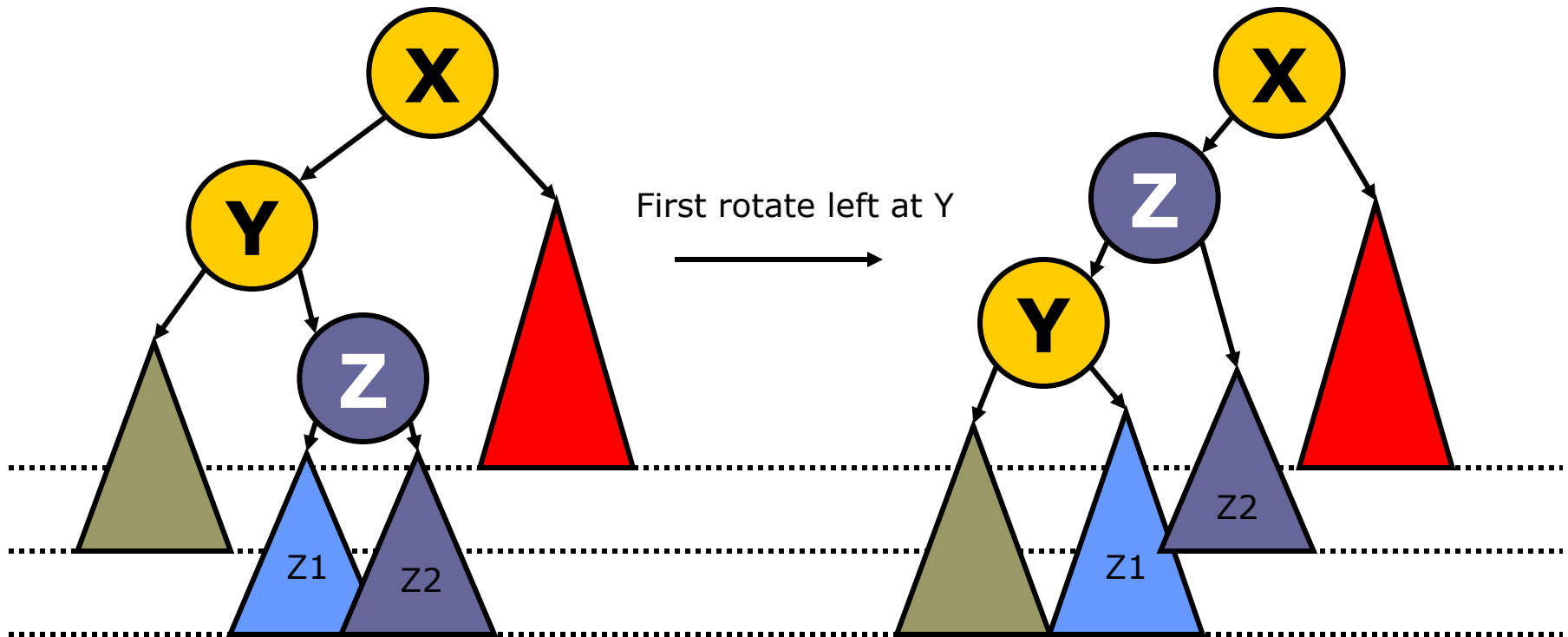
does not work!

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)

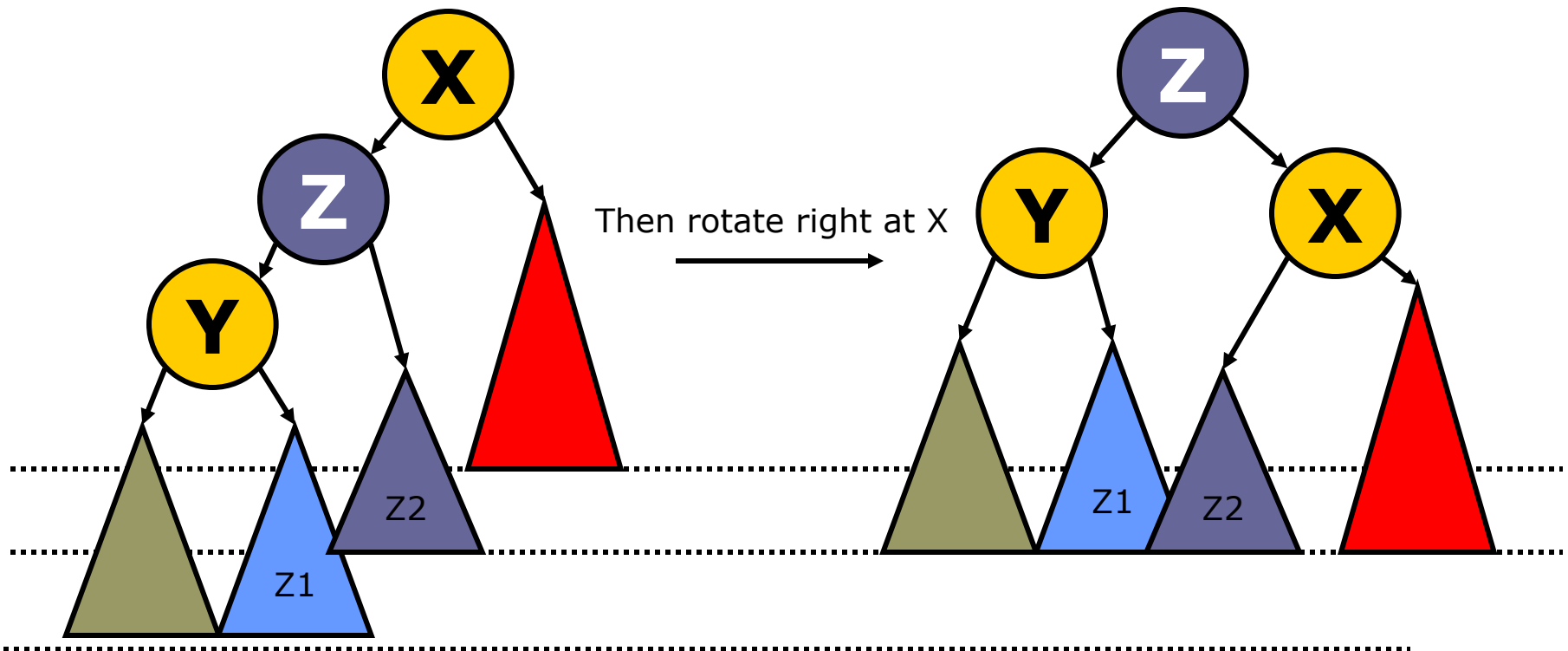


First rotate left around Y – become case 1

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

Case 2: Become Case 1

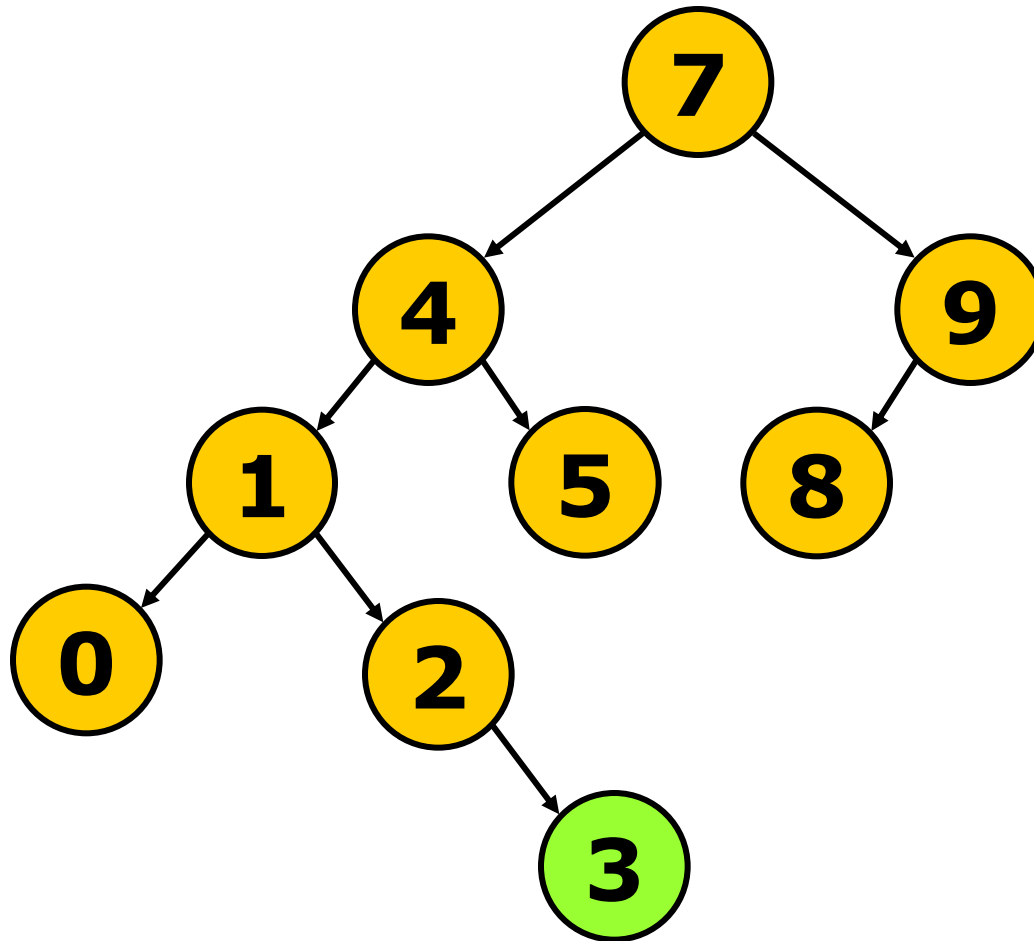
This is case 1.



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

Example: Insert Inside

e.g., insert 3

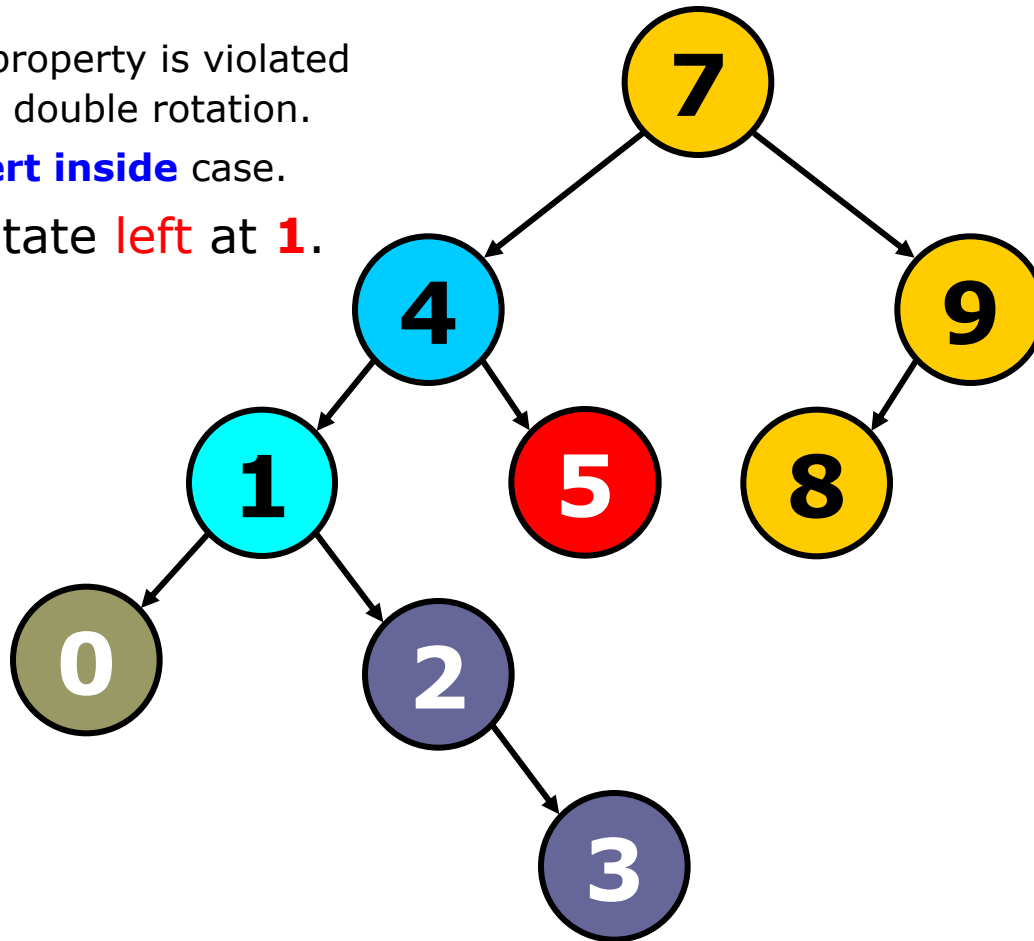


Example: Insert Inside (cont.)

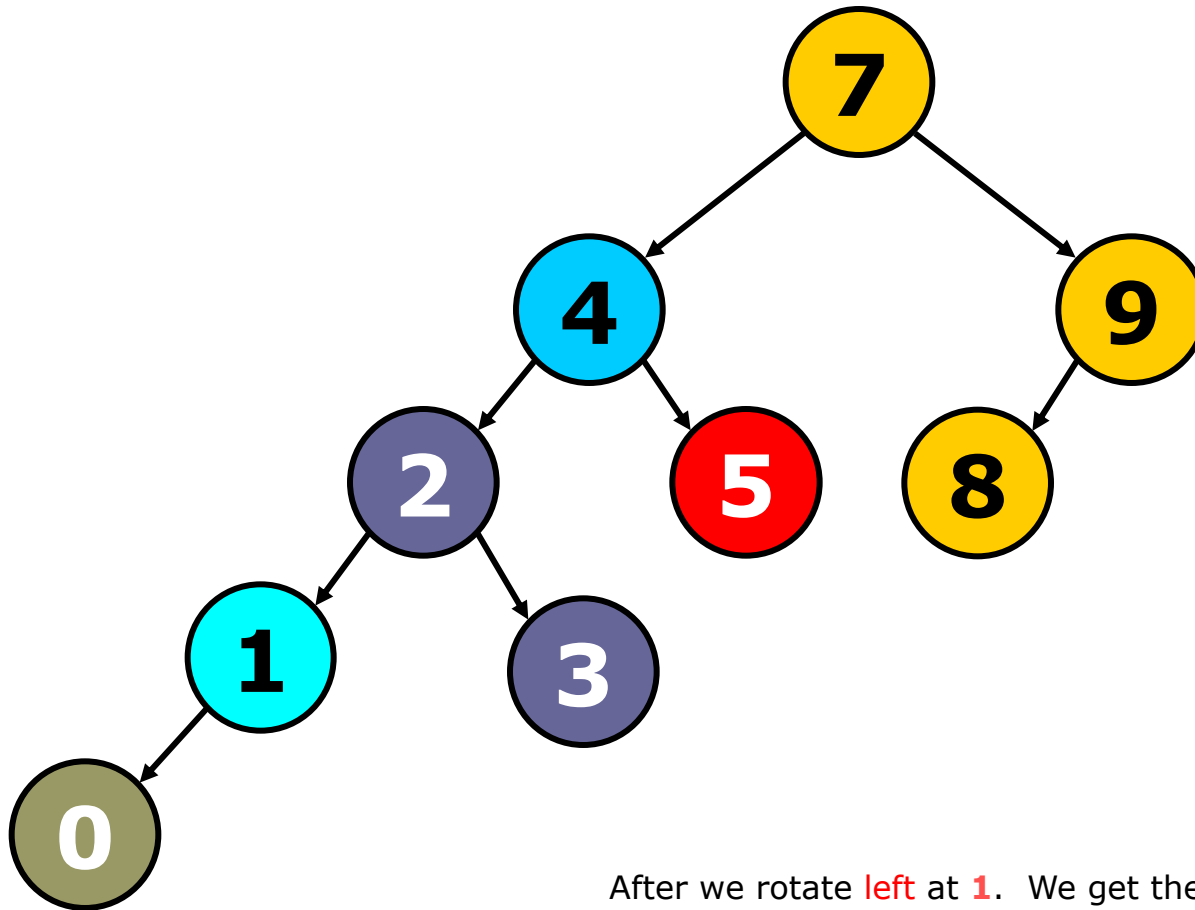
The AVL Tree property is violated at **4**. We do a double rotation.

This is an **insert inside** case.

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

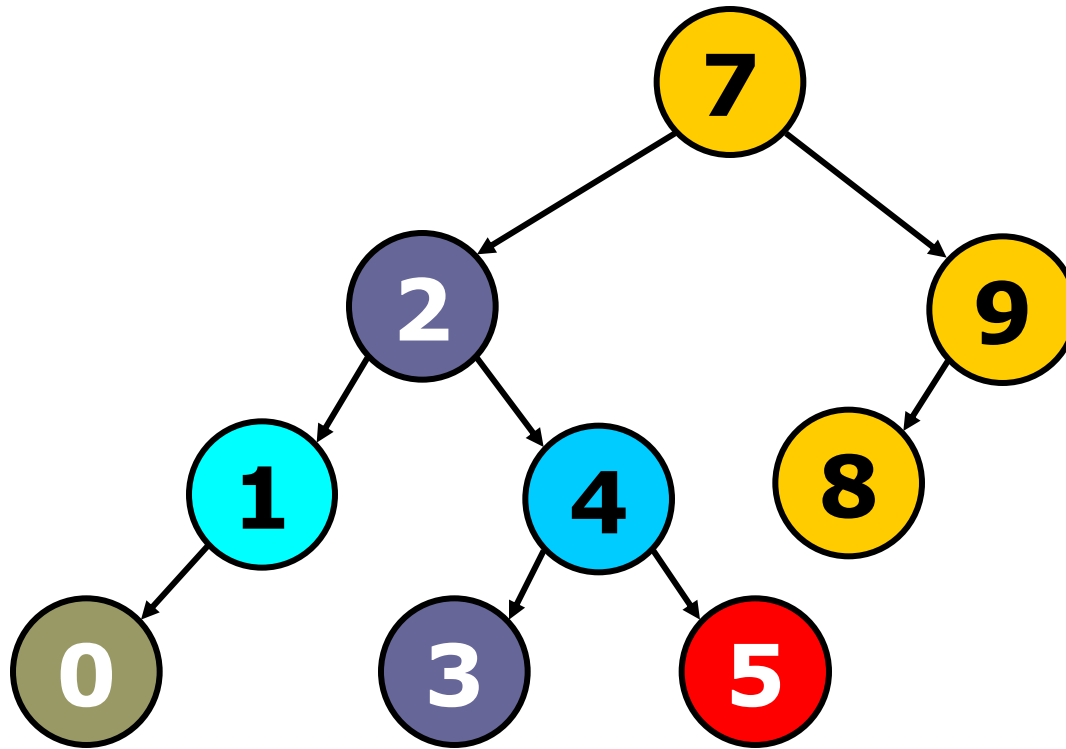


Example: Insert Inside (cont.)



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)

- 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)

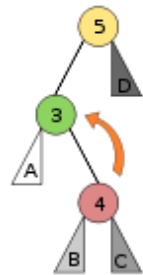
- Insert inside (on left):
→ double rotation
Left-Right (LR) rotation

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

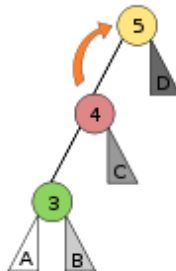
- Result:

Source: Wikipedia

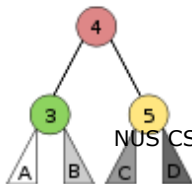
Left Right Case



Left Left Case



Balanced



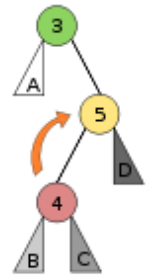
NUS CS1102

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

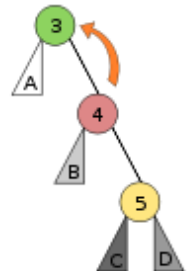
- Insert outside (on right):
→ single rotation
Left (L) rotation

- Result:

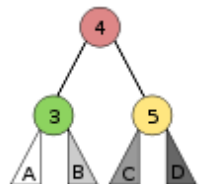
Right Left Case



Right Right Case



Balanced



Order Statistics



Dynamic Set ADT

- **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

Example: A list of numbers:

8 6 5 4 9 0 7 3

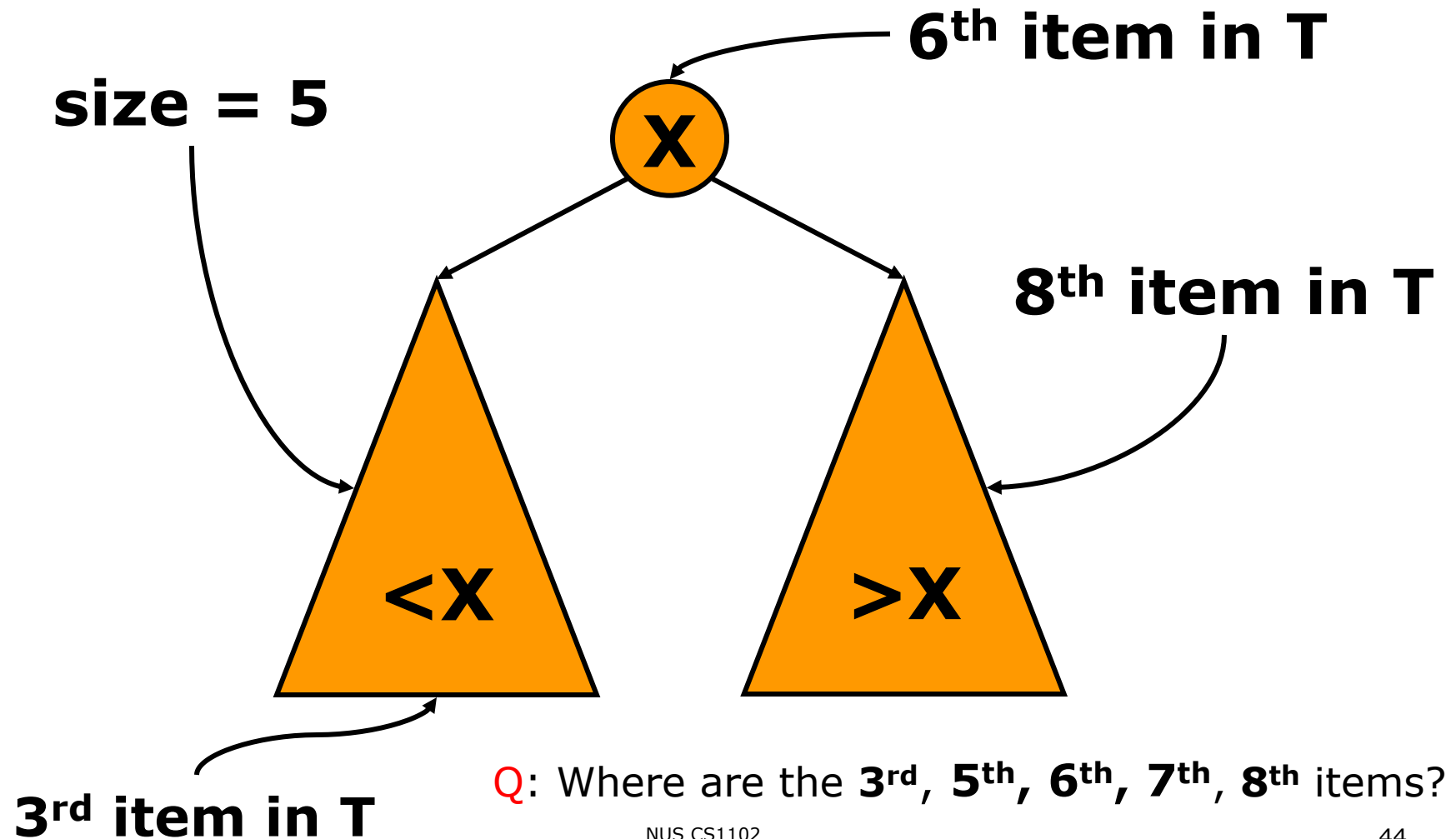
$\text{findKth}(1) = 0$

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

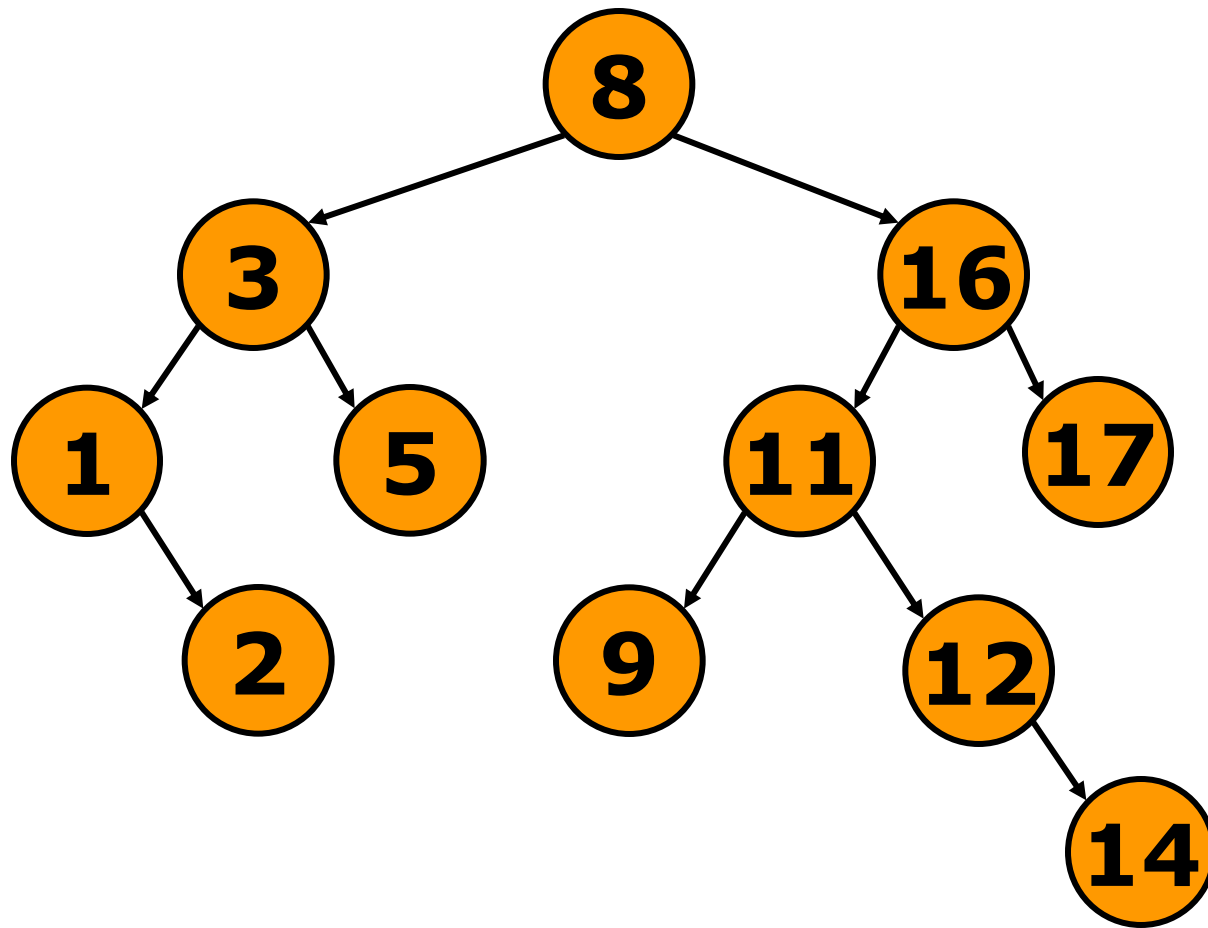
$\text{findKth}(5) = 6$

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

- by BST Property

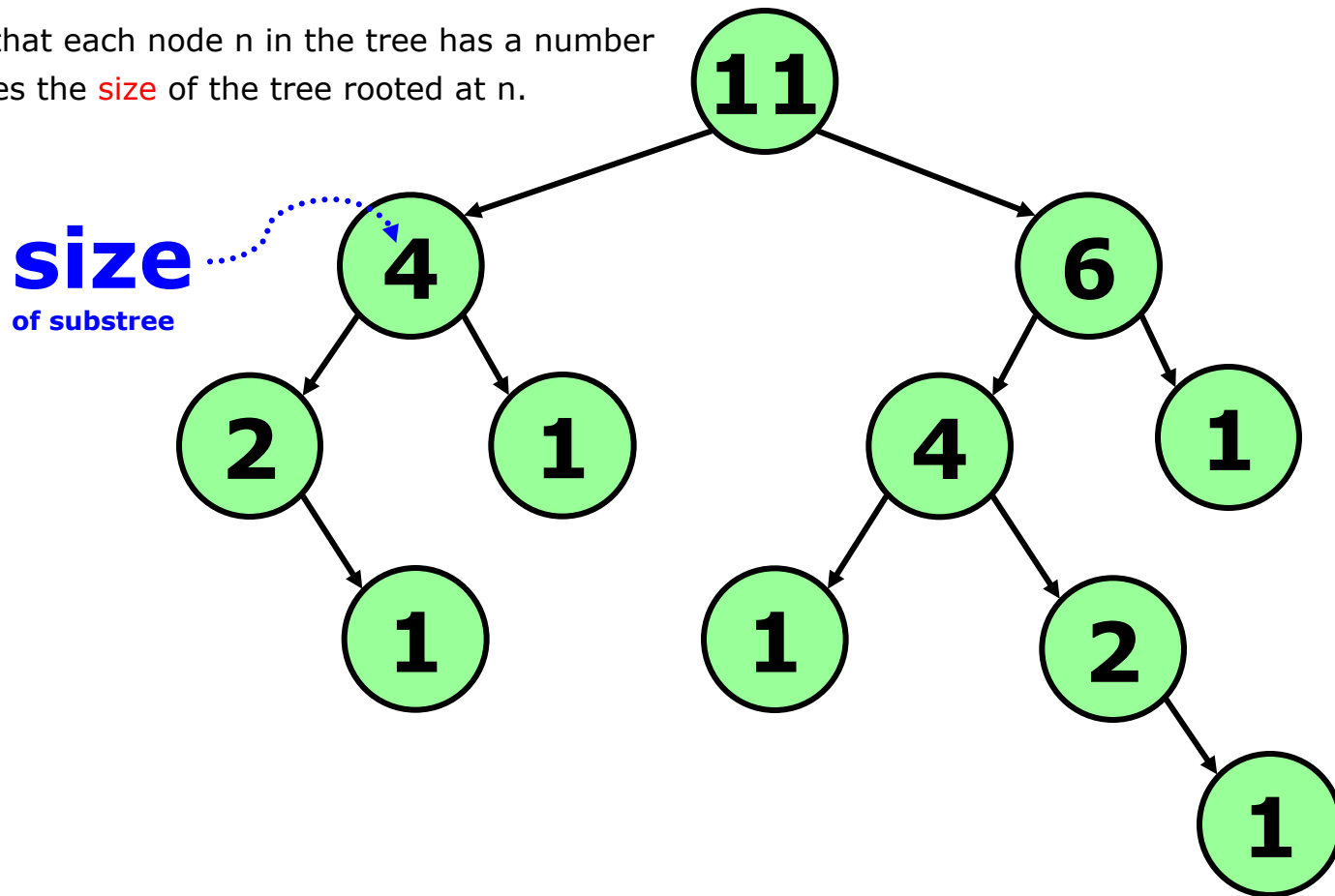


findKth(T,K) on BST



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 .



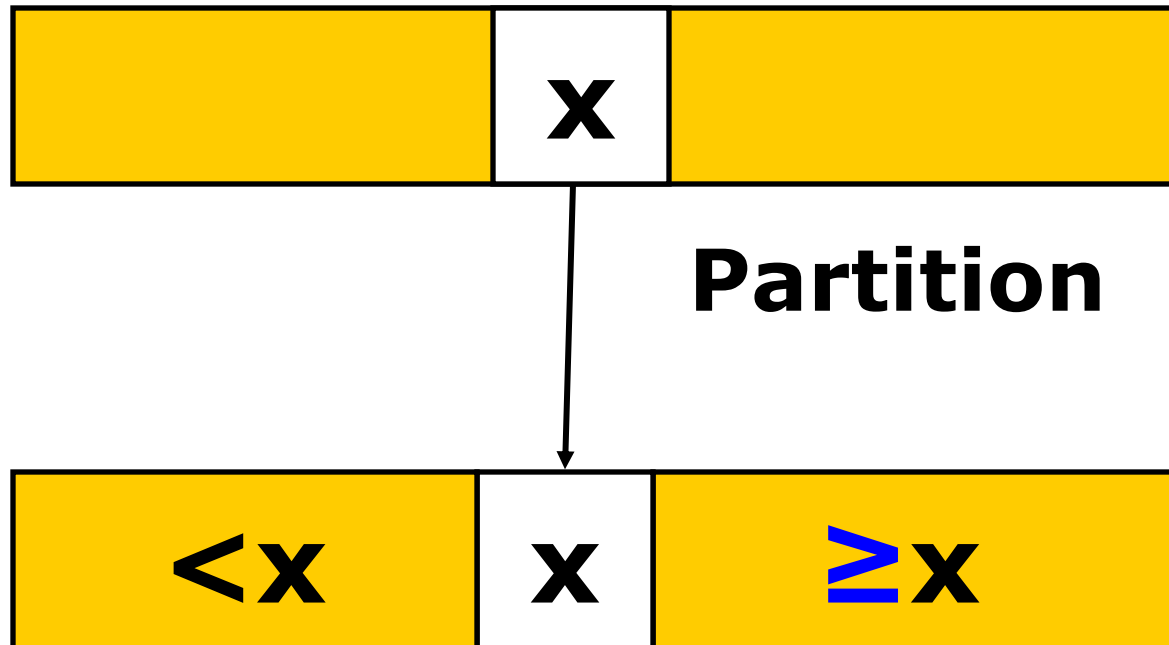
findKth (T,K) algorithm

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

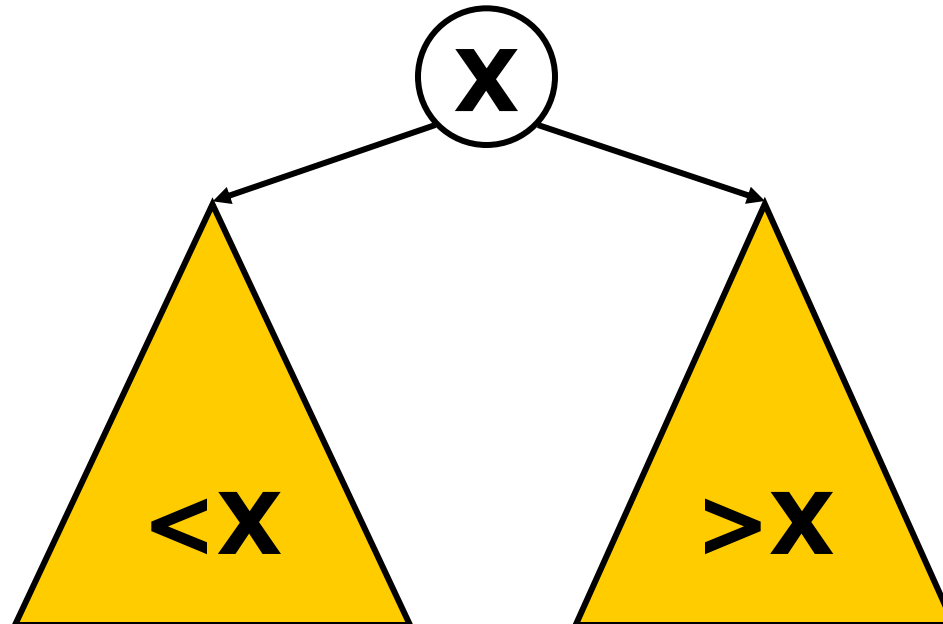
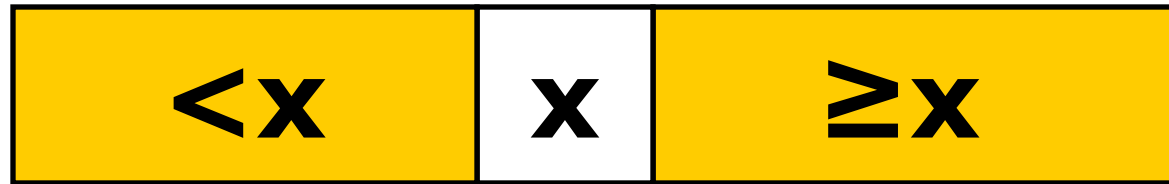
```
if T is empty
    return null
let sizeL be the size of T.left
if K == sizeL + 1
    return T.item
else if K ≤ sizeL
    return findKth(T.left, K)
else
    return findKth(T.right, K - sizeL - 1)
```

findKth() on an **unsorted** array

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

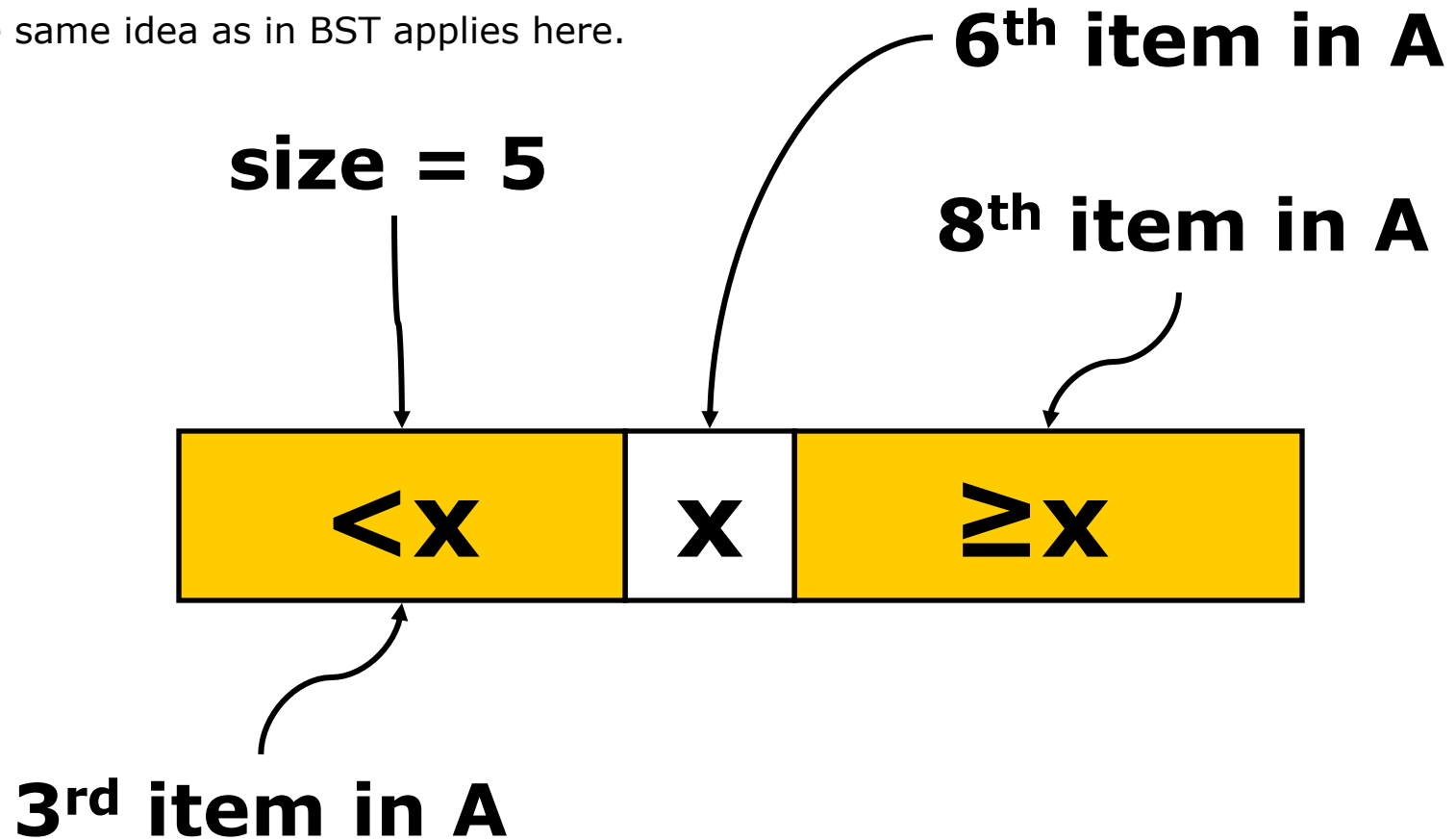


findKth() on an array (cont.)



findKth() on an array (cont.)

The same idea as in BST applies here.



findKth (A, i, j, K)

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()

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