## **Data Structure**

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**Office Hours:** 



## Non Linear Data Structure

- Data structure we will consider this semister:
  - Tree
  - Binary Search Tree
  - Graph
  - Weighted Graph
  - Sorting



Balanced Search Tree



## Balanced Search Trees 균형 탐색 트리



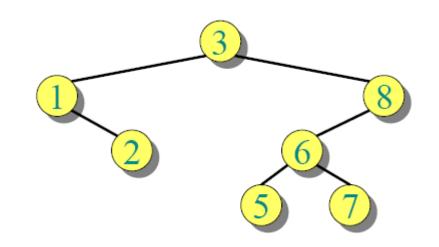
## **Balanced Search Trees**

◆ Binary Search Tree(이진탐색트리)



## Balanced Search Trees(균형탐색트리)

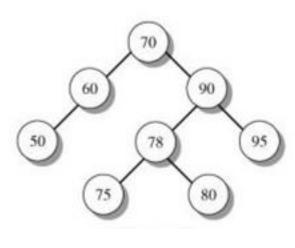
- ◆ Balanced search tree: A search-tree data structure for which a height of O(lgn) is guaranteed when implementing a dynamic set of n items. (탐색시 탐색시간 O(lgn) 을 보장)
- Examples:
  - AVL Tree
  - 2-3-4 Tree
  - B Tree
  - Red-black Tree





## 1. What is a Balanced Binary Search Tree?

◆ A balanced search tree is one where all the branches from the root have almost the same height.(균형탐색트리는 어느 단말에서도 루트까지 높이가 거의같은 트리)



balanced



unbalanced

- ◆ As a tree becomes more unbalanced, search running time decreases from O(log n) to O(n)(불균형이진탐색트리는 탐색시간이 O(n))
  - because the tree shape turns into a list

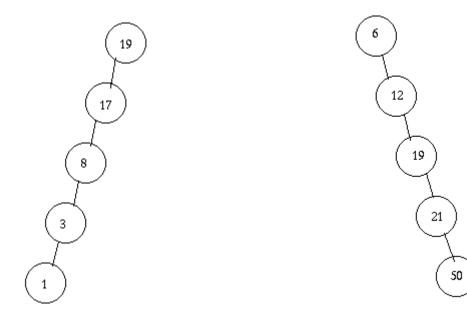
 We want to keep the binary search tree balanced as nodes are added/removed, so searching/insertion remain fast.



## **Unbalanced Search Trees**

(불균형탐색트리)

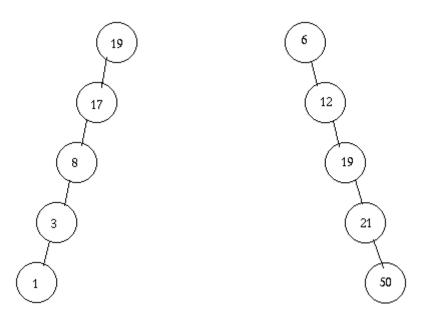
Skewd bst(경사이진트리)





#### 이진 탐색트리

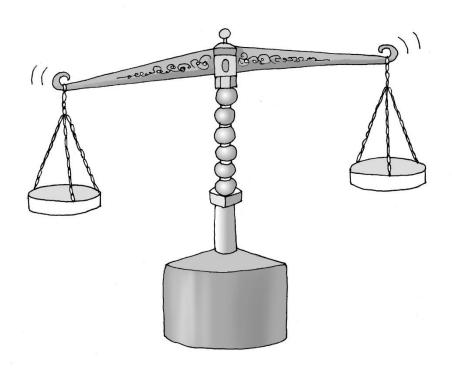
- □ 이진 탐색 트리의 문제점
  - O 이진 탐색 트리에는 새로운 노드들이 무작위로 삽입/삭제가 됨
  - 이때, 다음 그림과 같이 탐색 트리가 한 방향으로 기울어질 수 있음
  - 이진 탐색 트리가 한 방향으로 기울어지면 비교횟수가 평균 n/2회로 증가하여 선형 탐색의 경우처럼 됨
  - → 이러한 문제를 해결하기 위해 <u>균형 탐색트리(balanced search tree)</u>가 사용





## **Balanced Search Trees**

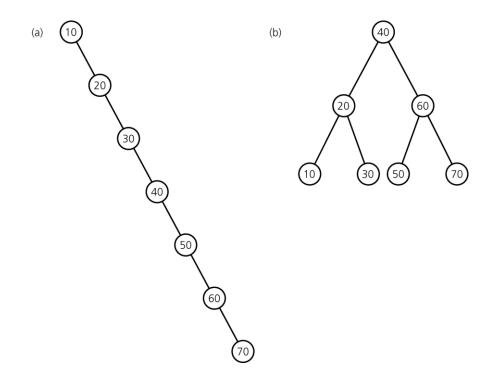
◆ Balanced(균형잡힌)





#### Why care about advanced implementations?

Same entries, different insertion sequence (같은데이터, 다른 입력순서)



- (a) Skewd bst 불균형 (b) complete bst
- → Not good! Would like to keep tree balanced.



## 순서

- 1 AVL 트리
- 2 스플레이 트리
- 3 2-3 트리
- 4 2-3-4 트리
- 5 레드-블랙 트리



# AVL Trees (AVL 트리)



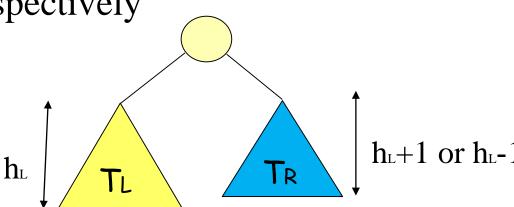
## **AVL Trees**

- First-invented self-balancing binary search tree (최초의 균형탐색트리 시도)
- Named after its two inventors,
  - 1. G.M. Adelson-Velsky and
  - 2. E.M. Landis,
  - published it in their 1962 paper "An algorithm for the organization of information."



## **AVL Trees: Formal Definition**

- 1. All empty trees are AVL-trees
- 2. If T is a non-empty binary search tree with  $T_L$  and  $T_R$  as its left and right sub-trees, then T is an AVL tree iff
  - 1. T<sub>L</sub> and T<sub>R</sub> are AVL trees
  - 2.  $|h_L h_R| \le 1$ , where  $h_L$  and  $h_R$  are the heights of  $T_L$  and  $T_R$  respectively

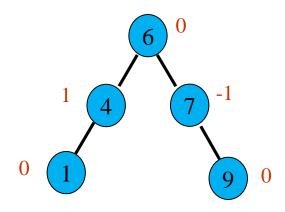




## **AVL Trees**

- AVL trees are height-balanced binary search trees
- ◆ Balance factor(균형인수) of a node = height(left subtree) height(right subtree)
- ◆ An AVL tree can only have balance factors of −1, 0, or 1 at every node
- For every node, heights of left and right subtree differ by no more than 1

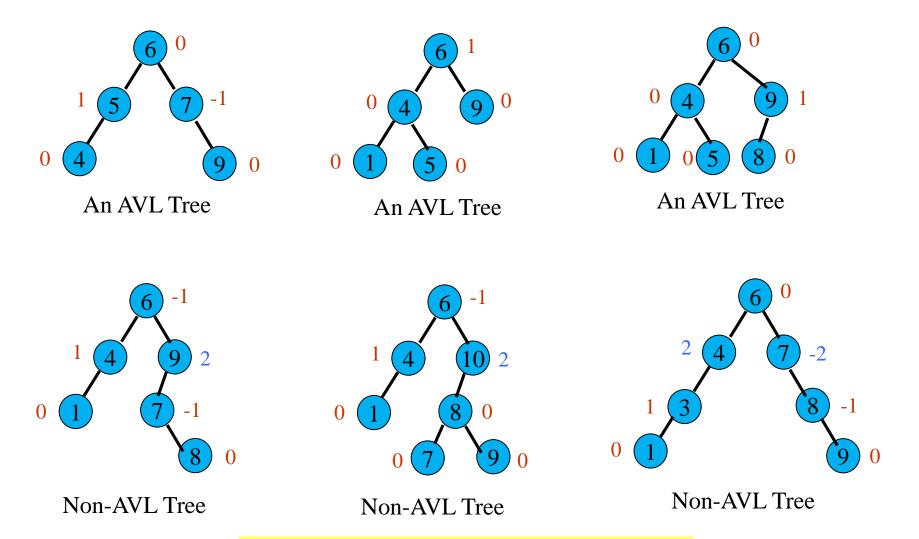
An AVL Tree



Red numbers are Balance Factors



#### AVL Trees: Examples and Non-Examples



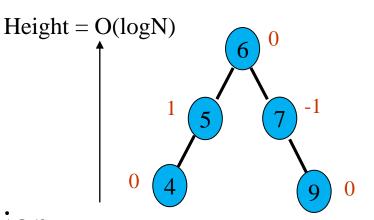
Red numbers are Balance Factors



### Good News about AVL Trees

- ◆ Can prove: Height of an AVL tree of N nodes is always O(log N) (높이는 항상)
- How? Can show:
  - Height  $h = 1.44 \log(N)$
  - Prove using recurrence relation for minimum number of nodes
     S(h) in an AVL tree of height h:
    - S(h) = S(h-1) + S(h-2) + 1
  - Use Fibonacci numbers to get bound on S(h) bound on height h

An AVL Tree

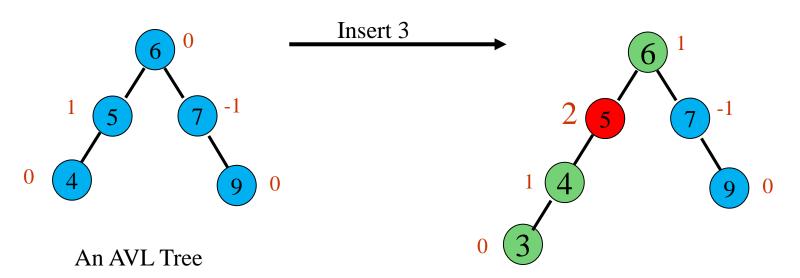


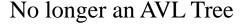
Red numbers are Balance Factors



#### Good and Bad News about AVL Trees

- Good News:
  - Search takes O(h) = O(log N)
- Bad News
  - Insert and Delete may cause the tree to be unbalanced!

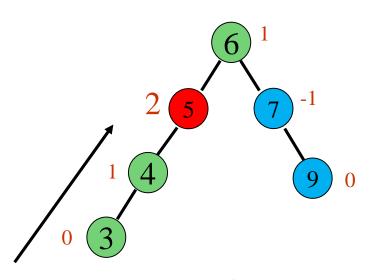






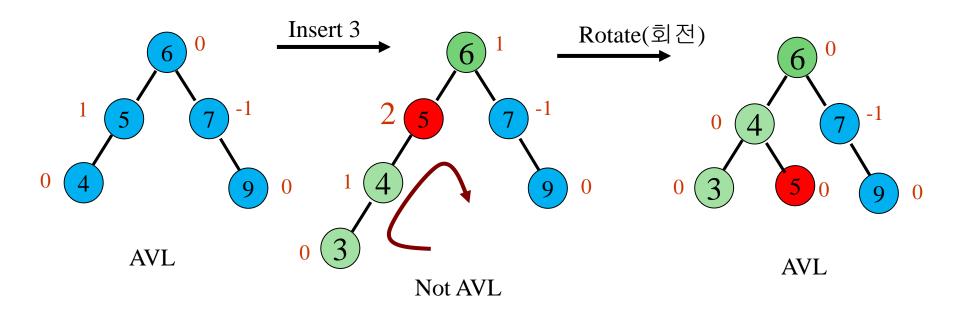
#### Restoring Balance in an AVL Tree

- ◆ Problem: Insert may cause balance factor to become 2 or −2 for some node on the path from root to insertion point(AVL트리에 원소삽입하면 AVL트리가 아니게 될 수 있음)
- Idea: After Inserting the new node
  - 1. Back up towards root updating balance factors along the access path
  - 2. If Balance Factor of a node = 2 or –2, adjust the tree by rotation around deepest such node.





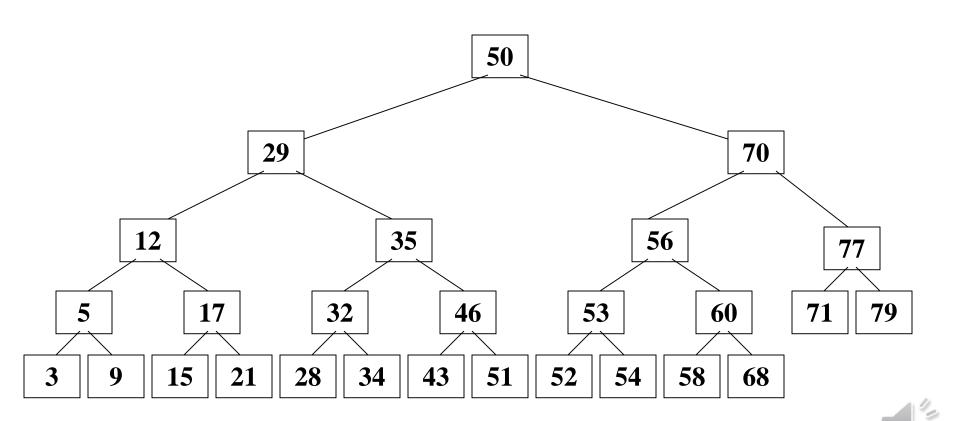
#### Restoring Balance: Example



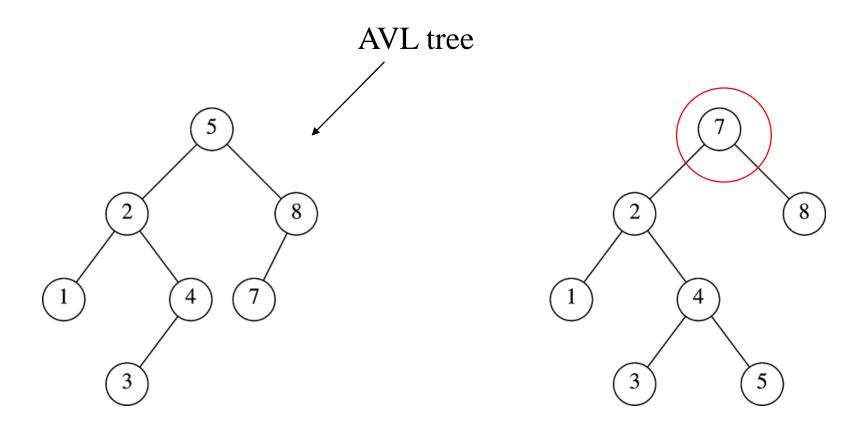
- After Inserting the new node
  - 1. Back up towards root updating heights along the access path
  - 2. If Balance Factor of a node = 2 or -2, adjust the tree by rotation around deepest such node.



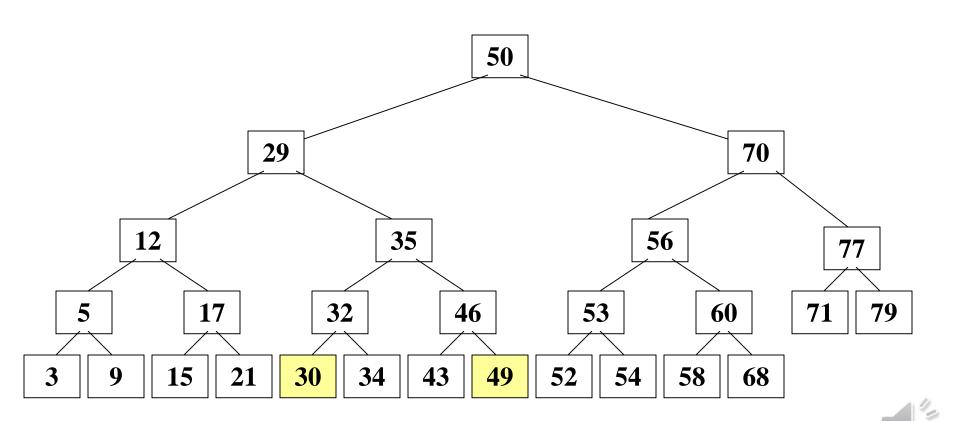
◆ Is this an AVL Tree?(yes!)



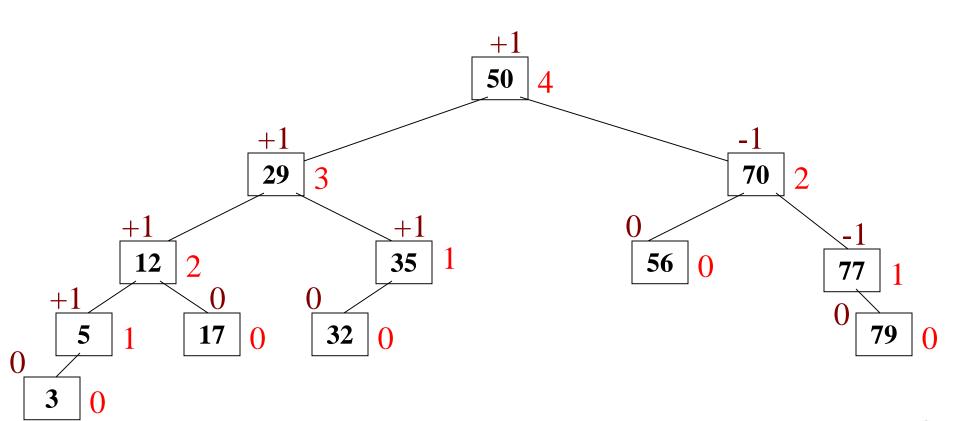
## Which is an AVL Tree?





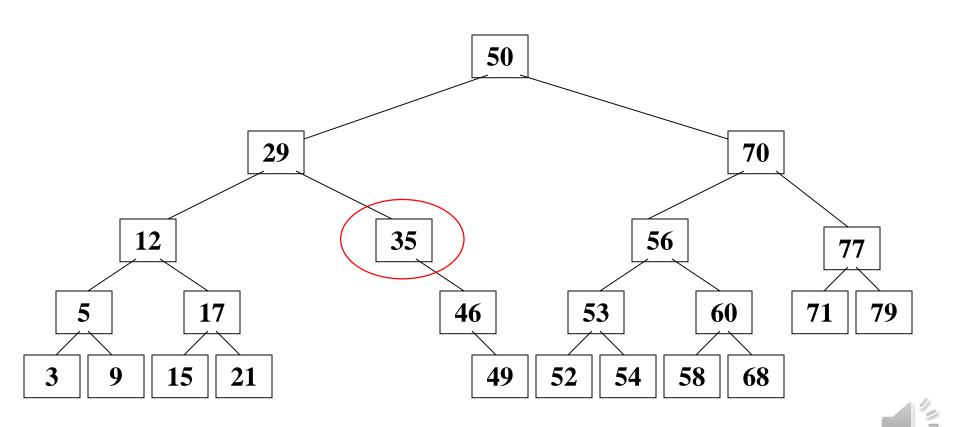


Is this an AVL Tree?(yes!)

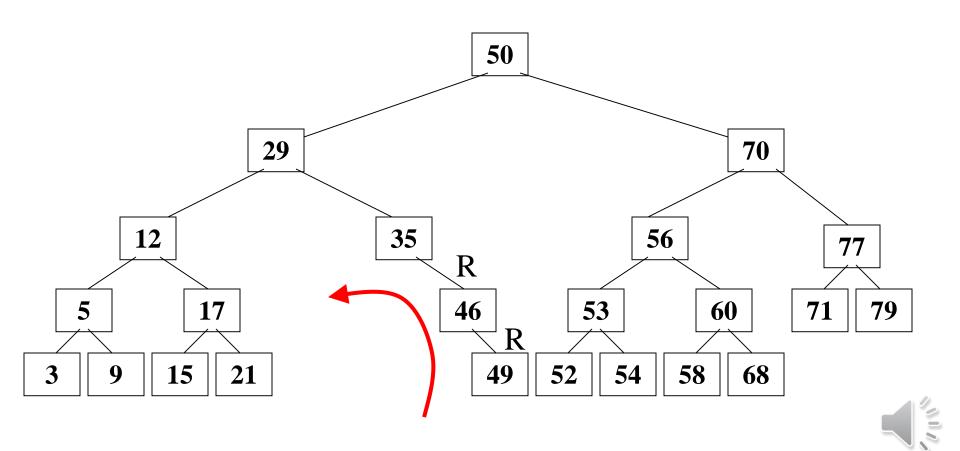




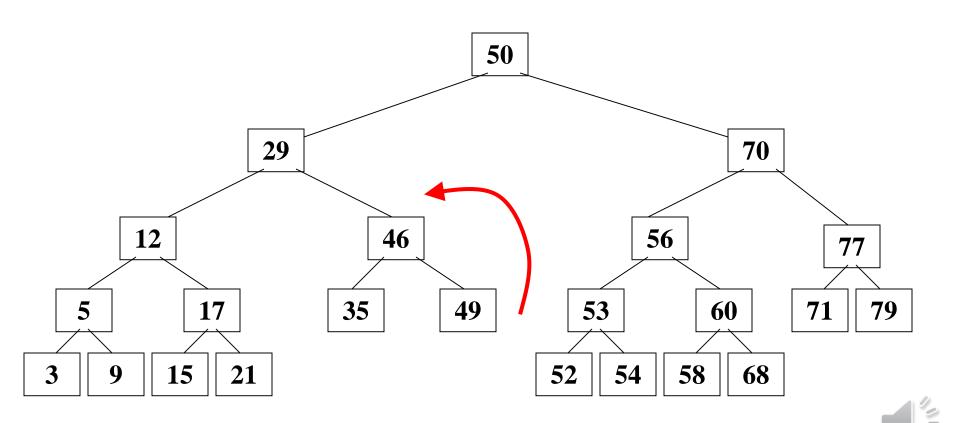
◆ Is this an AVL Tree?(No!)



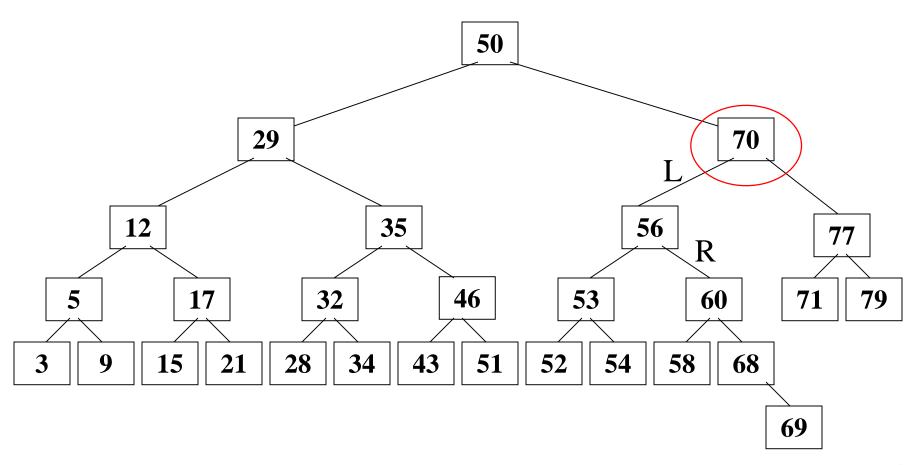
• No



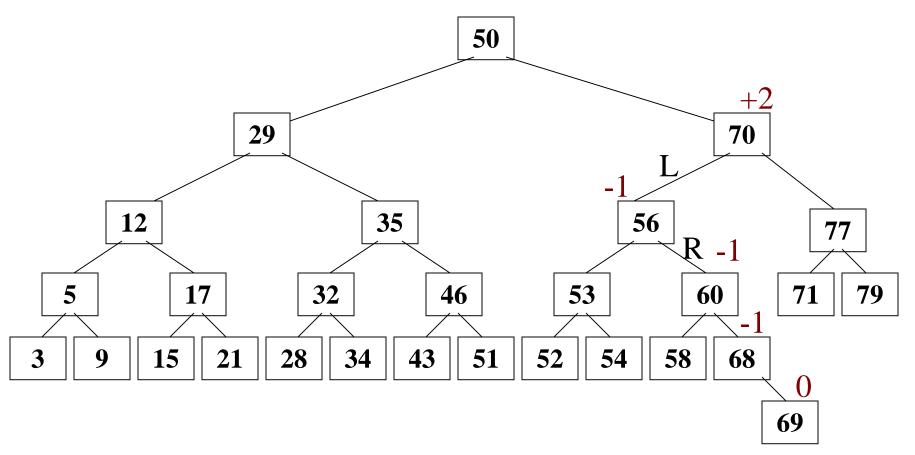
• Did this fix the problem?



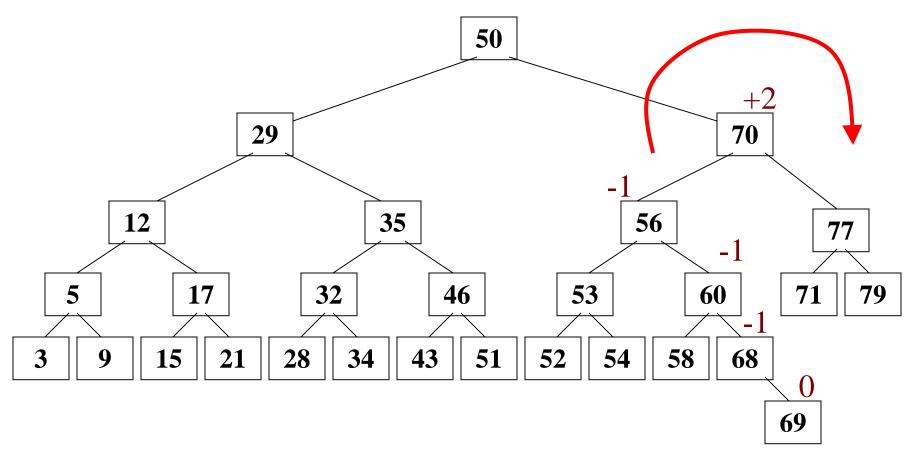
◆ Is this an AVL Tree?(No!)



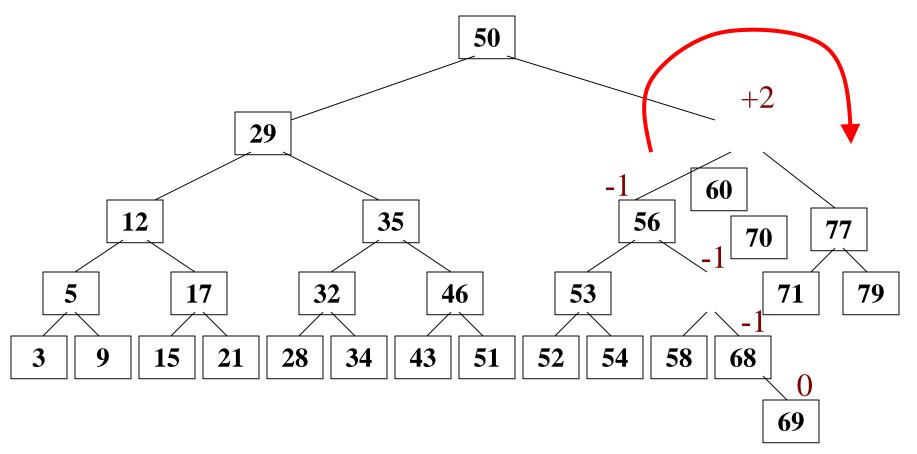




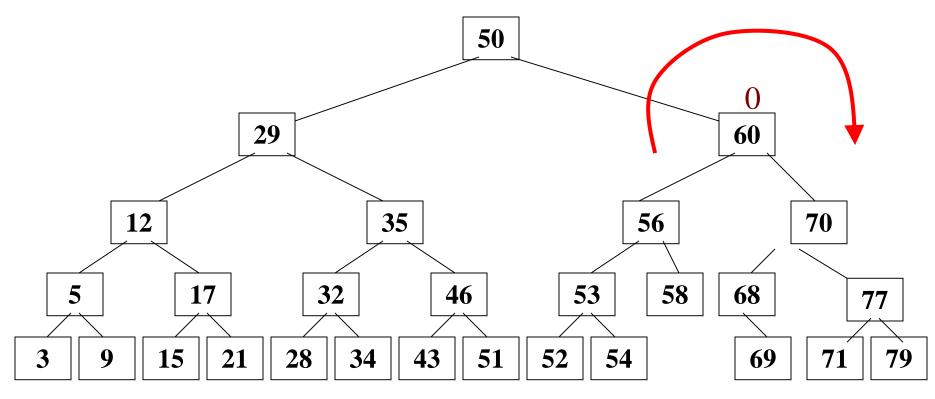














## Correcting Imbalance(불균형 해소)

- 1. After every insertion
- 2. Check to see if an imbalance was created.
  - All you have to do backtrack(단말에서루트로 이동함) up the tree
- 3. If you find an imbalance, correct it.
- 4. As long as the original tree is an AVL tree, there are only 4 types of imbalances that can occur.



#### Insertions in AVL Trees

Let the node that needs rebalancing be  $\alpha$ .

#### There are 4 cases:

Outside Cases (require single rotation):

- 1. Insertion into left subtree of left child of  $\alpha$ . (LL)
- 2. Insertion into right subtree of right child of  $\alpha$ .(RR)

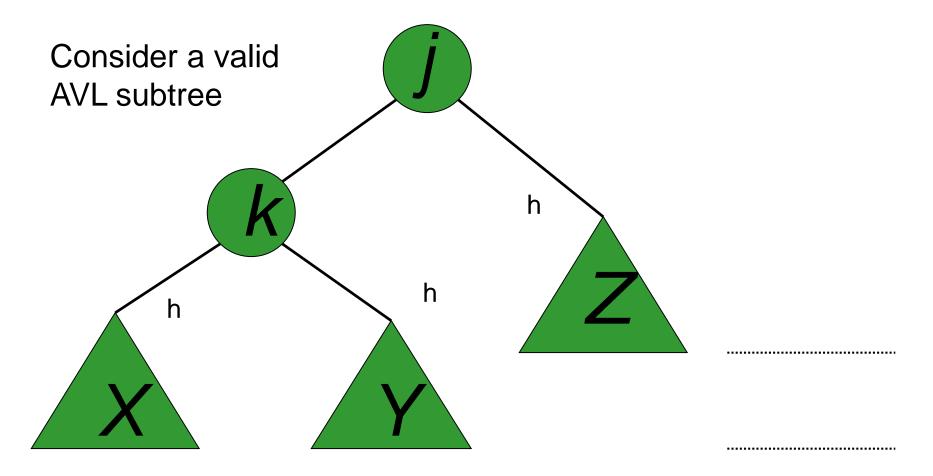
Inside Cases (require double rotation):

- 3. Insertion into right subtree of left child of  $\alpha$ .(RL)
- 4. Insertion into left subtree of right child of  $\alpha$ .(LR)

The rebalancing is performed through four separate rotation algorithms.

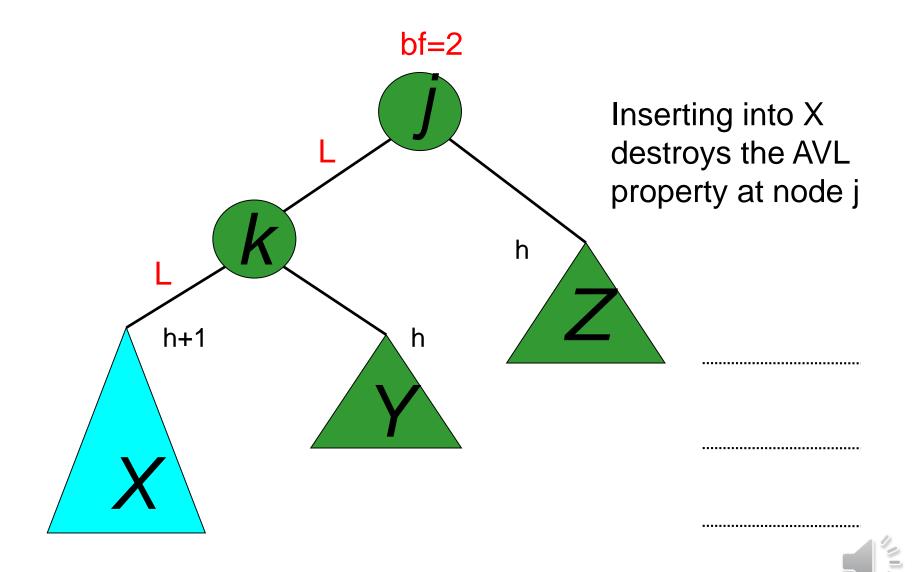


## **AVL Insertion: Left-Left**

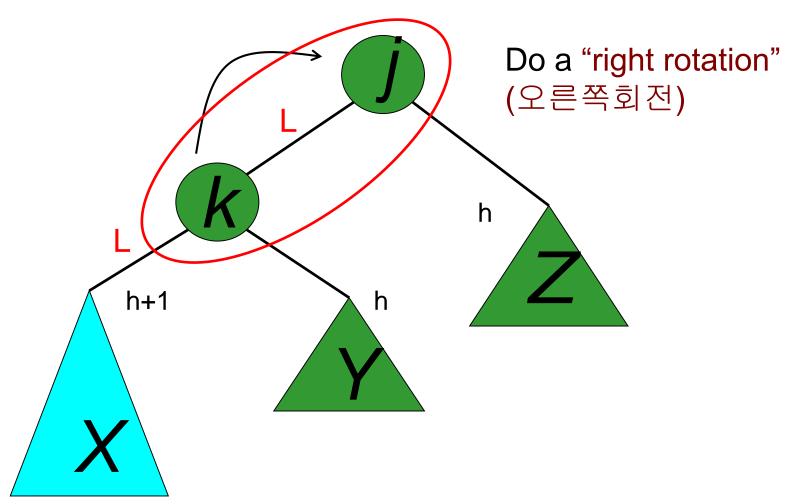




### **AVL Insertion: Outside Case**

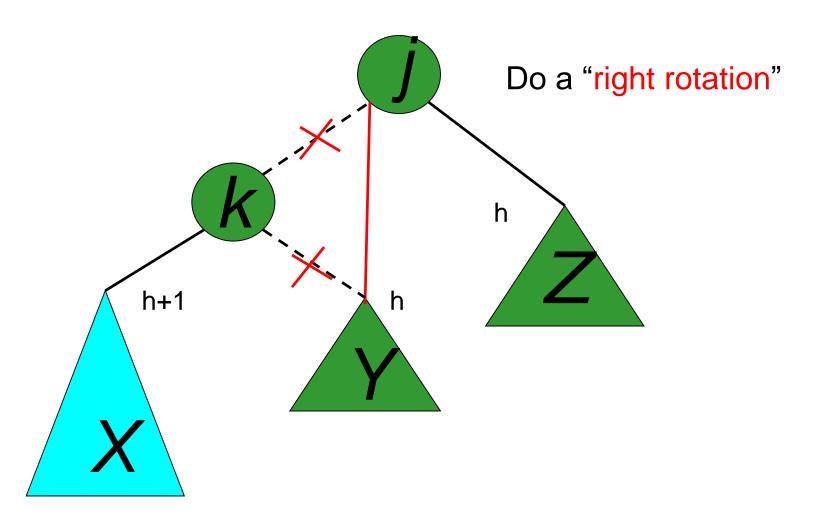


## **AVL Insertion: Outside Case**



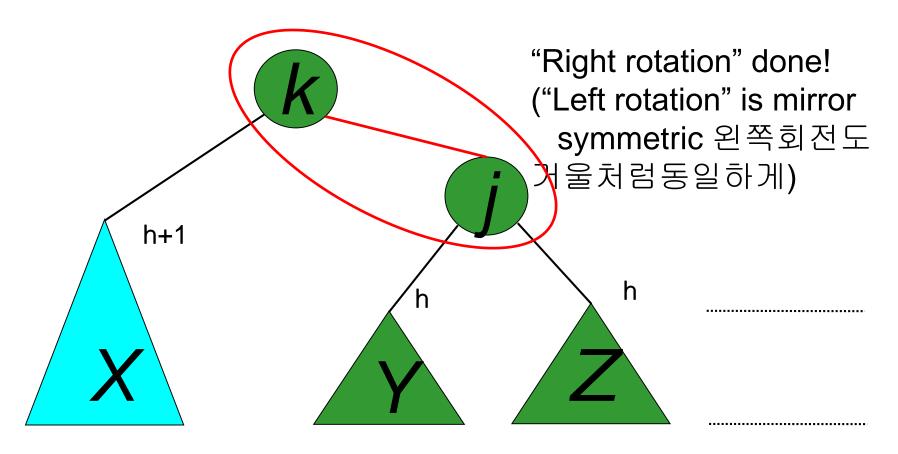


# Single right rotation





# Outside Case Completed

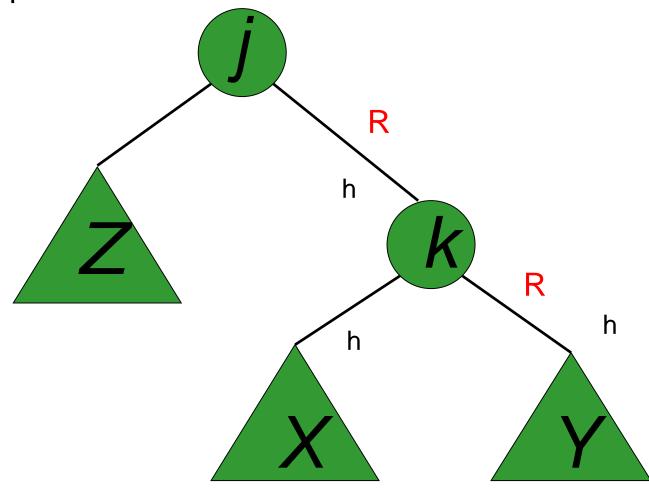


AVL property has been restored!



# **AVL Insertion: Right-Right**

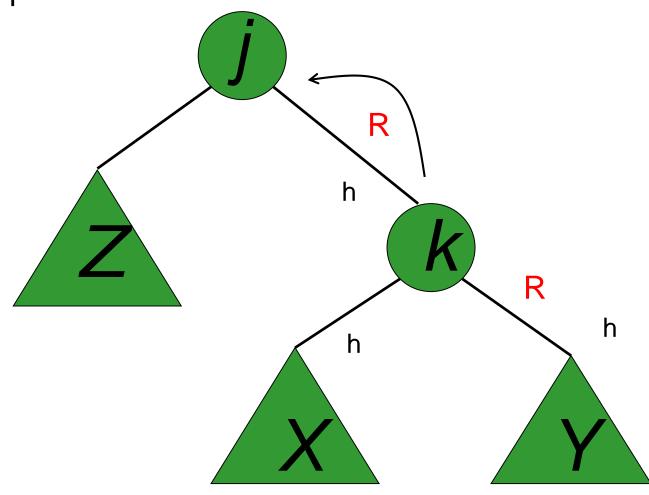
Exact same process as LL





# **AVL Insertion: Right-Right**

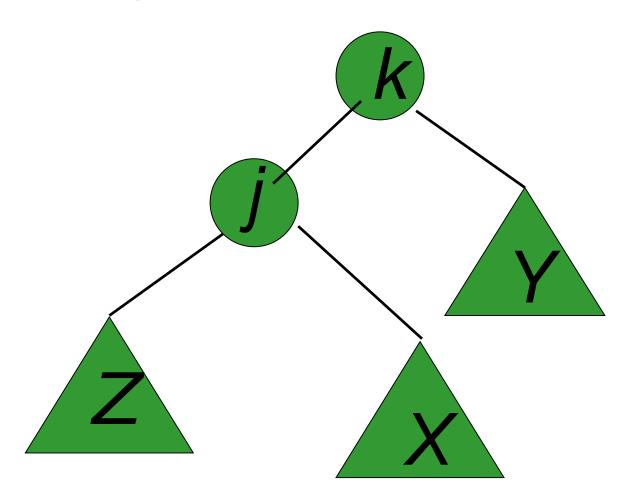
Exact same process as LL





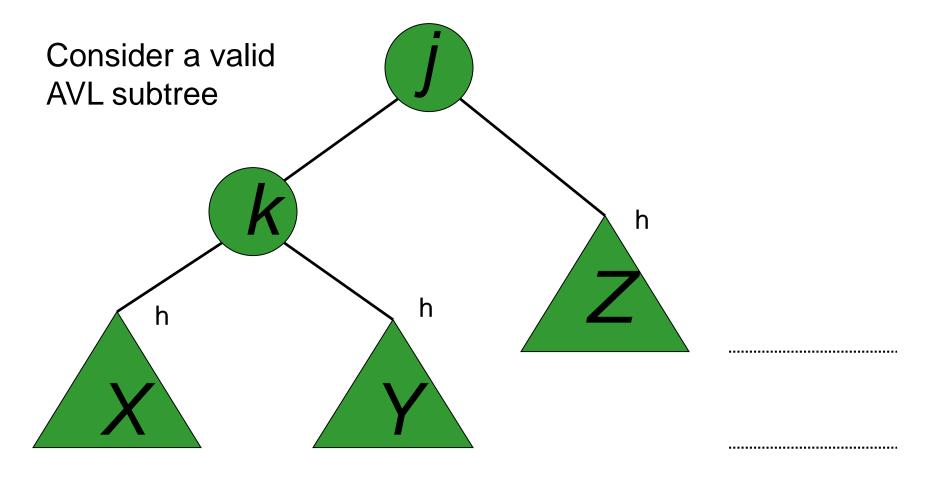
# Single left rotation

Exact same process as LL



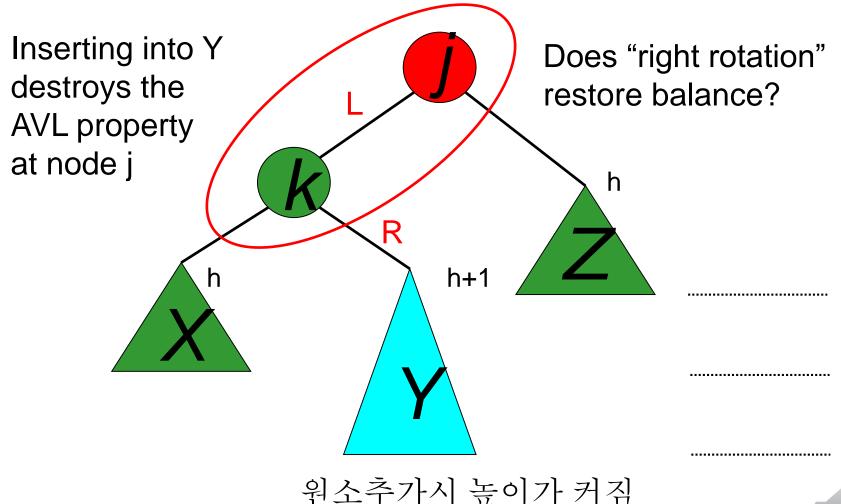


# **AVL Insertion: Inside Case**



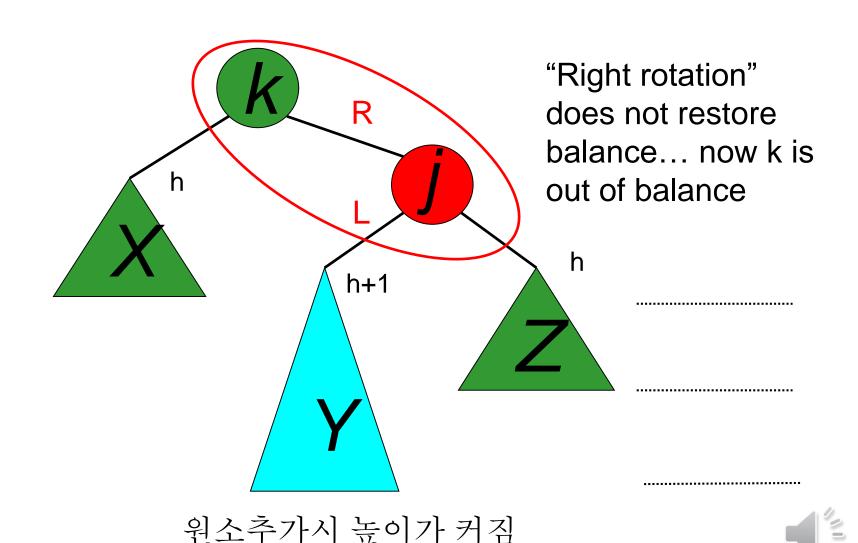


# **AVL Insertion: Left-Right**

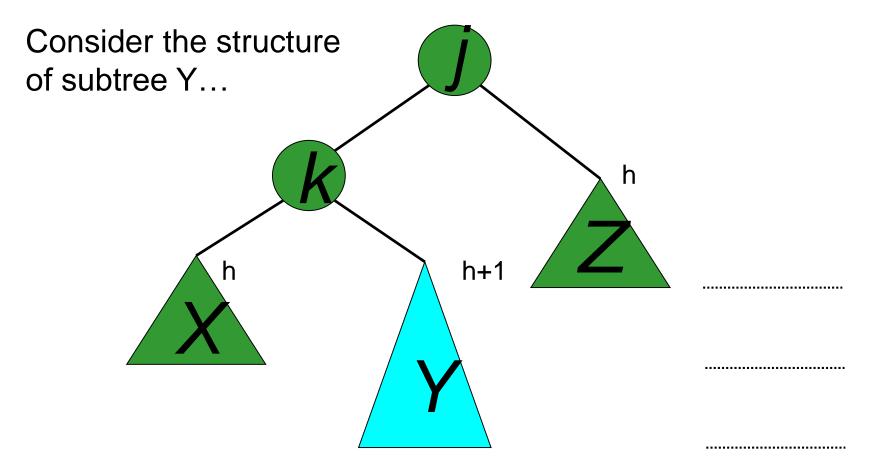




# **AVL Insertion: Right-Left**

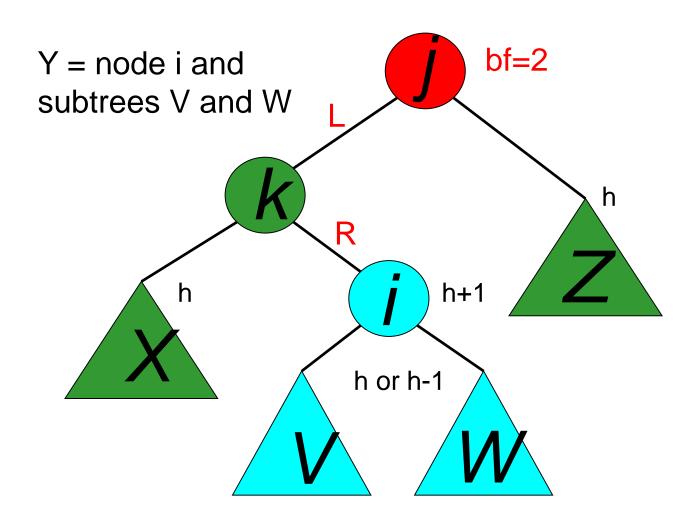


# AVL Insertion: Double Rotation 이중회전



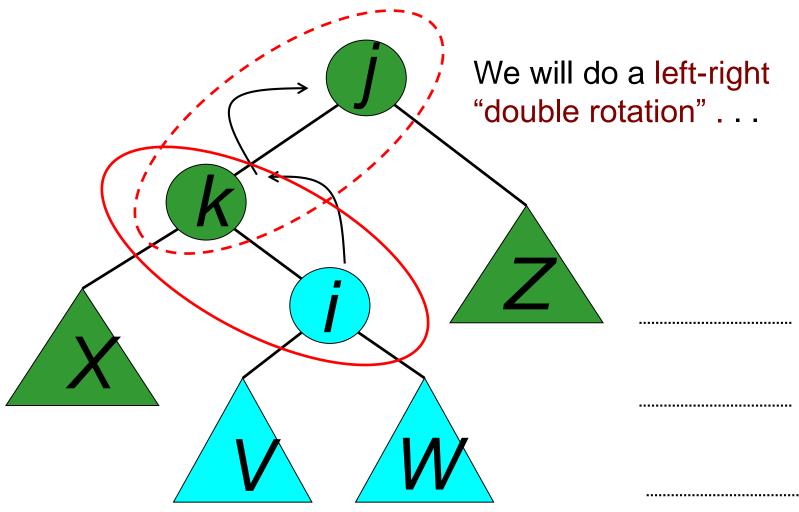


## **AVL Insertion: Inside Case**



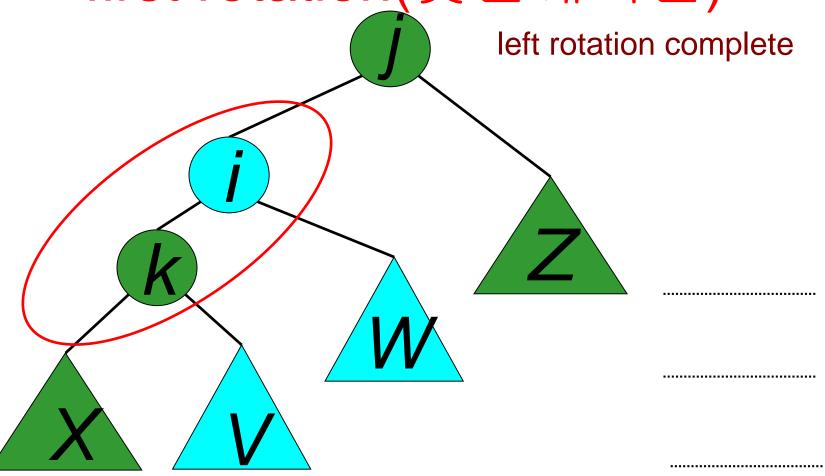


# **AVL Insertion: Inside Case**



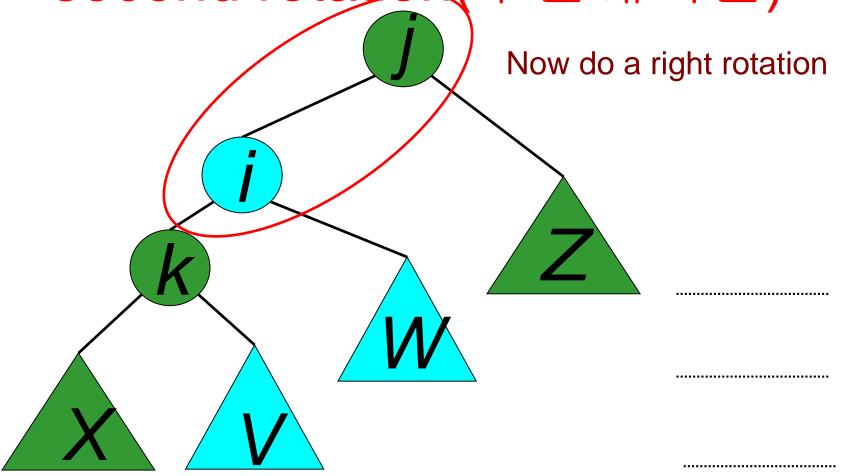


# Double rotation: first rotation(첫번째회전)





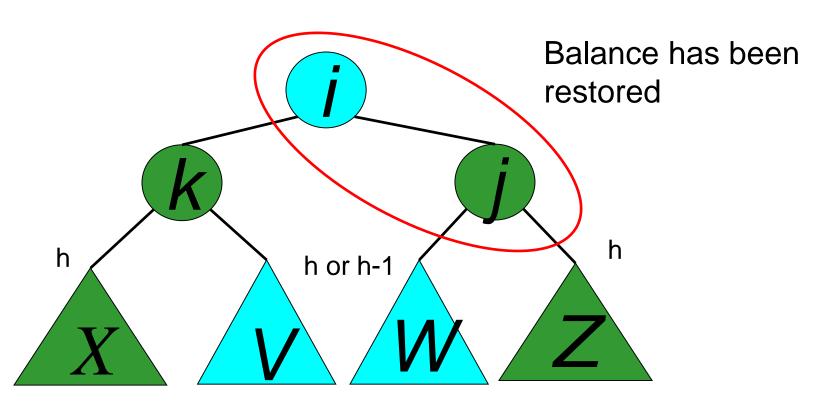
# Double rotation: second rotation(두번째회전)





# Double rotation : second rotation

right rotation complete

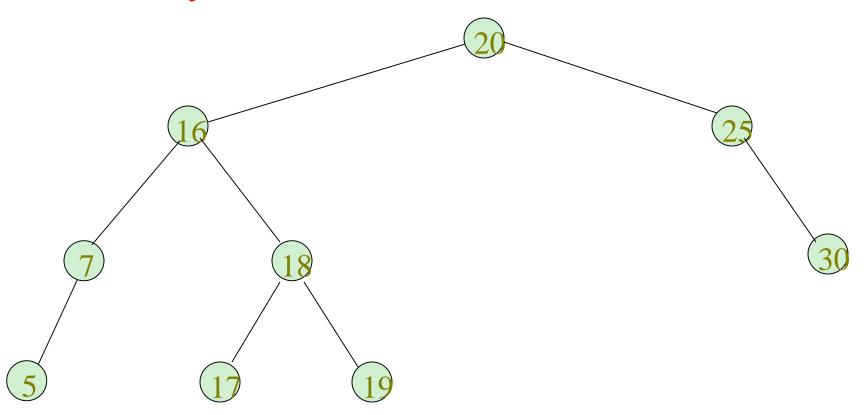




# **AVL Trees**

(Adelson – Velskii – Landis)

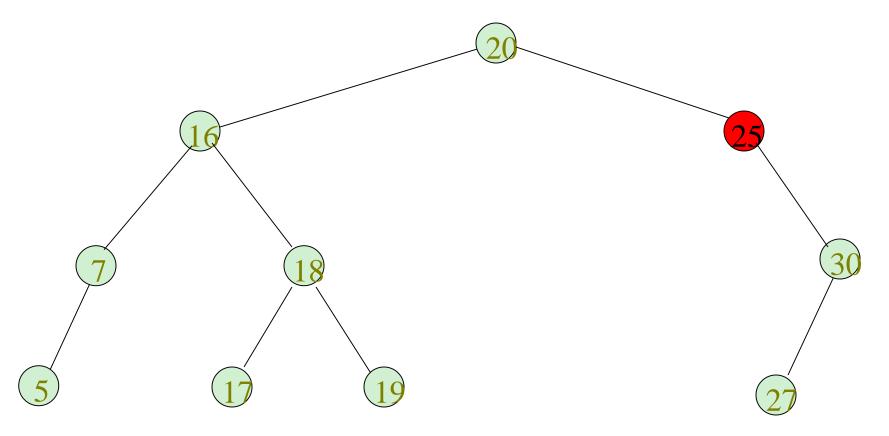
AVL tree: yes





# **AVL Trees**

AVL tree: No



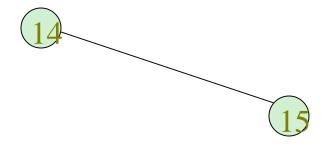


# Example 1



Single rotations: insert 14, 15, 16, 13, 12, 11, 10

• First insert 14 and 15:

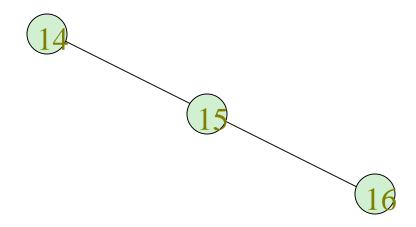


• Now insert 16.



#### Single rotations:

• Inserting 16 causes AVL violation:

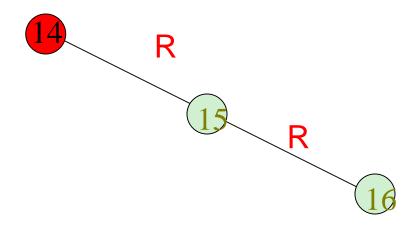


• Need to rotate.



#### Single rotations:

• Inserting 16 causes AVL violation:

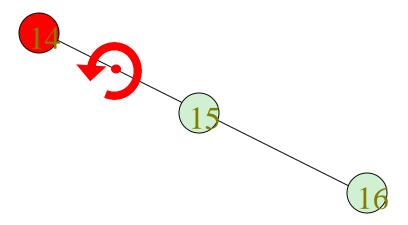


Need to rotate.



#### Single rotations:

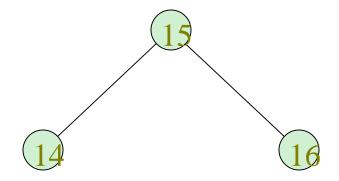
• Rotation type:





#### Single rotations:

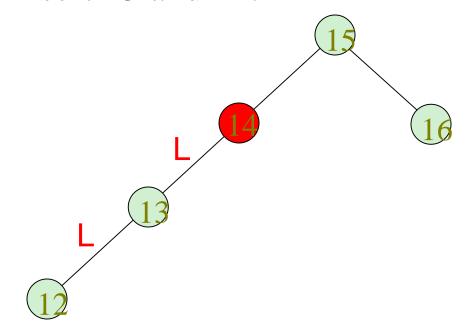
• Rotation restores AVL balance:





#### Single rotations:

• Now insert 13 and 12:

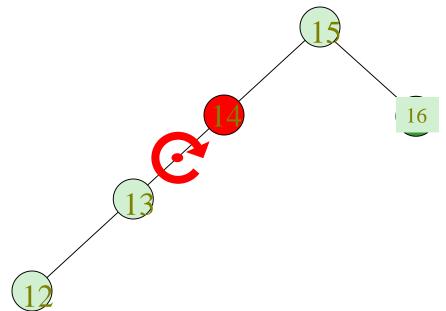


• AVL violation - need to rotate.



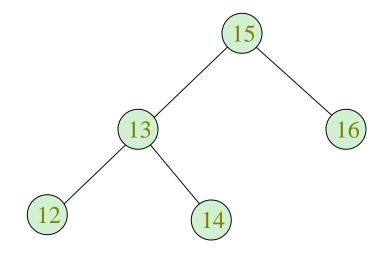
#### Single rotations:

• Rotation type:





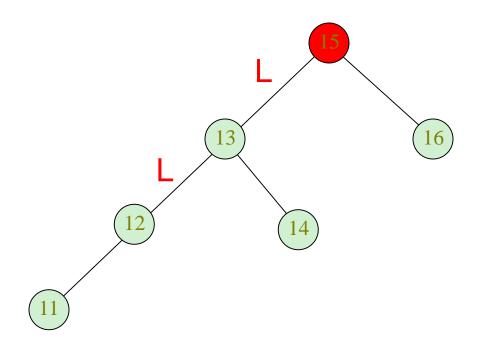
#### Single rotations:



• Now insert 11.



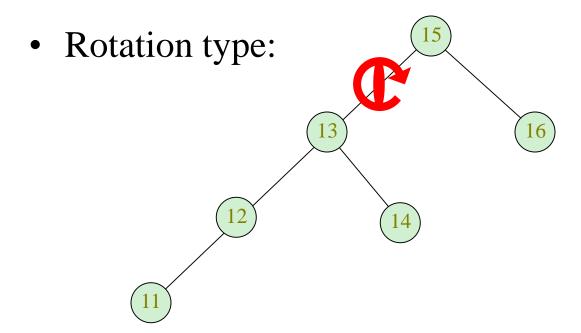
#### Single rotations:



• AVL violation – need to rotate

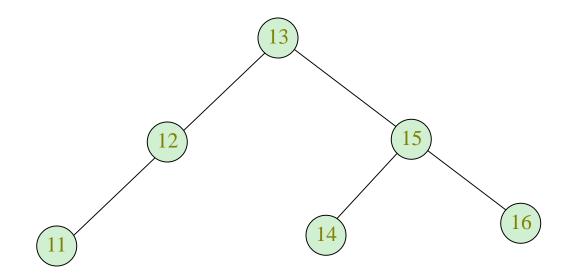


#### Single rotations:





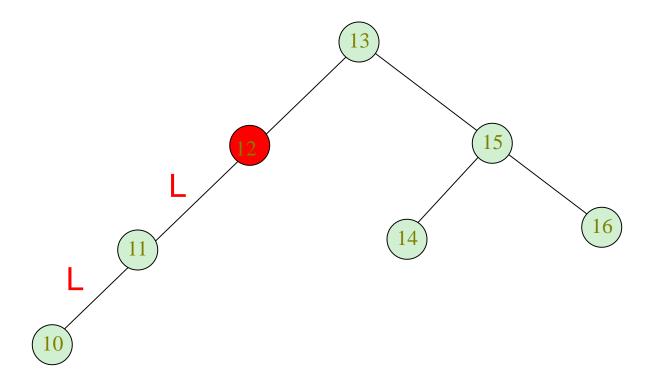
#### Single rotations:



• Now insert 10.



#### Single rotations:

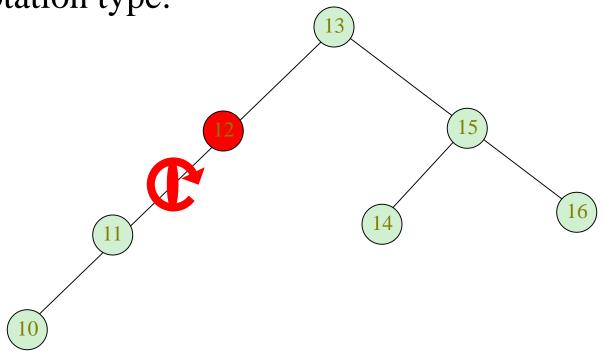


• AVL violation – need to rotate



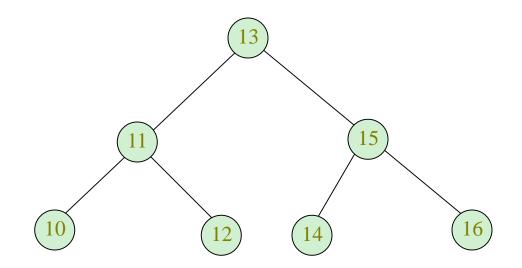
#### Single rotations:

Rotation type:





#### Single rotations:



• AVL balance restored.

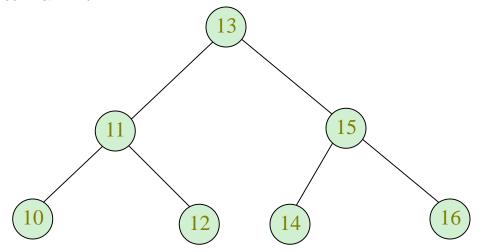


# Continue



Double rotations: insert 1, 2, 3, 4, 5, 7, 6, 9, 8

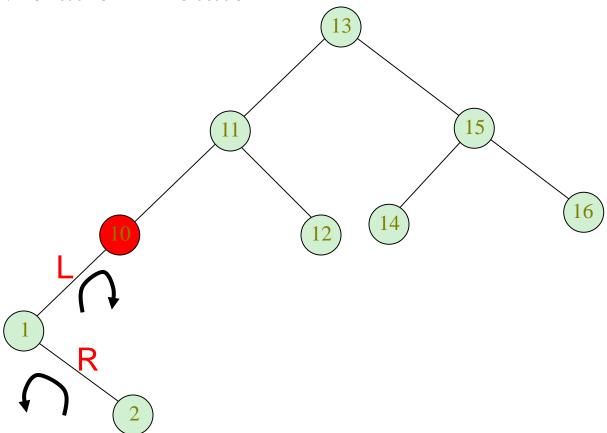
• First insert 1 and 2:





#### Double rotations:

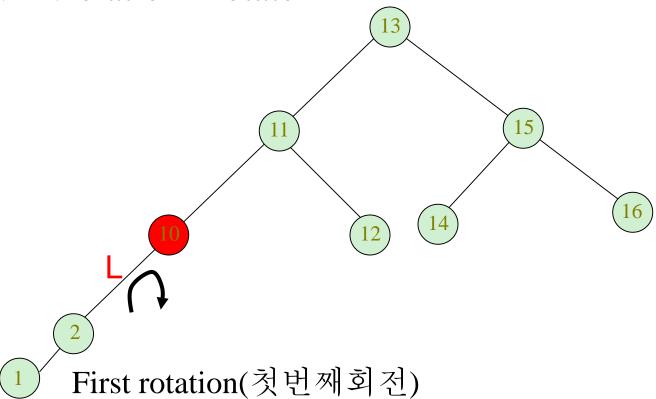
• AVL violation - rotate





#### Double rotations:

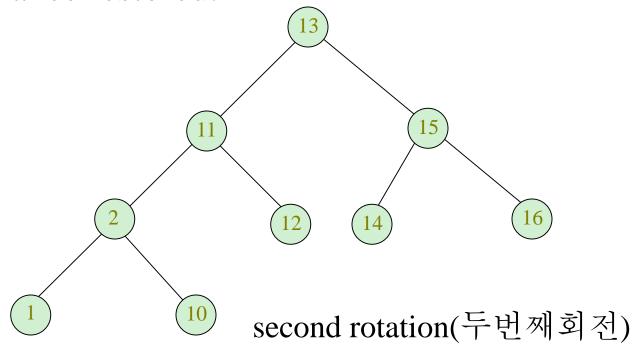
• AVL violation - rotate





#### Double rotations:

• AVL balance restored:

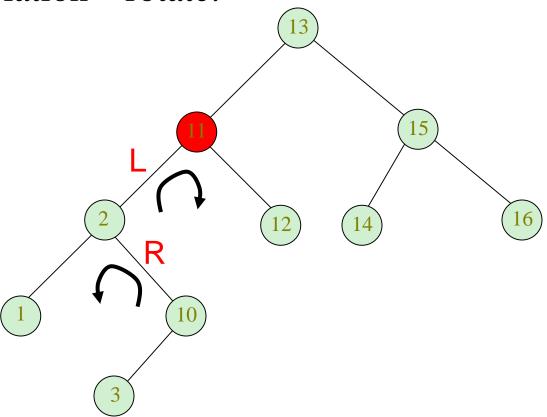


• Now insert 3.



#### Double rotations:

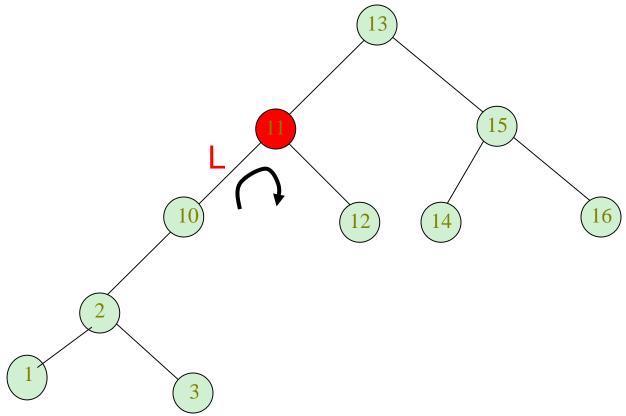
• AVL violation – rotate:





#### Double rotations:

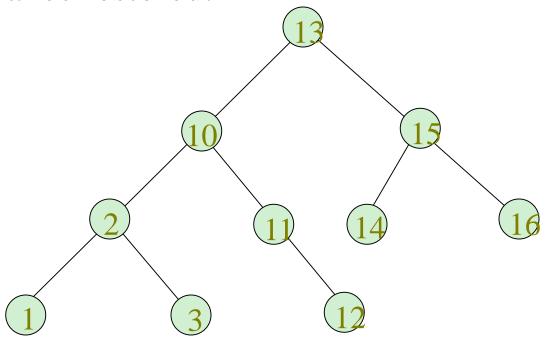
• AVL violation – rotate:





#### Double rotations:

• AVL balance restored:

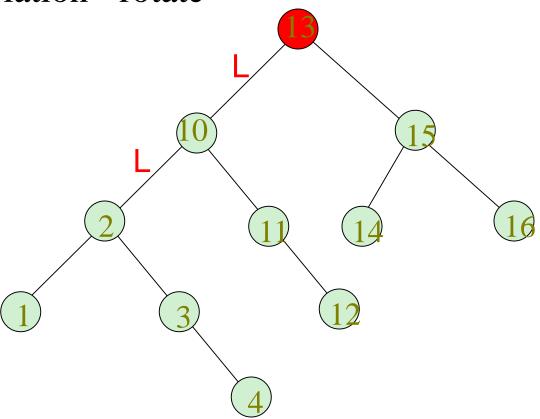


• Now insert 4.



#### Double rotations:

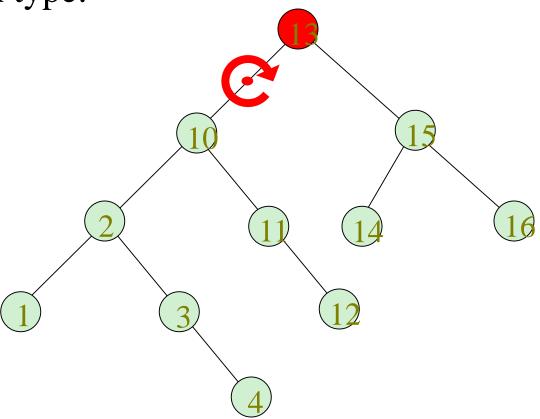
• AVL violation - rotate



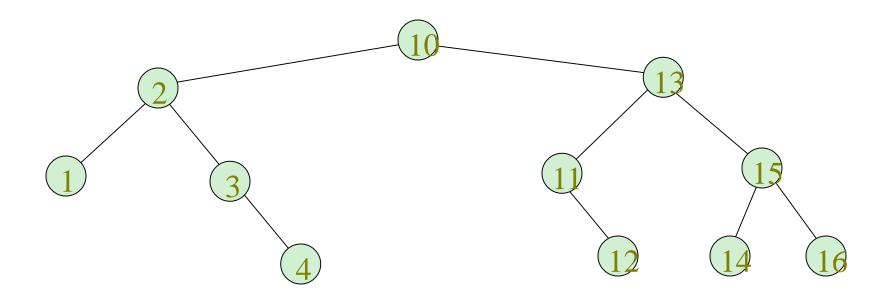


#### Double rotations:

• Rotation type:



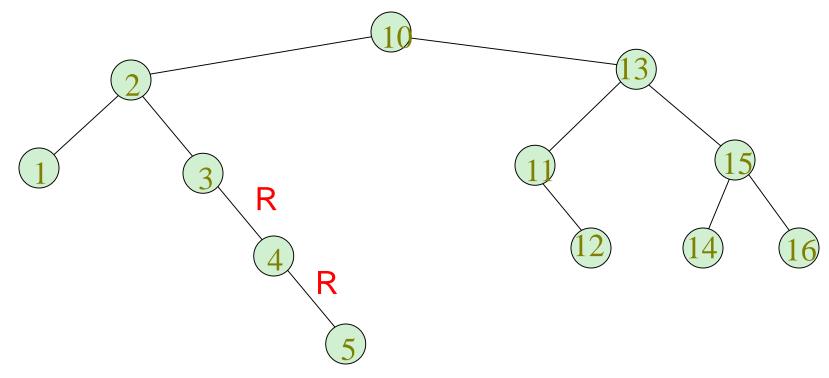




• Now insert 5.



#### Double rotations:

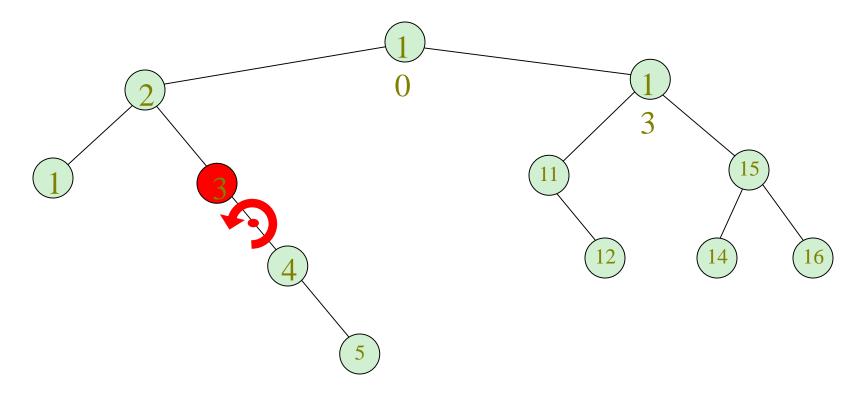


• AVL violation – rotate.



### Single rotations:

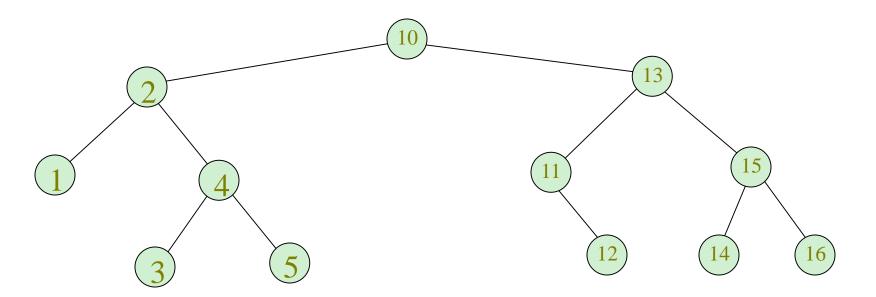
• Rotation type:





### Single rotations:

• AVL balance restored:

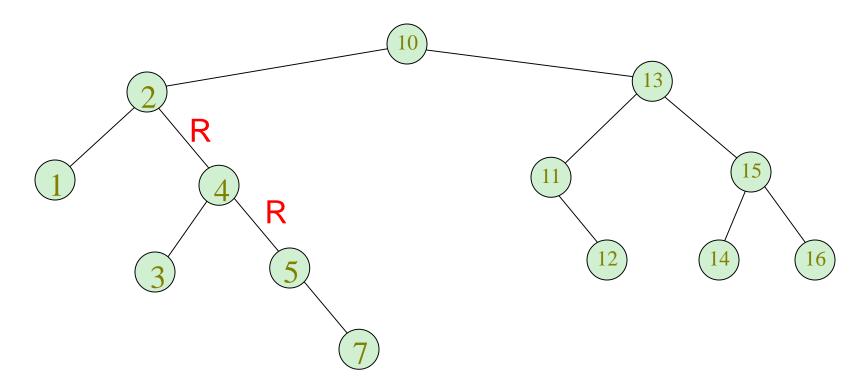


• Now insert 7.



### Single rotations:

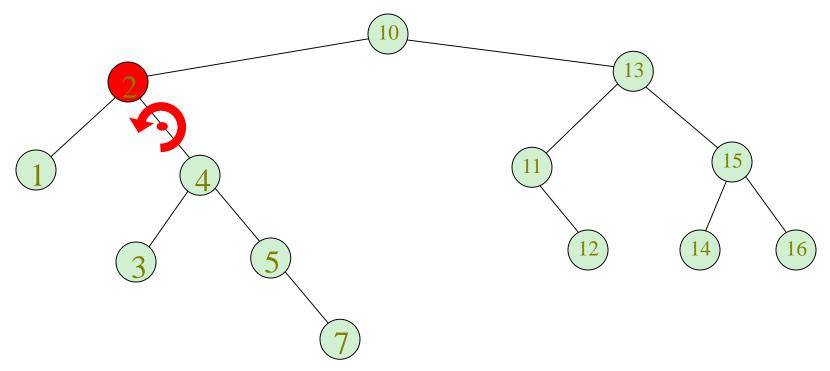
• AVL violation – rotate.





### Single rotations:

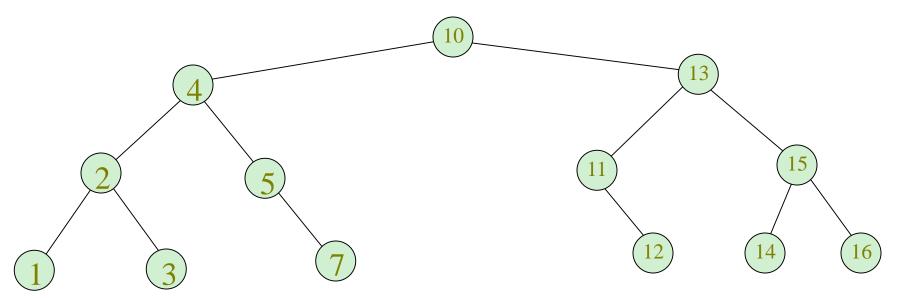
• Rotation type:





#### Double rotations:

• AVL balance restored.

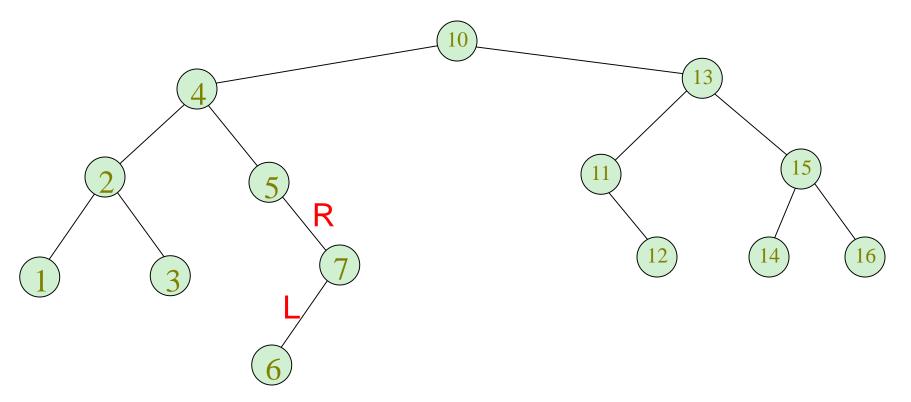


• Now insert 6.



#### Double rotations:

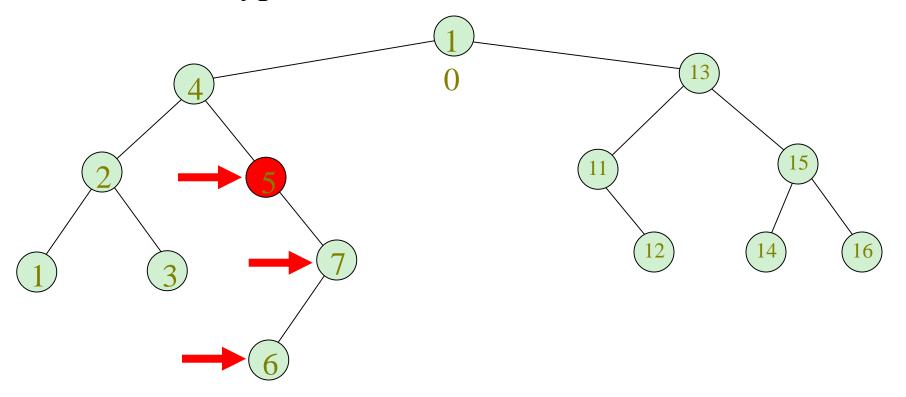
• AVL violation - rotate.





#### Double rotations:

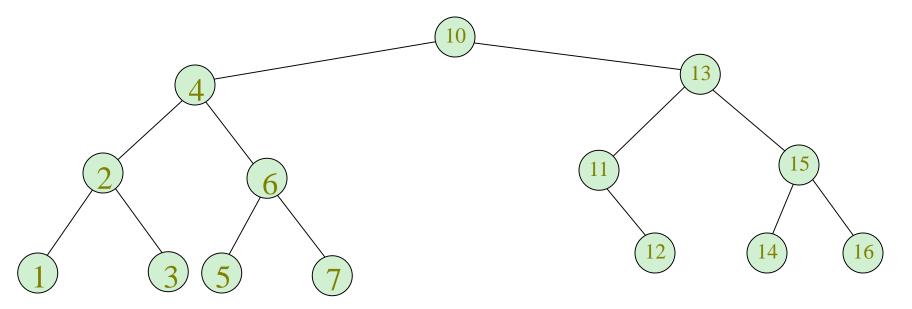
• Rotation type:





#### Double rotations:

• AVL balance restored.

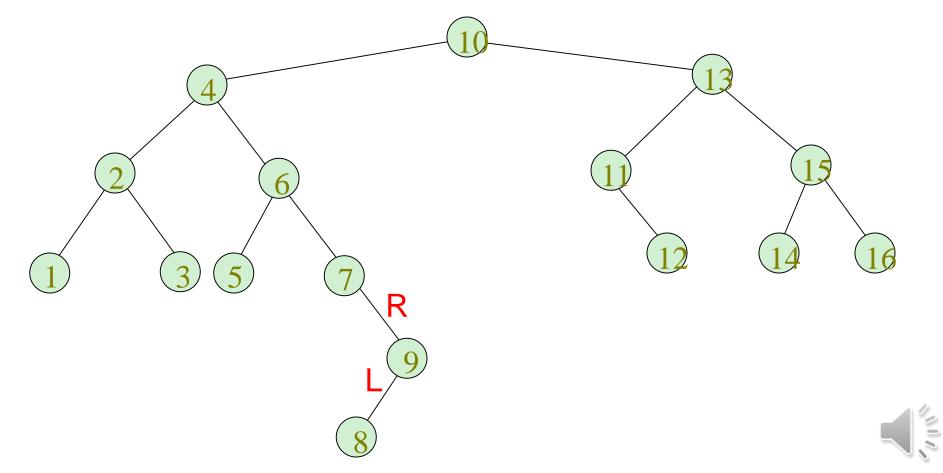


• Now insert 9 and 8.



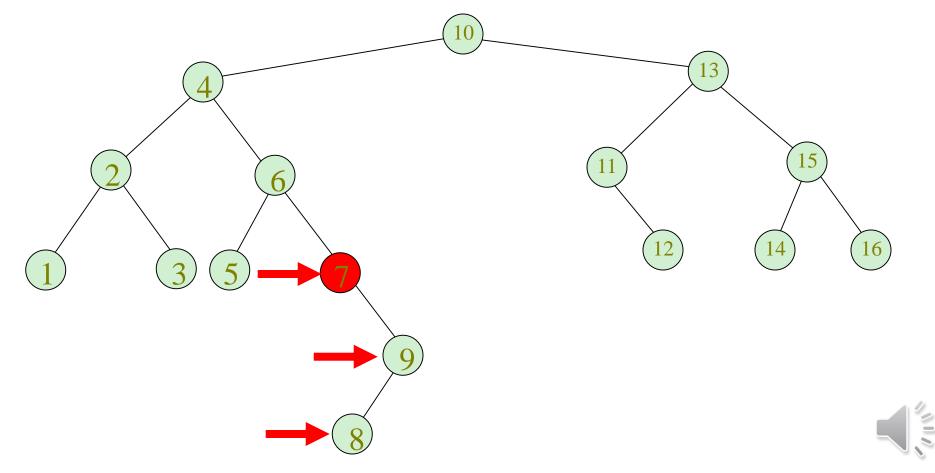
#### Double rotations:

• AVL violation - rotate.



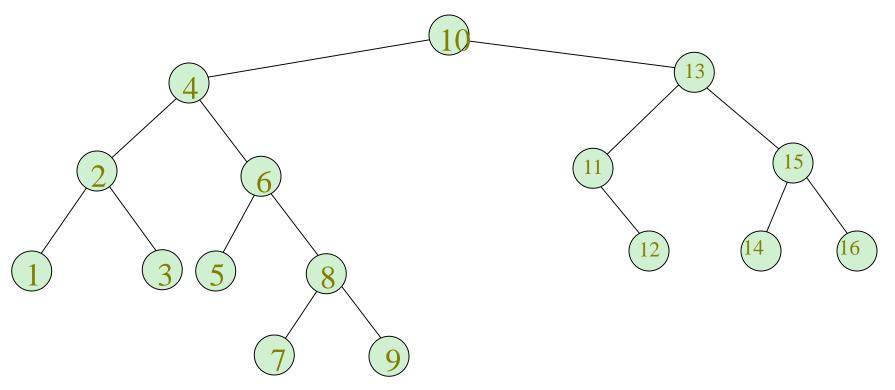
#### Double rotations:

• Rotation type:



#### Final tree:

• Tree is almost perfectly balanced



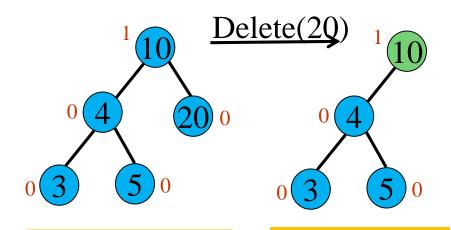


# Deletion(삭제)

Deletion is similar to insertion

- First do regular BST deletion keeping track of the nodes on the path to the deleted node
- After the node is deleted, simply backup the tree(이진트리재구성) and update balance factors
  - If an imbalance is detected, do the appropriate rotation to restore the AVL tree property
  - You may have to do more than one rotation as you backup the tree

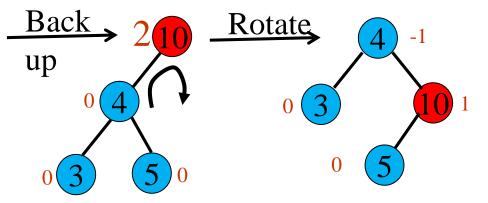
### Deletion Example (1)



**Initial AVLTree** 

Tree after deletion of 20

Now, backup the tree updating balance factors



Idenfitied 10 as the pivot

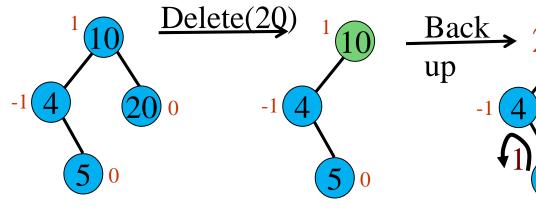
Classify the type of imbalance

AVL Tree after LL Correction

- LL Imbalance:
  - bf of P(10) is 2
  - bf of L(4) is 0 or 1



### Deletion Example (2)



Back 2 10 Rotate 5 0
up

-1 4 2 0 4 10 0

AVL Tree after LL Correction

**Initial AVLTree** 

Tree after deletion of 20

Now, backup the tree updating balance factors

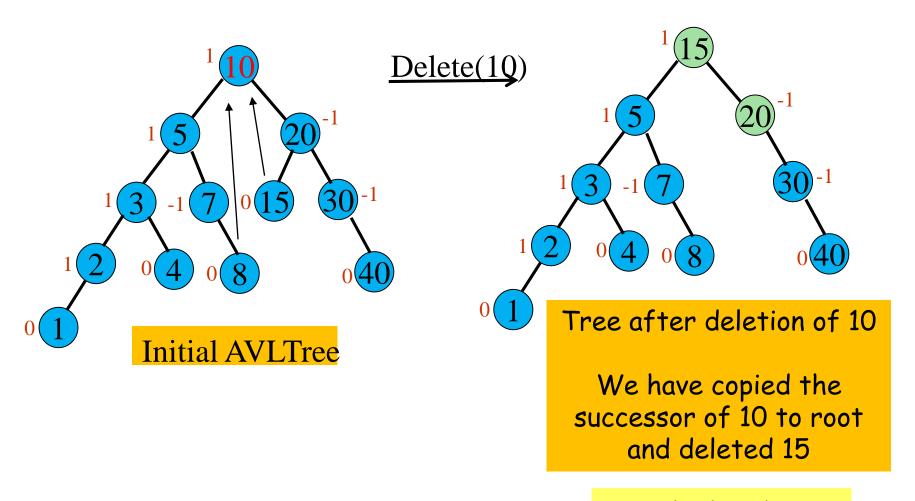
Idenfitied 10 as the pivot

Classify the type of imbalance

- LR Imbalance:
  - bf of P(10) is 2
  - bf of L(4) is -1



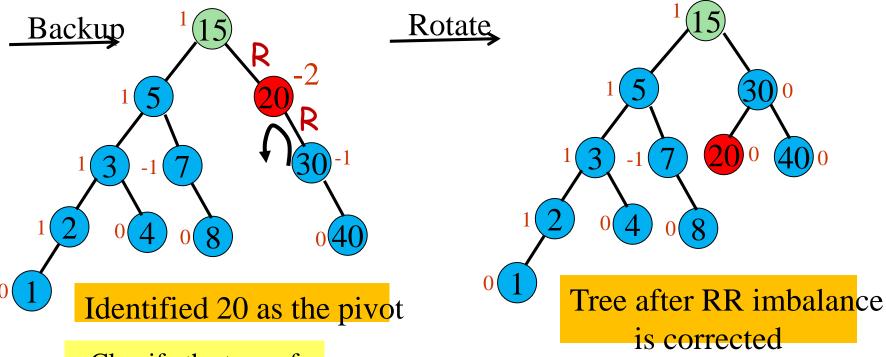
### Deletion Example (3)



Now, backup the tree updating balance factors



### Deletion Example (3) - continued



Classify the type of imbalance

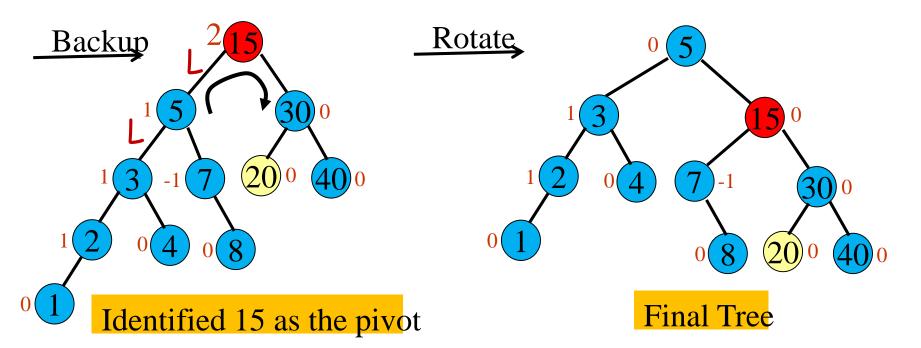
- RR Imbalance:
  - bf of P(20) is -2
  - bf of R(30) is 0 or -1

Is this an AVL tree?

Continue backing up the tree updating balance factors



### Deletion Example (3) - continued



Classify the type of imbalance

- LL Imbalance:
  - bf of P(15) is 2
  - bf of L(5) is 0 or 1



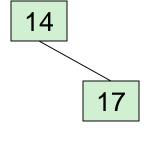
# Example 2



• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL tree

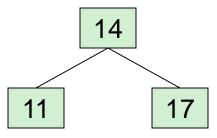


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL tree



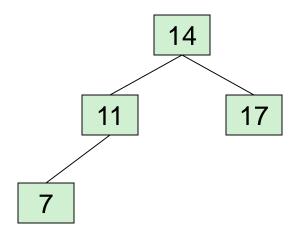


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



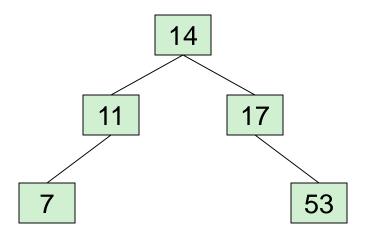


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



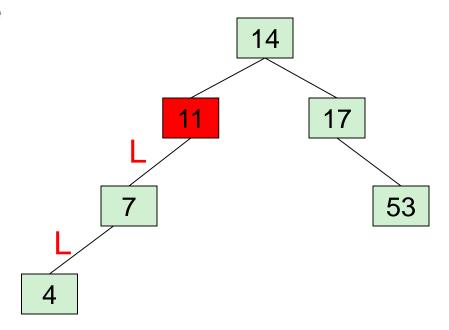


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



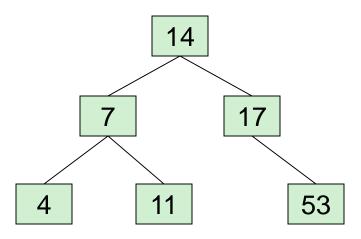


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



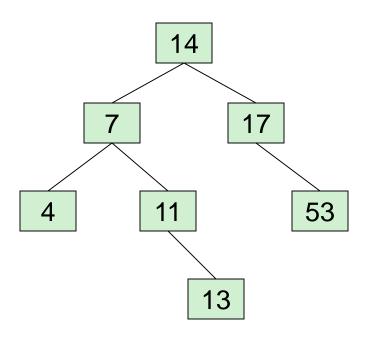


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



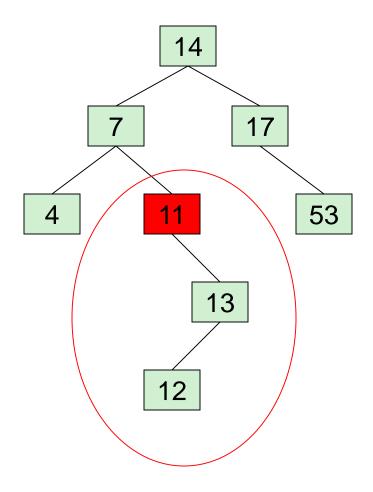


• Insert 14, 17, 11, 7, 53, 4, 13 into an empty AVL



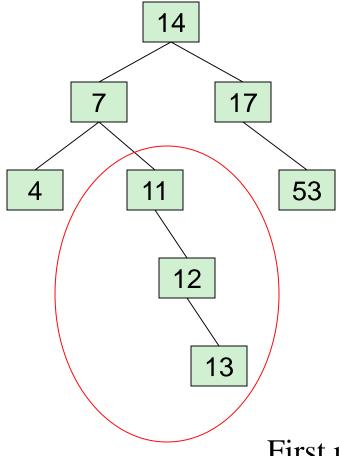


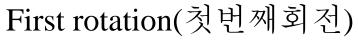
#### Now insert 12





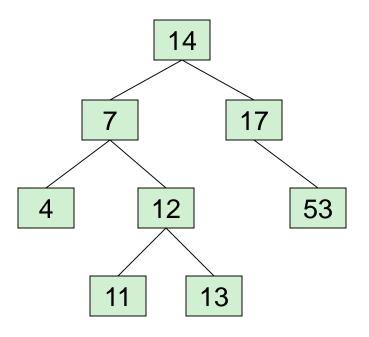
#### Now insert 12







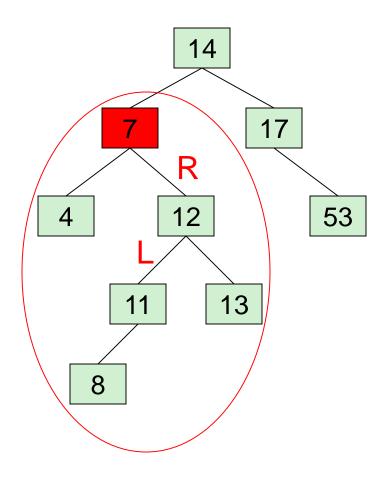
Now the AVL tree is balanced.



Second rotation(두번째회전)

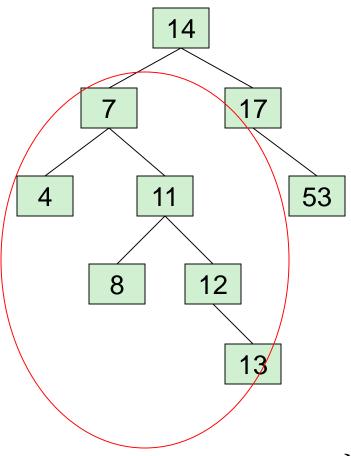


#### Now insert 8





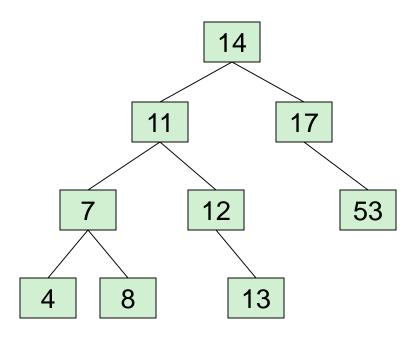
#### Now insert 8



First rotation(첫번째회전)



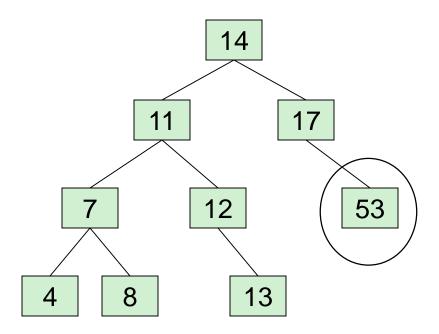
Now the AVL tree is balanced.



Second rotation(두번째회전)

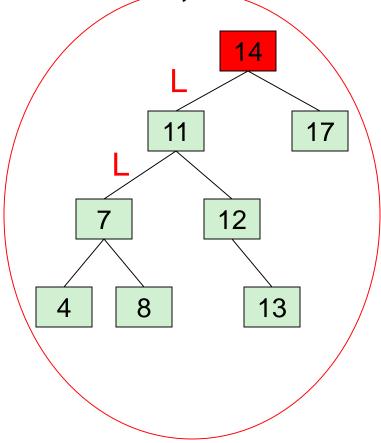


• Now remove 53(53제거)



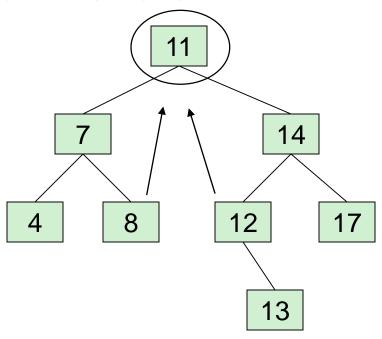


Now remove 53, unbalanced





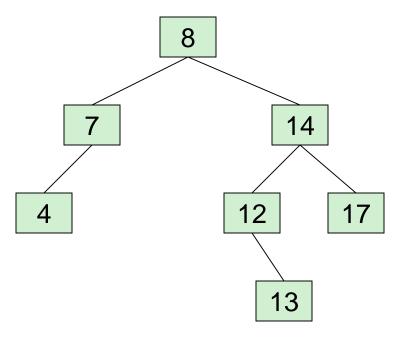
Balanced! Remove 11





• Remove 11, replace it with the largest in its left

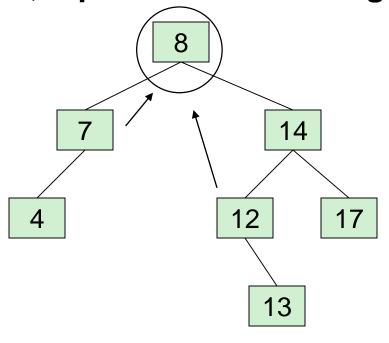
branch





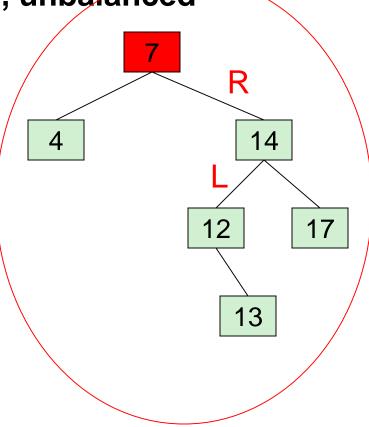
Remove 8, replace it with the largest in its left

branch



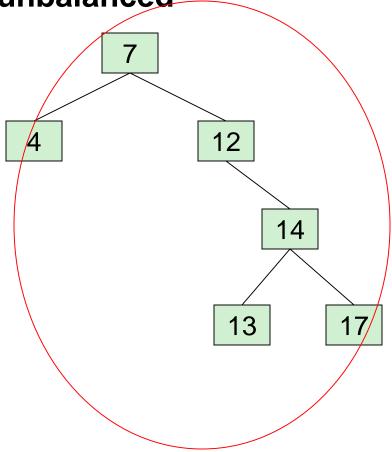


Remove 8, unbalanced





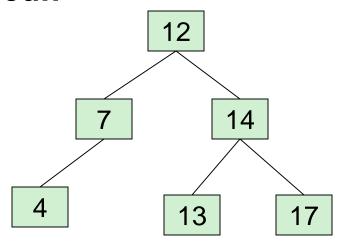
Remove 8, unbalanced



First rotation(첫번째회전)



#### · Balanced!!



Second rotation(두번째회전)



# Example 3

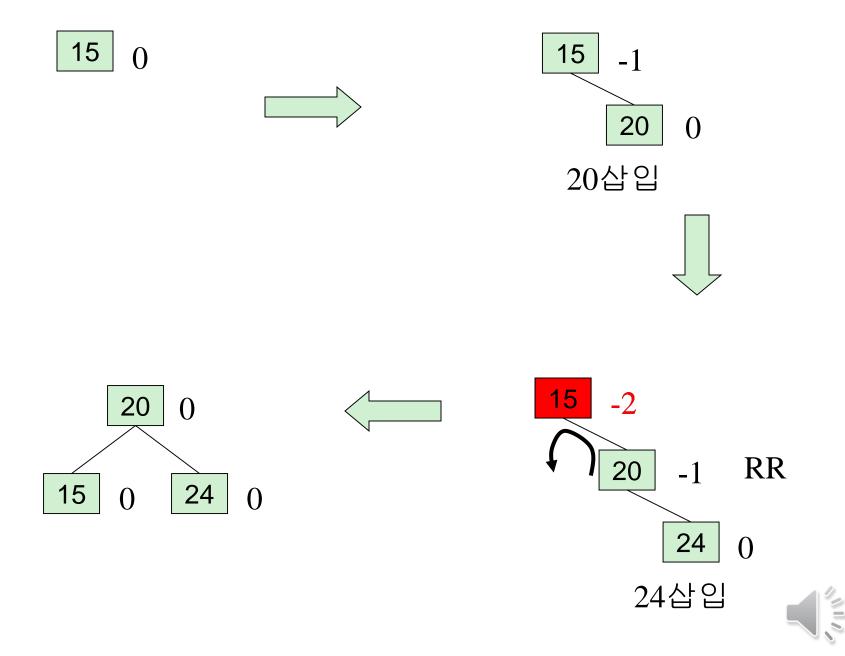


## **Example**

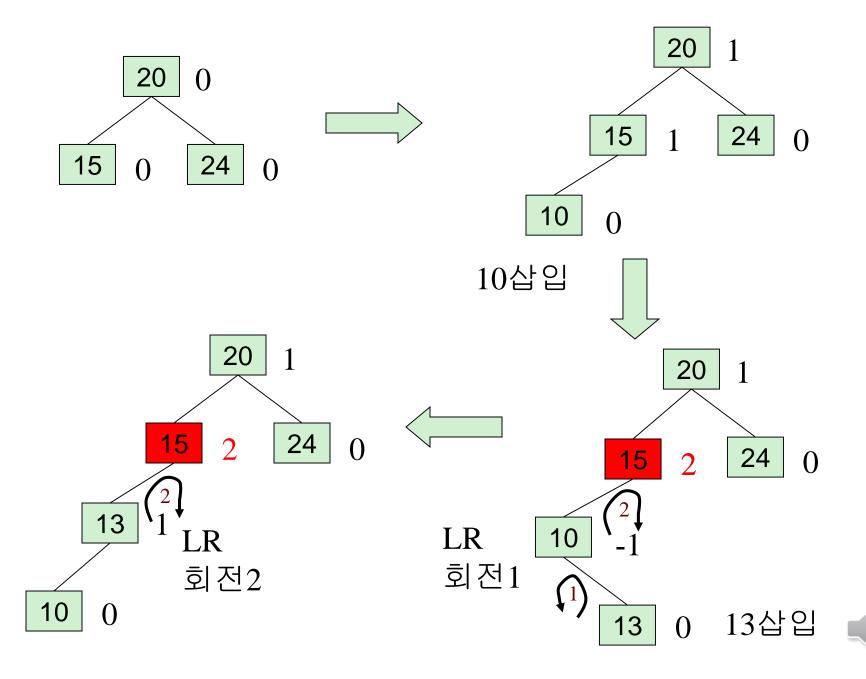
• Build an AVL tree with the following values: 15, 20, 24, 10, 13, 7, 30, 36, 25



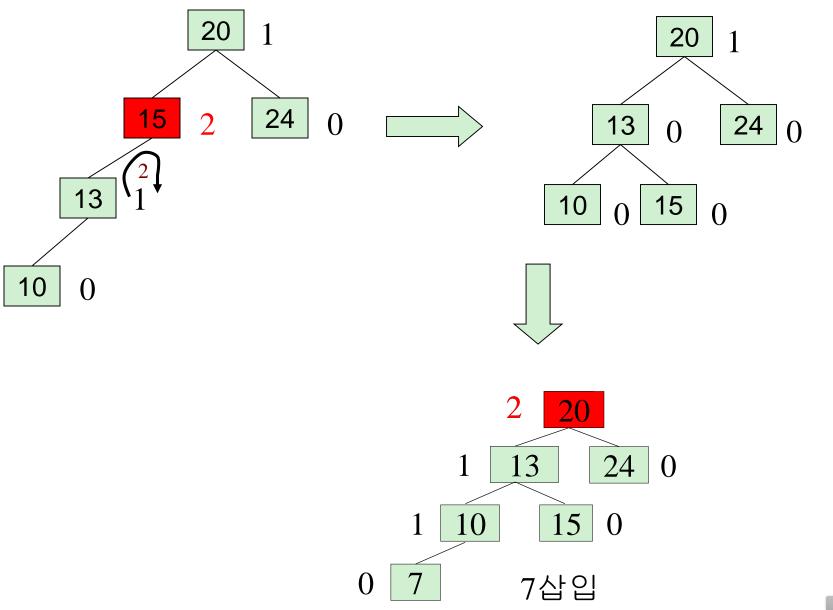
, **20**, **24**, 10, 13, 7, 30, 36, 25



15, 20, 24, **10**, **13**, 7, 30, 36, 25

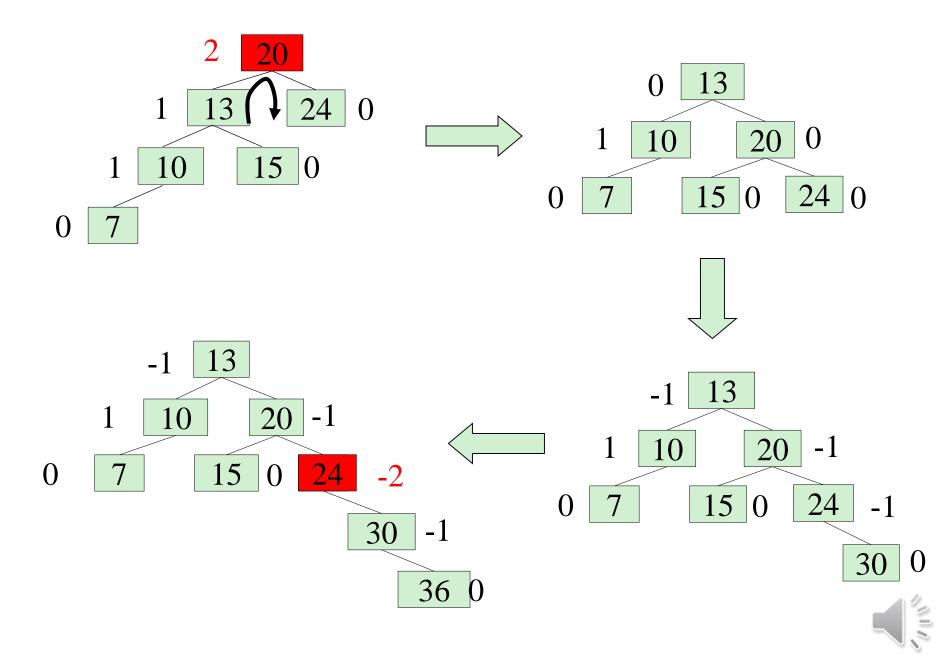


15, 20, 24, 10, 13, 7, 30, 36, 25

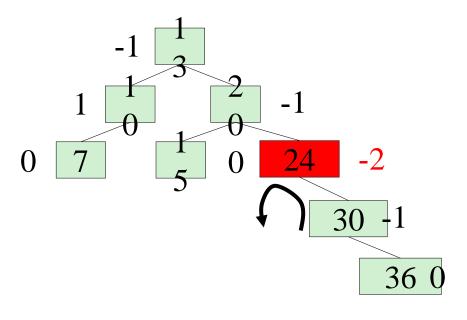


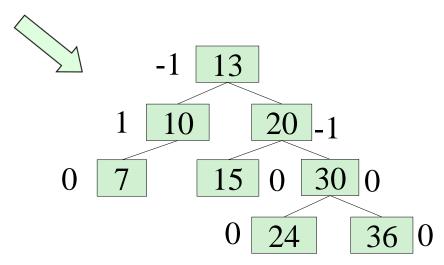


15, 20, 24, 10, 13, 7, <mark>30, 36</mark>, 25



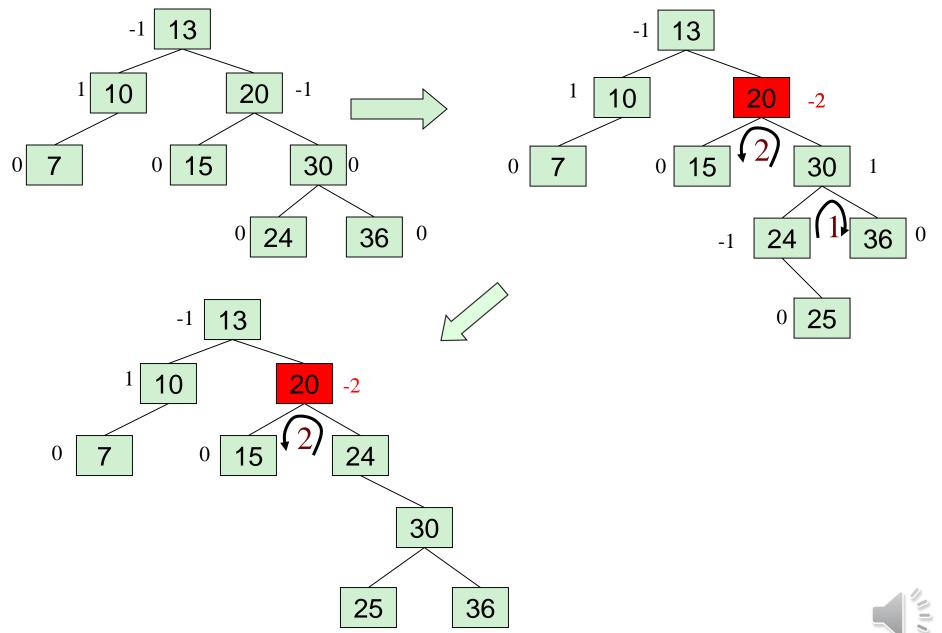
15, 20, 24, 10, 13, 7, 30, 36, 25



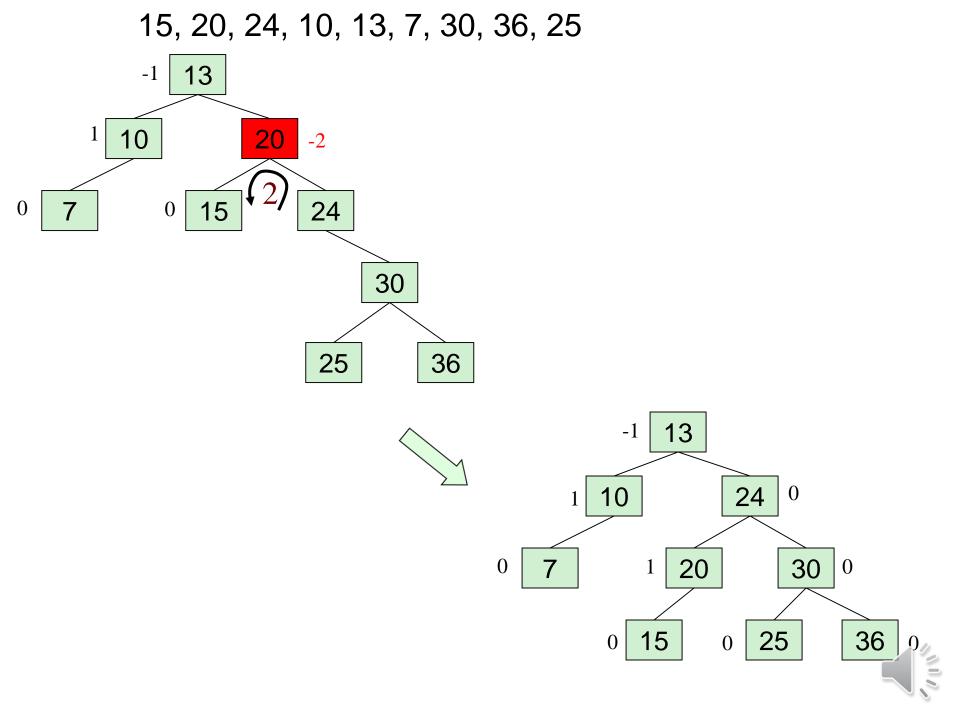




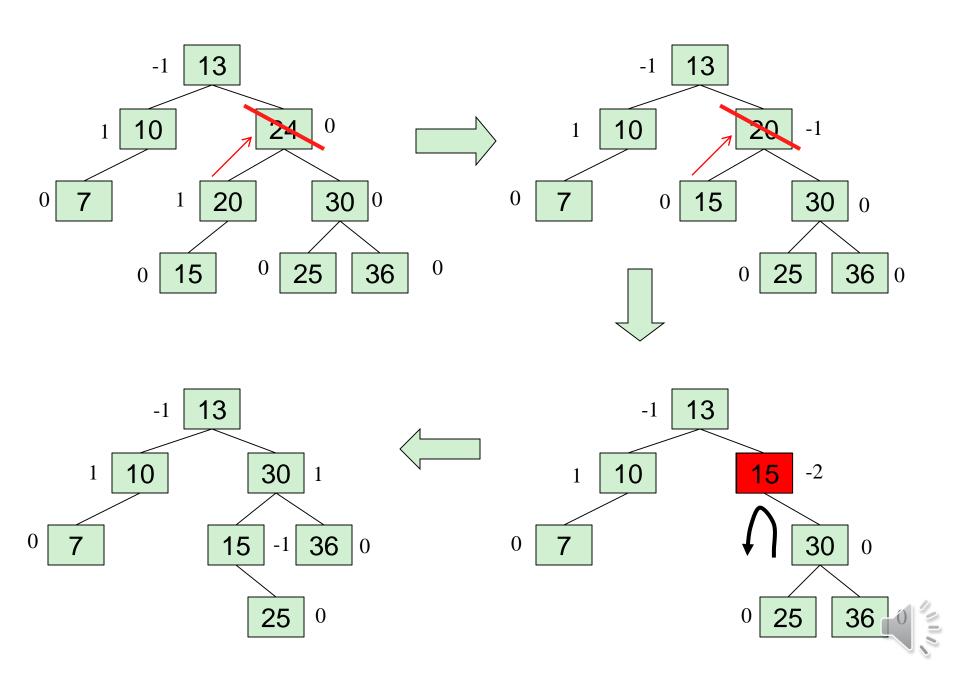
15, 20, 24, 10, 13, 7, 30, 36, <mark>25</mark>







#### Remove 24 and 20 from the AVL tree.



## Search (Find)

• Since AVL Tree is a BST(이진탐색트리), search algorithm is the same as BST search and runs in guaranteed O(logn) time



## Pros and Cons of AVL Trees 장점/단점

Arguments for AVL trees: 삽입,삭제,탐색 모두 O(log N) 보장

- Search is O(log N) since AVL trees are always balanced.
- 2. Insertion and deletions are also O(logn)
- 3. The height balancing adds no more than a constant factor to the speed of insertion.

#### Arguments against using AVL trees:

- 1. Difficult to program & debug프로그램하기어려움; more space for balance factor.
- 2. Asymptotically faster but rebalancing costs time. 균형유지비용 공간소모
- 3. Most large searches are done in database systems on disk and use other structures (e.g. B-trees).
- May be OK to have O(N) for a single operation if total run time for many consecutive operations is fast (e.g. Splay trees).

## Splay Trees (스플레이트리)

splay: 벌리다. 펼치다.



## Motivation for Splay Trees

#### Problems with AVL Trees

- extra storage/complexity for height fields
- ugly delete code

### Solution: splay trees

- blind adjusting version of AVL trees
- amortized time for all operations is O(log n)
- worst case time is O(n)
- insert/find always rotates node *to the root*!



## Splay Trees

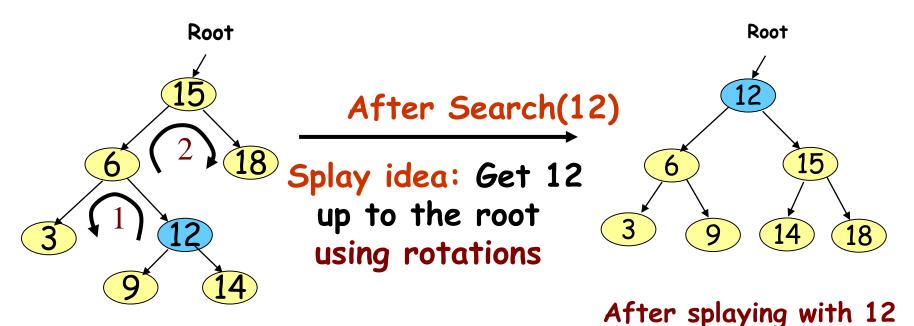
- Splay trees are binary search trees (BSTs) that:
  - ◆ Are not perfectly balanced all the time (완전균형이 아님)
  - ◆ Allow search and insertion operations to try to balance the tree so that future operations may run faster (삽입,삭제원소를 루트로 가져와 다음 탐색이 빠르도록 함)

#### • Based on the heuristic:

- If X is accessed once, it is likely to be accessed again. (한번 탐색되었던 원소는 다시 탐색되기 쉽다는 가정을 기반)
- After node X is accessed, perform "splaying" operations to bring X up to the root of the tree.
- Do this in a way that leaves the tree more or less balanced as a whole.



## Motivating Example

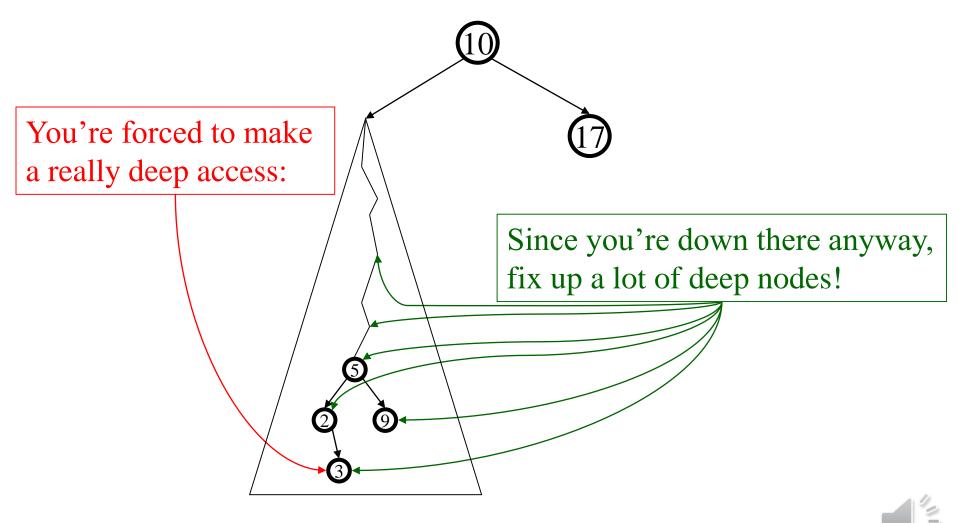


#### Initial tree

- Not only splaying with 12 makes the tree balanced, subsequent accesses for 12 will take O(1) time.
- Active (recently accessed) nodes will move towards the root and inactive nodes will slowly move further from the root



## Splay Tree Idea



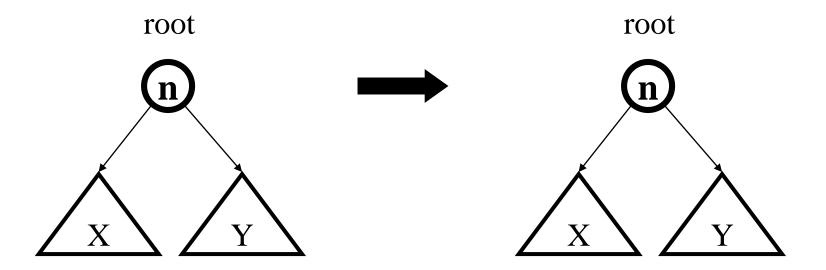
## **Splaying Cases**

### Node being accessed (n) is:

- Root
- Child of root
- Has both parent (p) and grandparent (g)
  - Zig-zig pattern:  $g \rightarrow p \rightarrow n$  is left-left or right-right
  - Zig-zag pattern:  $g \rightarrow p \rightarrow n$  is left-right or right-left

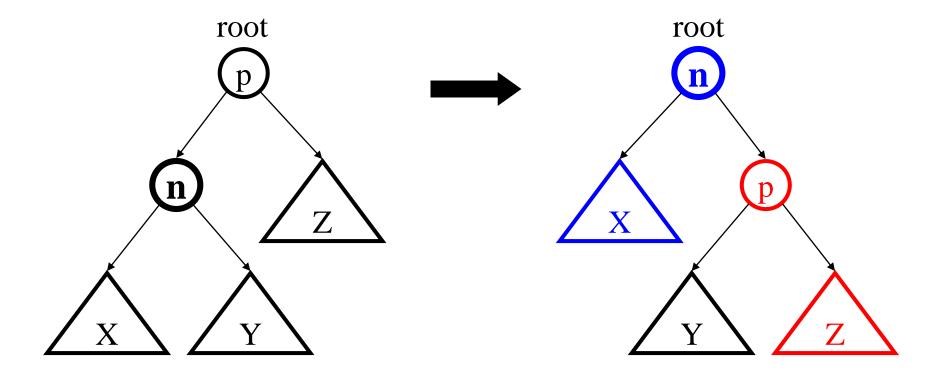


# Access root: Do nothing (that was easy!)





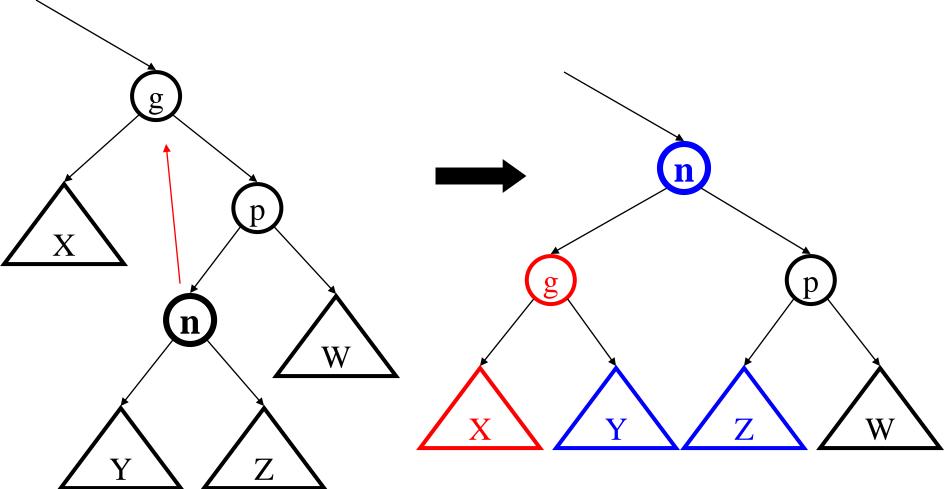
# Access child of root: Zig (AVL single rotation)





### Access (LR, RL) grandchild:

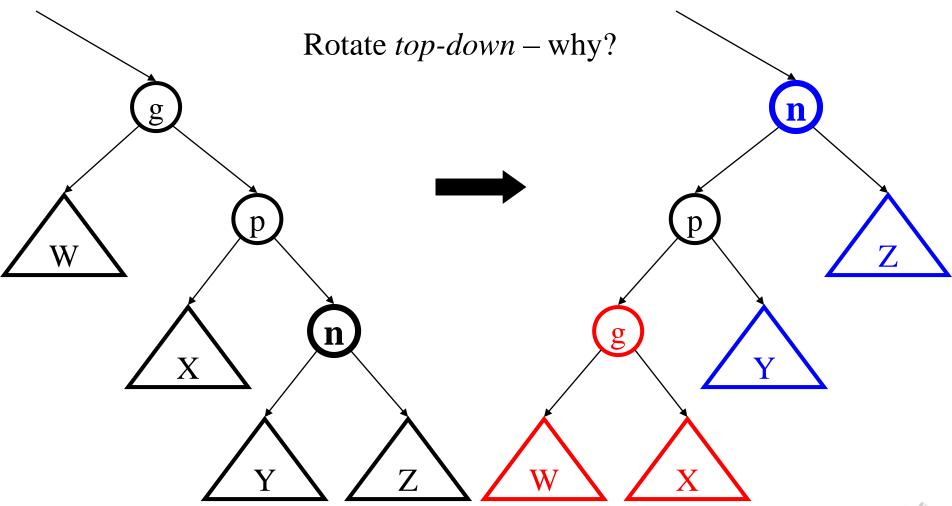
# Zig-Zag (AVL double rotation)





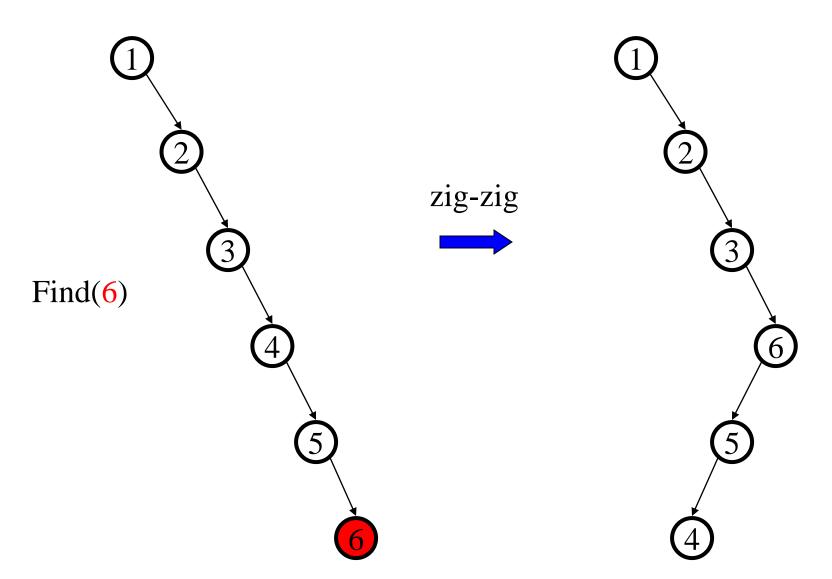
## Access (LL, RR) grandchild:

## Zig-Zig



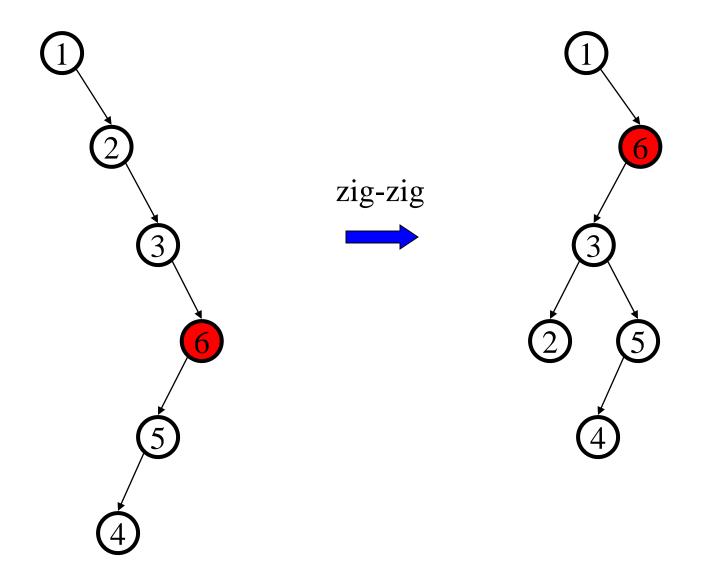


# Splaying Example: Find(6)



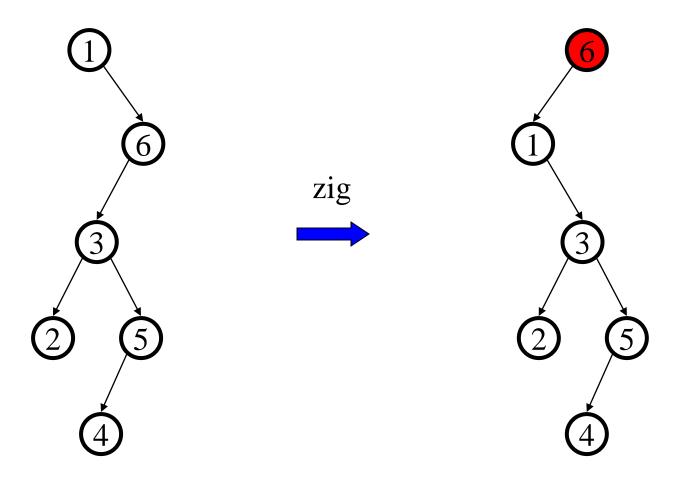


## ... still splaying ...



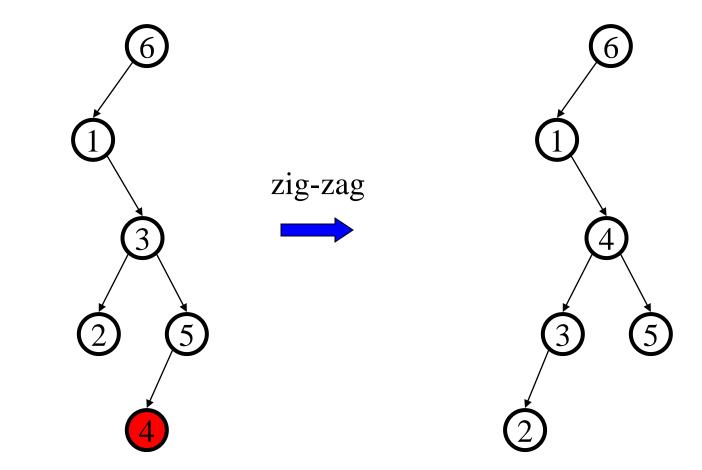


## ... 6 splayed out!





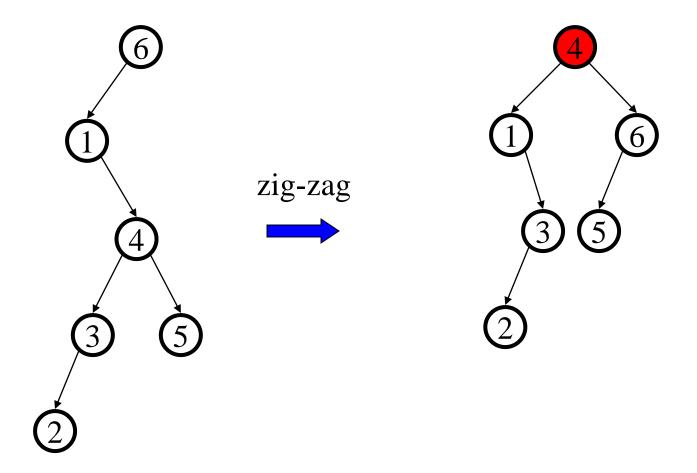
# Splay it Again, Sam! Find (4)



Find(4)



## ... 4 splayed out!





### Why Splaying Helps

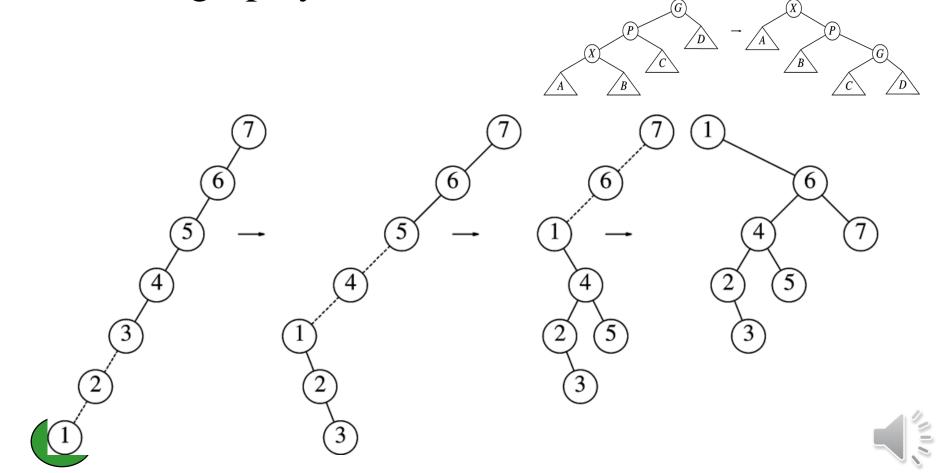
- If a node n on the access path is at depth d before the splay, it's at about depth d/2 after the splay
  - Exceptions are the root, the child of the root, and the node splayed
- Overall, nodes which are below nodes on the access path tend to move closer to the root
- ◆ Splaying gets amortized O(log n) performance. (Maybe not now, but soon, and for the rest of the operations.)



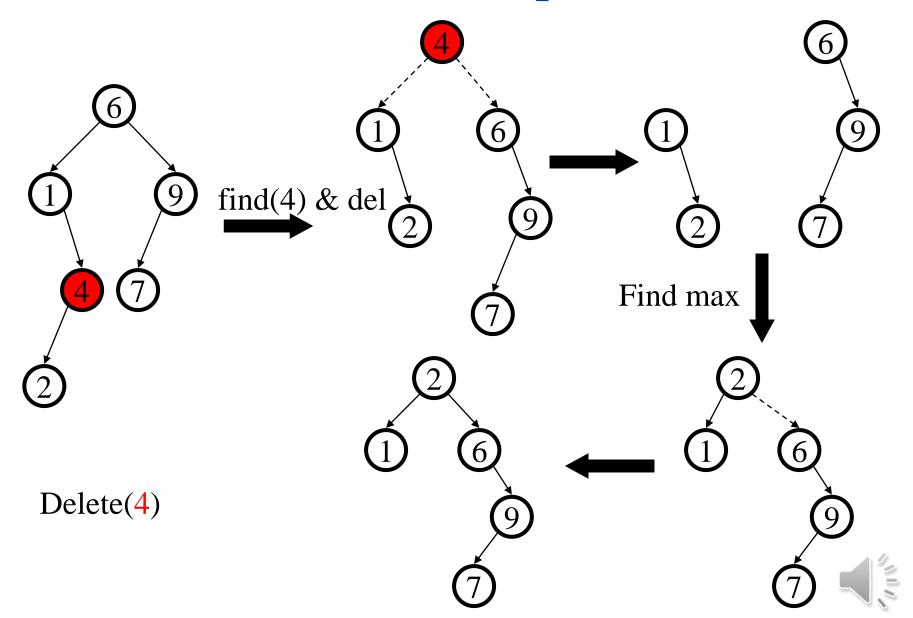
#### Splay Tree: Splaying

CASE: Zig-zig

 Work out an Example: Insert node 1 in the following Splay tree

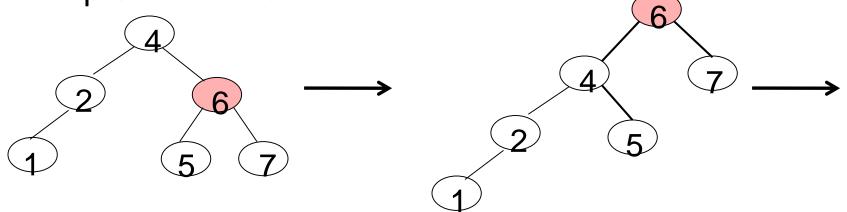


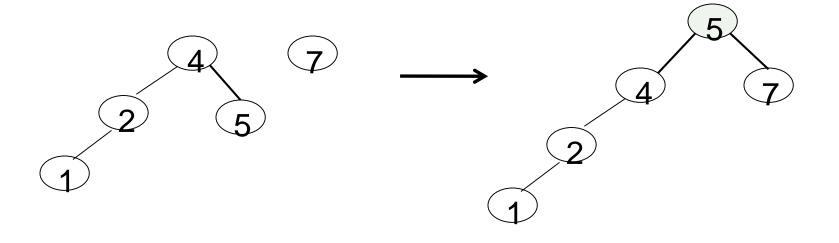
#### Delete Example



#### Splay Tree: Remove

Example: Remove 6







#### Do it yourself exercise

- ◆ Insert the keys 1, 2, ..., 7 in that order into an empty splay tree.(1~7까지 차례로 원소를 삽입하면 어떤 스플레이트리가 만들어지는가?)
- What happens when you access "3"?(Final exam)



#### 스플레이 트리

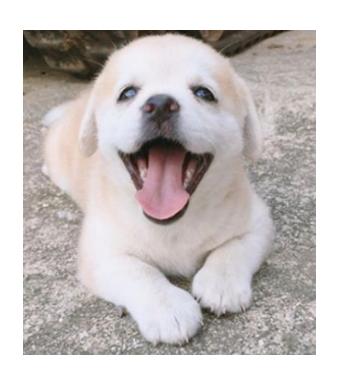
- ◆ 스플레이 트리의 시간 복잡도
  - ◆ 각 연산(탐색, 삽입, 삭제, 조인, 분할)은 O(logn) 상환 시간에 수행할 수 있음
  - ◆ 상환 시간(amortized time)
    - 일련의 연산 수행에서 시간이 많이 걸리는 연산의 시간을 적게 걸리는 연산에 전가시킨 뒤의 시간
    - 개개 연산의 최악의 경우에 걸리는 시간이 짧아짐
  - ◆ m번의 삽입, 삭제 연산을 수행 → O(mlogn) 상환 시간



#### Summary of Splay Trees

- Examples suggest that splaying causes tree to get balanced.
- Result of Analysis: Any sequence of M operations on a splay tree of size N takes O(M log N) time. So, the amortized running time for one operation is O(log N).
- This guarantees that even if the depths of some nodes get very large, you cannot get a long sequence of O(N) searches because each search operation causes a rebalance.
- Without splaying, total time could be O(MN).











감사합니다.

