

# **CSE 332**

**JULY 5<sup>TH</sup> – AVL TREES**

# **ASSORTED MINUTIAE**

- **P1 due at 11:30 PM tonight**

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  - Review in section Thursday

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- **EX05 due at 11:30 PM**
- **EX06 on AVL trees, out tonight**
- **Exam next Friday**
  - Review in section Thursday
  - Good review times?

# TODAY'S LECTURE

- **AVL Trees**
  - Balance
  - Implementation



# TODAY'S LECTURE

- **AVL Trees**
  - Balance
  - Implementation
- **Memory analysis**
  - Will discuss after AVL on Friday

# REVIEW

- **AVL Trees**

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  - BST trees with AVL property

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- BST trees with AVL property
- $\text{Abs}(\text{height}(\text{left}) - \text{height}(\text{right})) \leq 1$

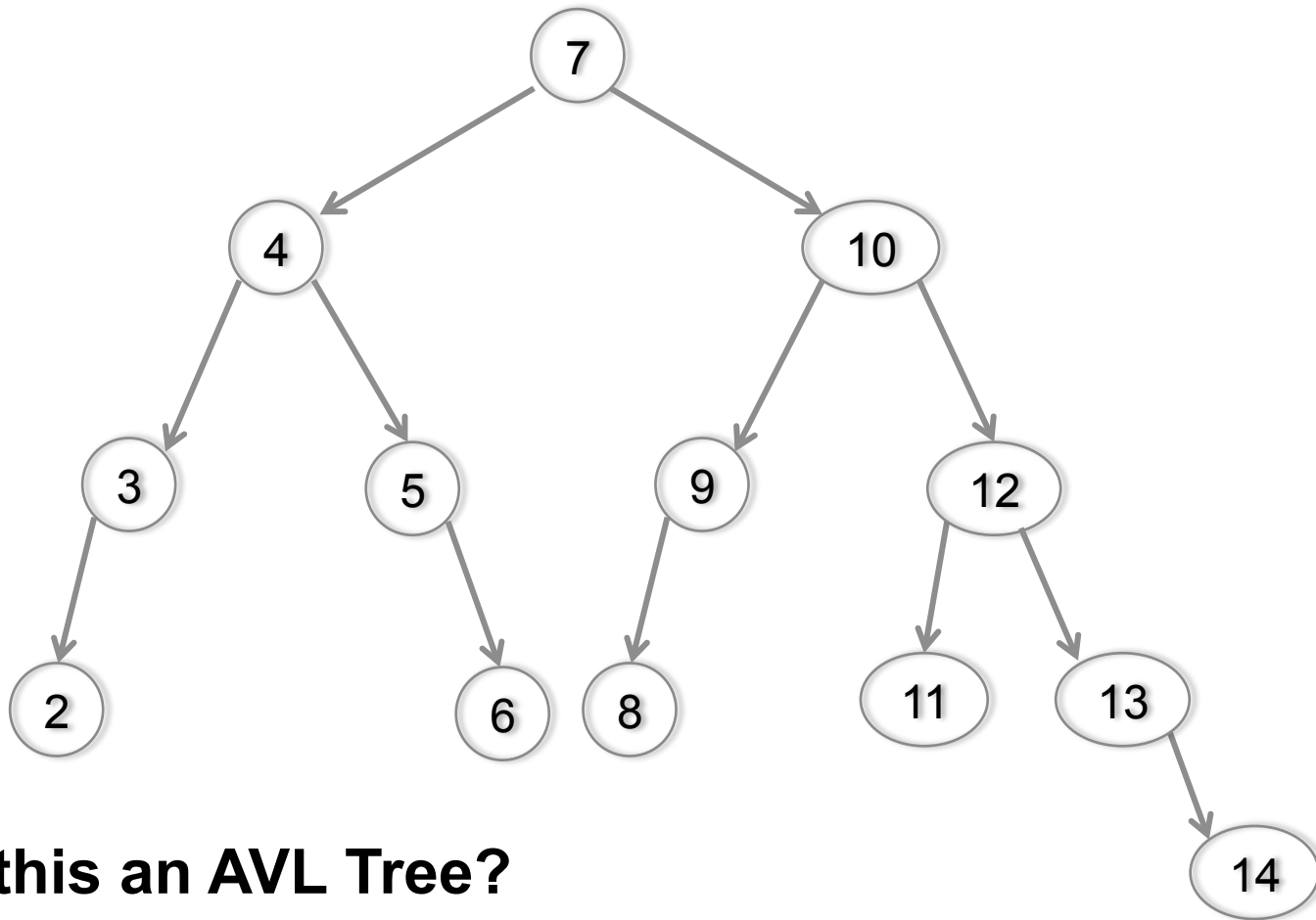
# REVIEW

- **AVL Trees**
  - BST trees with AVL property
  - $\text{Abs}(\text{height}(\text{left}) - \text{height}(\text{right})) \leq 1$
  - Heights of subtrees can differ by at most one

# REVIEW

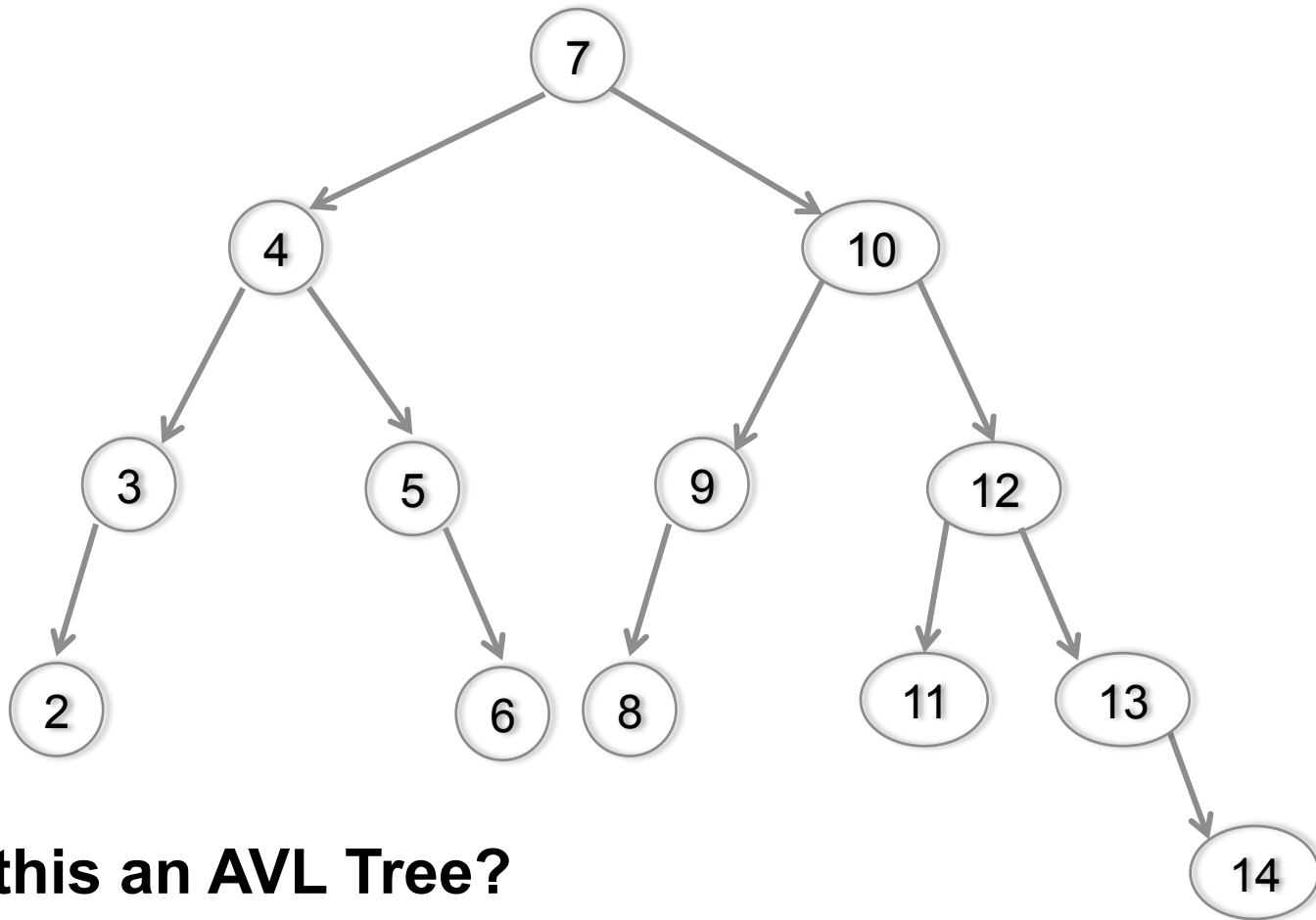
- **AVL Trees**
  - BST trees with AVL property
  - $\text{Abs}(\text{height}(\text{left}) - \text{height}(\text{right})) \leq 1$
  - Heights of subtrees can differ by at most one
  - This property must be preserved throughout the tree

# REVIEW



- Is this an AVL Tree?

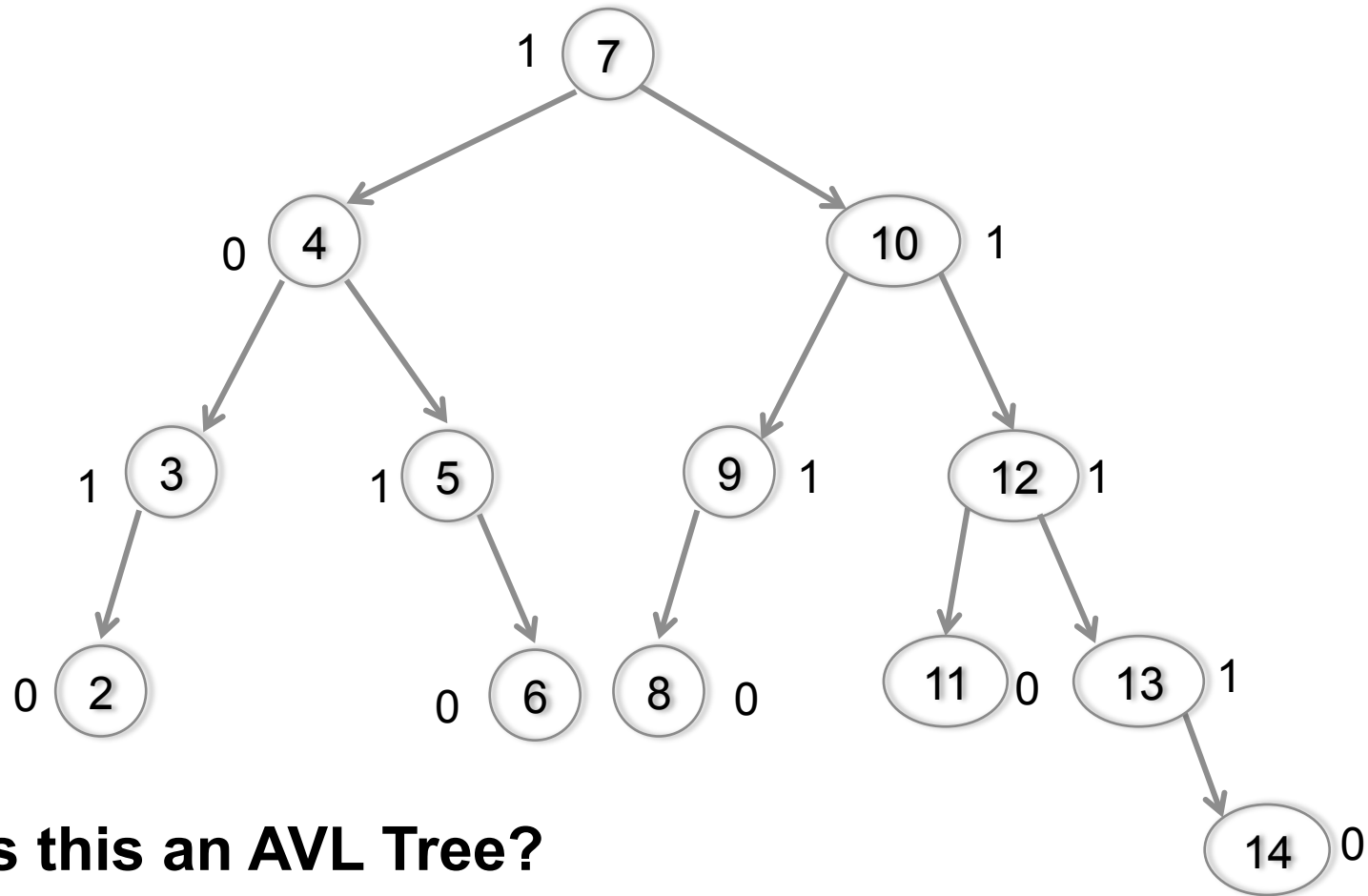
# REVIEW



- **Is this an AVL Tree?**
  - Calculate balance for each node

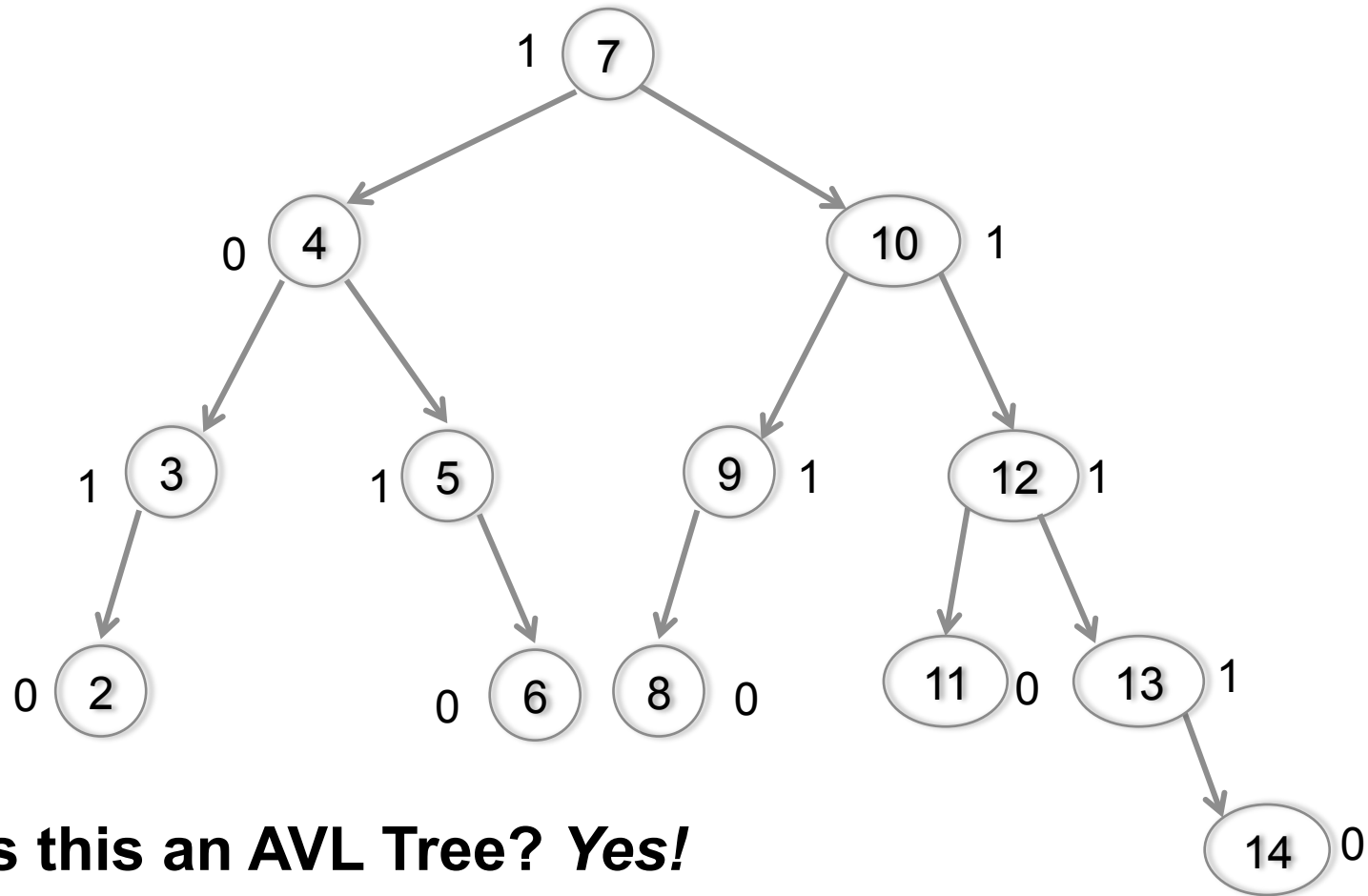


# REVIEW



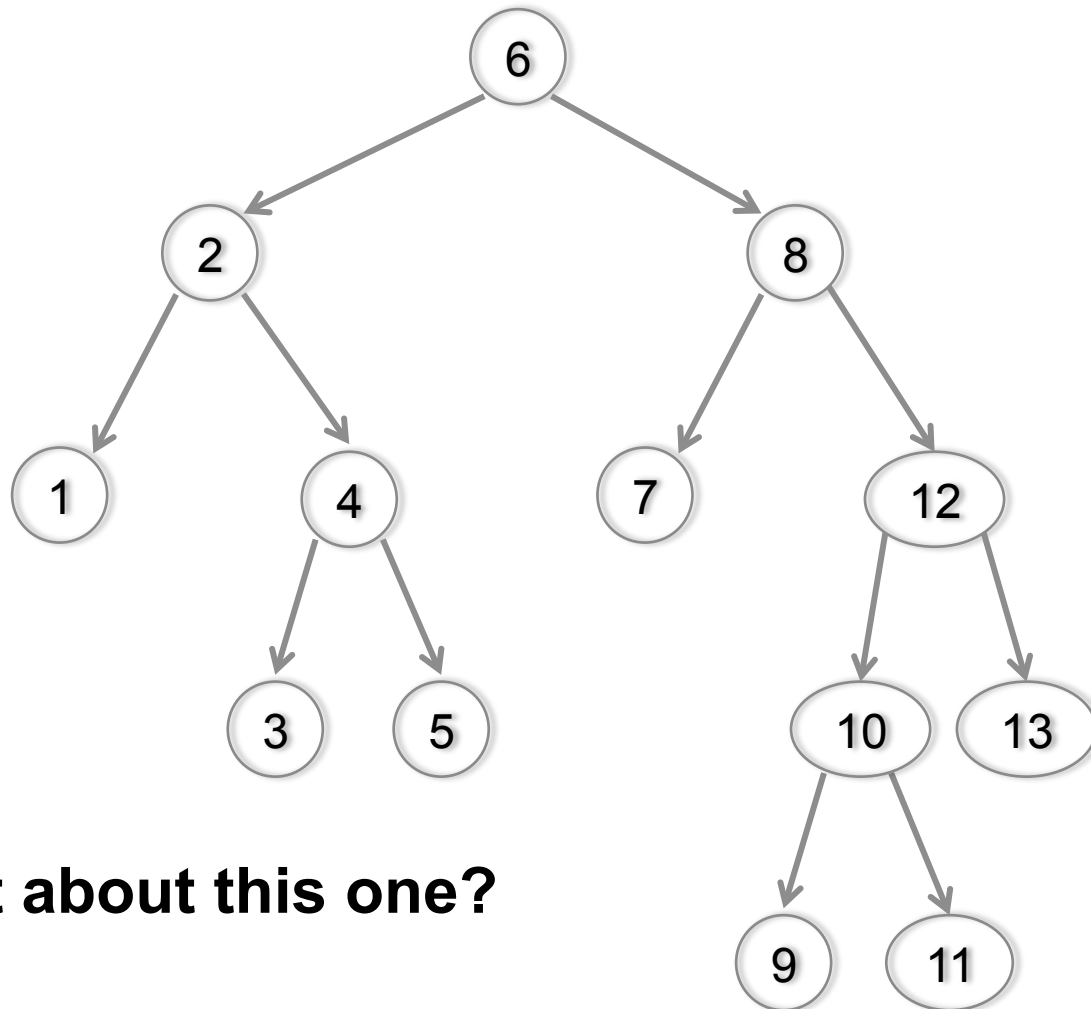
- **Is this an AVL Tree?**
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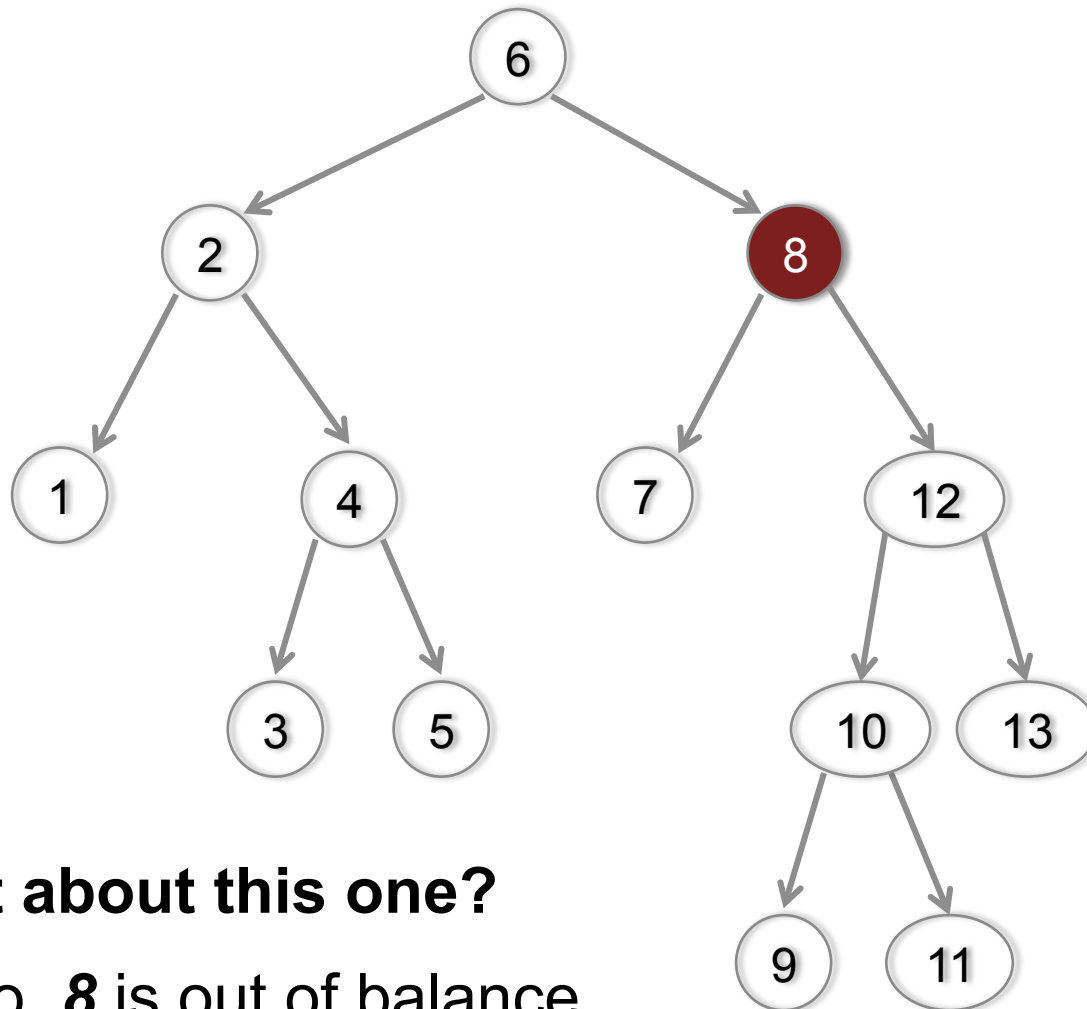
- **Is this an AVL Tree? Yes!**
  - Calculate balance for each node

# REVIEW



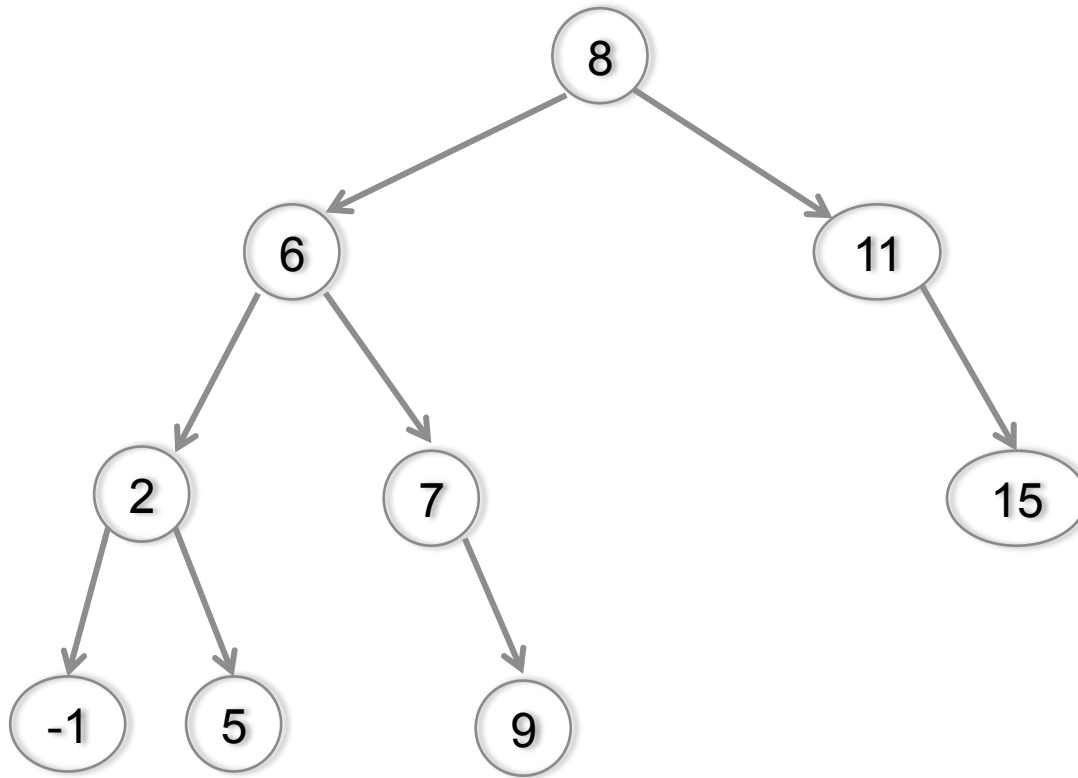
- **What about this one?**

# REVIEW



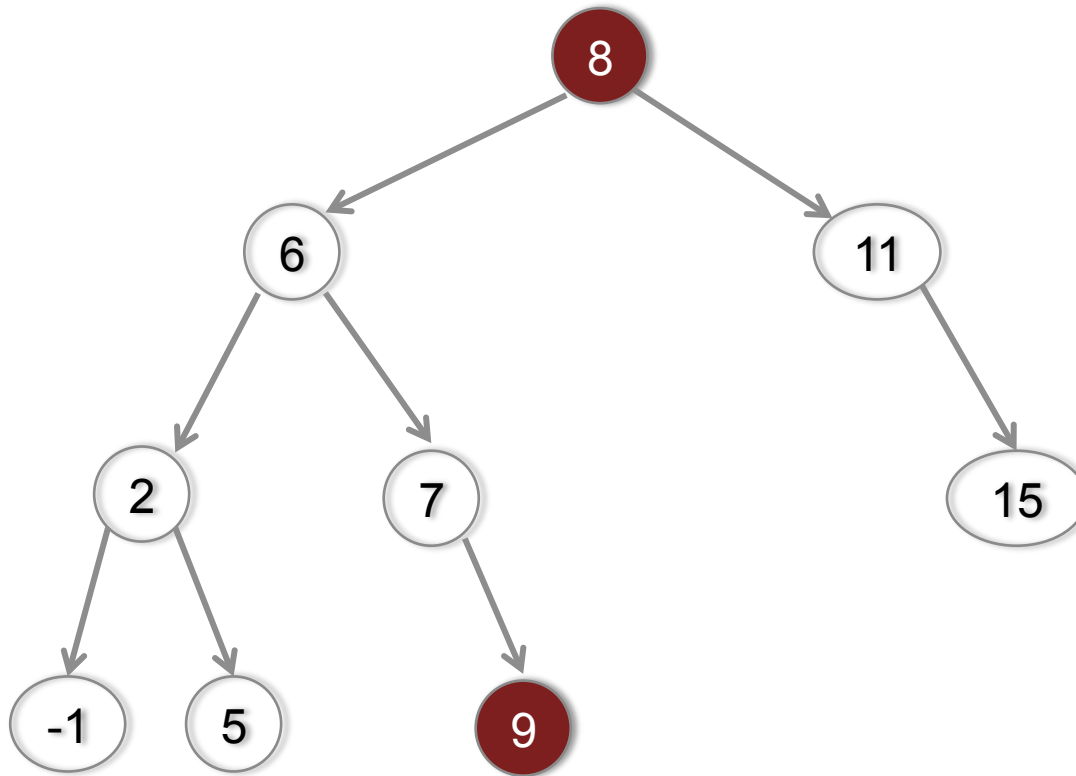
- **What about this one?**
  - No, **8** is out of balance

# REVIEW



- **Is this an AVL Tree?**

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- **Is this an AVL Tree?**
  - No, AVL trees must still maintain Binary Search

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  - If not, correct the tree



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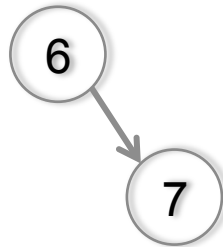
- **Insert(key k, value v):**
  - Insert the key value pair into the dictionary
  - Verify that balance is maintained
  - If not, correct the tree
- **How do we correct the tree?**

# AVL INSERT

6

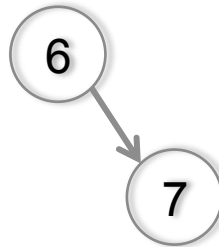
- **Start with the single root**

# AVL INSERT



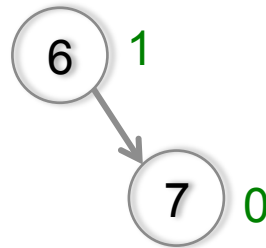
- **Add 7 to the tree**

# AVL INSERT



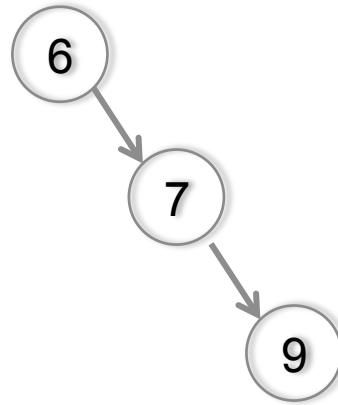
- **Add 7 to the tree. Is balance preserved?**

# AVL INSERT



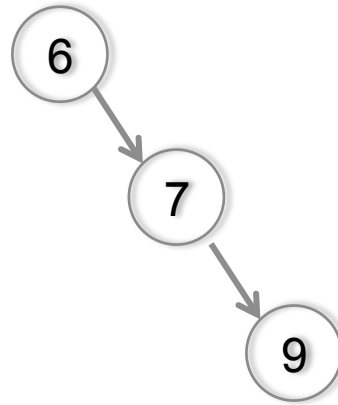
- **Add 7 to the tree. Is balance preserved?**
  - Yes

# AVL INSERT



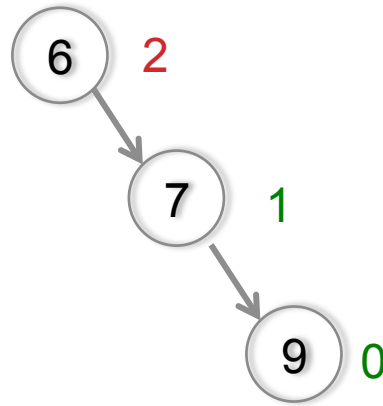
- **Add 9 to the tree**

# AVL INSERT



- **Add 9 to the tree. Is balance preserved?**

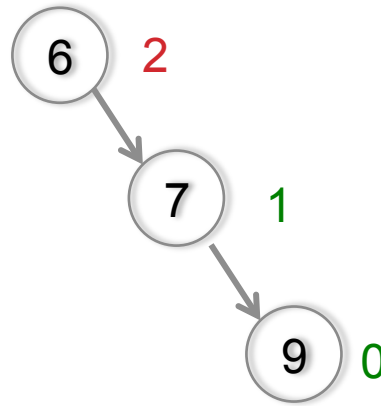
# AVL INSERT



- **Add 9 to the tree. Is balance preserved?**
  - No.

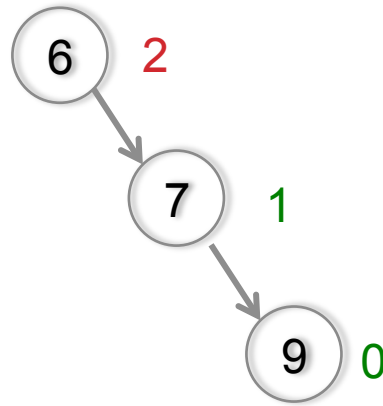


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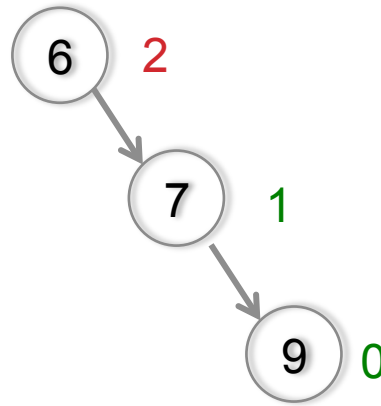
- How do we correct this imbalance?

# AVL INSERT



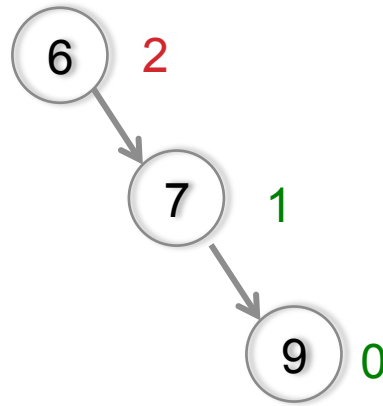
- **How do we correct this imbalance?**
  - Important to preserve binary search

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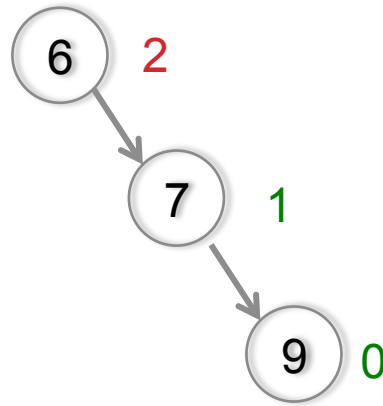
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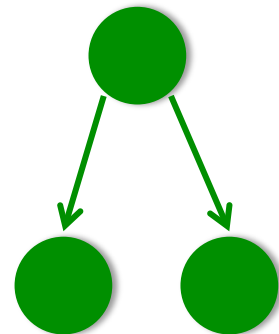


- What shape do we want?

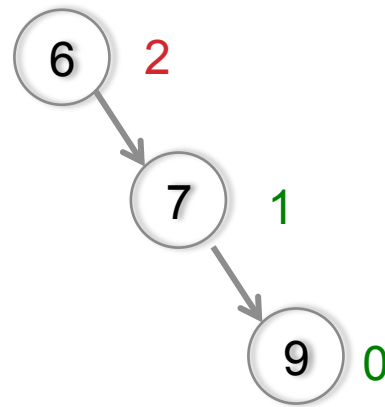
# AVL INSERT



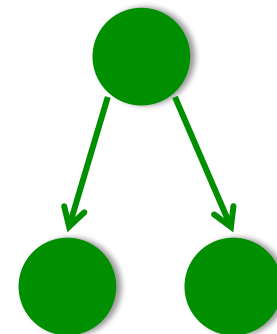
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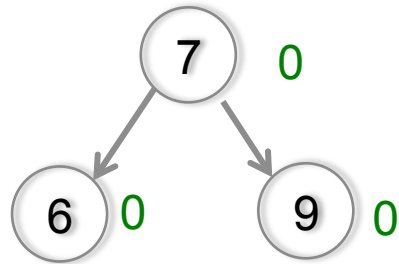
# AVL INSERT



- **What shape do we want?**
  - What then do we have as the root?



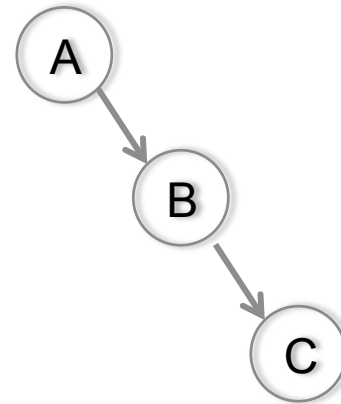
# AVL INSERT



- **Since 7 must be the root, we “rotate” that node into position.**

# AVL “ROTATION”

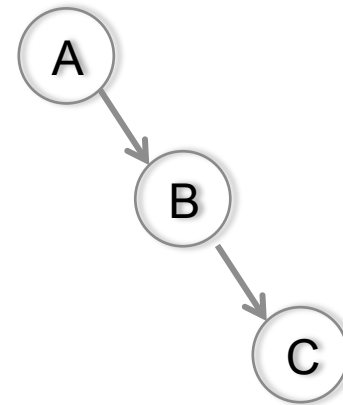
- **To correct this case:**
  - B must become the root





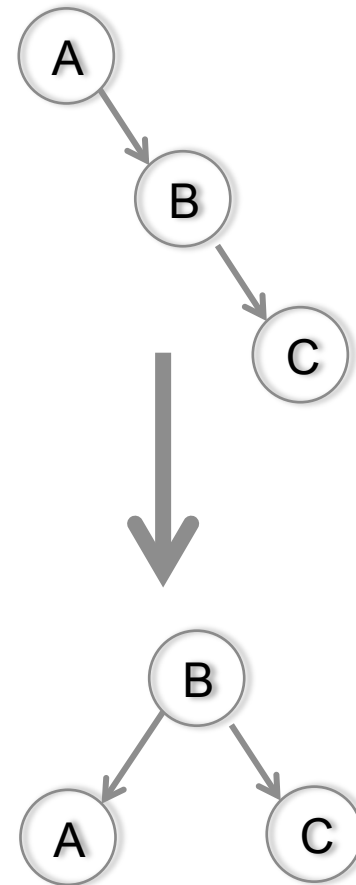
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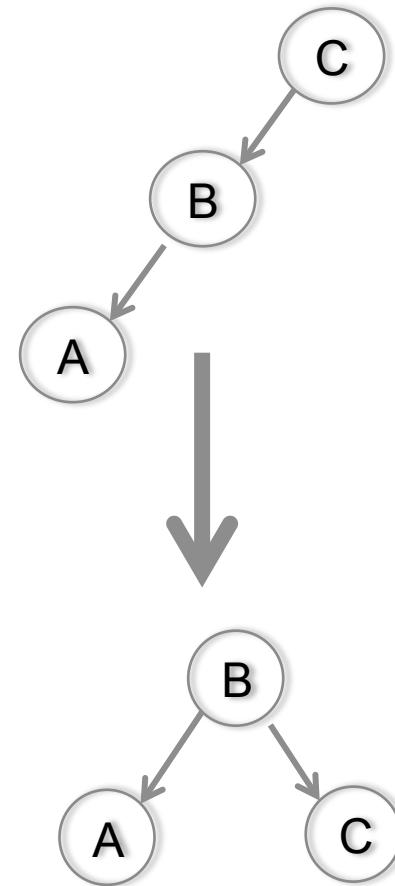
- **To correct this case:**
  - B must become the root
  - We rotate B to the root position
  - A becomes the left child of B





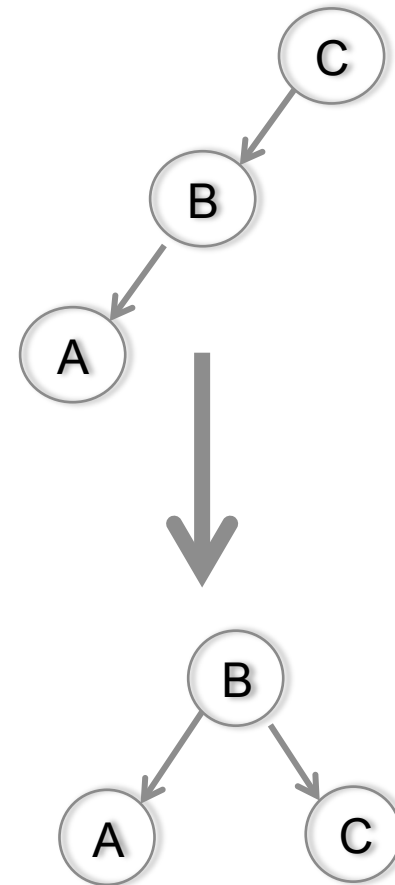
# AVL “ROTATION”

- Right rotation



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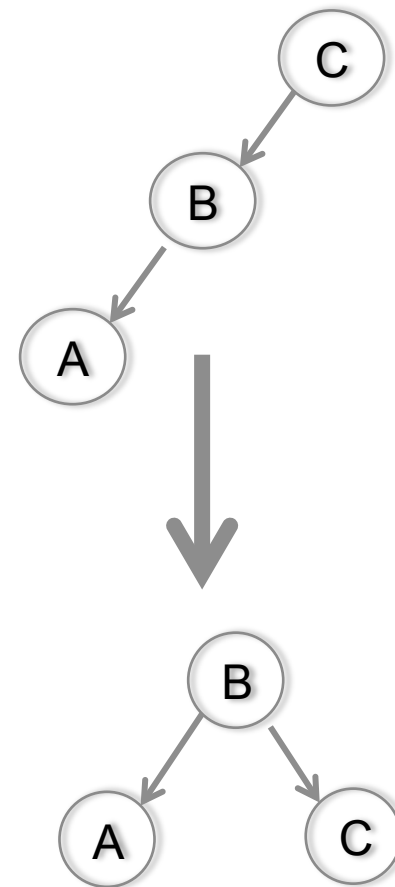
- **Right rotation**
  - Symmetric concept



# AVL “ROTATION”

- **Right rotation**

- Symmetric concept
- B must become the new root



# AVL “ROTATION”

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  - In general, this rotation occurs when an addition is made to the right-right or left-left grandchild

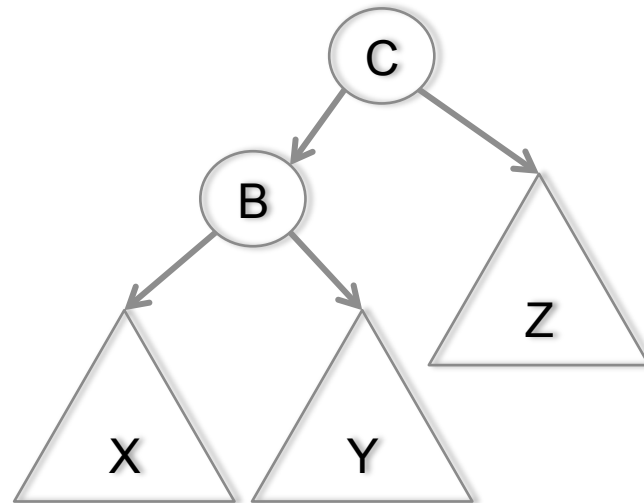


# AVL “ROTATION”

- **These are the “single” rotations**
  - In general, this rotation occurs when an addition is made to the right-right or left-left grandchild
  - **The balance might not be off on the parent! An insert might upset balance up the tree**

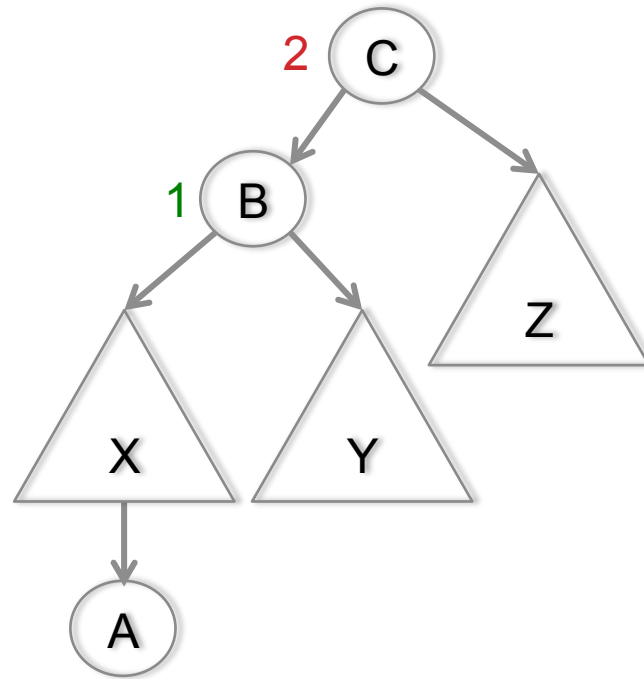
# AVL “ROTATION”

- **General case**
  - Suppose this tree is balanced,  $\{X, Y, Z\}$  all have the same height



# AVL “ROTATION”

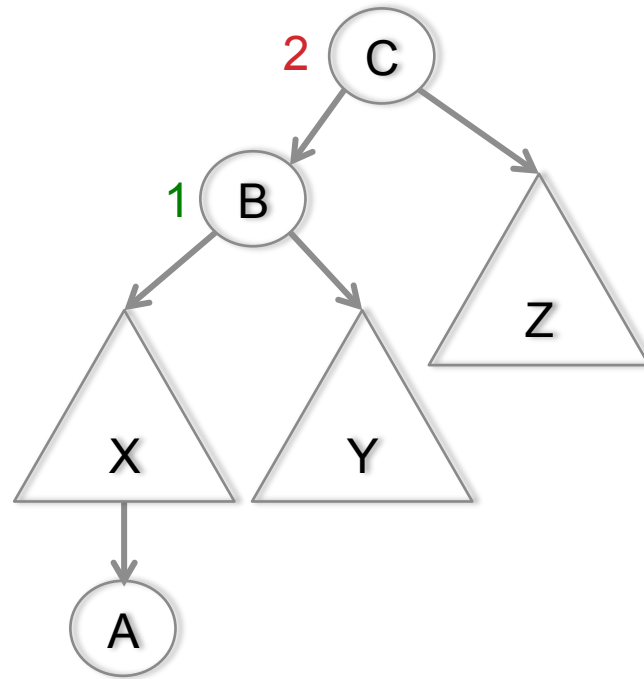
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- **General case**

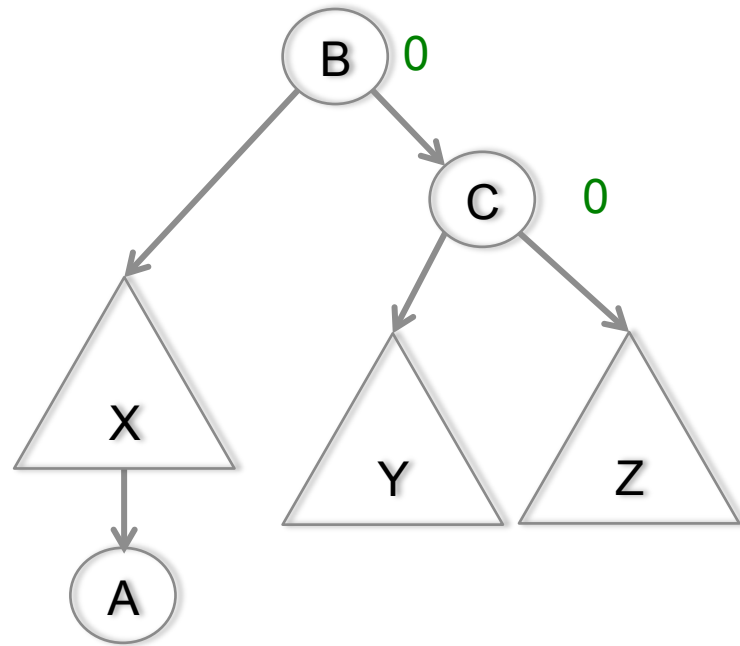
- Suppose this tree is balanced,  $\{X, Y, Z\}$  all have the same height
- Adding A, puts C out of balance
- Rotate B up and pass the Y subtree to C



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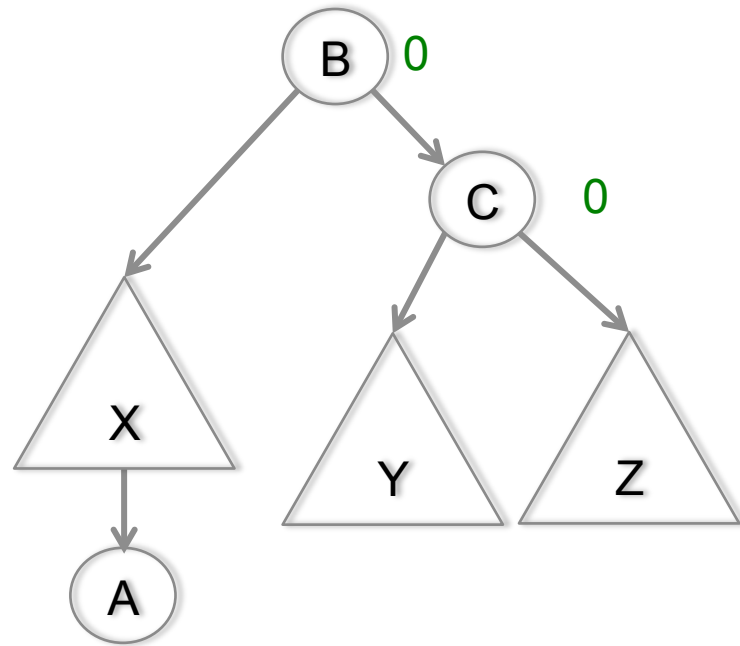
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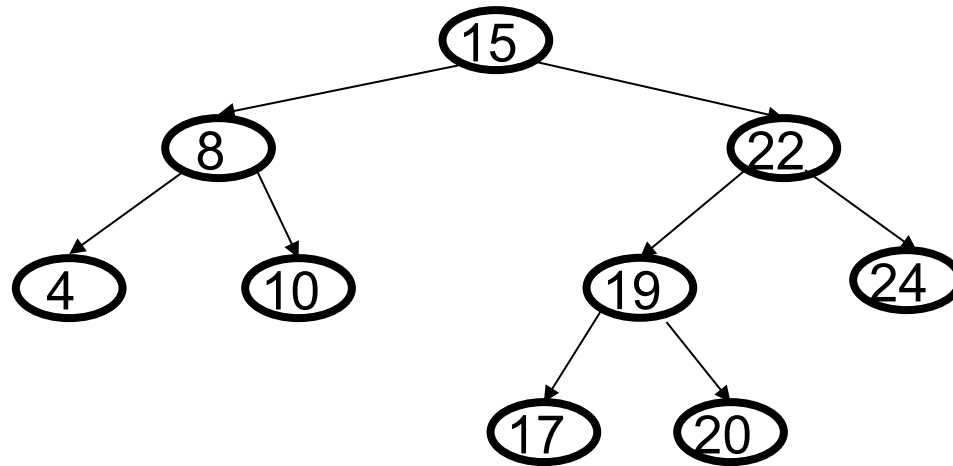
# AVL “ROTATION”

- **General case**

- Suppose this tree is balanced, {X,Y,Z} all have the same height
- Adding A, puts C out of balance
- Rotate B up and pass the Y subtree to C
- **Perform this rotation at the lowest point of imbalance**

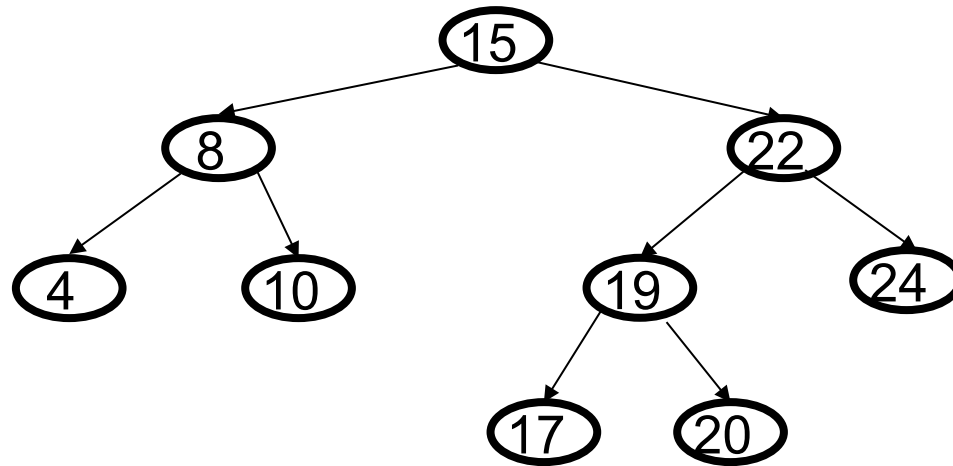


# SINGLE ROTATION EXAMPLE



- Consider the above tree

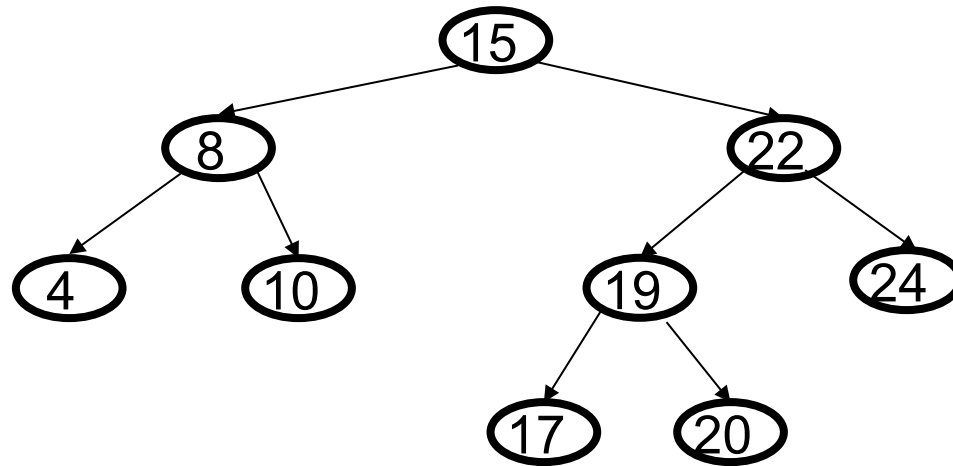
# SINGLE ROTATION EXAMPLE



- **Consider the above tree**
  - Is it an AVL tree?

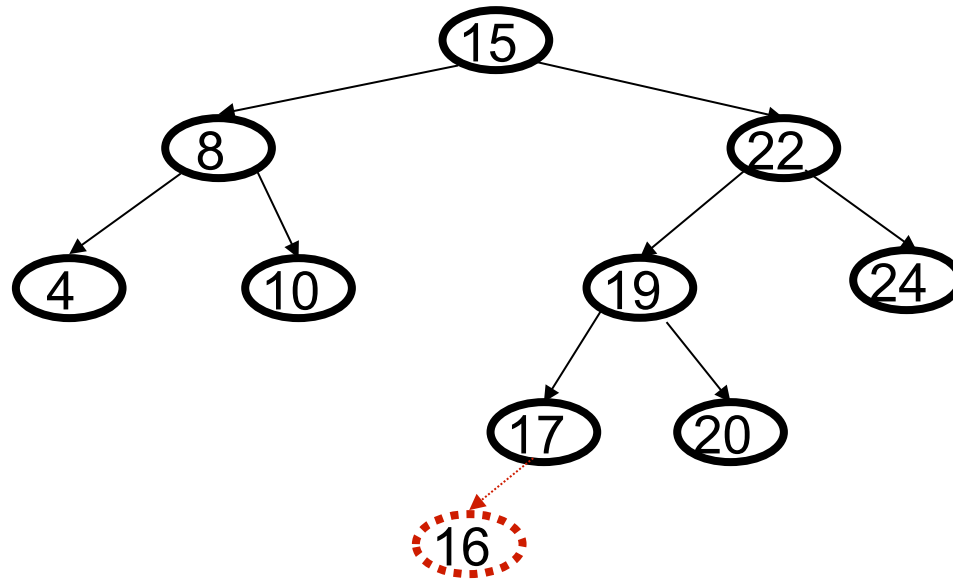


# SINGLE ROTATION EXAMPLE



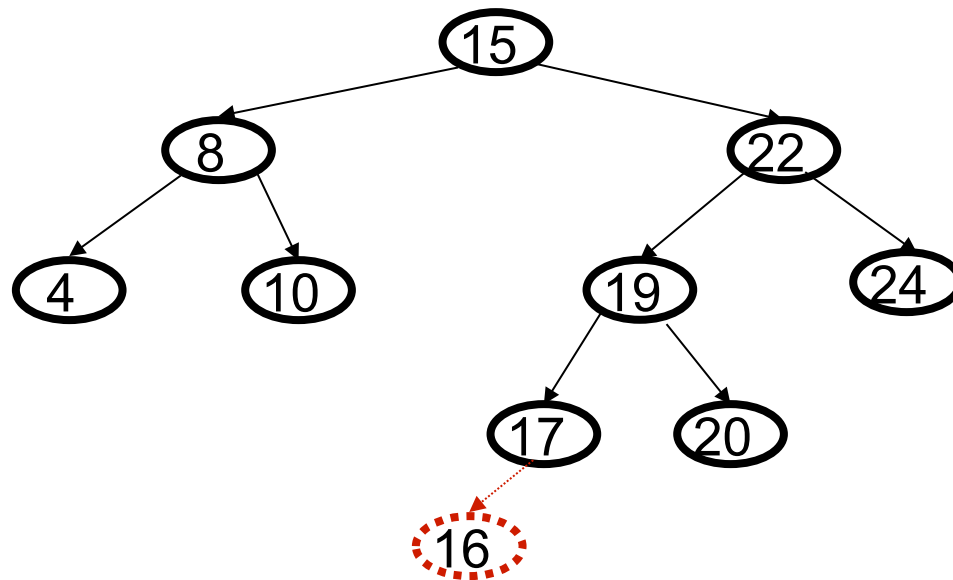
- **Consider the above tree**
  - Is it an AVL tree? *Yes*

# SINGLE ROTATION EXAMPLE



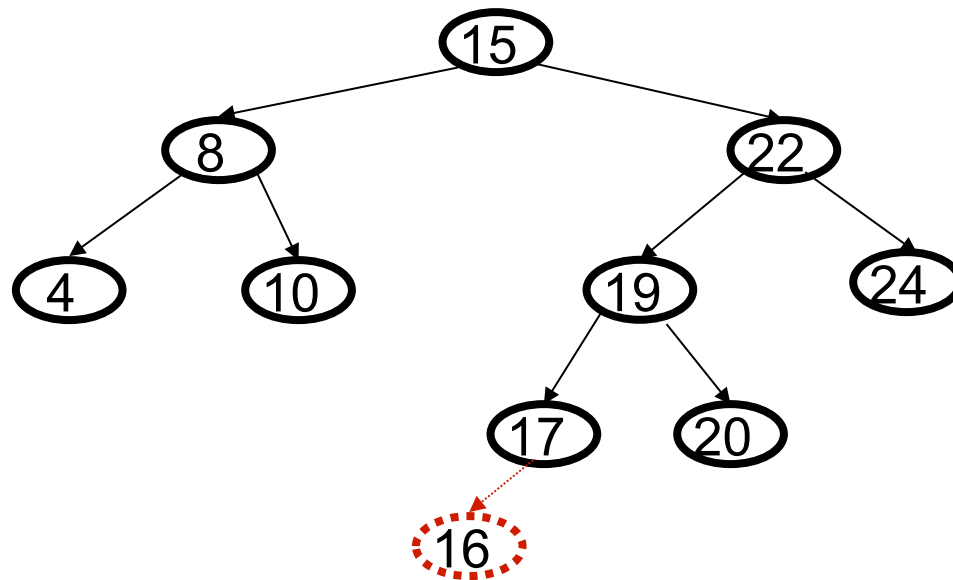
- Add 16 to the tree

# SINGLE ROTATION EXAMPLE



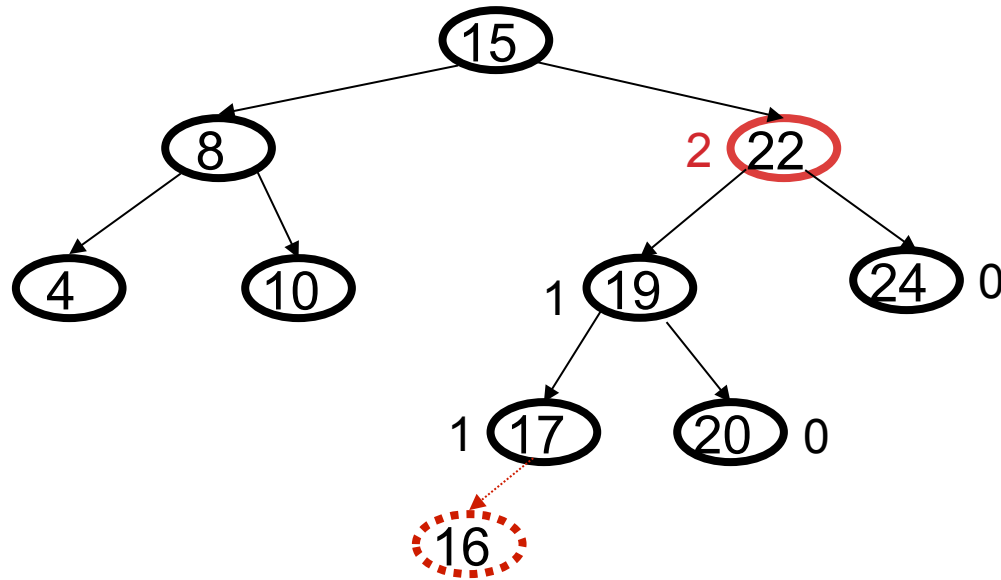
- **Add 16 to the tree**
  - Is it unbalanced now?

# SINGLE ROTATION EXAMPLE



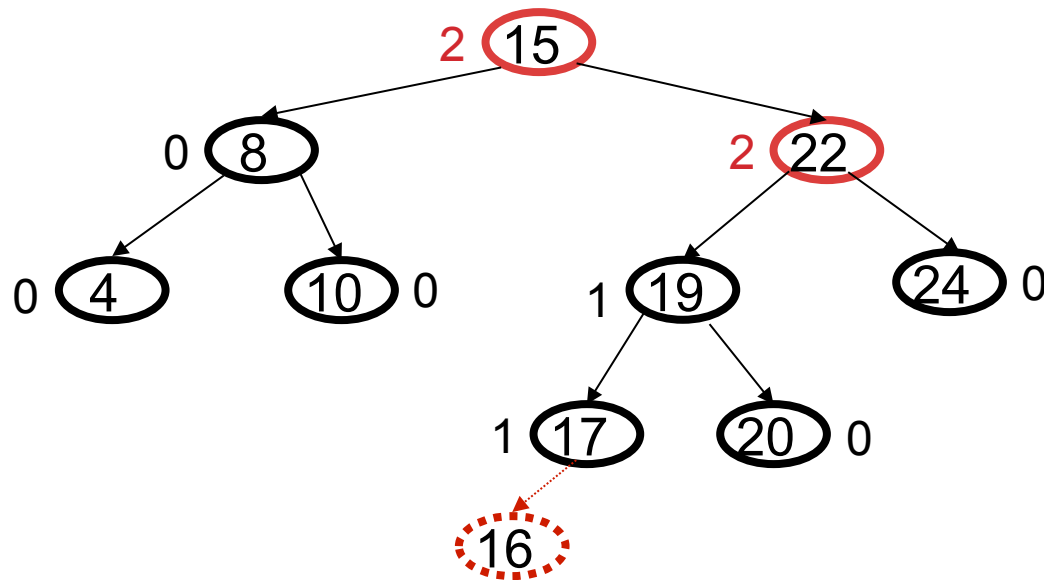
- **Add 16 to the tree**
  - Is it unbalanced now? Where?

# SINGLE ROTATION EXAMPLE



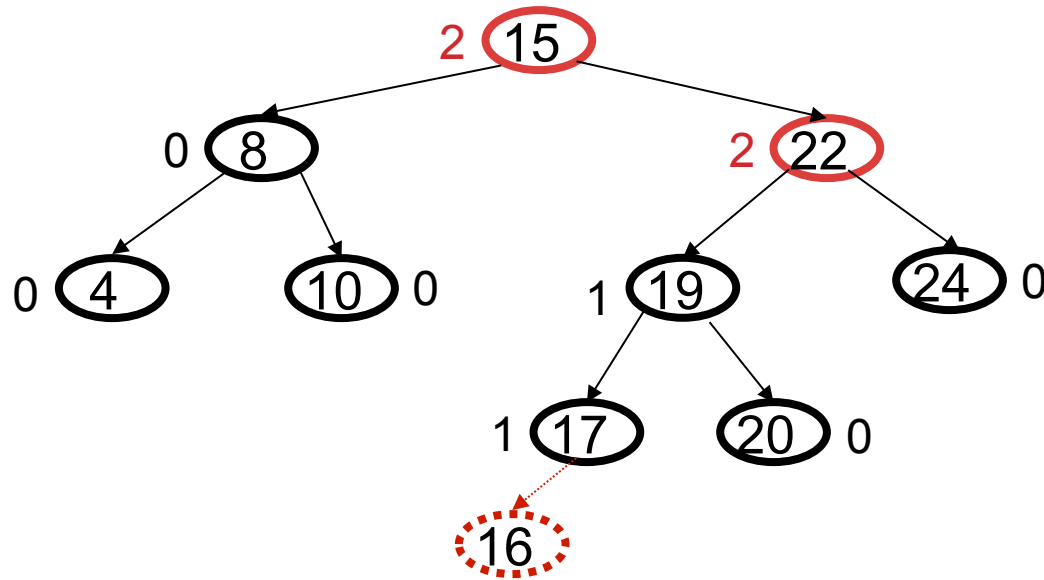
- **Add 16 to the tree**
  - Is it unbalanced now? Where? **22**

# SINGLE ROTATION EXAMPLE



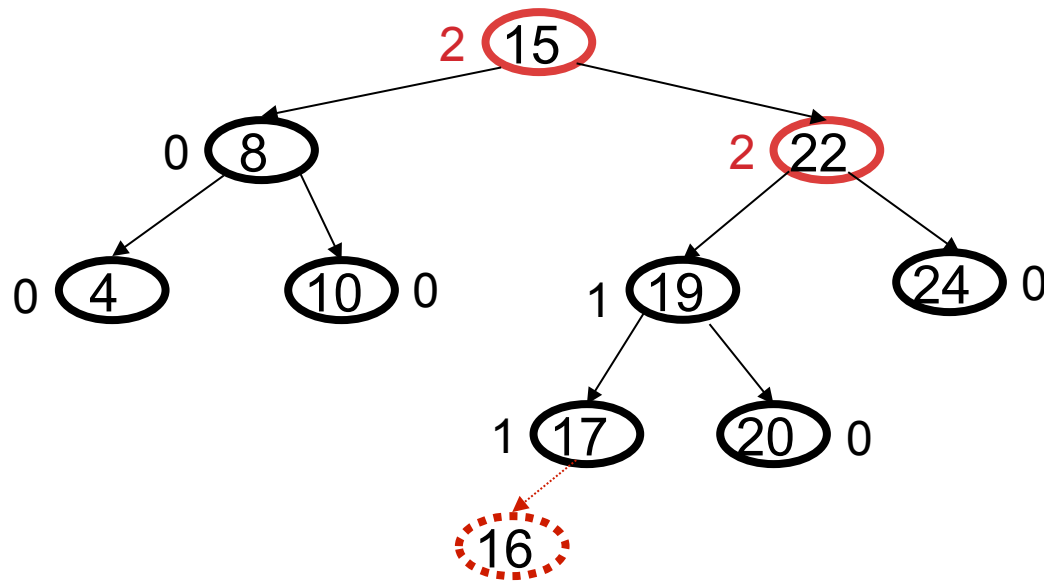
- **Add 16 to the tree**
  - Is it unbalanced now? Where? **22**
  - Also at 15, but we choose the lowest point

# SINGLE ROTATION EXAMPLE



- Perform the rotation around 22

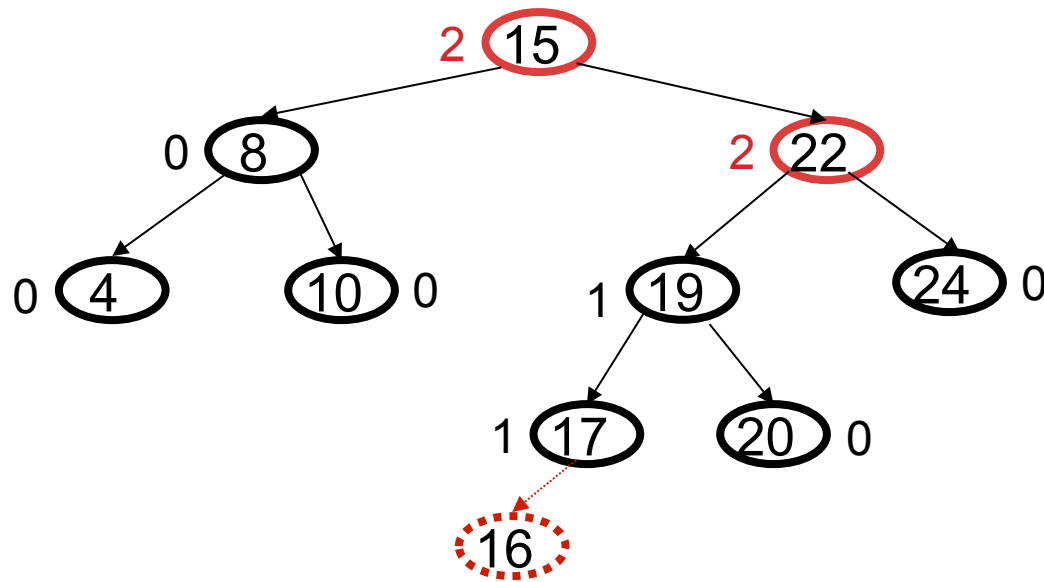
# SINGLE ROTATION EXAMPLE



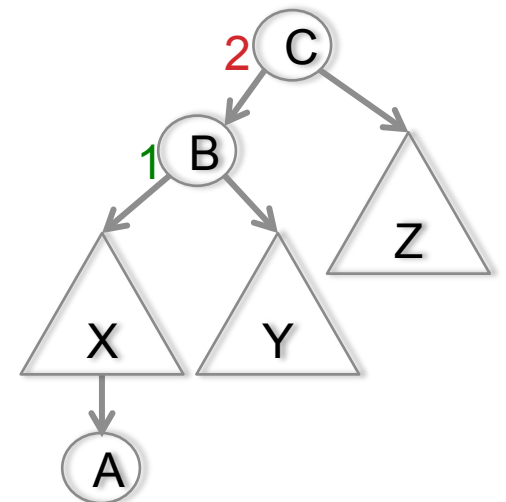
- **Perform the rotation around 22**
  - What rotation takes place?



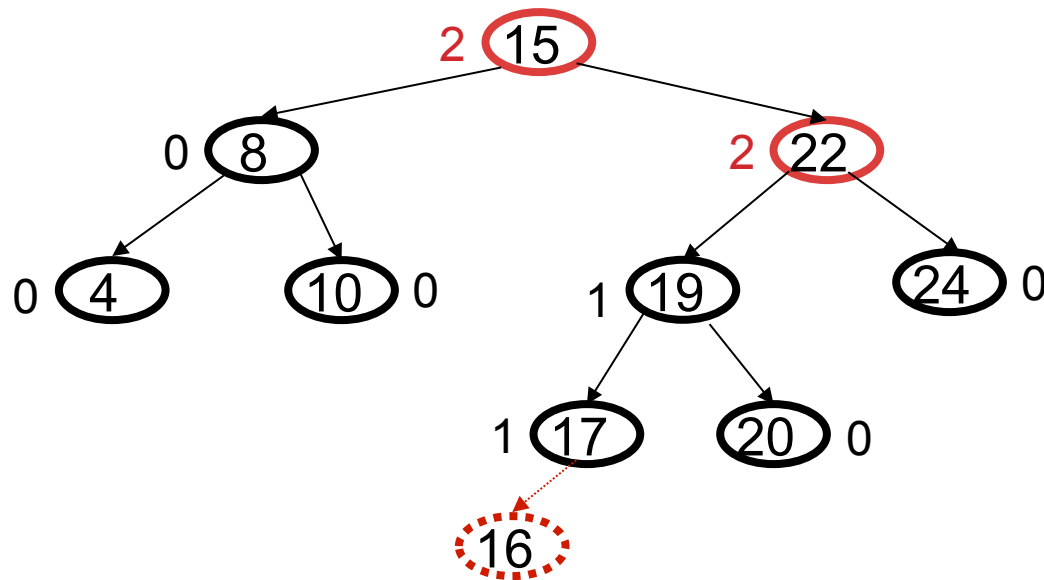
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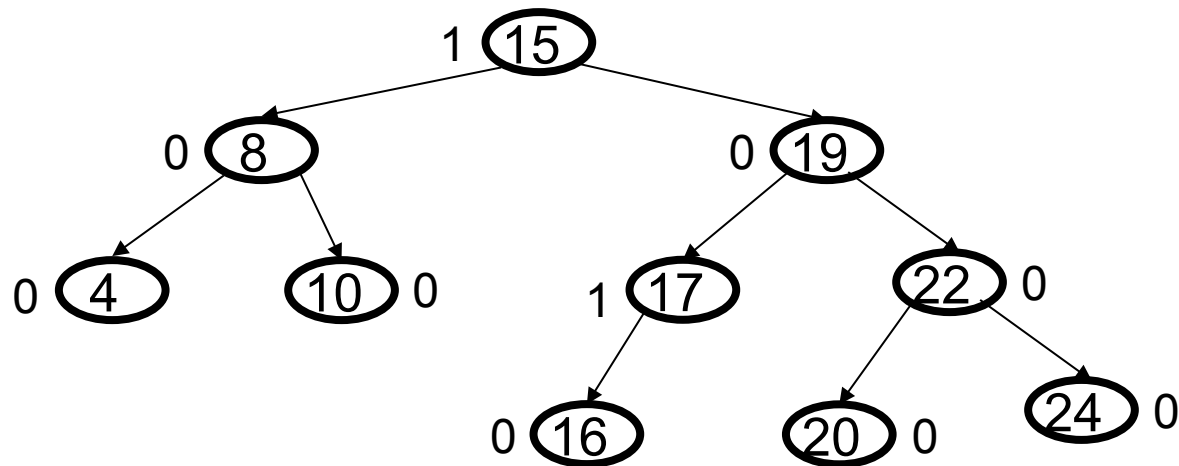


# SINGLE ROTATION EXAMPLE



- **Perform the rotation around 22**
  - What rotation takes place?
  - What is the resulting tree?

# SINGLE ROTATION EXAMPLE



- **19 must move up to where 22 was**
  - 20 changes parents
  - Balances are recomputed throughout the tree

# AVL “ROTATION”

- **These two rotations (right-right and left-left) are symmetric and can be solved the same way**

# AVL “ROTATION”

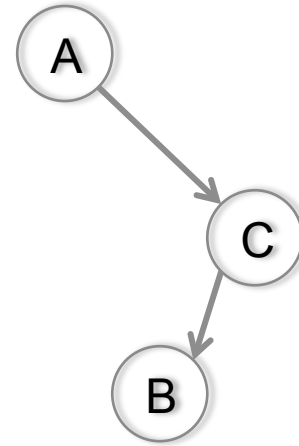
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# AVL “ROTATION”

- **These two rotations (right-right and left-left) are symmetric and can be solved the same way**
  - Named by the location of the added node relative to the unbalanced node
  - What are the other two cases?

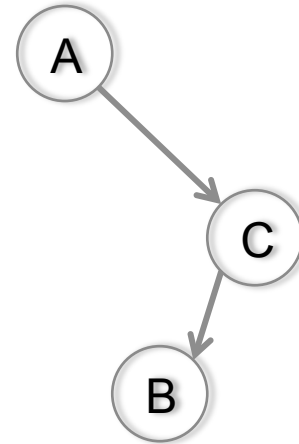
# AVL “ROTATION”

- Right left case



# AVL “ROTATION”

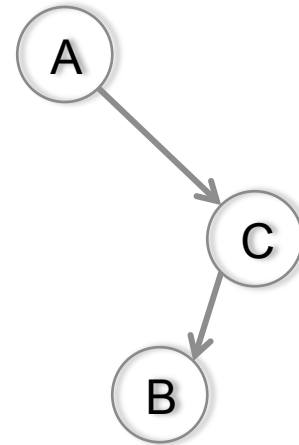
- **Right left case**
  - Again, A is out of balance





# AVL “ROTATION”

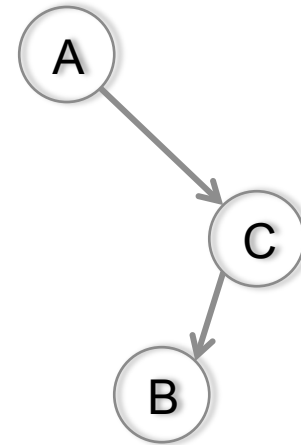
- **Right left case**
  - Again, A is out of balance
  - This time, the addition (B) comes between A and C



# AVL “ROTATION”

- **Right left case**

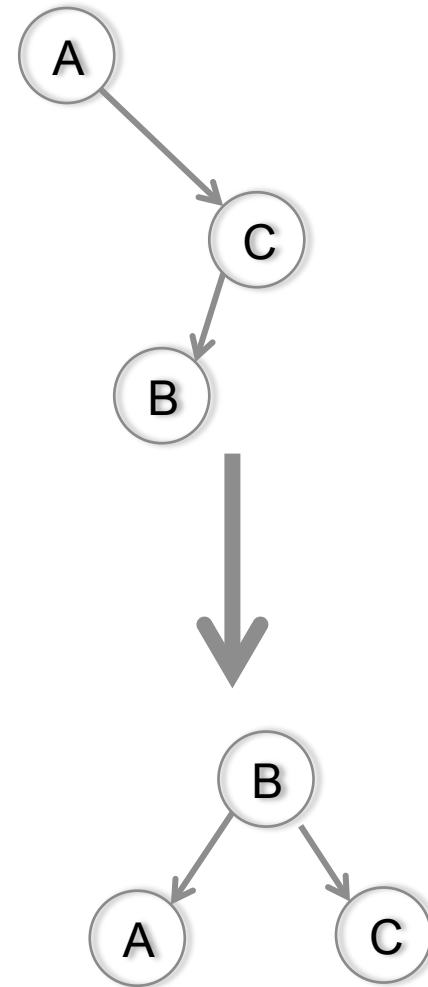
- Again, A is out of balance
- This time, the addition (B) comes between A and C
- In this case, the grandchild must become the root.



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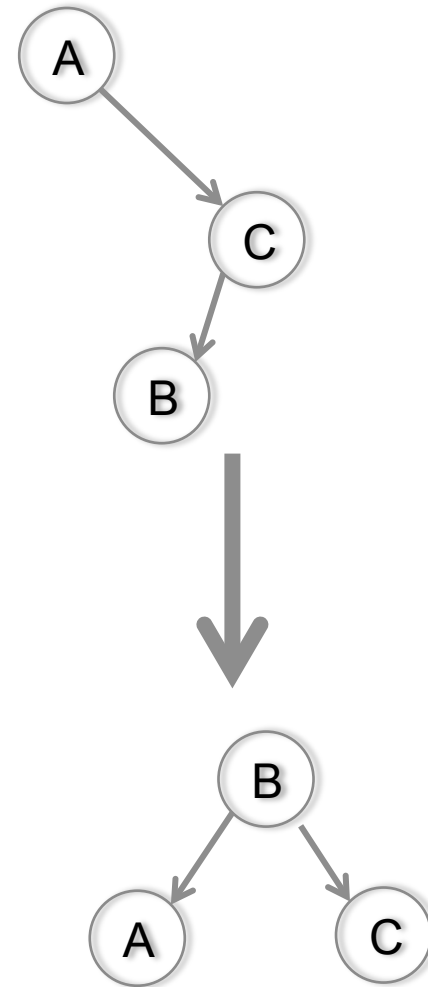
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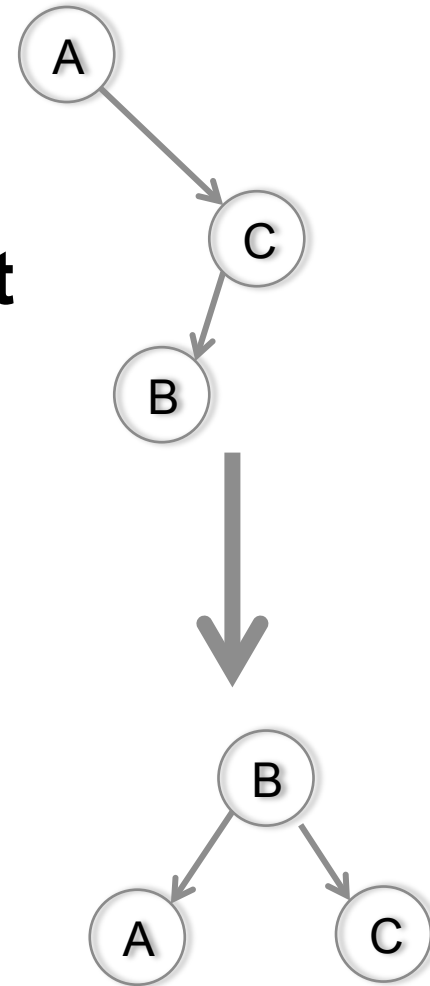
# AVL “ROTATION”

- Identifying what should be the new root is key



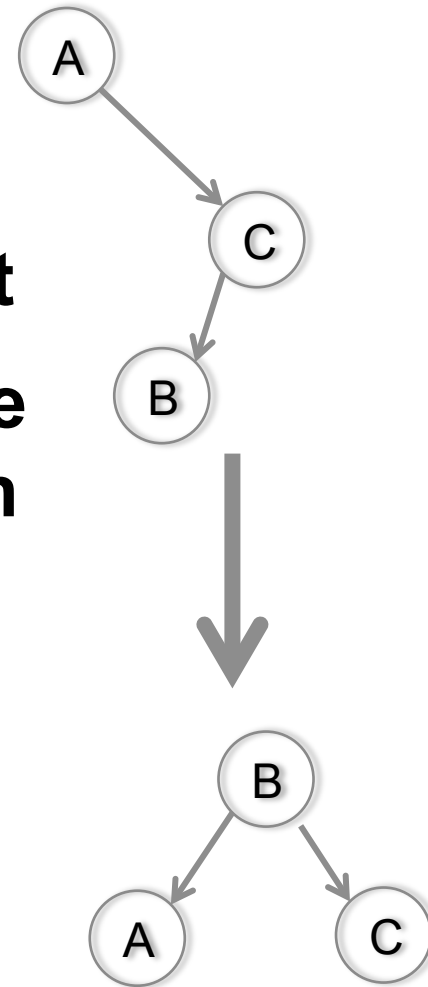
# AVL “ROTATION”

- Identifying what should be the new root is key
- Imagine “lifting” up the root



# AVL “ROTATION”

- Identifying what should be the new root is key
- Imagine “lifting” up the root
- Where will the children have to go to maintain the search property?

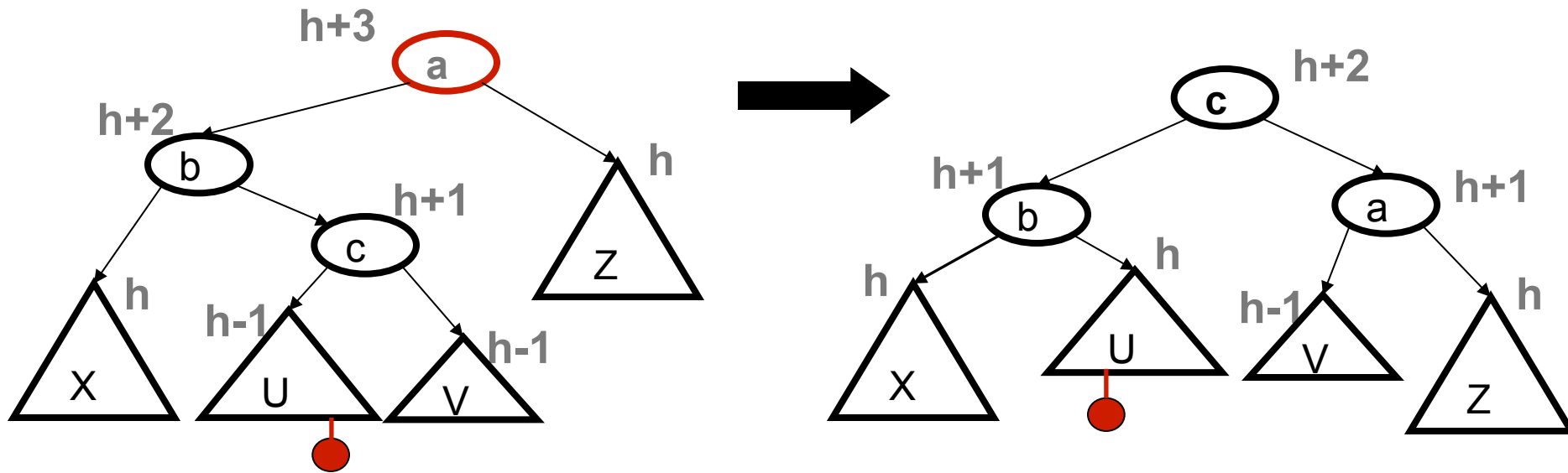


# AVL “ROTATION”

- I apologize for what you are about to see...

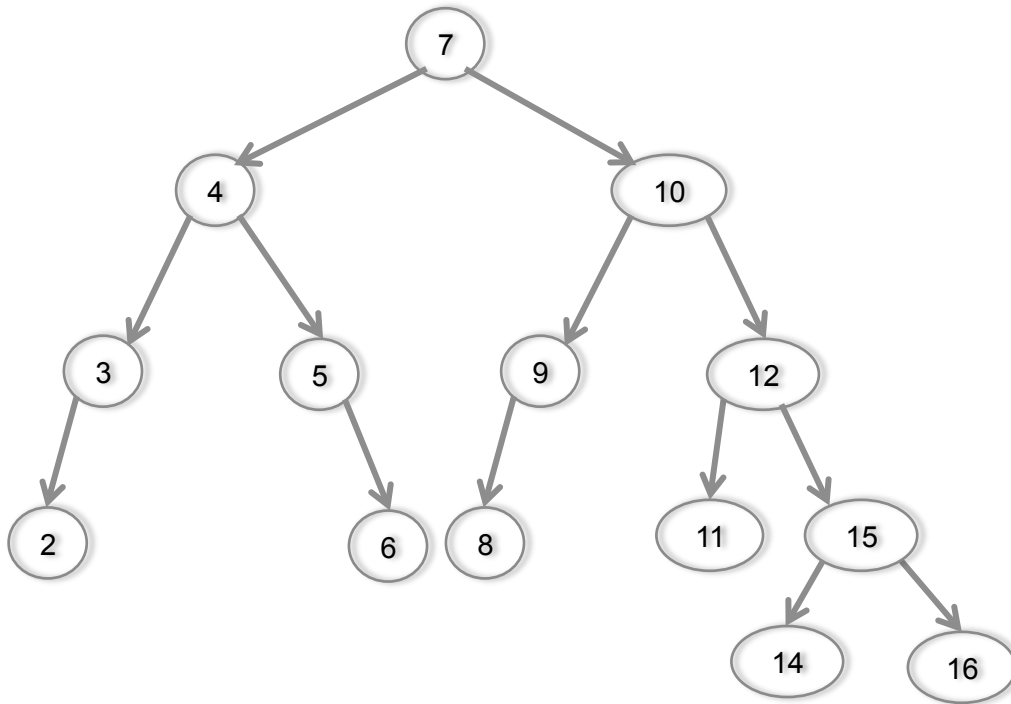
# AVL “ROTATION”

- This is for your reference later.



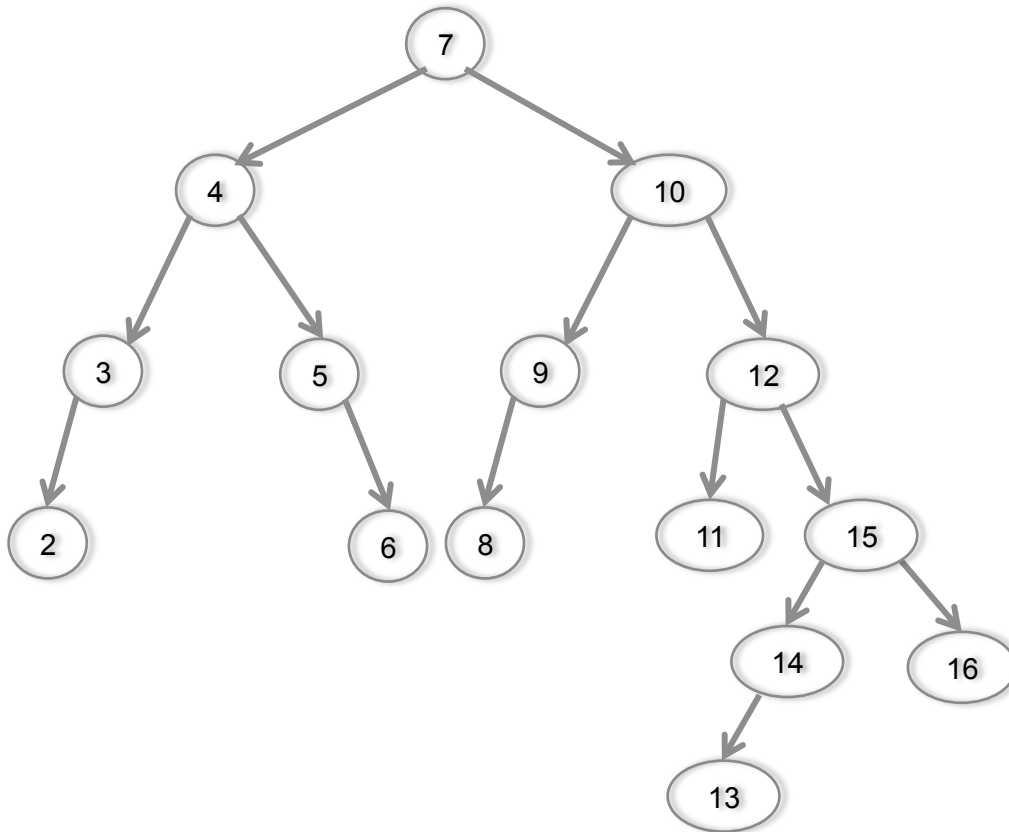


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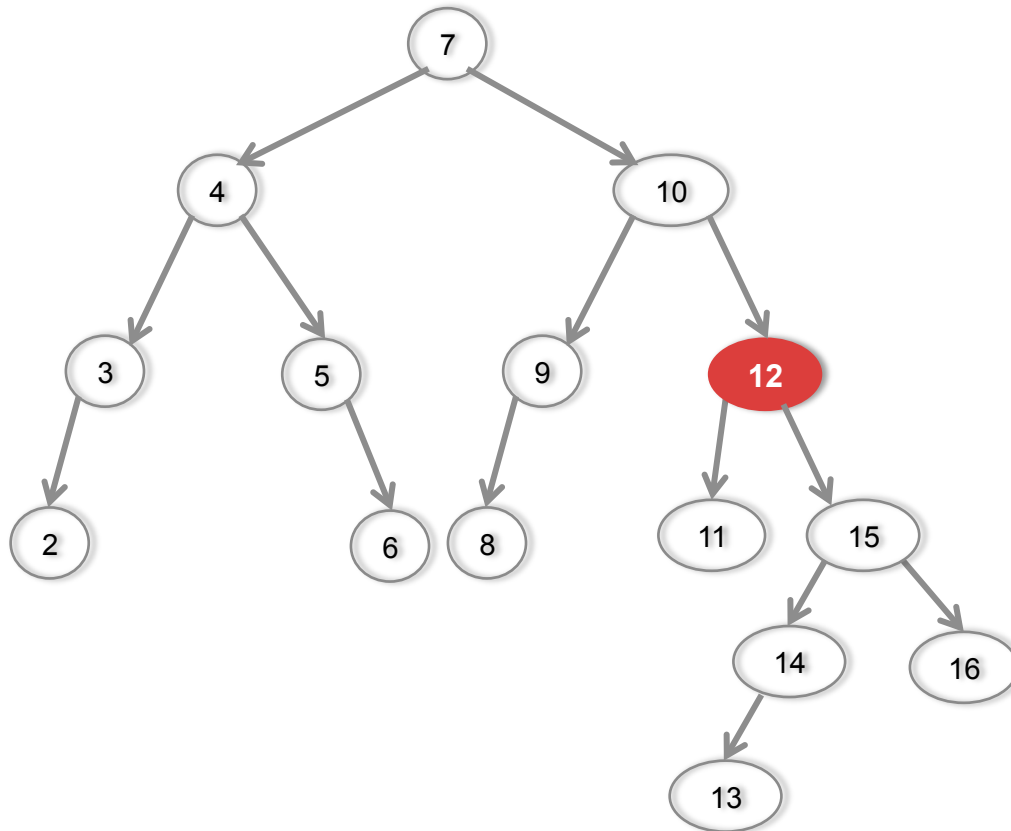
- **Let's do an example. Insert(13)**

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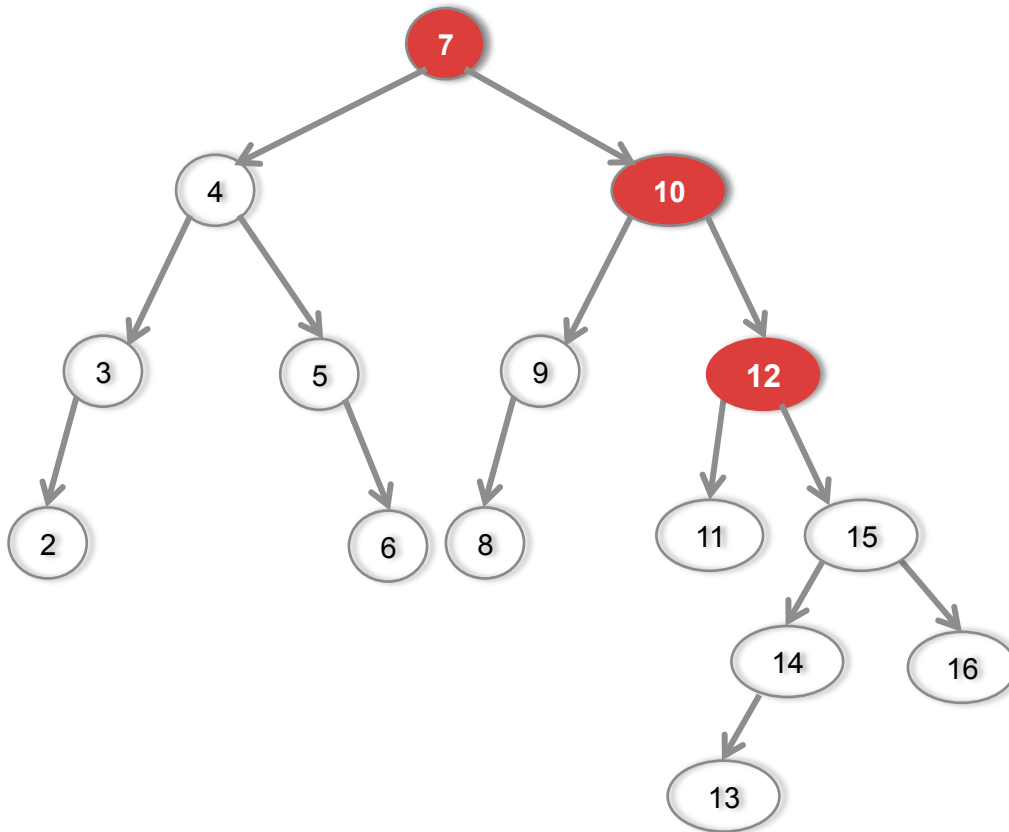
- **Where is the imbalance?**

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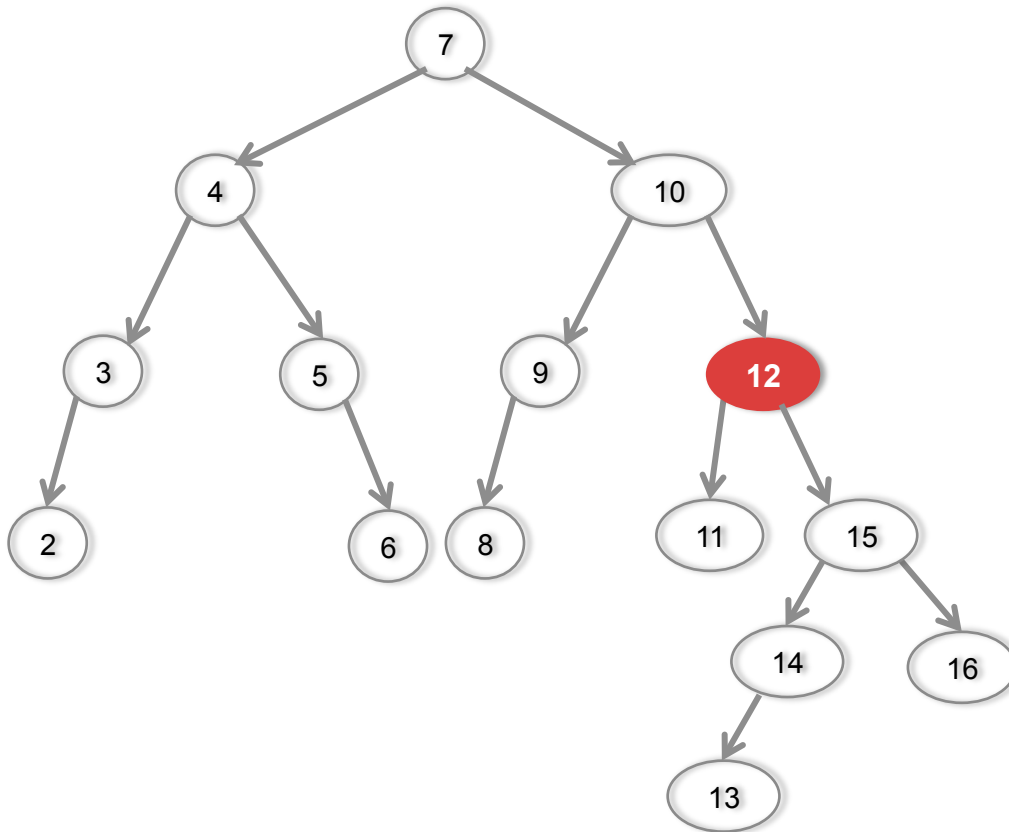
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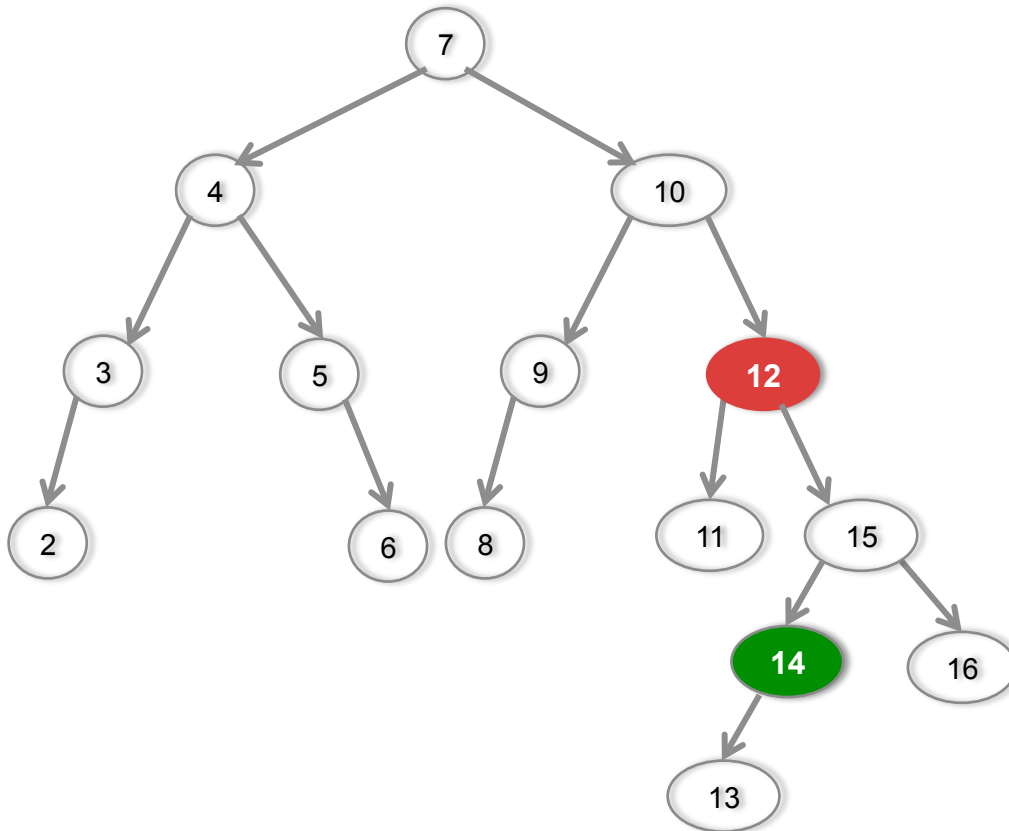
- **Where is the imbalance?** (also 7 and 10)

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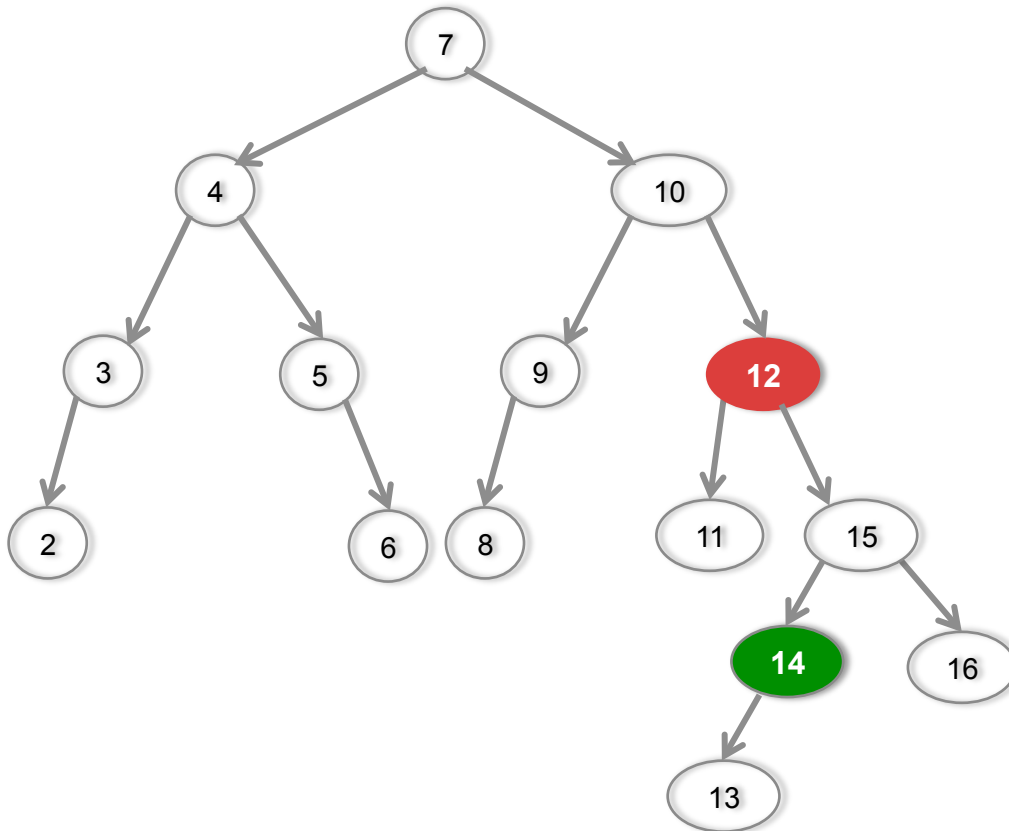
- What must be the new root?

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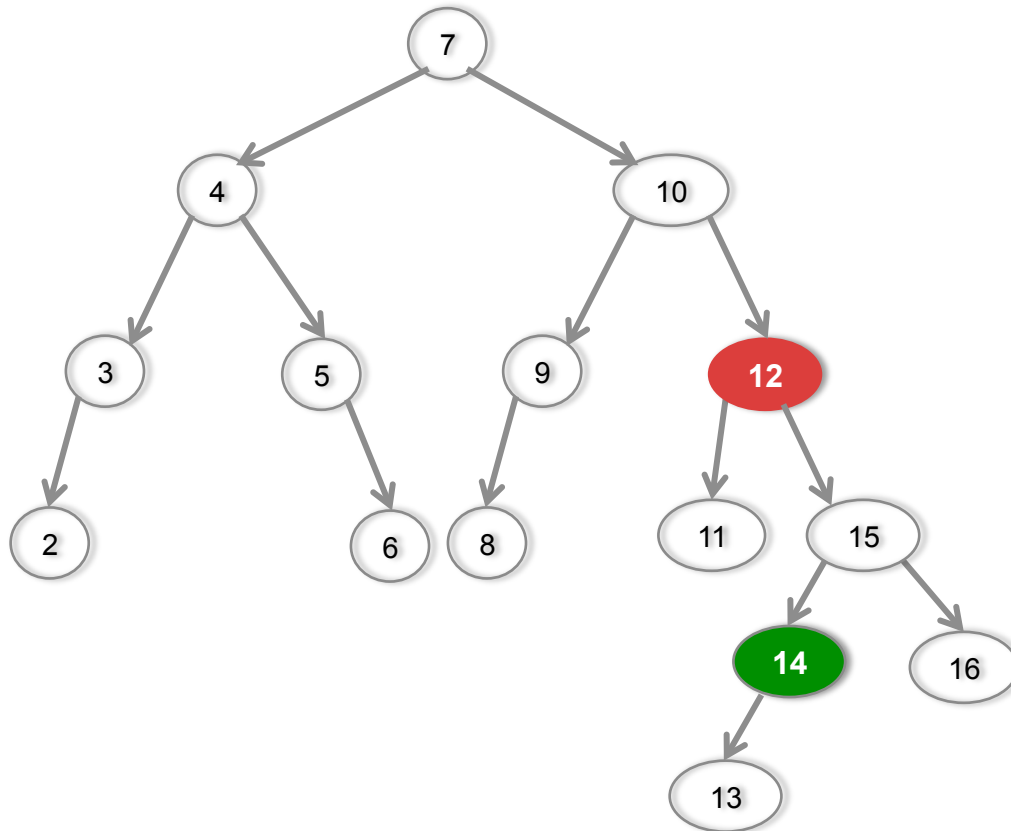
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# AVL “ROTATION”



- What must be the new root? Why?

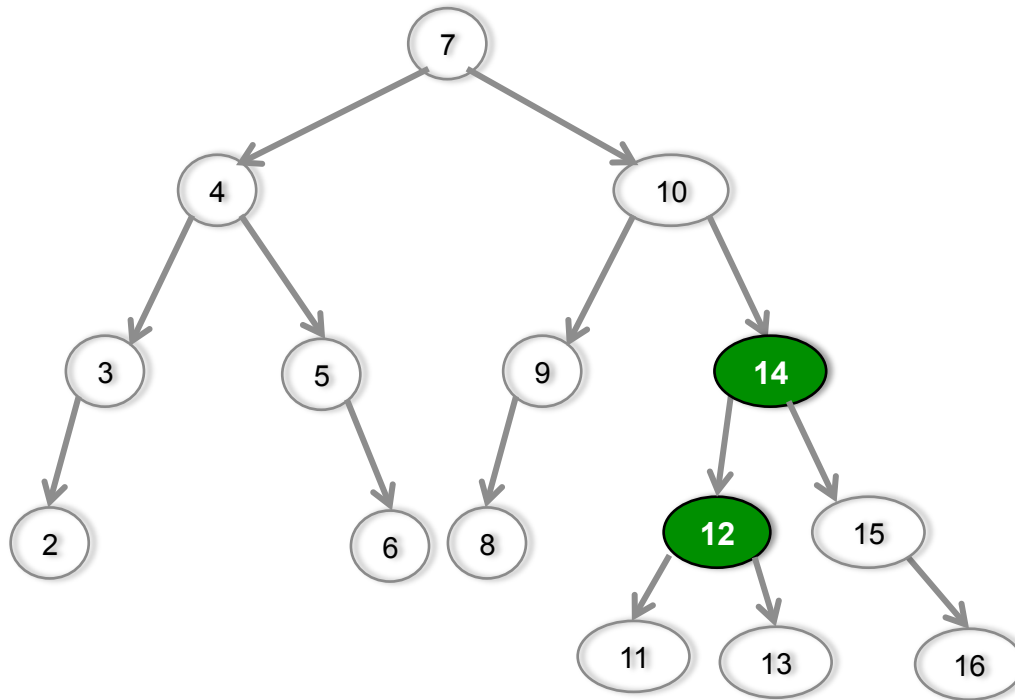
# AVL “ROTATION”



- What does the new tree look like?



# AVL “ROTATION”



- The replaced root is always a child of the new root!

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- **You do not need to memorize this proof, but it is interesting to think about**

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  - Let's consider the most “unbalanced” AVL tree, that is: the tree for each height that has the fewest nodes

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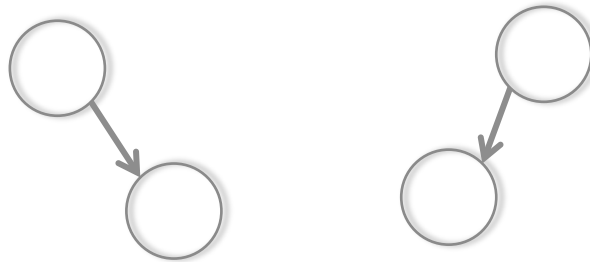
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# **AVL HEIGHT (PROOF)**

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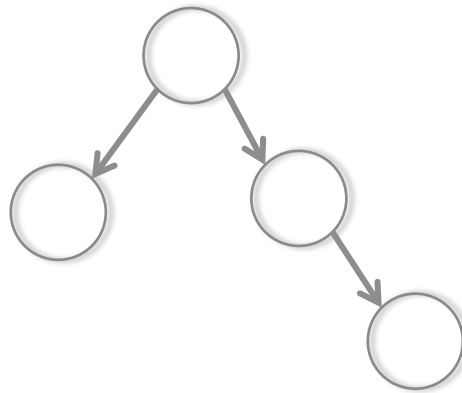
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  - *Hint: balance will probably not be zero*



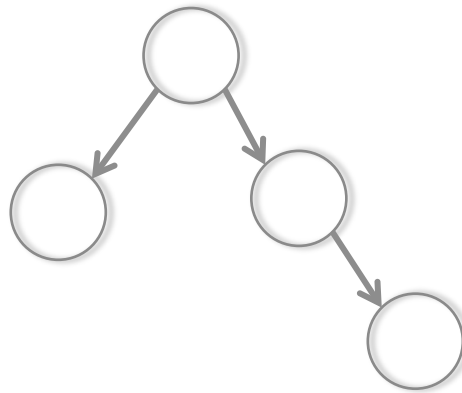
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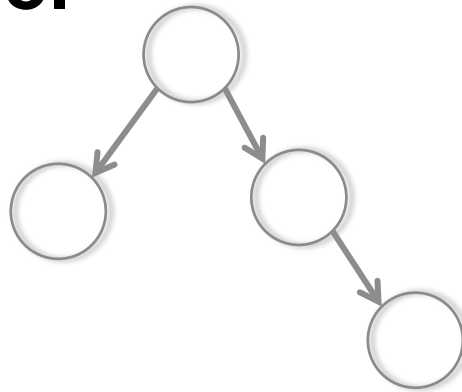
- **What about for height three? What tree has the fewest number of nodes?**
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**There are multiple of these trees, but what's special about it?**

# AVL HEIGHT (PROOF)

- The smallest tree of size three is a node where one child is the smallest tree of size one and the other one is the smallest tree of size two.



# AVL HEIGHT (PROOF)

- In general then, if  $N_1 = 1$  and  $N_2 = 2$  and  $N_3 = 4$ , what is  $N_k$ ?

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  - $N_4 = 7$ , how do I know?

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- In general then, if  $N_1 = 1$  and  $N_2 = 2$  and  $N_3 = 4$ , what is  $N_k$ ?
  - $N_k = 1 + N_{k-1} + N_{k-2}$ 

Because the smallest AVL tree is a node (1) with a child that is the smallest AVL tree of height  $k-1$  ( $N_{k-1}$ ) and the other child is the smallest AVL tree of height  $k-2$  ( $N_{k-2}$ ).

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  - **This means every non-leaf has balance 1**
  - **Nothing in the tree is perfectly balanced.**

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$$N_{k-1} = 1 + N_{k-2} + N_{k-3}$$

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# AVL HEIGHT (PROOF)

Substitute the k-1 into the original equation

$$N_k = 1 + N_{k-1} + N_{k-2}$$

$$N_{k-1} = 1 + N_{k-2} + N_{k-3}$$

# AVL HEIGHT (PROOF)

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This means the tree doubles in size after every two height (compared to a perfect tree which doubles with every added height)

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- **An AVL tree has  $O(\log n)$  height**
- **This does not come at an increased asymptotic runtime for insert.**
- **Rotations take a constant time.**

# **NEXT CLASS**

- **B-Trees**

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