

CSE 250

Data Structures

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Day 26
AVL Trees

Announcements

- WA2 due tonight @ 11:59pm

BST Operations

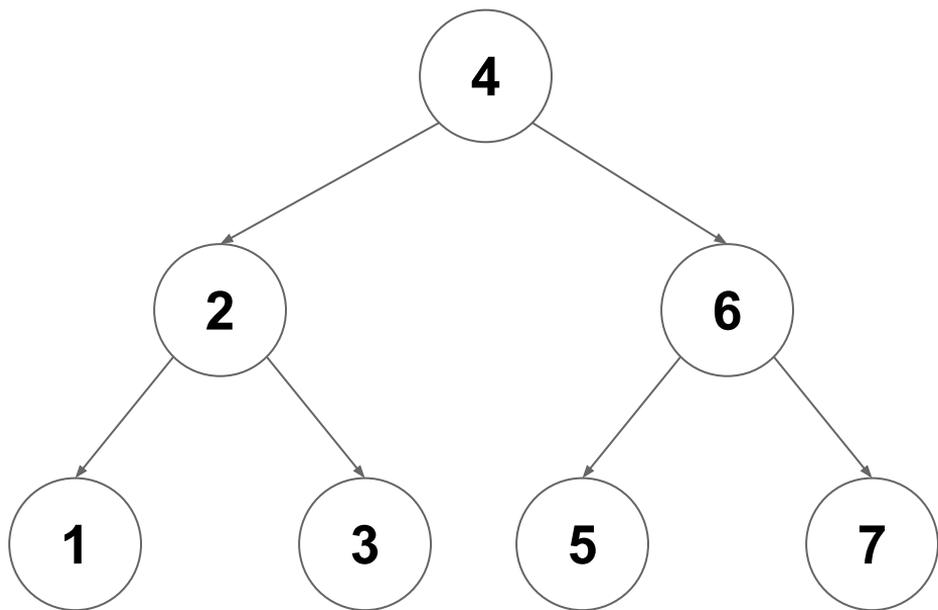
Operation	Runtime
<code>find</code>	$O(d)$
<code>insert</code>	$O(d)$
<code>remove</code>	$O(d)$

What is the runtime in terms of n ? $O(n)$

$$\log(n) \leq d \leq n$$

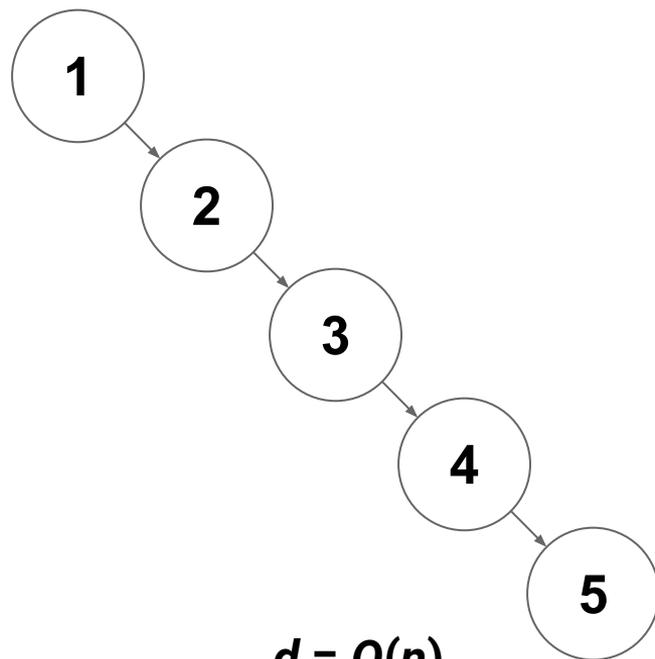
Tree Depth vs Size

If $\text{height}(\text{left}) \approx \text{height}(\text{right})$



$d = O(\log(n))$

If $\text{height}(\text{left}) \ll \text{height}(\text{right})$



$d = O(n)$

Balanced Trees

Balanced Trees are good: Faster find, insert, remove

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What do we mean by balanced?

Balanced Trees

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What do we mean by balanced? $|\text{height}(\text{left}) - \text{height}(\text{right})| \leq 1$

Balanced Trees

Balanced Trees are good: Faster `find`, `insert`, `remove`

What do we mean by balanced? $|\text{height}(\text{left}) - \text{height}(\text{right})| \leq 1$

How do we keep a tree balanced?

Balanced Trees - Two Approaches

Option 1

Keep left/right subtrees within **+/-1** of each other in height

(add a field to track amount of "imbalance")

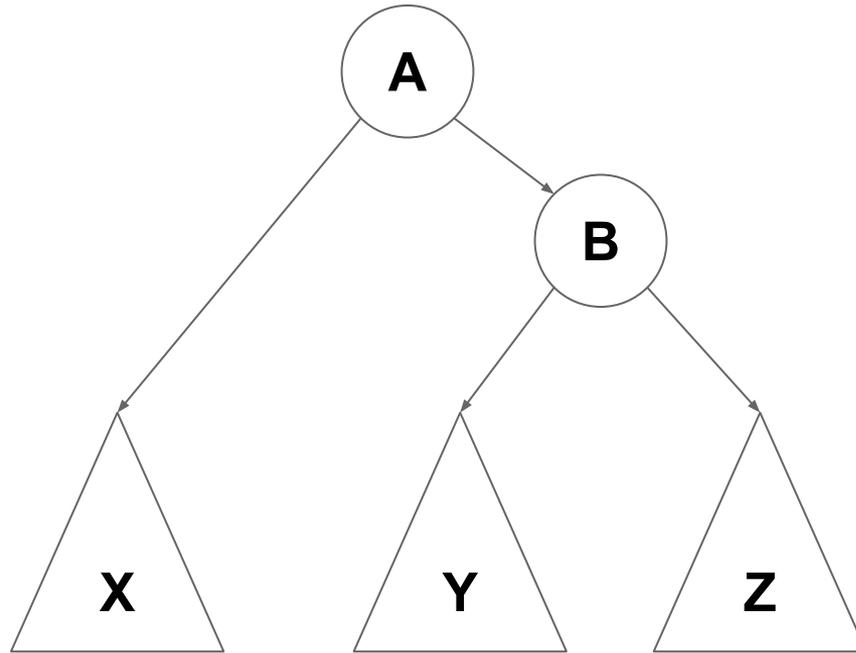
Option 2

Keep leaves at some minimum depth (**$d/2$**)

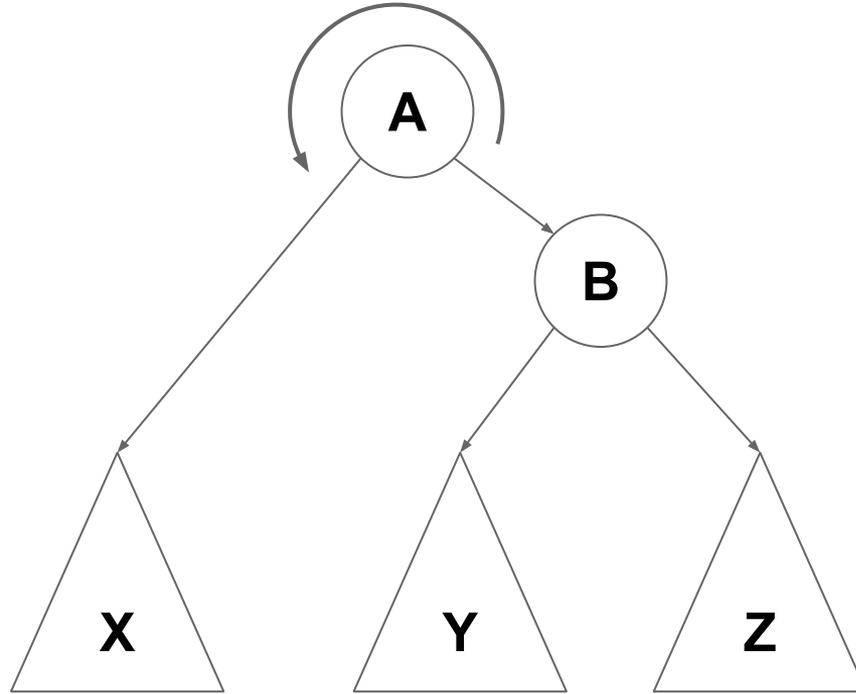
(Add a color to each node marking it as "red" or "black")

**Ok...but how do we enforce
this...?**

Rebalancing Trees (rotations)

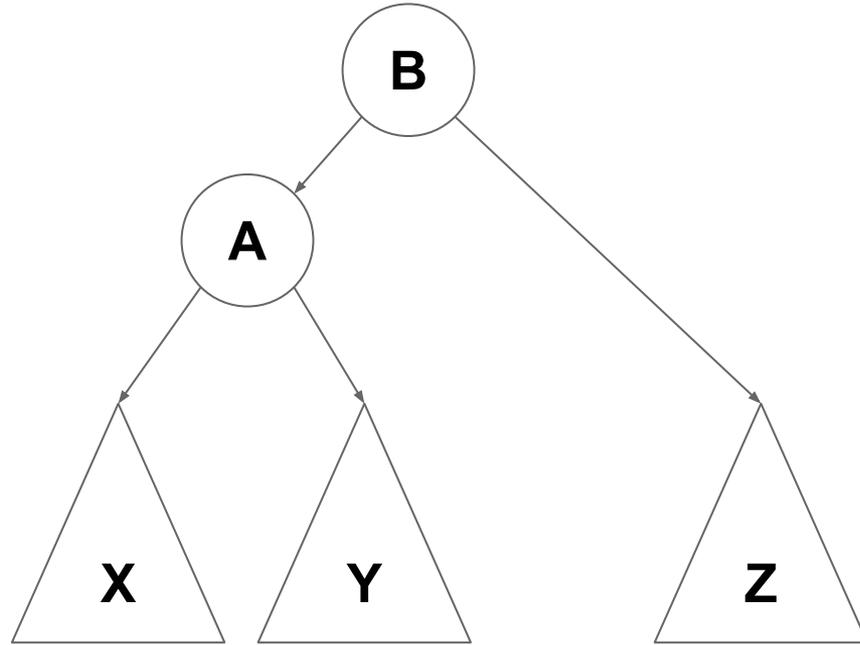


Rebalancing Trees (rotations)



Rotate(A, B)

Rebalancing Trees (rotations)

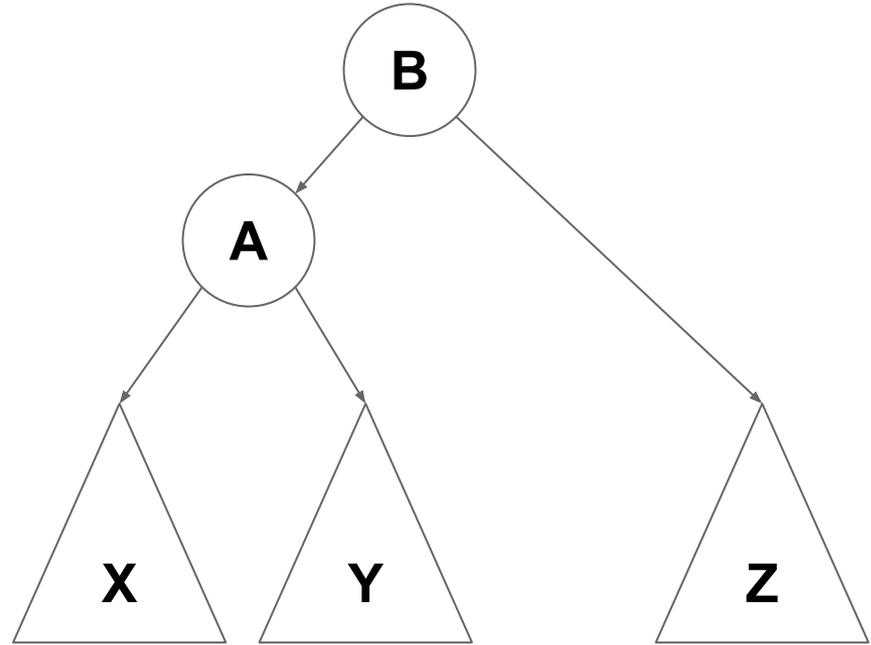


Rotate(A, B)

Rebalancing Trees (rotations)

A became **B**'s left child

B's left child became **A**'s right child



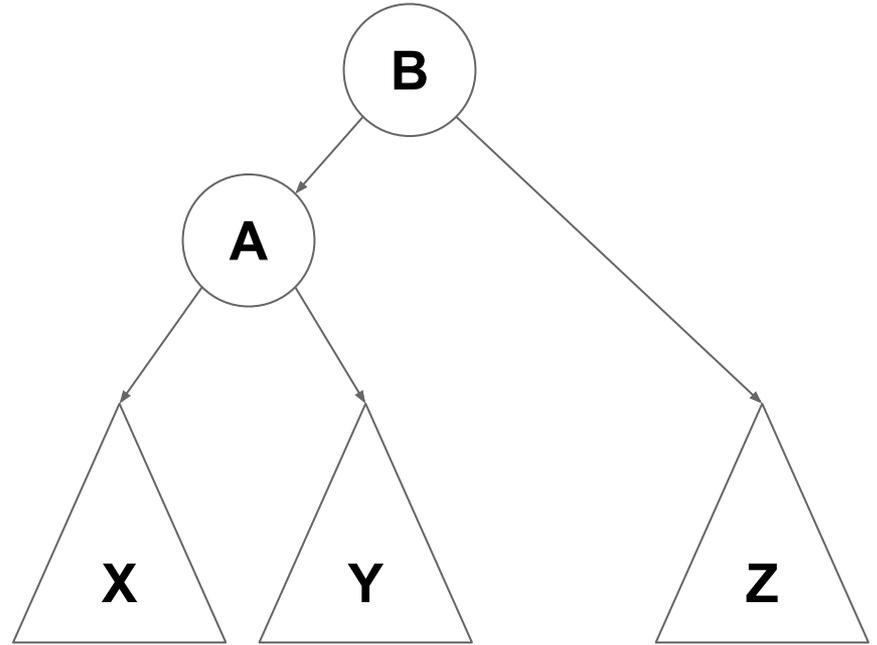
Rotate(A, B)

Rebalancing Trees (rotations)

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Is ordering maintained?



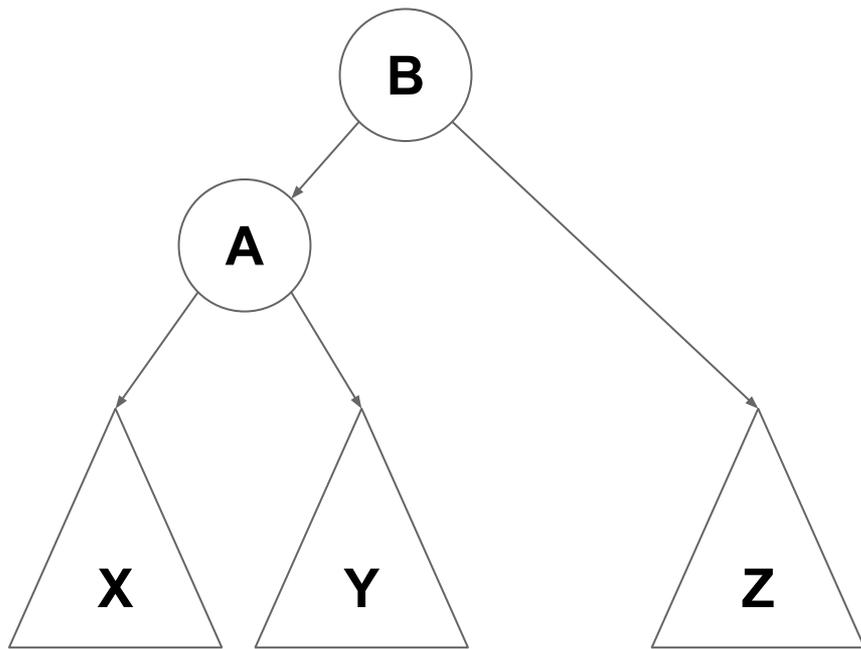
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Rebalancing Trees (rotations)

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Is ordering maintained? Yes!



Rotate(A, B)

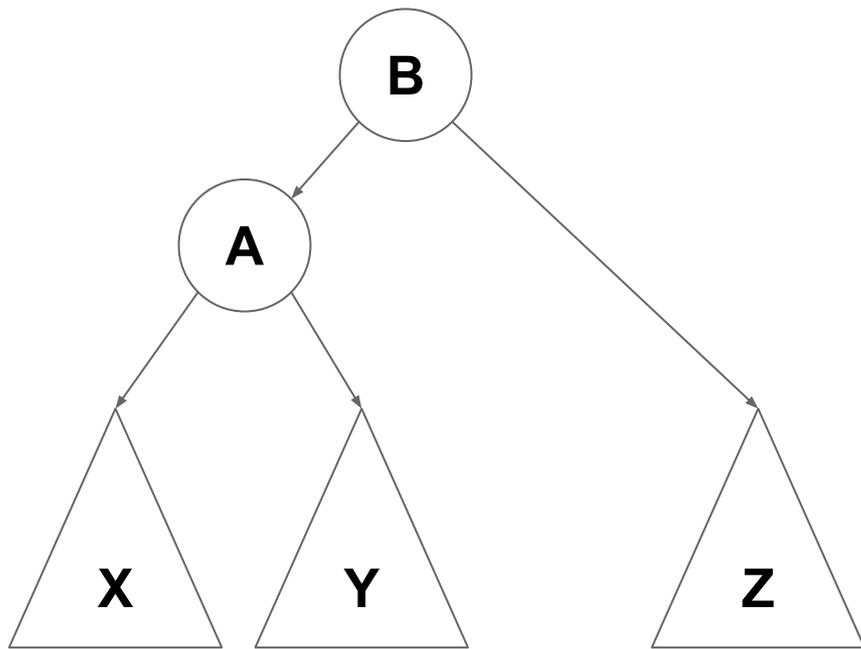
Rebalancing Trees (rotations)

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Is ordering maintained? Yes!

Complexity?



Rotate(A, B)

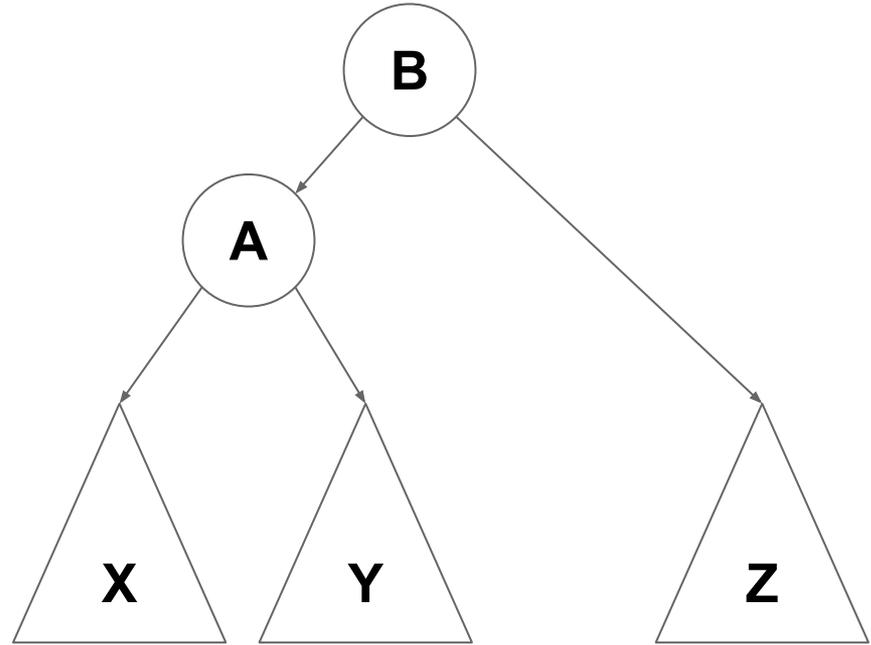
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Complexity? $O(1)$



Rotate(A, B)

Rebalancing Trees (rotations)

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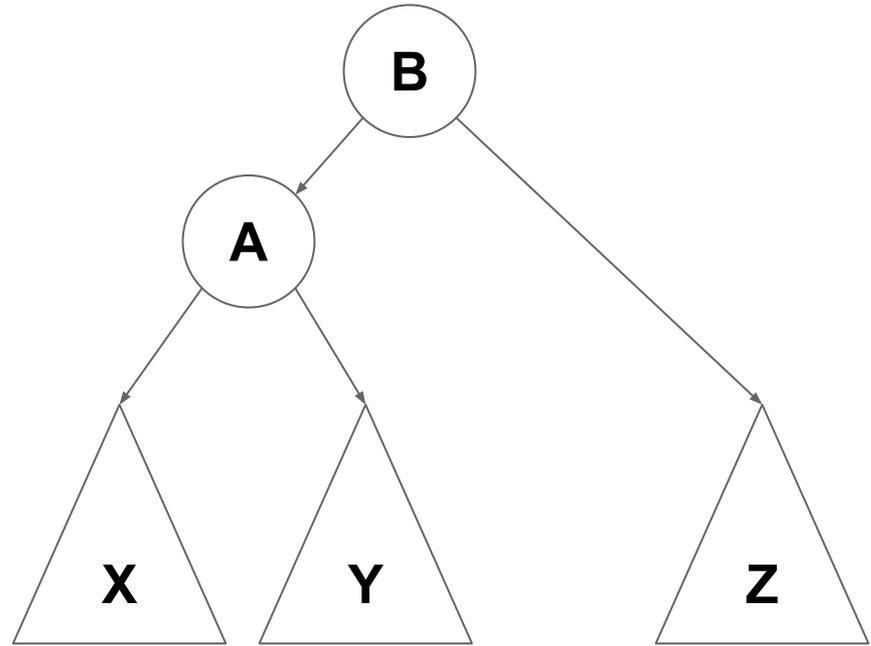
B's left child became **A**'s right child

Is ordering maintained? Yes!

Complexity? $O(1)$

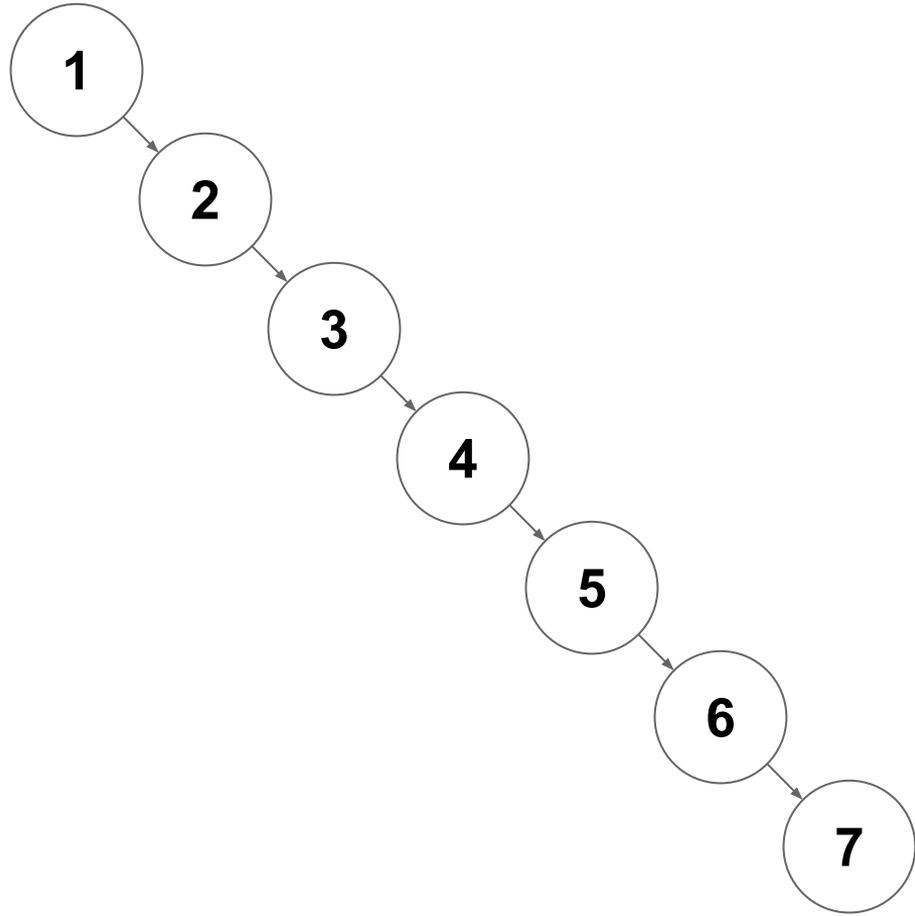
This is called a left rotation

(right rotation is the opposite)



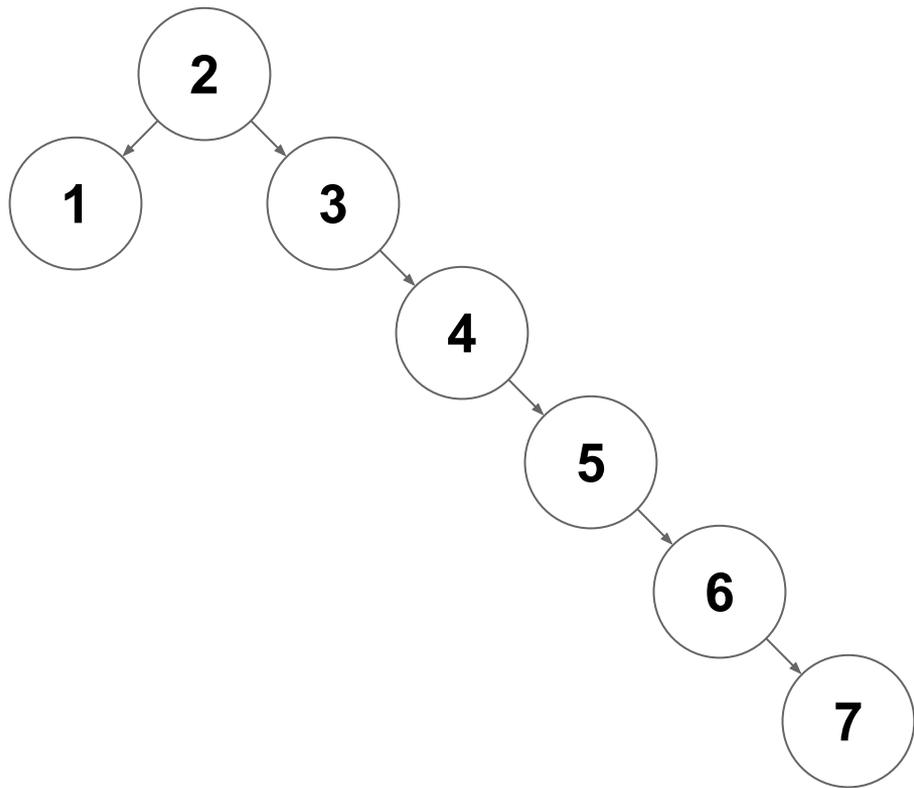
Rotate(A, B)

Rebalancing Trees



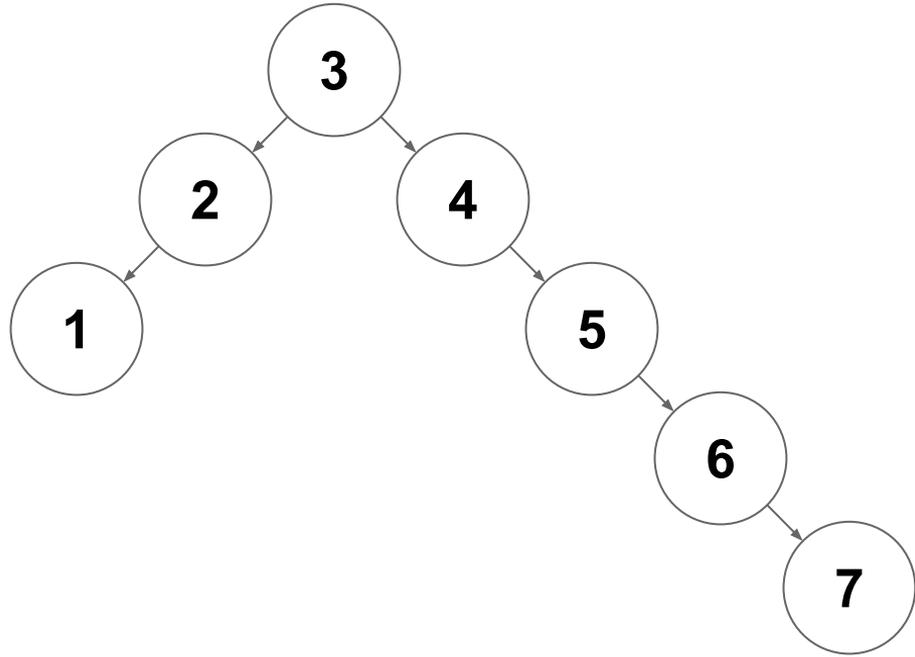
Rebalancing Trees

`Rotate(1,2)`



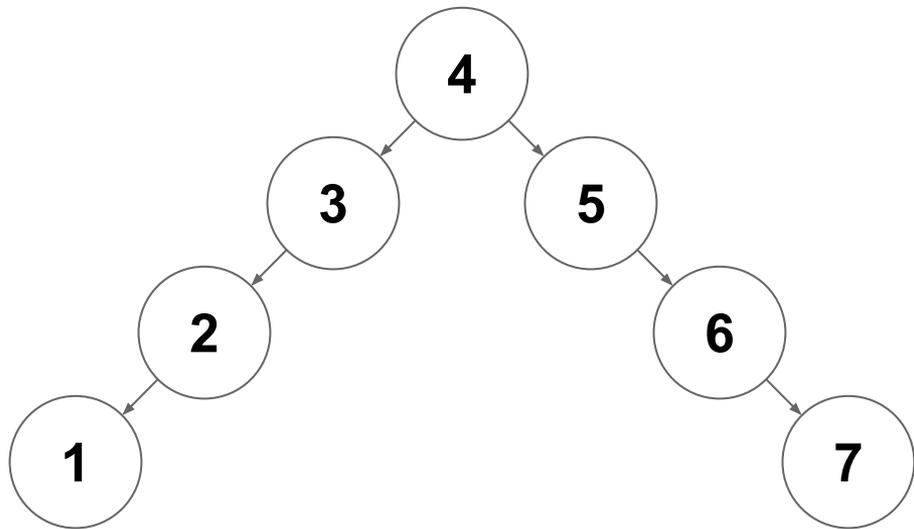
Rebalancing Trees

Rotate(2,3)



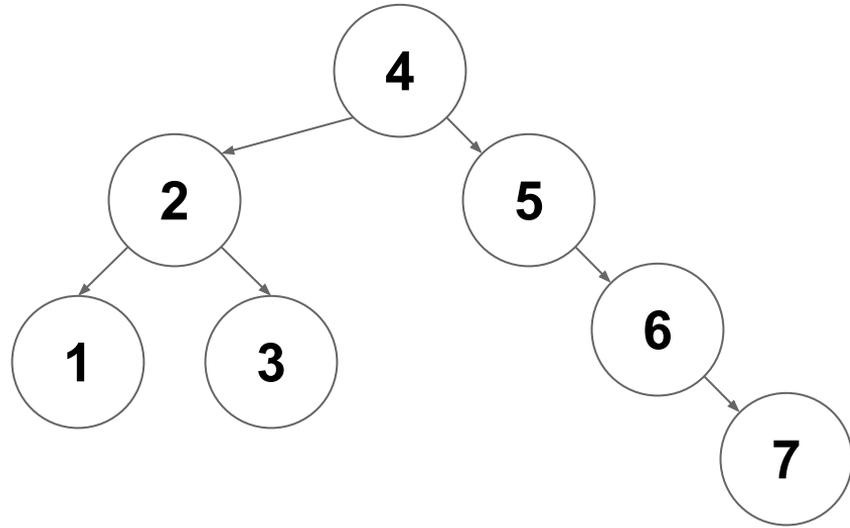
Rebalancing Trees

Rotate(3,4)



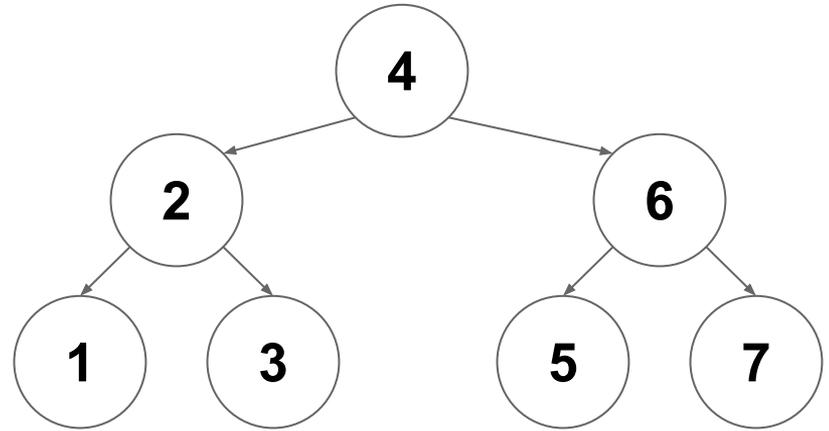
Rebalancing Trees

Rotate(3,2)



Rebalancing Trees

Rotate(5,6)



AVL Trees

AVL Trees

An **AVL tree** (**Adelson-**V**elsky and **L**andis) is a ***BST*** where every subtree is depth-balanced**

Remember: Tree depth = height(root)

Balanced: $|\text{height}(\text{root.left}) - \text{height}(\text{root.right})| \leq 1$

AVL Trees

Define $\text{balance}(v) = \text{height}(v.\text{right}) - \text{height}(v.\text{left})$

Goal: Maintaining $\text{balance}(v) \in \{-1, 0, 1\}$

- $\text{balance}(v) = 0 \rightarrow$ " v is balanced"
- $\text{balance}(v) = -1 \rightarrow$ " v is left-heavy"
- $\text{balance}(v) = 1 \rightarrow$ " v is right-heavy"

AVL Trees

Define **balance(v) = height(v.right) - height(v.left)**

Goal: Maintaining **balance(v) ∈ { -1, 0, 1 }**

- **balance(v) = 0** → "v is balanced"
- **balance(v) = -1** → "v is left-heavy"
- **balance(v) = 1** → "v is right-heavy"

What does enforcing this gain us?

AVL Trees - Depth Bounds

Question: Does the AVL property result in any guarantees about depth?

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YES! Depth balance forces a maximum possible depth of $\log(n)$

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YES! Depth balance forces a maximum possible depth of $\log(n)$

Proof Idea: An AVL tree with depth d has "enough" nodes

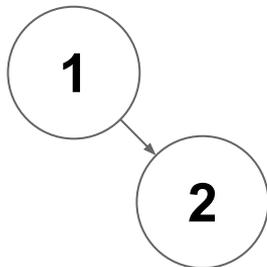
AVL Trees - Depth Bounds

Let $\text{minNodes}(d)$ be the minimum number of nodes an in AVL tree of depth d

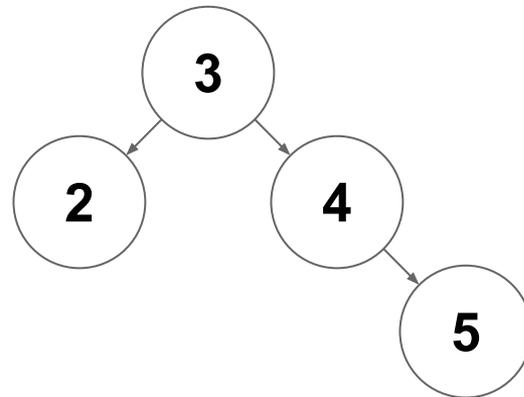
$\text{minNodes}(0) = 1$



$\text{minNodes}(1) = 2$



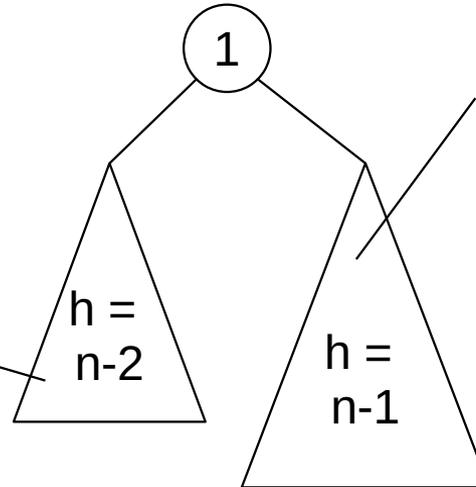
$\text{minNodes}(2) = 4$



AVL Trees

For any tree of depth n :

subtrees must be balanced, so the other subtree needs to have a depth of at least $n-2$



at least one subtree needs to have a depth of $n - 1$

$$\text{minNodes}(n) = \left\{ \right.$$

Enough Nodes?

- For $d > 1$
 - $\text{minNodes}(d) = 1 + \text{minNodes}(d-1) + \text{minNodes}(d-2)$
 - This is the Fibonacci Sequence!
 - $\text{minNodes}(d) = \text{Fib}(d+3)-1$
 - $\text{Fib}(0), \text{Fib}(1), \text{Fib}(2), \dots = 0, 1, 1, 2, 3, 5, 8, \dots$
 - $\text{minNodes}(d) = \Omega(1.5^d)$

Enough Nodes?

- $\text{minNodes}(d) = \Omega(1.5^d)$

$$n \geq c1.5^d$$

$$\frac{n}{c} \geq 1.5^d$$

$$\log_2 \left(\frac{n}{c} \right) \geq \log_2 (1.5^d)$$

$$\log_2 \left(\frac{n}{c} \right) \geq \log_{1.5}(1.5^d) \log_2 1.5$$

$$\log_2 \left(\frac{n}{c} \right) \geq d \log_2(1.5)$$

$$\frac{\log_2 \left(\frac{n}{c} \right)}{\log_2(1.5)} \geq d$$

constant

$$\frac{\log_2(n)}{\log_2(1.5)} - \frac{\log_2(c)}{\log_2(1.5)} \geq d$$

$$O(\log_2(n)) \geq d$$

A tree with n nodes and the AVL constraint has logarithmic depth in n

Enforcing the AVL Constraint

- Computing `balance()` on the fly is expensive
 - `balance` calls `height()` twice
 - Computing height requires visiting every node
 - (linear in the size of the subtree)
- **Idea:** Store height of each node at the node
 - **Better idea:** Store balance factor (only requires 2 bits)

Enforcing the AVL Constraint

maintaining `_parent` makes it possible to traverse up the tree (helpful for rotations), but is not possible in an immutable tree.

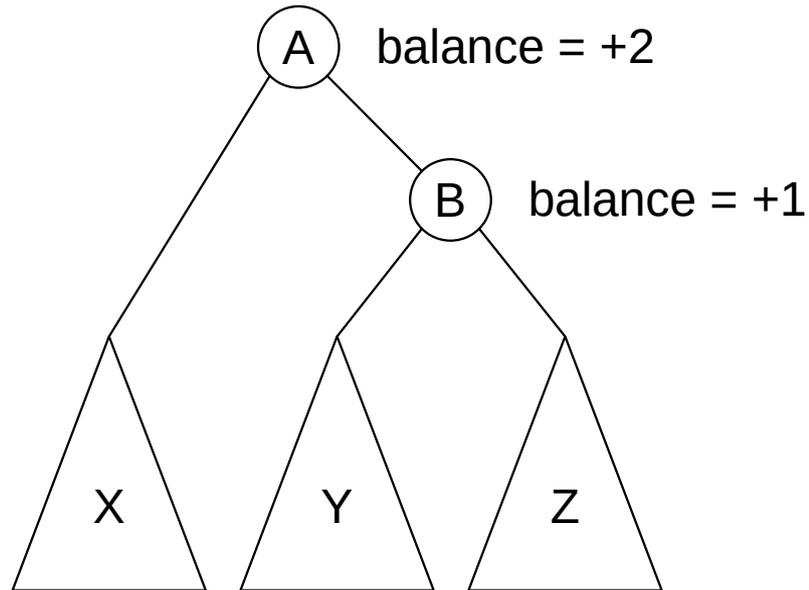
```
class AVLNode[K, V](  
  var _key: K,  
  var _value: V,  
  var _parent: Option[AVLNode[K,V]],  
  var _left: AVLNode[K,V],  
  var _right: AVLNode[K,V],  
  var _isLeftHeavy: Boolean, // true if balance(this) == -1  
  var _isRightHeavy: Boolean, // true if balance(this) == 1  
)
```

$$\textit{balance}(n) = \begin{cases} -1 & \text{if } n._isLeftHeavy = \mathbf{T} \\ +1 & \text{if } n._isRightHeavy = \mathbf{T} \\ 0 & \text{otherwise} \end{cases}$$

Enforcing the AVL Constraint

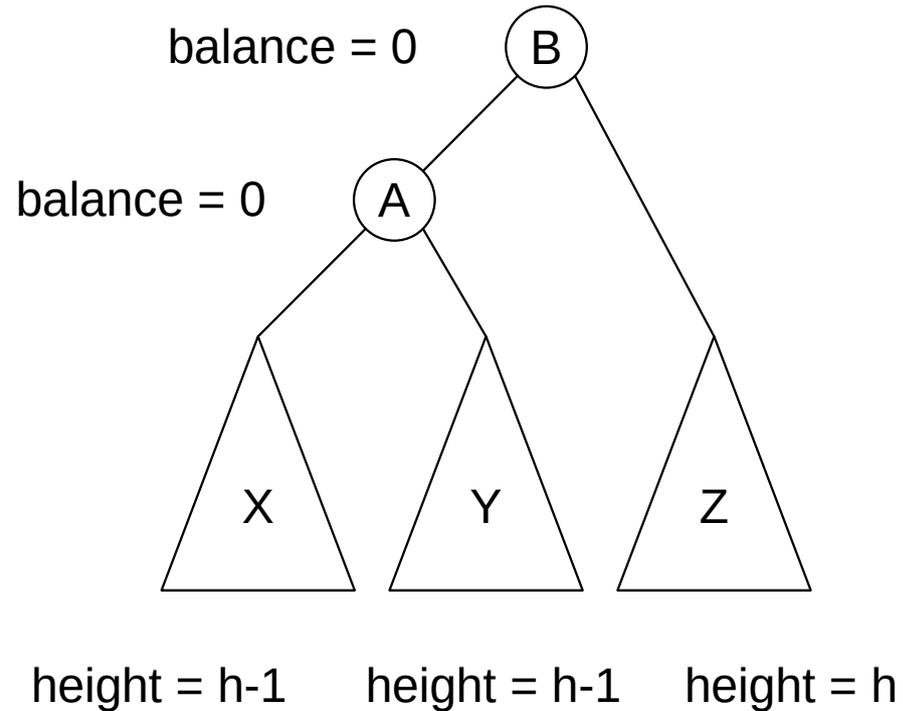
- Left Rotation
 - Before
 - **(A)** root; balance(**A**) = +2 (too right heavy)
 - **(B)** root.right; balance(**B**) = +1 (right heavy)
 - 1) Left subtree of **(B)** becomes right subtree of **(A)**.
 - 2) **(A)** becomes left subtree of **(B)**
 - 3) **(B)** becomes root
 - After
 - balance(**A**) = 0, balance(**B**) = 0

Enforcing the AVL Constraint



height = $h-1$ height = $h-1$ height = h

Enforcing the AVL Constraint



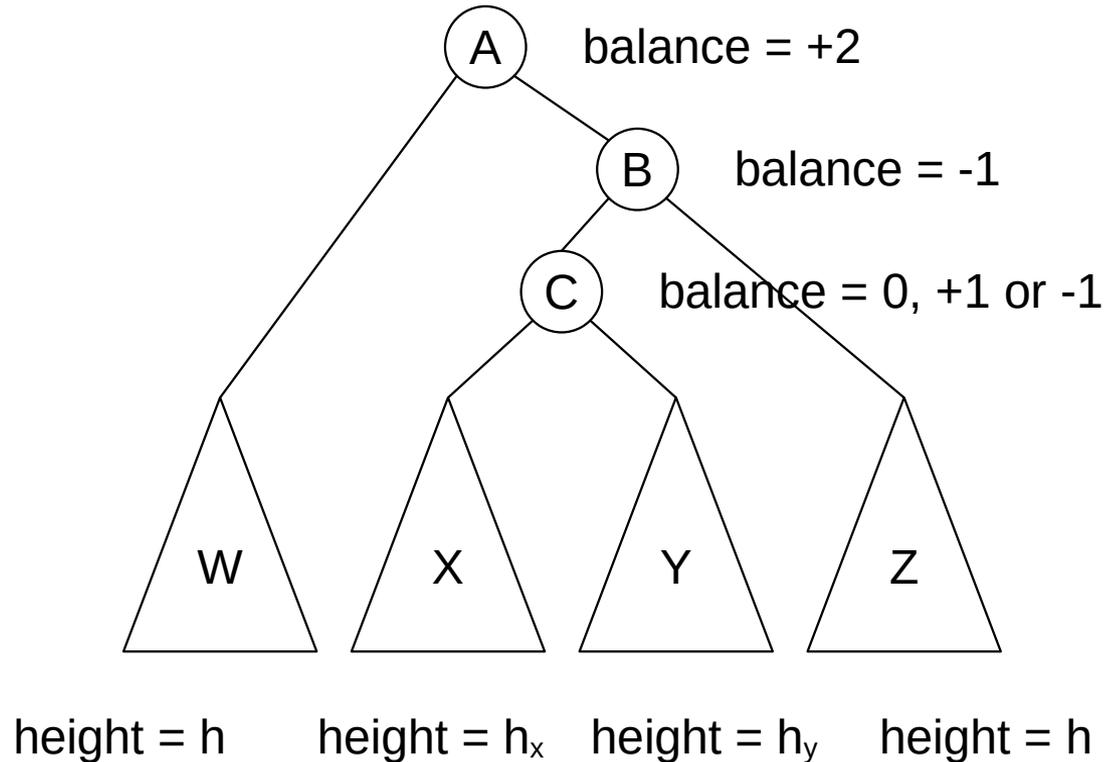
Enforcing the AVL Constraint

- Right-Left Rotation
 - Before
 - **(A)** root; balance(**A**) = +2 (too right heavy)
 - **(B)** root.right; balance(**B**) = -1 (left heavy)
 - **(C)** right.left.right
 - 1) Left subtree of **(C)** becomes right subtree of **(A)**.
 - 2) Right subtree of **(C)** becomes left subtree of **(B)**.
 - 3) **(A)** becomes left subtree of **(C)**
 - 4) **(B)** becomes right subtree of **(C)**
 - 5) **(C)** becomes root

Enforcing the AVL Constraint

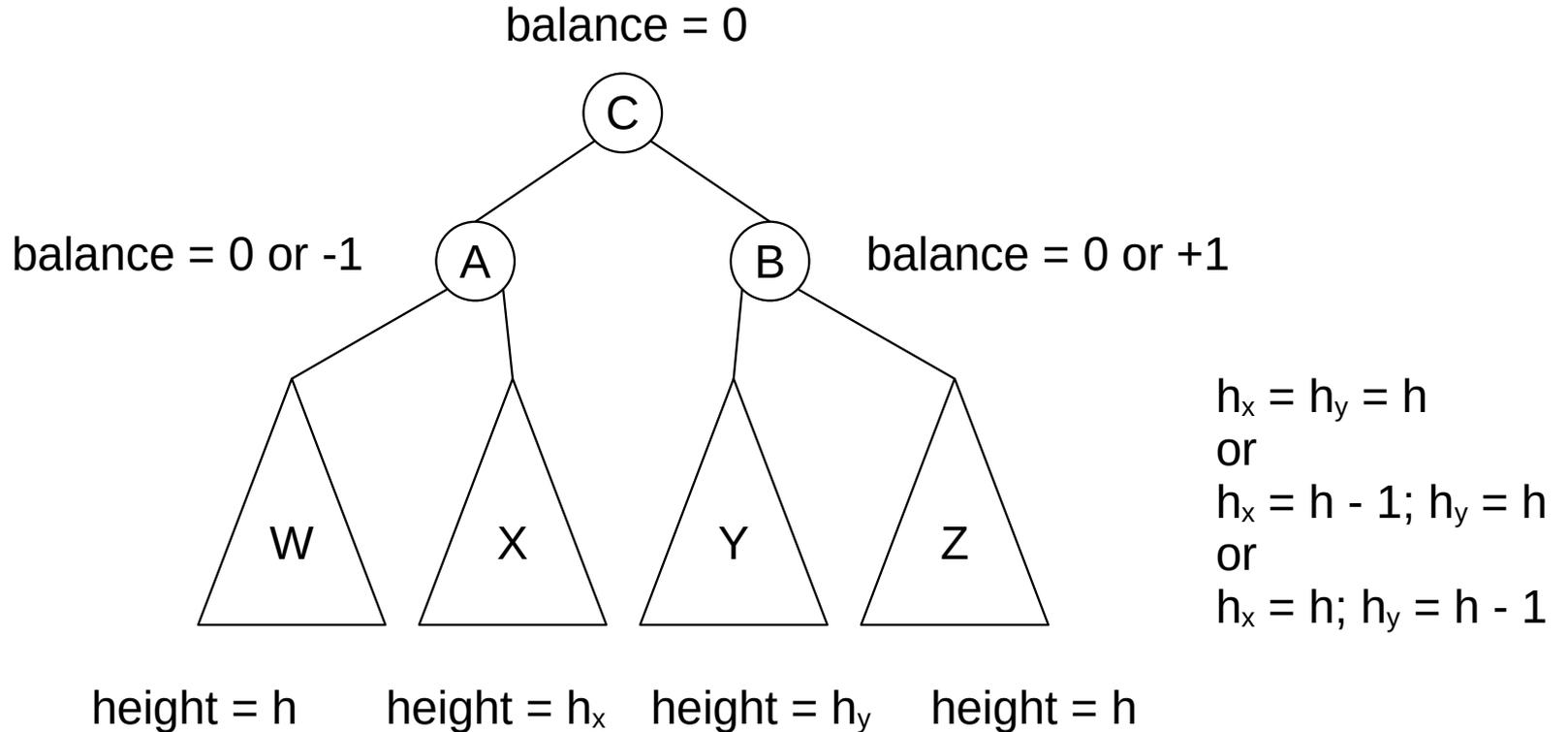
- After
 - if **(C)**'s BF was originally 0
 - **(A)** BF = 0; **(B)** BF = 0; **(C)** BF = 0
 - if **(C)**'s BF was originally -1
 - **(A)** BF = 0; **(B)** BF = +1; **(C)** BF = 0
 - if **(C)**'s BF was originally +1
 - **(A)** BF = -1; **(B)** BF = 0; **(C)** BF = 0

Enforcing the AVL Constraint



$h_x = h_y = h$
or
 $h_x = h - 1; h_y = h$
or
 $h_x = h; h_y = h - 1$

Enforcing the AVL Constraint



Enforcing the AVL Constraint

- Rotate Right
 - Symmetric to rotate left
- Rotate Left-Right
 - Symmetric to rotate right-left

Inserting Records

- Inserting Records
 - Find insertion as in BST
 - Set balance factor of new leaf to 0
 - `_isLeftHeavy = _isRightHeavy = false`
 - Trace path up to root, updating balance factor
 - Rotate if balance factor off

Inserting Records

```
def insert[K, V](key: K, value: V, root: AVLNode[K, V]): Unit =
{
  var node = findInsertionPoint(key, root)
  node._key = key;  node._value = value
  node._isLeftHeavy = node._isRightHeavy = false
  while(node._parent.isDefined){
    if(node._parent._left == node){
      if(node._parent._isRightHeavy){
        node._parent._isRightHeavy = false; return
      } else if(node._parent._isLeftHeavy) {
        if(node._isLeftHeavy){ node._parent.rotateRight() }
        else { node._parent.rotateLeftRight() }
        return
      } else {
        node._parent.isLeftHeavy = true
      }
    } else {
      /* symmetric to above */
    }
    node = node._parent
  }
}
```

$O(d) = O(\log(n))$

$O(d) = O(\log(n))$ loops

$O(1)$ per loop

Total Runtime = $O(\log(n))$

Removing Records

- Removing Records
 - Remove the node
 - Find the node containing the value as in BST
 - If it doesn't exist, return false
 - If the node is a leaf, remove it
 - If the node has one child, the child replaces the node
 - If the node has two children
 - copy smaller child value into node
 - remove smaller child node
 - Fix balance factors
 - Inverse of insertion

Maintaining Balance

- **Claim:** Only the balance factors of ancestors are impacted
 - The height of a node is only affected by its descendants
- **Claim:** Only one rotation will fix any remove/insert imbalance
 - Insert/remove change the height by at most one
- Only $\log(n)$ rotations are required for any insert/remove
 - Insert/remove are still $\log(n)$