# CSE 250 Data Structures

Dr. Eric Mikida epmikida@buffalo.edu 208 Capen Hall

Lec 27: AVL Trees

#### Announcements

- WA4 due Sunday
- Classes cancelled Monday for the Eclipse
  - Recitation next week is midterm review, no attendance required
  - If you have recitation on Monday but still want to attend, you may attend a Tuesday recitation (as long as there is space)
- TA hiring starting soon If you want to join 250 course staff email me!

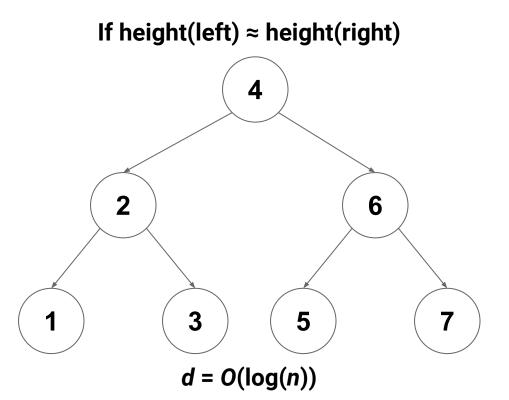
#### **BST Operations**

Operation	Runtime
find	O(d)
insert	O(d)
remove	O(d)

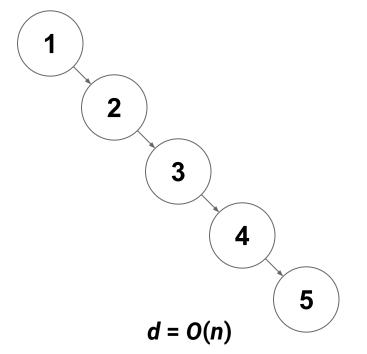
What is the runtime in terms of n? O(n)

$$\log(n) \le d \le n$$

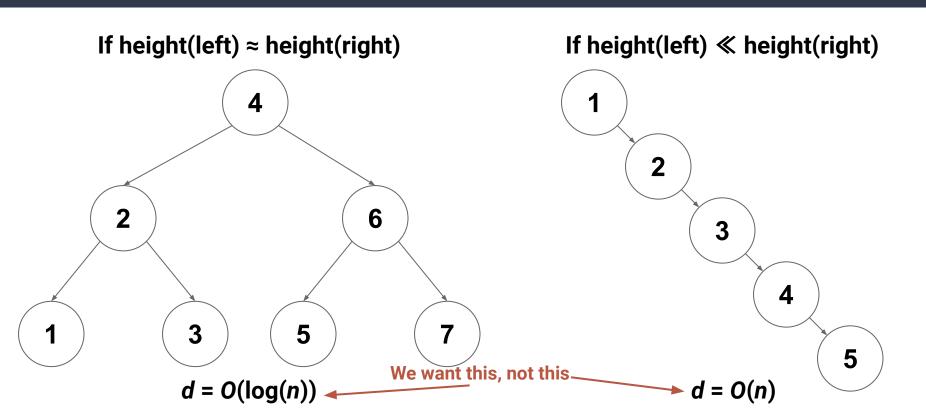
#### Tree Depth vs Size



If height(left) ≪ height(right)



# Tree Depth vs Size



#### **Keeping Depth Small - Two Approaches**

#### **Option 1**

Keep tree **balanced**: subtrees **+/-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")

Balanced Trees are good: Faster find, insert, remove

Balanced Trees are good: Faster find, insert, remove

What do we mean by balanced?

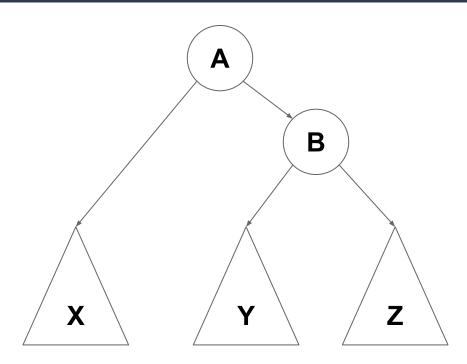
Balanced Trees are good: Faster find, insert, remove

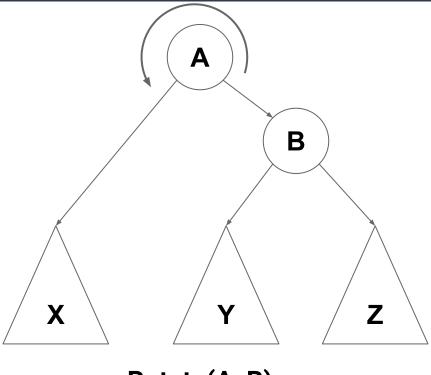
What do we mean by balanced? |height(right) - height(left)| ≤ 1

Balanced Trees are good: Faster find, insert, remove

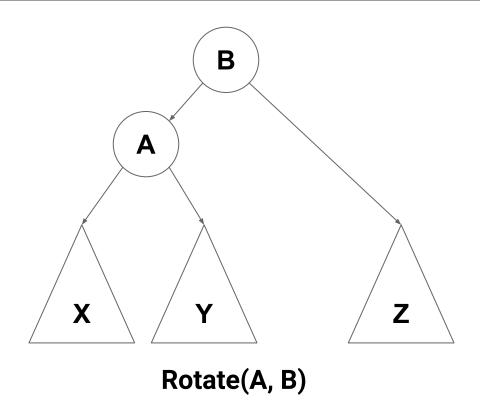
What do we mean by balanced? |height(right) - height(left)| ≤ 1

How do we keep a tree balanced?





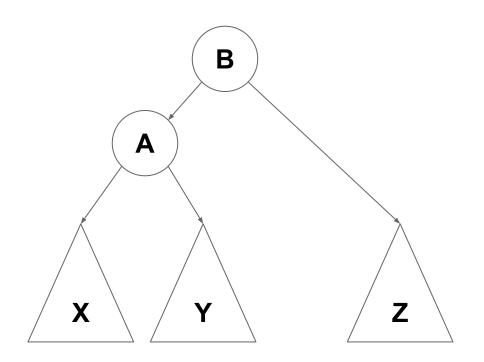
Rotate(A, B)



13

A became B's left child

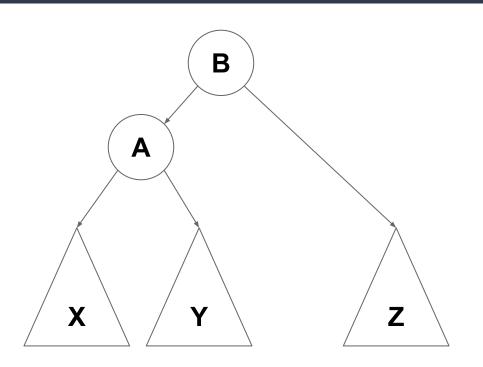
B's left child became A's right child



A became B's left child

B's left child became A's right child

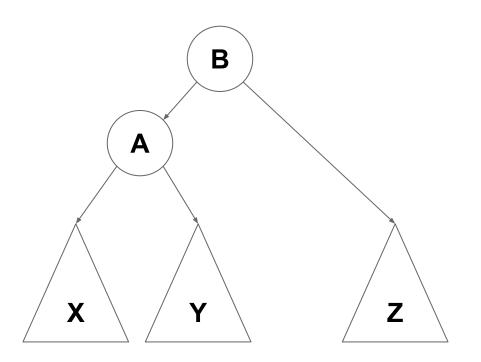
*Is ordering maintained?* 



A became B's left child

B's left child became A's right child

Is ordering maintained? Yes!

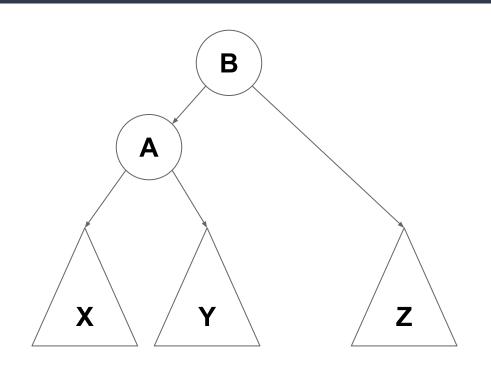


A became B's left child

B's left child became A's right child

Is ordering maintained? Yes!

Complexity?

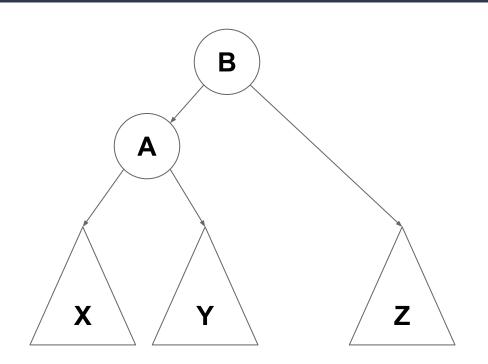


A became B's left child

B's left child became A's right child

Is ordering maintained? Yes!

Complexity? **O(1)** 



A became B's left child

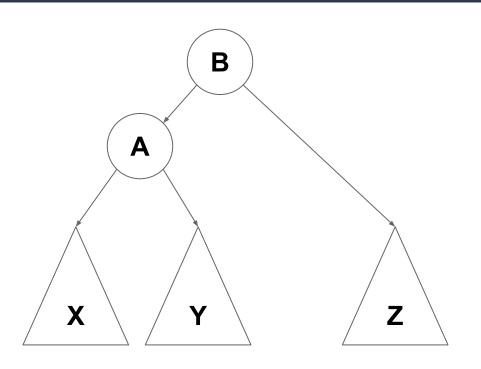
B's left child became A's right child

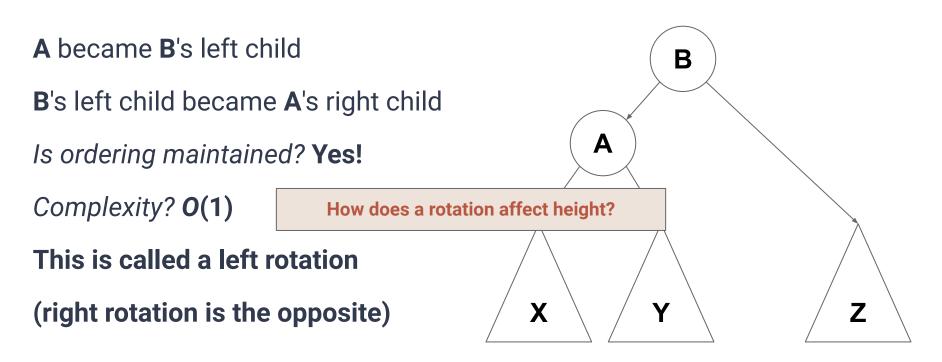
Is ordering maintained? Yes!

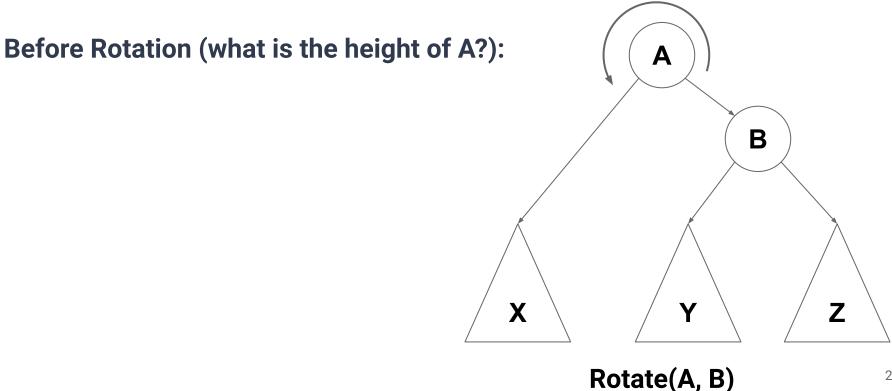
Complexity? **O(1)** 

This is called a left rotation

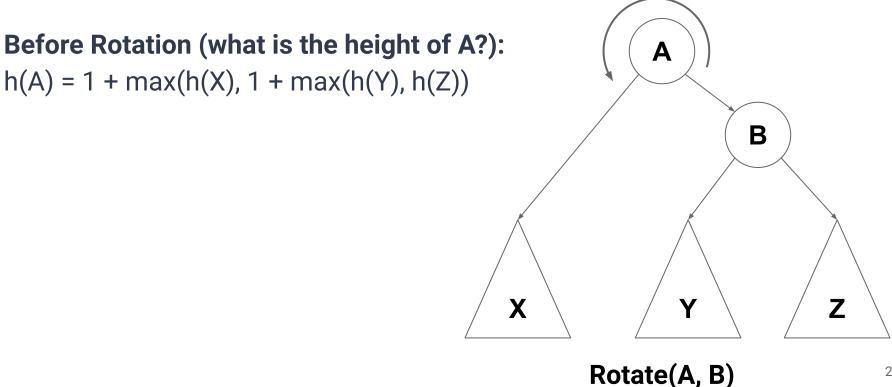
(right rotation is the opposite)







21



**Before Rotation (what is the height of A?):** B h(A) = 1 + max(h(X), 1 + max(h(Y), h(Z)))After Rotation (what is the height of B?): Α Rotate(A, B)

23

**Before Rotation (what is the height of A?):** B h(A) = 1 + max(h(X), 1 + max(h(Y), h(Z)))After Rotation (what is the height of B?): Α h(B) = 1 + max(1 + max(h(X),h(Y)), h(Z))Rotate(A, B)

**Before Rotation (what is the height of A?):** 

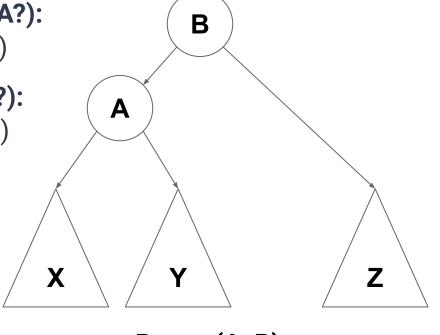
h(A) = 1 + max(h(X), 1 + max(h(Y), h(Z))

After Rotation (what is the height of B?):

h(B) = 1 + max(1 + max(h(X),h(Y)), h(Z))

 If X was the tallest of X,Y,Z our total height increased by 1.

- If Z was the tallest our total height decreased by 1.
- If X,Z same height, or Y is the tallest then total is unchanged



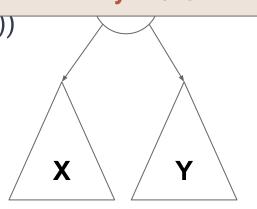
#### **Before Rotation (what is the height of A?):**

h(A) = 1 + ma

Therefore, a single left (or right) rotation can change the height of the tree by +1/0/-1 After Rotation

h(B) = 1 + max(1 + max(h(X),h(Y)), h(Z))

- If **X** was the tallest of **X,Y,Z** our total height increased by 1.
- If **Z** was the tallest our total height decreased by 1.
- If X,Z same height, or Y is the tallest then total is unchanged



Rotate(A, B)

B

An <u>AVL tree</u> (<u>A</u>delson-<u>V</u>elsky and <u>L</u>andis) is a *BST* where every subtree is depth-balanced

**Remember:** Tree depth = height(root)

**Balanced:** |height(root.right) - height(root.left)| ≤ 1

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

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

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

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

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

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

What does enforcing this gain us?

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

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

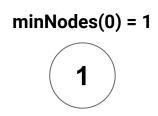
**YES!** Depth balance forces a maximum possible depth of log(n)

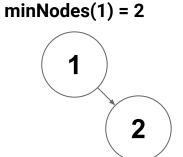
**Question:** Does the AVL property result in any guarantees about depth?

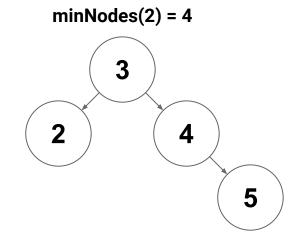
**YES!** Depth balance forces a maximum possible depth of log(n)

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

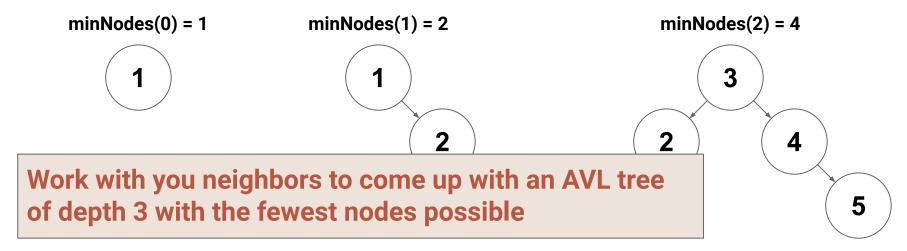
Let minNodes(d) be the min number of nodes an in AVL tree of depth d



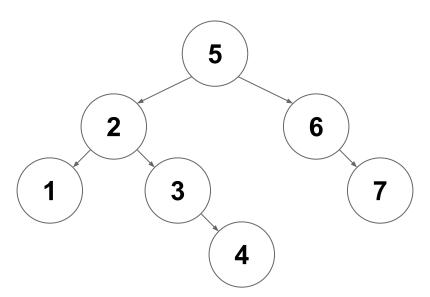




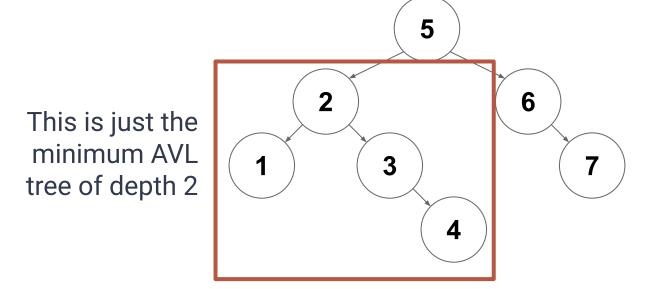
Let minNodes(d) be the min number of nodes an in AVL tree of depth d



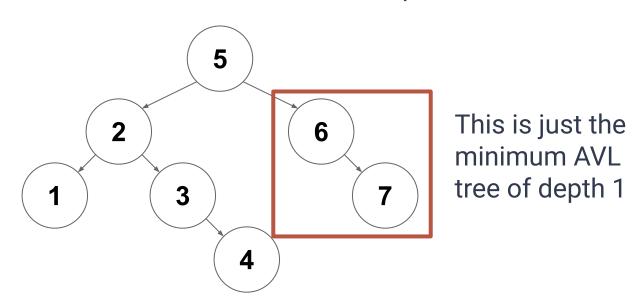
The minimum number of nodes for an AVL tree of depth 3...is 7!



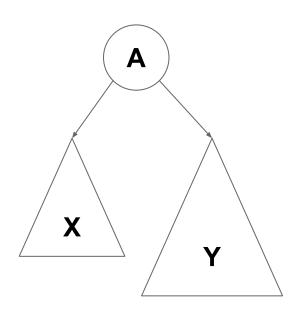
The minimum number of nodes for an AVL tree of depth 3...is 7!



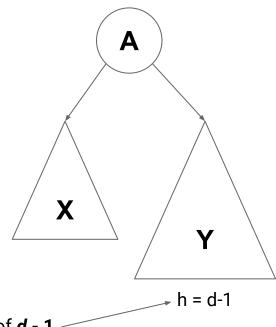
The minimum number of nodes for an AVL tree of depth 3...is 7!



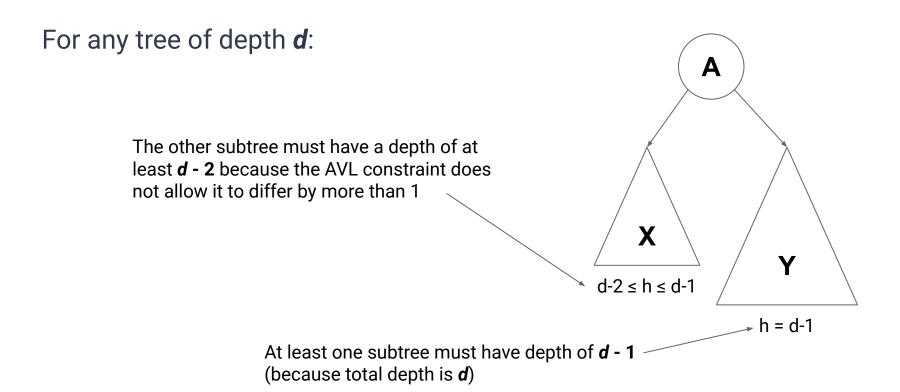
For any tree of depth **d**:



For any tree of depth **d**:



At least one subtree must have depth of **d** - 1 (because total depth is **d**)



For *d* < 1:

minNodes(d) = 1 + minNodes(d - 1) + minNodes(d - 2)

For *d* < 1:

minNodes(d) = 1 + minNodes(d - 1) + minNodes(d - 2)

This is the Fibonacci Sequence!

For *d* < 1:

minNodes(d) = 1 + minNodes(d - 1) + minNodes(d - 2)

This is the Fibonacci Sequence!

What is the **d**<sup>th</sup> term of the Fibonacci sequence?

Coarse approximation: minNodes(d) =  $\Omega(1.5^d)$ 

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

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

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

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

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

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

minNodes(d) =  $\Omega(1.5^d)$ 

$$n > c1.5^d$$

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

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

minNodes(d) =  $\Omega(1.5^d)$ 

$$n > c1.5^d$$

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

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

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

minNodes(
$$d$$
) =  $\Omega(1.5^d)$ 

$$n > c1.5^d$$

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

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

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

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

minNodes(d) =  $\Omega(1.5^d)$ 

$$n > c1.5^d$$

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

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

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

$$\frac{\log_2(n))}{\log_2(1.5)} - \frac{\log_2(c)}{\log_2(1.5)} \ge d$$
All constants

minNodes(d) =  $\Omega(1.5^d)$ 

$$n > c1.5^d$$

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

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

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

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

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

minNodes(
$$d$$
) =  $\Omega(1.5^d)$ 

$$\log_2\left(\frac{n}{c}\right) \geq \log \frac{\log_2\left(\frac{n}{c}\right)}{\frac{\log_2\left(\frac{n}{c}\right)}{\log_2\left(1.5\right)}} \geq d$$
 Therefore if we enforce the AVL constraint, then a tree with  $n$  nodes will have logarithmic depth 
$$\log_2\left(\frac{n}{c}\right) \geq d\log_2(1.5) = \frac{\log_2\left(\frac{n}{c}\right)}{\log_2(1.5)} \geq d$$
 
$$\log_2\left(\frac{n}{c}\right) \geq d\log_2(1.5)$$
 
$$d \in O(\log_2(n))$$

minNodes(
$$d$$
) =  $\Omega(1.5^d)$ 

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

$$\log_2\left(\frac{n}{c}\right) \ge \log$$

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

 $n \geq c1.5^d$  Therefore if we enforce the AVL  $\log_2\left(\frac{n}{c}\right) \geq \log$ constraint, then a tree with *n* nodes So how do we enforce the constraint?  $\frac{g_2(c)}{g_2(1.5)} \geq d$ 

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

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

- Computing balance() on the fly is expensive
  - balance() calls height() twice
  - Computing height() requires visiting every node

- Computing balance() on the fly is expensive
  - balance() calls height() twice
  - Computing height() requires visiting every node

**Idea:** Store height of each node at the node

- Computing balance() on the fly is expensive
  - balance() calls height() twice
  - Computing height() requires visiting every node

**Idea:** Store height of each node at the node

Better Idea: Just store the balance factor (only needs 2 bits)

```
public class AVLTreeNode<T> {
    T value;
    Optional<AVLTreeNode<T>> parent; // We need a ref to parent to rotate
    Optional<AVLTreeNode<T>> leftChild;
    Optional<AVLTreeNode<T>> rightChild;
    Boolean isLeftHeavy; // true if height(right) - height(left) == -1
    Boolean isRightHeavy; // true if height(right) - height(left) == 1
}
```

Need to add 3 fields to our TreeNode class to make it an AVLTreeNode

Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

What is the effect on the height of insert?

Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

What is the effect on the height of insert? Increases by at most 1

Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

- What is the effect on the height of insert? Increases by at most 1
- What is the effect on the height of remove?

Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

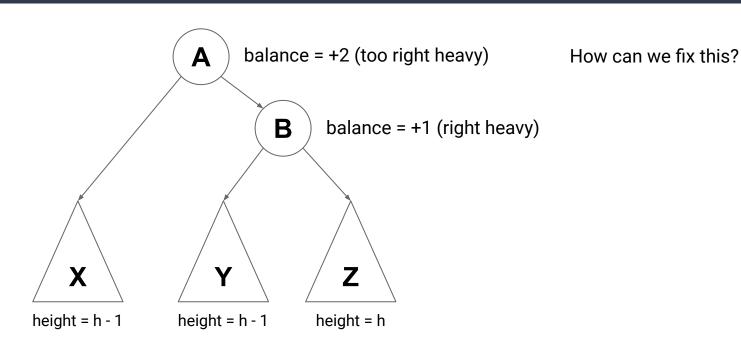
- What is the effect on the height of insert? Increases by at most 1
- What is the effect on the height of remove? Decreases by at most 1

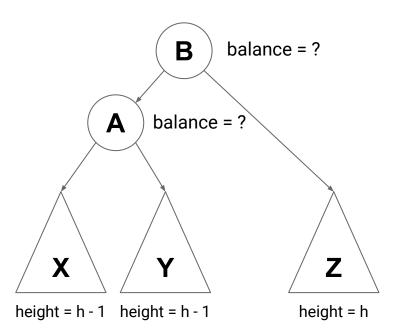
Assume we have a valid AVL tree and we modify it. How might this break our AVL constraint?

- What is the effect on the height of insert? Increases by at most 1
- What is the effect on the height of remove? Decreases by at most 1

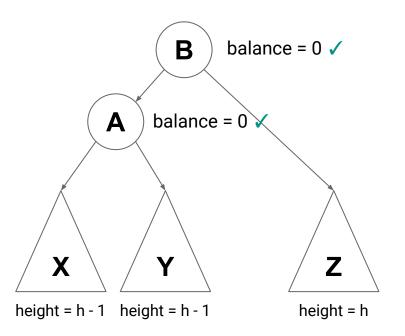
**Therefore** after an operation that modifies an AVL tree, the difference in heights can be **at most** 2.

What are the exact ways this broken constraint might show up?

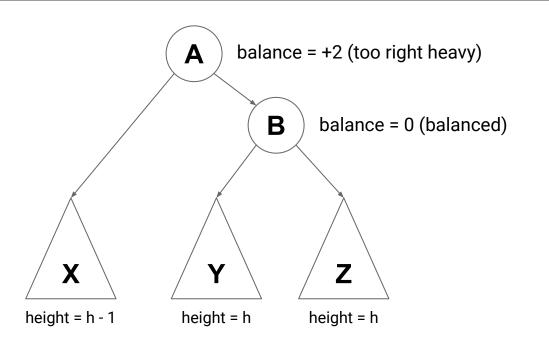




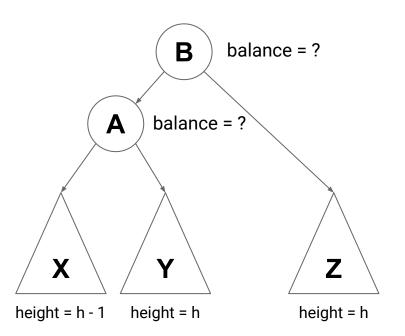
How can we fix this? rotate(A,B)



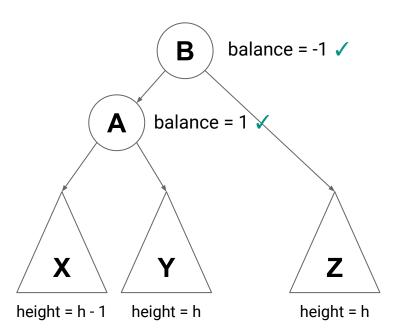
How can we fix this? rotate(A,B)



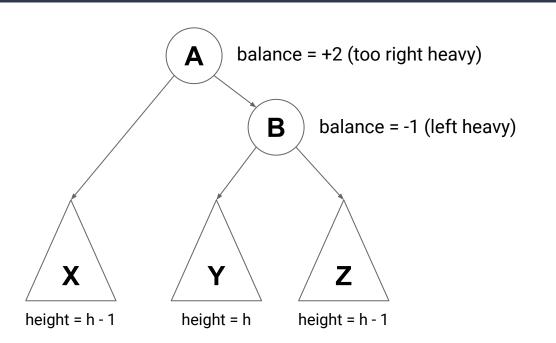
How can we fix this?



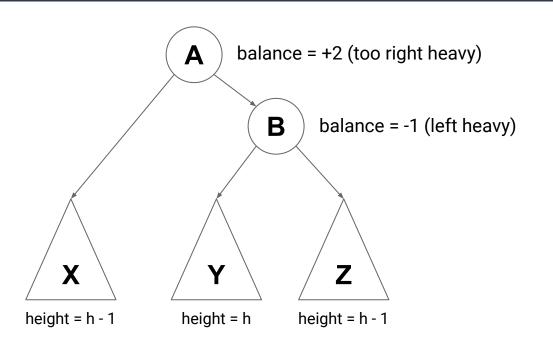
How can we fix this? rotate(A,B)



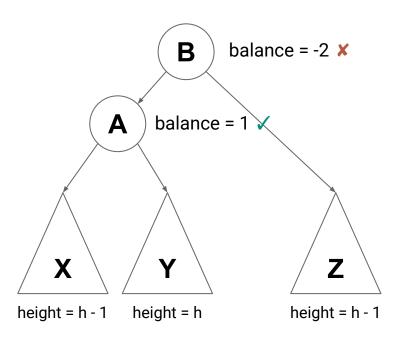
How can we fix this? rotate(A,B)



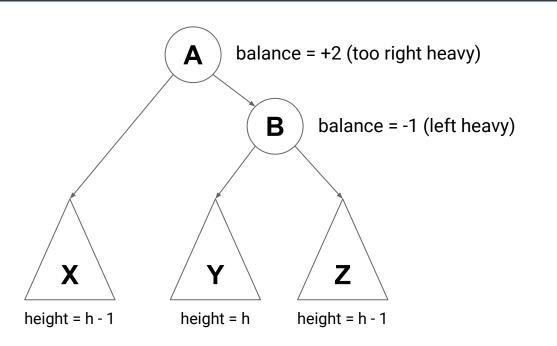
How can we fix this?



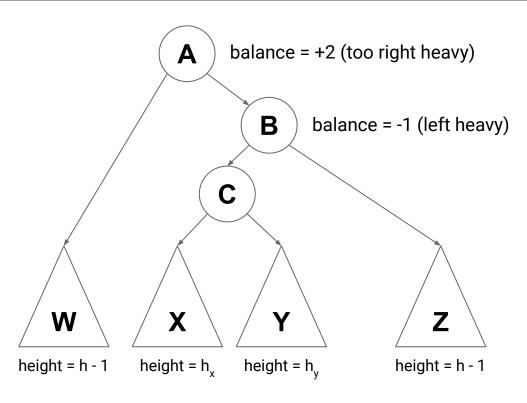
How can we fix this? Will just a single left rotation work?



How can we fix this?
Will just a single left rotation work? **No** 



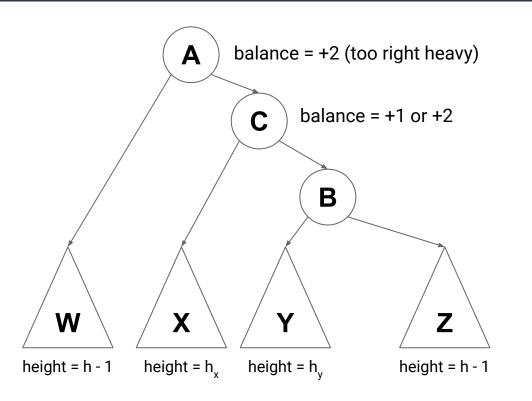
How can we fix this?



How can we fix this?

Height of **C** we know must be **h** 

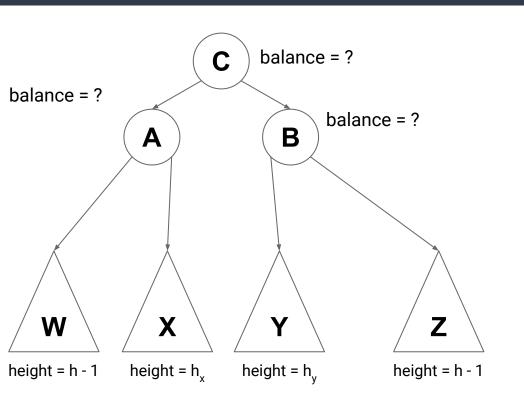
Therefore At least one of  $h_x$  or  $h_y$  must be h - 1



How can we fix this?
Rotate right first: rotate(B,C)

Height of **C** we know must be **h** 

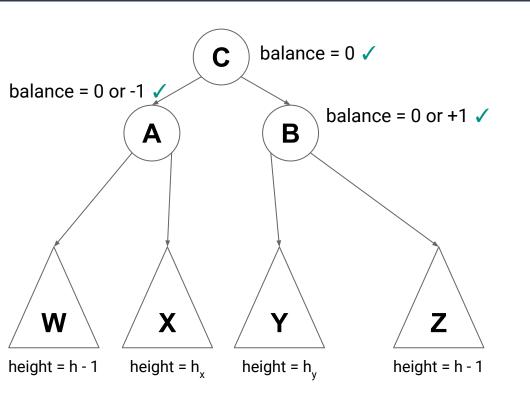
Therefore At least one of  $h_x$  or  $h_y$  must be h - 1



How can we fix this?
Rotate right first: rotate(B,C)
Then right left: rotate(A,C)

Height of **C** we know must be **h** 

Therefore At least one of  $h_x$  or  $h_y$  must be h - 1



How can we fix this?
Rotate right first: rotate(B,C)
Then right left: rotate(A,C)

Height of **C** we know must be **h** 

Therefore At least one of  $h_x$  or  $h_y$  must be h - 1

- If too right heavy (balance == +2)
  - If right child is right heavy (balance == +1) or balanced (balance == 0)
    - rotate left around the root
  - If right child is left heavy (balance == -1)
    - rotate right around root of right child, then rotate left around root
- If too left heavy (balance == -2)
  - Same as above but flipped

Therefore if we have a balance factor that is off, but all children are AVL trees, we can fix the balance factor in at most 2 rotations

## Inserting Records

To insert a record into an AVL Tree:

- 1. Find the insertion point (remember it is a BST)
- 2. Insert the new leaf and set balance factor to 0
- Trace path back up to root and update balance factors
  - a. If a balance factor becomes +/-2 then rotate to fix

#### **Inserting Records**

#### To insert a record into an AVL Tree:

1.	Find the insertion point (remember it is a BST)	$O(d) = O(\log n)$
2.	Insert the new leaf and set balance factor to 0	<i>O</i> (1)
3.	Trace path back up to root and update balance factors	$O(d) = O(\log n)$

Trace path back up to root and update balance ractors a. If a balance factor becomes +/-2 then rotate to fix 0(1)

```
public void insert(T value, AVLTreeNode<T> root) {
    // Use normal logic for inserting into a BST, then set heavy flags
    AVLTreeNode<T> newNode = insertIntoBST(value, root);
    newNode.isLeftHeavy = newNode.isRightHeavy = false;
    while (newNode.parent.isPresent()) {
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
        // Fix issues that occur from inserting into parents left subtree
       } else {
        // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
12
13
```

```
1|public void insert(T value, AVLTreeNode<T> root) {
      // Use normal logic for inserting into a BST, then set heavy flags
     AVLTreeNode<T> newNode = insertIntoBST(value, root);
     newNode.isLeftHeavy = newNode.isRightHeavy = false;
     while (newNode.parent.isPresent()) {
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
         // Fix issues that occur from inserting into parents left subtree
       } else {
         // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
                                               Find insertion point and create the new
                                               leaf O(d) = O(\log n)
12
13
```

```
public void insert(T value, AVLTreeNode<T> root) {
     // Use normal logic for inserting into a BST, then set heavy flags
     AVLTreeNode<T> newNode = insertIntoBST(value, root);
     newNode.isLeftHeavy = newNode.isRightHeavy = false;
                                                           O(d) = O(\log n) iterations
     while (newNode.parent.isPresent()) { ←
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
         // Fix issues that occur from inserting into parents left subtree
       } else {
         // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
12
13
```

```
public void insert(T value, AVLTreeNode<T> root) {
     // Use normal logic for inserting into a BST, then set heavy flags
     AVLTreeNode<T> newNode = insertIntoBST(value, root);
     newNode.isLeftHeavy = newNode.isRightHeavy = false;
     while (newNode.parent.isPresent()) {
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
         // Fix issues that occur from inserting into parents left subtree
       } else {
         // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
                                          What is the cost of each iteration?
12
                                          How exactly do we fix the issues? (next slide)
13
```

```
| if (newNode.parent.get().leftChild.orElse(null) == newNode) {
    // Fix issues that occur from inserting into parents left subtree
     if (newNode.parent.get().isRightHeavy) {
       newNode.parent.get().isRightHeavy = false;
       return
6
     } else if (newNode.parent.get().isLeftHeavy) {
       if (newNode.isLeftHeavy) newNode.parent.get().rotateRight();
       else newNode.parent.get().rotateLeftRight();
       return
10
     } else {
11
       newNode.parent.get().isLeftHeavy = true;
12
13
```

```
if (newNode.parent.get().leftChild.orElse(null) == newNode) {
     // Fix issues that occur from inserting into parents left subtree
     if (newNode.parent.get().isRightHeavy) {
                                                         If we inserted into the left of a
       newNode.parent.get().isRightHeavy = false;
                                                          right heavy subtree, then the
                                                         subtree is no longer right heavy
       return
                                                             and we can stop here
     } else if (newNode.parent.get().isLeftHeavy)
6
       if (newNode.isLeftHeavy) newNode.parent.get().rotateRight();
       else newNode.parent.get().rotateLeftRight();
       return
10
     } else {
11
       newNode.parent.get().isLeftHeavy = true;
12
13
```

```
if (newNode.parent.get().leftChild.orElse(null)
                                                        If we inserted into the left of a left
     // Fix issues that occur from inserting into
                                                           heavy subtree, then we just
     if (newNode.parent.get().isRightHeavy) {
                                                         created imbalance, and need to
                                                          rotate. But then we can stop.
       newNode.parent.get().isRightHeavy = false;
       return
6
     } else if (newNode.parent.get().isLeftHeavy) {
       if (newNode.isLeftHeavy) newNode.parent.get().rotateRight();
       else newNode.parent.get().rotateLeftRight();
       return
10
     } else {
11
       newNode.parent.get().isLeftHeavy = true;
12
13
```

```
if (newNode.parent.get().leftChild.orElse(null) == newNode) {
     // Fix issues that occur from inserting into parents left subtree
     if (newNode.parent.get().isRightHeavy) {
       newNode.parent.get().isRightHeavy = false;
       return
                                                         If we inserted into the left of a
6
     } else if (newNode.parent.get().isLeftHeavy)
                                                        balanced subtree, then we mark it
       if (newNode.isLeftHeavy) newNode.parent.get
                                                          as now being left heavy, and
       else newNode.parent.get().rotateLeftRight()
                                                             continue up the tree
       return
     } else {
10
11
       newNode.parent.get().isLeftHeavy = true;
12
13
```

```
public void insert(T value, AVLTreeNode<T> root) {
     // Use normal logic for inserting into a BST, then set heavy flags
    AVLTreeNode<T> newNode = insertIntoBST(value, root);
     newNode.isLeftHeavy = newNode.isRightHeavy = false;
     while (newNode.parent.isPresent()) {
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
6
         // Fix issues that occur from inserting into parents left subtree
       } else {
         // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
                                         What is the cost of each iteration? O(1)
12
13
```

```
public void insert(T value, AVLTreeNode<T> root) {
     // Use normal logic for inserting into a BST, then set heavy flags
     AVLTreeNode<T> newNode = insertIntoBST(value, root);
     newNode.isLeftHeavy = newNode.isRightHeavy = false;
     while (newNode.parent.isPresent()) {
       if (newNode.parent.get().leftChild.orElse(null) == newNode) {
         // Fix issues that occur from inserting into parents left subtree
       } else {
         // Fix issues that occur from inserting into parents right subtree
10
11
       newNode = newNode.parent.get();
12
                          Therefore, our total insertion cost is O(d) = O(\log(n))
13
```

# Removing Records

- Removal follows essentially the same process as insertion
  - Do a normal BST removal.
  - Go back up the tree adjusting balance factors
  - If you discover a balance factor that goes to +2/-2, rotate to fix

• We want shallow BSTs (it makes **find**, **insert**, **remove** faster)

- We want shallow BSTs (it makes find, insert, remove faster)
- Enforcing AVL constraints makes our BSTs shallow
  - The constraints are |height(right) height(left)| ≤ 1
  - It will guarantee  $d = O(\log(n))$

- We want shallow BSTs (it makes find, insert, remove faster)
- Enforcing AVL constraints makes our BSTs shallow
  - The constraints are |height(right) height(left)| ≤ 1
  - It will guarantee  $d = O(\log(n))$
- Adding/removing from a BST changes height by at most 1
- A rotation can also change a BST height by at most 1

- We want shallow BSTs (it makes find, insert, remove faster)
- Enforcing AVL constraints makes our BSTs shallow
  - The constraints are |height(right) height(left)| ≤ 1
  - o It will guarantee d = O(log(n))
- Adding/removing from a BST changes height by at most 1
- A rotation can also change a BST height by at most 1
- Therefore after insert/remove into an AVL tree, we can reinforce AVL constraints with one (or two) rotations
  - We only need to make one trip back up the tree to do so
  - Therefore insert/remove is still  $O(d) = O(\log(n))$