



# A BRIEF NOTE ON ALGORITHM COMPLEXITY (ASYMPTOTIC COMPLEXITY)

- A function  $f(n) = O(g(n))$  if there exist constants  $c$  and  $n_0$  such that  $f(n) \leq cg(n)$  for all  $n \geq n_0$

- Note

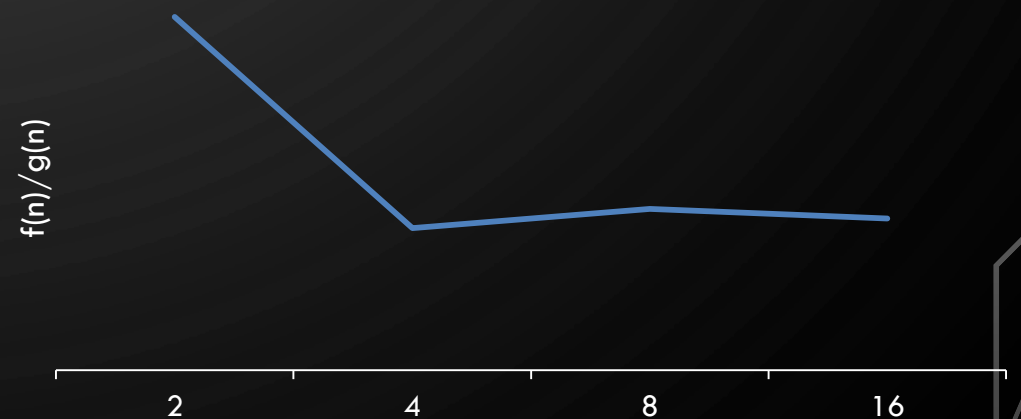
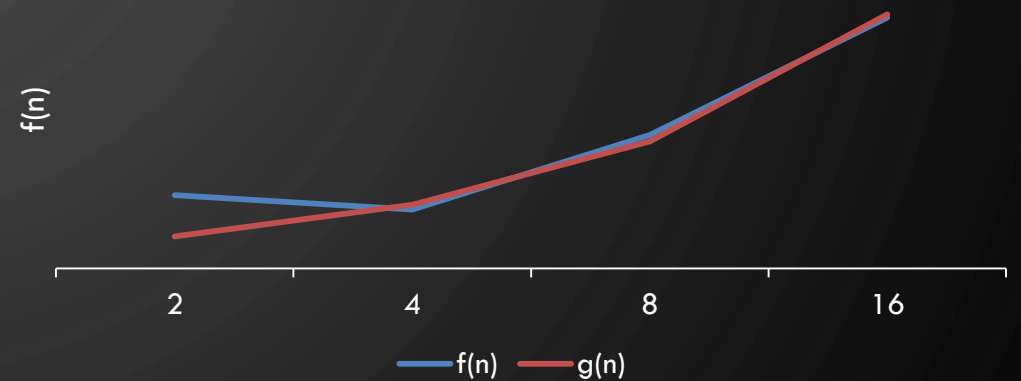
- $f(n)$  is the actual time an algorithm would take (real/measured time)
- $g(n)$  is the expected or theoretical time

- Big-Oh is ordered, note

- $1 = O(n)$  for all constants  $c$
- $n = O(n \log n)$  for all constants  $c$
- Etc


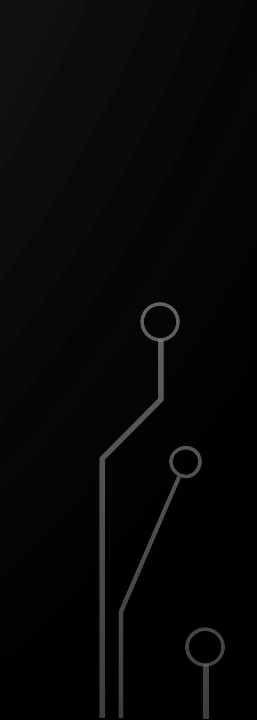
- $c$  and  $n_0$  are considered Big-Oh constants

- Can figure  $c$  by finding the smallest value such that  $\frac{f(n)}{g(n)} \leq c$ ,  $n_0$  is where  $c$  starts to hold



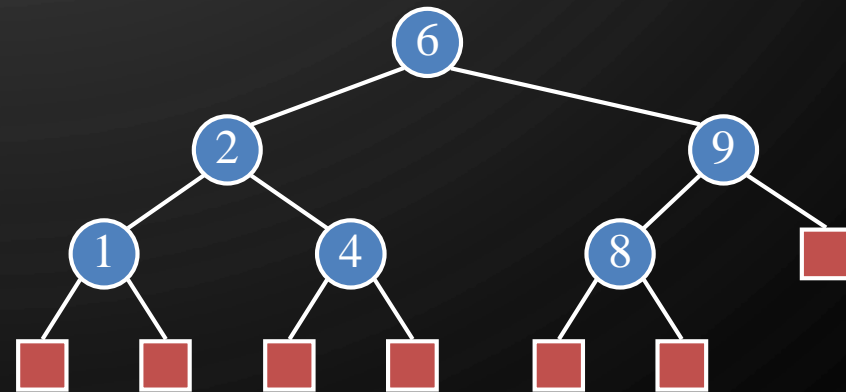


# DETERMINING ALGORITHM COMPLEXITY

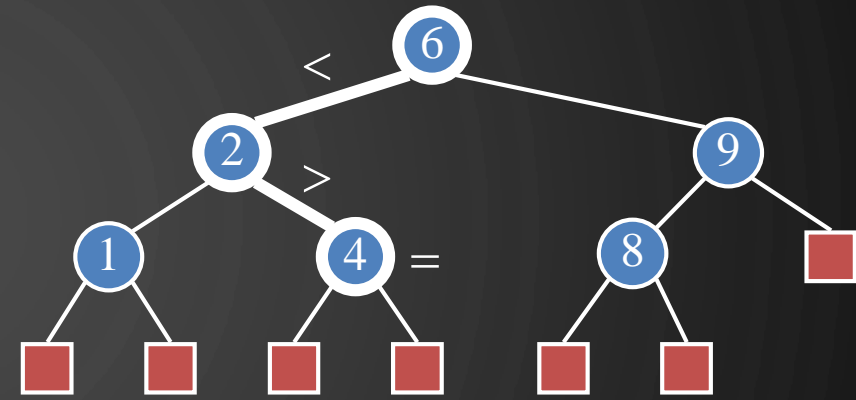
- Count ALL operations
  - Again....count ALL operations
  - MAYDAY....count ALL operations
  
  - Jokes aside, this is the easiest way. An operation will be expressed as a function of the input size (algorithm complexity)
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# BINARY SEARCH TREES

- A binary search tree is a binary tree storing entries  $(k, e)$  (i.e., key-value pairs) at its internal nodes and satisfying the following property:
  - Let  $u, v$ , and  $w$  be three nodes such that  $u$  is in the left subtree of  $v$  and  $w$  is in the right subtree of  $v$ . Then  $key(u) \leq key(v) \leq key(w)$
- External nodes do not store items
- An inorder traversal of a binary search tree visits the keys in increasing order



# SEARCH



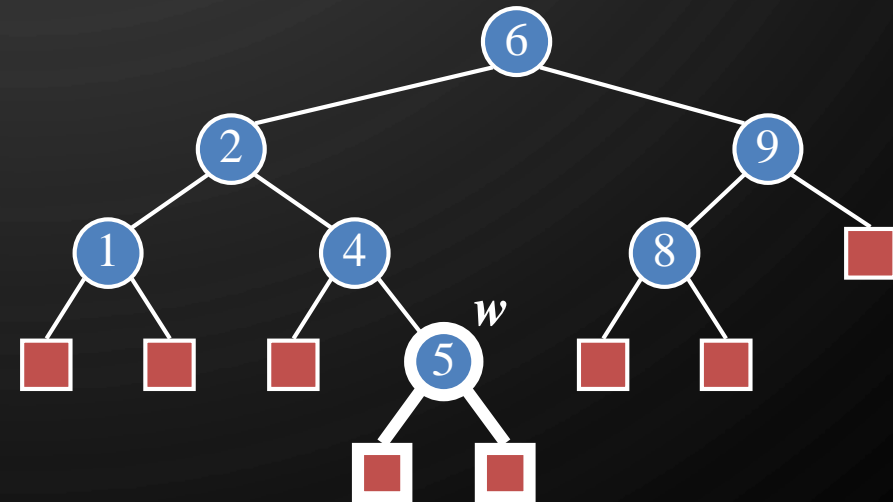
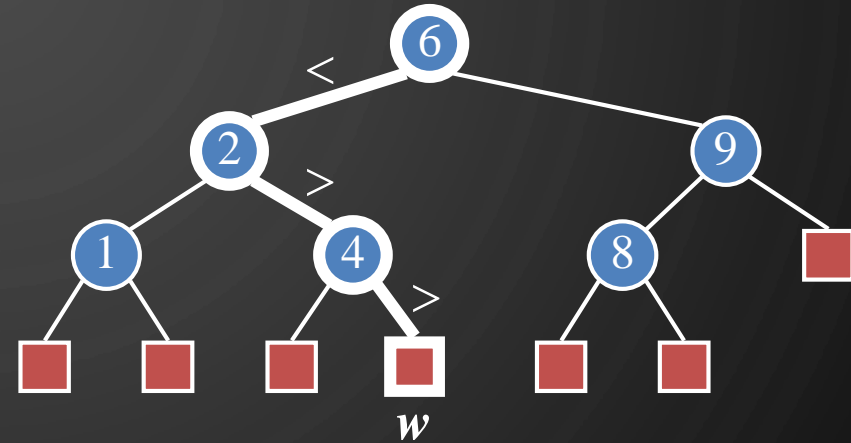
- To search for a key  $k$ , we trace a downward path starting at the root
- The next node visited depends on the outcome of the comparison of  $k$  with the key of the current node
- If we reach a leaf, the key is not found
- Example: `find(4)`
- Algorithms for `floorEntry()` and `ceilingEntry()` are similar

Algorithm `Search( $k, v$ )`

1. if `v.isExternal()`
2. return `v`
3. if `k < v.key()`
4. return `Search(k, v.left())`
5. else if `k = v.key()`
6. return `v`
7. else // `k > v.key()`
8. return `Search(k, v.right())`

# INSERTION



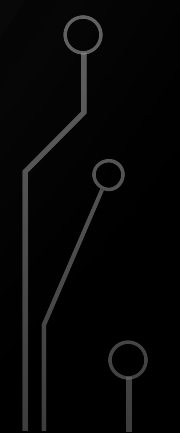
- To perform operation  $\text{put}(k, v)$ , we search for key  $k$  (using  $\text{Search}(k)$ )
- Assume  $k$  is not already in the tree, and let  $w$  be the leaf reached by the search
- We insert  $k$  at node  $w$  and expand  $w$  into an internal node
- Example: insert 5





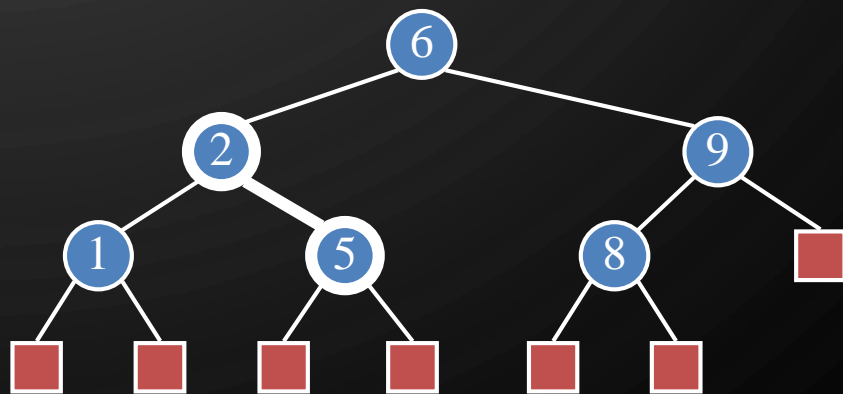
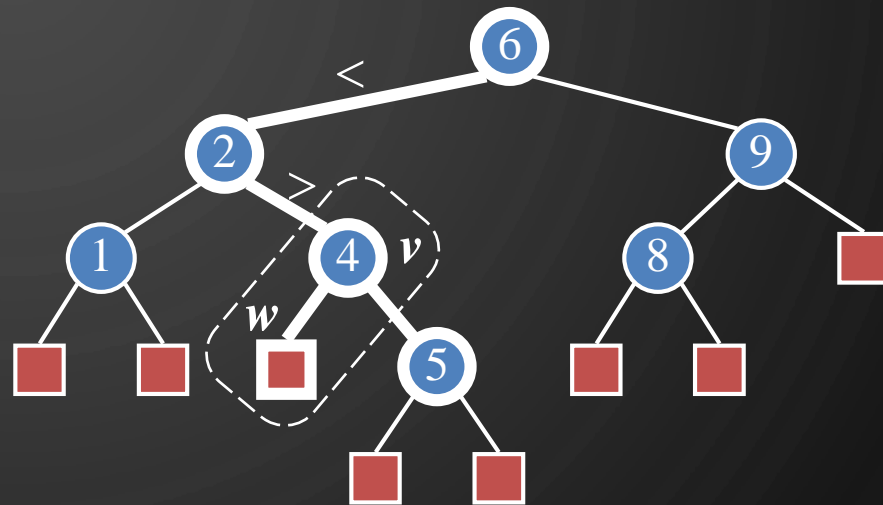
# EXERCISE

## BINARY SEARCH TREES

- Insert into an initially empty binary search tree items with the following keys (in this order). Draw the resulting binary search tree
    - 30, 40, 24, 58, 48, 26, 11, 13
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# DELETION

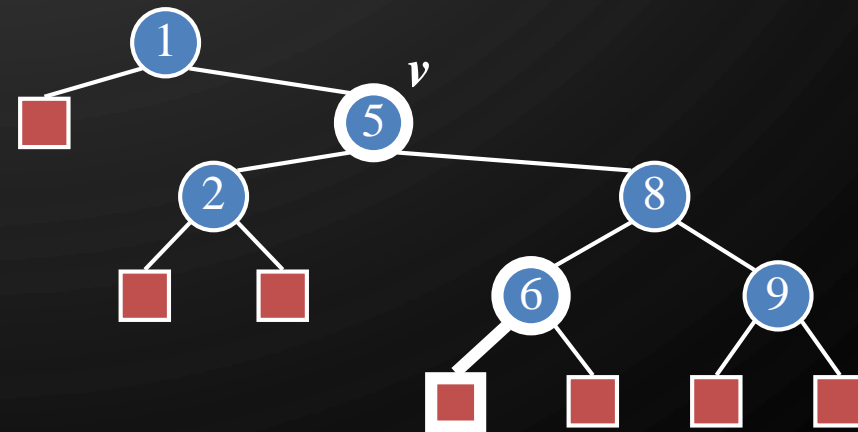
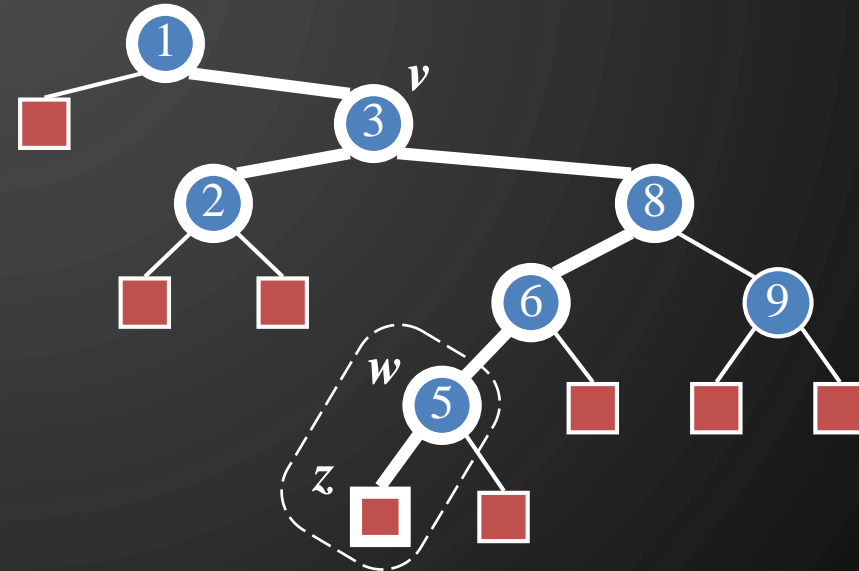
- To perform operation  $\text{erase}(k)$ , we search for key  $k$
- Assume key  $k$  is in the tree, and let  $v$  be the node storing  $k$
- If node  $v$  has a leaf child  $w$ , we remove  $v$  and  $w$  from the tree with operation  $\text{removeAboveExternal}(w)$ , which removes  $w$  and its parent
- Example: remove 4





# DELETION (CONT.)



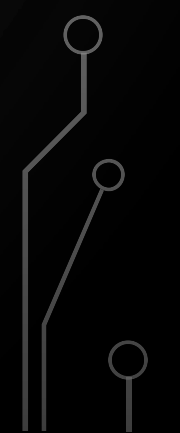
- We consider the case where the key  $k$  to be removed is stored at a node  $v$  whose children are both internal
  - we find the internal node  $w$  that follows  $v$  in an inorder traversal
  - we copy  $w.key$  into node  $v$
  - we remove node  $w$  and its left child  $z$  (which must be a leaf) by means of operation `removeAboveExternal(z)`
- Example: remove 3





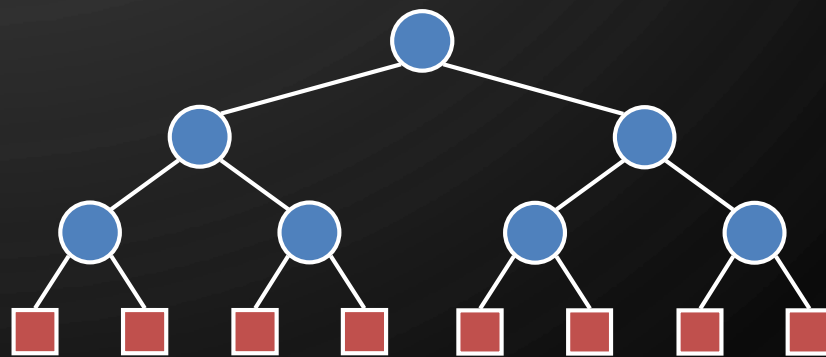
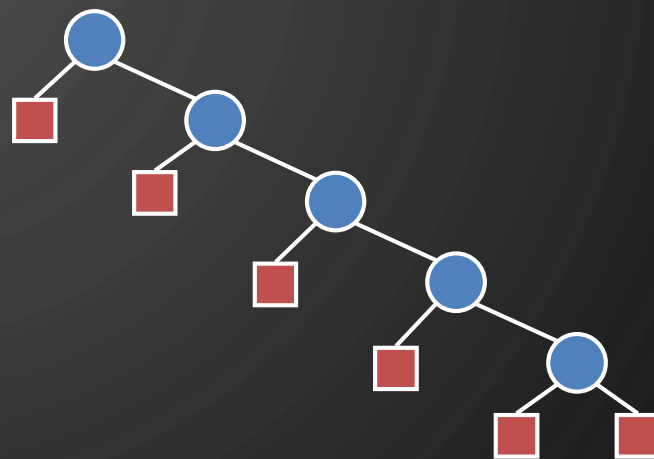
# EXERCISE

## BINARY SEARCH TREES

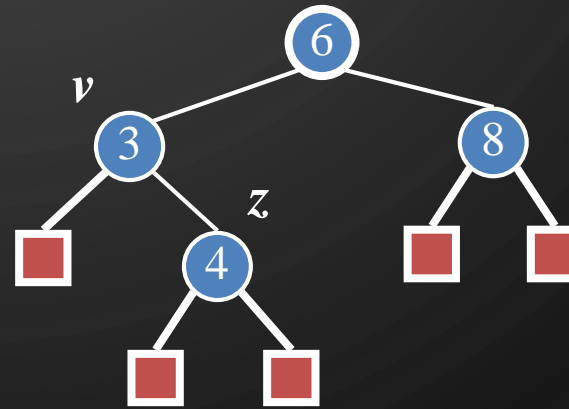
- Insert into an initially empty binary search tree items with the following keys (in this order). Draw the resulting binary search tree
    - 30, 40, 24, 58, 48, 26, 11, 13
  - Now, remove the item with key 30. Draw the resulting tree
  - Now remove the item with key 48. Draw the resulting tree.
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# PERFORMANCE

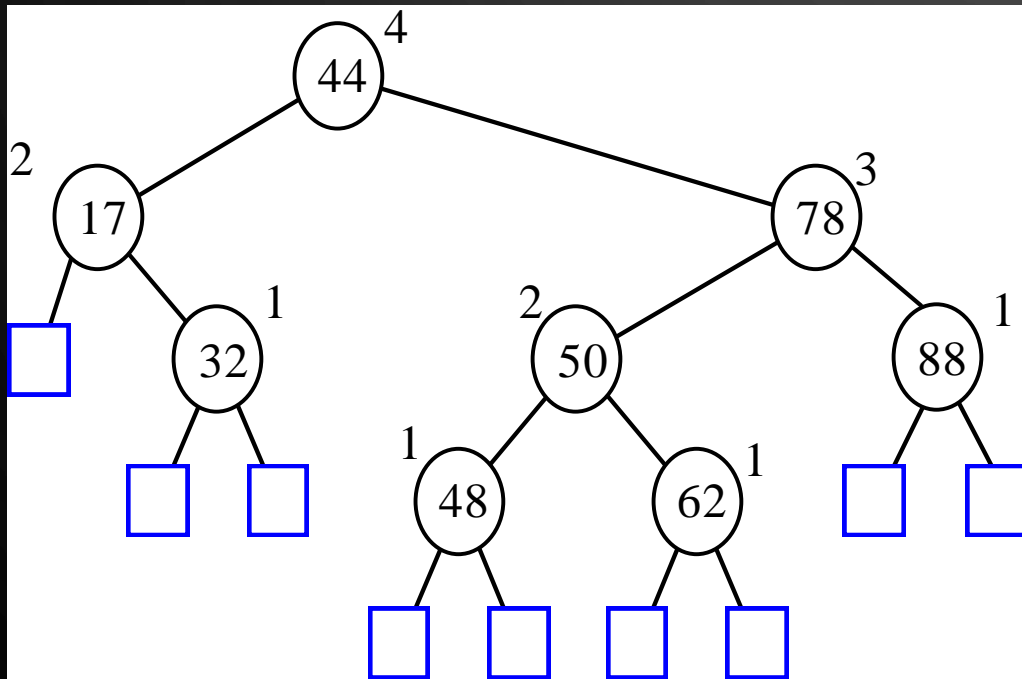
- Consider an ordered map with  $n$  items implemented by means of a binary search tree of height  $h$ 
  - Space used is  $O(n)$
  - Methods  $\text{find}(k)$ ,  $\text{floorEntry}(k)$ ,  $\text{ceilingEntry}(k)$ ,  $\text{put}(k, v)$ , and  $\text{erase}(k)$  take  $O(h)$  time
- The height  $h$  is  $O(n)$  in the worst case and  $O(\log n)$  in the best case



# AVL TREES



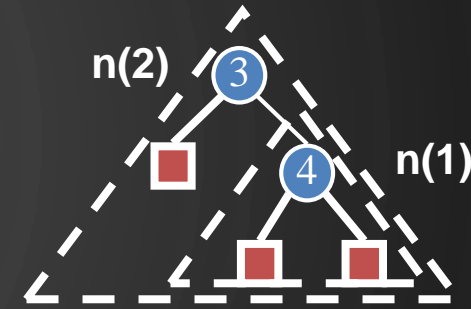
# AVL TREE DEFINITION



An example of an AVL tree where the heights are shown next to the nodes:

- AVL trees are balanced
- An **AVL Tree** is a binary search tree such that for every internal node  $v$  of  $T$ , the heights of the children of  $v$  can differ by at most 1

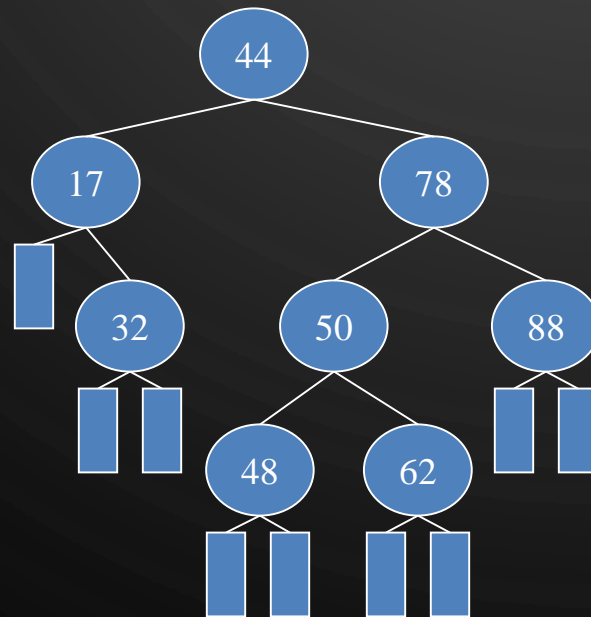
# HEIGHT OF AN AVL TREE



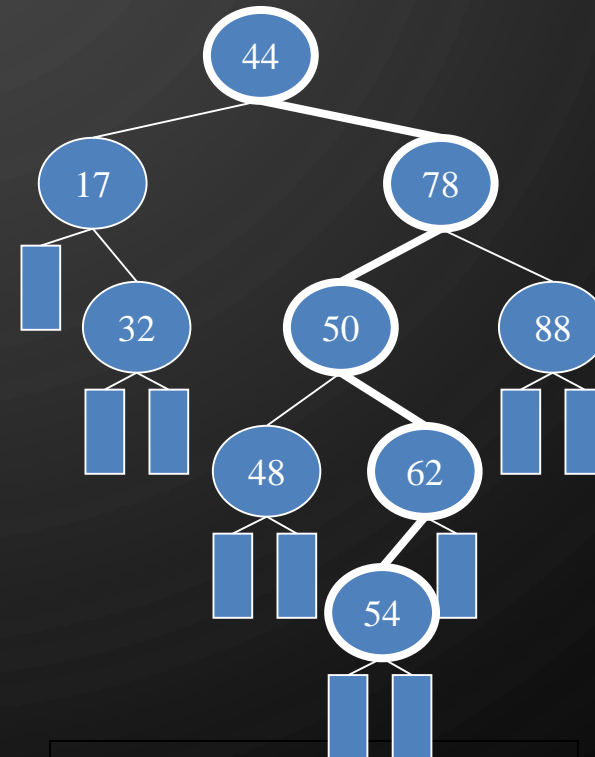
- Fact: The height of an AVL tree storing  $n$  keys is  $O(\log n)$ .
- Proof: Let us bound  $n(h)$ : the minimum number of internal nodes of an AVL tree of height  $h$ .
- We easily see that  $n(1) = 1$  and  $n(2) = 2$
- For  $n > 2$ , an AVL tree of height  $h$  contains the root node, one AVL subtree of height  $h - 1$  and another of height  $h - 2$ .
- That is,  $n(h) = 1 + n(h - 1) + n(h - 2)$
- Knowing  $n(h - 1) > n(h - 2)$ , we get  $n(h) > 2n(h - 2)$ . So
  - $n(h) > 2n(h - 2) > 4n(h - 4) > 8n(h - 6), \dots$  (by induction),
  - $n(h) > 2^i n(h - 2i)$
- Solving the base case we get:  $n(h) > 2^{\frac{h}{2}-1}$
- Taking logarithms:  $h < 2 \log n(h) + 2$
- Thus the height of an AVL tree is  $O(\log n)$

# INSERTION IN AN AVL TREE

- Insertion is as in a binary search tree
- Always done by expanding an external node.
- Example insert 54:



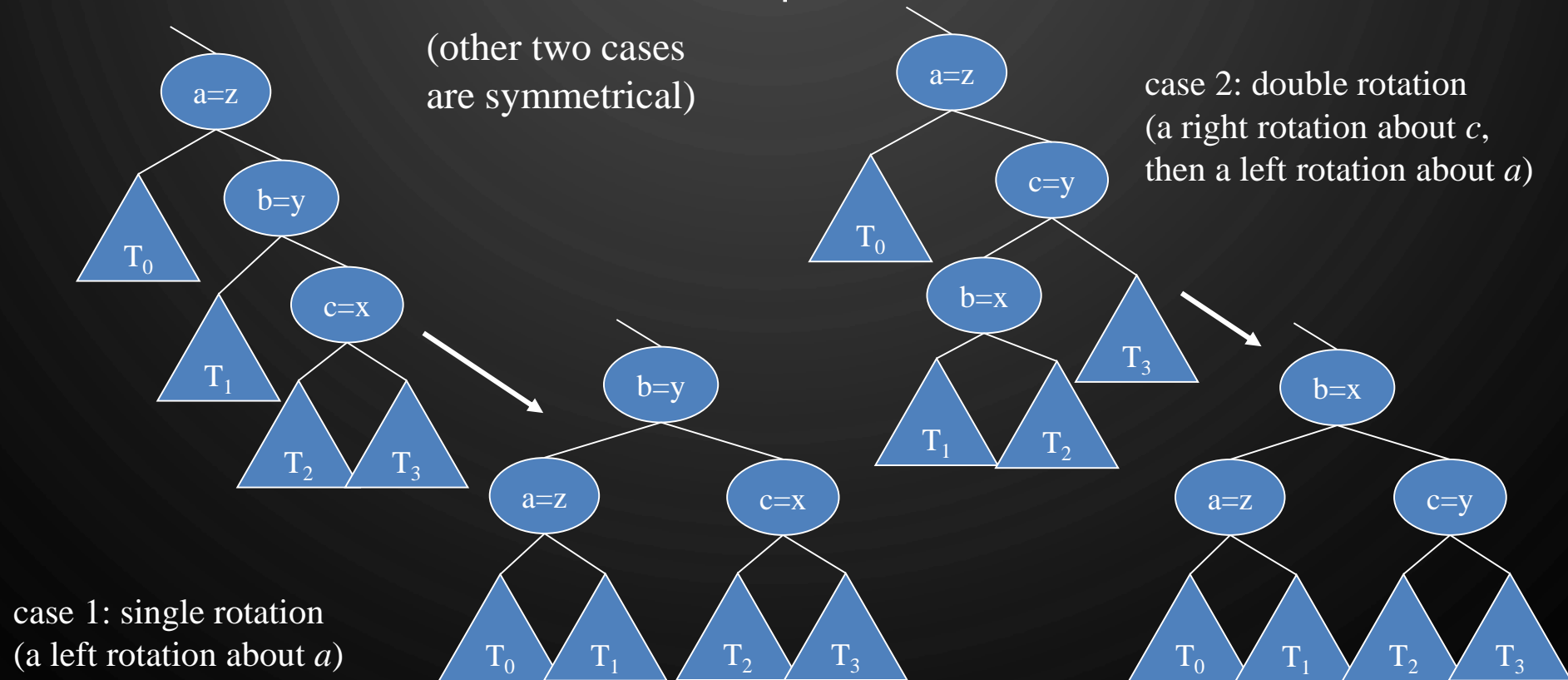
Before Insertion



After Insertion

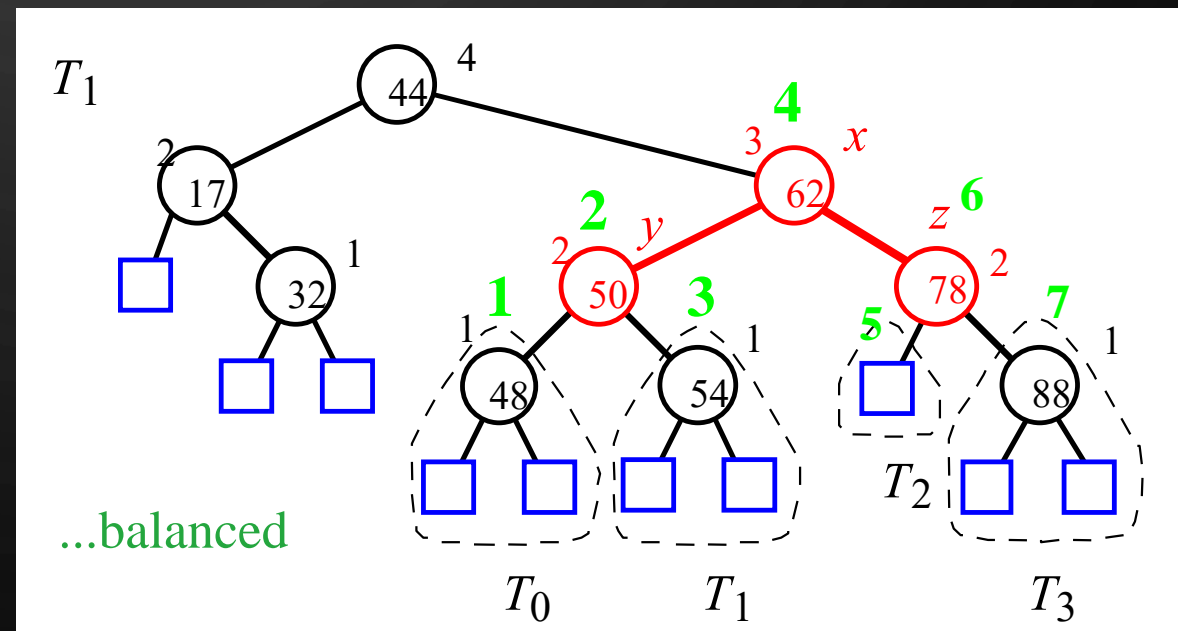
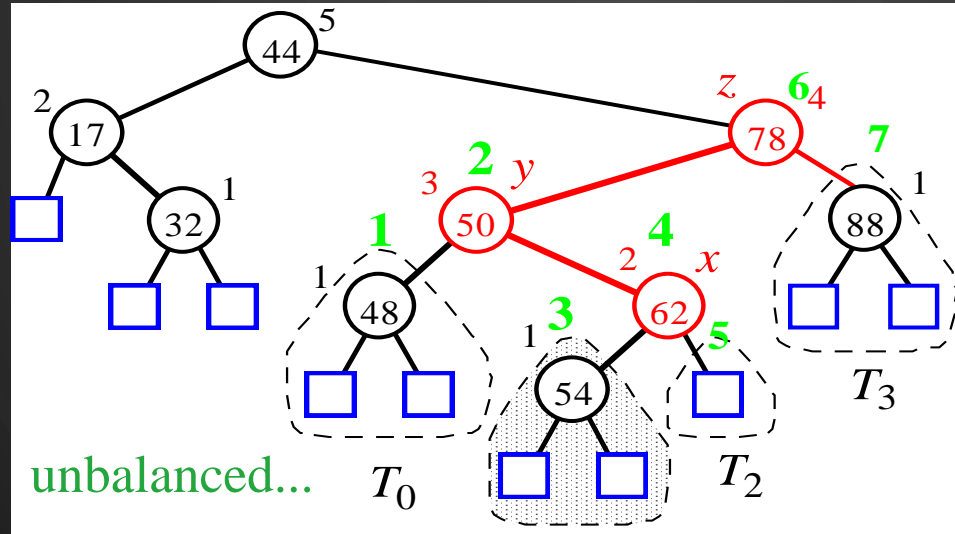
# TRINODE RESTRUCTURING

- let  $(a, b, c)$  be an inorder listing of  $x, y, z$
- perform the rotations needed to make  $b$  the topmost node of the three

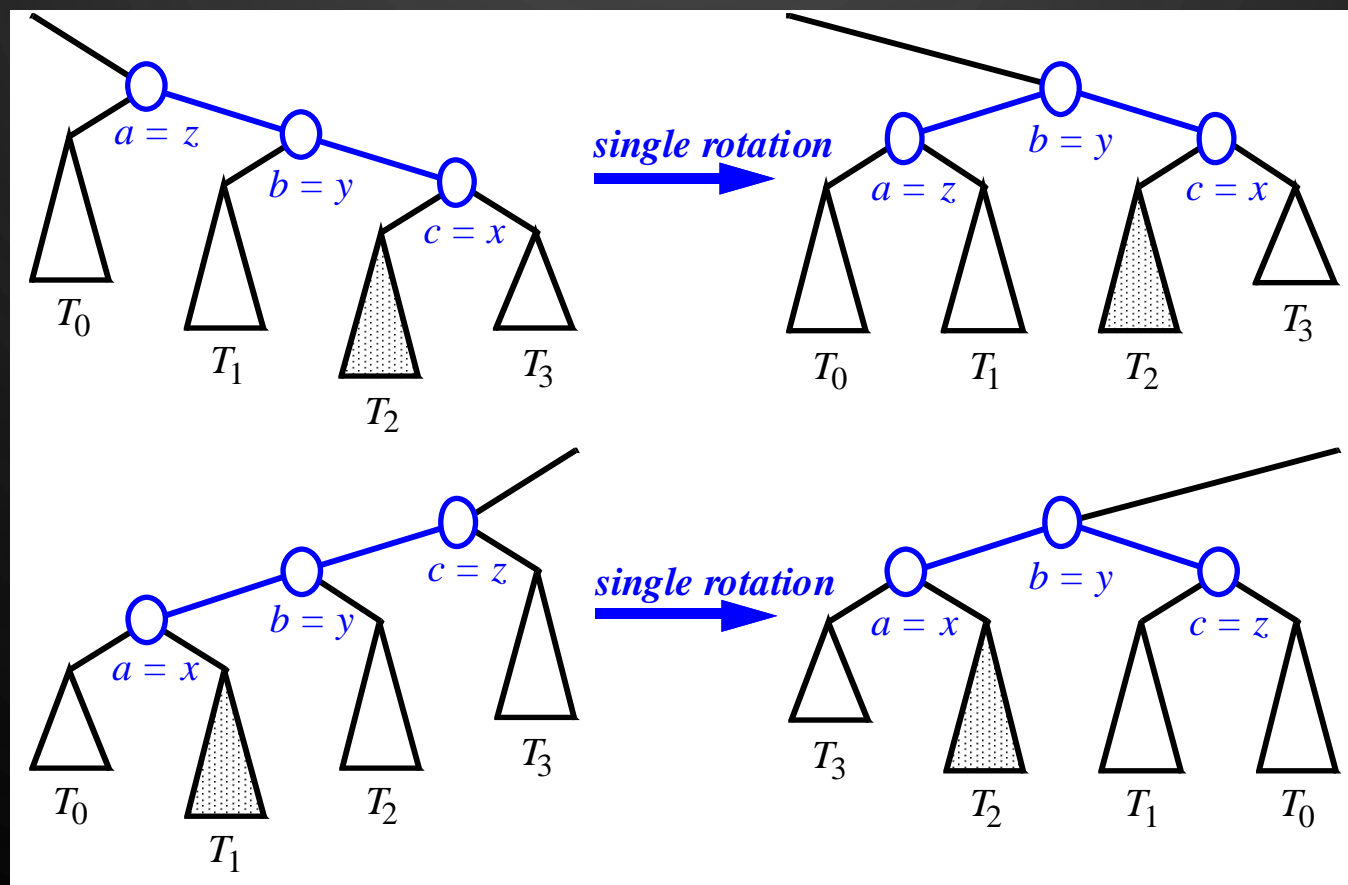




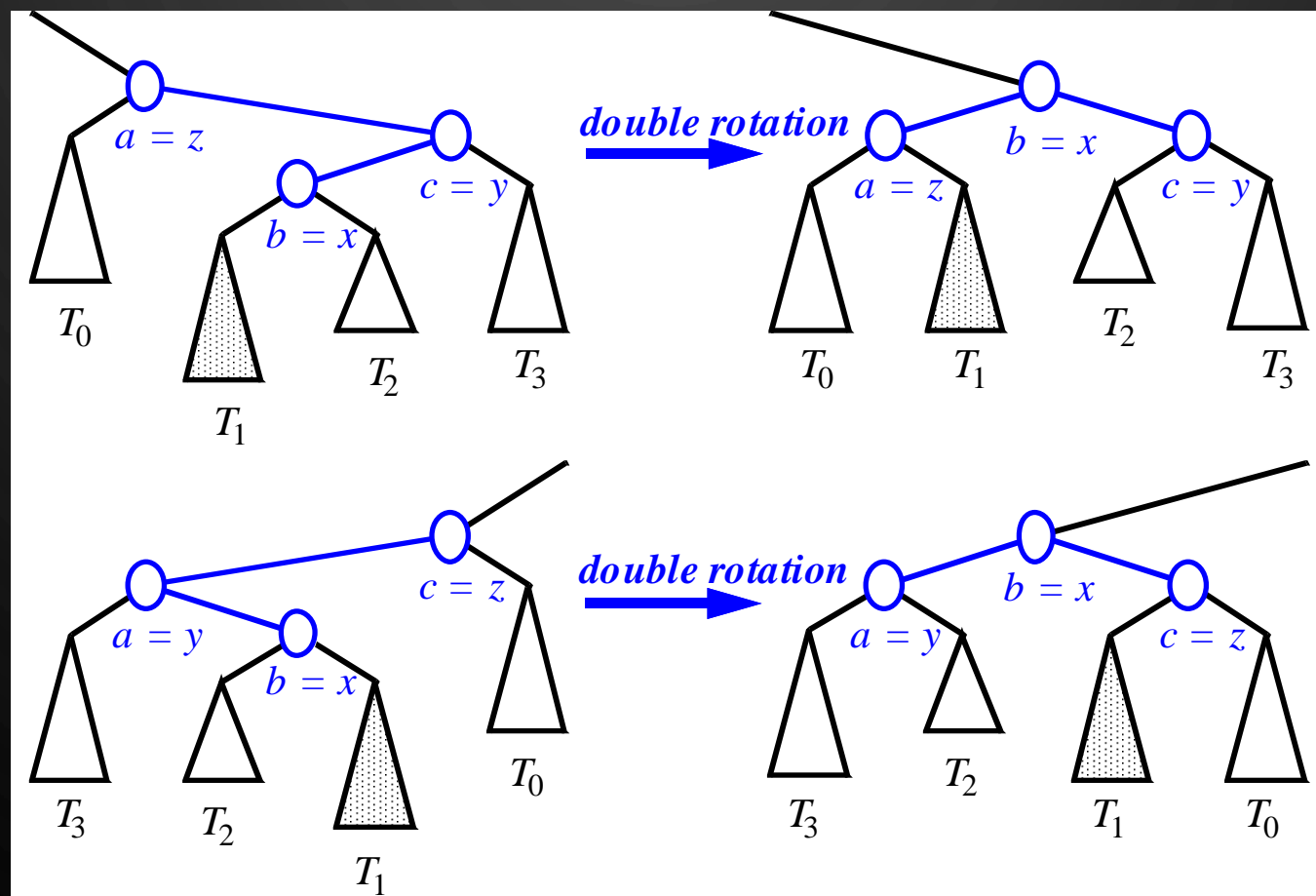
# INSERTION EXAMPLE, CONTINUED



# RESTRUCTURING SINGLE ROTATIONS




# RESTRUCTURING DOUBLE ROTATIONS

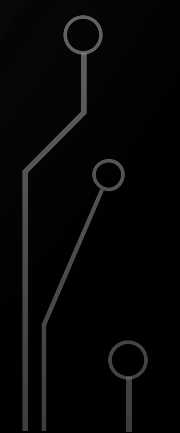




# EXERCISE

## AVL TREES

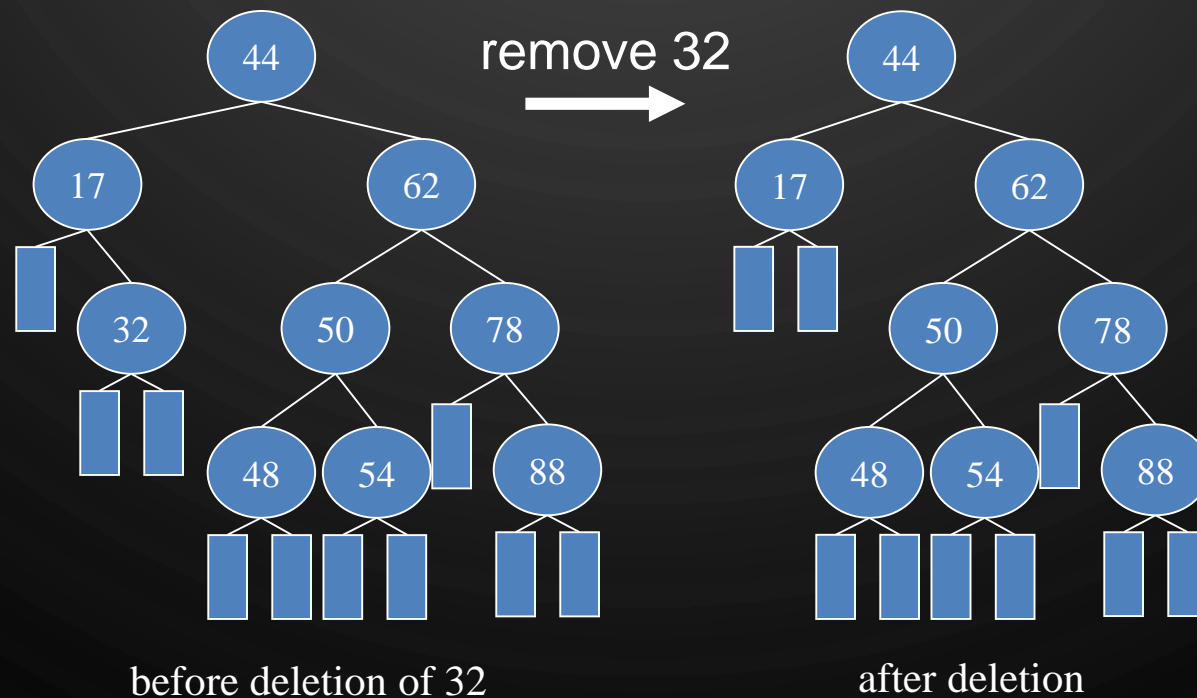
- Insert into an initially empty AVL tree items with the following keys (in this order). Draw the resulting AVL tree
    - 30, 40, 24, 58, 48, 26, 11, 13
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# REMOVAL IN AN AVL TREE

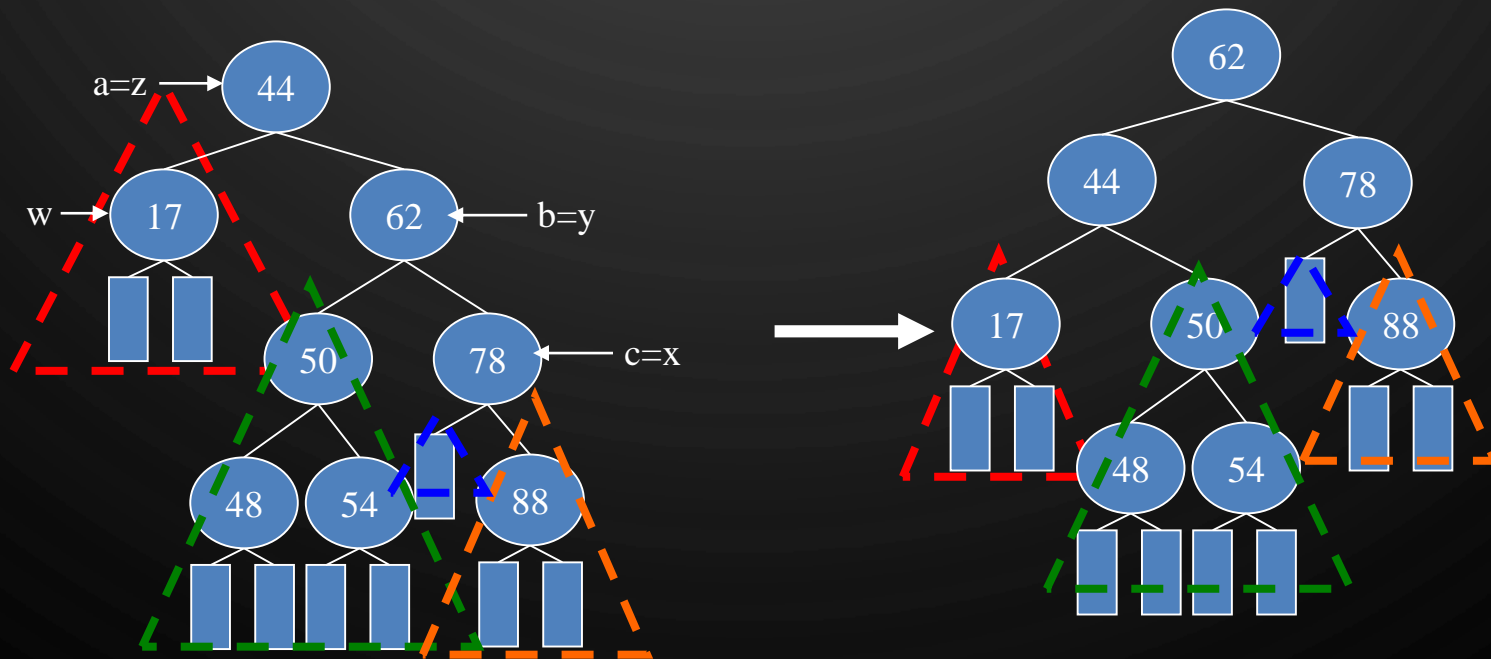
- Removal begins as in a binary search tree, which means the node removed will become an empty external node. Its parent,  $w$ , may cause an imbalance.

• Example:



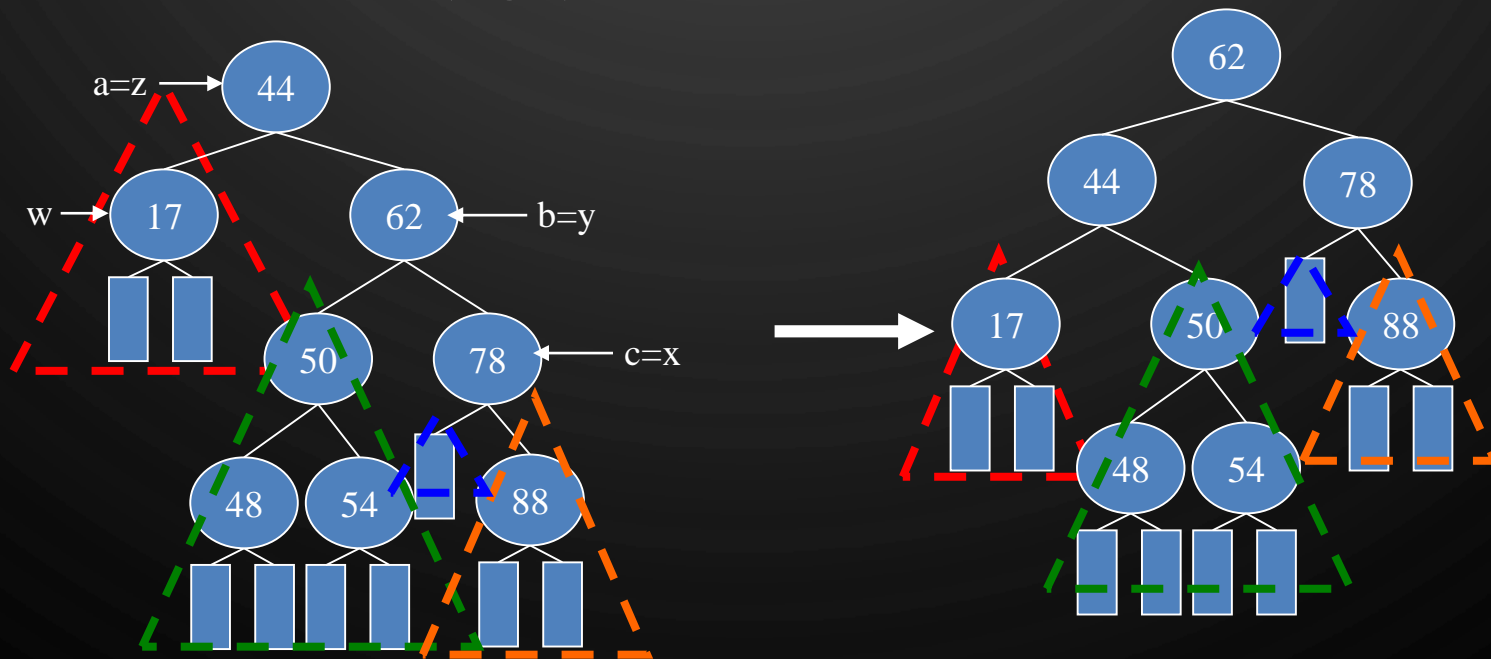
# REBALANCING AFTER A REMOVAL

- Let  $z$  be the **first unbalanced** node encountered while travelling up the tree from  $w$  (parent of removed node). Also, let  $y$  be the child of  $z$  with the larger height, and let  $x$  be the child of  $y$  with the larger height.
- We perform **restructure( $x$ )** to restore balance at  $z$ .



# REBALANCING AFTER A REMOVAL


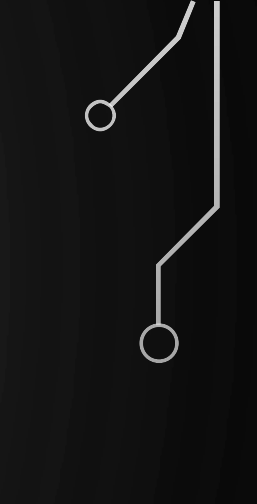
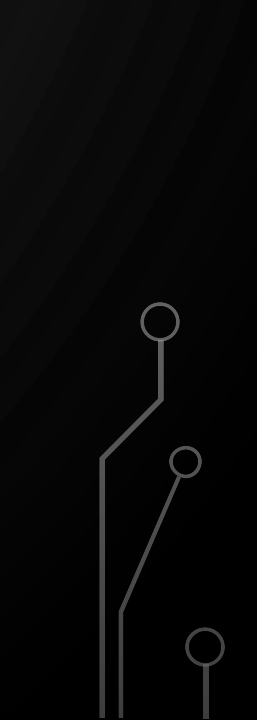
- As this restructuring may upset the balance of another node higher in the tree, we must continue checking for balance until the root of  $T$  is reached
  - This can happen at most  $O(\log n)$  times. Why?





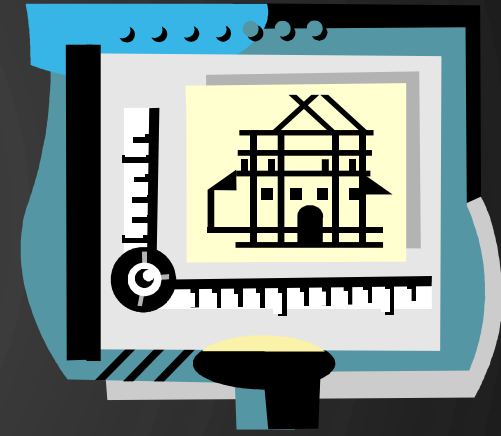
# EXERCISE

## AVL TREES

- Insert into an initially empty AVL tree items with the following keys (in this order). Draw the resulting AVL tree
    - 30, 40, 24, 58, 48, 26, 11, 13
  - Now, remove the item with key 48. Draw the resulting tree
  - Now, remove the item with key 58. Draw the resulting tree
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# RUNNING TIMES FOR AVL TREES



- A **single restructure** is  $O(1)$  – using a linked-structure binary tree
- **find( $k$ )** takes  $O(\log n)$  time – height of tree is  $O(\log n)$ , no restructures needed
- **put( $k, v$ )** takes  $O(\log n)$  time
  - Initial find is  $O(\log n)$
  - Restructuring up the tree, maintaining heights is  $O(\log n)$
- **erase( $k$ )** takes  $O(\log n)$  time
  - Initial find is  $O(\log n)$
  - Restructuring up the tree, maintaining heights is  $O(\log n)$

# OTHER TYPES OF SELF-BALANCING TREES

- Splay Trees – A binary search tree which uses an operation  $\text{splay}(x)$  to allow for amortized complexity of  $O(\log n)$
- (2,4) Trees – A multiway search tree where every node stores internally a list of entries and has 2, 3, or 4 children. Defines self-balancing operations
- Red-Black Trees – A binary search tree which colors each internal node red or black. Self-balancing dictates changes of colors and required rotation operations

