# B-Trees

**CMSC 420** 

### Improving our index

- B-Tree: A generalization of a 2-3 tree.
  - Parameter p (for pointer) controls the fan-out (#children) of every node.
  - For efficiency purposes, usually nodes allocated with static array of size p that contain pointers to subtrees.
  - Any non-root node can have between  $\left[\frac{p}{2}\right] 1$  and p 1 keys inclusive.
  - The root itself is the only node allowed to have a single key (2 children)
    - Just allowed. Not necessarily "has to have".

### Next-level quiz

• Quiz: To separate p subtrees I need the following #separators...

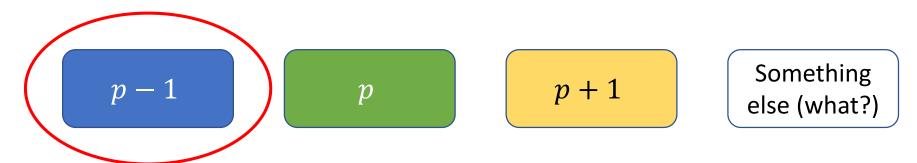
### Next-level quiz

• Quiz: To separate p subtrees I need the following #separators...



### Next-level quiz

• Quiz: To separate p subtrees I need the following #separators...



So, all B-Tree nodes have (p-1) 4-byte separators and p 8-byte pointers, for a total memory footprint of  $12p-4=\mathcal{O}(p)$  each!

### Insertion / Deletion into B-Trees

- Generalization of insertion /deletion in 2-3 trees.
  - Difference: arrays of keys and references inside every node
- Some new constraints, though:
  - 1. Any non-root node can have between  $\left\lceil \frac{p}{2} \right\rceil 1$  and p-1 keys.
    - Exception: root can have 2 children! (we'll see why)
  - 2. If a key is inserted into a node with p-1 keys, we have an overflow.
  - 3. If a key is deleted from a leaf node with  $\left\lceil \frac{p}{2} \right\rceil 1$  keys, we have an underflow.

### What's with the constraint on the root?

• Suppose we have p=8 and the following "stub" B-Tree consisting of just the root...

30, 36, 52, 67, 79, 90, 98

### What's with the constraint on the root?

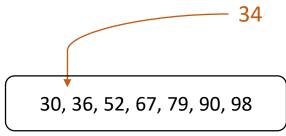
• Suppose we have p=8 and the following "stub" B-Tree consisting of just the root...

30, 36, 52, 67, 79, 90, 98

And now I want to insert they key 34 in my tree.

### What's with the constraint on the root?

• Suppose we have p=8 and the following "stub" B-Tree consisting of just the root...



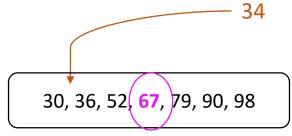
And now I want to insert they key 34 in my tree.





### What's with the constraints on root and leaves?

• Suppose we have p=8 and the following "stub" B-Tree consisting of just the root...



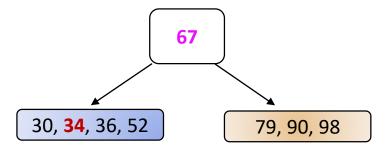
- And now I want to insert they key 34 in my tree.
- Solution: Split the root!



### What's with the constraints on root and leaves?

• Suppose we have p=8 and the following "stub" B-Tree consisting of

just the root...



- And now I want to insert they key 34 in my tree.
- Solution: Split the root!
  - Left child: holds  $4 = \left\lceil \frac{p}{2} \right\rceil \ge \left\lceil \frac{p}{2} \right\rceil 1$  keys which is our lower bound

**APPROVES** 

• Right child: holds  $3 = \left\lceil \frac{p}{2} \right\rceil \ge \left\lceil \frac{p}{2} \right\rceil - 1$ , our lower bound

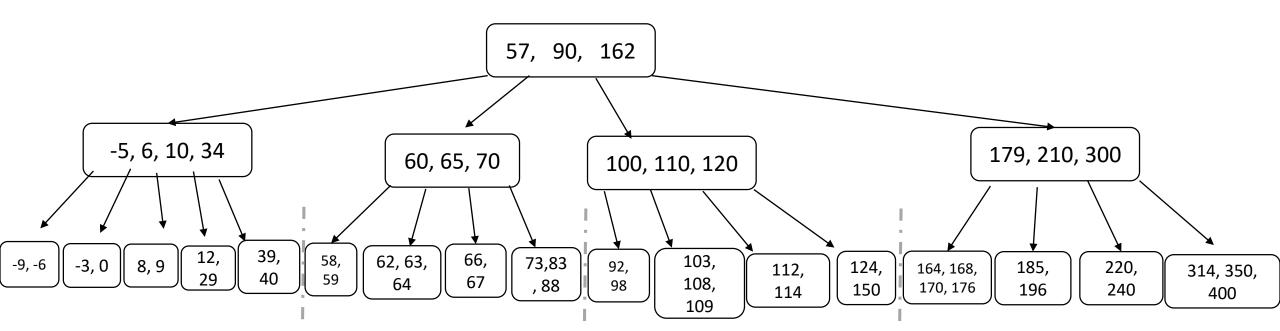
### Dealing with overflows

- Unlike in 2-3 trees, where splitting is practically the only option allowed, in B-trees, we will always attempt key rotations first.
  - To avoid asking the heap for large contiguous storage!

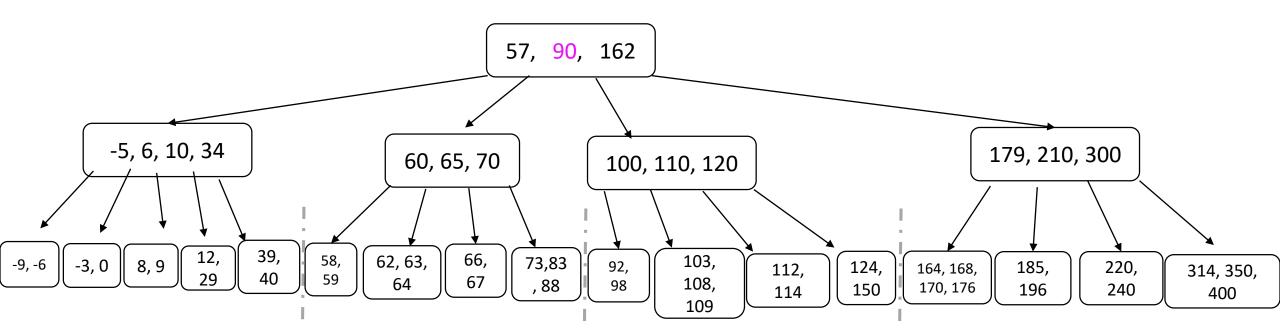
### Dealing with overflows

- Unlike in 2-3 trees, where splitting is practically the only option allowed, in B-trees, we will always attempt key rotations first.
  - To avoid asking the heap for large contiguous storage!
- Idea: Look at your sibling nodes (≤ 2) and locate at least one that would not overflow if you were to add a key to it
  - If you find one such sibling, rotate the key "closest" to the sibling node to that node through the parent.
  - This is always either the smallest or the largest key of the current node

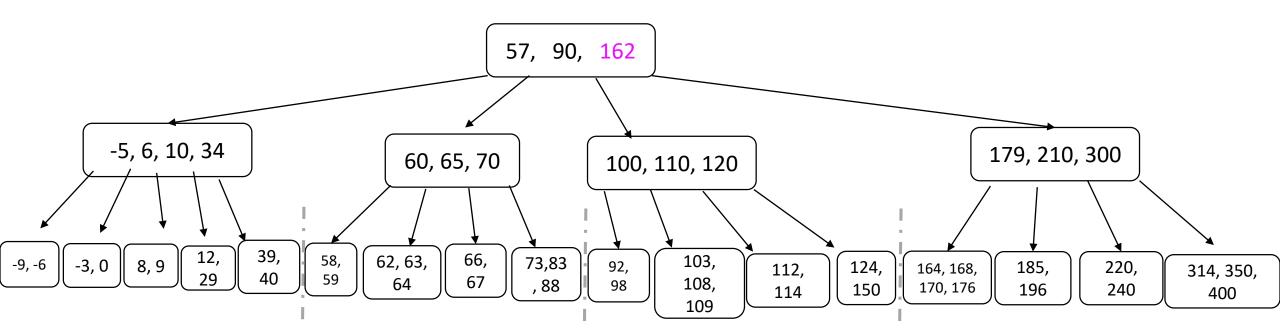
## Example #0: No overflows



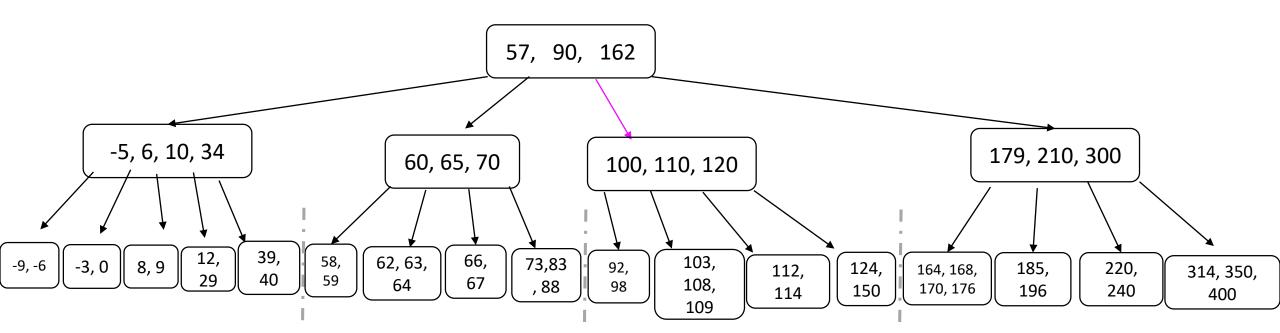
## Example #0: No overflows



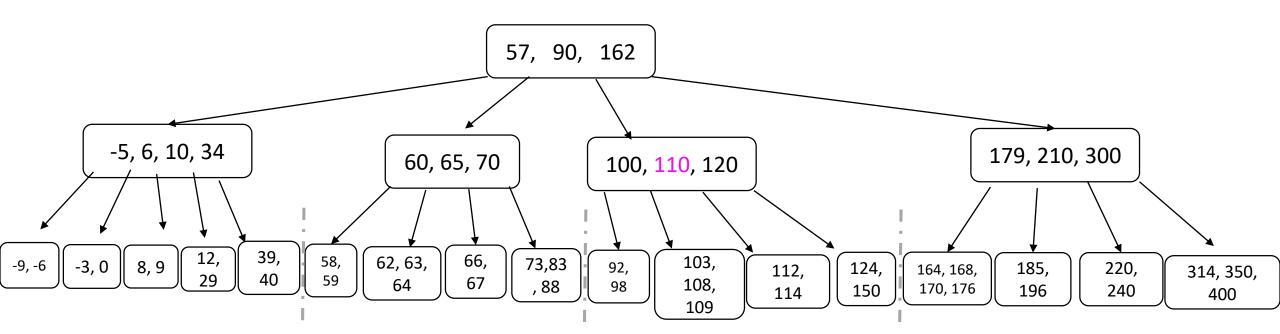
## Example #0: No overflows



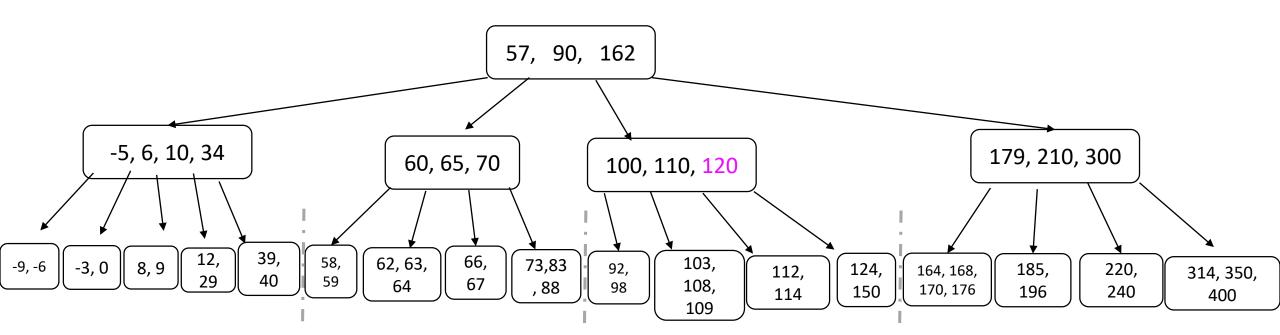
## Example #0: No overflows



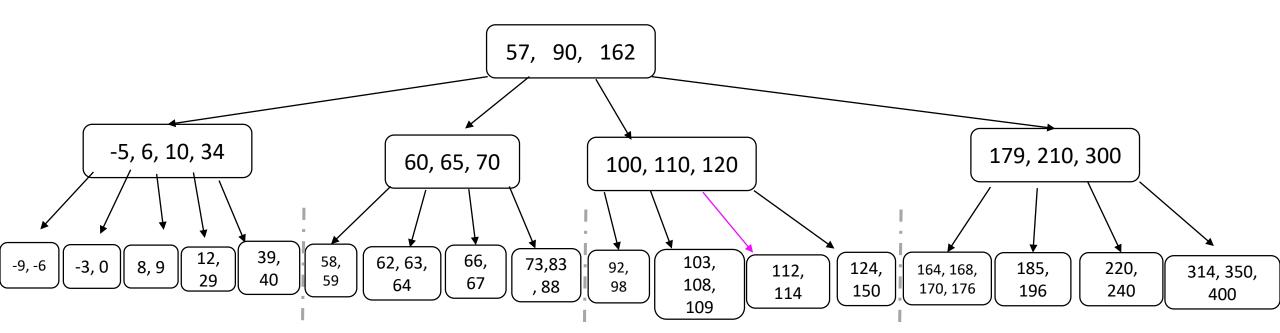
## Example #0: No overflows



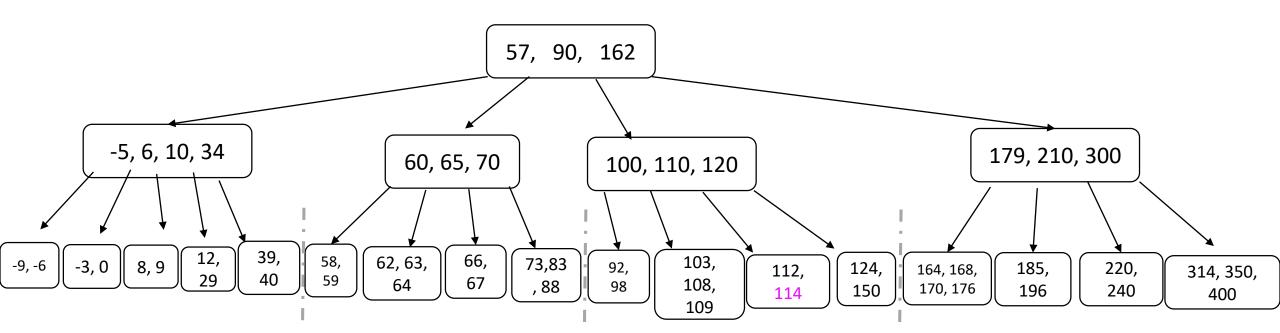
## Example #0: No overflows



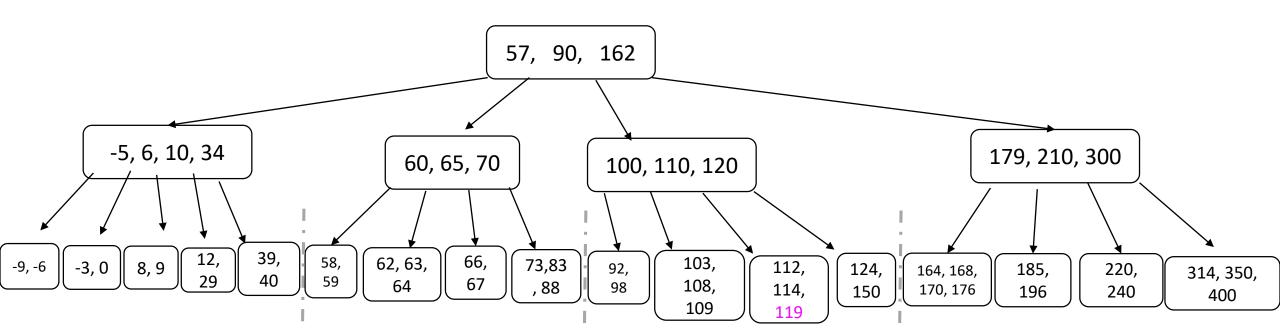
## Example #0: No overflows



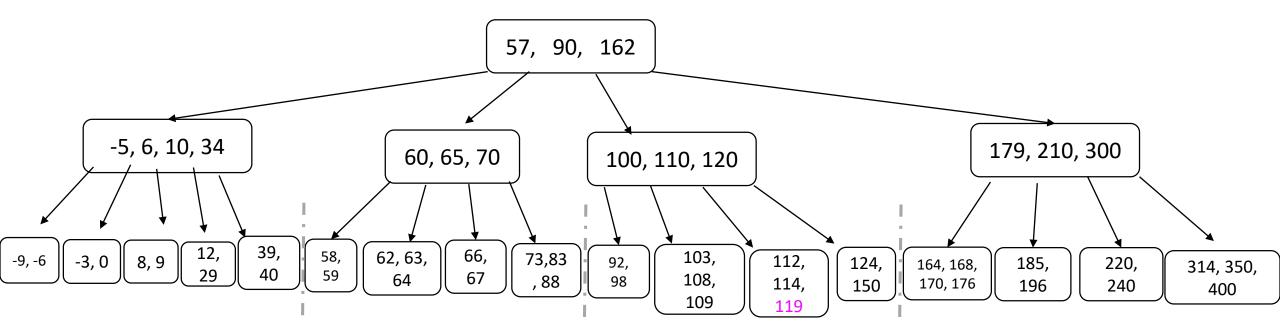
## Example #0: No overflows



## Example #0: No overflows



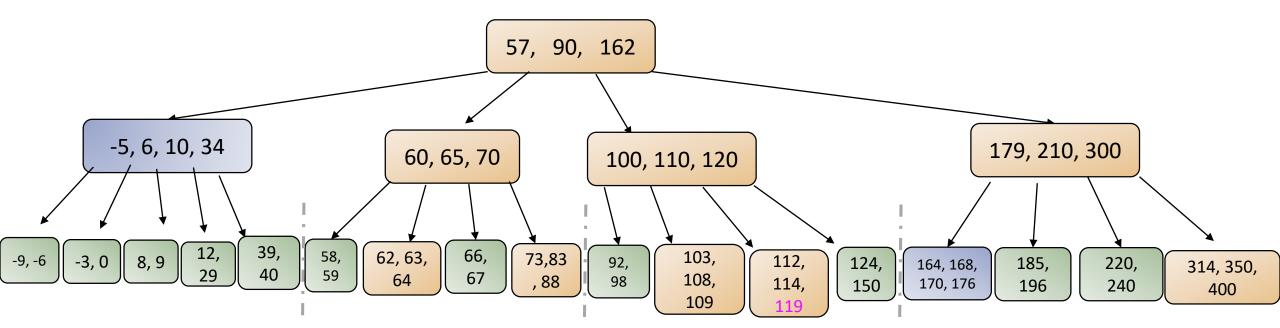
### Example #0: No overflows



- Task: Insert 119
- No overflow at the leaf, so no problem

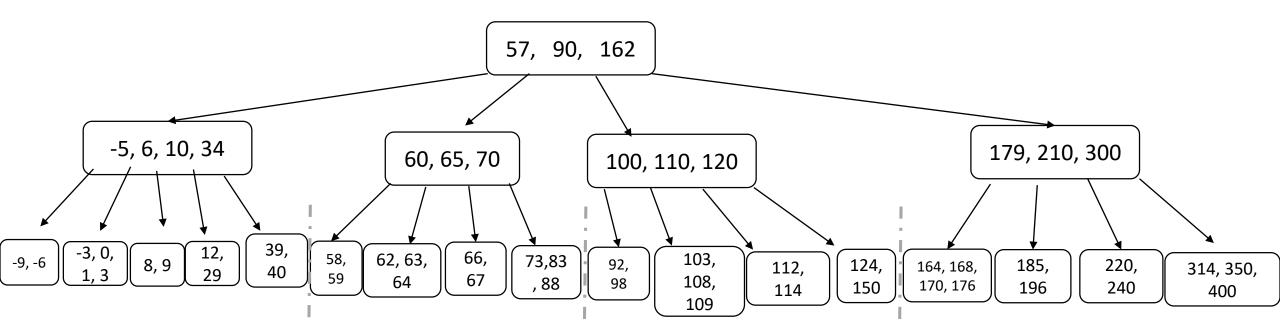


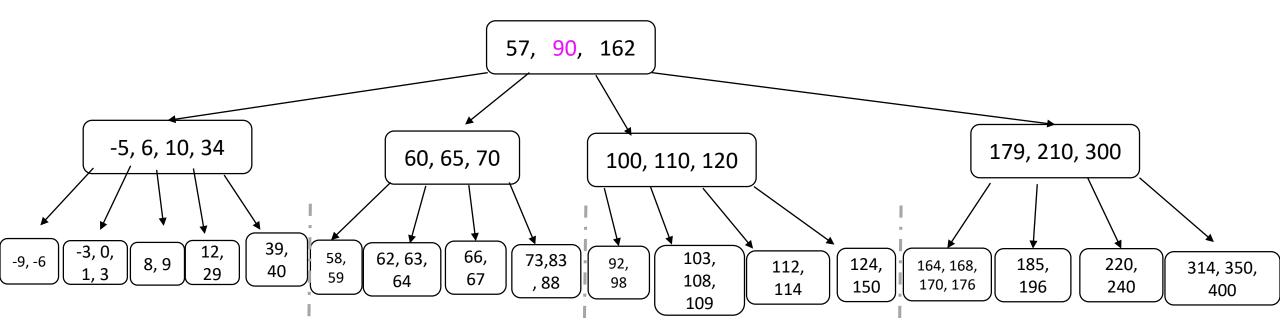
### Example #0: No overflows

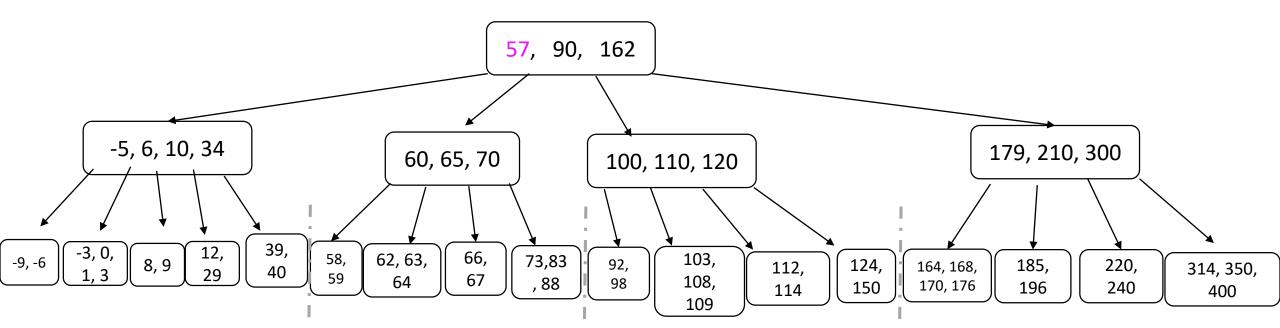


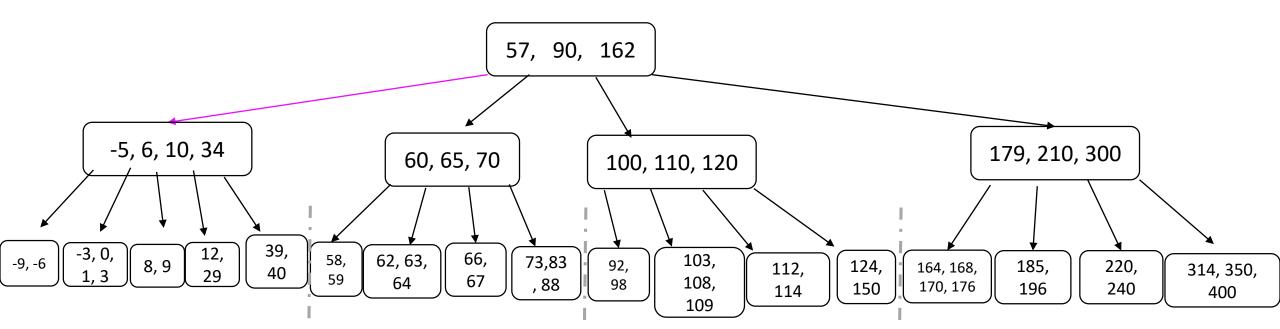
#### Side notes:

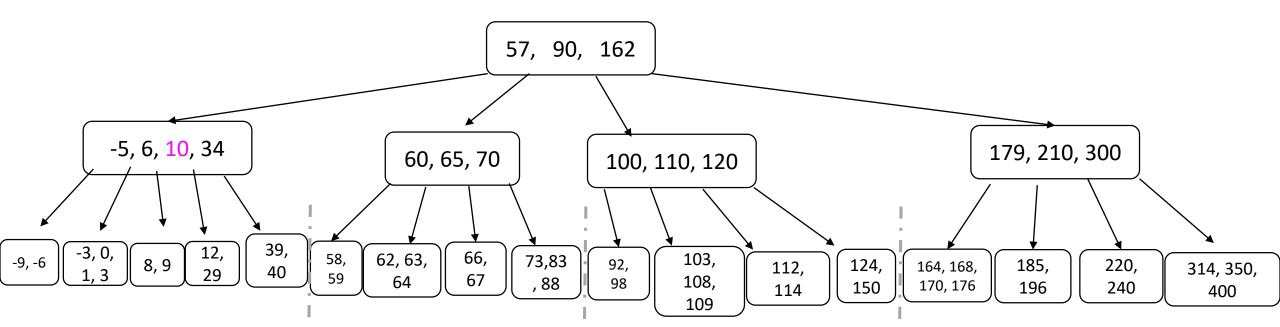
- 1. Only 2 nodes with maximum amount of p-1=4 keys: That's ok.
- 2. Bunch of leaf nodes holding only  $2 = \left\lceil \frac{p}{2} \right\rceil 1$  keys; also ok
- 3. Bunch of inner and leaf nodes holding  $3 = \lceil \frac{p}{2} \rceil$  keys; also ok

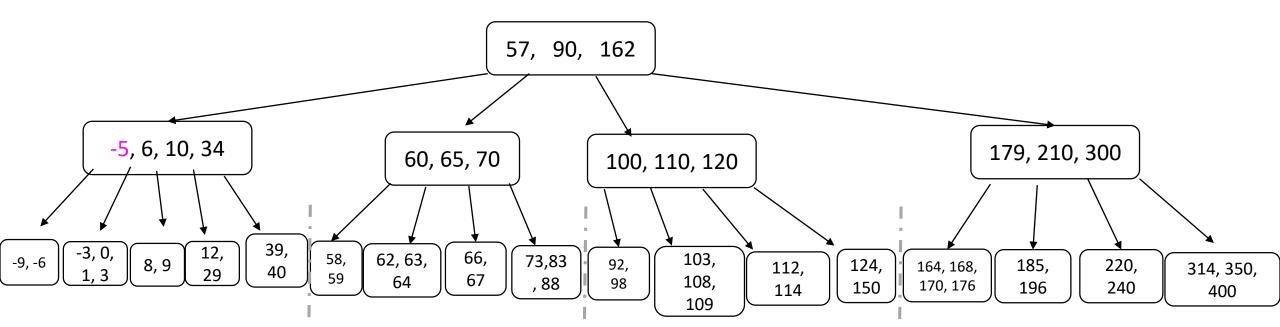


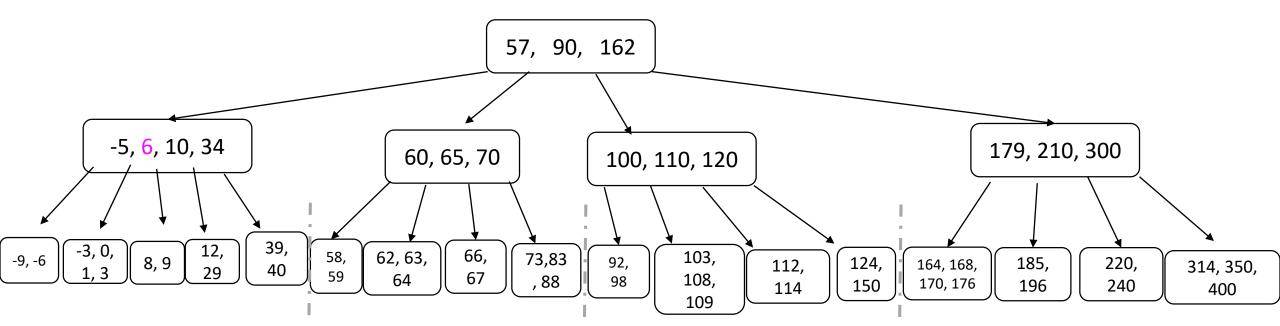


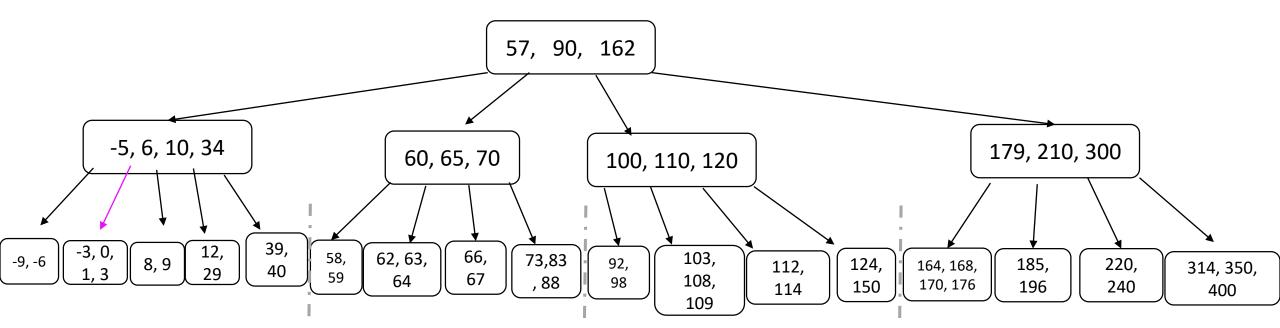


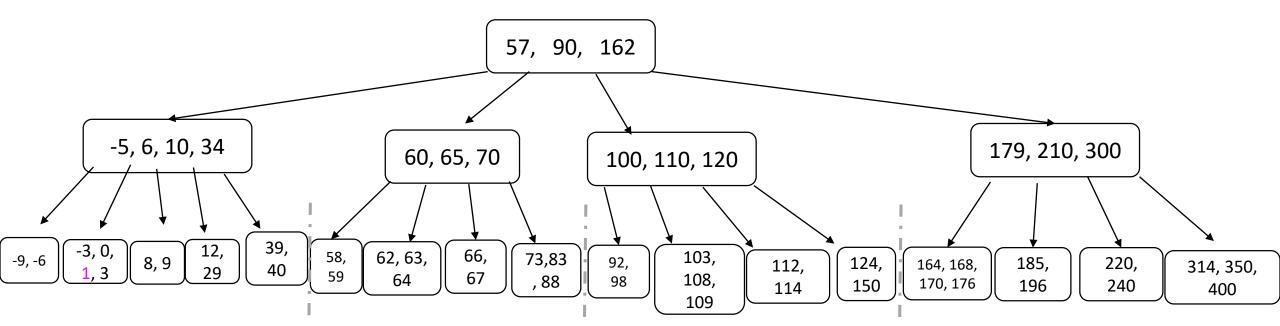


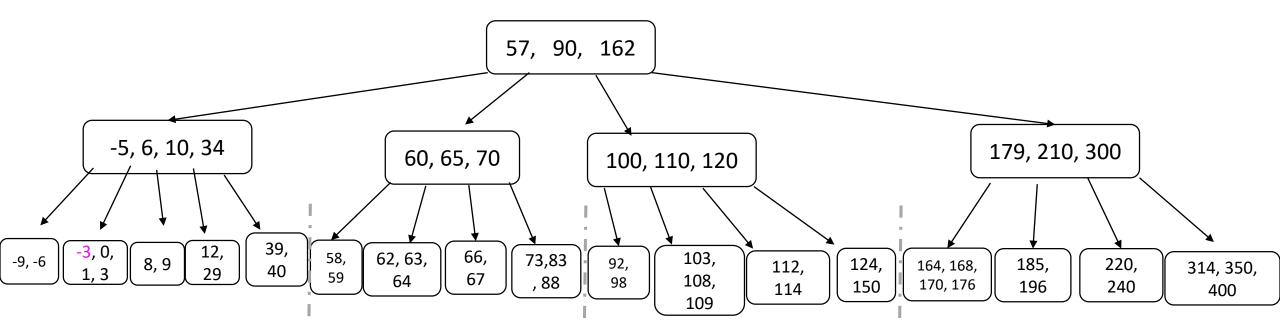


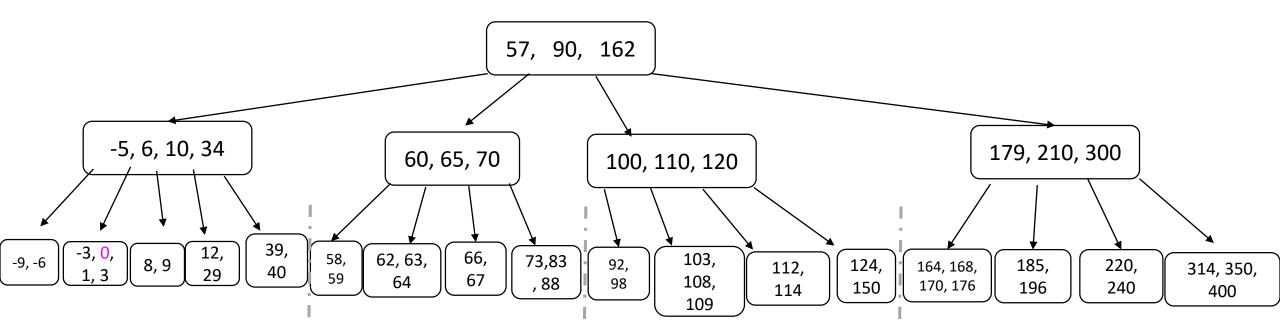


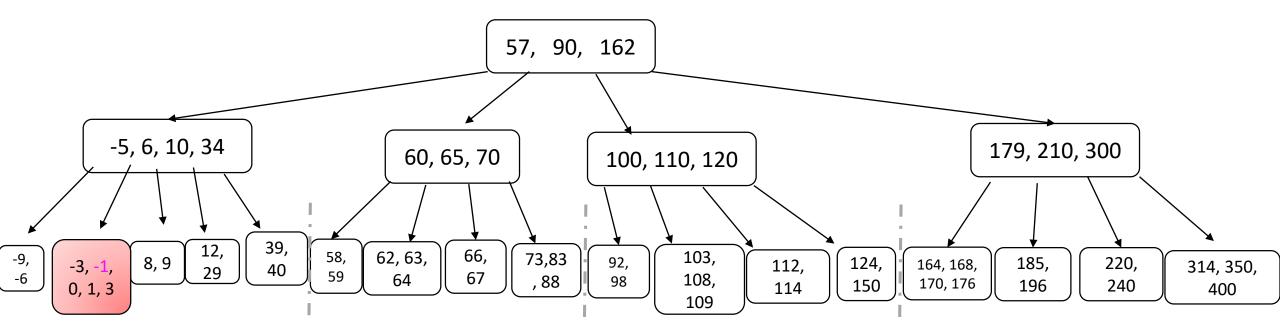








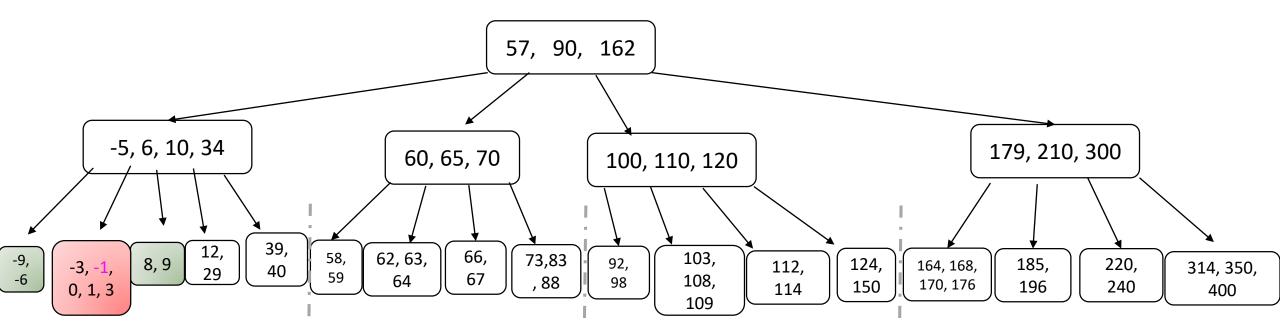




• Task: Insert -1

Overflow 🕾

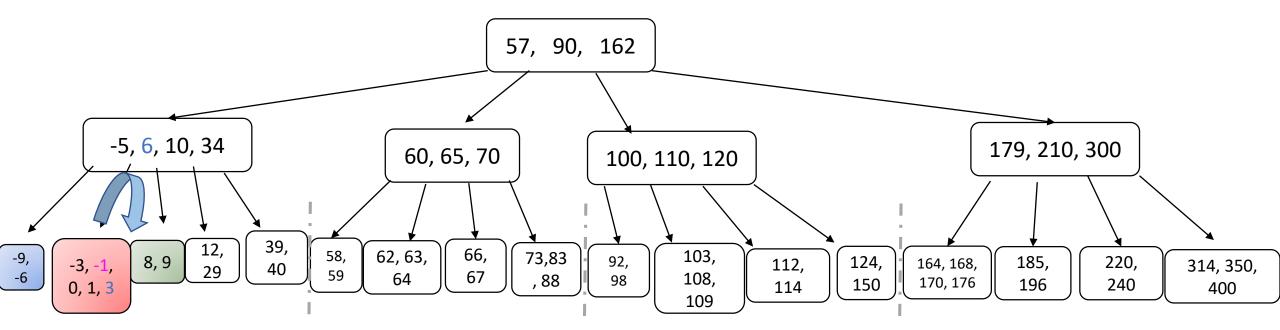




• Task: Insert -1

No worries! I can rotate to either sibling ©

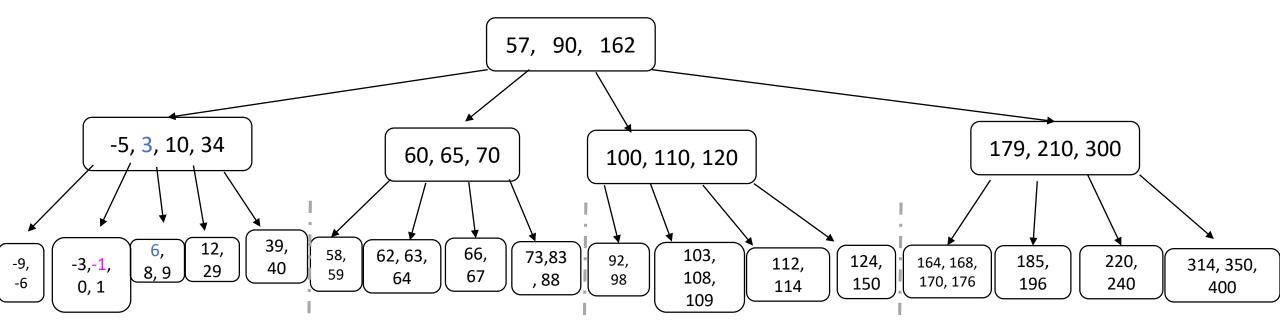




• Task: Insert -1

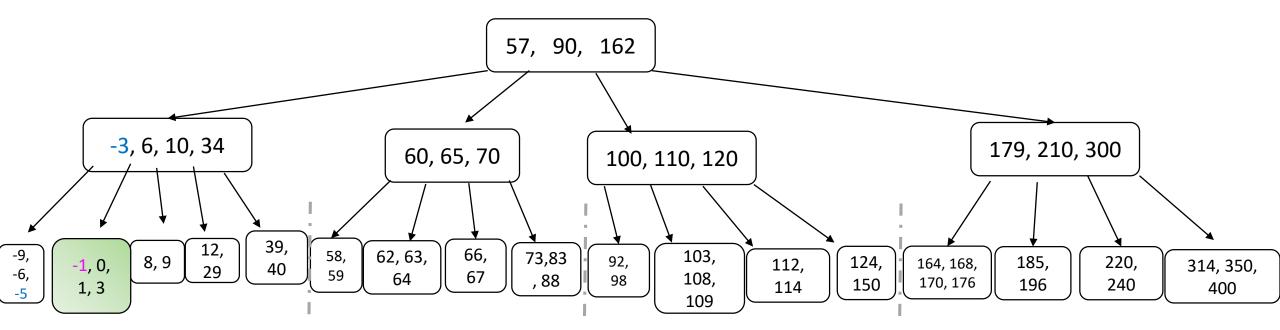
E.g pick right sibling, rotate 3 rightwards

(This is a remnant from an older semester: In Fall 19, we make the convention of rotation rightwards first)



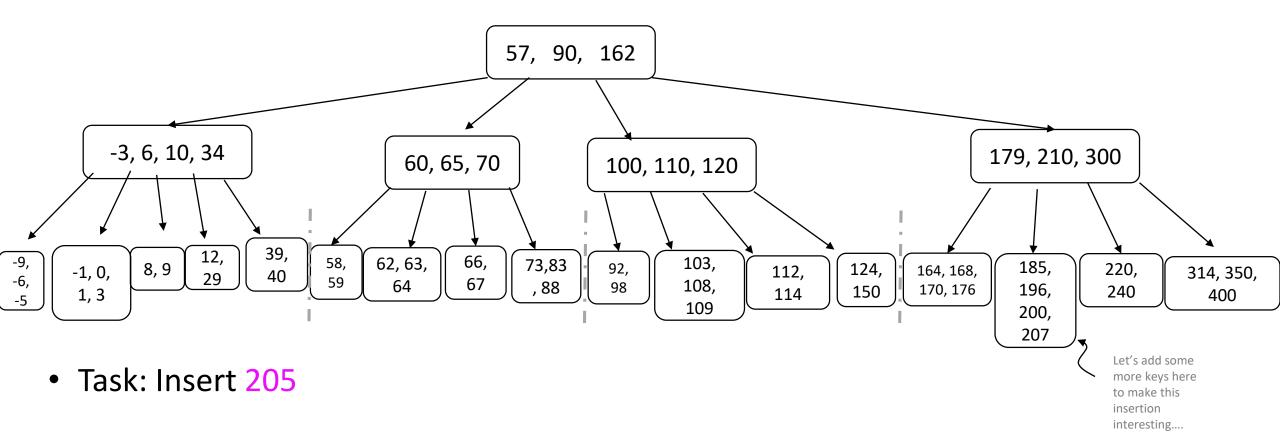
• Task: Insert -1

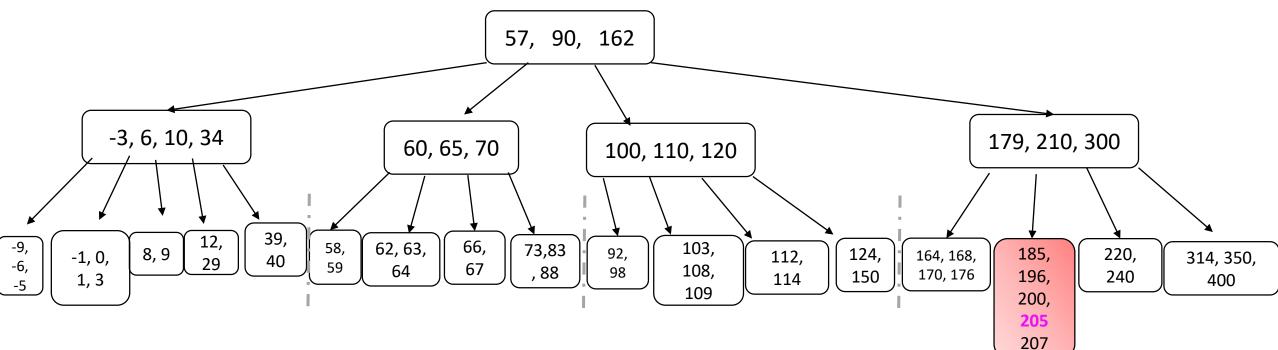
Careful: This means that <u>the parent's key</u>
(6) is the one that lands on the sibling node... 3 goes to the parent!



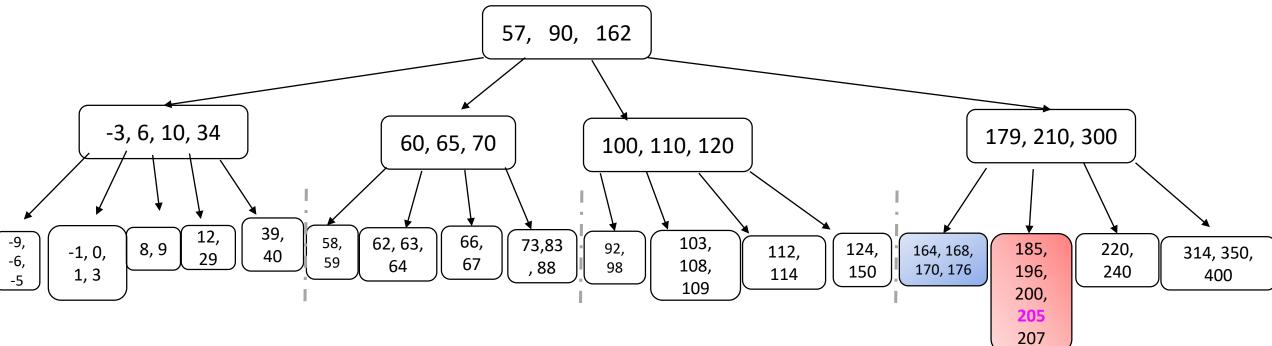
Task: Insert -1

Overflow fixed, key inserted ©

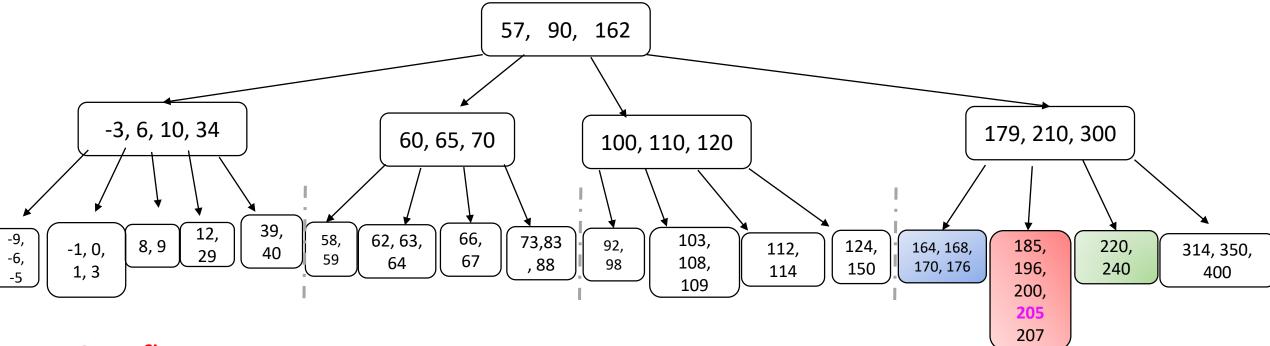




Overflow...

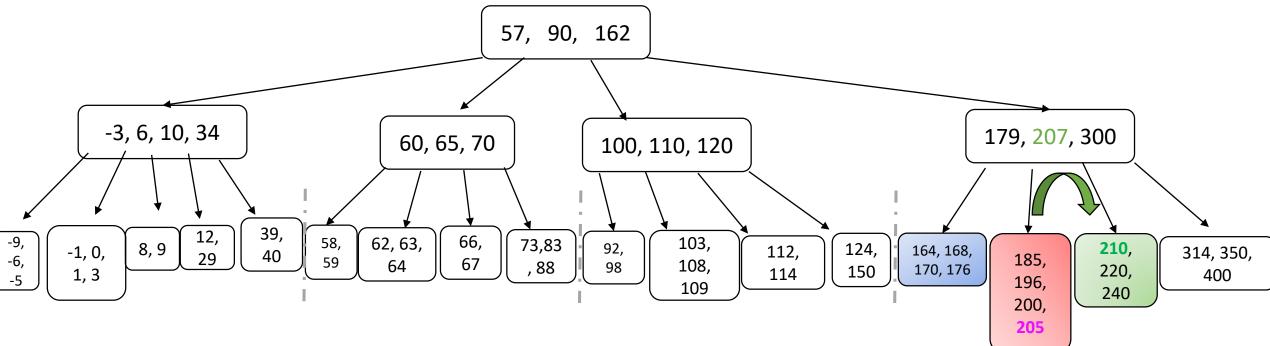


- Overflow...
- Can't rotate 185 leftwards because left sibling full 😊

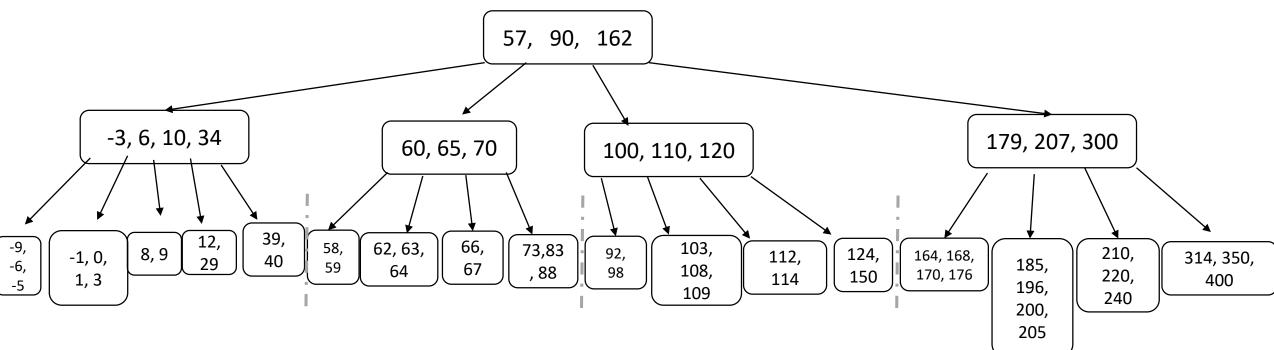


- Overflow...
- Can't rotate 185 leftwards because left sibling full 🕾
- But can rotate 207 rightwards because right sibling non-full ©

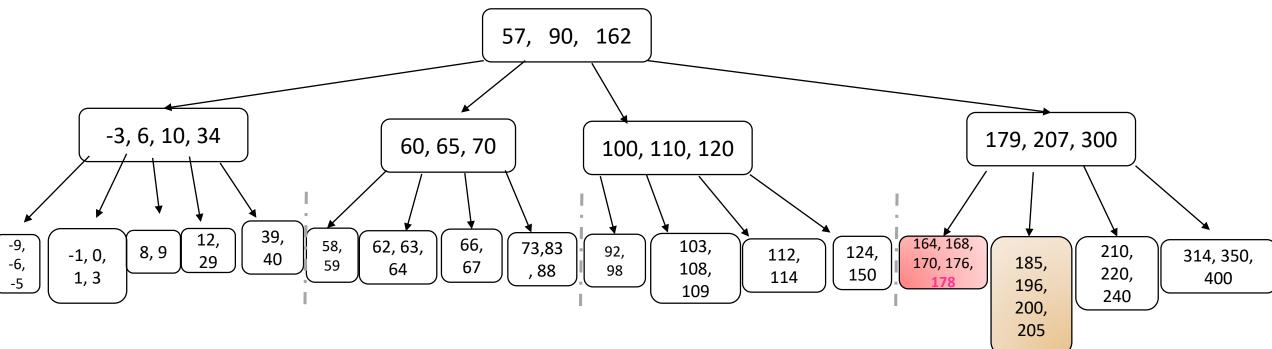
Once again, for Fall 19, we would make the convention of going right first (so we would check it *first*).



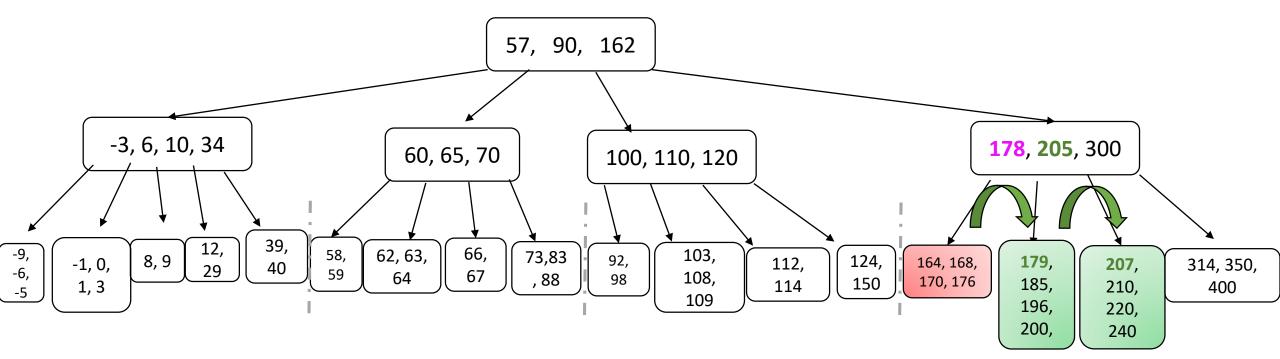
- Overflow...
- Can't rotate 185 leftwards because left sibling full 😊
- But can rotate 207 rightwards because right sibling non-full ©



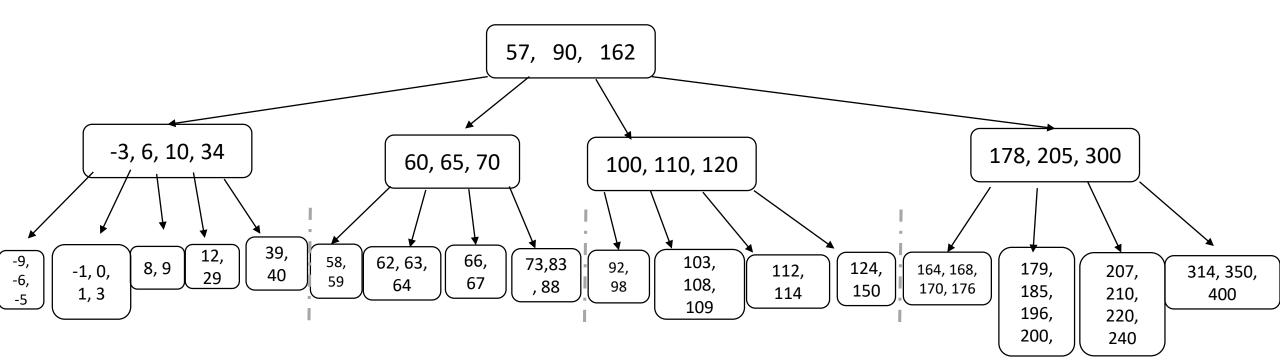
Task: Insert 178



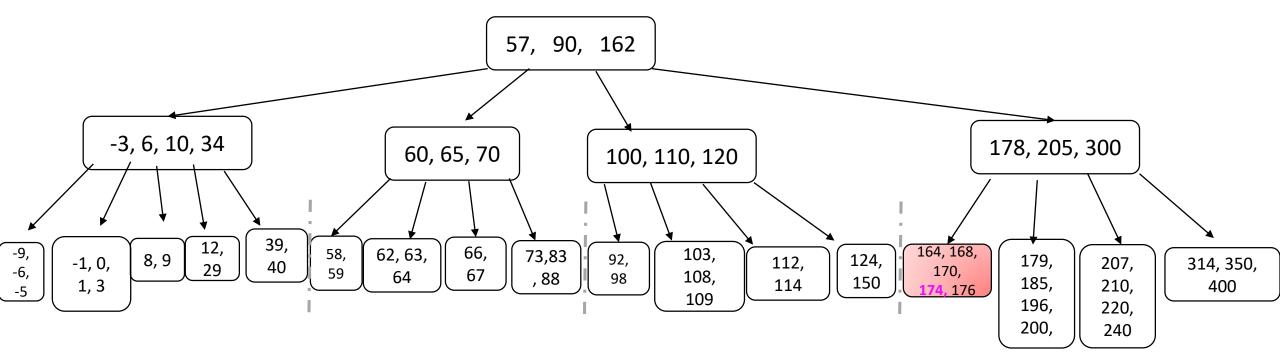
- Task: Insert 178
- Overflow... 🙁
- Only sibling also full 🙁



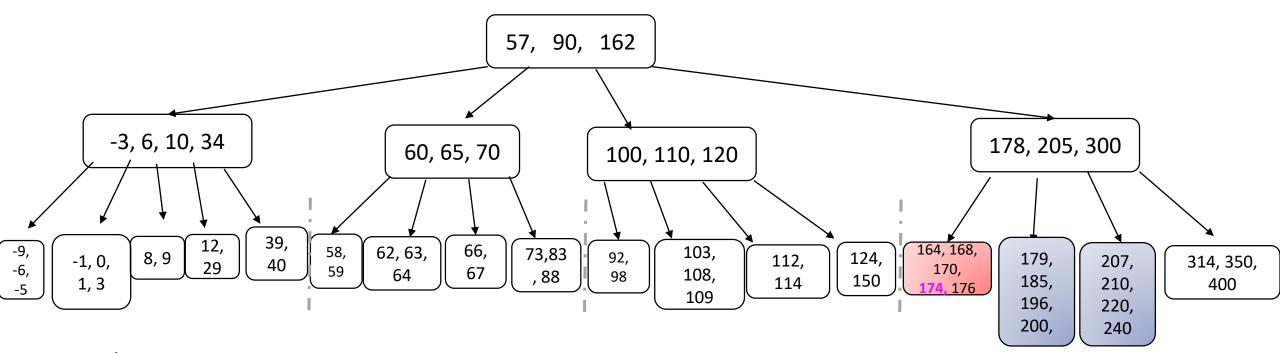
- Task: Insert 178
- Overflow... 🙁
- Only sibling also full ⊗
- Solution: Rotate 205 rightwards and 178 (new key!) rightwards! ©



• Task: Insert 174

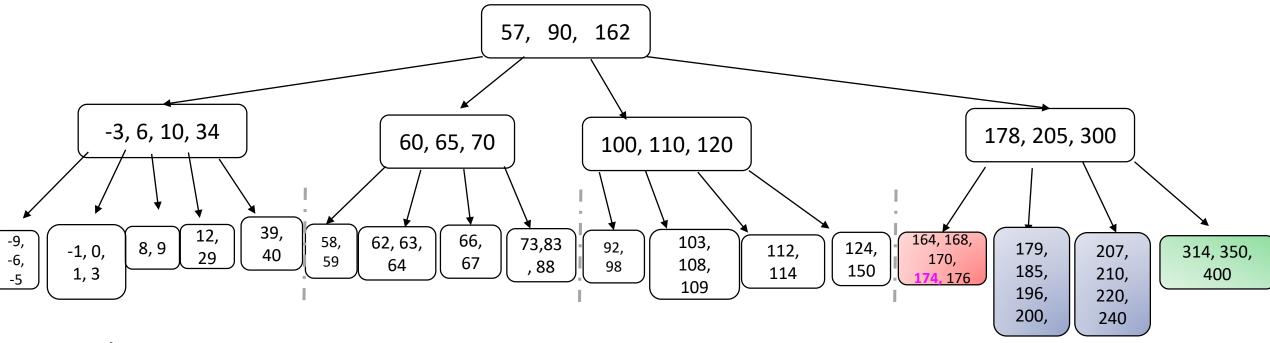


- Task: Insert 174
- Overflow <sup>(S)</sup>



- Task: Insert 174
- Overflow 🕾
- 1st and 2nd sibling don't have space to rotate keys to 😊

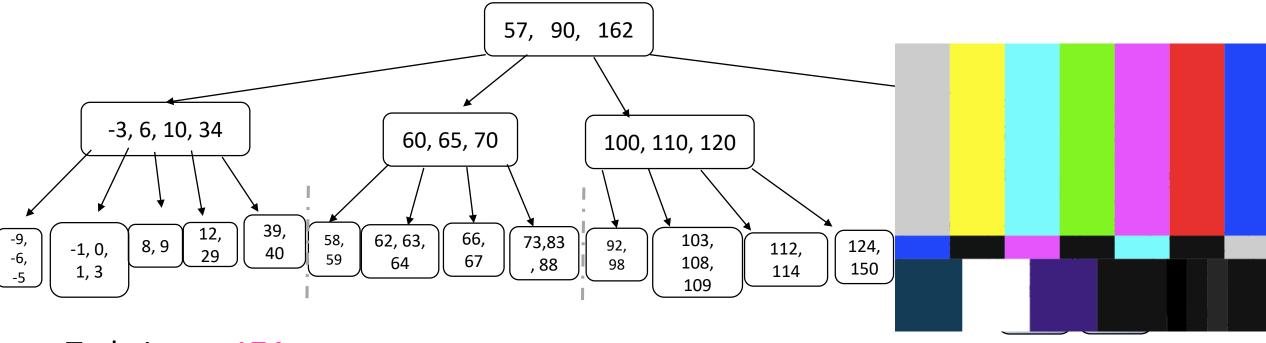
#### Example #4: Examine second sibling node!



- Task: Insert 174
- Overflow 🕾
- 1st and 2nd sibling don't have space to rotate keys to 🕾
- But 3<sup>rd</sup> sibling does! ©



### Example #4: Examine second sibling node!



- Task: Insert 174
- Overflow 🕾
- 1st and 2nd sibling don't have space to rotate keys to 🕾
- But 3<sup>rd</sup> sibling does! ©

WE INTERRUPT YOUR
REGULARLY
SCHEDULED PROGRAM
FOR AN
INVESTIGATION INTO
SIBLING SEARCH!

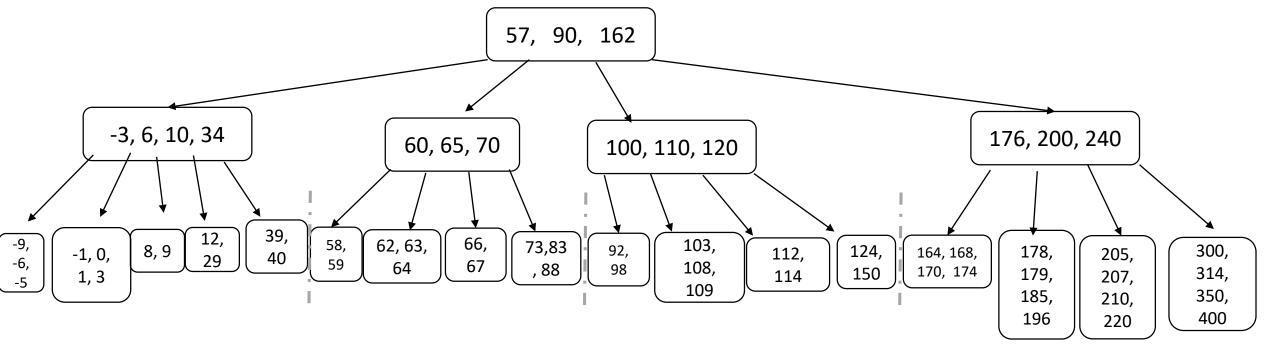
• UNCLEAR.

- UNCLEAR.
- In the 70s and 80s, yes, absolutely
  - Memory expensive: inner nodes in disk as well means we want to minimize height.

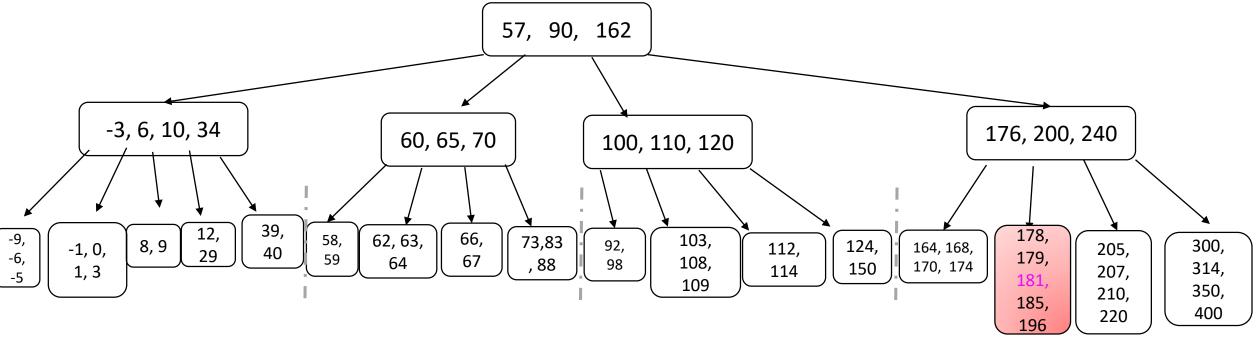
#### UNCLEAR.

- In the 70s and 80s, yes, absolutely
  - Memory expensive: inner nodes in disk as well means we want to minimize height.
- Nowadays, can fit the index (B-Tree) in memory.
  - So might not care about adding to the height that much

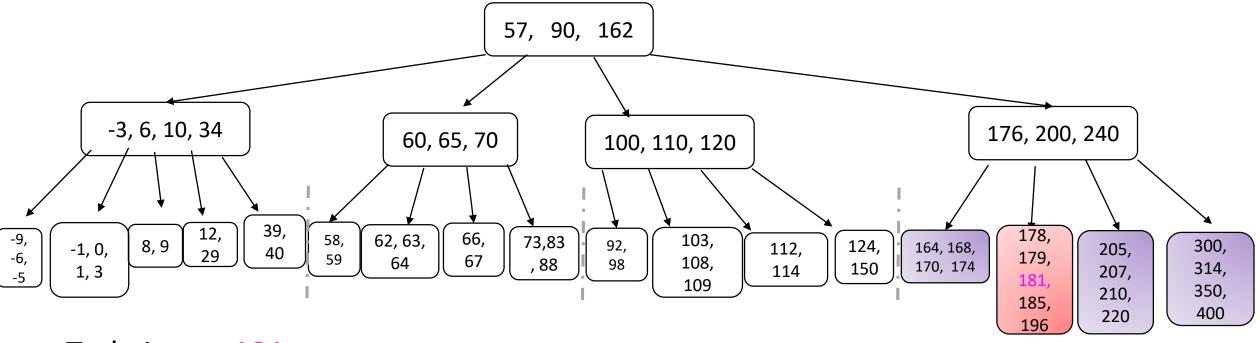
- UNCLEAR.
- In the 70s and 80s, yes, absolutely
  - Memory expensive: inner nodes in disk as well means we want to minimize height.
- Nowadays, can fit the index (B-Tree) in memory.
  - So might not care about adding to the height that much
- Our solution (for exams, projects, etc): supply an int parameter hops to either insertion method or B-Tree constructor to indicate how far away you are willing to search for key space when you overflow.
  - hops = -1 can be used to indicate "as far away as you want".



Task: Insert 181

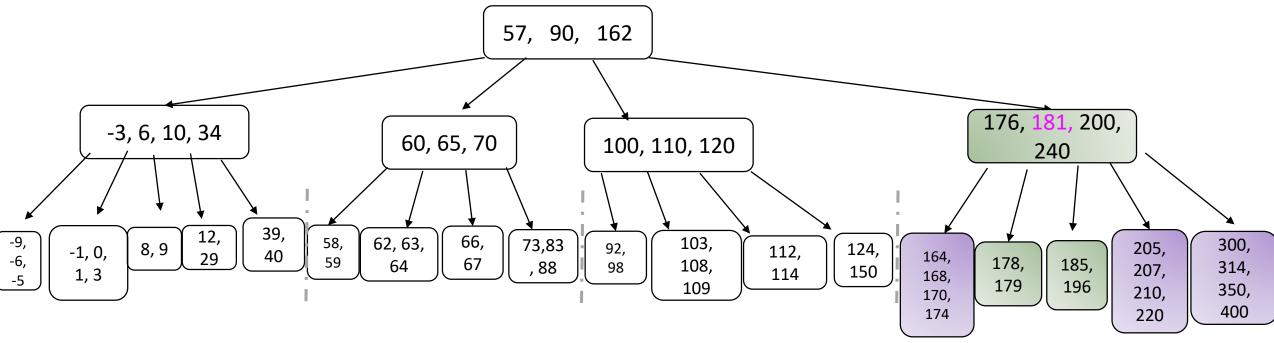


- Task: Insert 181
- Overflow (3)



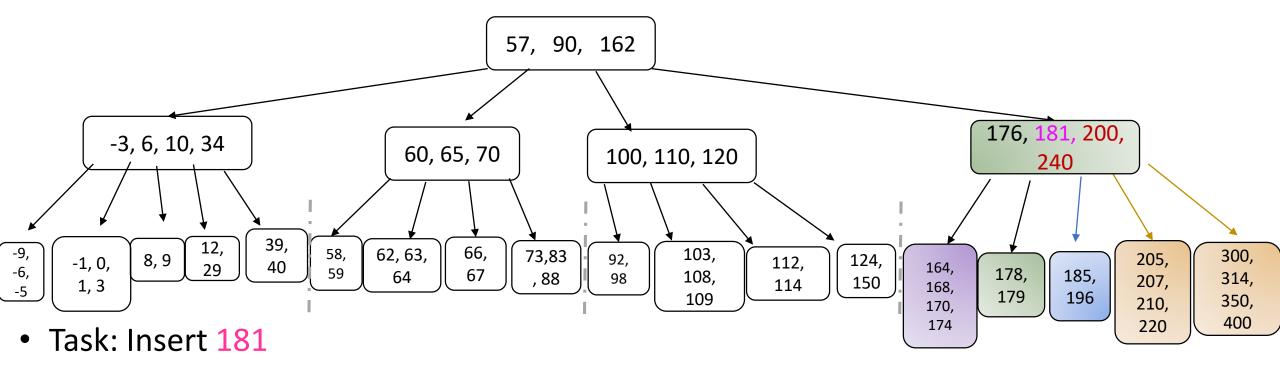
- Task: Insert 181
- Overflow 🕾
- No sibling or cousin has space for rotating keys to!





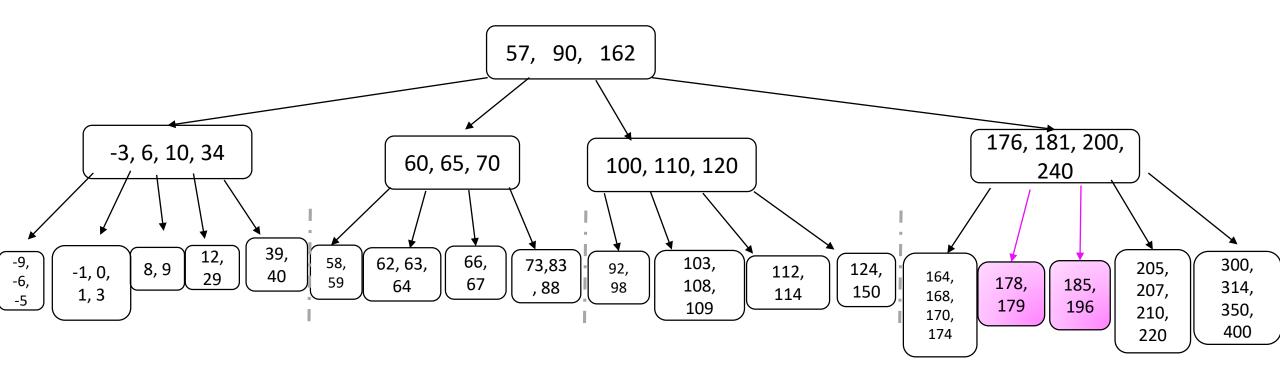
- Task: Insert 181
- Overflow 🕾
- No sibling or cousin has space for rotating keys to!
- Solution: Split the current node, and elevate middle key to the parent ©



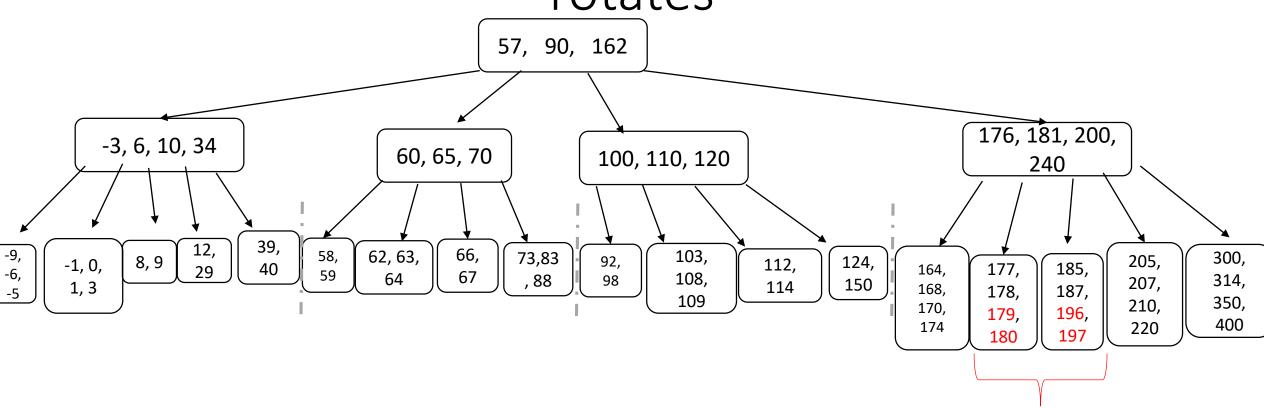


- Overflow <sup>(3)</sup>
- No sibling or cousin has space for rotating keys to!
- Solution: Split the current node, and elevate middle key to the parent ©
  - Parent has 1 additional child subtree now.

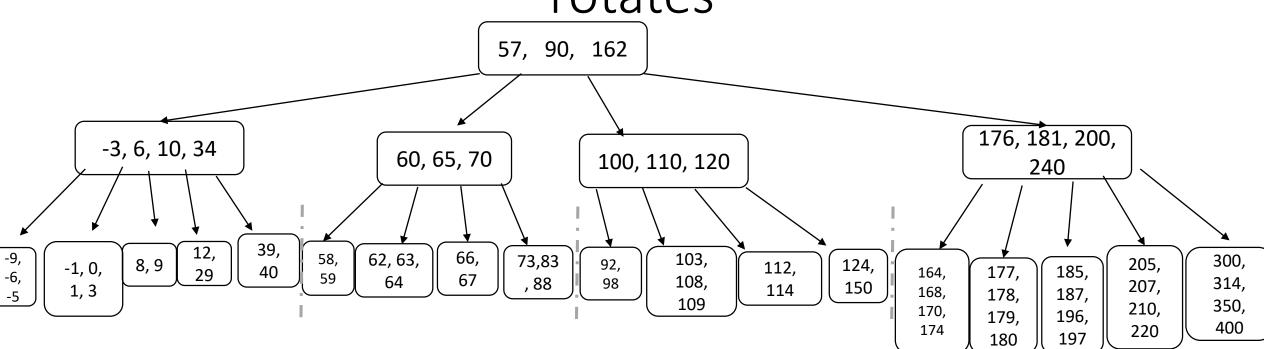
# Interesting notes about splitting



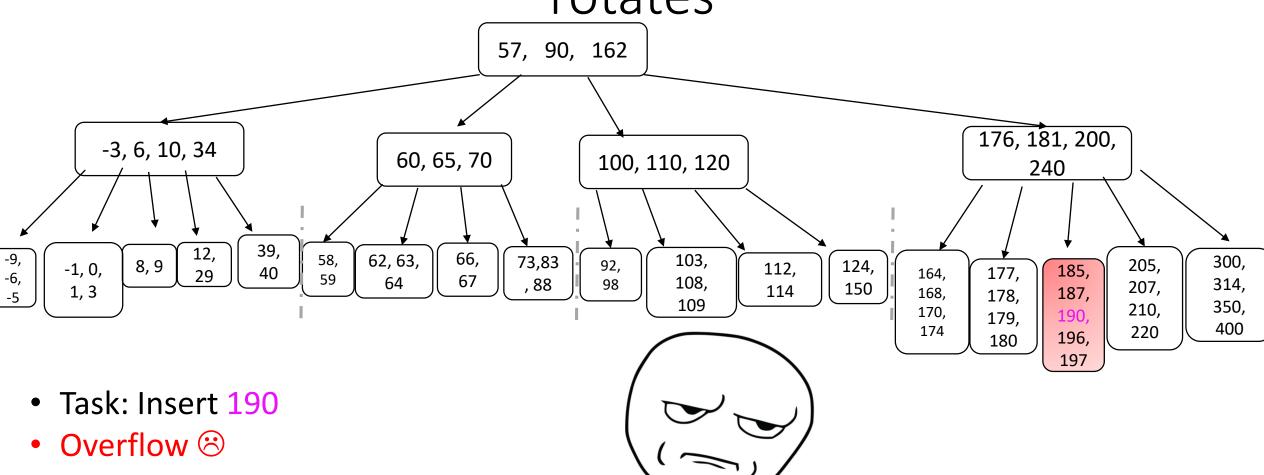
- 4 key insertions in the range [177, 199] will be solvable with key rotations to the left or right!
- Point: when a splitting in a certain range occurs, it's unlikely to happen again in the near future (*locality of reference*)

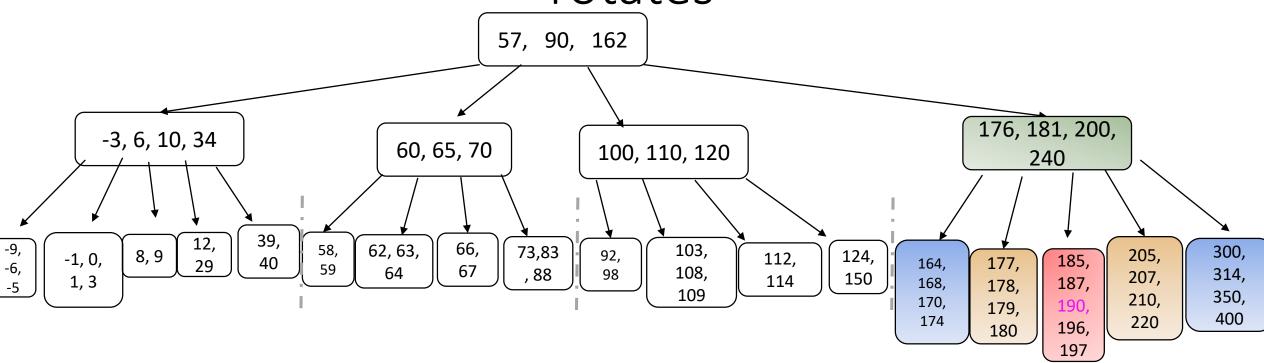


Added some keys here to make example interesting...



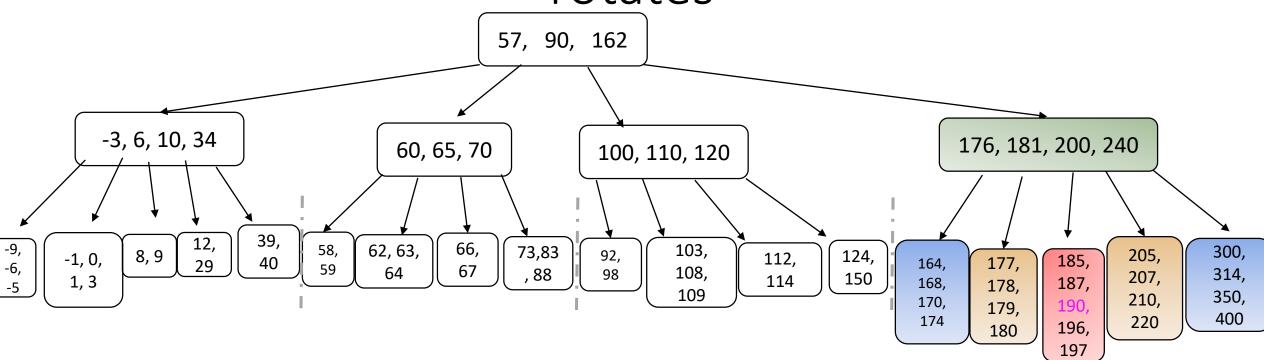
• Task: Insert 190



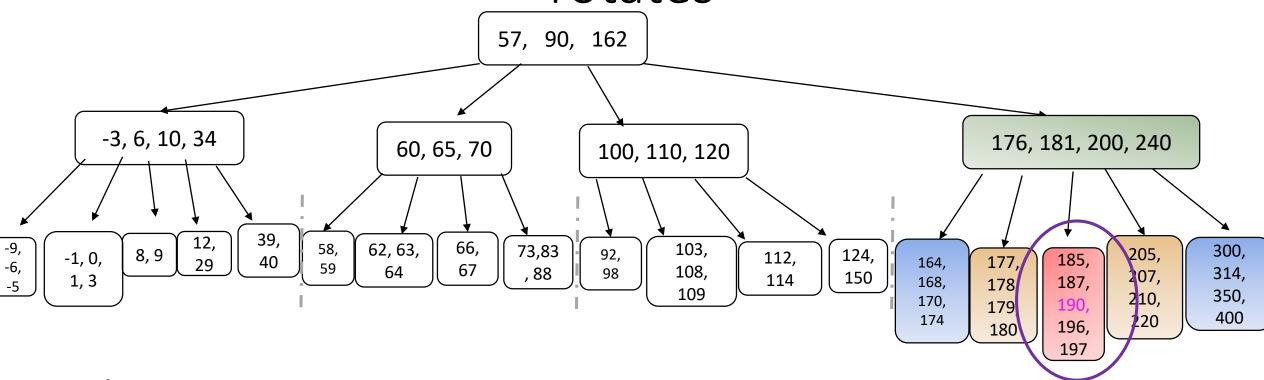


- Task: Insert 190
- Overflow 😊
- 1st Siblings, 2nd siblings and parent all full!

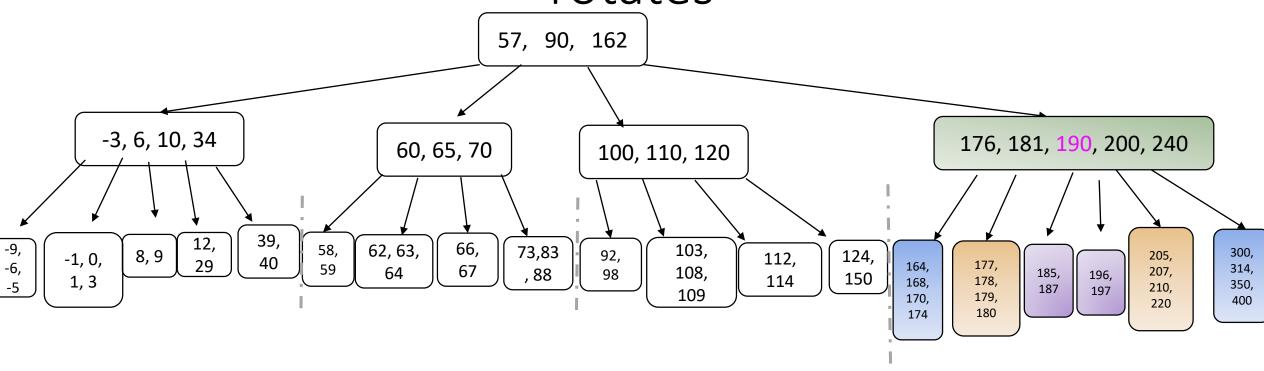




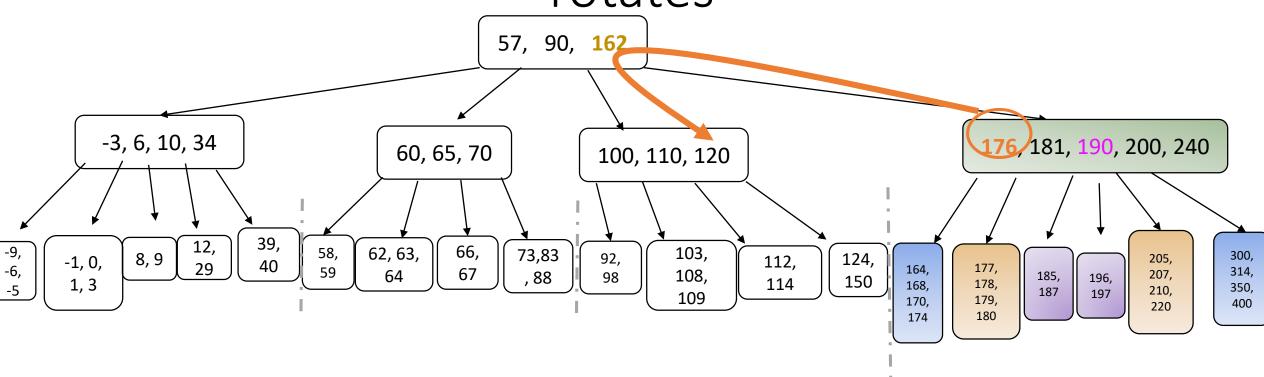
- Task: Insert 190
- Overflow 😊
- 1st Siblings, 2nd siblings and parent all full!
- Solution: Split node, elevating 190 to parent and then rotate 176 to the left!



- Task: Insert 190
- Overflow 😊
- 1st Siblings, 2nd siblings and parent all full!
- Solution: Split node, elevating 190 to parent and then rotate 176 to the left!

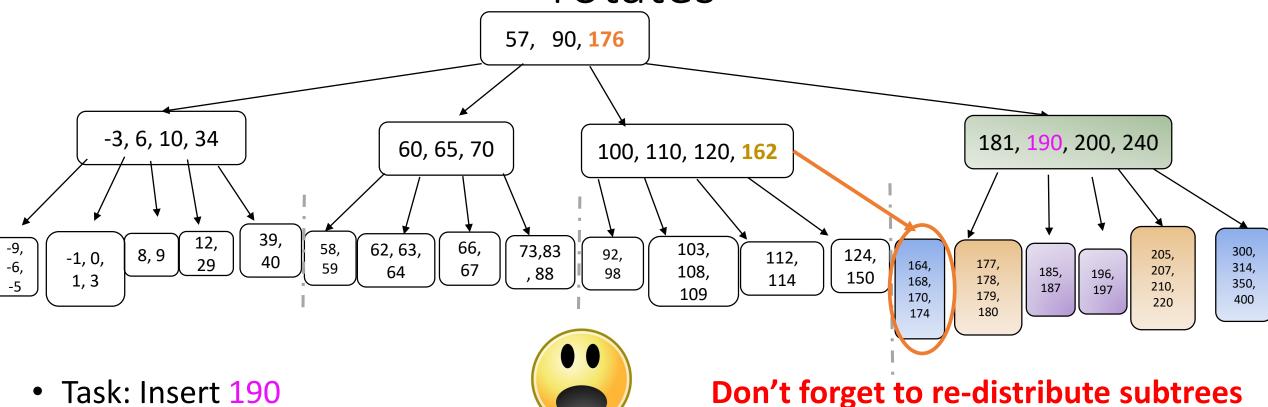


- Task: Insert 190
- Overflow 😊
- 1st Siblings, 2nd siblings and parent all full!
- Solution: Split node, elevating 190 to parent and then rotate 176 to the left!



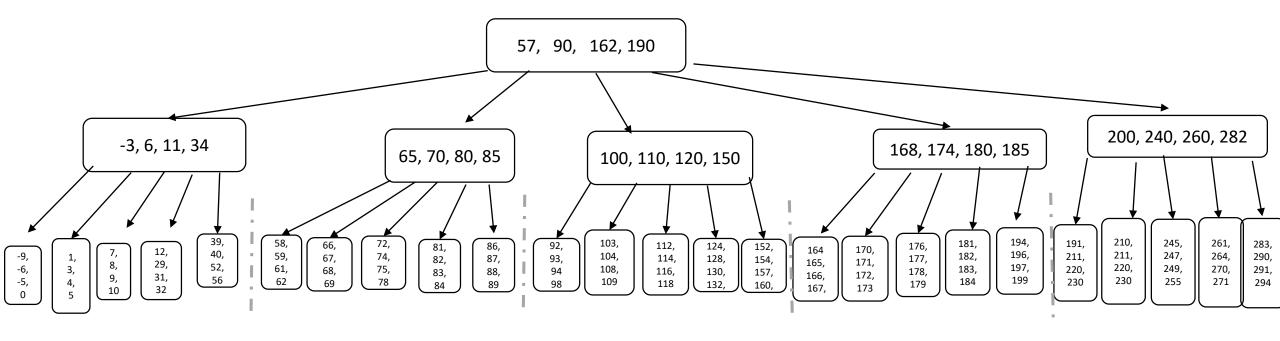
- Task: Insert 190
- Overflow 😊
- 1st Siblings, 2nd siblings and parent all full!
- Solution: Split node, elevating 190 to parent and then rotate 176 to the left!

# Example #6: Splitting, parent overflows and rotates

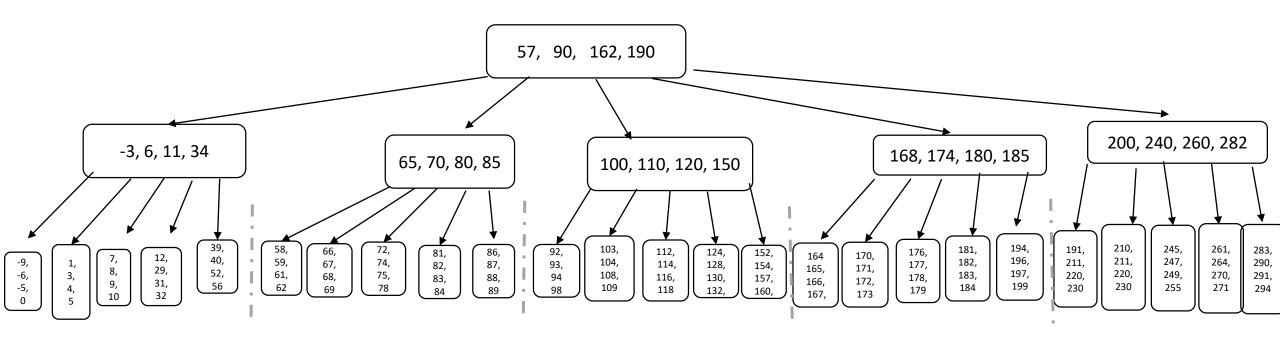


when rotating keys above the leaf

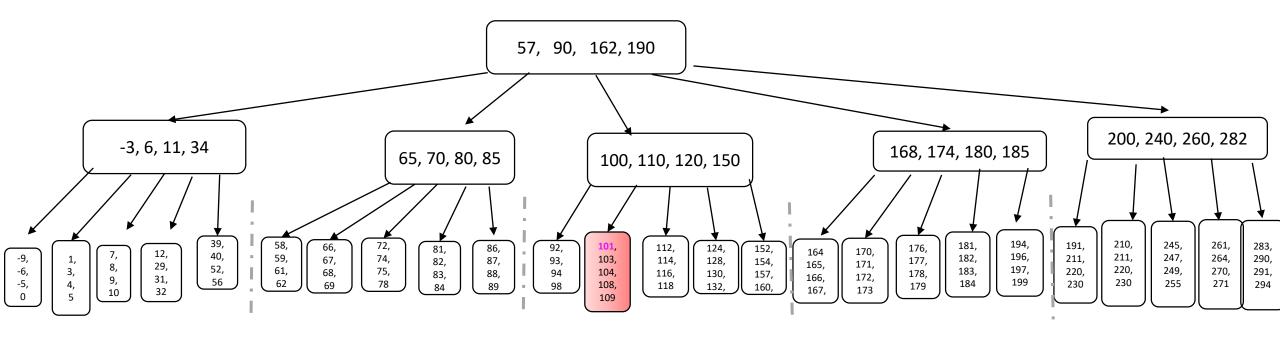
- Task: Insert 190
- Overflow <sup>(2)</sup>
- 1<sup>st</sup> Siblings, 2<sup>nd</sup> siblings and parent all full! level!
- Solution: Split node, elevating 190 to parent and then rotate 176 to the left!



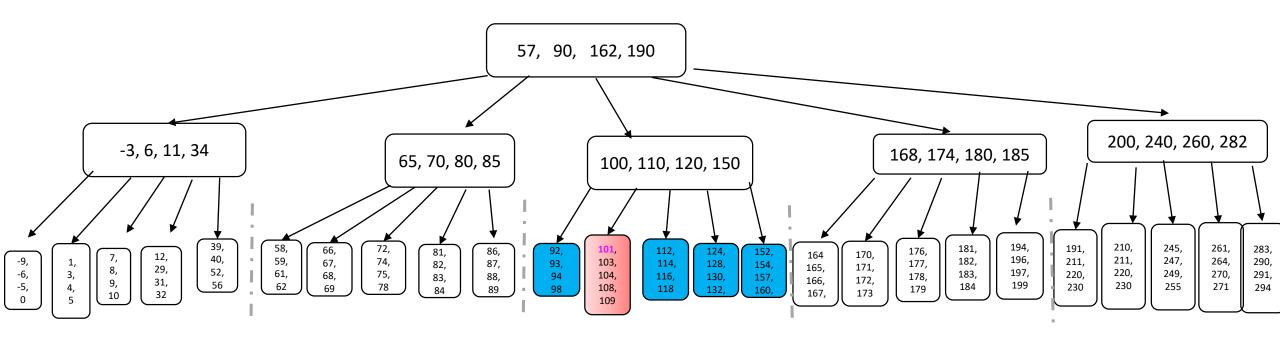
- Added a bunch of keys to make the tree filled to the brim!
- $4 + 4^2 + 4^3 = 20 + 64 = 84$  keys with h = 2 and p = 5.



Task: Insert 101

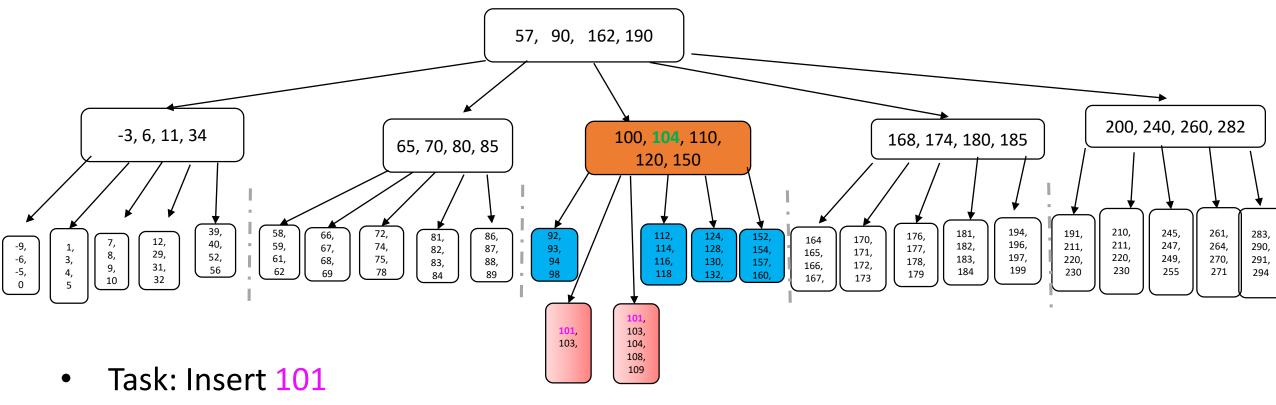


- Task: Insert 101
- Overflow (3)



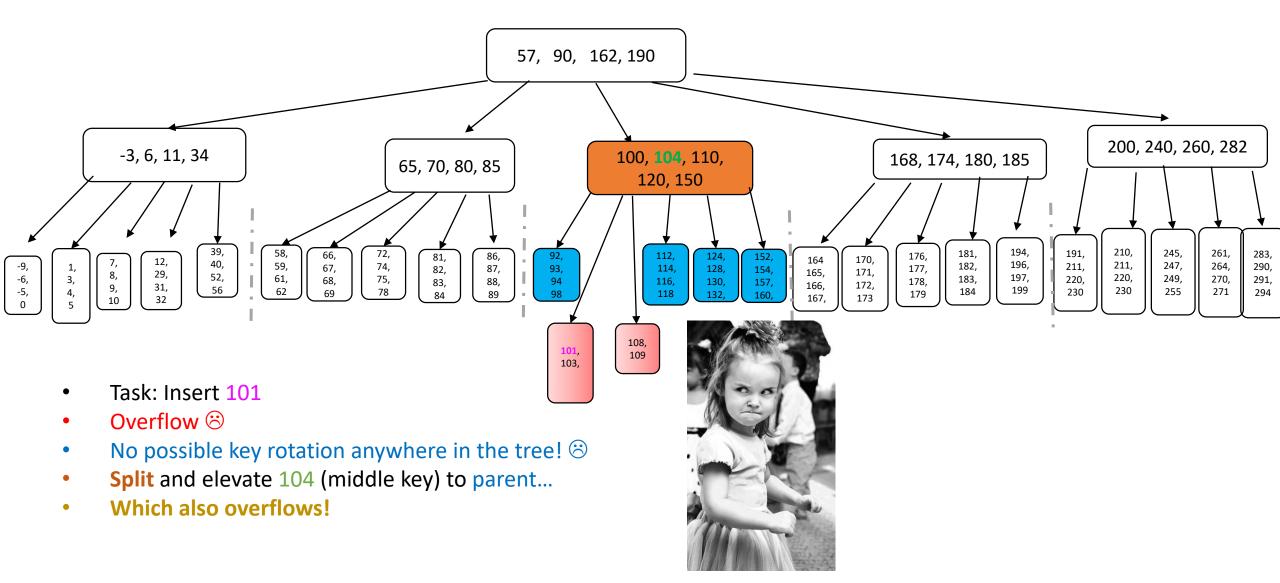
- Task: Insert 101
- Overflow 😊
- No possible key rotation to siblings!

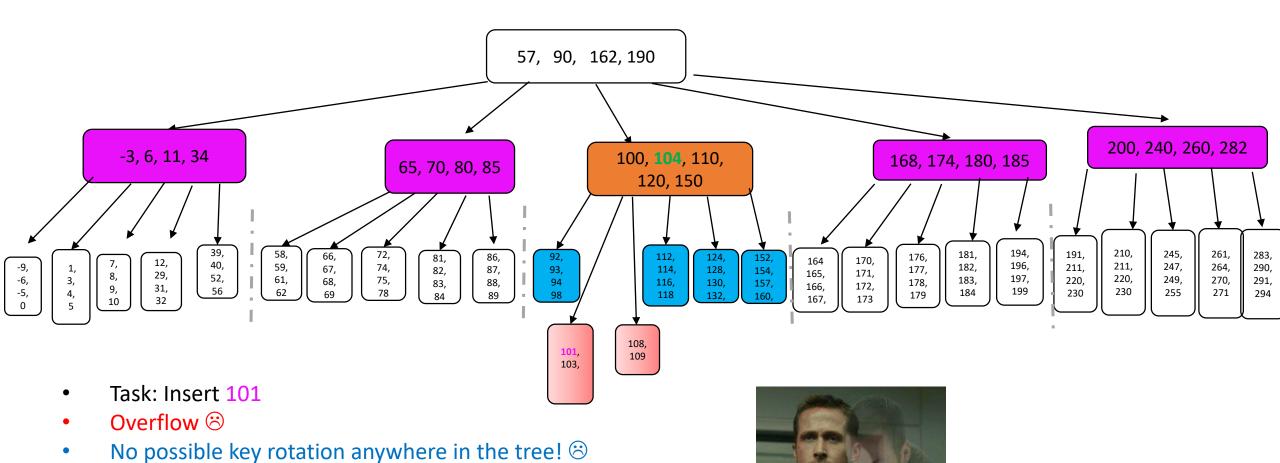




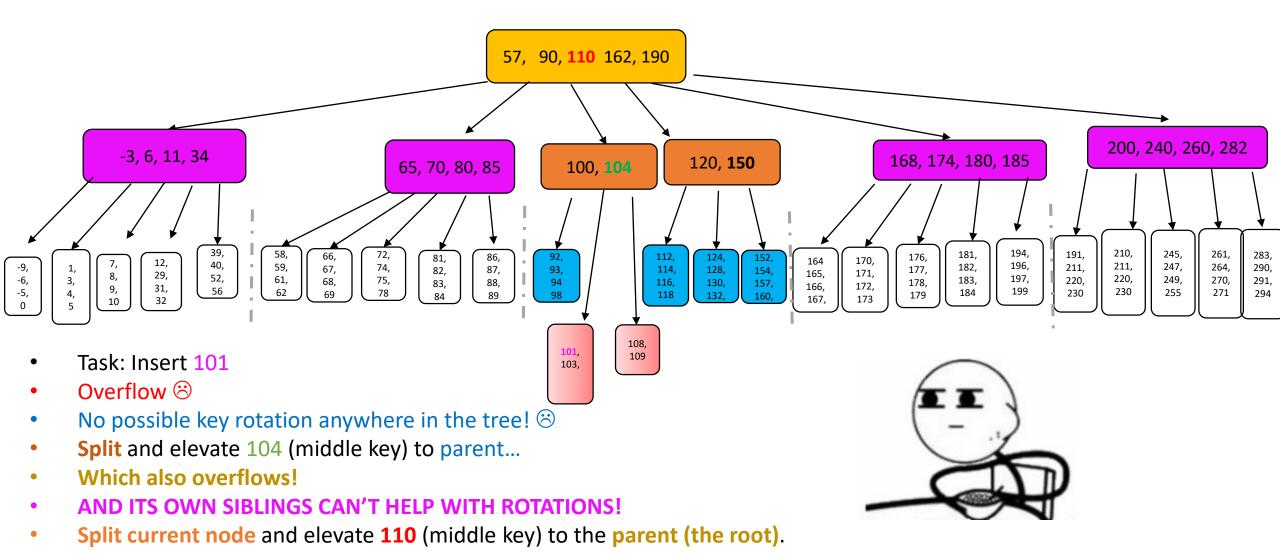
- Overflow 😊
- No possible key rotation anywhere in the tree! 😊
- Split and elevate 104 (middle key) to parent...

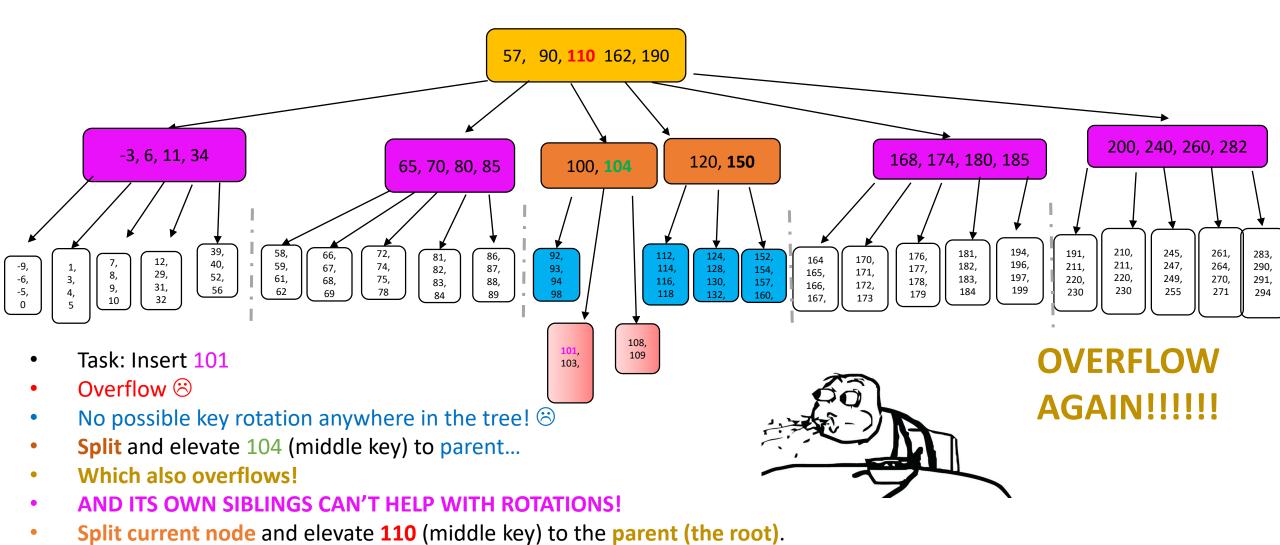


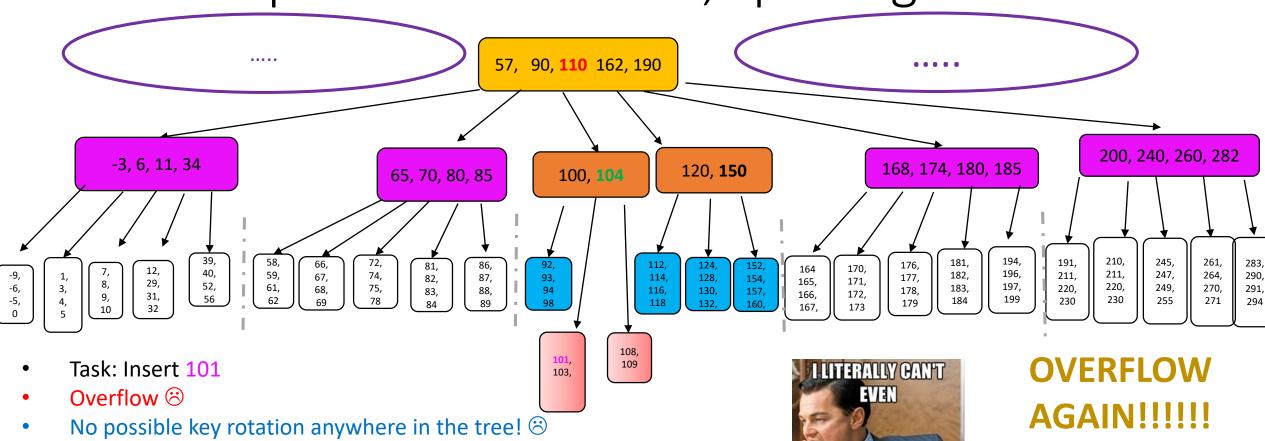




- Split and elevate 104 (middle key) to parent...
- Which also overflows!
- AND ITS OWN SIBLINGS CAN'T HELP WITH ROTATIONS!

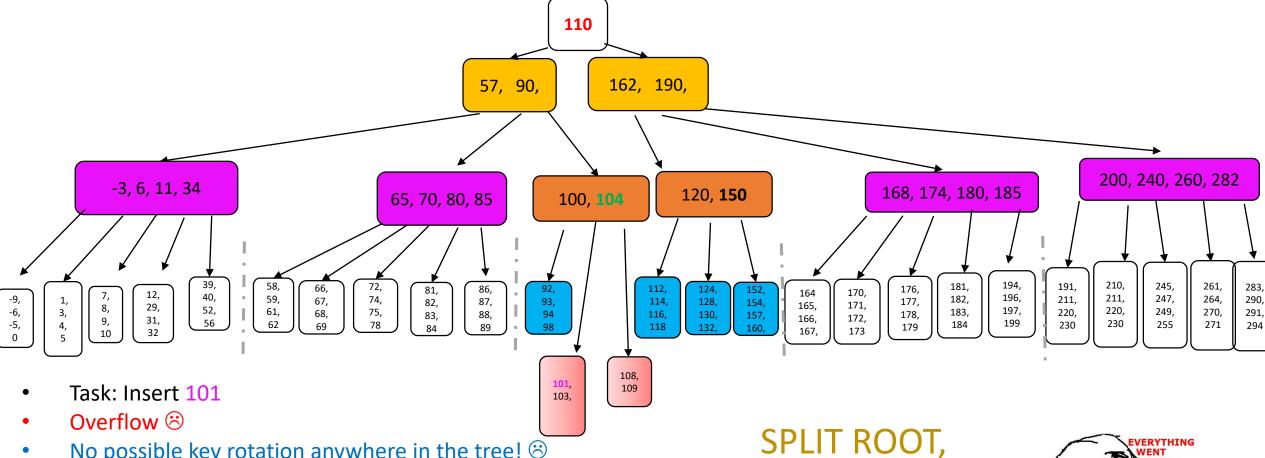






- Split and elevate 104 (middle key) to parent...
- Which also overflows!
- AND ITS OWN SIBLINGS CAN'T HELP WITH ROTATIONS!
- Split current node and elevate 110 (middle key) to the parent (the root).

NO SIBLINGS
TO ROTATE TO!



- No possible key rotation anywhere in the tree!
- Split and elevate 104 (middle key) to parent...
- Which also overflows!
- AND ITS OWN SIBLINGS CAN'T HELP WITH ROTATIONS!
- Split current node and elevate 110 (middle key) to the parent (the root).

ELEVATING 110, AND DONE.

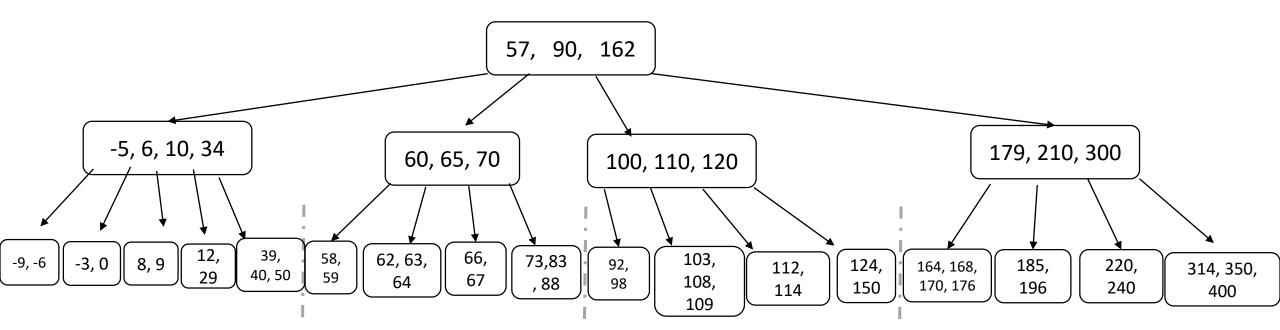


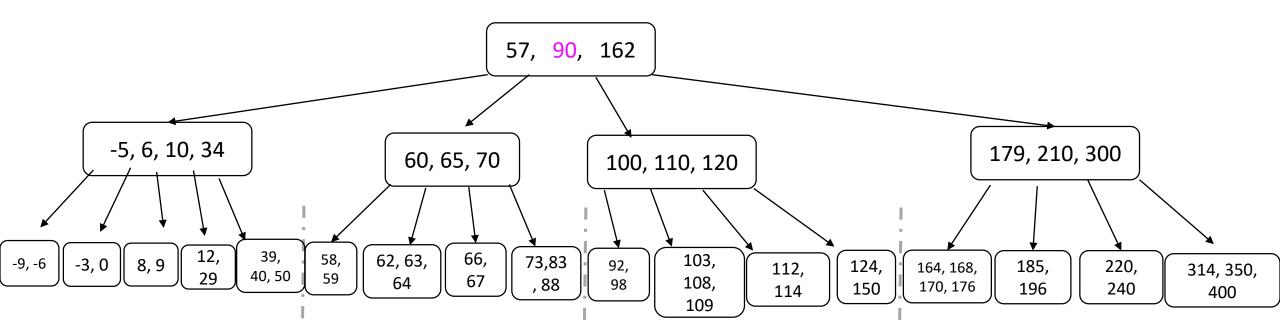
 Since deleting any key will always boil down to deleting some key from the leaf level, underflows can only occur at the leaf level

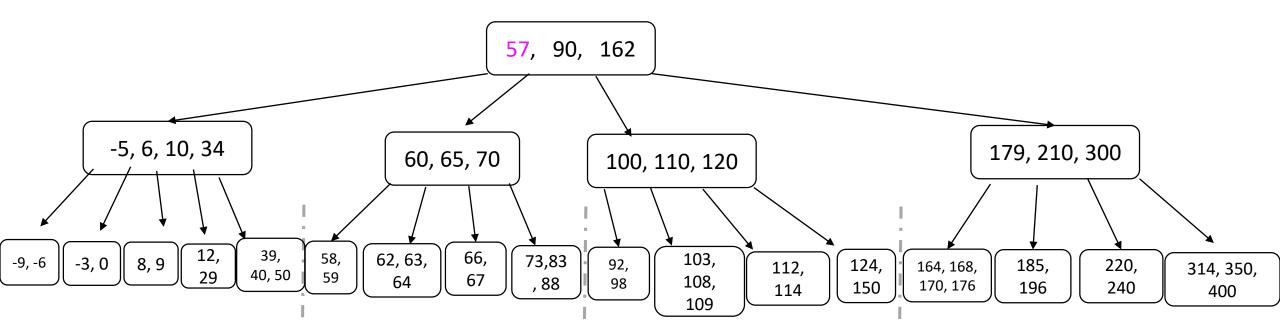
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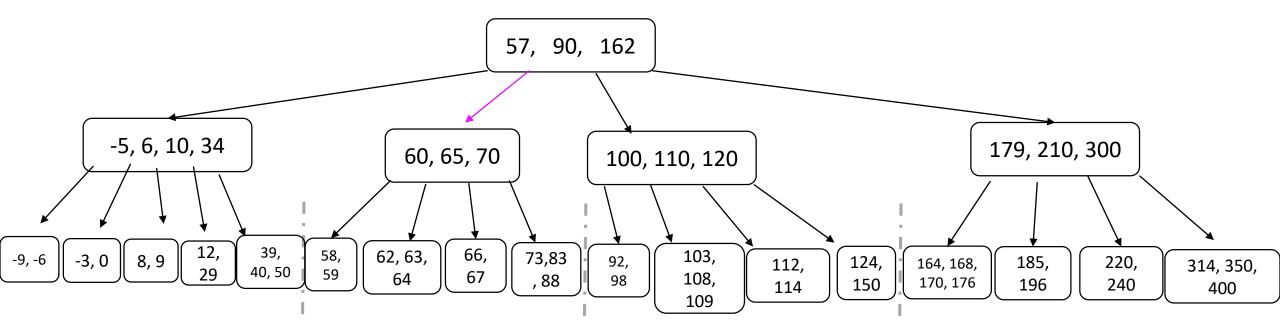
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  - If you find one such sibling, rotate the key "closest" to the current node from that sibling through the parent.
  - This is always either the smallest or the largest key of the sibling

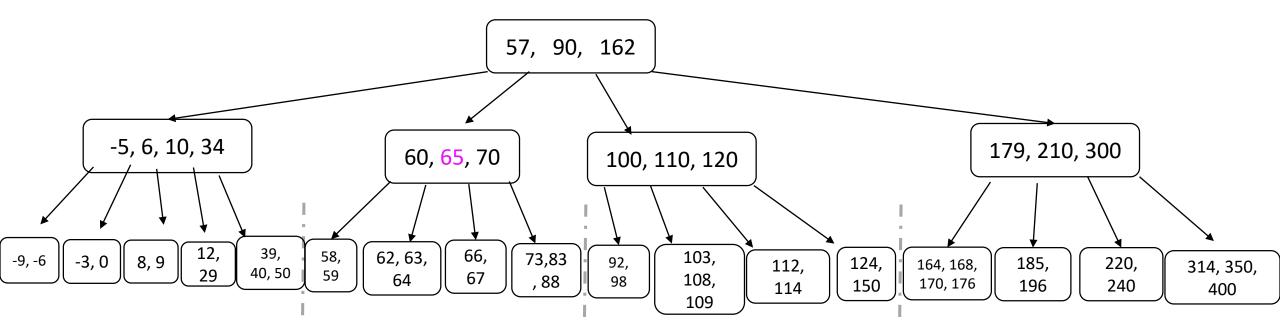
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  - This is always either the smallest or the largest key of the sibling
- Familiar generalization to "further" siblings applies here too.
- If all fails, then merge current node with parent key
  - This may propagate an underflow in the parent, which should be dealt with recursively...

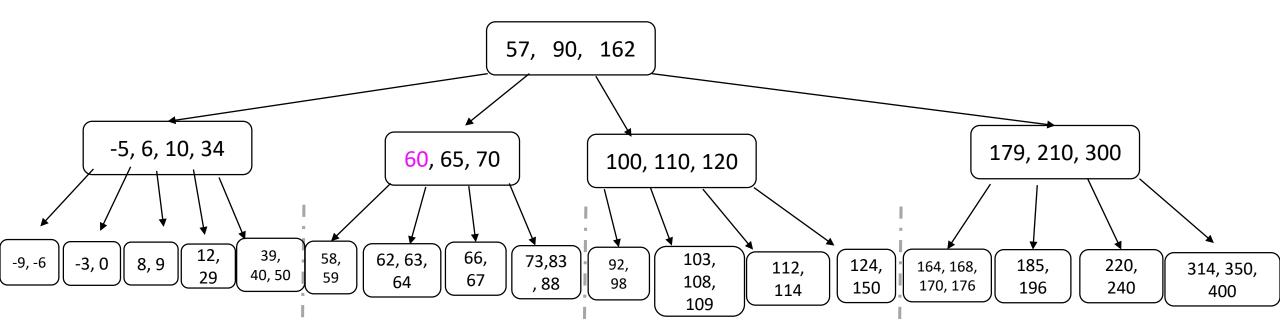


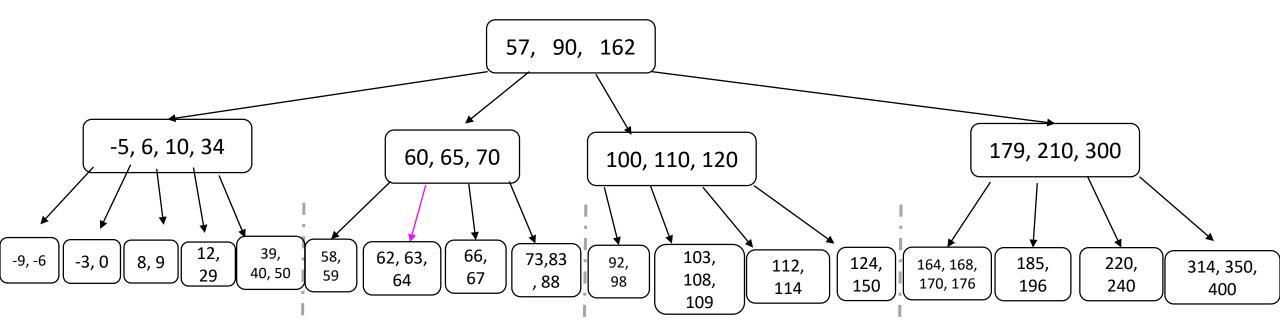


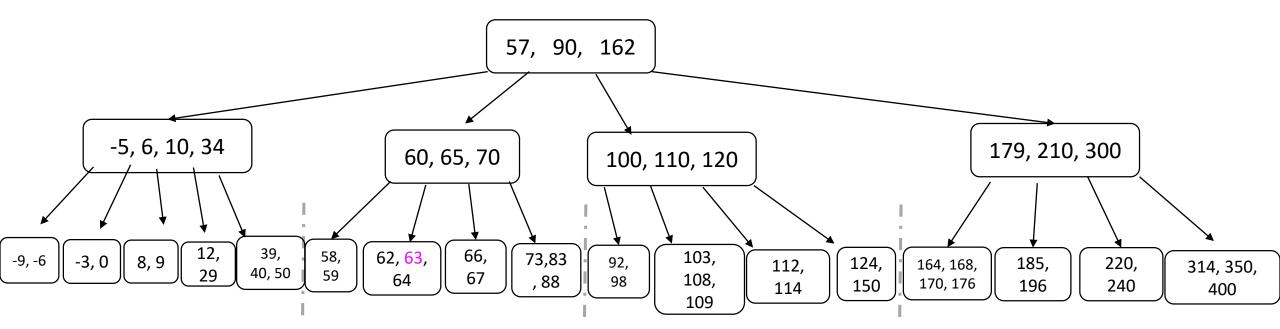


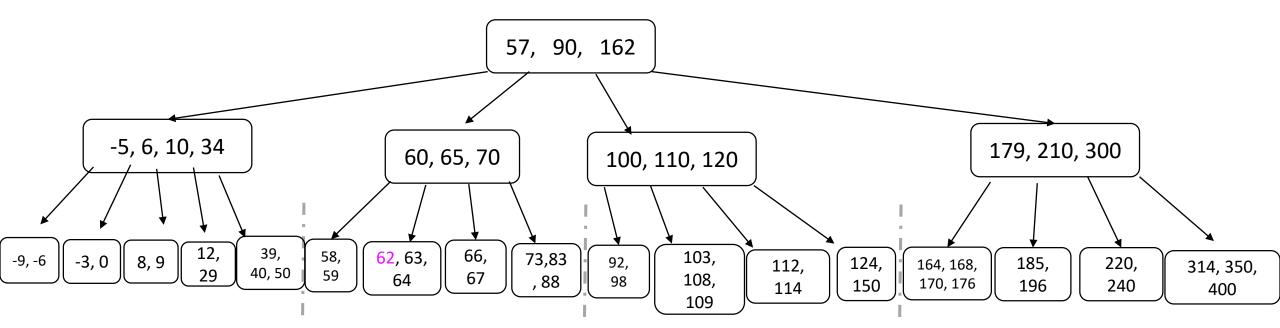


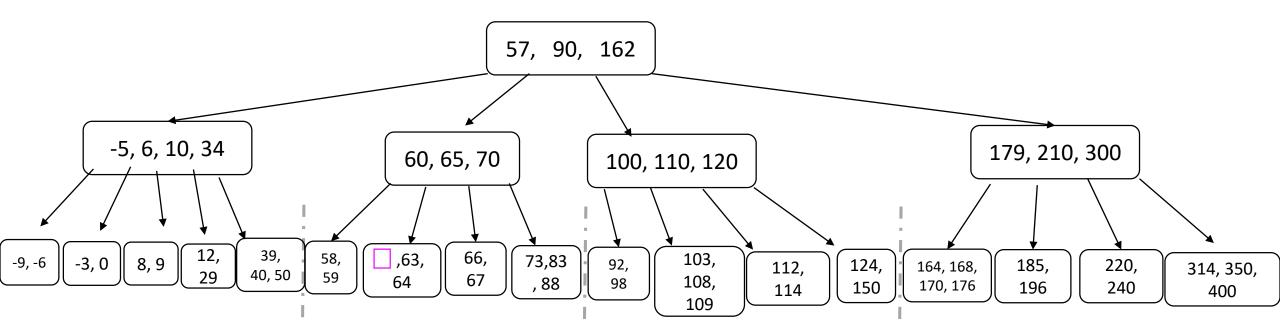


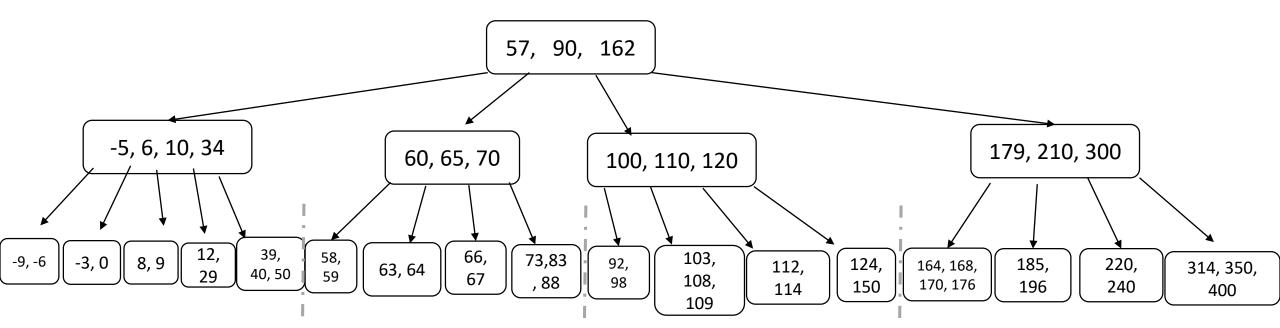


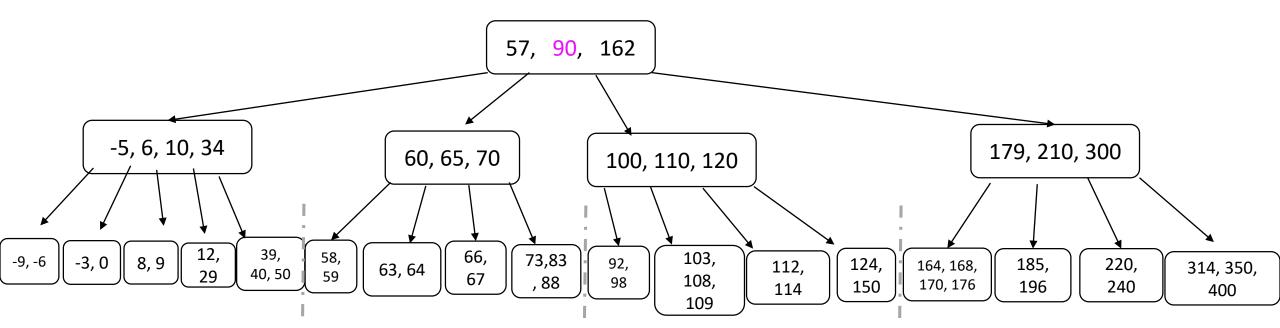


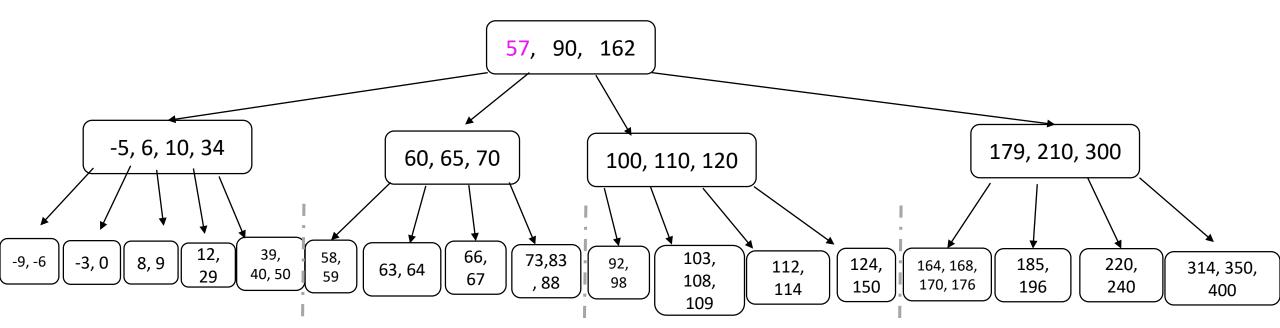


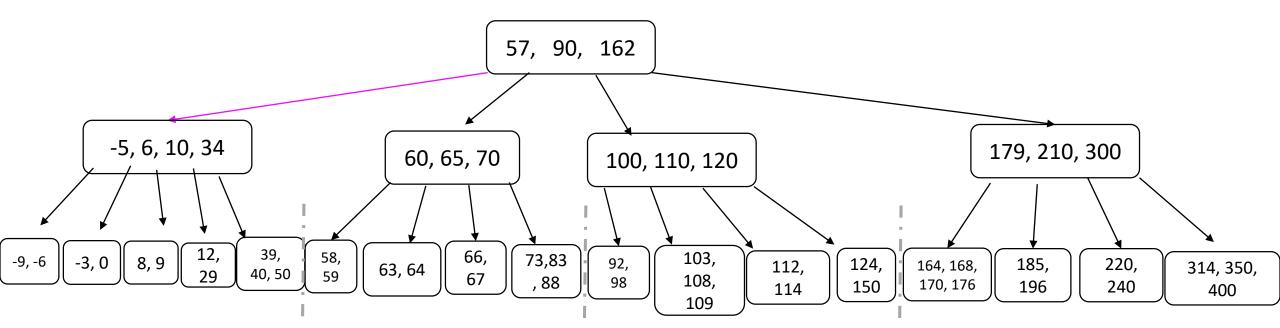


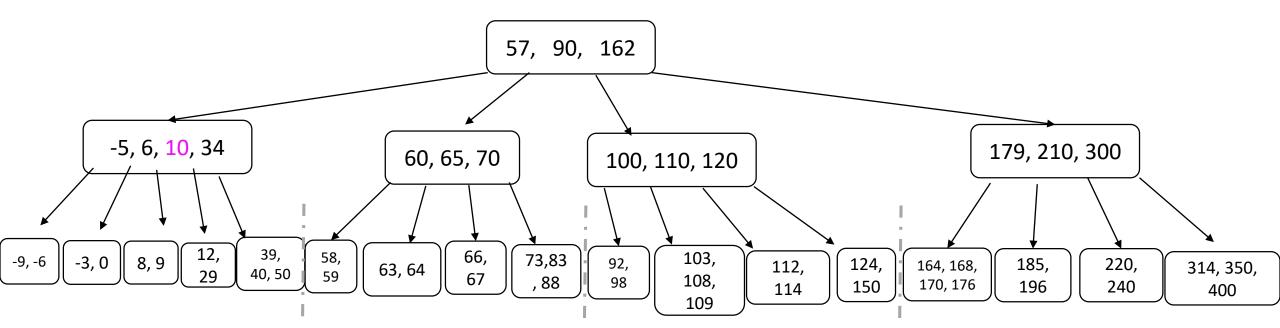


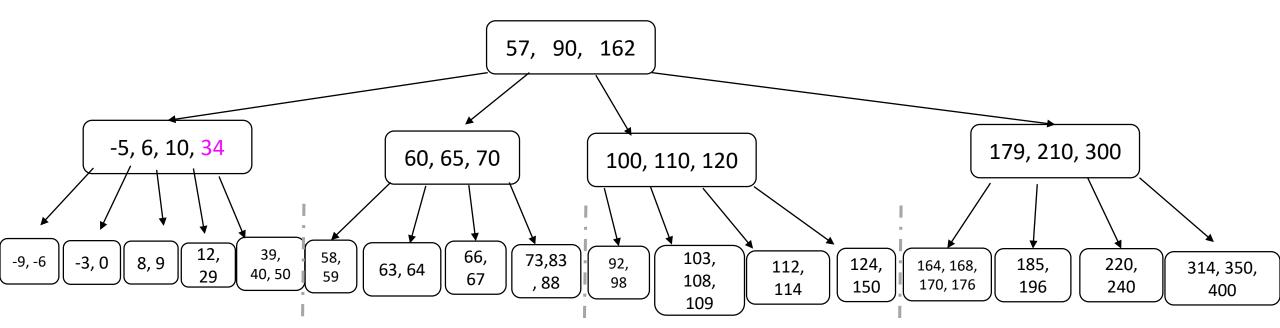


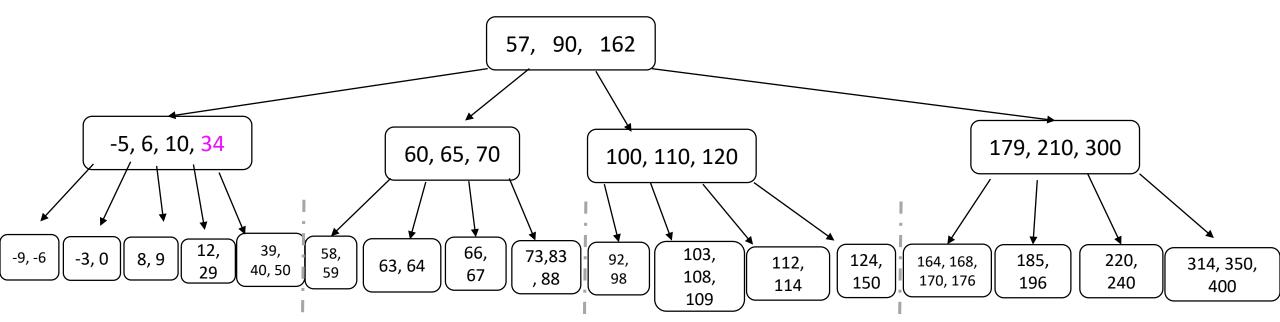




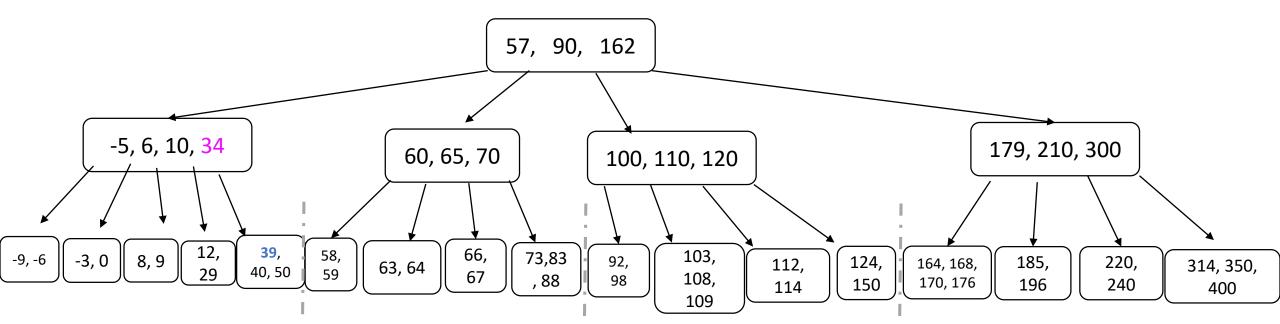




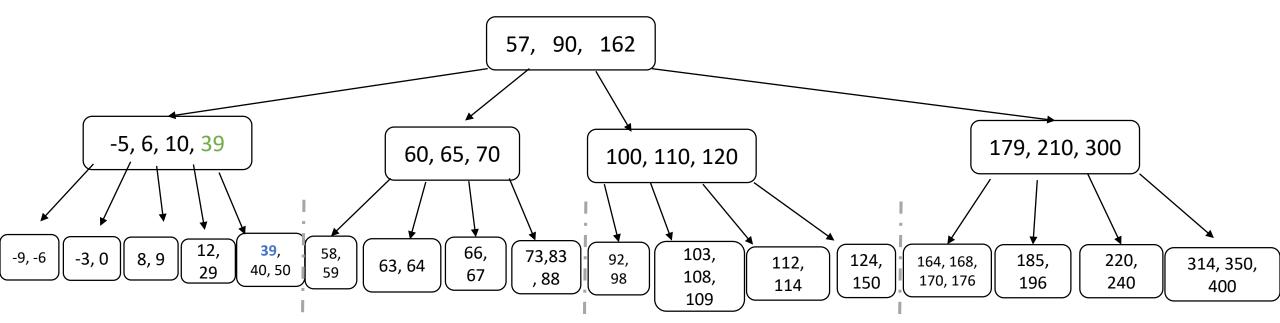




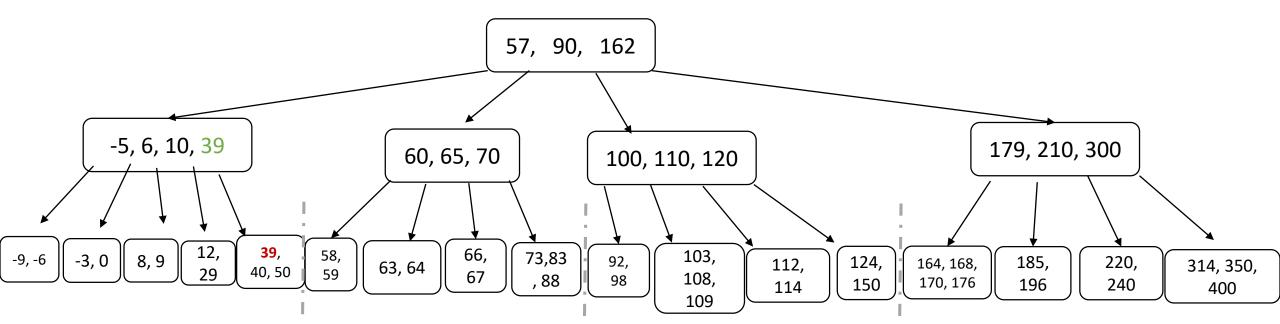
- Task: delete 34
  - Finding inorder successor...



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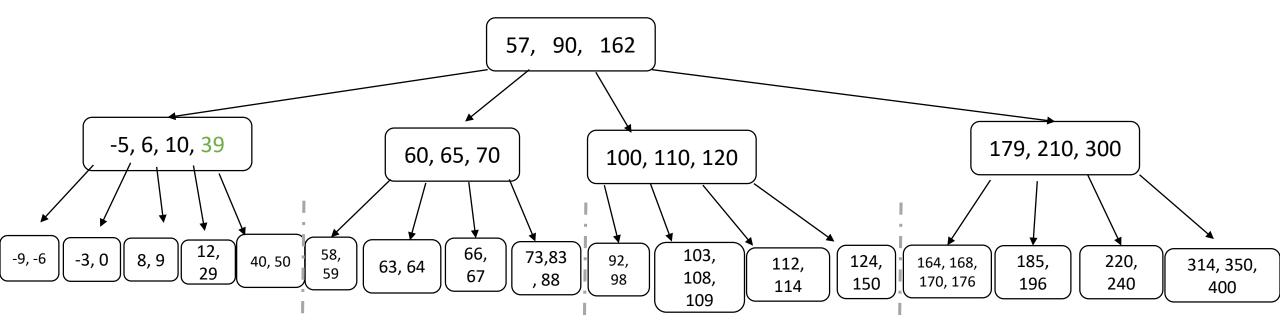


- Task: delete 34
  - Finding inorder successor...
  - Copy key



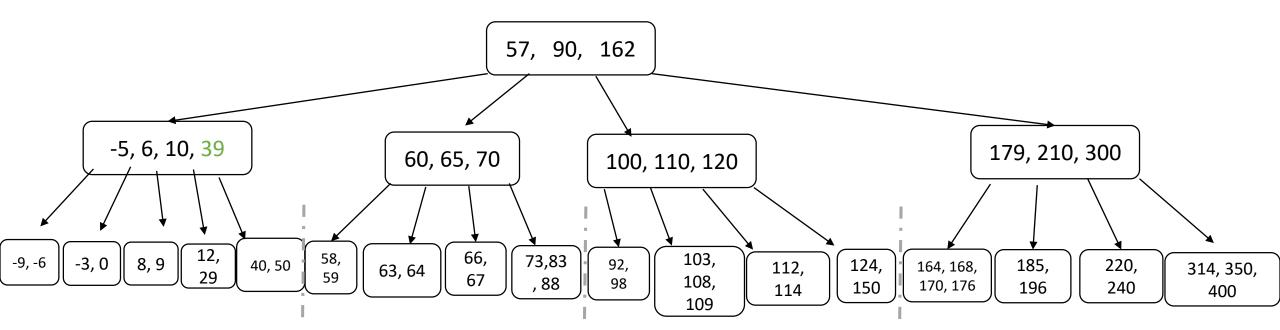
- Task: delete 34
  - Finding inorder successor...
  - Copy key
  - Recursively delete 39

## Example #1: Inner node deletion, no underflows

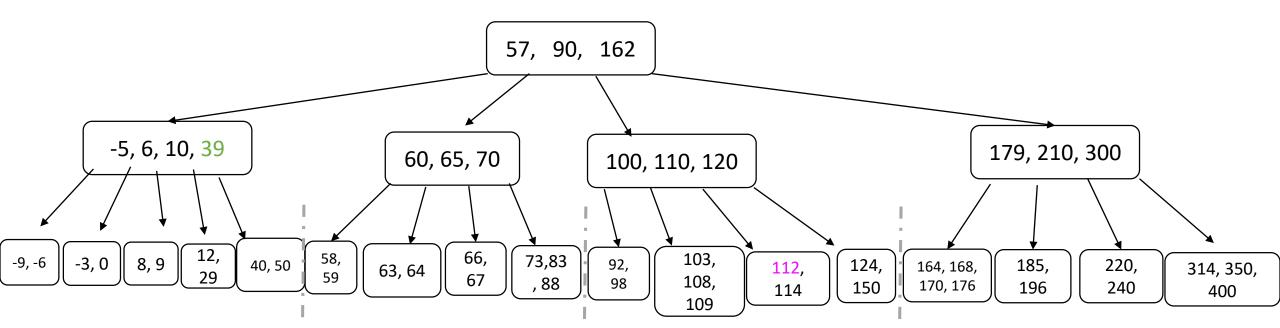


- Task: delete 34
  - Finding inorder successor...
  - Copy key
  - Recursively delete 39
    - No underflow, no problem!

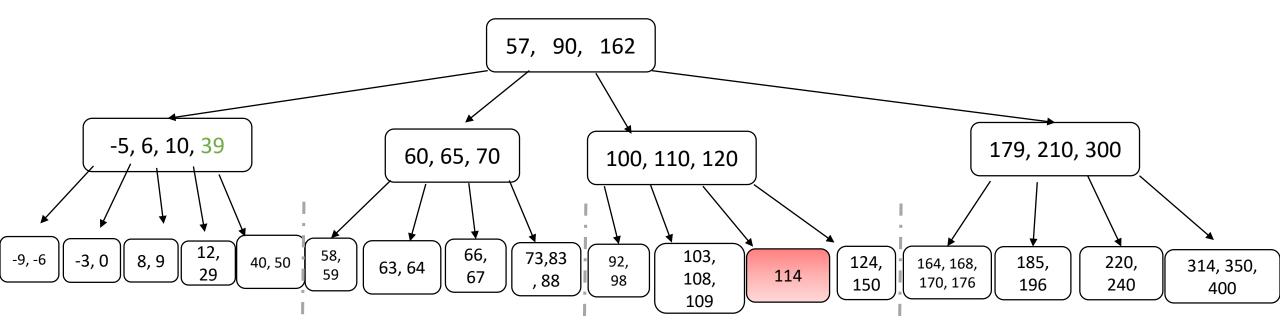




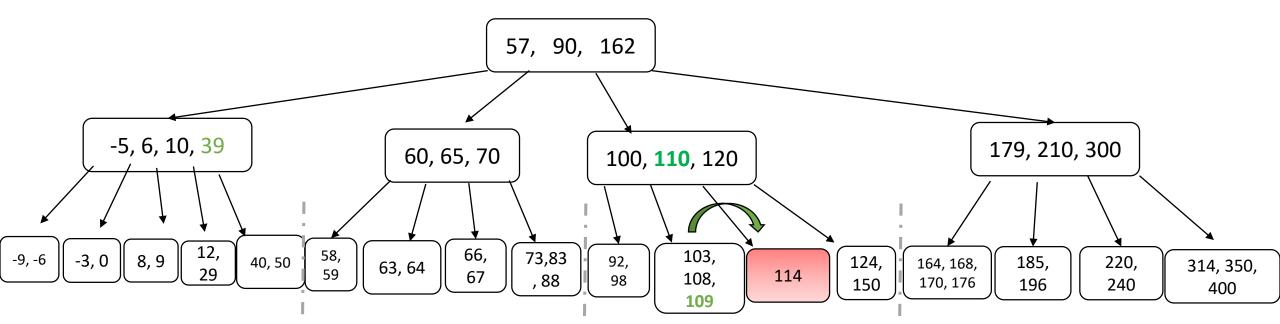
• Task: delete 112



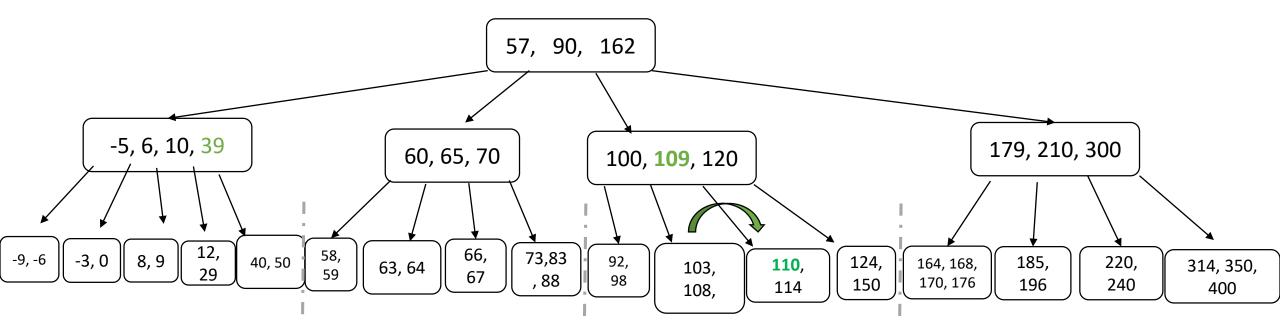
• Task: delete 112



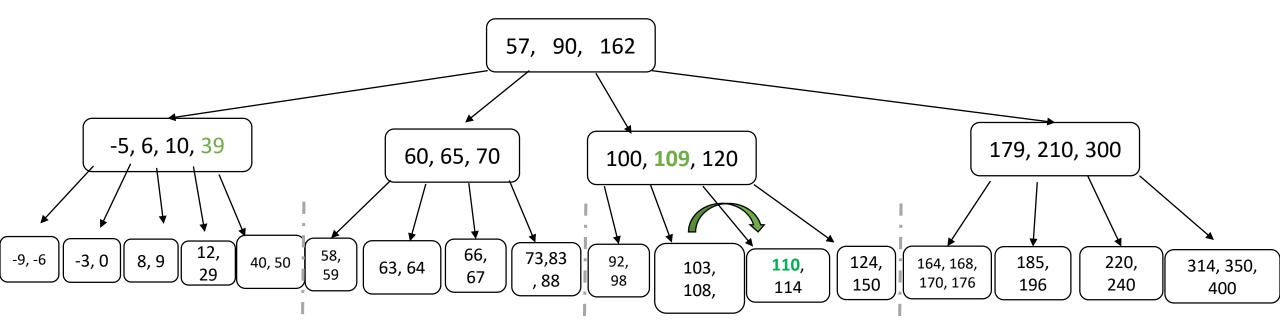
- Task: delete 112
- Underflow 🕾



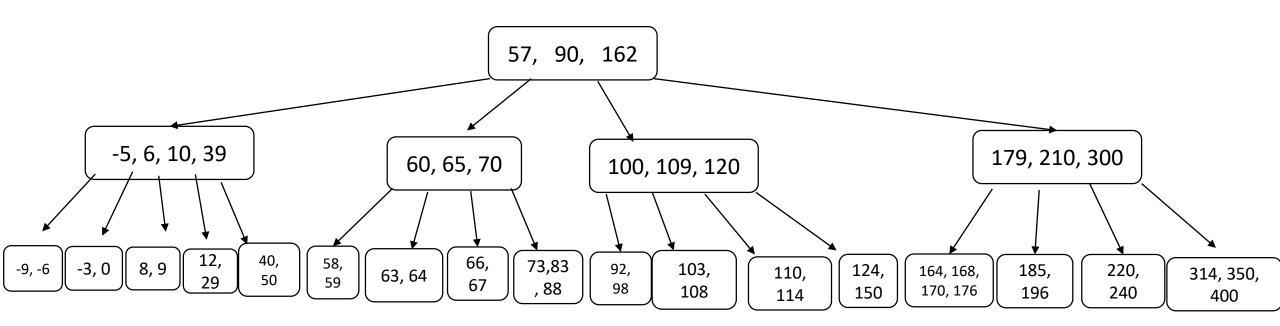
- Task: delete 112
- Underflow 🕾
- Solvable via key rotation ©



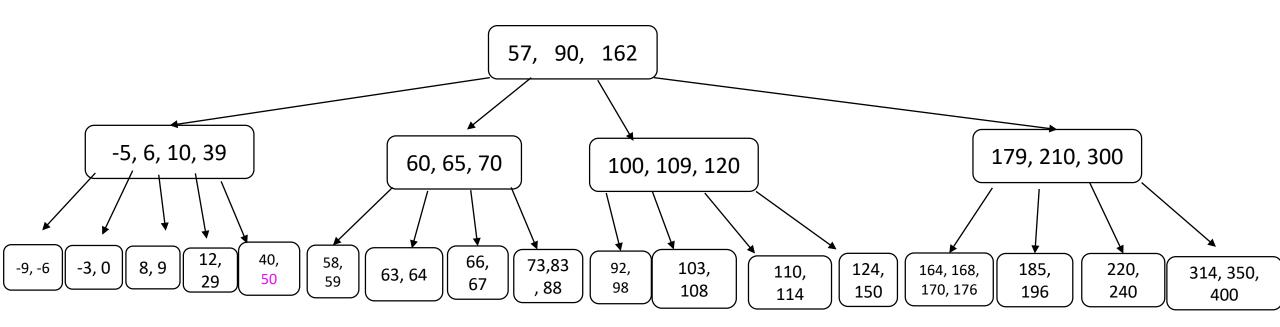
- Task: delete 112
- Underflow 🕾
- Solvable via key rotation ©



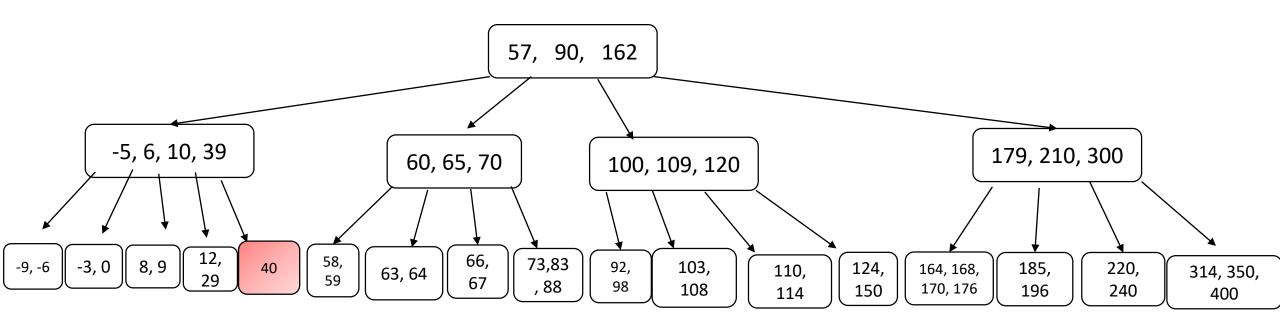
- Task: delete 112
- Underflow 😊
- Solvable via key rotation ©
- The *hops* trick that we learned from insertion applies here as well!
  - Look as far away as hops tells you to.



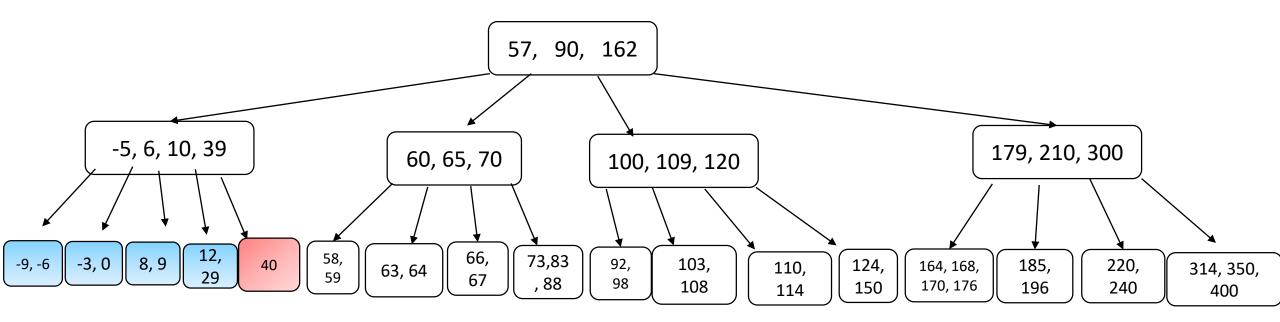
Task: delete 50



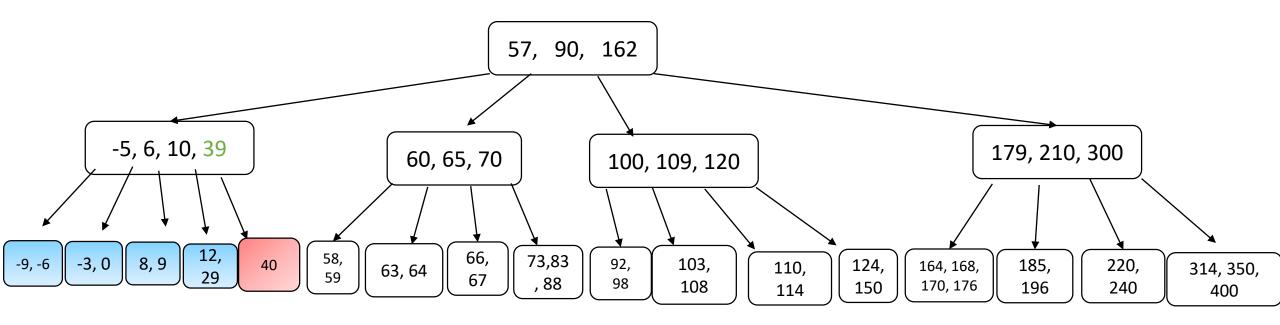
Task: delete 50



- Task: delete 50
- Underflow ⊗

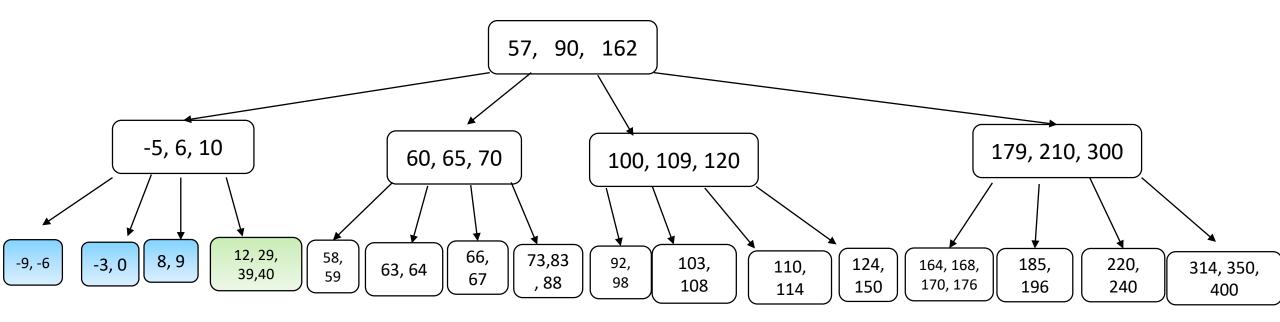


- Task: delete 50
- Underflow 😊
- Siblings can't help with key rotations  $\odot$  (because min # keys=  $\left\lceil \frac{p}{2} \right\rceil 1 = 3 1 = 2$ )

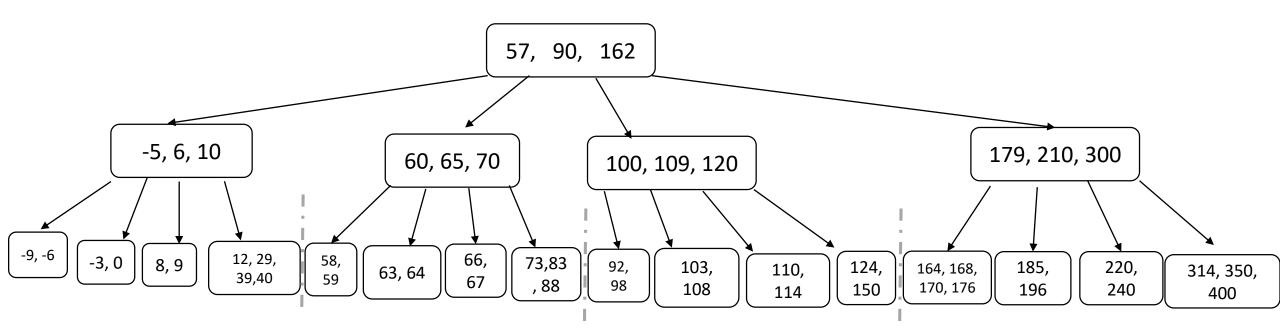


- Task: delete 50
- Underflow 😊
- Siblings can't help with key rotations  $\odot$  (because min # keys=  $\left\lceil \frac{p}{2} \right\rceil 1 = 3 1 = 2$ )
- Solution: Merge current node with sibling node and parent key.

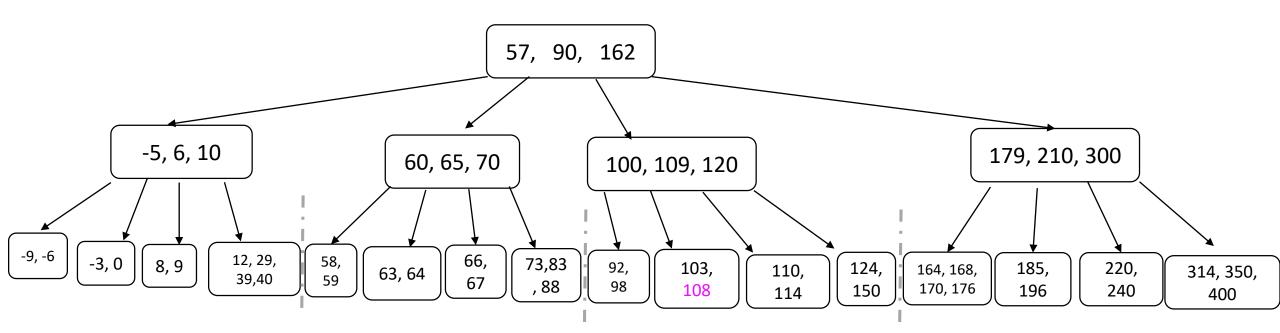
### Example #3: Merging with parent node



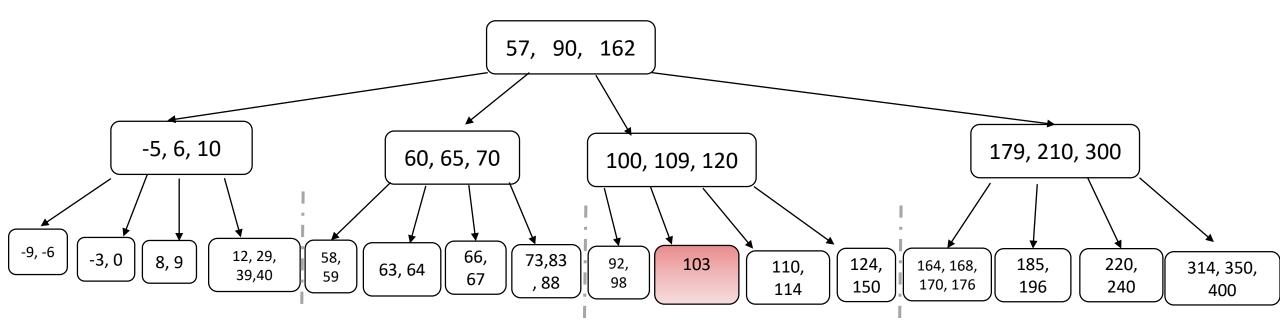
- Task: delete 50
- Underflow 😊
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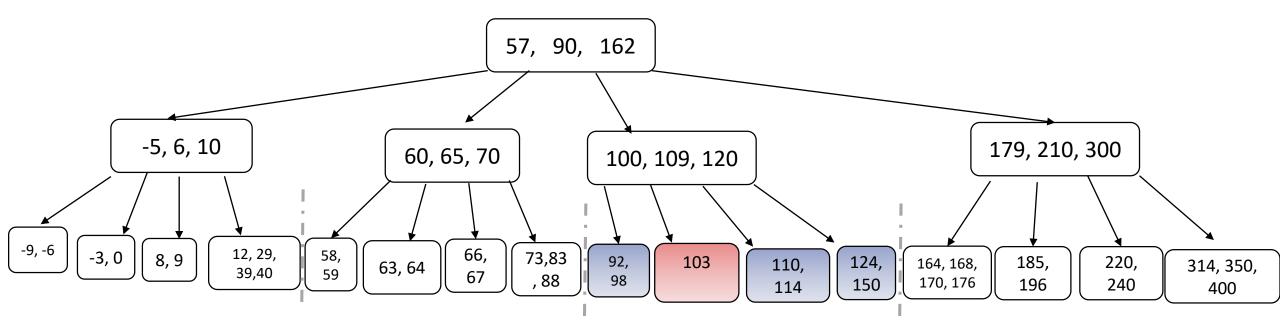
Task: delete 108



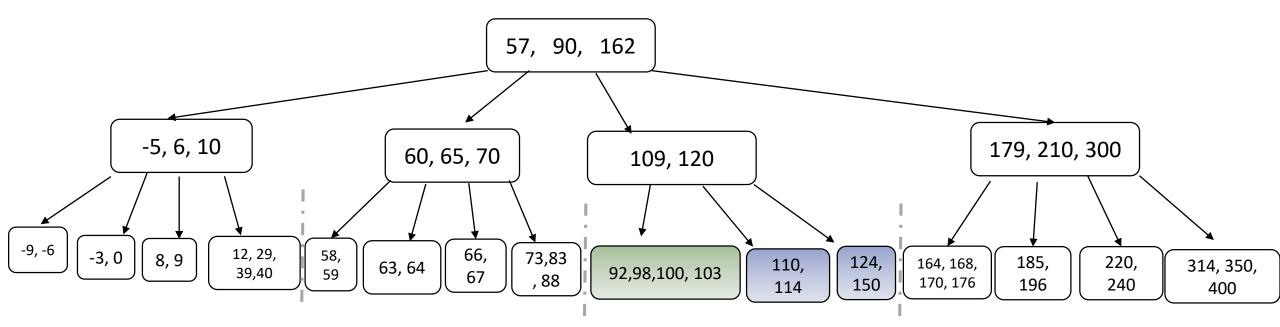
Task: delete 108



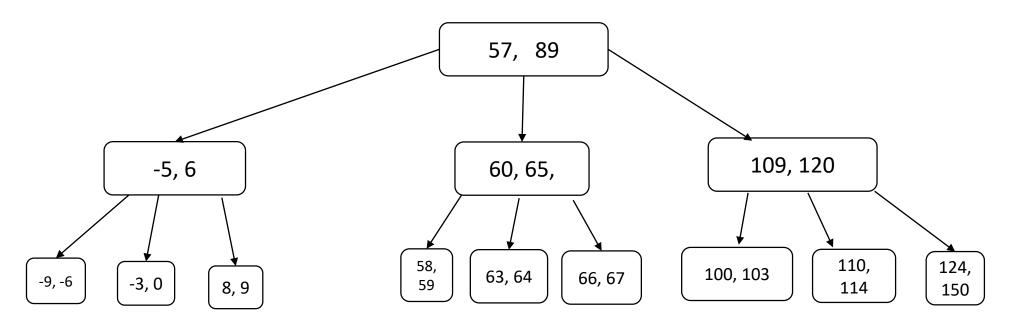
- Task: delete 108
- Underflow (3)



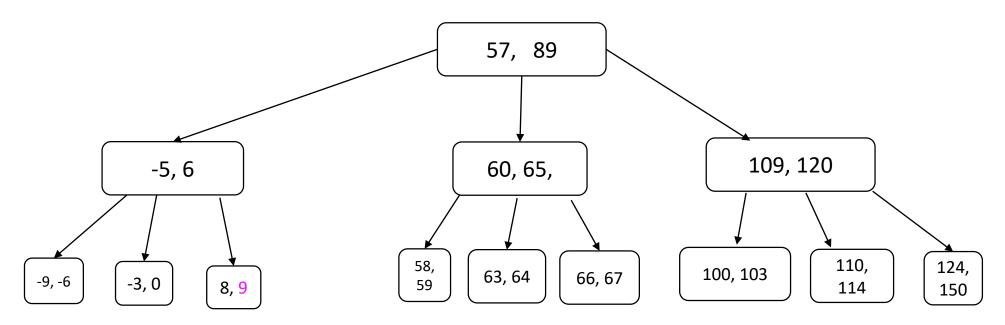
- Task: delete 108
- Underflow (3)
- Siblings can't help with key rotations ☺ (same reason)



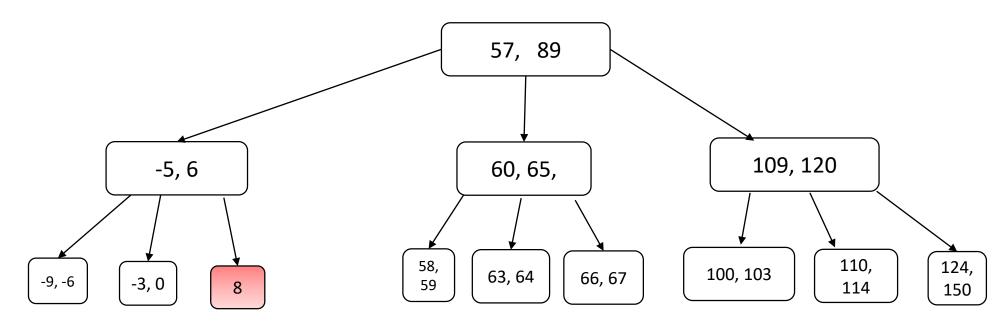
- Task: delete 108
- Underflow 😊
- Siblings can't help with key rotations (same reason)
- A relief force appears in the form of a sibling-parent key merging ©



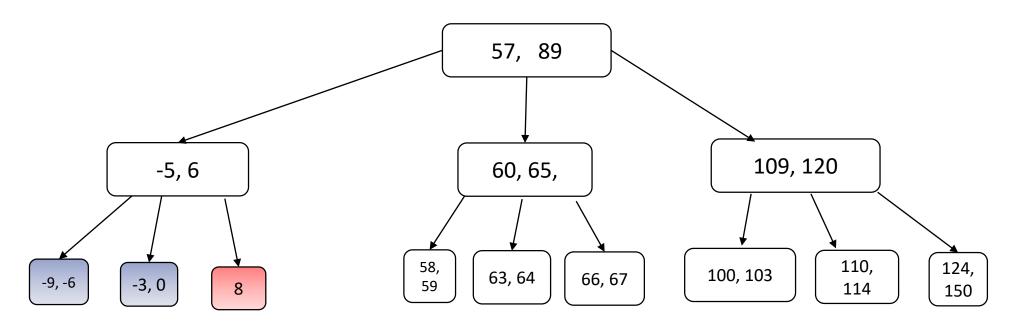
Task: delete 9



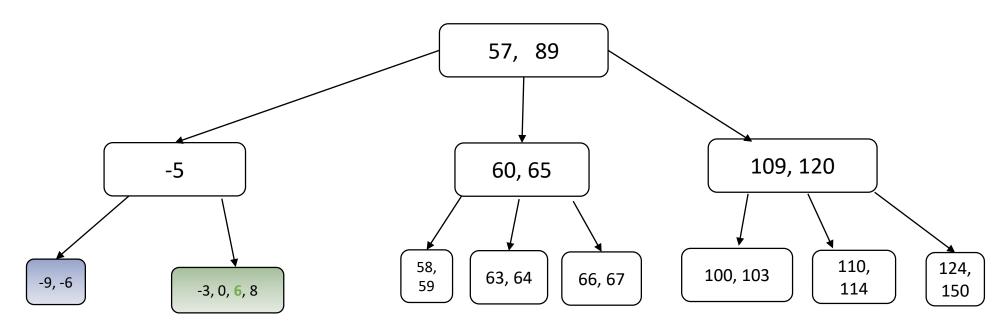
Task: delete 9



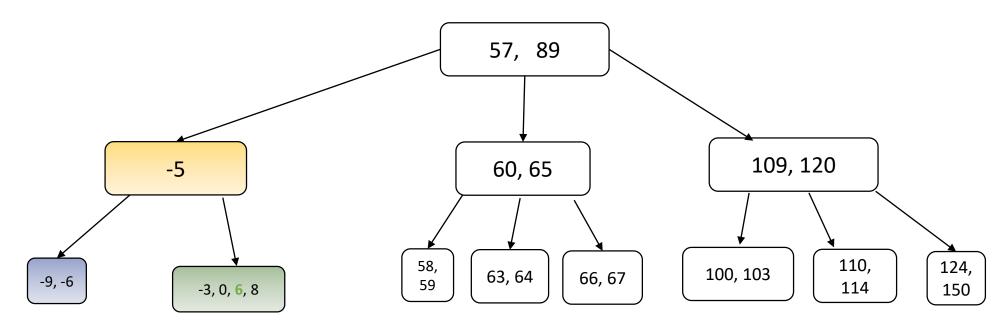
- Task: delete 9
- Underflow (3)



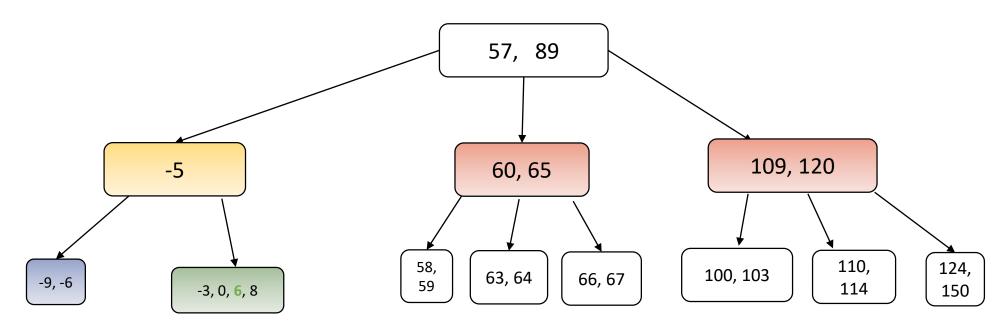
- Task: delete 9
- Underflow (3)
- Siblings can't help with key rotations! 😊



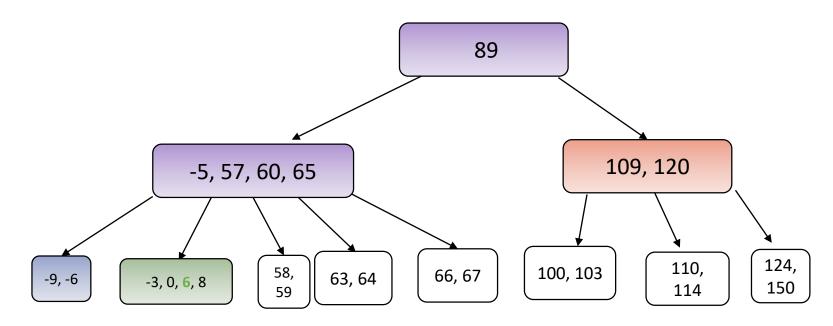
- Task: delete 9
- Underflow 😊
- Siblings can't help with key rotations! 🕾
- Merging with parent key and sibling ©



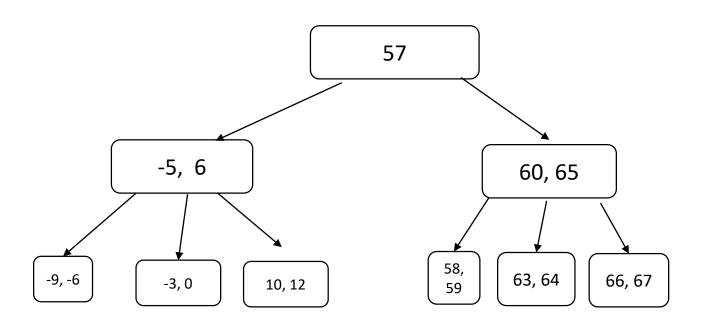
- Task: delete 9
- Underflow <sup>(3)</sup>
- Siblings can't help with key rotations!
- Merging with parent key and sibling ©
- Parent underflows 🕾



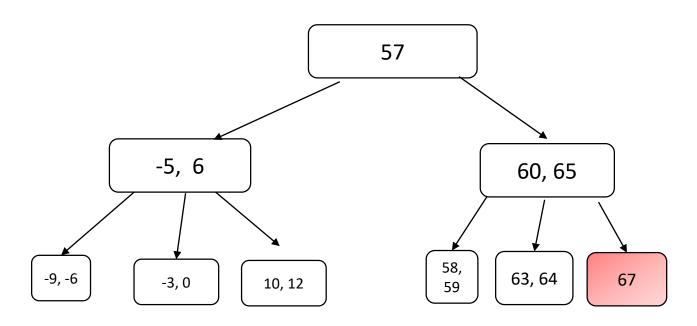
- Task: delete 9
- Underflow <sup>(3)</sup>
- Siblings can't help with key rotations!
- Merging with parent key and sibling ©
- Parent underflows 🕾
- Siblings can't help with rotations⊗



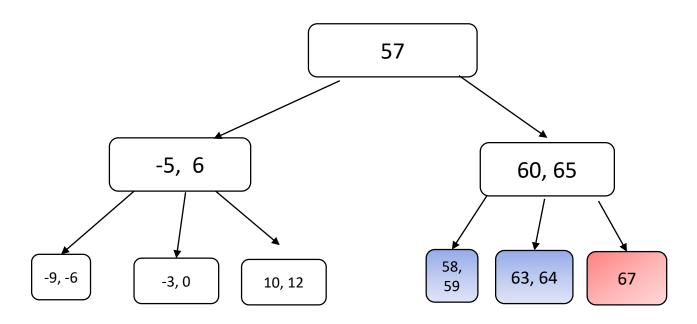
- Task: delete 9
- Underflow 😊
- Siblings can't help with key rotations! Solution: Merge with parent key and sibling
- Parent underflows 🕾
- Siblings can't help with rotations 🕾



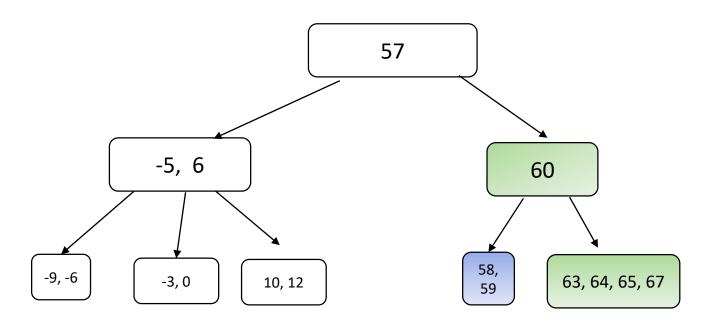
Task: delete 66



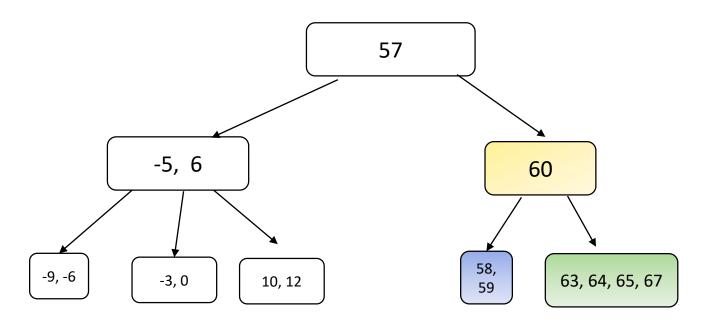
- Task: delete 66
- Underflow (3)



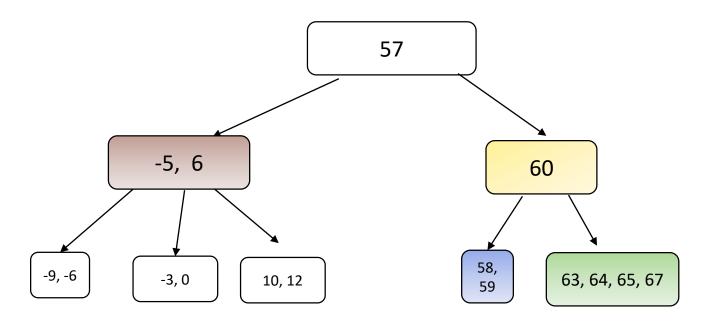
- Task: delete 66
- Underflow 😊
- Siblings can't help with key rotations 😊



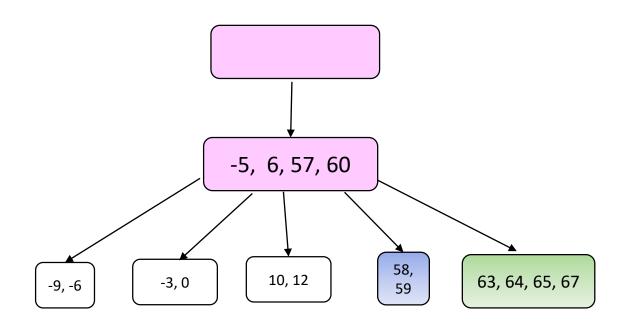
- Task: delete 66
- Underflow 😊
- Siblings can't help with key rotations 🕾
- Merge ©



- Task: delete 66
- Underflow 😊
- Siblings can't help with key rotations 🕾
- Merge ©
- Underflow (3)

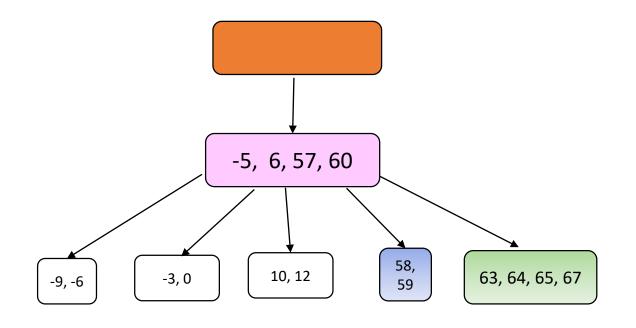


- Task: delete 66
- Underflow (3)
- Siblings can't help with key rotations 🕾
- Merge ©
- Underflow 😊
- Siblings can't help with key rotations 🕾



- Task: delete 66
- Underflow (3)
- Siblings can't help with key rotations 🕾
- Merge ©
- Underflow 😊
- Siblings can't help with key rotations 🕾

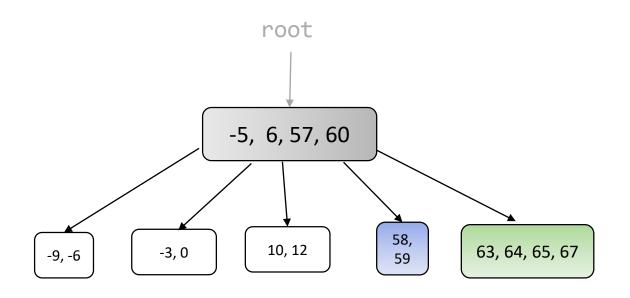




- Task: delete 66
- Underflow ☺
- Siblings can't help with key rotations 🕾
- Merge ©
- Underflow 😊
- Siblings can't help with key rotations 🕾

Merge ©

**Root underflows** 🕾



- Task: delete 66
- Underflow ☺
- Siblings can't help 🕾
- Merge ©
- Underflow 😊
- Siblings can't help 🕾

- Merge ©
- Root underflows (3)
- Delete it, and set new root to its only child!

## Searching a B-Tree

- Searching has effectively been covered by presenting insertion and deletion.
- At every level, I will query the node via binary search. Either:
  - I will find the key, so I'm done, or
  - I will follow the relevant pointer to a subtree, and repeat.
- Worse case: I have to go all the way to the leaves.

- I want to measure the worst-case search cost in a B-Tree with branching factor *p*.
- Unit cost: comparison of two keys via compareTo().

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 $\log_p n$ 

 $p * log_p n$ 

 $(p-1) * log_p n$ 

Something else (what?)

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- Question: in the worst case, how many comparisons will I make for a key search in a B-Tree with  $n \, \underline{keys}$ ?

$$\log_2(p-1) * \log_p n \approx \log_2 n$$

 $\log_p n$ 

 $p * log_p n$ 

$$(p-1)*log_p n$$

Something else (what?)



With the keys **sorted by construction**, it really is dumb to not do binary search in every node! ;)

# So, why even care?

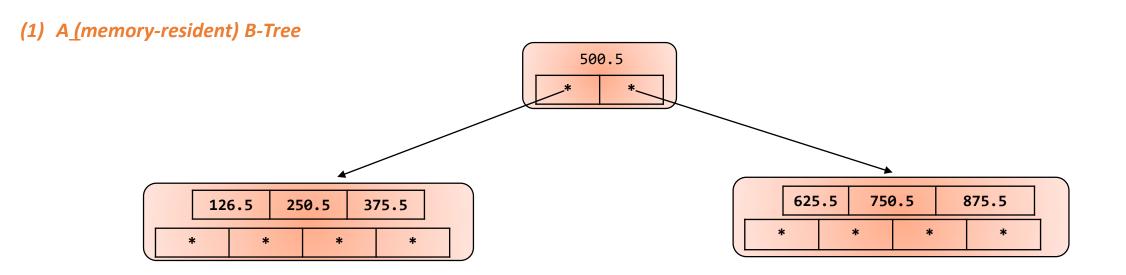
• Why even care about B-Trees if their search is  $O(\log_2 n)$ ?

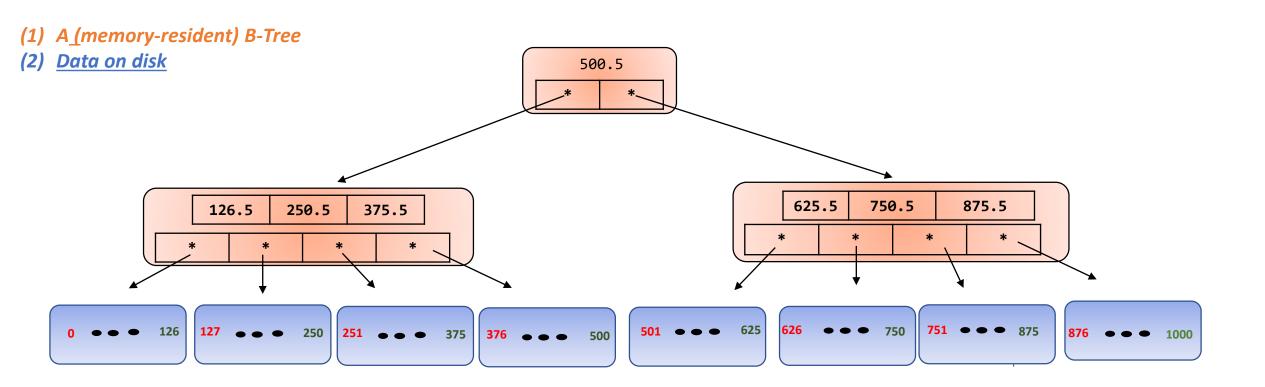


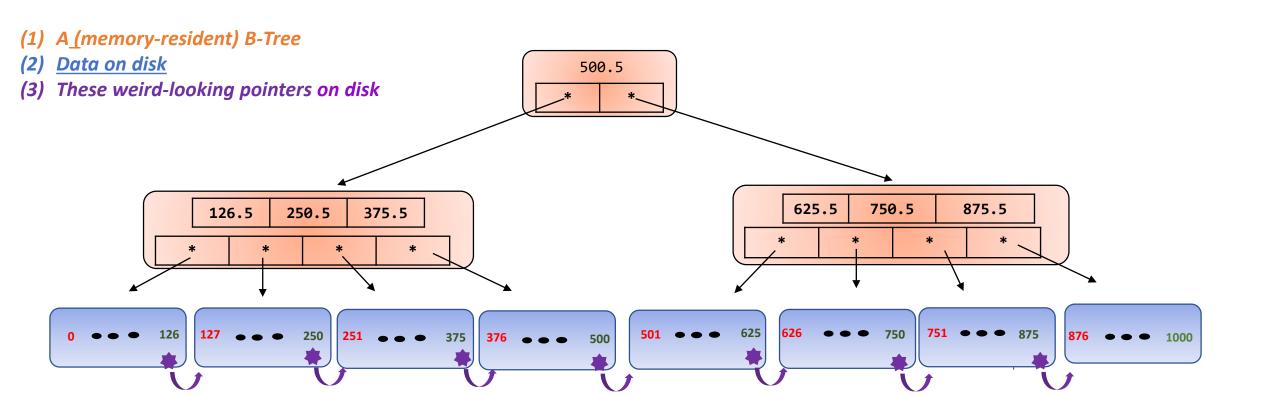
## So, why even care?

- Why even care about B-Trees if their search is  $O(\log_2 n)$ ?
- Because of the **hugely successful** <u>B+ ("B-plus") trees</u>, of which they are the main component!

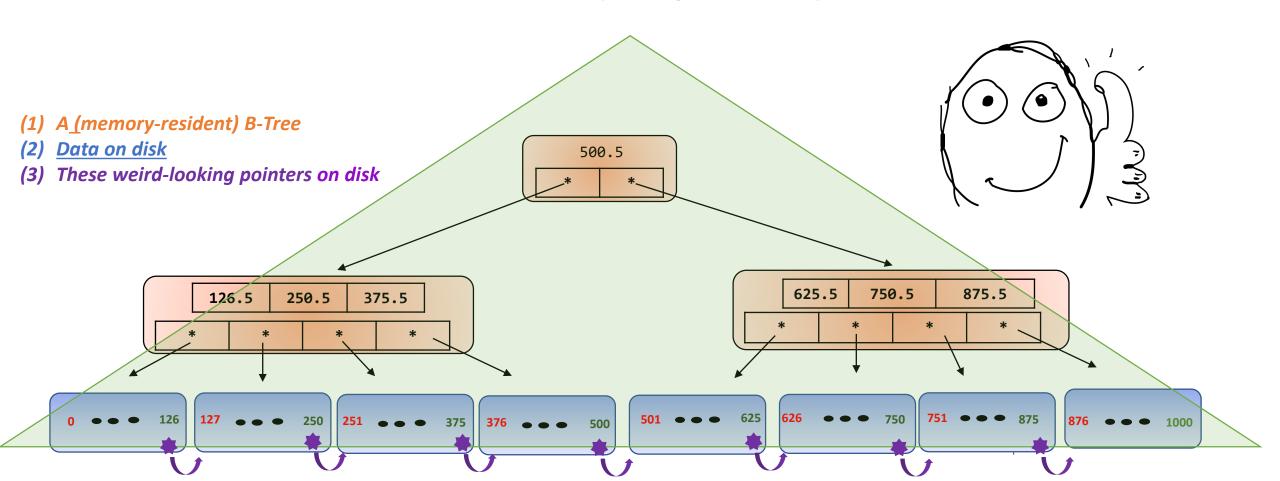








Give us a B+-tree ("B - plus tree") index!



## Are buffers a good storage choice?

- Issue: Static storage buffers for keys and references waste memory space for nodes.
  - Proposal: Use linked lists instead!
- This is actually not a good idea.
- Counter-arguments:
  - 1. Buffers waste space MINIMAL compared to the size of the DB (recall earlier results)
  - 2. Static buffers allow us to perform super-efficient binary search for seeking keys at every node
  - 3. In 2019, memory is cheaper than it used to be in 1970; no reason to overoptimize!

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- Conclusion: yes, they are an excellent storage choice.

