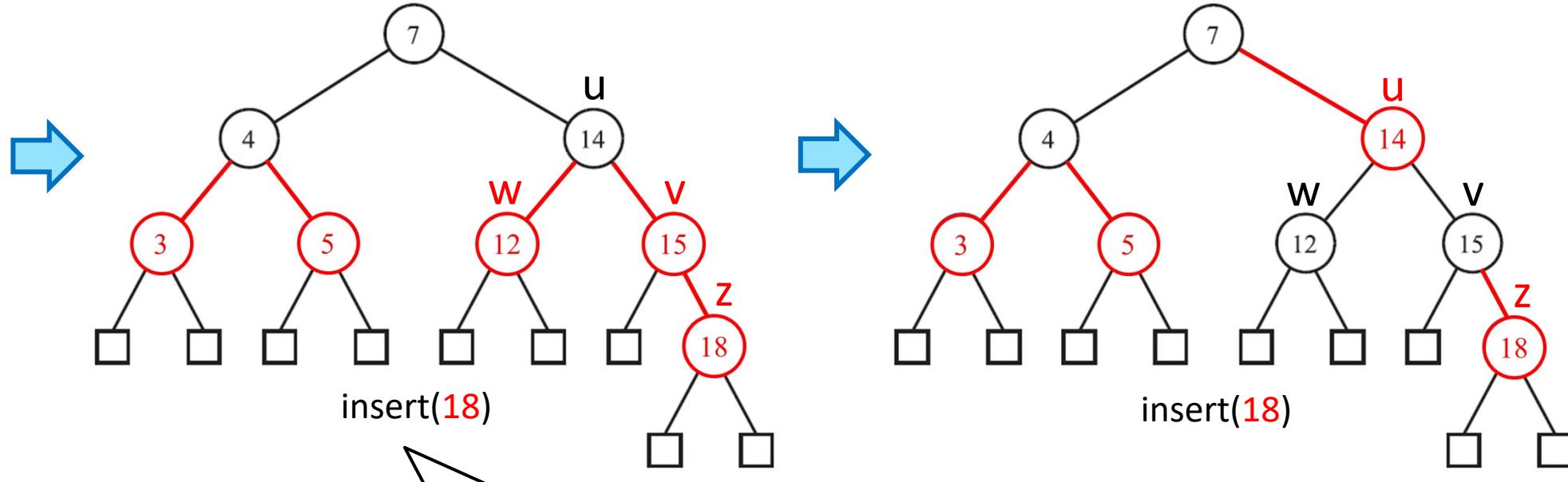
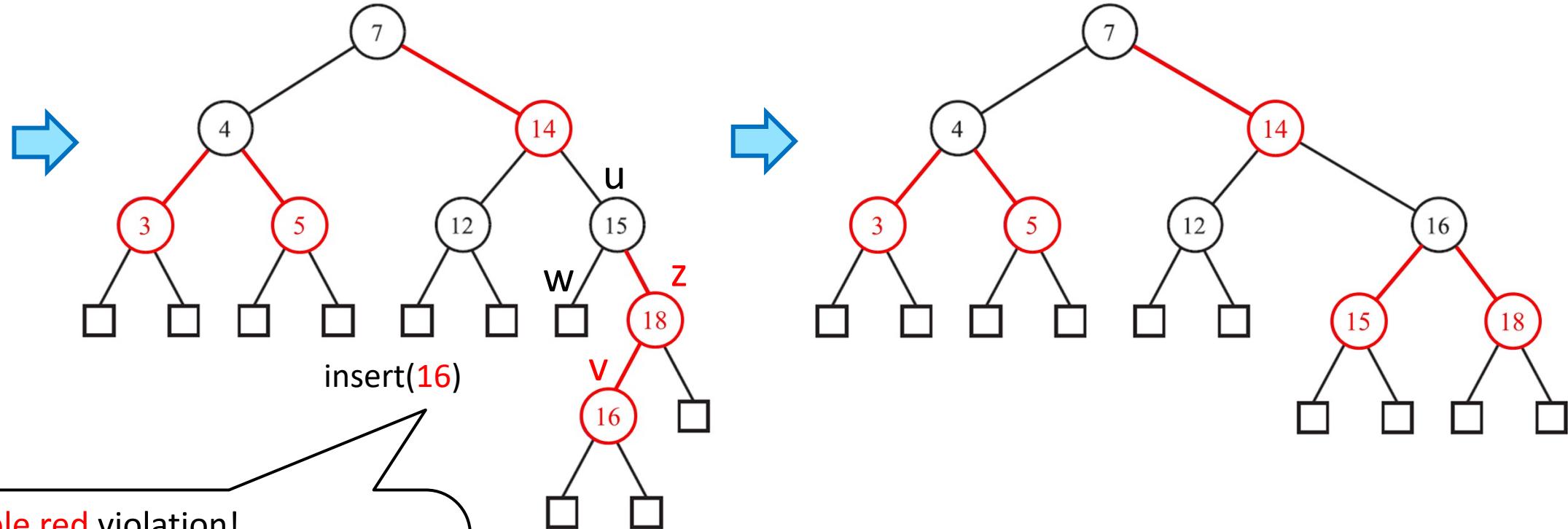


RED-BLACK – INSERTION EXAMPLES



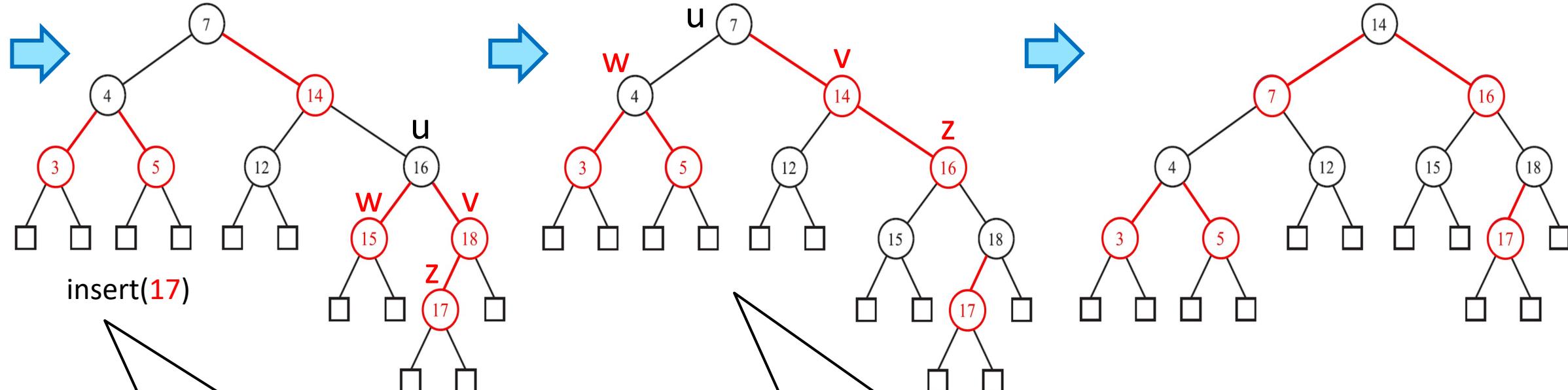
RED-BLACK – INSERTION EXAMPLES



Double red violation!

- Case 1: w is black
 - Rename (u,v,z) as (a,b,c) and use **trinode restructuring**
 - Make a and c **red** and b **black**

RED-BLACK – INSERTION EXAMPLES



Double red violation!

- Case 2: w is red (do recoloring)
 - Make v and w black
 - Make u red (unless it's the root)

This results in another **double red** violation higher up the tree!

- Case 1: w is black
 - Rename (u,v,z) as (a,b,c) and use **trinode restructuring**
 - Make a and c red and b black

RED-BLACK – REMOVAL

- We will skip the details of how an entry is **removed** from a **Red-Black** tree, since it involves dealing with many special cases that can be confusing sometimes
- All you need to know is that **removal** may require **O(log n)** **recoloring** operations and two **trinode restructuring** operations
- Note that **recoloring** is simpler and slightly faster than **trinode restructuring**, which is why we would rather perform the former rather than the latter

COMPARISON OF DIFFERENT TREES

We discussed three type of **self-balancing search trees**:

- **AVL trees:**
 - **Removing** an entry may take **O(log n)** **trinode restructuring** operations
- **(2,4) trees:**
 - **Inserting** an entry may take **O(log n)** **split** operations
 - **Removing** an entry may take **O(log n)** **fusions** and/or **1 transfer** operation
- **Red-Black trees:**
 - **Insertion** may take **O(log n)** **recoloring** operations and/or **1 trinode restructuring**
 - **Removal** may take **O(log n)** **recoloring** operations and/or **2 trinode restructuring**

Recoloring is the fastest operation, hence Red-Black trees tend to be faster

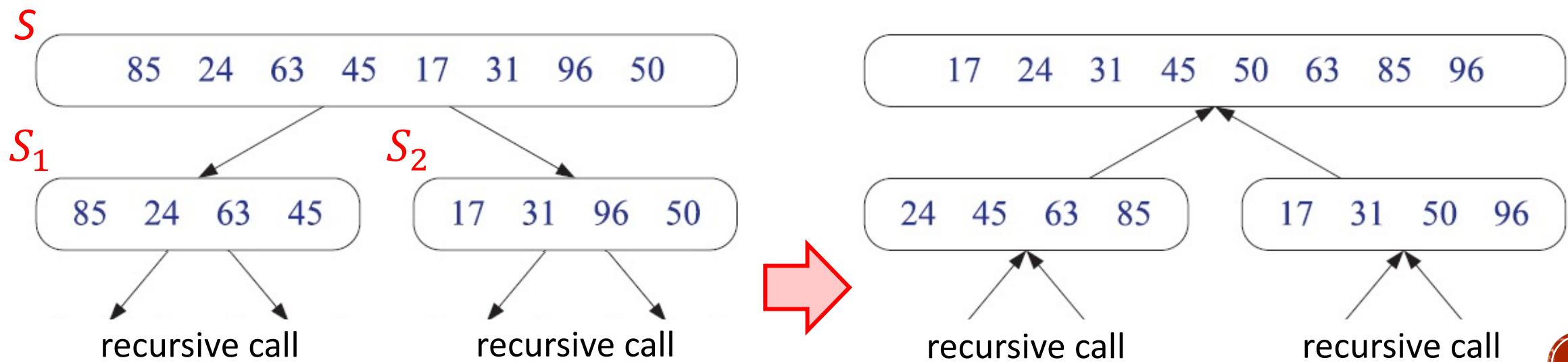
CHAPTER 11: SORTING

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MERGE-SORT

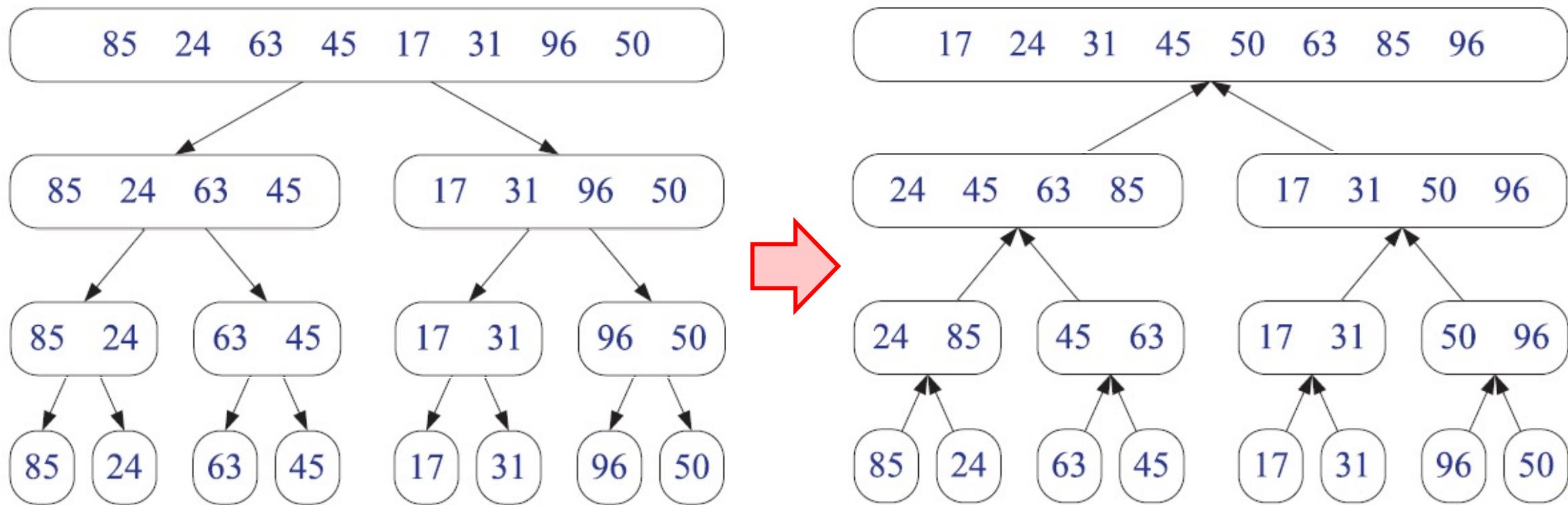
MERGE-SORT

- Given a sequence S of n elements, the algorithm “merge-sort” sorts S as follows:
 - Divide: If S contains less than two element, return S immediately; otherwise divide S by putting the first $[n/2]$ elements in S_1 and the remaining $[n/2]$ in S_2
 - Recur: Recursively sort S_1 and S_2
 - Conquer: Put back the elements into S by merging the sorted sequences S_1 and S_2 into a sorted sequence.



MERGE-SORT TREE

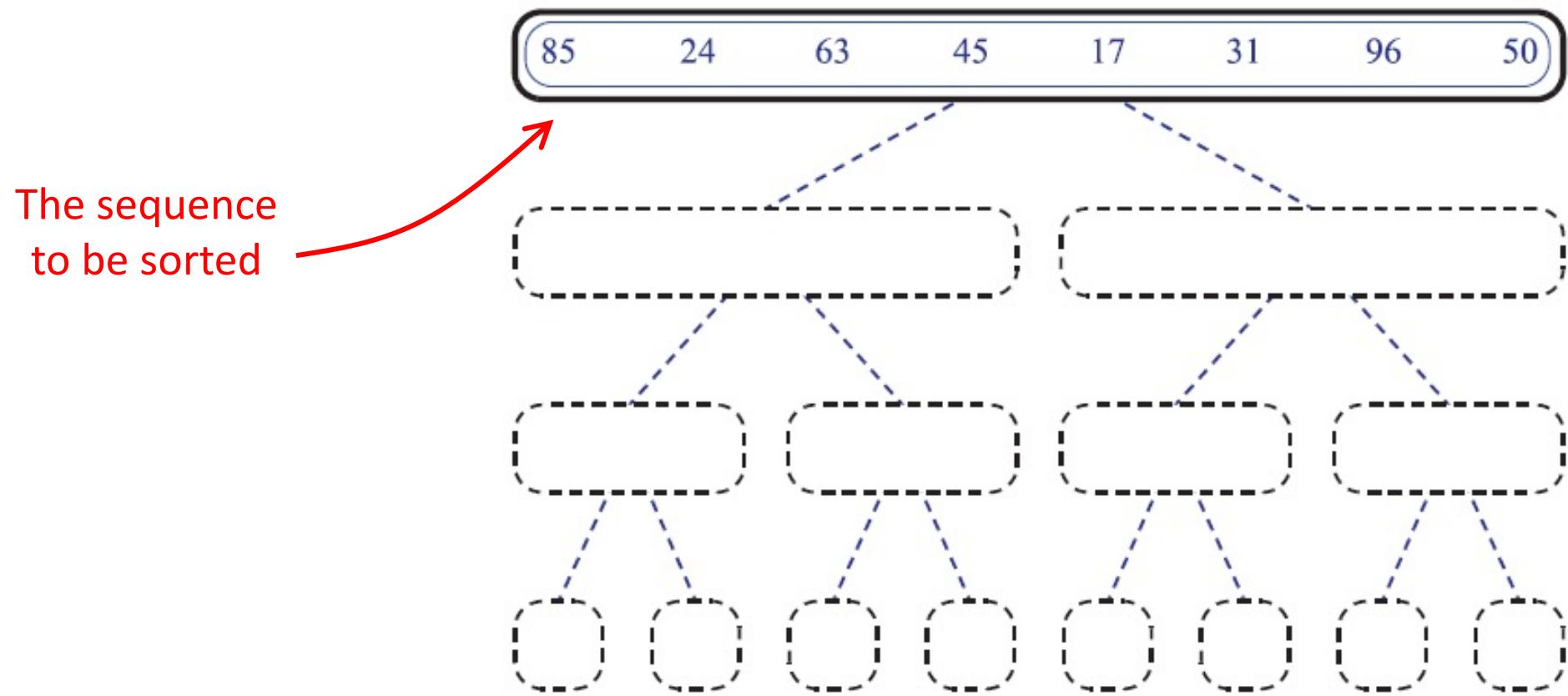
- Here is an example of a merge-sort tree



- Since the input size roughly halves at each recursive call, the height of the merge-sort tree is $O(\log n)$. In fact, it is proven that the height equals $\lceil \log n \rceil$

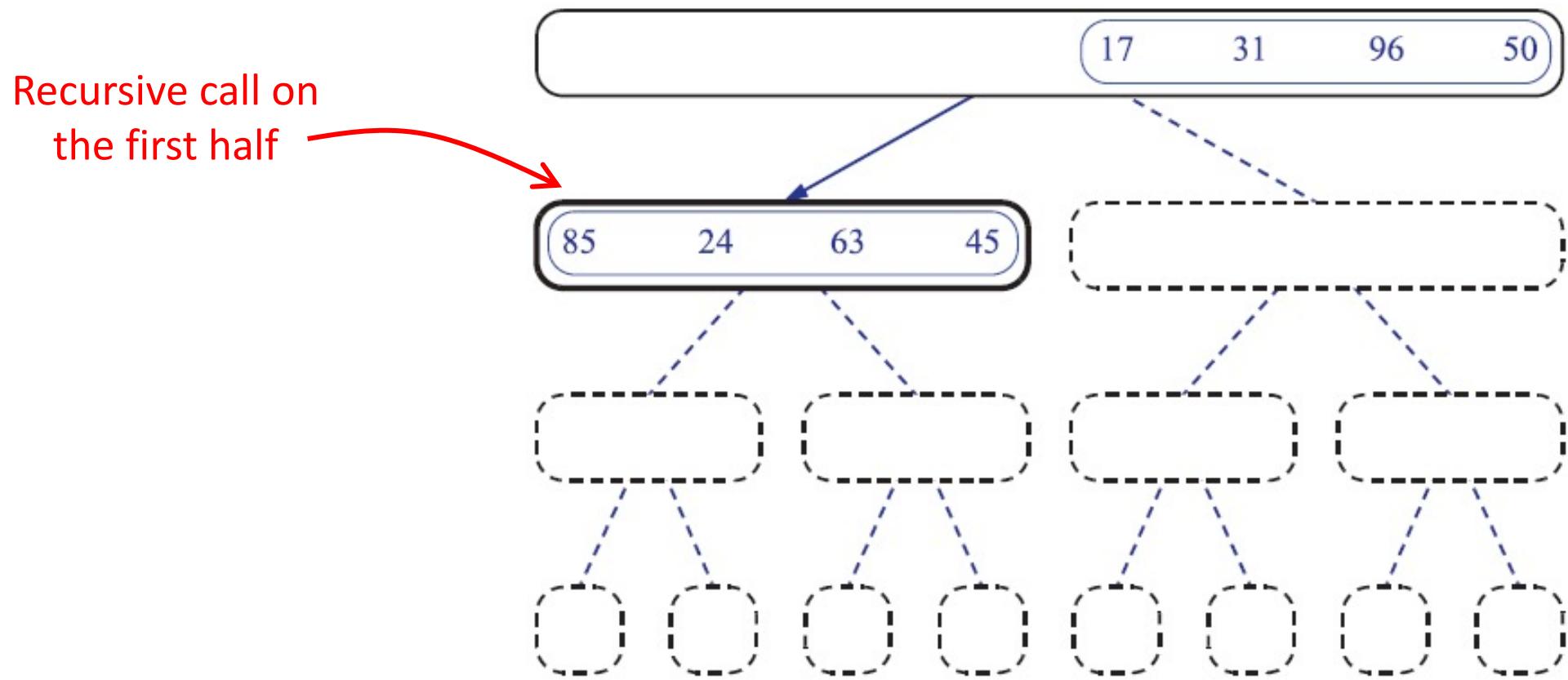
MERGE-SORT TREE

- Here is a **more detailed example** showing that the first half is sorted recursively before starting with the second half



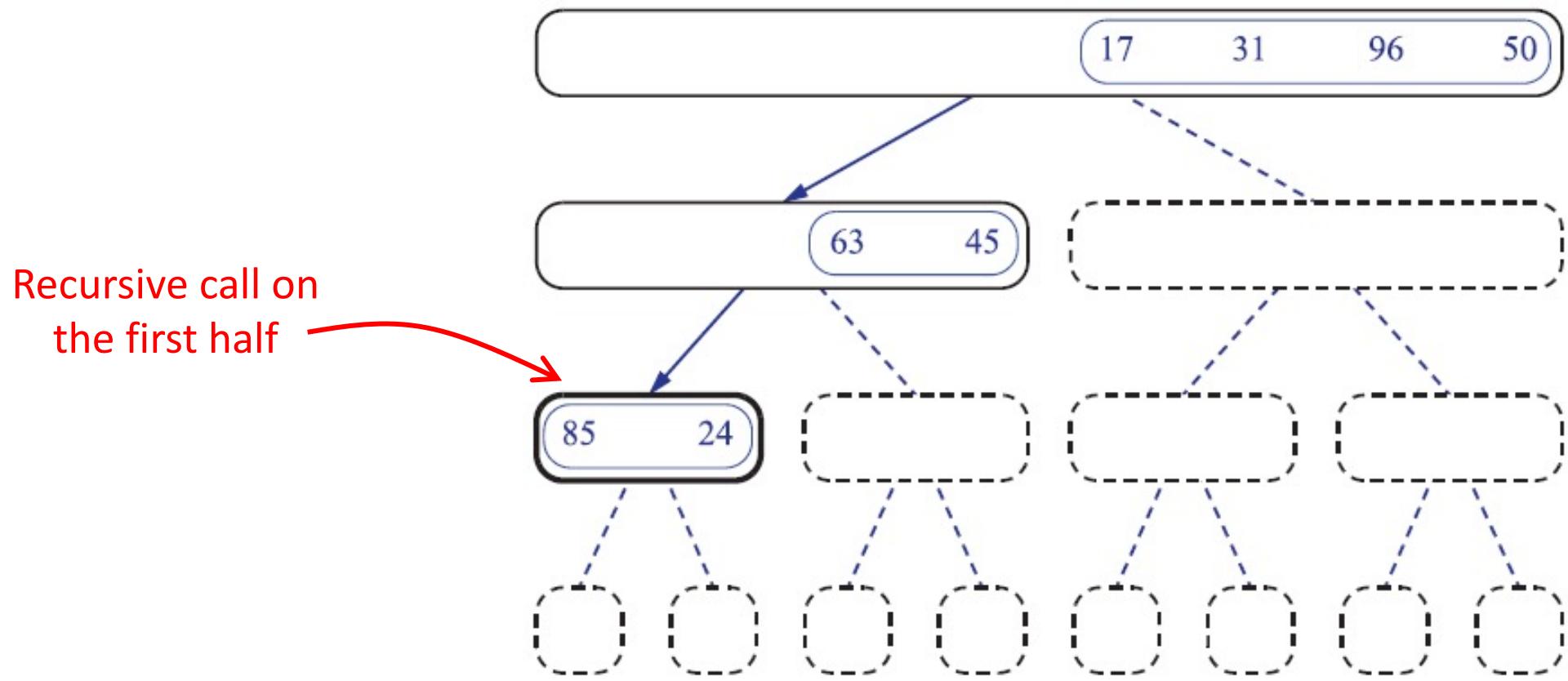
MERGE-SORT TREE

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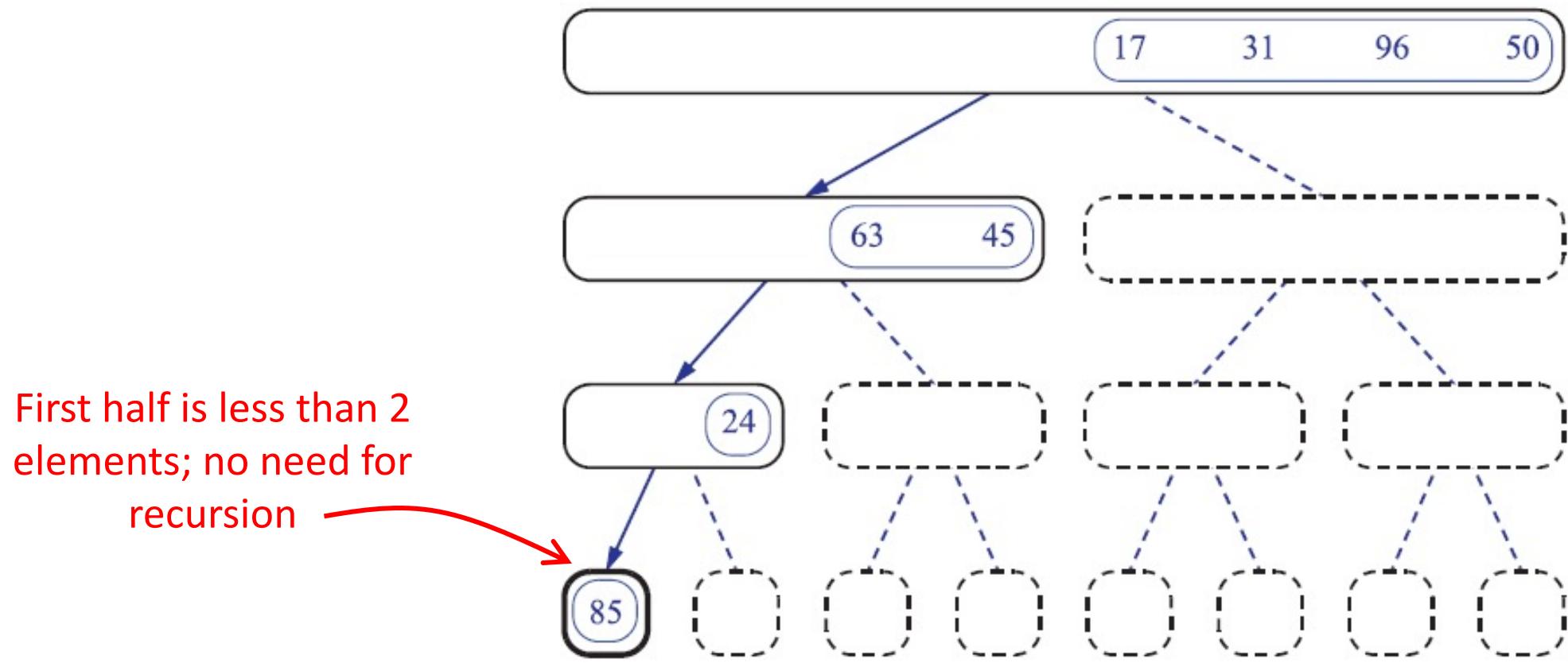
MERGE-SORT TREE

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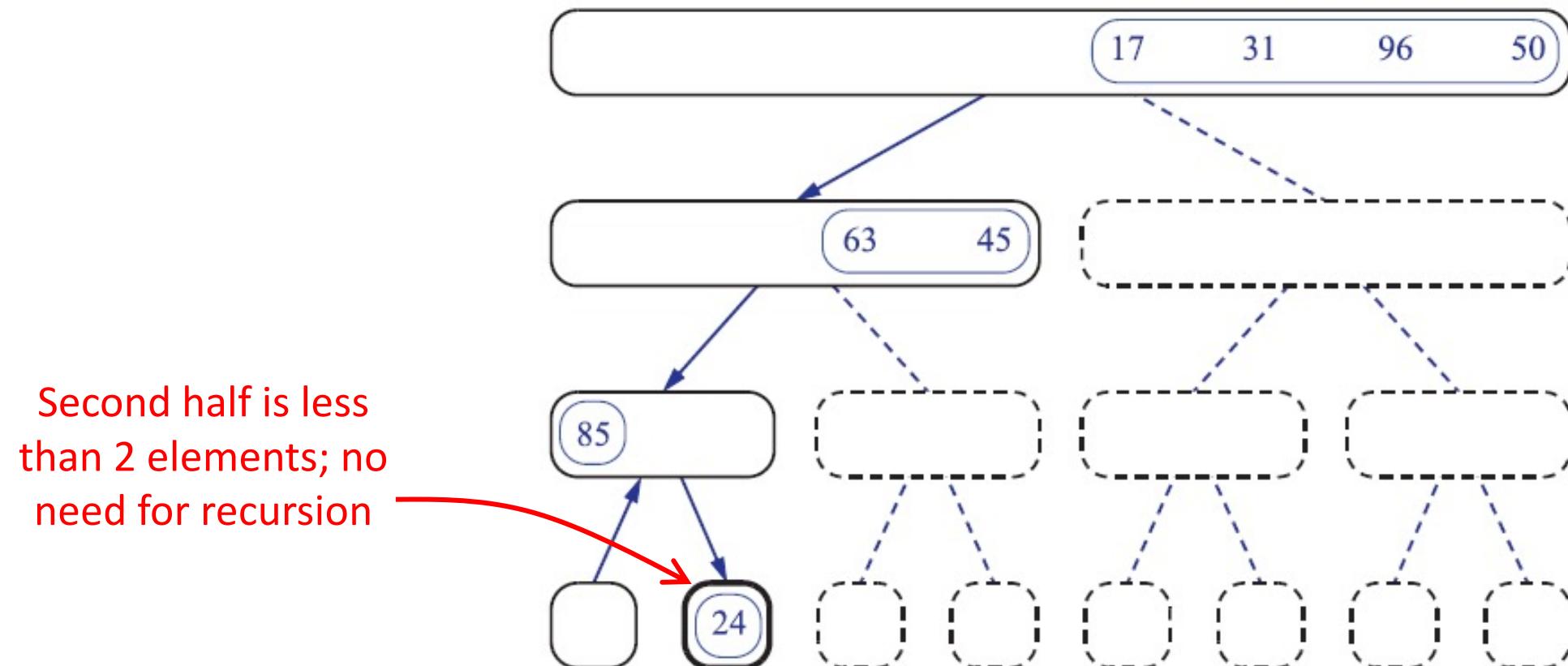
MERGE-SORT TREE

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MERGE-SORT TREE

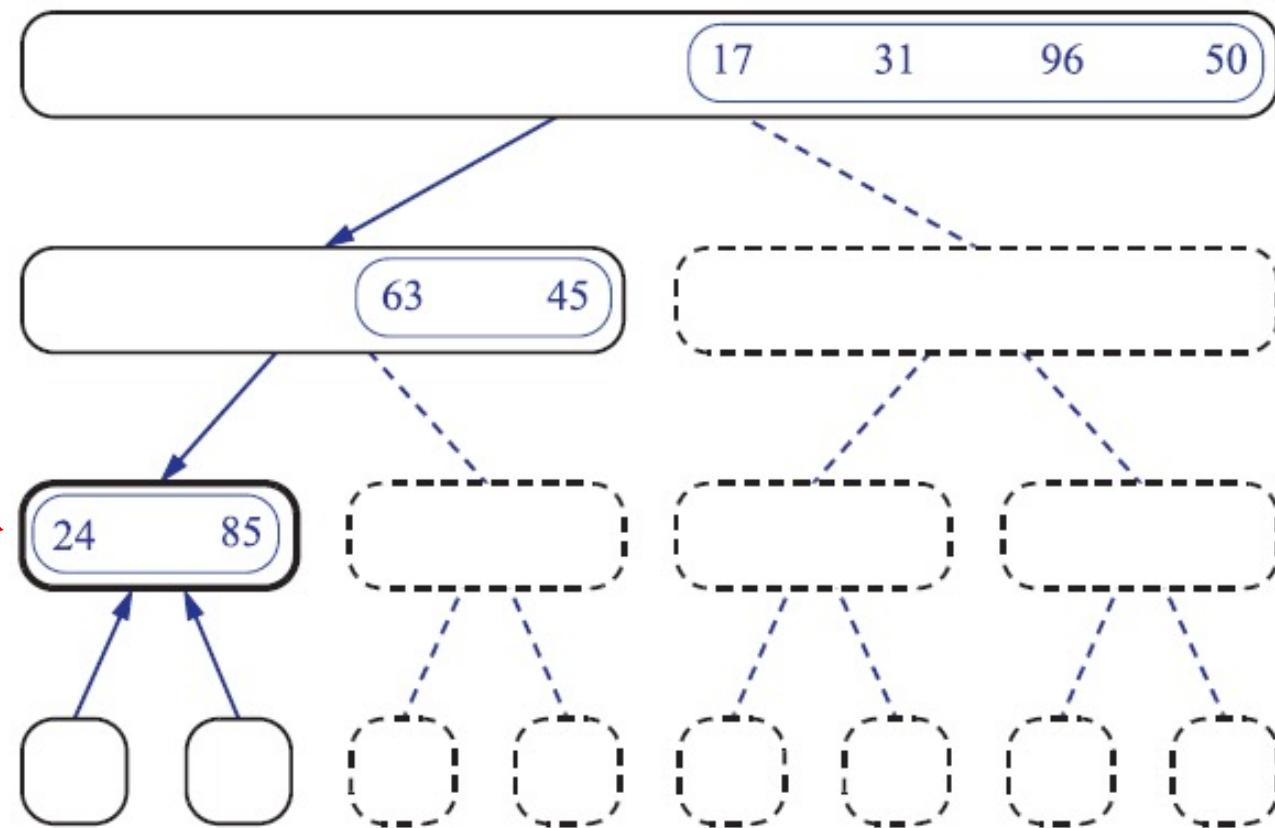
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE-SORT TREE

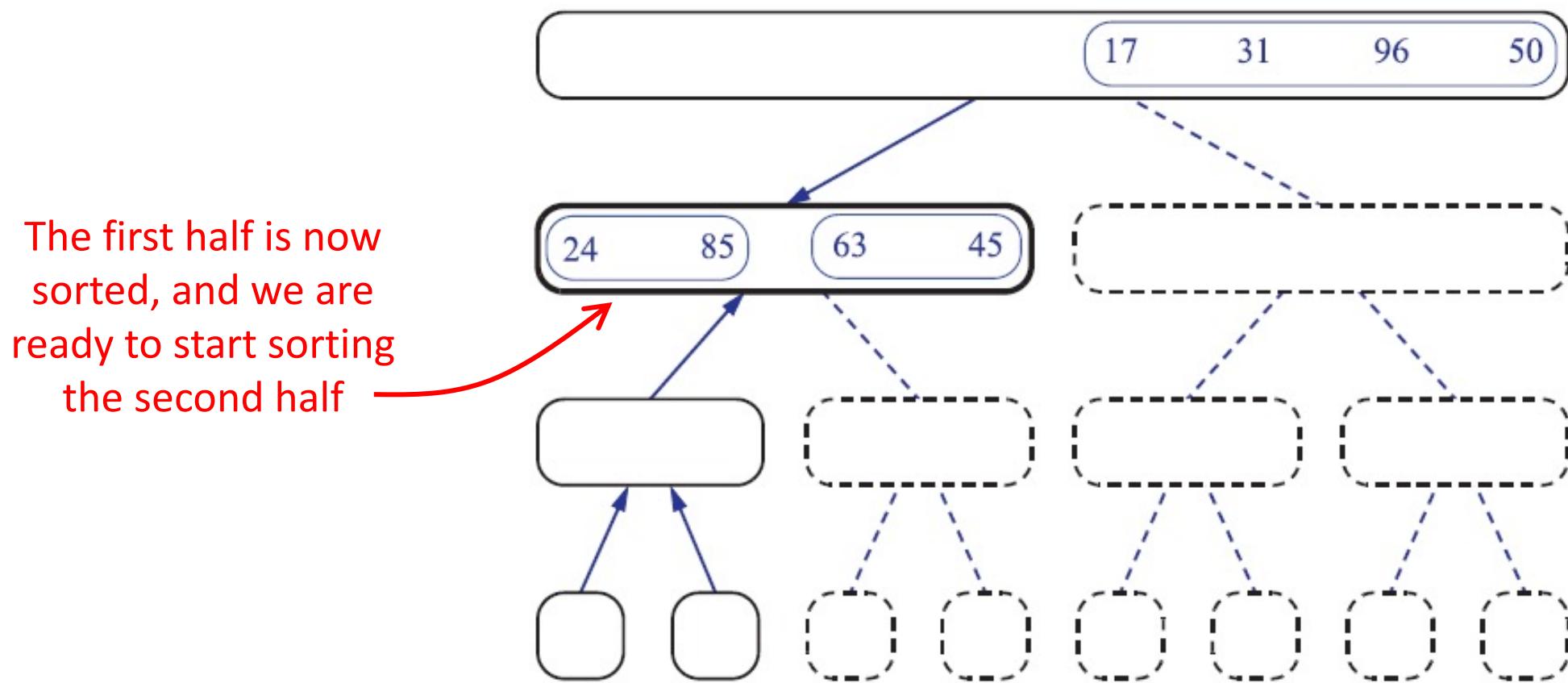
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half

Merging the two halves (85) and (24) involves sorting them, which is why we now have (24) before (85)



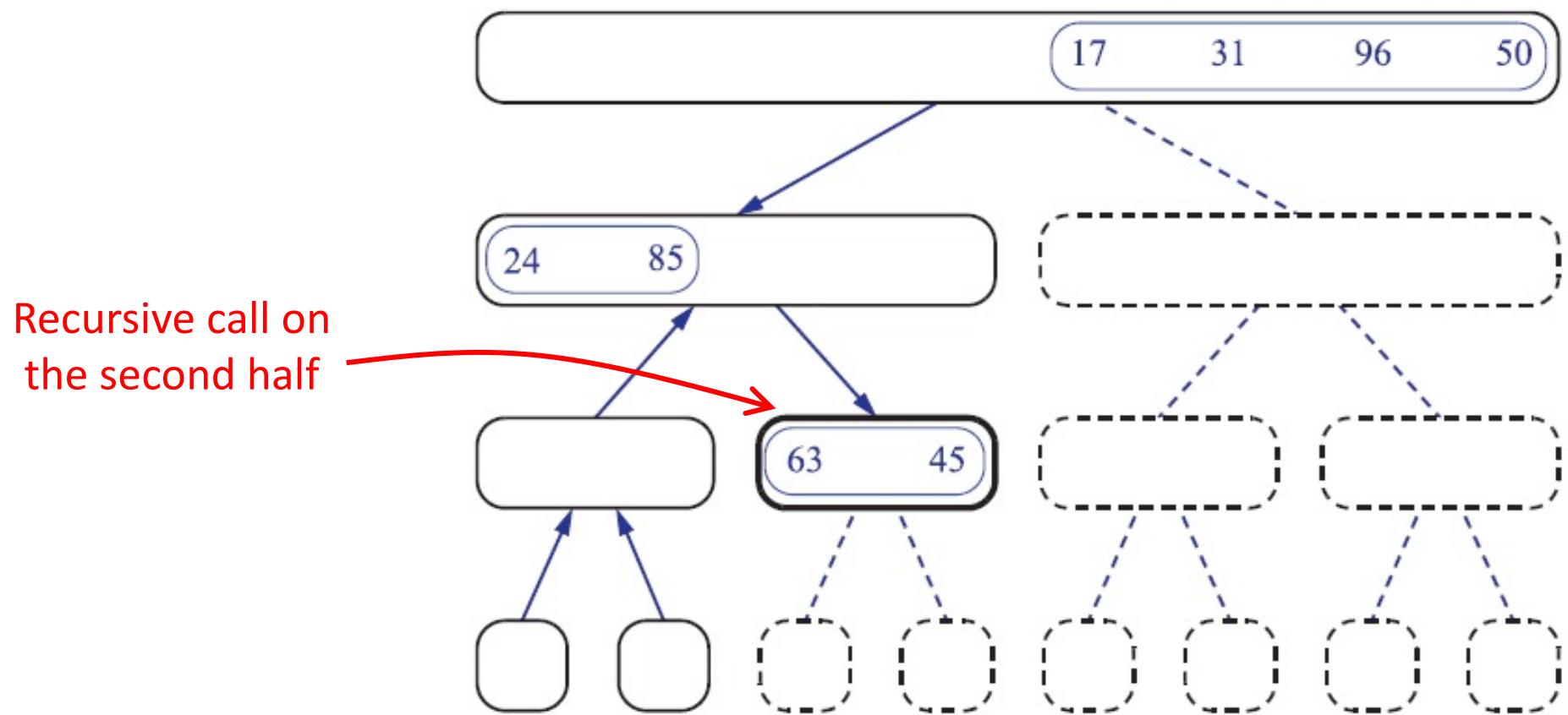
MERGE-SORT TREE

- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



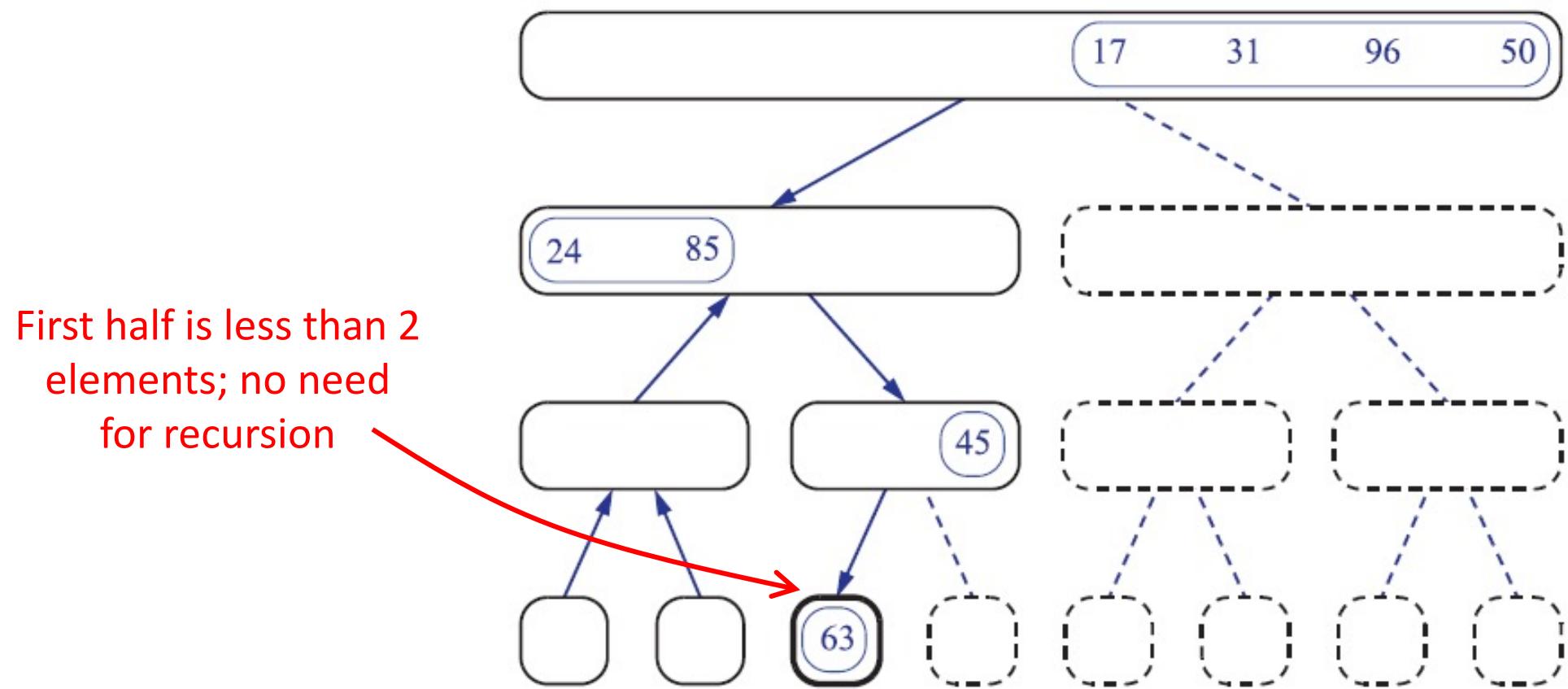
MERGE-SORT TREE

- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



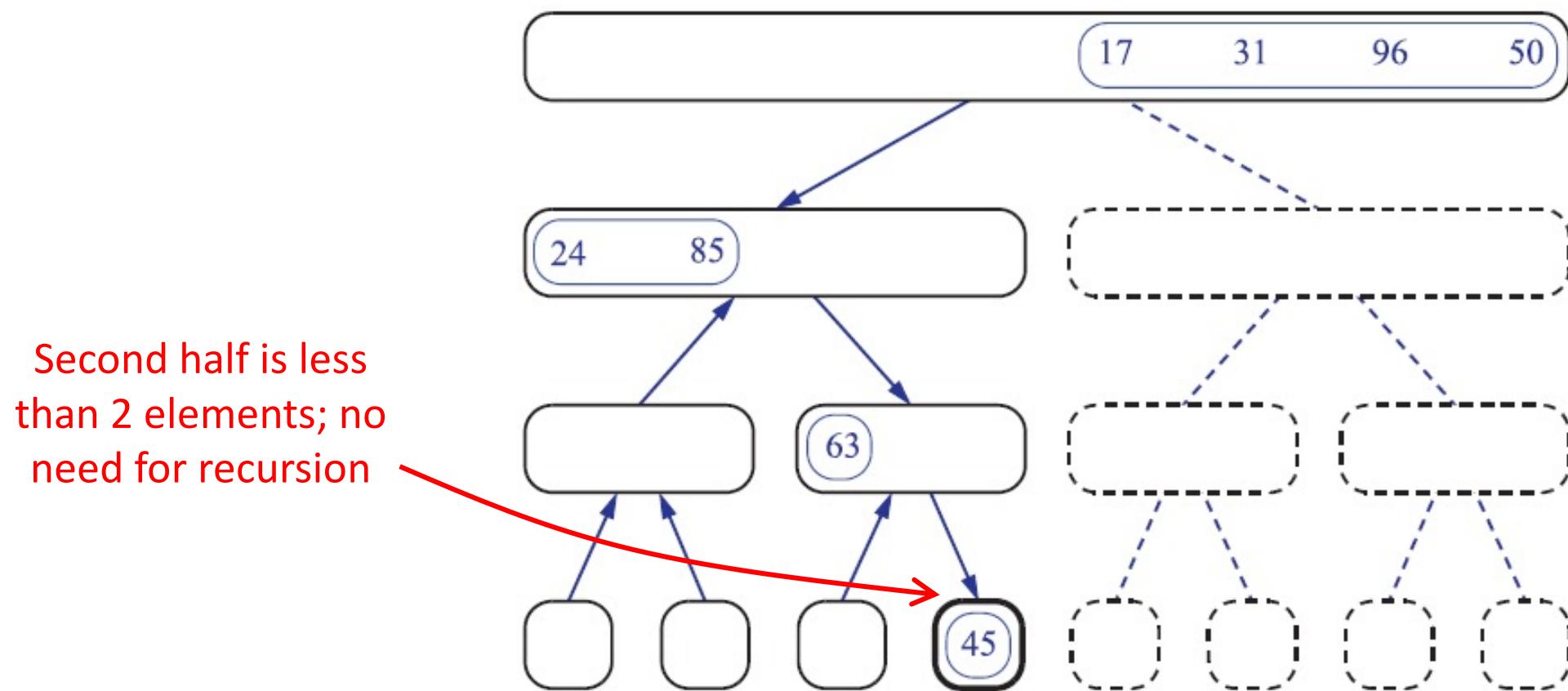
MERGE-SORT TREE

- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE-SORT TREE

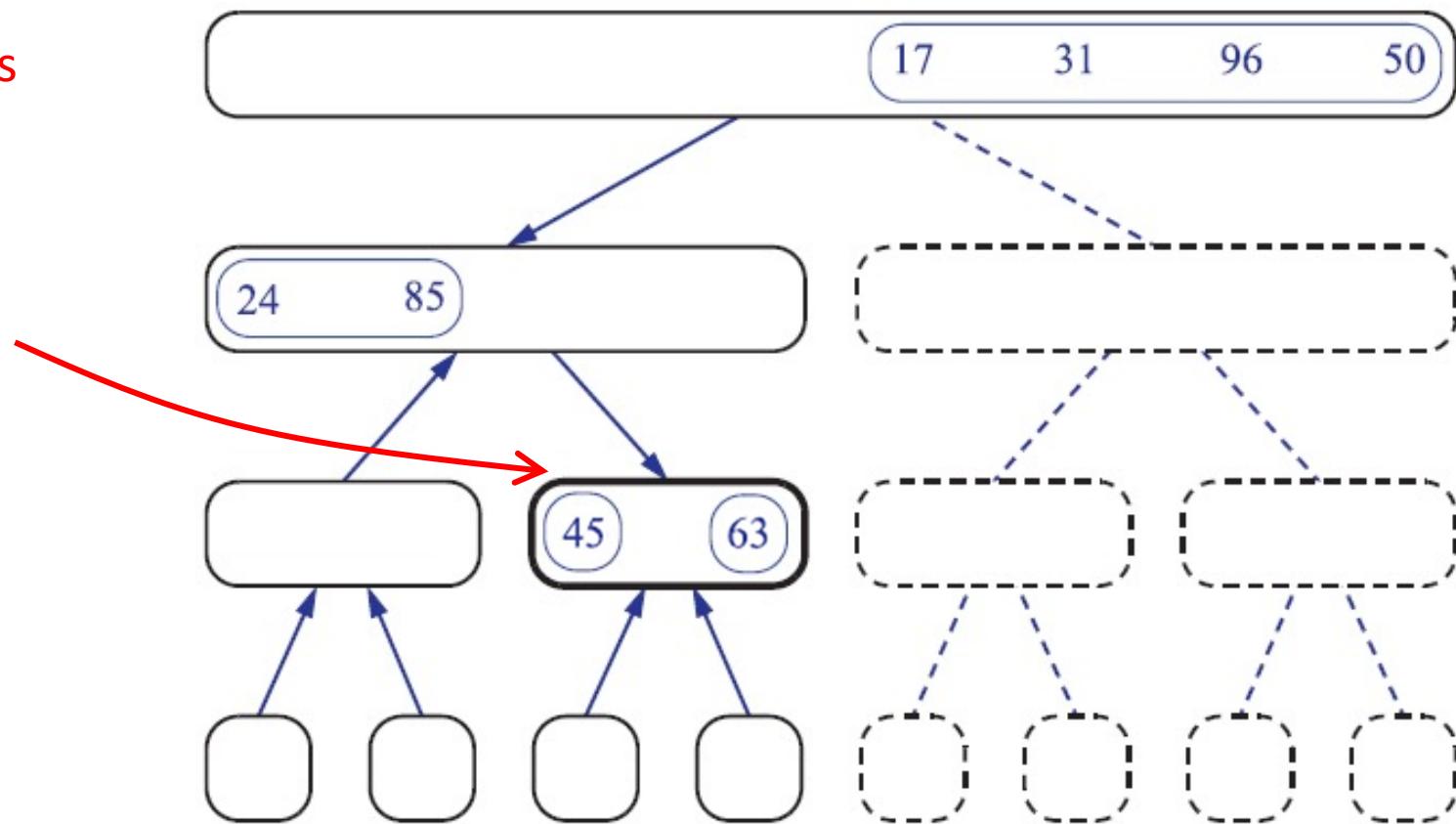
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE-SORT TREE

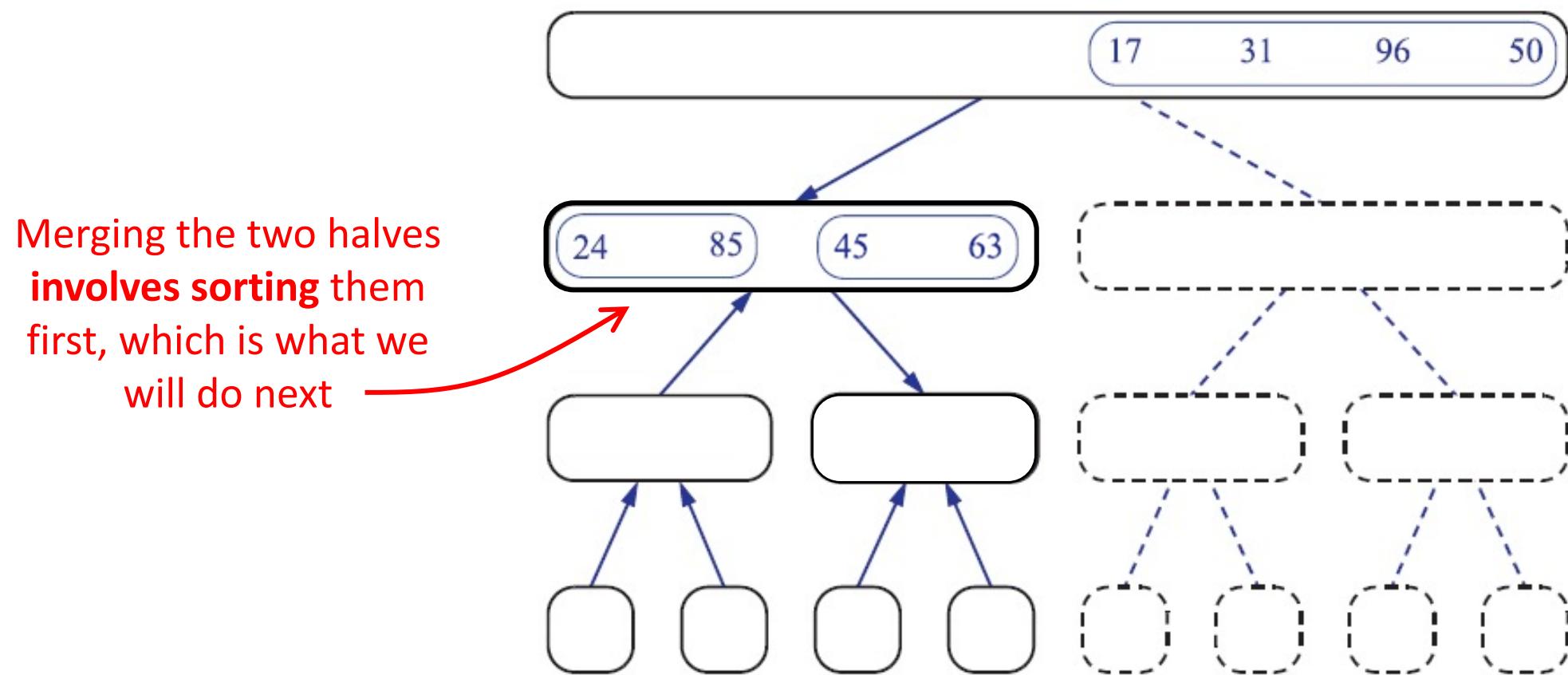
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half

Merging the two halves
(63) and (45) involves
sorting them first,
which is why we now
have (45) before (63)



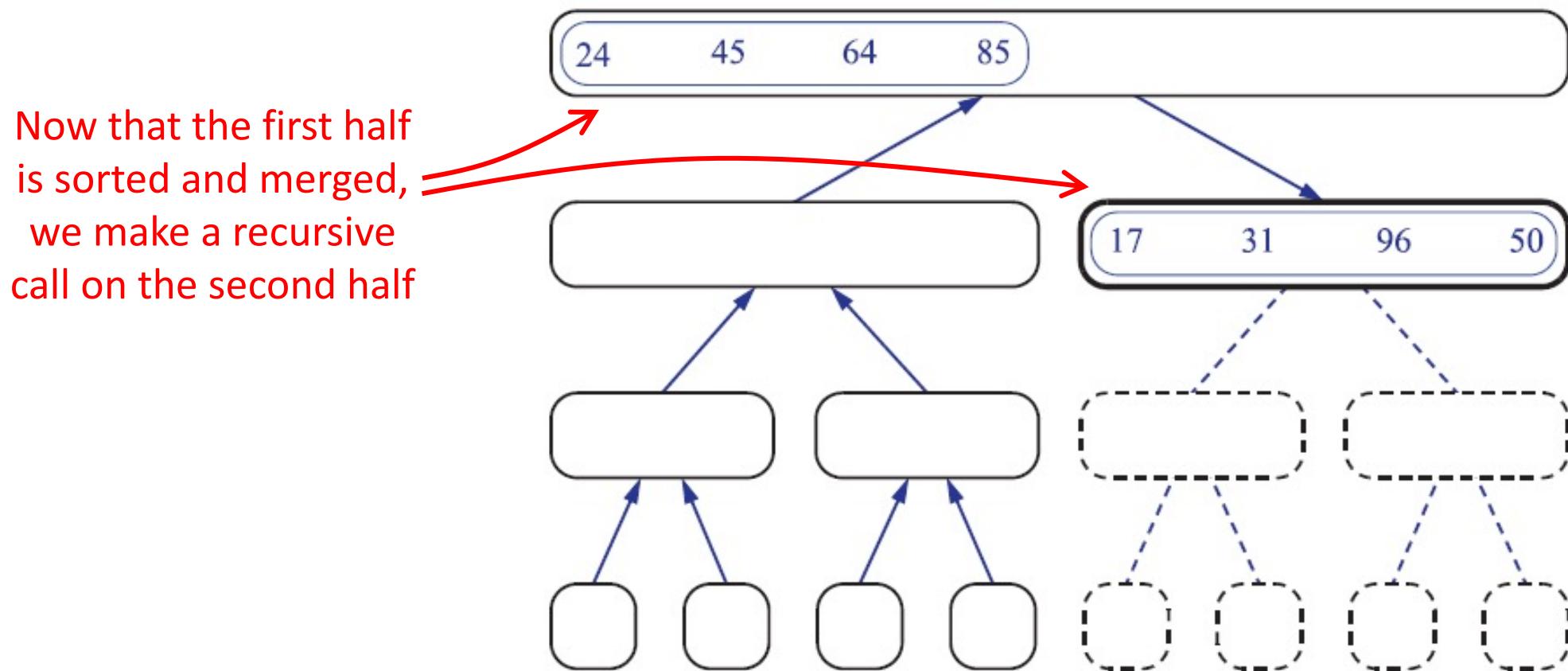
MERGE-SORT TREE

- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE-SORT TREE

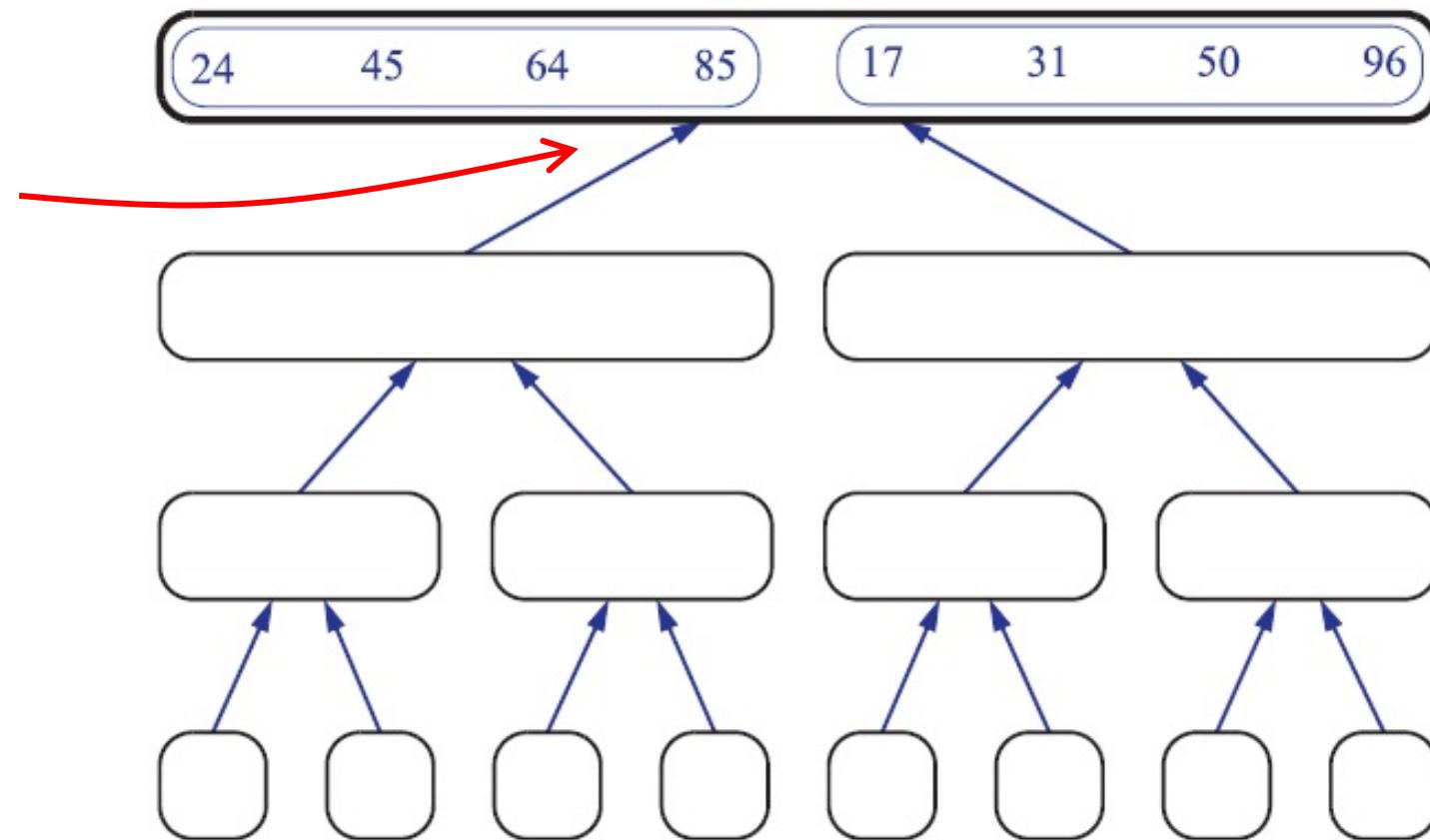
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE-SORT TREE

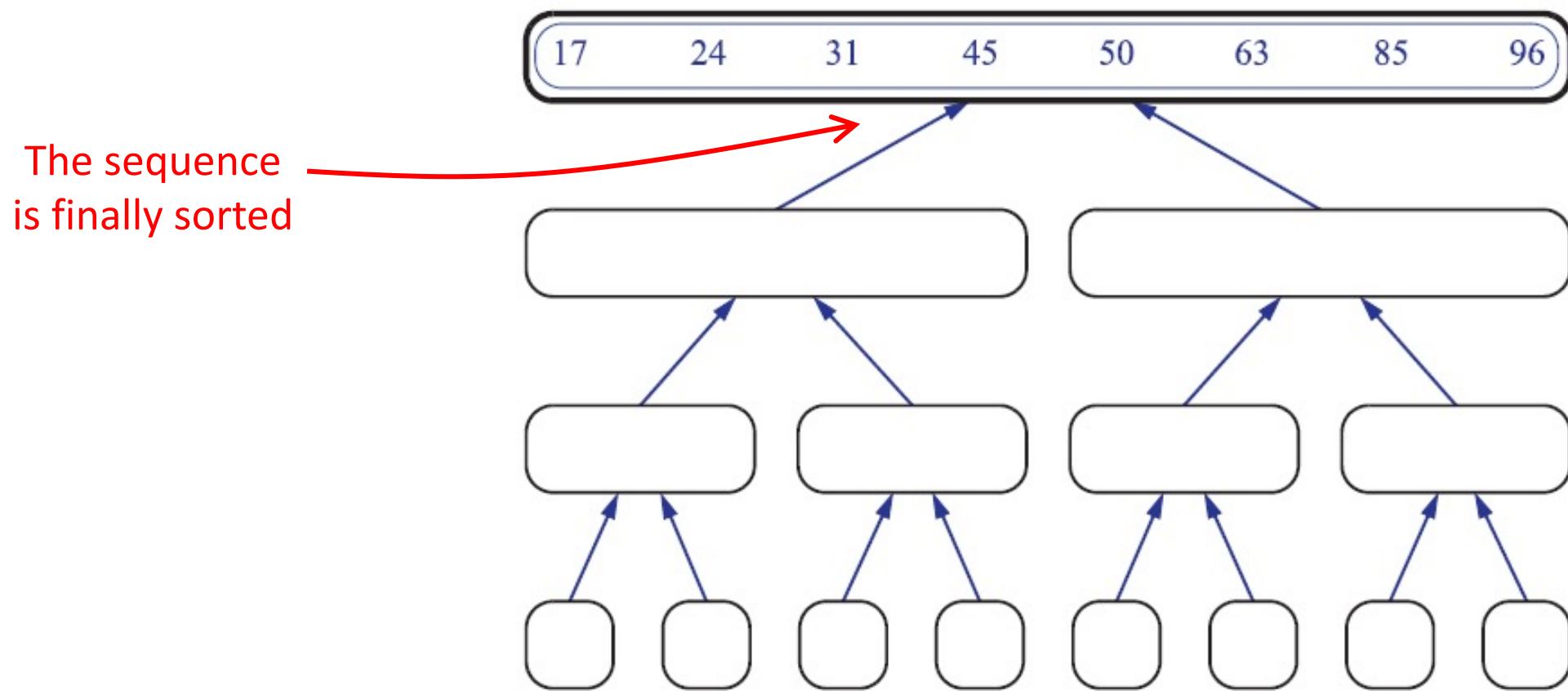
- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half

After many steps, both halves are sorted, and we need to merge them (which involves sorting)



MERGE-SORT TREE

- Here is a **more detailed** example showing that the first half is sorted recursively before starting with the second half



MERGE – ARRAY IMPLEMENTATION

Let's start by analyzing the “[merge](#)” step:

- Given two **sorted** sequences S_1 and S_2 , we need to merge them into a **sorted** sequence S
 - The analysis depends on whether the sequences are implemented as [arrays](#) or as [lists](#)
1. With array implementation:

S_1

0	1	2	3	4	5	6
2	5	8	11	12	15	16

S_2

0	1	2	3	4	5	6
3	9	10	13	20	22	25



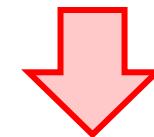
S

0	1	2	3	4	5	6	7	8	9	10	11	12	13
2	3	5	8	9	10	11	12	13	15	16	20	22	25

MERGE – ARRAY IMPLEMENTATION

Write the pseudo code of **merge** given an **array** implementation (see the illustration):

	0	1	2	3	4	5	6
S_1	2	5	8	11	12	14	15
					<i>i</i>		
S_2	3	9	10	18	19	22	25
					<i>j</i>		
S	0	1	2	3	4	5	6
	2	3	5	8	9		



$S.\text{insertBack}(S_2[j])$

	0	1	2	3	4	5	6
S_1	2	5	8	11	12	14	15
					<i>i</i>		
S_2	3	9	10	18	19	22	25
					<i>j</i>		
S	0	1	2	3	4	5	6
	2	3	5	8	9	10	

MERGE – ARRAY IMPLEMENTATION

Algorithm merge(S_1, S_2, S):

Input: Sorted sequences S_1 and S_2 and an empty sequence S , all of which are implemented as arrays

Output: Sorted sequence S containing the elements of S_1 and S_2

$i \leftarrow j \leftarrow 0$

while $i < S_1.\text{size}()$ and $j < S_2.\text{size}()$ **do**

if $S_1[i] \leq S_2[j]$ **then**

$S.\text{insertBack}(S_1[i])$ {copy i^{th} element of S_1 to end of S }

$i \leftarrow i+1$

else

$S.\text{insertBack}(S_2[j])$ {copy j^{th} element of S_2 to end of S }

$j \leftarrow j+1$

while $i < S_1.\text{size}()$ **do** {copy the remaining elements of S_1 to S }

$S.\text{insertBack}(S_1[i])$

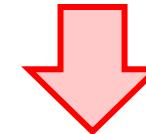
$i \leftarrow i+1$

while $j < S_2.\text{size}()$ **do** {copy the remaining elements of S_2 to S }

$S.\text{insertBack}(S_2[j])$

$j \leftarrow j+1$

	0	1	2	3	4	5	6
S_1	2	5	8	11	12	14	15
				i			
	0	1	2	3	4	5	6
S_2	3	9	10	18	19	22	25
				j			
S	2	3	5	8	9		
	0	1	2	3	4	5	6
	7	8	9	10	11	12	

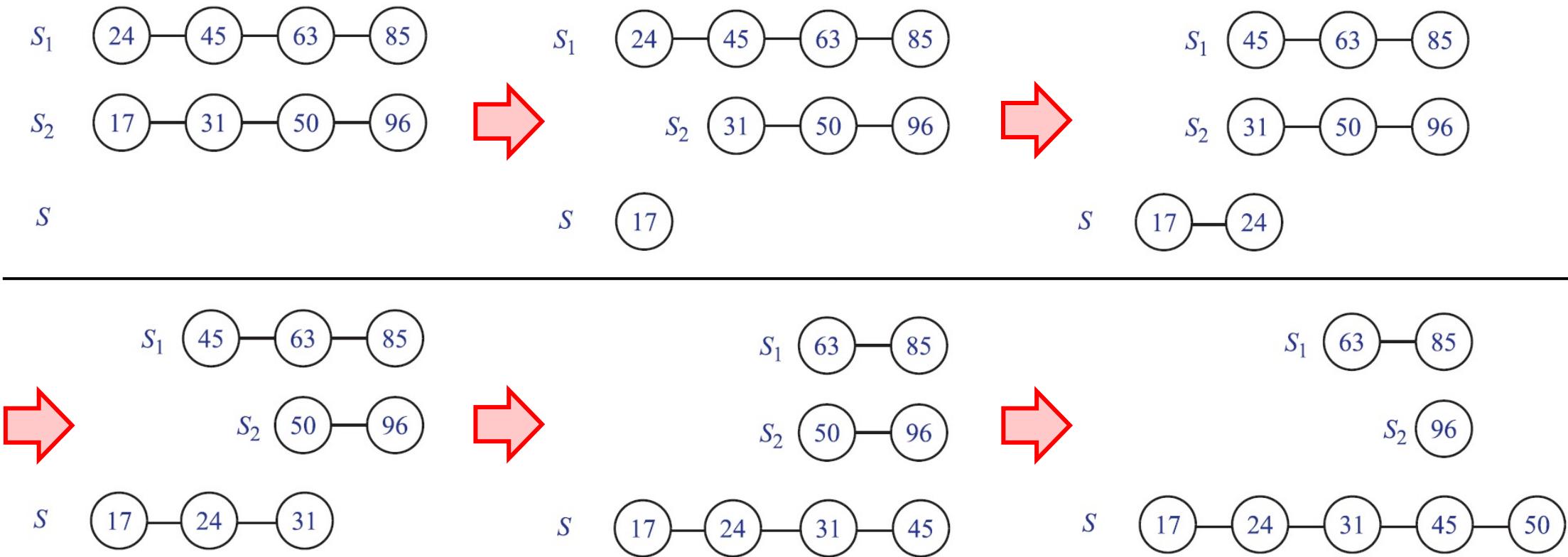


$S.\text{insertBack}(S_2[j])$

	0	1	2	3	4	5	6
S_1	2	5	8	11	12	14	15
				i			
	0	1	2	3	4	5	6
S_2	3	9	10	18	19	22	25
				j			
S	2	3	5	8	9	10	
	0	1	2	3	4	5	6
	7	8	9	10	11	12	

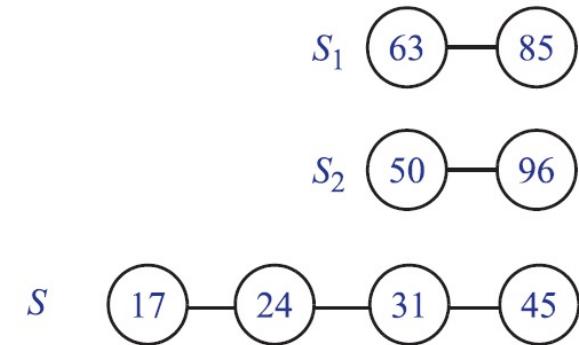
MERGE – LIST IMPLEMENTATION

2. With **lists**, we remove the element at the **front** of S_1 or S_2 and add it to the **end** of S
 - Repeat until S_1 or S_2 is empty, at which point copy the remainder of the other list to S

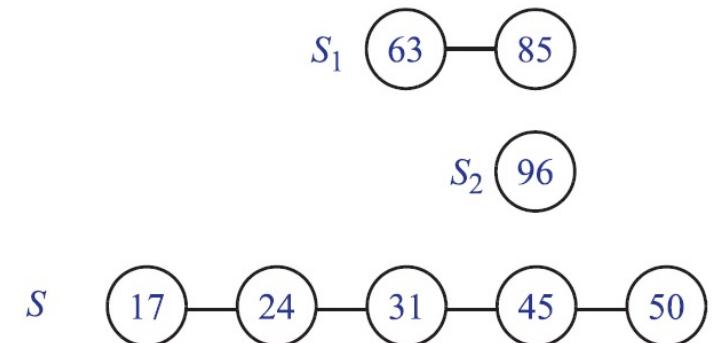
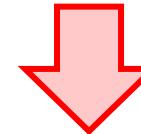


MERGE – LIST IMPLEMENTATION

Write the pseudo code of **merge** given a **list** implementation (see the illustration):



S.insertBack(S₂.eraseFront())



MERGE – LIST IMPLEMENTATION

Algorithm merge(S_1, S_2, S):

Input: Sorted sequences S_1 and S_2 and an empty sequence S , implemented as linked lists

Output: Sorted sequence S containing the elements from S_1 and S_2

while S_1 is not empty **and** S_2 is not empty **do**

if $S_1.\text{front}().\text{element}() \leq S_2.\text{front}().\text{element}()$ **then**

 {move the first element of S_1 at the end of S }

$S.\text{insertBack}(S_1.\text{eraseFront}())$

else

 {move the first element of S_2 at the end of S }

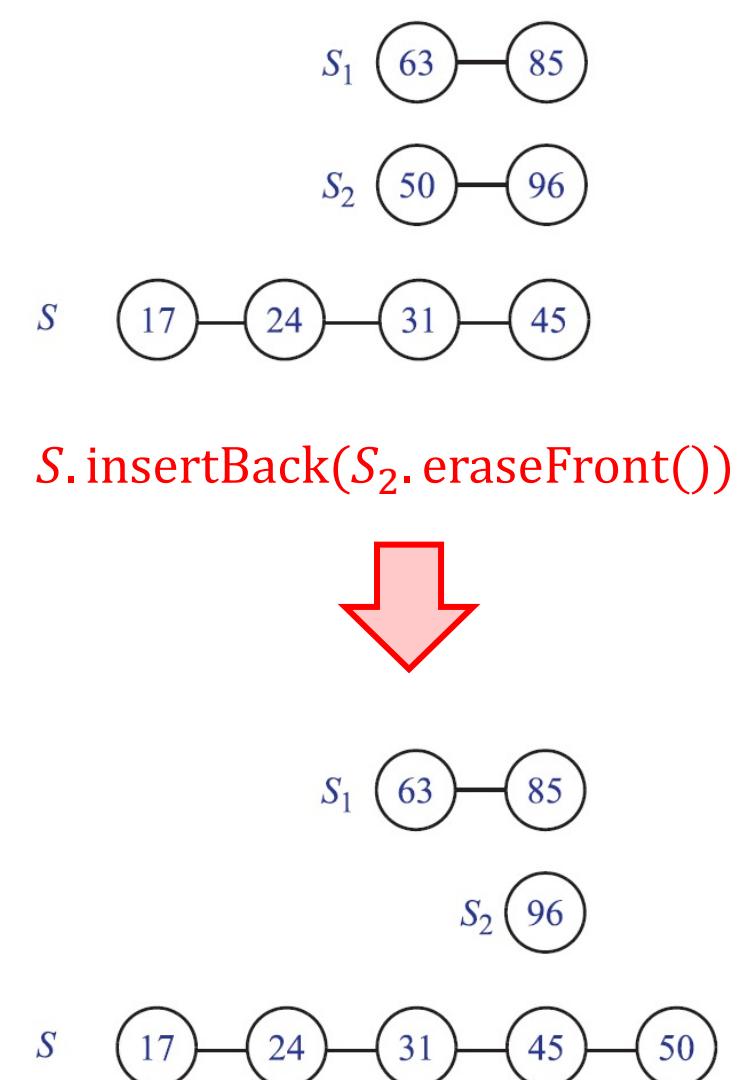
$S.\text{insertBack}(S_2.\text{eraseFront}())$

while S_1 is not empty **do** {move the remaining elements of S_1 to S }

$S.\text{insertBack}(S_1.\text{eraseFront}())$

while S_2 is not empty **do** {move the remaining elements of S_2 to S }

$S.\text{insertBack}(S_2.\text{eraseFront}())$



COMPLEXITY OF MERGE-SORT

- Here we analyze the complexity of the “merge” step, which merges S_1 and S_2 :
 - merge has **three while loops**, the operations inside each loop take $O(1)$ time.
 - But **how do we count the total number of iterations over all three loops?**

```
i ← j ← 0
while i < S1.size() and j < S2.size() do
    if S1[i] ≤ S2[j] then
        S.insertBack(S1[i])
        i ← i+1
    else
        S.insertBack(S2[j])
        j ← j+1
    while i < S1.size() do
        S.insertBack(S1[i])
        i ← i+1
    while j < S2.size() do
        S.insertBack(S2[j])
        j ← j+1
```

Array-based
implementation

```
while S1 is not empty and S2 is not empty do
    if S1.front().element() ≤ S2.front().element() then
        S.insertBack(S1.eraseFront())
    else
        S.insertBack(S2.eraseFront())
while S1 is not empty do
    S.insertBack(S1.eraseFront())
while S2 is not empty do
    S.insertBack(S2.eraseFront())
```

List-based
implementation

COMPLEXITY OF MERGE-SORT

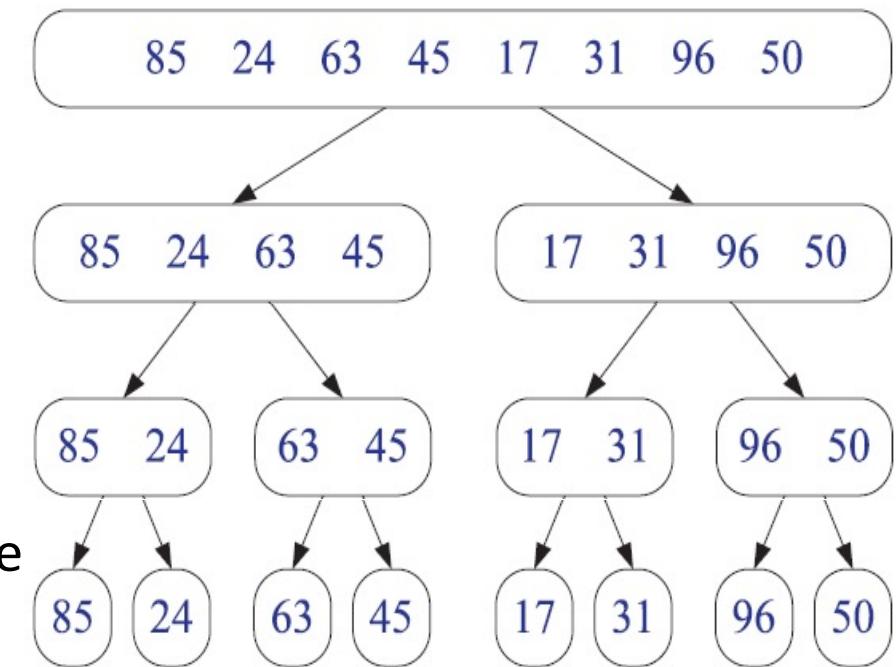
- Let us first analyze the complexity of the “**merge**” step, which merges S_1 and S_2 :
 - **merge** has **three while loops**, the operations inside each loop take $O(1)$ time.
 - But **how do we count the total number of iterations over all three loops?**
 - Let n_1 and n_2 be the number of elements of S_1 and S_2
 - **Key observation:**

During each iteration of one of the loops, one element is copied or moved from either S_1 or S_2 into S (**and that element is no longer considered**).
 - This implies that the total number of iterations over all three loops is $n_1 + n_2$
 - Thus, the running time of **merge** is $O(n_1 + n_2)$, i.e., **proportional to the number of elements being merged!**
- Next, we analyze the complexity of the entire **merge-sort** algorithm

COMPLEXITY OF MERGE-SORT

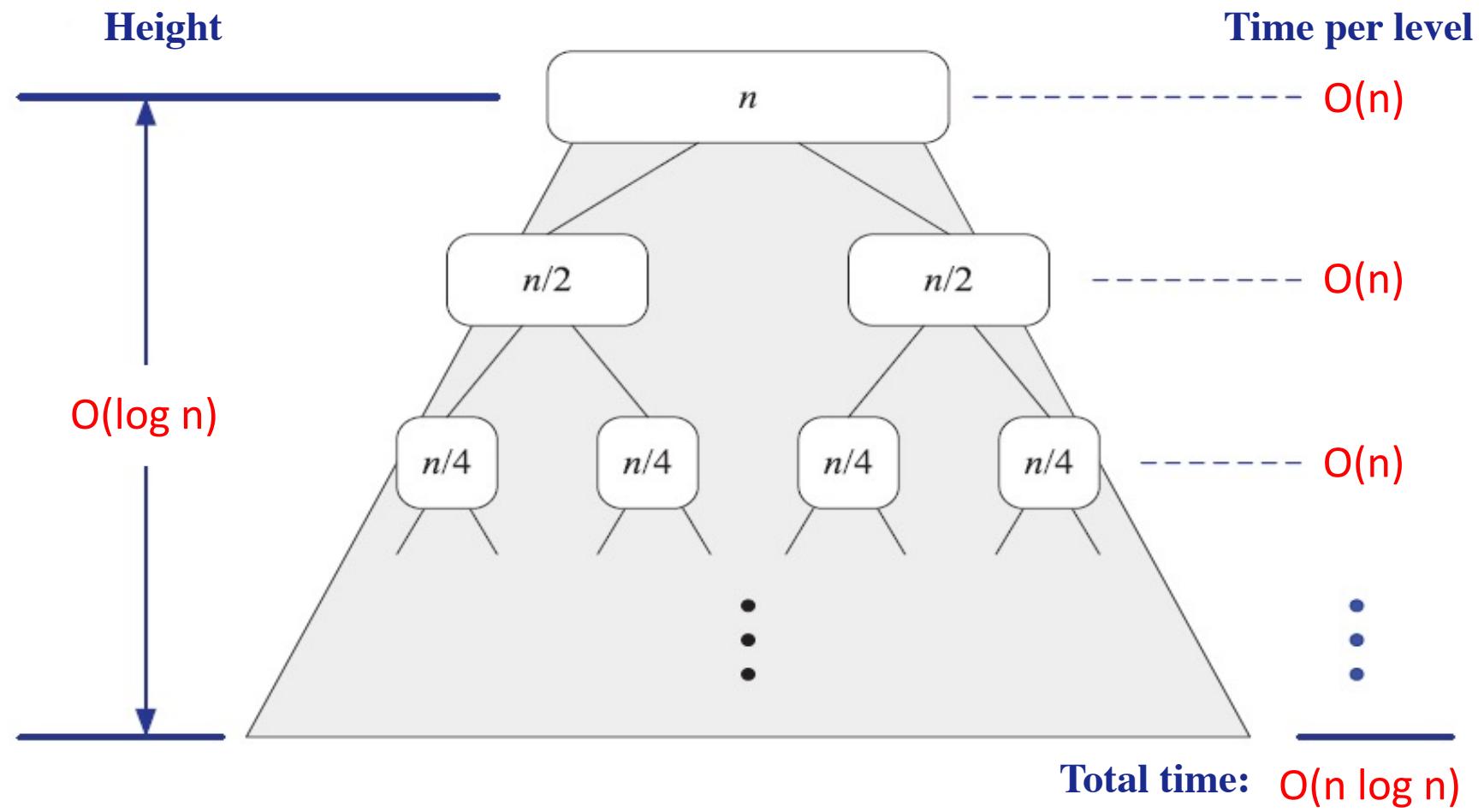
- To simplify the analysis, let's assume that n is a power of 2 (the result of our analysis also holds when n is not a power of 2)
- For each node v in the merge-sort tree, let “**the time spent at v** ” be the running time of the recursive call associated with v **excluding the time spent waiting for v 's children**
- Let i be v 's depth. Then, v contains $n/2^i$ elements
- The time spent at node v is $O(n/2^i)$ time for **dividing and merging** the elements
- Time spent on **all nodes** at depth i is $O(n)$ since:
 - There are 2^i nodes at depth i
 - Each node requires $O(n/2^i)$ time

➤ Thus, each level i takes $O(2^i \times n/2^i) = O(n)$ time
- Overall time** for all $O(\log n)$ levels is $O(n \log n)$



COMPLEXITY OF MERGE-SORT

- Here is an illustration summarizing the complexity of merge-sort:

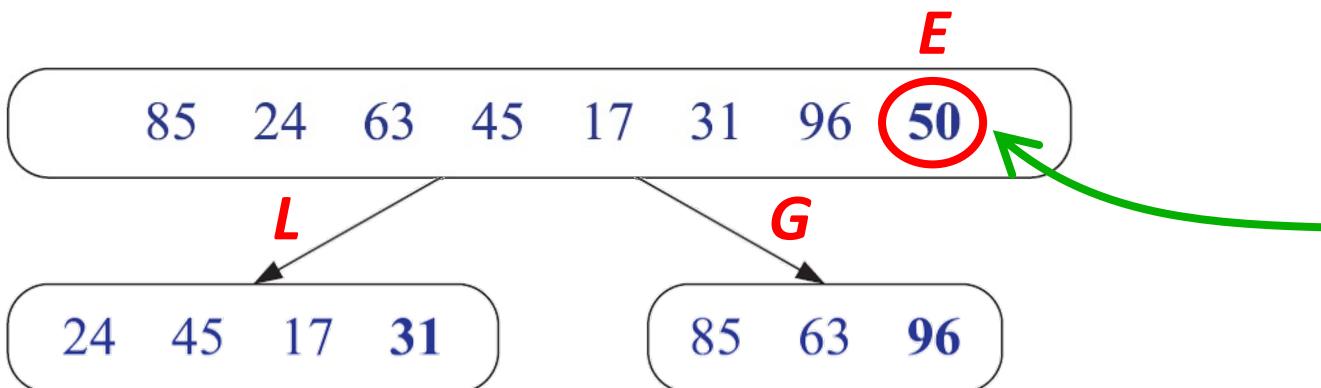


100

QUICK-SORT

QUICK-SORT

- Quick-sort is a divide-and-conquer algorithm that sort sequence S of n elements:
 1. Divide: If S contains at least two element, select an element p to be the **pivot** and divide S into three sets: L (less than p); E (equal to p); G (greater than p)

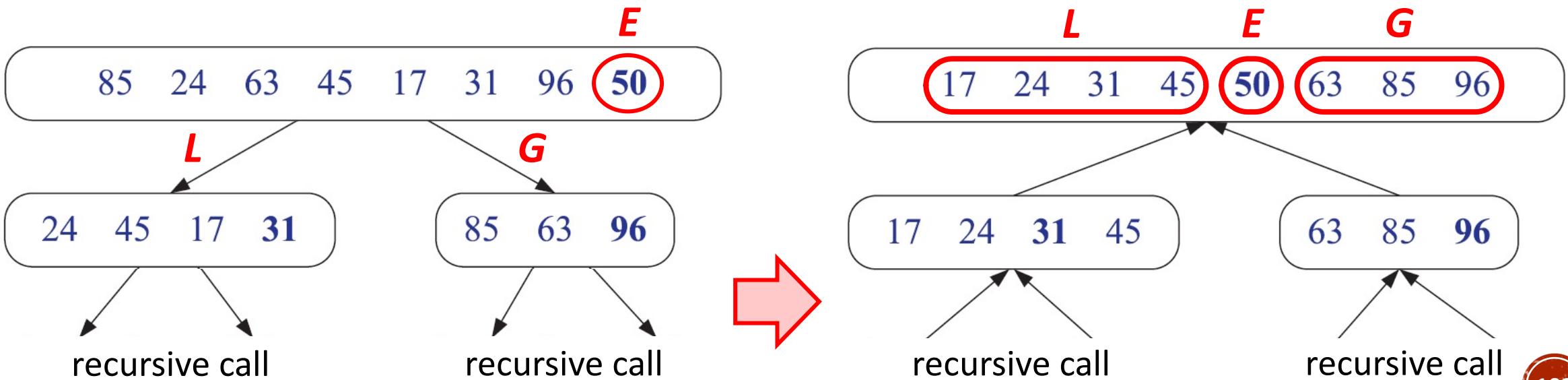


as common practice, choose p to be the last element in S (in this example, $p = 50$)

The pivot can be selected randomly as well

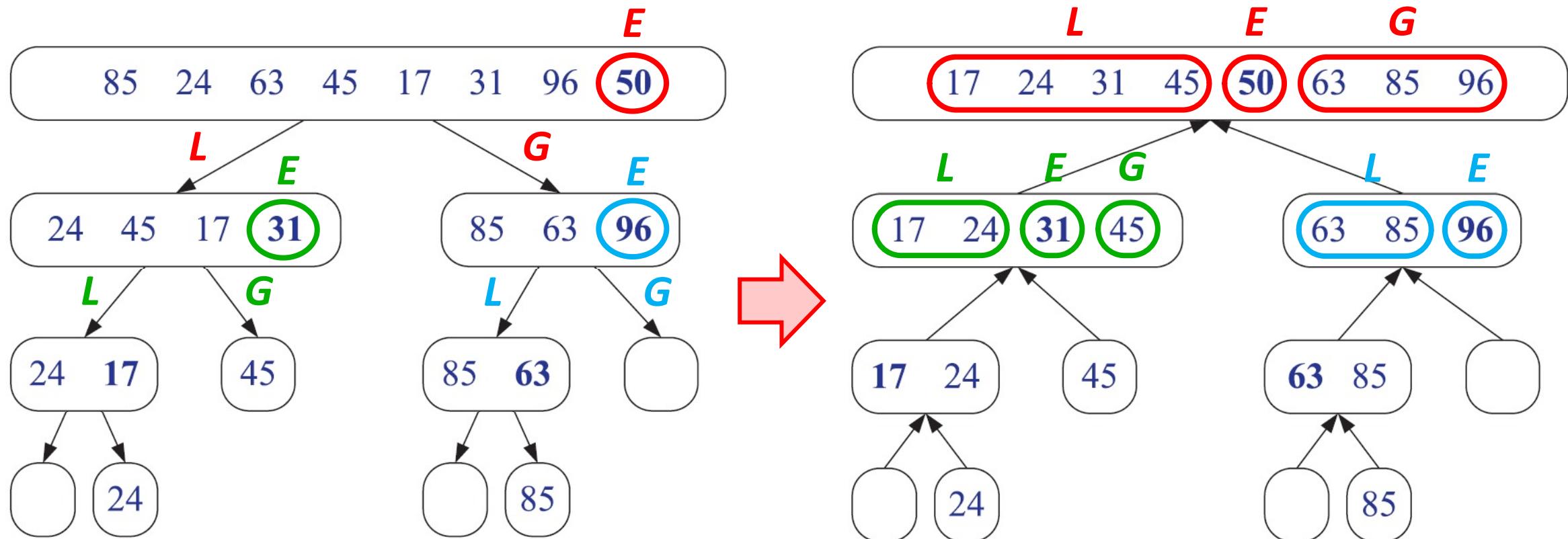
QUICK-SORT

- Quick-sort is a divide-and-conquer algorithm that sort sequence S of n elements:
 - Divide: If S contains at least two element, select an element p to be the **pivot** and divide S into three sets: L (less than p); E (equal to p); G (greater than p)
 - Recur: Recursively sort L and G
 - Conquer: Put the elements back into S , by putting L then E then G .



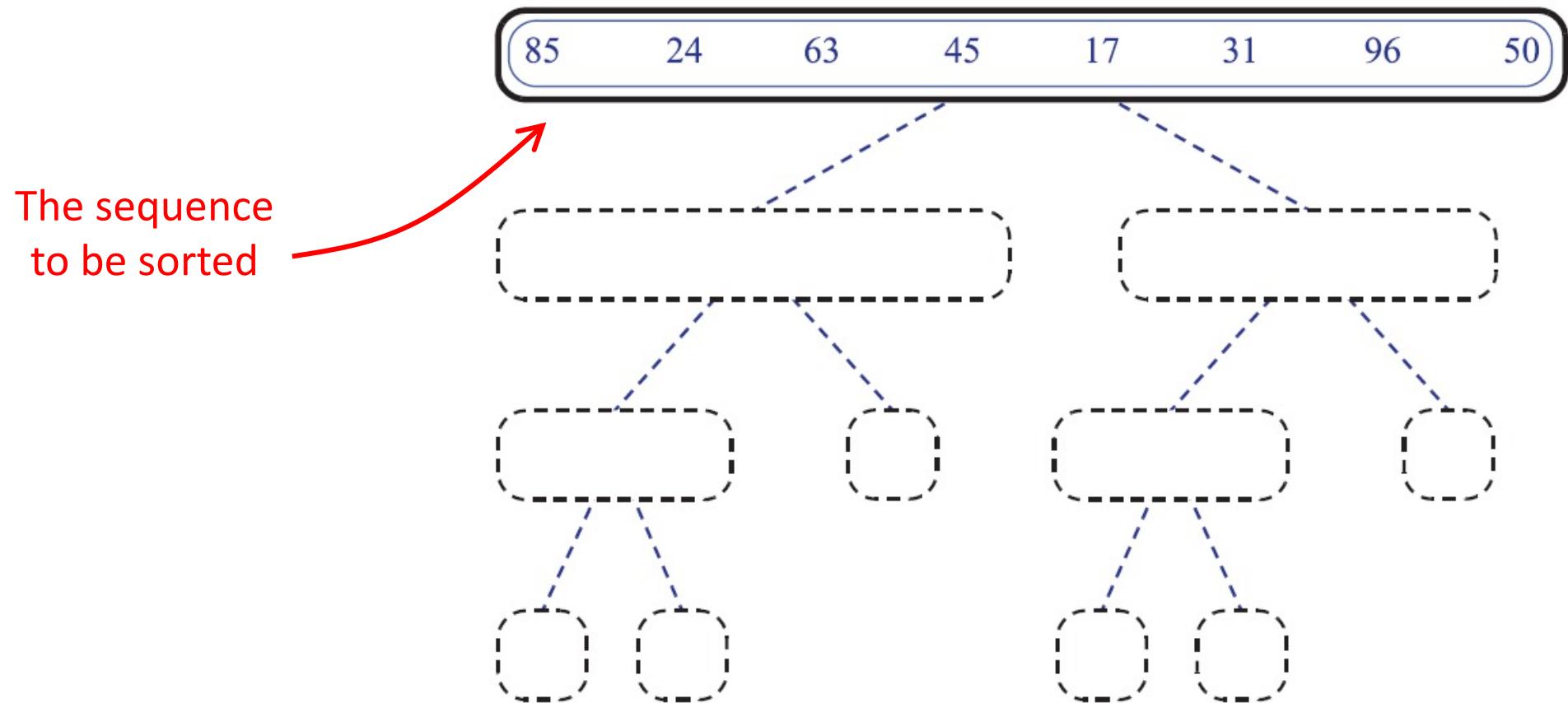
QUICK-SORT TREE

- Here is an example of a quick-sort tree



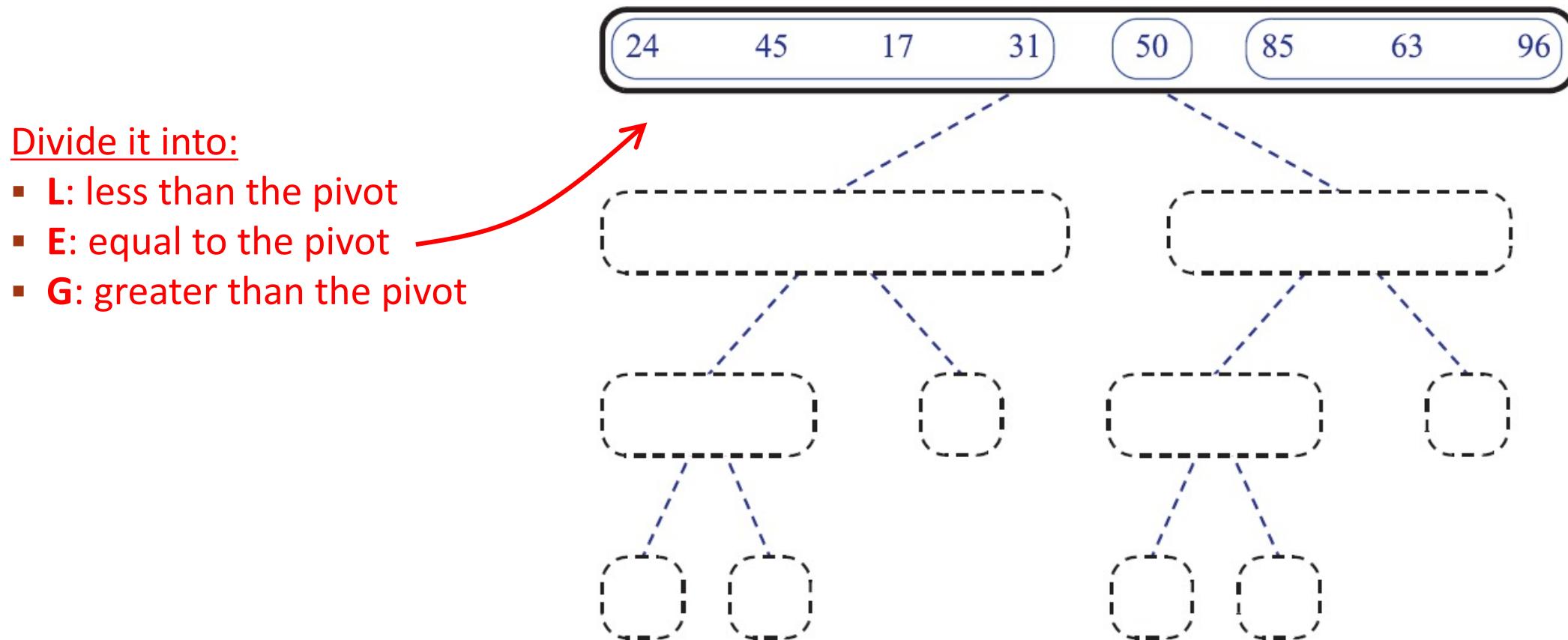
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, **L**, is sorted recursively before starting with the second half, **G**



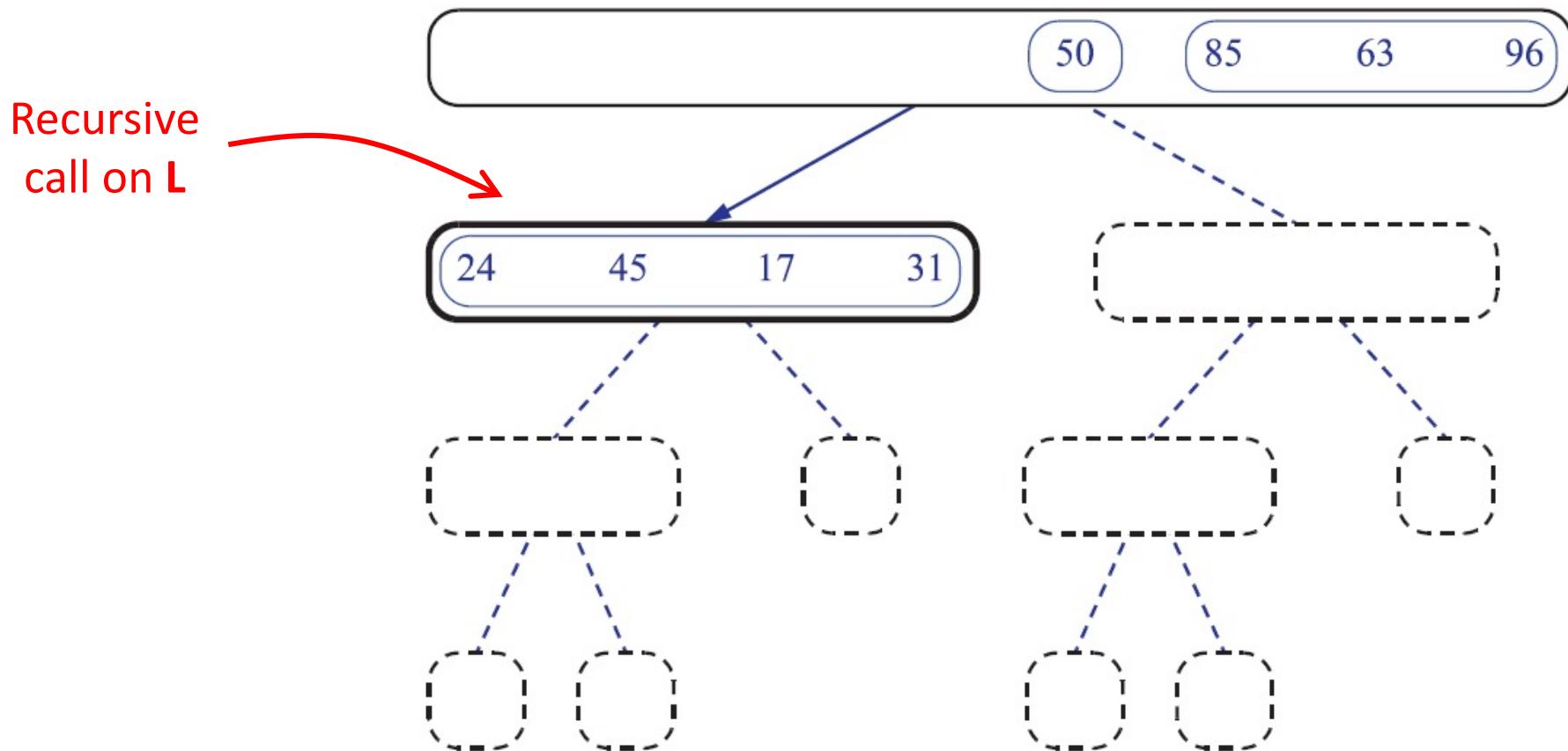
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, **L**, is sorted recursively before starting with the second half, **G**



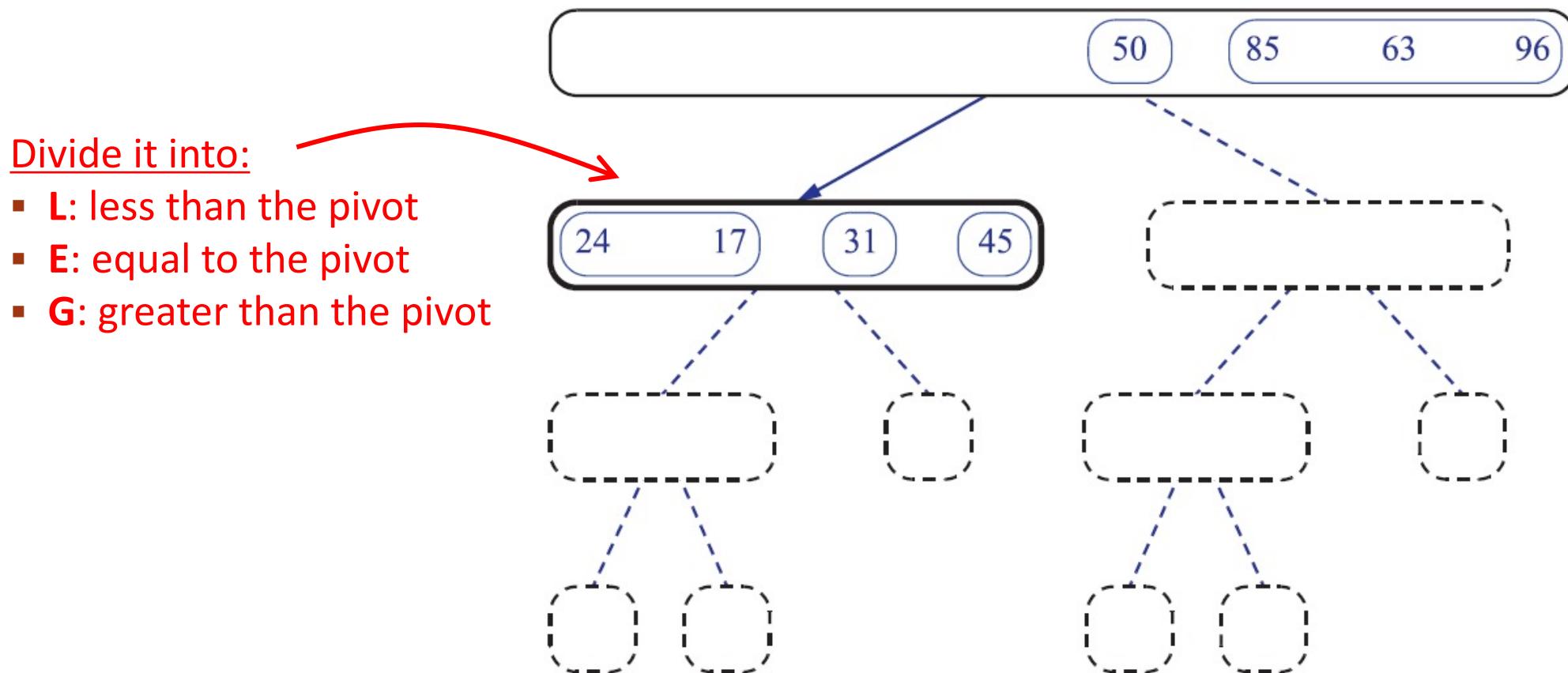
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, **L**, is sorted recursively before starting with the second half, **G**



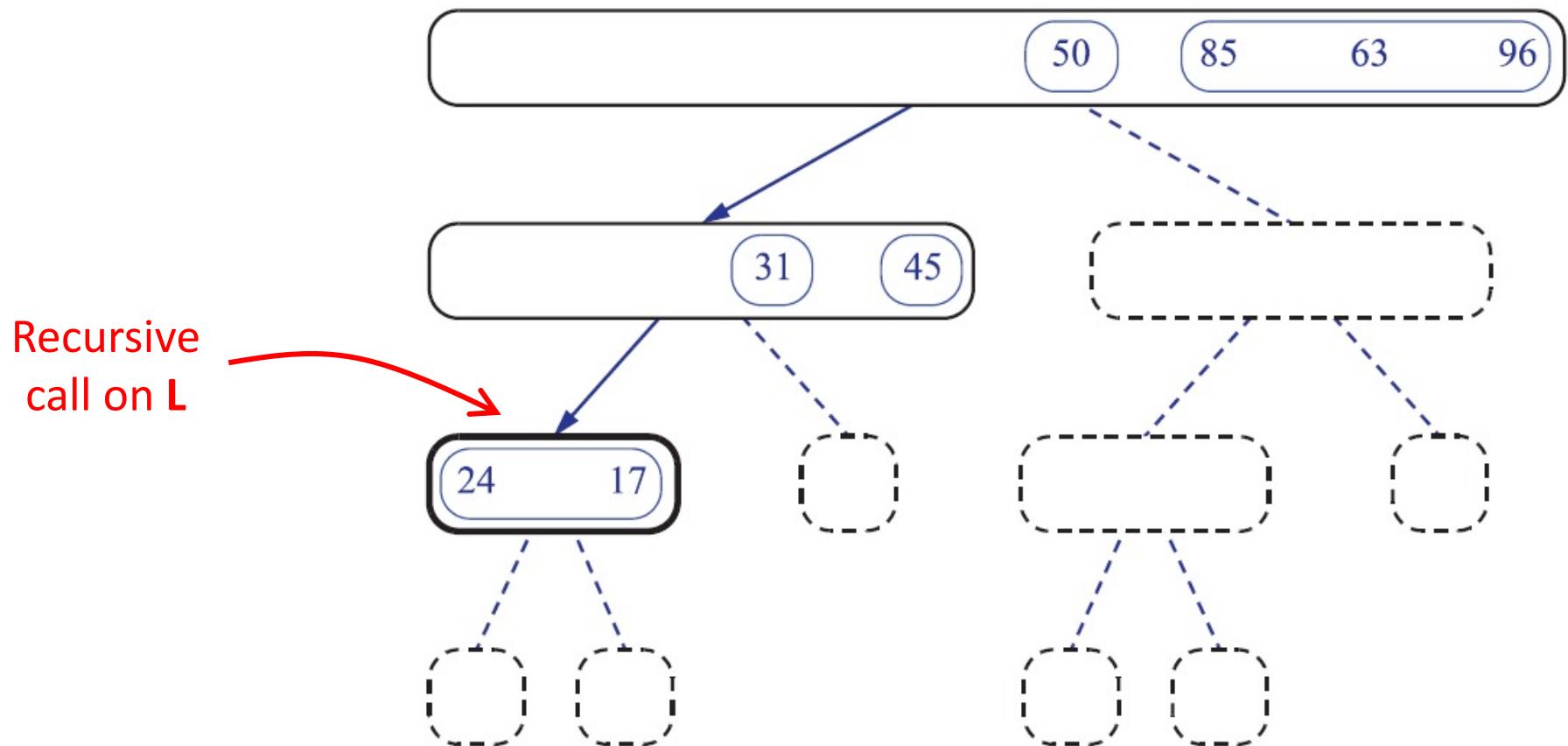
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, **L**, is sorted recursively before starting with the second half, **G**



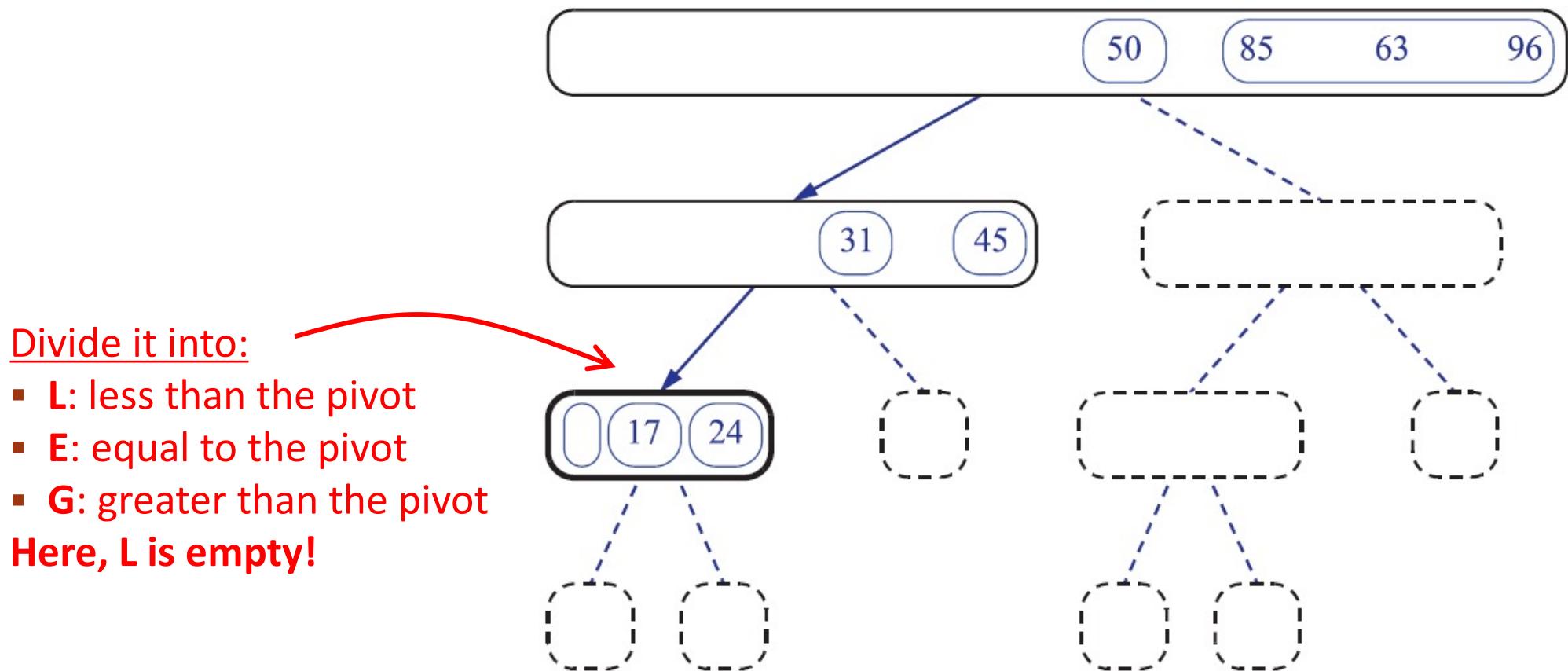
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G



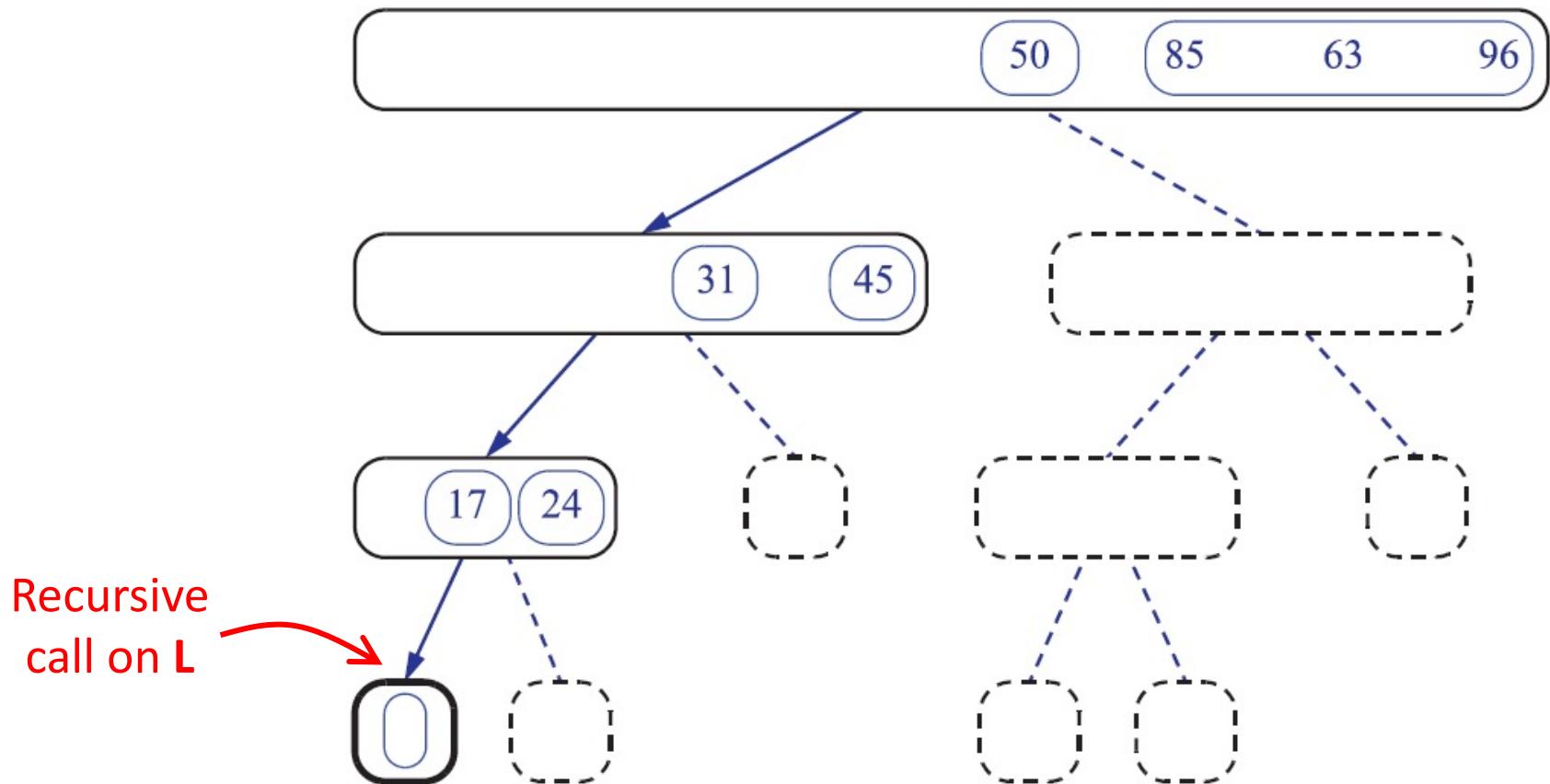
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G



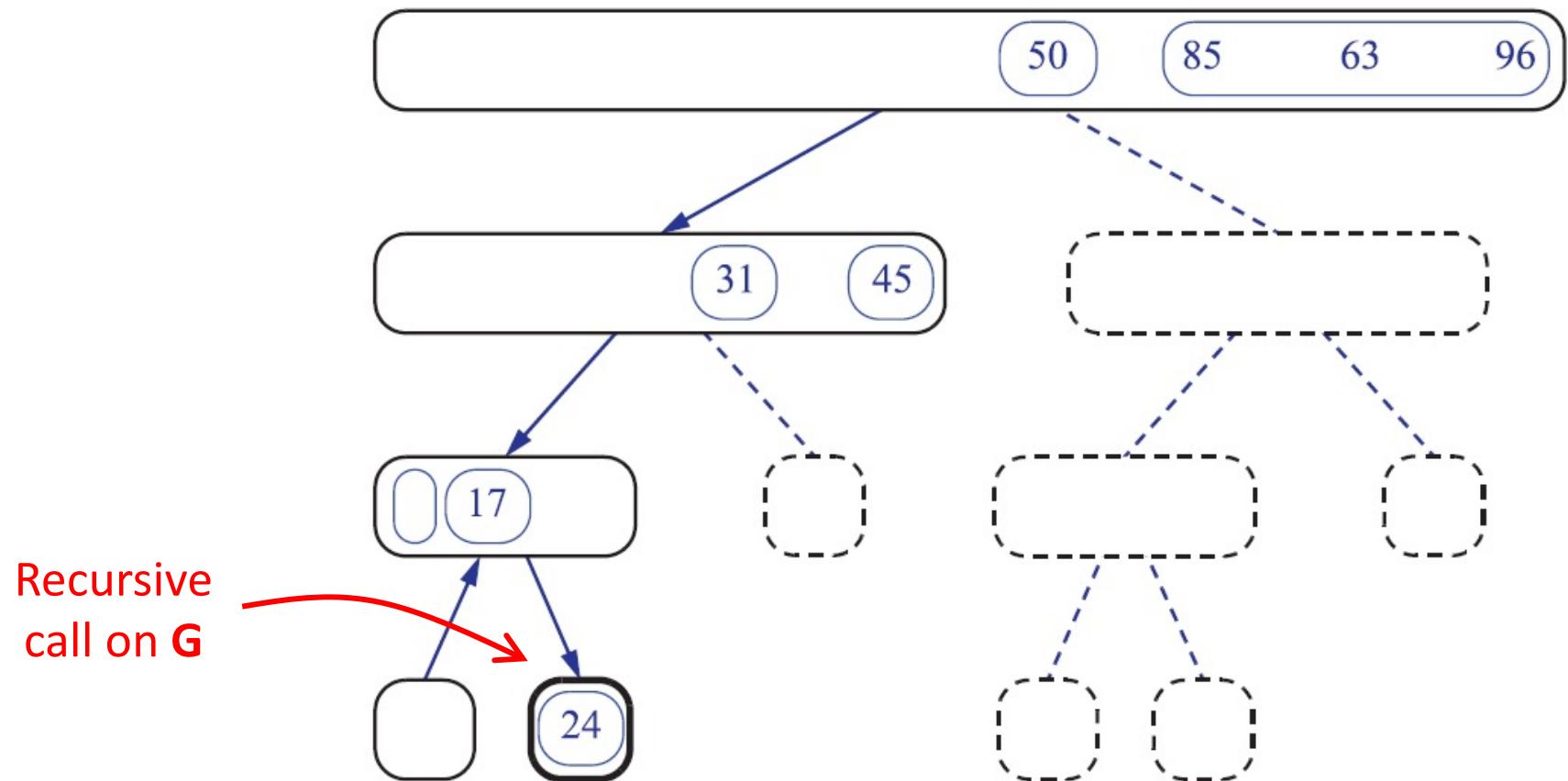
QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G



QUICK-SORT TREE

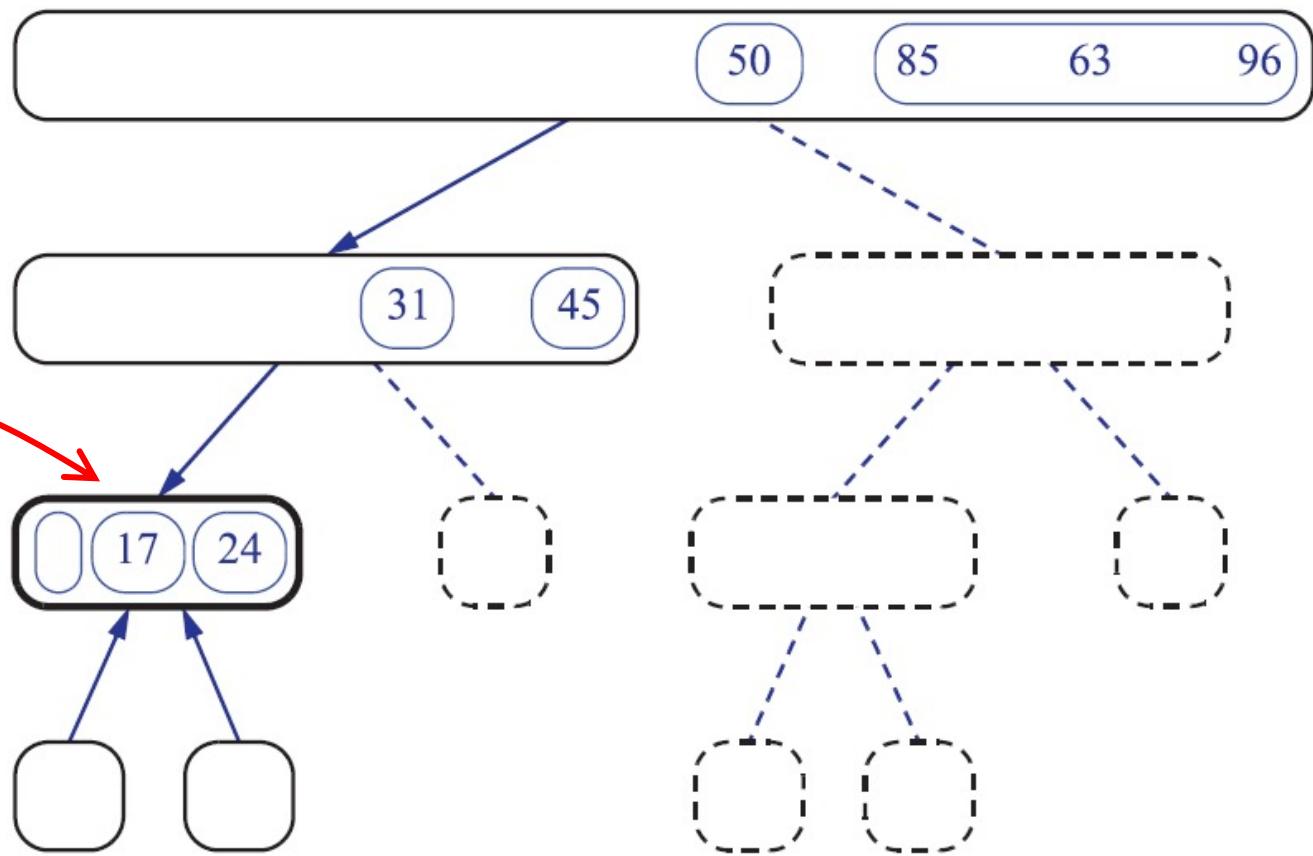
- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G



QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

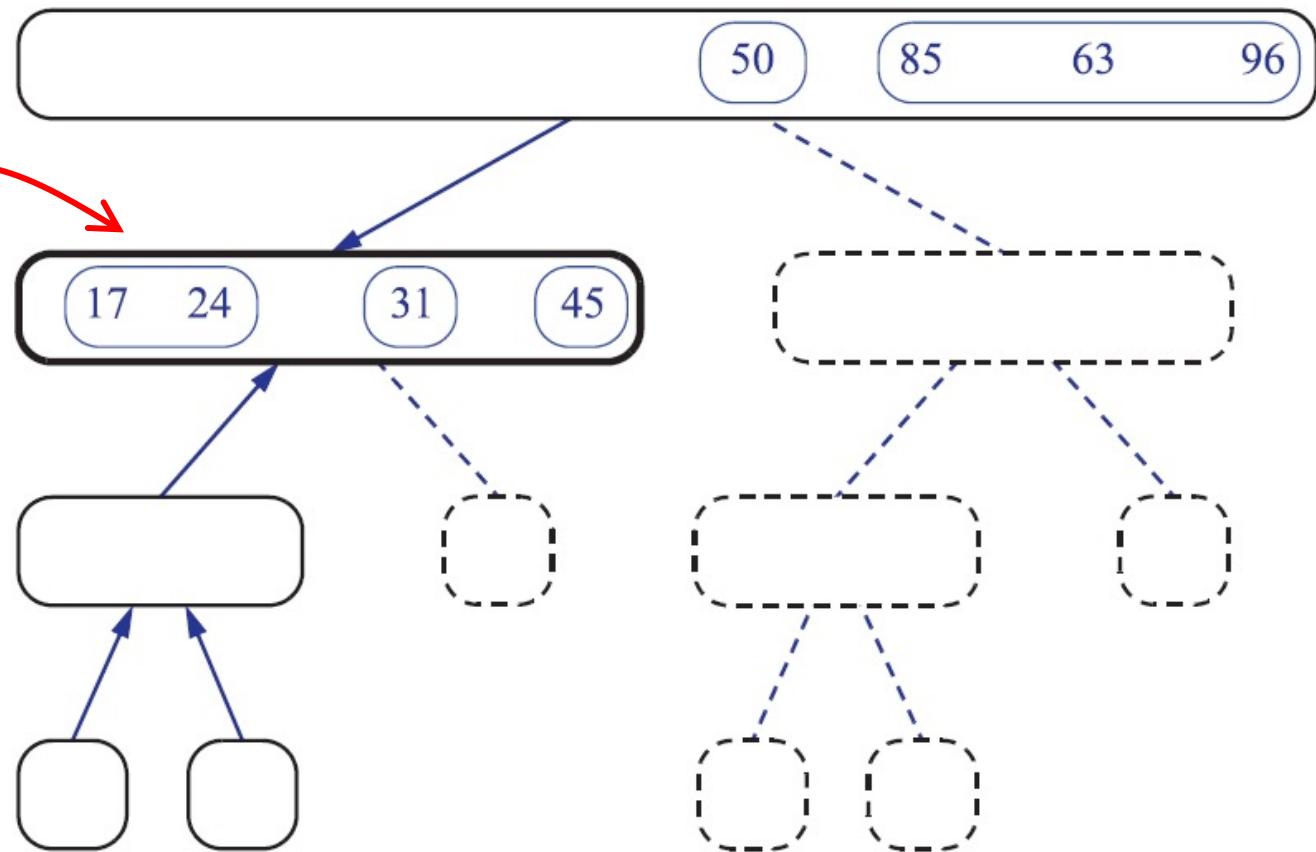
Merge them by:
▪ first putting L
▪ followed by E
▪ followed by G



QUICK-SORT TREE

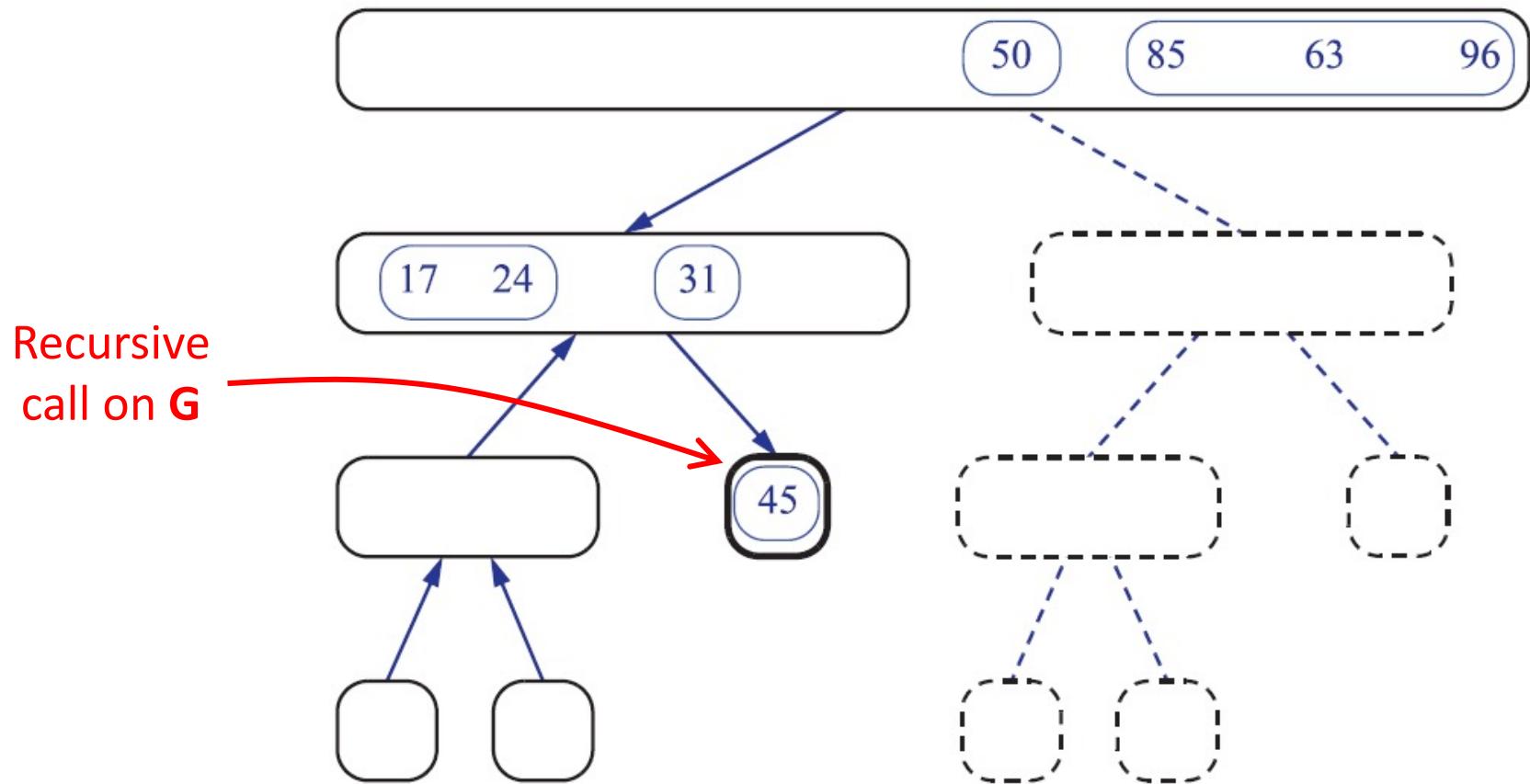
- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

Now that L is sorted, we need to deal with G,



QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

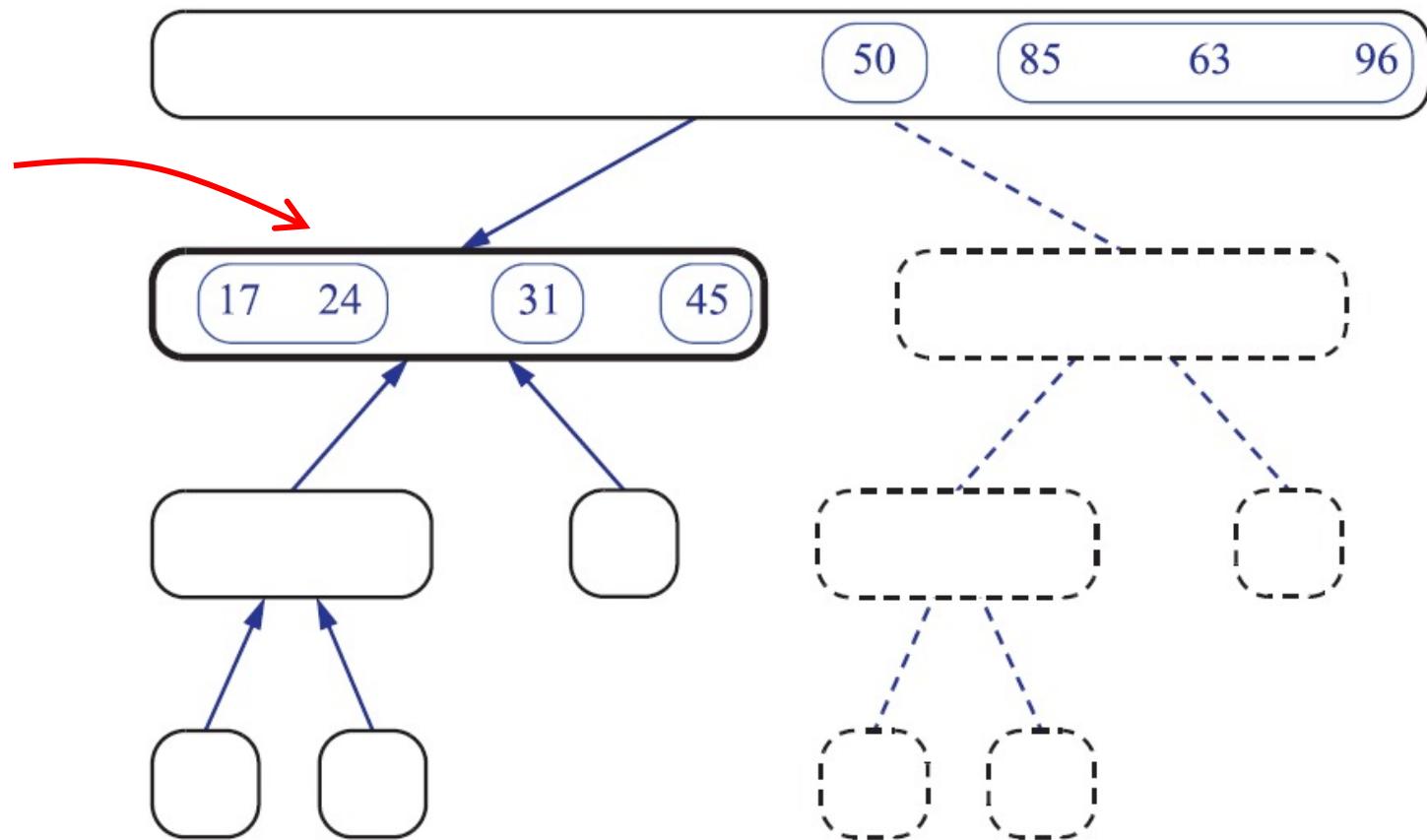


QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

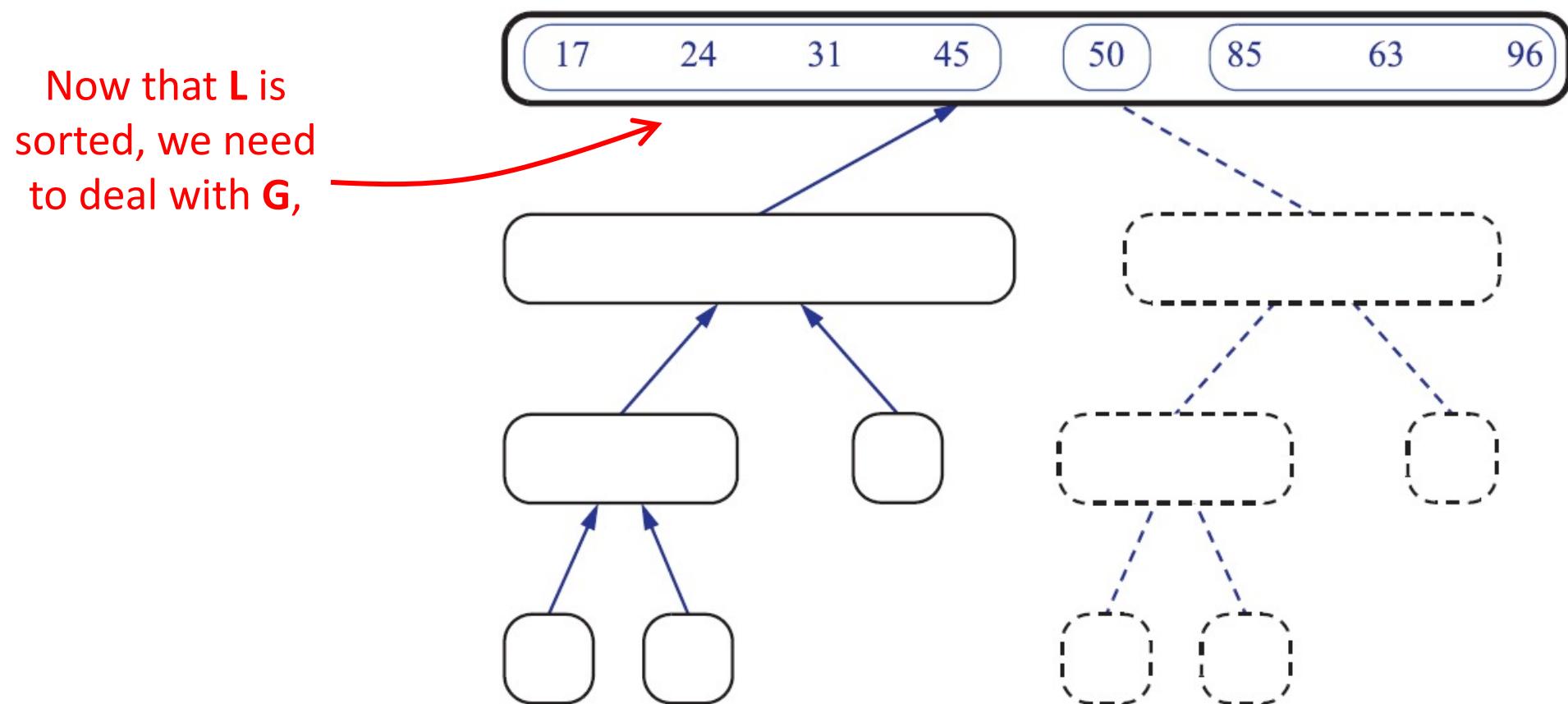
Merge them by:

- first putting L
- followed by E
- followed by G



QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

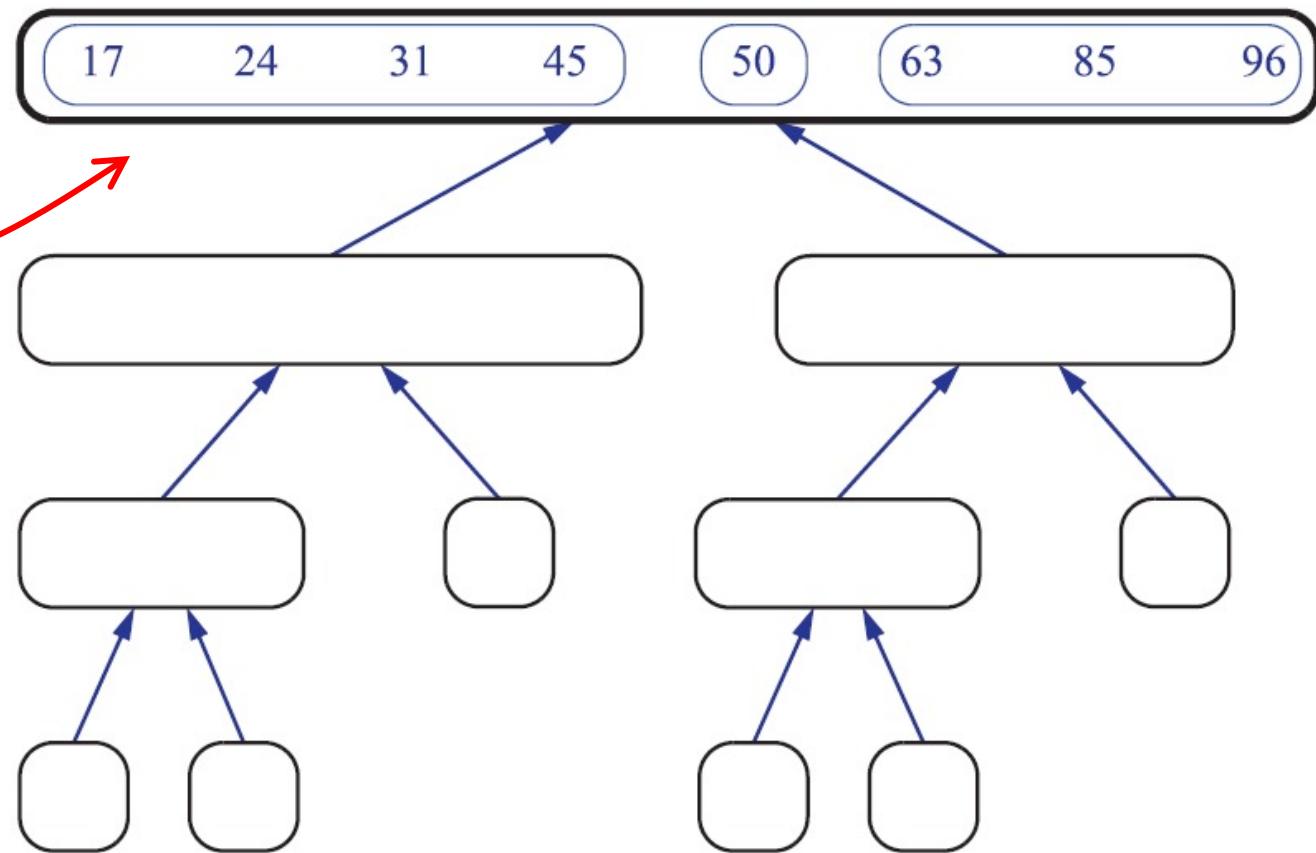


QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G

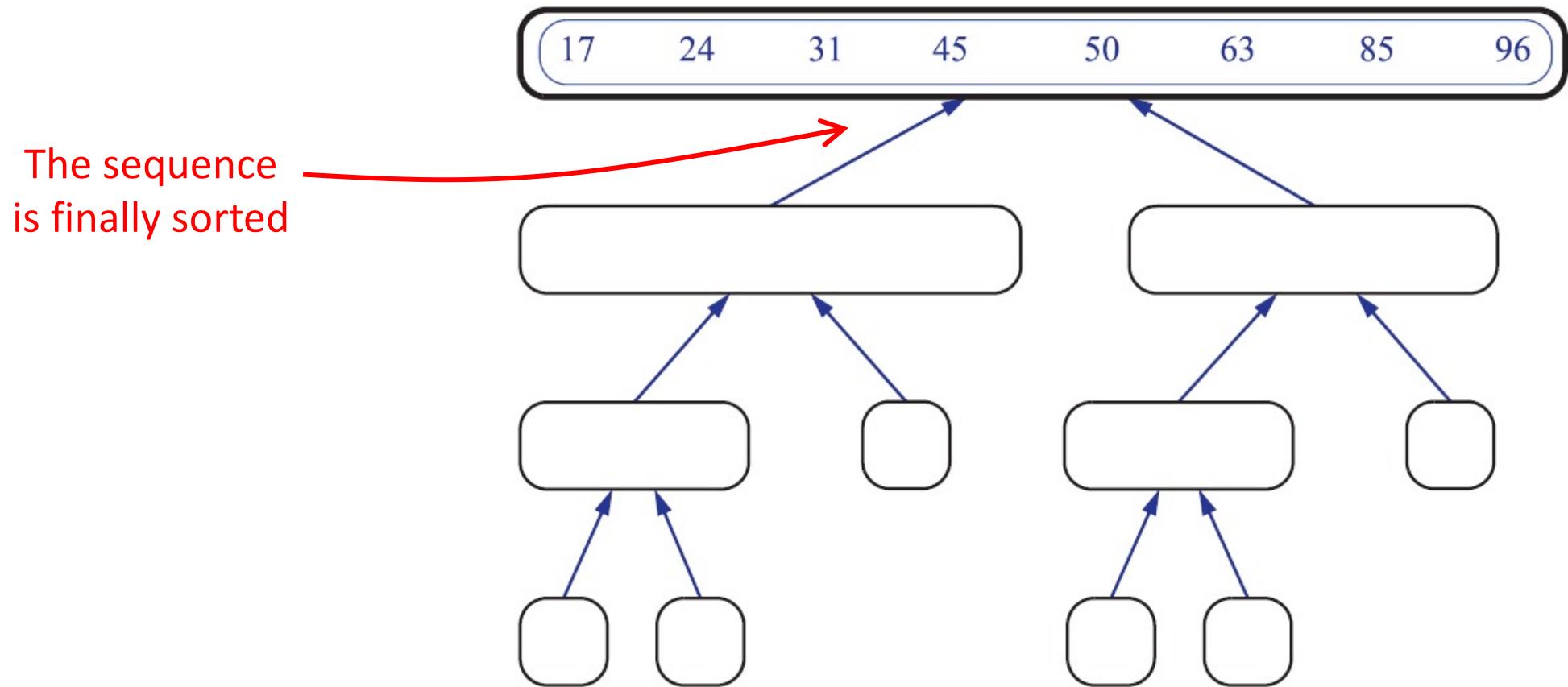
After many recursive calls,
G is sorted, and now we're
ready to merge them by:

- first putting L
- followed by E
- followed by G



QUICK-SORT TREE

- Here is a **more detailed** example showing that the first half, L, is sorted recursively before starting with the second half, G



Algorithm QuickSort(*S*):

```
if S.size() ≤ 1 then
    return


← S.back().element() {the pivot}


Let L, E, and G be empty sequences
while !S.empty() do
    if S.back().element() < p then
        L.insertBack( S.eraseBack() )
    else if S.back().element() = p then
        E.insertBack( S.eraseBack() )
    else
        G.insertBack( S.eraseBack() )
    QuickSort(L)
    QuickSort(G)
    while !L.empty() do
        S.insertBack( L.eraseFront() )
    while !E.empty() do
        S.insertBack( E.eraseFront() )
    while !G.empty() do
        S.insertBack( G.eraseFront() )
return
```

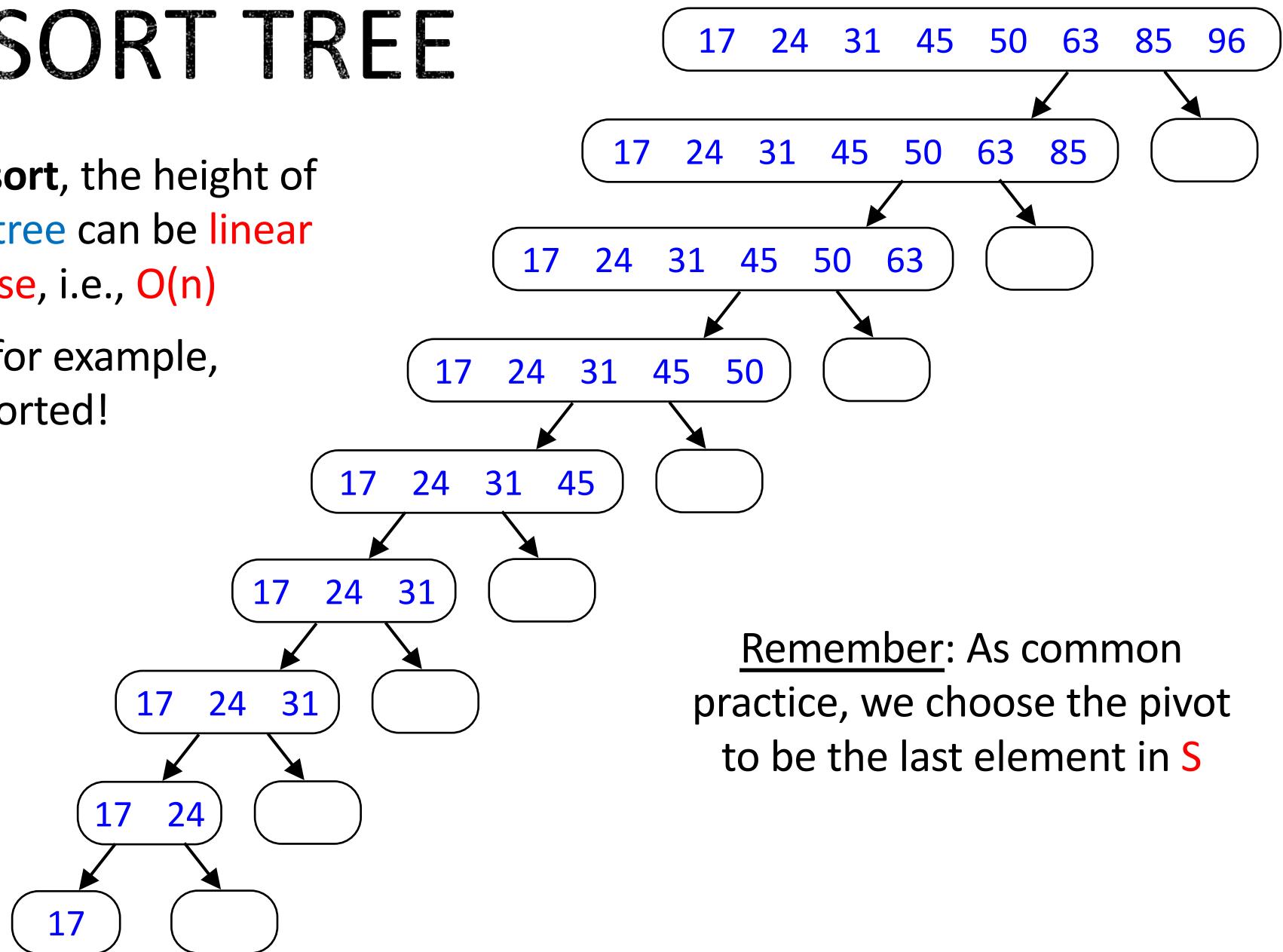
- Scan *S* starting **from the back**. For each element, remove it from *S* and put it in **the back** of *L*, *E* or *G*
- **We insert/remove elements from the back** since this can be done efficiently regardless of whether we are dealing with arrays or lists!

- Recursive calls on *L* and *G*

- Scan *L* starting **from the front**. For each element, remove it from *L* and put it in **the back** of *S*
- Do the same for *E* and *G*
- **We insert elements from the back** since this can be done efficiently regardless of whether we are dealing with arrays or lists!
- **But removal from front is inefficient for arrays!** 😞
This inefficiency can be avoided by deleting the array after copying all its elements to *S*

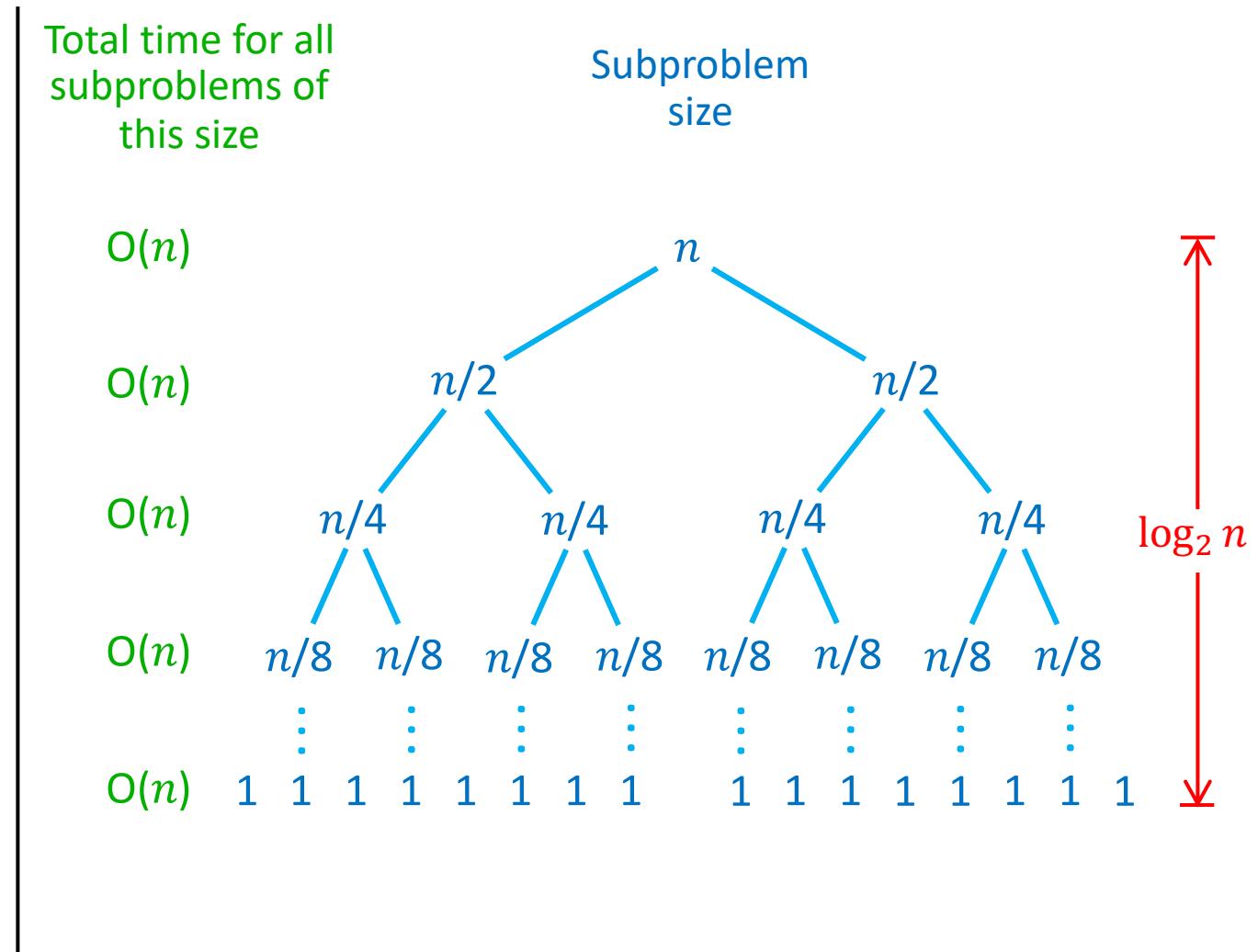
QUICK-SORT TREE

- Unlike **merge-sort**, the height of the quick-sort tree can be **linear in the worst case**, i.e., $O(n)$
- This happens, for example, if **S** is already sorted!



BEST-CASE RUNNING TIME

- The **best case** is if we always pick a pivot that splits the sequence into **equal halves!**
- Quick-sort runs in $O(n \log n)$ time in the **best case!**
- Moreover, if we get a **good split** 50% of the time, and a **bad split** 50% of the time, we end up with a version of quick-sort that runs in $O(n \log n)$ too!



WORST-CASE RUNNING TIME

- The **worst case** is if we always pick a pivot that splits the sequence into **two parts, one of which is empty!**
- In the **worst case**, the number of operations performed is:
 $n + (n - 1) + \dots + 2 + 1$
- Thus, quick-sort runs in $O(n^2)$ time in the **worst case!**

