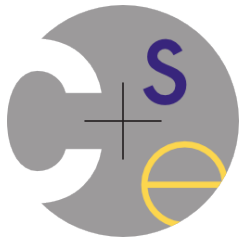


# CSE332: Data Abstractions

## Section 8



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Winter 2015



Adapted from slides by Hye In Kim

# Today

- Announcements
- Questions?
- Worksheet

# Announcements

- Project 3 Phase A:
  - Due Monday March 2<sup>nd</sup> 11pm
- Written HW 7:
  - Due Wednesday March 4<sup>th</sup> 11pm
- The last week of class is busy... get ahead now

# Questions

- Written Homework?
- Project 3?
- Parallel or Concurrent Programming so far?

# Worksheet

- Work together, these are tricky.

# Question 1: Parallel Prefix Sum

- Output array needs to store sums of everything in the input array up to a certain index.

- Meaning:

$\text{output}[i] =$

$\text{input}[i] + \text{input}[i-1] + \text{input}[i-2] + \dots + \text{input}[0]$

input	8	9	6	3	2	5	7	2
output								

# What Information Do We Need?

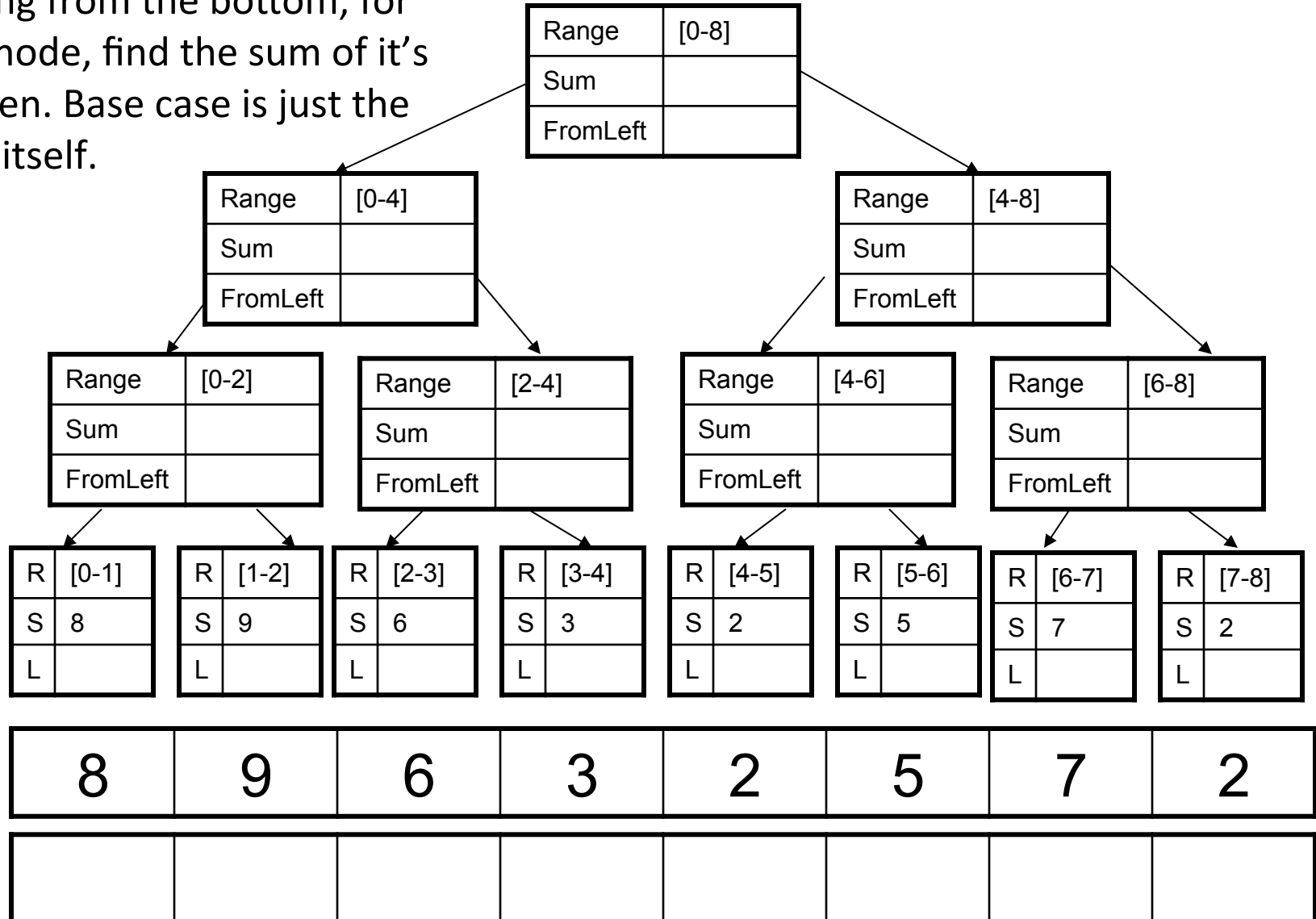
Range	[0-8]
Sum	
FromLeft	

- Start off at root with the entire range of the problem (low=0, high=8).
- We need to find the Sum and the FromLeft value of the root, but we will do this in two passes.
  - First pass, go down and split up the problem until we get to the cutoff of one item (high-low=1)

input	8	9	6	3	2	5	7	2
output								

# Divide the Problem into Parallel Pieces

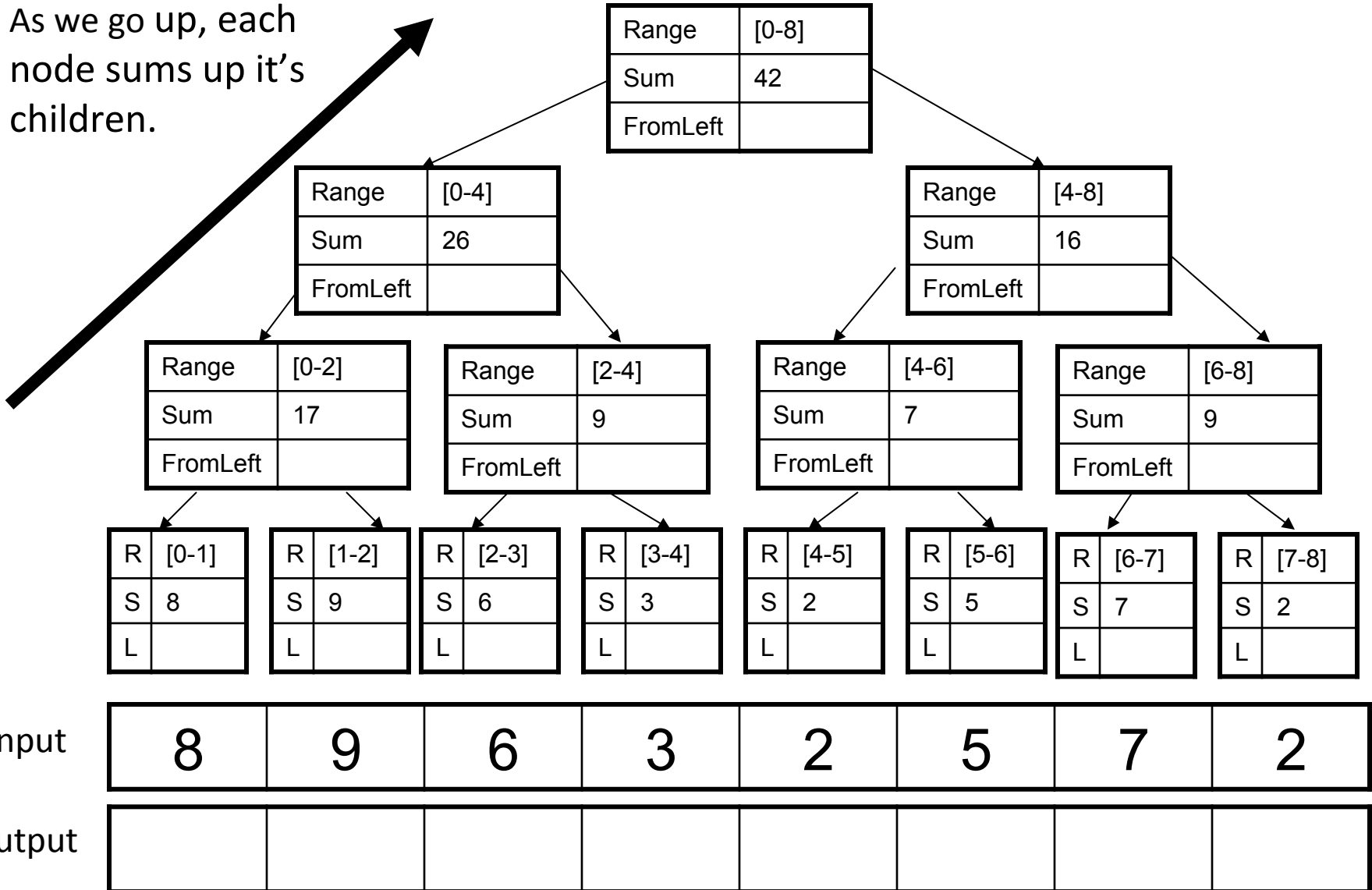
Starting from the bottom, for each node, find the sum of its children. Base case is just the input itself.





# 1<sup>st</sup> Pass Finds Sums, Going Up

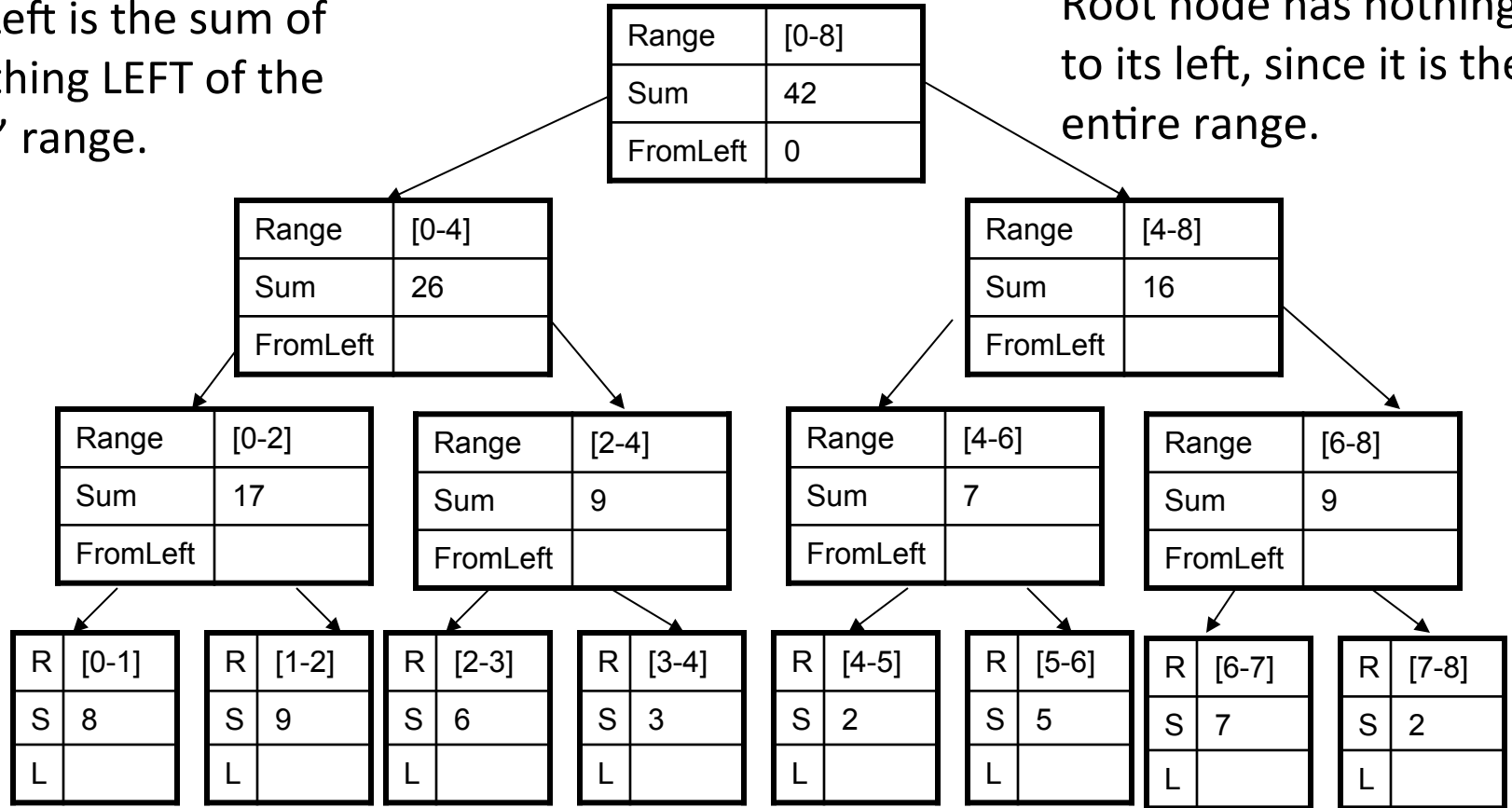
As we go up, each node sums up it's children.



# 2<sup>nd</sup> Pass Finds FromLeft, Going Down

FromLeft is the sum of everything LEFT of the nodes' range.

Root node has nothing to its left, since it is the entire range.



input

8	9	6	3	2	5	7	2
---	---	---	---	---	---	---	---

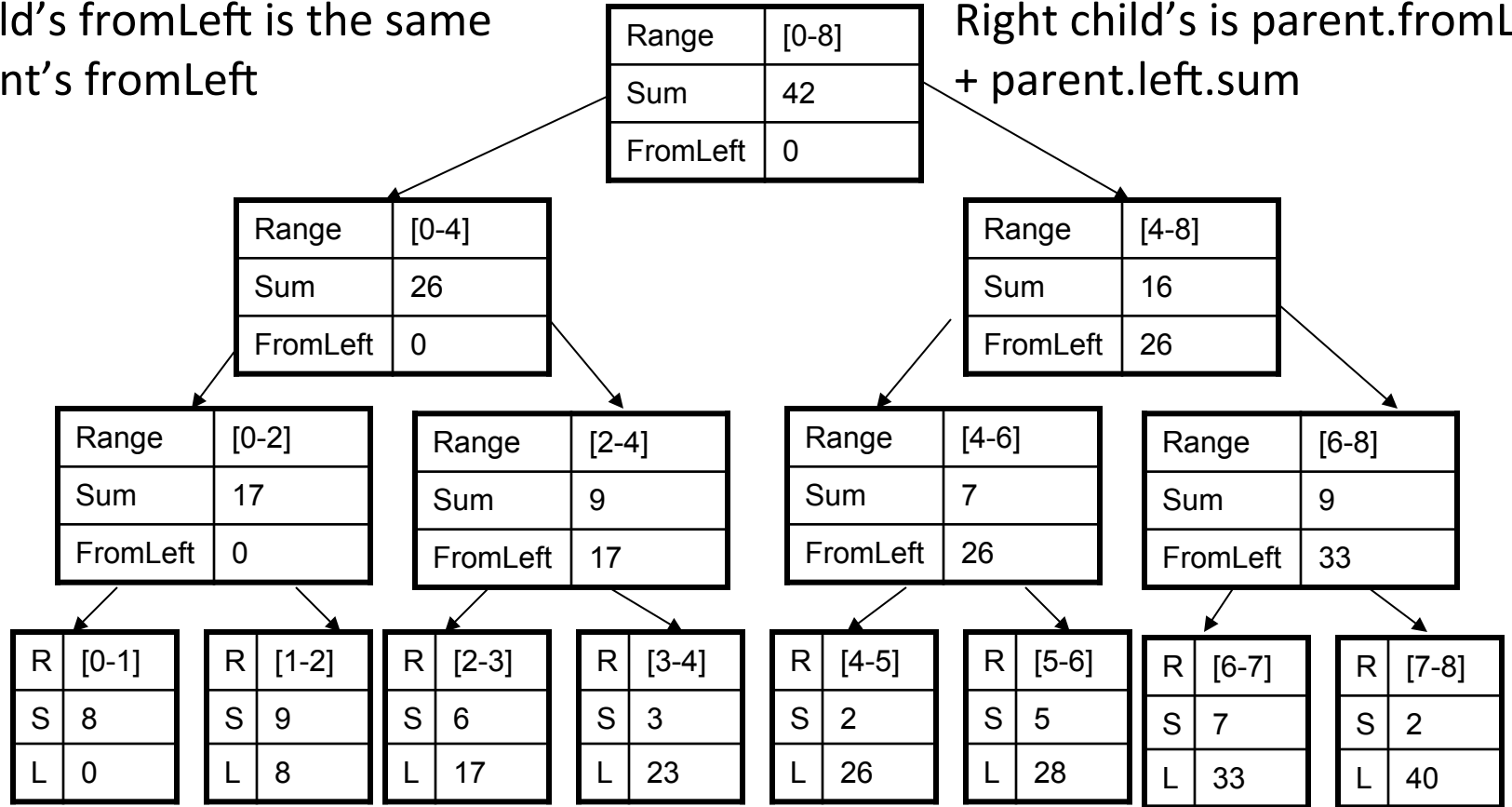
output

--	--	--	--	--	--	--	--

# 2<sup>nd</sup> Pass Finds FromLeft, Going Down

Left child's fromLeft is the same as parent's fromLeft

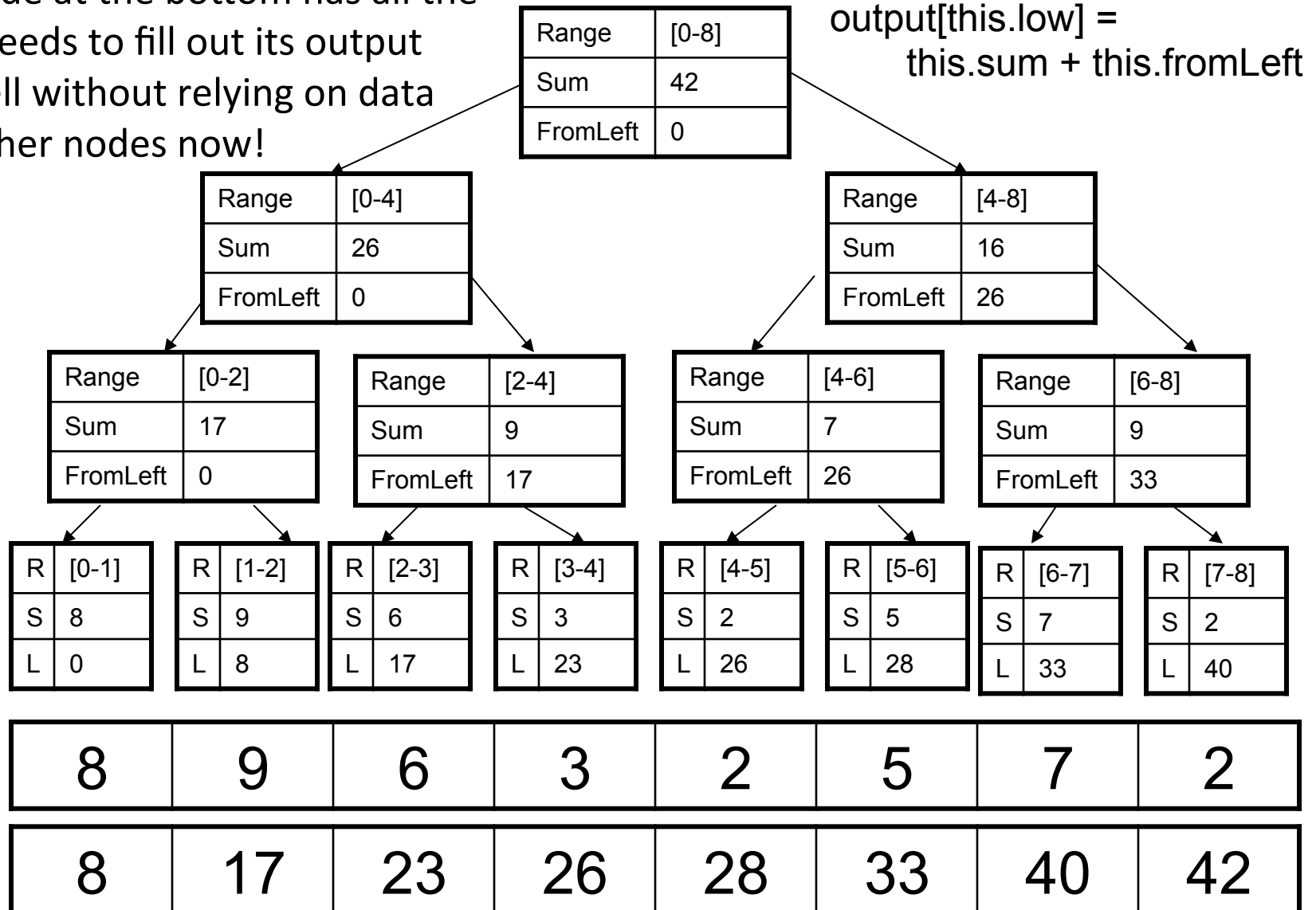
Right child's is parent.fromLeft + parent.left.sum



input	8	9	6	3	2	5	7	2
output								

# Finally, Fill the Output Array

Each node at the bottom has all the info it needs to fill out its output array cell without relying on data from other nodes now!



# Question 2: Parallel Prefix FindMin

- Output an array with the minimum value of all cells to its left or “the min seen so far”.
- Meaning:  
$$\text{output}[i] = \min(\text{input}[0], \text{input}[1], \dots, \text{input}[i-1], \text{input}[i])$$

input	8	9	6	3	2	5	7	4
output								

# What Information Do We Need?

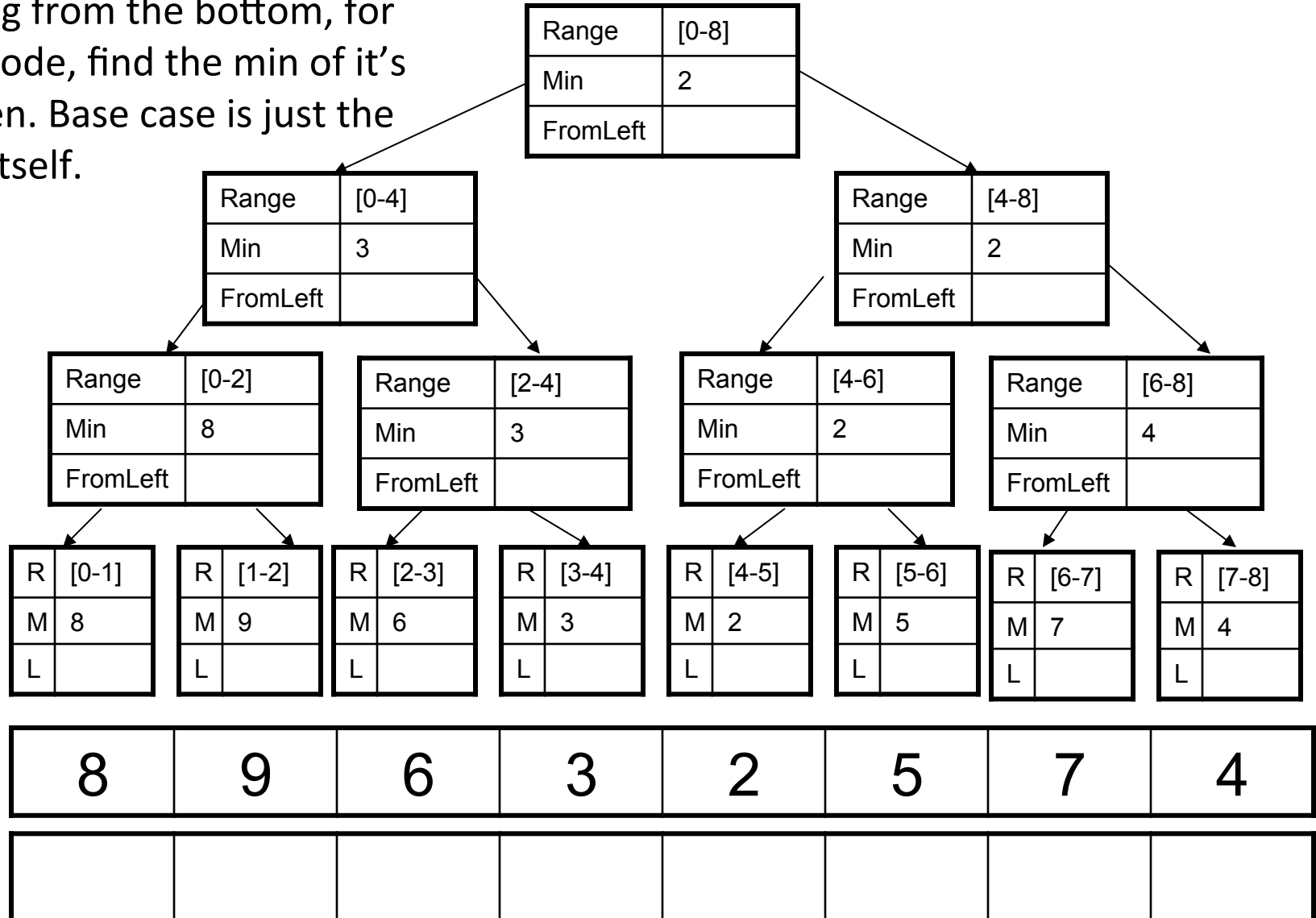
Range	[0-8]
Sum	
FromLeft	

- Same as before, except this time, we want to store the node's range, the min of it's children, and the min of everything to it's left.
- Start off at root with the entire range of the problem (low=0, high=8).

input	8	9	6	3	2	5	7	4
output								

# 1<sup>st</sup> Pass Finds Mins, Going Up

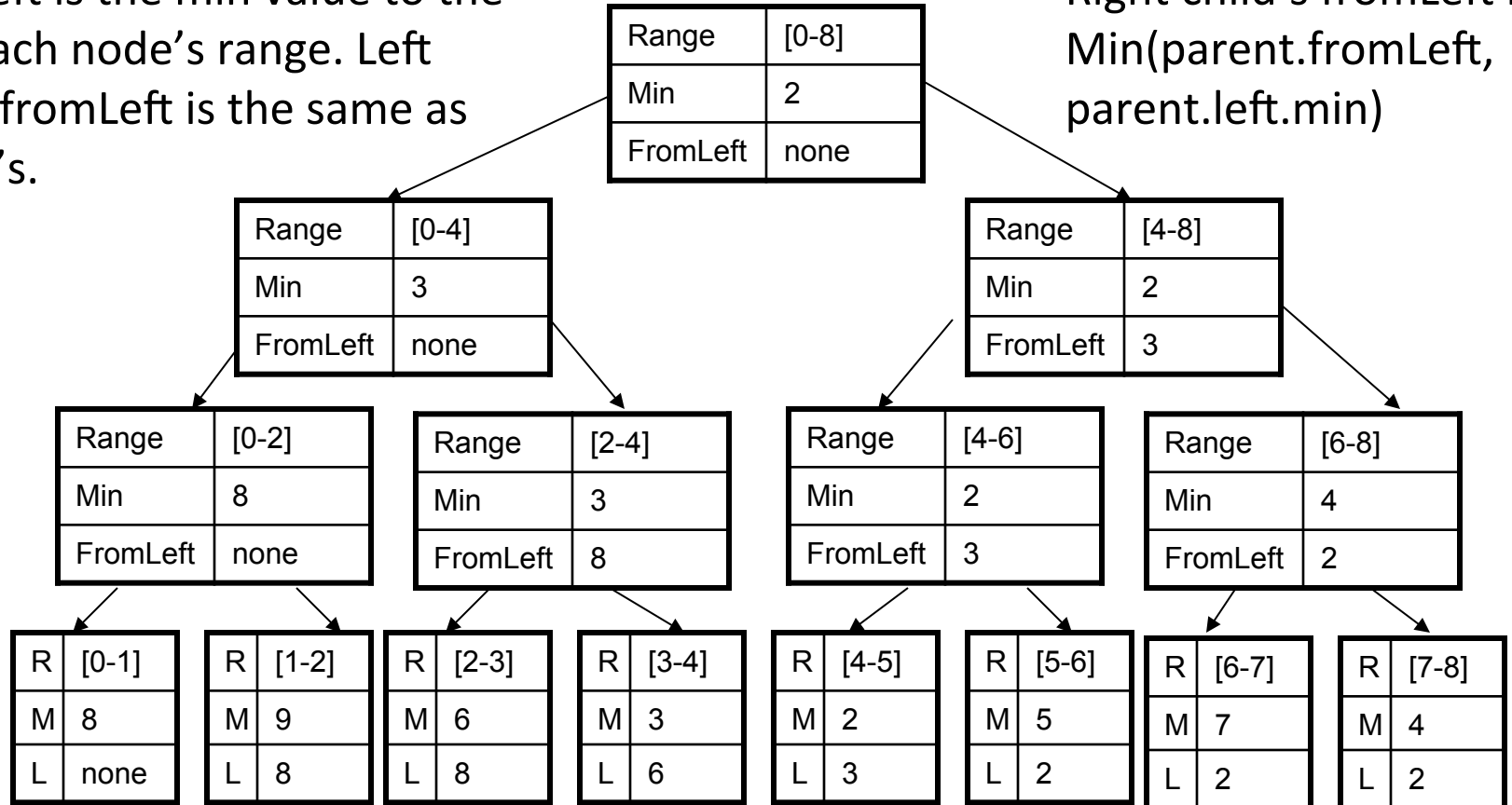
Starting from the bottom, for each node, find the min of it's children. Base case is just the input itself.



# 2<sup>nd</sup> Pass Finds FromLeft Going Down

FromLeft is the min value to the LEFT each node's range. Left child's fromLeft is the same as parent's.

Right child's fromLeft is  $\text{Min}(\text{parent.fromLeft}, \text{parent.left.min})$



input

8	9	6	3	2	5	7	4
---	---	---	---	---	---	---	---

output

8	8	6	3	2	2	2	2
---	---	---	---	---	---	---	---



# Question 3: Quicksort Recurrence Relations

- Recall that sequential Quicksort consists of
  - $O(1)$  Picking a pivot
  - $O(n)$  Partition data into
    - A: Less than pivot
    - B: Pivot
    - C: Greater than pivot
  - $2 T(n/2)$  Recursively, sort each of the two halves, A and C.
- $T(n)=1 + n + 2T(n/2) = O(n \log n)$

# To Parallelize Step 3 (recursion)

- Each partition can be done at the same, so  $2T(n/2)$  becomes time  $1 T(n/2)$
- Whole relation becomes:  
 $T(n)=1 + n + T(n/2)$
- Ignoring the constant time pivot-picking:  
 $T(n) = n + T(n/2)$

# Solving the Recurrence Relation

$$T(n) = n + T(n/2)$$

$$T(n) = n + (n/2 + T(n/4))$$

$$T(n) = n + (n/2 + (n/4 + T(n/8)))$$

$$T(n) = n * (1 + 1/2 + 1/4 + \dots + 1/2^{k-1}) + T(n/2^k)$$

This will eventually expand down to  $T(1)$ , the base case.

$$n/2^k=1$$

$$k = \log n$$

# Solving the Recurrence Relation

$$T(n) = n + T(n/2)$$

$$T(n) = n + (n/2 + T(n/4))$$

$$T(n) = n + (n/2 + (n/4 + T(n/8)))$$

$$T(n) = n * (1 + 1/2 + 1/4 + \dots + 1/2^{k-1}) + T(n/2^k)$$

Assume  $T(1)=C$  that is, that to sort 1 element takes a constant  $C$  units of time.

$$T(n) = n * (1 + 1/2 + 1/4 + \dots + 1/2^{\log n - 1}) + C$$

- Sum of geometric series  $(1 + 1/2 + 1/4 + \dots)$  converges to 2

$$T(n) = 2n + C \text{ which is } O(n), \text{ linear}$$

# To Parallelize Step 2 (partitioning)

- Do two filters
  - Filter to get the less-than-pivot partition
  - Filter to get the greater-than-pivot partition
- Filter is work  $O(n)$ , span  $O(\log n)$
- Quicksort is now (partition + recursion):  
 $T(n) = O(\log n) + T(n/2)$

# Solving the Recurrence Relation

Expand out the Recurrence

$$T(n) = \log n + T(n/2)$$

$$T(n) = \log n + (\log(n/2) + T(n/4))$$

$$T(n) = \log n + \log(n/2) + \log(n/4) + T(n/8)$$

$$T(n) = \log n + \log(n/2) + \log(n/4) + \log(n/8) + T(n/16)$$

$$T(n) = \log n + (\log n - \log 2) + (\log n - \log 4) \\ + (\log n - \log 8) + T(n/16)$$

$$T(n) = 4 \cdot \log n - \log 2 - \log 4 - \log 8 + T(n/16)$$

# Solving the Recurrence Relation

$$T(n) = 4 \cdot \log n - \log 2 - \log 4 - \log 8 + T(n/16)$$

Because we're using log base 2

$$T(n) = 4 \cdot \log n - 1 - 2 - 3 + T(n/2^4)$$

$$T(n) = k \cdot \log n - (1 + 2 + 3 + \dots + (k-1)) + T(n/2^k)$$

$$T(n) = k \cdot \log n - (k(k-1))/2 + T(n/2^k)$$

# Solving the Recurrence Relation

$$T(n) = k \cdot \log n - (k(k-1))/2 + T(n/2^k)$$

As usual, set  $n/2^k=1$ , gives  $k=\log n$

Then assume  $T(1)=C$

$$T(n) = (\log n) \cdot (\log n) - ((\log n - 1)(\log n))/2 + C$$

$$T(n) = (\log n) \cdot (\log n) - ((\log n * \log n) - \log n)/2 + C$$

Which is  $O(\log n * \log n)$