

CSE 595: Advanced Topics in Computer Science

Presentation 2 and 3

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Topics for today's presentation

- ▶ Given an array of size n and a number k , find all elements that appear more than n/k times.

Problem 2: Given an array of size n and a number k , find all elements that appear more than n/k times

Understanding the problem:

- ▶ Given: an array and a random value " k ".
- ▶ Task: To find all the elements such the frequency of the element is greater than the $\text{arrayLength}/k$.
- ▶ Example:
exampleArray = [1, 2, 3, 4, 1, 1, 2, 2, 5]
 $k = 4$
Answer = [1, 2]

Possible Approaches:

- ▶ Naive Approach: Calculate the frequency of all the elements by traversing the array
- ▶ Using a HashMap
- ▶ Alternate Method
- ▶ Boyer-Moore Voting Algorithm ($n/2$, $n/3$ and n/k generalization)

Overview of Complexity Analysis of the discussed problems.

Complexity Analysis for the algorithms			
Algorithm	Time	Space	Side Notes
HashMap	$O(N)$	$O(N)$	Still requires to iterate through array
Alternate Method	$O(N * K)$	$O(K)$	Double loops increase time complexity
Boyer-Moore	$O(N)$	$O(1)$	Manually writing if-else conditions is tedious for $k > 3$

Problem 2: Hash method

Algorithm 1 Hash algorithm for n/k

```
1: Calculate the
2: for  $i$  from 0 to  $n - 1$  do
3:   Add to the count of the element in the hashmap
4: end for
5: for Iterate over hashmap do
6:   if  $elementCount > ratio$  then
7:     save the corresponding element
8:   end if
9: end for
```

Time Complexity: $O(N)$

Space Complexity: $O(N)$

Problem 2: Alternate method

Algorithm 2 Alternate algorithm for n/k

- 1: define a structure of length $k-1$ to hold the element and count
 - 2: **if** element of array is already present in the structure **then**
 - 3: Increase its count
 - 4: **else if** element of array is not present in the structure **then**
 - 5: **if** there is space in structure **then**
 - 6: Add element and set count to 1
 - 7: **else**
 - 8: Reduce the count of all elements by 1
 - 9: **end if**
 - 10: **end if**
-

Problem 2: Alternate algorithm Visualization

array = [1, 2, 3, 4, 1, 1, 2, 2, 5]

i=1:

temp: $\frac{1}{1} - -$

i=2:

temp: $\frac{1}{1} \frac{2}{1} -$

i=3:

temp: $\frac{1}{1} \frac{2}{1} \frac{3}{1}$

i=4:

temp: $\frac{1}{0} \frac{2}{0} \frac{3}{0}$

{ if no space:
count-- }

i=5:

temp: $\frac{1}{1} \frac{2}{0} \frac{3}{0}$

i=6:

temp: $\frac{1}{2} \frac{2}{0} \frac{3}{0}$

i=7:

temp: $\frac{1}{2} \frac{2}{1} \frac{3}{0}$

i=8:

temp: $\frac{1}{2} \frac{2}{2} \frac{3}{0}$

i=9:

temp: $\frac{1}{2} \frac{2}{2} \frac{5}{1}$

Figure 1: Structure element changes over the course of the algorithm

Time Complexity: $O(N * K)$

Space Complexity: $O(K)$

Introduction to Boyer-Moore Voting Algorithm

The usual variations of this problem, is to find the frequency of elements that occur more than $n/3$ times or $n/4$ time, with the constraint of linear time complexity and $O(1)$ space.

LOGIC:

- ▶ There can be atmost 1 element with frequency more than $n/2$.
- ▶ There can be atmost 2 elements with frequency more than $n/3$.
- ▶ There can be atmost 3 elements with frequency more than $n/4$.
- ▶ There can be atmost $k-1$ elements with frequency more than n/k .

Problem 2: Boyer-Moore Voting Algorithm

Algorithm 3 Boyer-Moore Voting Algorithm for $n/2$

- 1: define variables to hold the element and count
 - 2: **if** element == variable **then**
 - 3: Increase its count
 - 4: **else if** *element* != *variable* and *variablecount* == 0 **then**
 - 5: Add element and set count to 1
 - 6: **else**
 - 7: Reduce the count by 1
 - 8: **end if**
-

Problem 2: Alternate algorithm Visualization

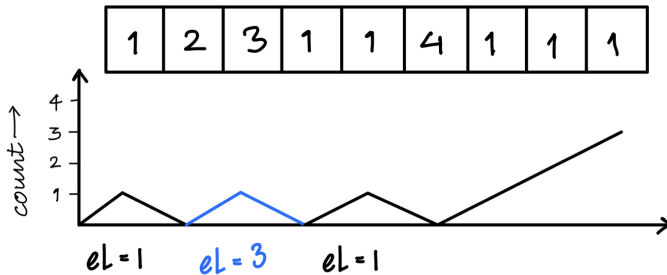


Figure 2: Boyer-Moore Voting Algorithm for $n/3$

Problem 2: Boyer-Moore Voting Algorithm

Algorithm 4 Boyer-Moore Voting Algorithm for $n/3$

```
1: define variables to hold the element and count
2: if element == variable1 OR element == variable2 then
3:   Increase its count
4: else if element != variable1 then
5:   if count == 0 then
6:     Add element and set count to 1
7:   else
8:     count — —
9:   end if
10: else if element != variable2 then
11:   if count == 0 then
12:     Add element and set count to 1
13:   else
14:     count — —
15:   end if
16: end if
```

Problem 2: Boyer-Moore Voting Algorithm for $n/3$

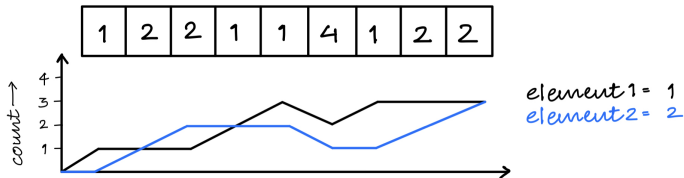


Figure 3: Element wise count changes over the course of the algorithm

Time Complexity: $O(N)$

Space Complexity: $O(1)$

Topics for today's presentation

- ▶ Trapping Rainwater

Problem 3: Trapping Rainwater

- ▶ Given: An Array with elements which represent the height of a bar.
- ▶ Task: To find the amount of water that can be trapped in between these bars.
- ▶ Example: $array = [3, 0, 2, 0, 3]$, $answer = 7$

$array = \{3, 0, 2, 0, 3\}$

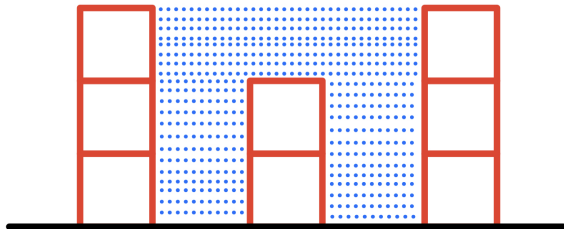


Figure 4: Visual representation of the problem

Overview of Complexity Analysis of the discussed problems.

Complexity Analysis			
Algorithm	Time	Space	Side Notes
Naive	$O(N^2)$	$O(1)$	Requires to iterate through the array, nested loops increase time complexity
Dynamic Prog.	$O(N)$	$O(N)$	Fastest method of the four
Stacks	$O(N^2)$	$O(N)$	Double loops increase time complexity
Two Pointer	$O(N)$	$O(1)$	Got to initialize or keep track of 4 variables

Problem 3: Real time problem run-time and space

Time Submitted	Status	Runtime	Memory	Language
06/07/2021 09:48	Accepted	12 ms	14.1 MB	cpp
06/07/2021 09:46	Accepted	4 ms	14.5 MB	cpp
06/07/2021 06:23	Accepted	0 ms	14.3 MB	cpp
06/07/2021 05:04	Accepted	496 ms	14.1 MB	cpp

Problem 3: Naive Method

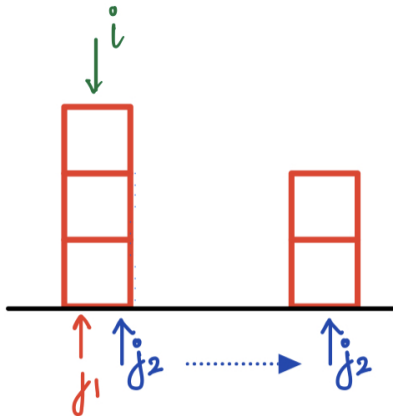
Algorithm 5 Naive algorithm

```
1: for  $i$  from 0 to  $n - 1$  do
2:   Initialize two variables to hold the maximum size on left and
   right side of the current element
3:   for  $j$  from  $i$  to 0 do
4:      $\text{leftMax} = \max(\text{leftMax}, \text{currentElement})$ 
5:   end for
6:   for  $j$  from  $i$  to  $n - 1$  do
7:      $\text{rightMax} = \max(\text{rightMax}, \text{currentElement})$ 
8:   end for
9:    $\text{answer} + = \min(\text{leftMax}, \text{rightMax}) - \text{currentElement}[i]$ 
10: end for
```

Time Complexity: $O(N^2)$

Space Complexity: $O(1)$

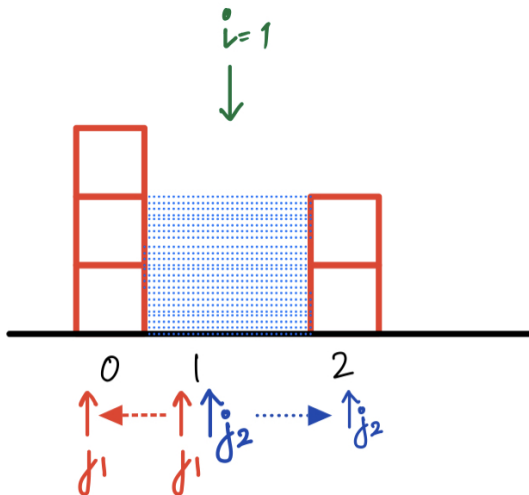
Problem 3: Naive algorithm Visualization



$answer += \min(\text{left-max}, \text{right-max}) - \text{height}[i]$

$answer += 3 - 3 = 0$

Problem 3: Naive algorithm Visualization



$answer += \min(\text{left-max}, \text{right-max}) - \text{height}[i]$

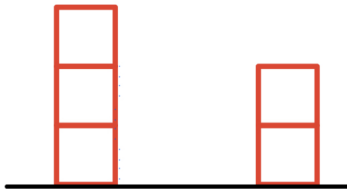
$answer += 2 - 0 = 2$

Problem 3: Dynamic Programming method

Algorithm 6 Dynamic Programming algorithm

- 1: Initialize two variables to hold the maximum size on left and right side of the current element
 - 2: **for** i from 1 to $n - 1$ **do**
 - 3: $leftMax[i] = \max(leftMax[i - 1], currentElement[i])$
 - 4: **end for**
 - 5: **for** j from $n - 2$ to 0 **do**
 - 6: $rightMax[i] = \max(rightMax[i + 1], currentElement[i])$
 - 7: **end for**
 - 8: **for** j from 0 to $n - 1$ **do**
 - 9: $answer+ = \min(leftMax[i], rightMax[i]) - currentElement[i]$
 - 10: **end for**
-

Problem 3: Dynamic Programming algorithm visualization



Init:

$$\text{left_max}[0] = \text{array}[0] = 3$$

$$\text{right_max}[2] = \text{array}[2] = 2$$

$$\begin{array}{l} \text{left_max}[1] = \max(3, 0) = 3 \quad \& \quad \text{right_max}[1] = \max(2, 0) = 2 \\ \text{left_max}[2] = \max(3, 2) = 3 \quad \text{right_max}[0] = \max(2, 3) = 3 \end{array}$$

Figure 5: Structure element changes over the course of the algorithm

Problem 3: Dynamic Programming algorithm visualization

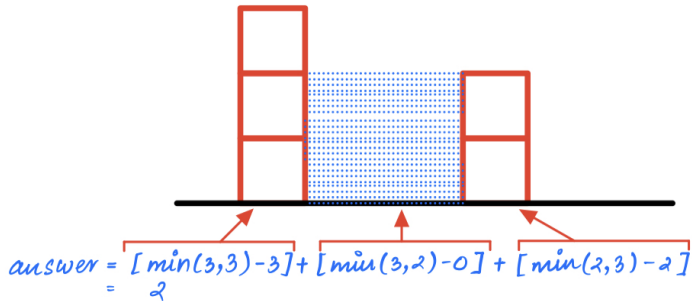


Figure 6: Structure element changes over the course of the algorithm

Problem 3: Stack method

Algorithm 7 Algorithm using Stack

```
1: for  $i$  from 0 to  $n - 1$  do
2:   while ( $!stack.empty()$  and  $currentElement > stack.top()$ )
     do
3:     Store index of top element and pop
4:      $distance = currentTop - currentElement$ 
5:      $boundingHeight = \min(currentTop, previousTop) -$ 
        $currentElement$ 
6:      $answer = boundingHeight * distance$ 
7:   end while
8: end for
```

What's the intuition behind Stack?

- ▶ Instead of storing the largest bar upto an index, we can use stack to store the bars that are bounded by longer bars
- ▶ If we encounter a bar \leq bar on top of the stack, we know it is bounded and hence add it to the stack.
- ▶ If we encounter a bar $>$ bar on top, we know it bounds the top as well the bar next in the stack.

Problem 3: Two Pointer method

Algorithm 8 Algorithm using two pointers

- 1: Initialize 4 variables to hold the two pointers and the max values for left and right respectively
 - 2: **while** *leftIndex* \leq *rightIndex* **do**
 - 3: **if** *rightMax* \leq *leftMax* **then**
 - 4: *output* $+= \max(0, \textit{rightMax} - \textit{arr}[\textit{rightIndex}])$
 - 5: Update *rightMax* and *rightIndex*(-1)
 - 6: **else**
 - 7: *output* $+= \max(0, \textit{leftMax} - \textit{arr}[\textit{leftIndex}])$
 - 8: Update *leftMax* and *leftIndex*(+1)
 - 9: **end if**
 - 10: **end while**
-

Problem 3: Two Pointer algorithm visualization

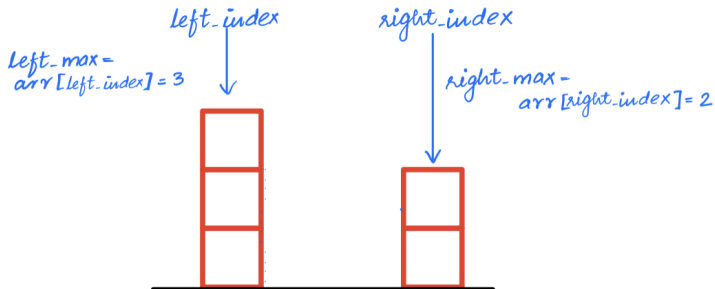
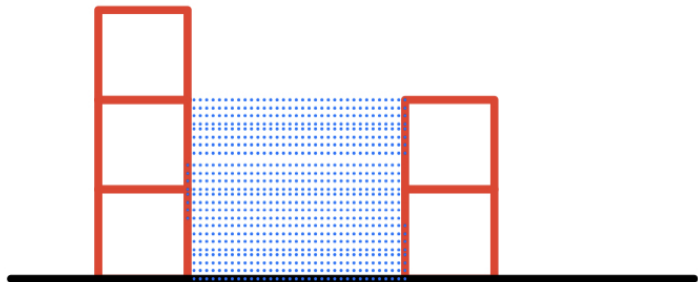


Figure 7: Structure element changes over the course of the algorithm

Problem 3: Two Pointer algorithm visualization



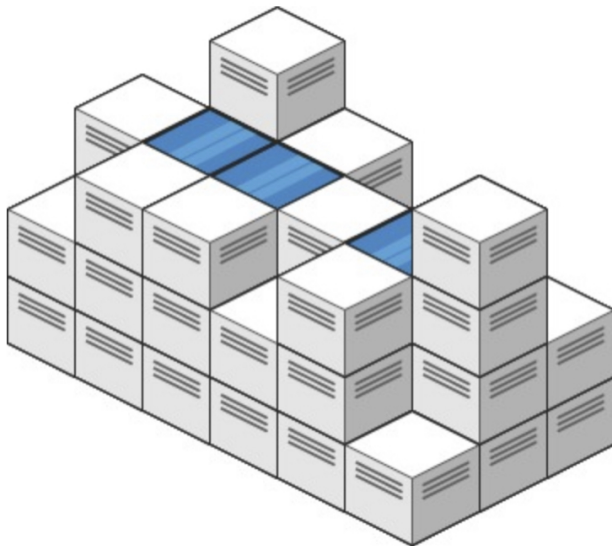
$$\text{output} += \max(0, 2 - 0) = 2$$

Figure 8: Structure element changes over the course of the algorithm

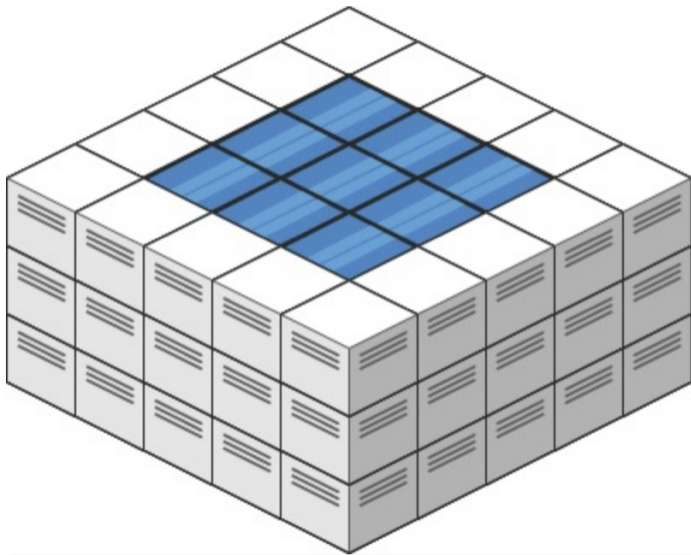
Extending this problem to 3D

- ▶ Can we extend this problem to 3D?
- ▶ The 3D problem requires an in-depth analysis of the problem.
- ▶ Let's see what it looks like

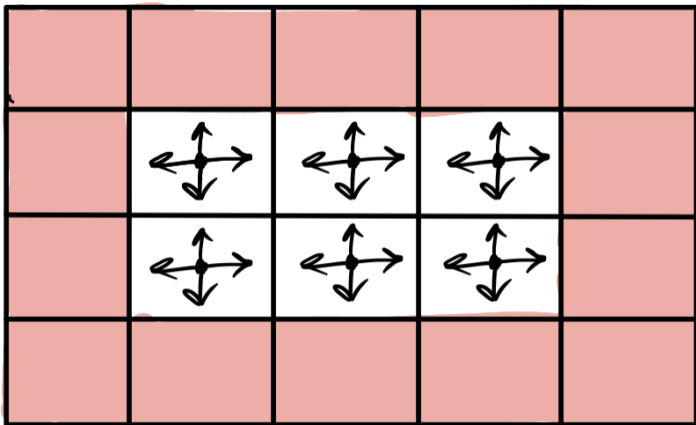
Problem 3: Visualization of the problem in 3D



Problem 3: Visualization of the problem in 3D



Problem 3: Intuitive understanding of the problem



- ▶ As discussed earlier, the amount of water that a cell can hold depends on the height of the smallest bar as its immediate neighbour i.e $\min(\text{height of 4 neighbours})$.

Problem 3: Solving it in 3D

Algorithm 9 3D solution using MinHeap/Priority Queue

```
1: Initialize a heap and add the elements of the edge to the heap
2: while heap!empty do
3:   if currentHeight > maxHeight then
4:     Add the element to the heap
5:   else
6:      $answer + = maxHeight - currentHeight$ 
7:     Loop over the neighbours to see if they're encountered before
8:     if !encountered then
9:       Recursive call
10:    end if
11:  end if
12: end while
```

Thankyou!