

Assignment 3

June 8, 2020 12:33 AM

Problem 1

• Intuition :

Binary Search can be used to solve this problem. If $A[mid] < mid$, we narrow our search to the right half. If $A[mid] > mid$, we narrow our search to the left half. If $A[mid] == mid$, the index is found. Otherwise, we return -1 to indicate that there is no such index.

e.g. When there is no such index

⑥ ① ② ③ ④ ⑤ ⑥ ⑦ ⑧ ⑨
[1, 3, 5, 7, 9, 11, 12, 20, 23, 90]
l m r

l m r

l r
m

r l \rightarrow there is no such index

e.g. When such index exists

⑥ ① ② ③ ④ ⑤ ⑥ ⑦ ⑧ ⑨
[-3, -1, 0, 3, 5, 16, 29, 40, 50, 66]
l m r

l m r

l m r

$\begin{matrix} l & r \\ m \end{matrix}$ $A[m] == m$; target found.

• PseudoCode

```
FIND_INDEX (A[], int index) {  
    // corner cases
```

```
if (A == null || A.length == 0) return -1;
```

```
int left = 0;
```

```
int right = A.length - 1;
```

```
int mid;
```

```
while (left ≤ right) {
```

```
    mid = left + (right - left) / 2;
```

```
    if (A[mid] == mid) {
```

```
        return mid;
```

```
    }
```

```
    if (A[mid] < mid) {
```

```
        left = mid + 1;
```

```
    } else {
```

```
        right = mid - 1;
```

```
    }
```

```
}
```

```
return -1;
```

```
}
```

• Time Complexity Analysis

This is a classical binary search approach; every time, the problem size is reduced by half, and the additional operations for each subproblem takes $O(1)$. (Just comparisons)

the recurrence relation is: $T(n) = T(n/2) + 1$

$$\Rightarrow O(n) = \log N$$

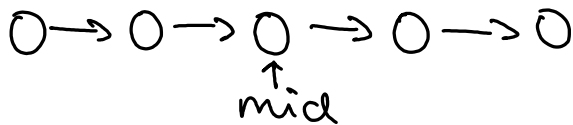
Problem 2

• Intuition:

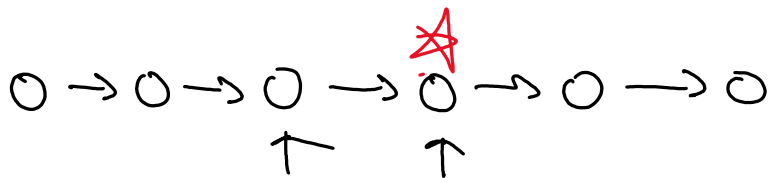
This problem is equivalent to "randomly sorting" a linked list. We can first use merge sort to sort a linked list, and modify the algorithm such that instead of merging by

value (i.e. always taking the smaller value first), we merge in a random fashion

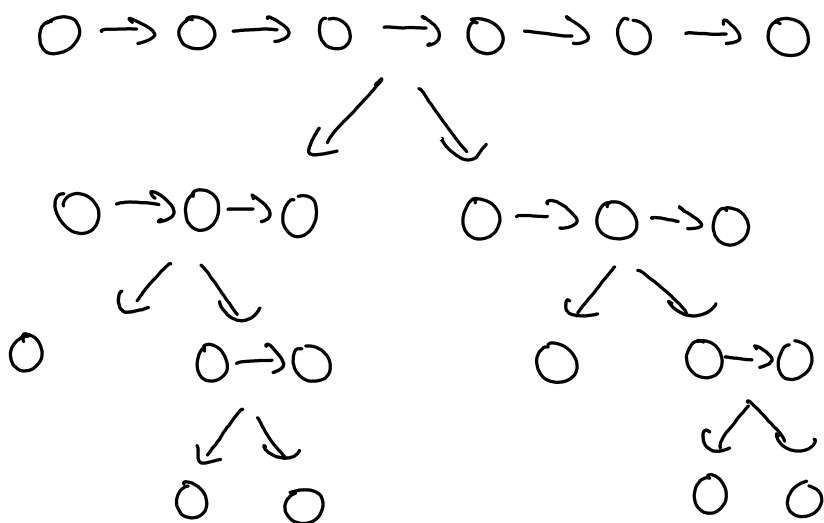
In order to perform mergesort on a linked list, need to find the middle node of the list. It is easy when there is an odd number of nodes:



But what if there is an even number of nodes?



the middle node can be either of these two; in this problem, we select the rightmost middle node.



Divide until there's only one node left in each list. Then, we begin the merging process, instead of taking the node with the smaller value first, we can use a random number generator to decide whether the next node to be appended will come from the first list or the second list. And for lists with an odd number of nodes, depending on which of the lists is longer, we append the left-out node to the end of the resulting linked list and return the list

• Pseudocode

```
SORT_LIST(ListNode head){
```

```
// base cases
```

```
if(head == null || head.next == null) return head;
```

```
// Find midpoint
```

```
ListNode slow = head;
```

```
ListNode fast = head;
```

```
// store the new left end
```

```
ListNode temp = head;
```

```
while (fast != null && fast.next != null){
```

```
    temp = slow;
```

```
    slow = slow.next;
```

```
    fast = fast.next.next;
```

```
}
```

```
temp.next = null;
```

```
ListNode left = SORT_LIST(head);
```

```
ListNode right = SORT_LIST(slow);
```

```
return MERGE_RANDOM(left, right);
```

```
}
```

```
MERGE_RANDOM(ListNode left, ListNode right){
```

```
    ListNode res = new ListNode(0);
```

```
    ListNode cur = res;
```

```
while (left != null && right != null){
```

```
    int rand = (int)(Math.random * 2);
```

```
    if (rand == 0){
```

```
        cur.next = left.next;
```

```
        left = left.next;
```

```
    } else {
```

```
        cur.next = right.next;
```

// rand will be
either 0 or 1

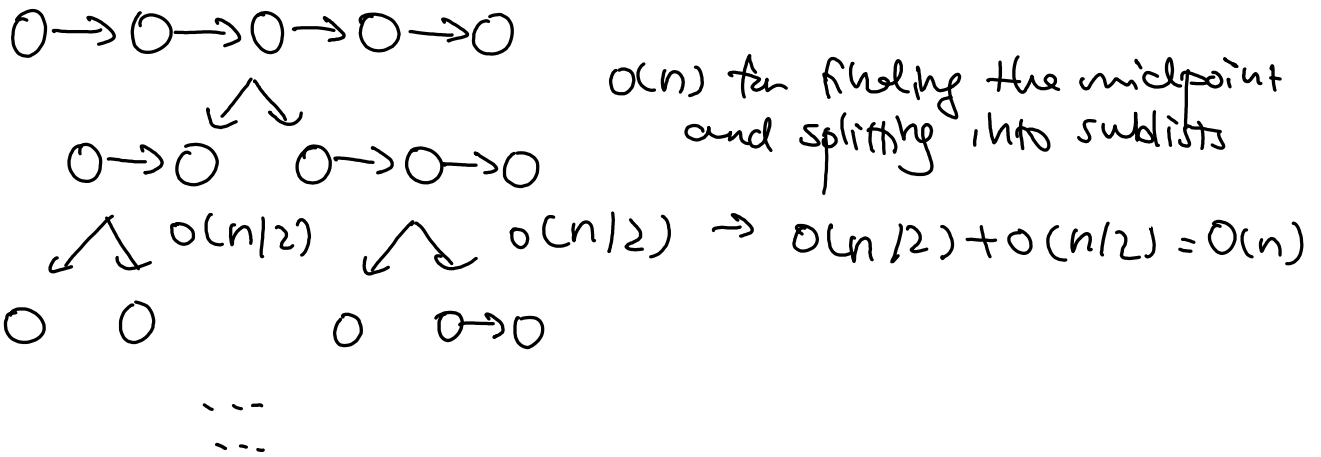
```

    cur = cur.next;
    right = right.next;
}
cur = cur.next;
}

if (left != null) cur.next = left;
if (right != null) cur.next = right;
return res.next;
}

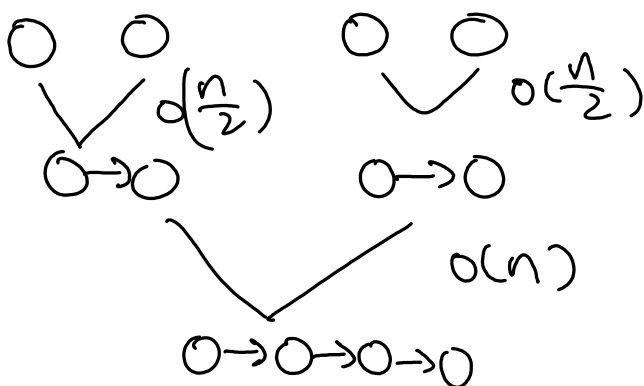
```

Time Complexity analysis



There is a total of $\log n$ levels, work done in each level takes $O(n)$, \therefore the time complexity for dividing the nodes: $O(n \log n)$

For merging, need to use two pointers to iterate through n nodes.



A total of $\log n$ levels; each merging takes $O(n)$; the merging process also takes $O(n \log n)$. Overall time complexity: $O(n \log n)$

$O(n \log n)$

Space Complexity analysis:

At any time, the deepest level possible of the call stack is $O(\log N)$, in addition to this, we used constant space for creating new ListNodes, \therefore the space complexity is $O(\log N)$.

Problem 3

Intuition:

We can use two pointers, i and j , initially pointing to the 1st element of each array (A and B) respectively. When the number that i points to is smaller, we advance i (and $k--$), and when the number that j points to is smaller, we advance j (and $k--$). After k moves, we will be at the k^{th} smallest element. This approach is not ideal because its time complexity is $O(n+m)$; the worst case happens when k is large.

Optimization: Since the arrays are sorted, can make use of binary search.

Suppose

$A = [1, 3, 5, 7, 9]$

$B = [2, 4, 6, 8, 10, 12]$ and $k = 6$.

A and B merged:

$1, 2, 3, 4, 5, \textcircled{6}, 7, 8, 9, 10, 12]$
↓
should return 6

(truncating down)

check the middle element of each array first

check the number element in each array first:

$$A = \begin{matrix} \textcircled{1} & \textcircled{2} & \textcircled{3} & \textcircled{4} & \textcircled{5} \\ [1, & 3, & 5, & 7, & 9] \end{matrix}$$

$$B = \begin{matrix} \textcircled{1} & \textcircled{2} & \textcircled{3} & \textcircled{4} & \textcircled{5} & \textcircled{6} \\ [2, & 4, & 6, & 8, & 10, & 12] \end{matrix}$$

the sum of their indexes is $3+2=5$, which is smaller than 6. Now, we have to compare $A[\text{mid}]$ with $B[\text{mid}]$; since the arrays are sorted and $A[\text{mid}] < B[\text{mid}]$, it means that all other numbers to the left of $A[\text{mid}]$ in A are smaller than $B[\text{mid}]$ as well, and since we still haven't reached the k th element when we reached $B[\text{mid}]$, it means that all values to the left of $A[\text{mid}]$ in A can be discarded. And $k=3$.

$$A = \begin{matrix} & & & \textcircled{4} & \textcircled{5} \\ [1, & 3, & 5, & 7, & 9] \end{matrix}$$
$$B = \begin{matrix} \textcircled{1} & \textcircled{2} & \textcircled{3} & \textcircled{4} & \textcircled{5} & \textcircled{6} \\ [2, & 4, & 6, & 8, & 10, & 12] \end{matrix}$$

sum of indices = 7
 $7 > 3$; since we already surpassed k , and $A[\text{mid}] > B[\text{mid}]$, all numbers to the right of $A[\text{mid}]$ are even larger, we can discard all numbers to the right of $A[\text{mid}]$.

$$A = \begin{matrix} \textcircled{4} & \textcircled{5} \\ [7, & 9] \end{matrix}$$
$$B = \begin{matrix} \textcircled{1} & \textcircled{2} & \textcircled{3} & \textcircled{4} & \textcircled{5} & \textcircled{6} \\ [2, & 4, & 6, & 8, & 10, & 12] \end{matrix}$$

sum of indices = 7
 $7 > 3$ and $A[\text{mid}] > B[\text{mid}]$; now we stop considering array A

$$B = \begin{matrix} \textcircled{1} & \textcircled{2} & \textcircled{3} & \textcircled{4} & \textcircled{5} & \textcircled{6} \\ [2, & 4, & 6, & 8, & 10, & 12] \end{matrix}$$

Return $B[k]$, which is 6.

Pseudocode

FIND_KTH_SMALLEST($A[]$, $B[]$, $\text{int } A_{\text{start}}$, $\text{int } A_{\text{end}}$,
 $\text{int } B_{\text{start}}$, $\text{int } B_{\text{end}}$,
 $\text{int } k$)

```
int Alen = Aend - Astart;  
int Blen = Bend - Bstart;
```

// base cases

```
if (k <= 0 && k > (Alen + Blen)) {  
    error: out of bound; invalid k  
}
```

```
if (Alen == 0) return B[Bstart + k];  
if (Blen == 0) return A[Astart + k];
```

```
int AmidInd = Alen / 2;  
int BmidInd = Blen / 2;  
int Amid = A[Astart + AmidInd];  
int Bmid = B[Bstart + BmidInd];
```

```
if ((AmidInd + BmidInd) < k) {  
    return (Bmid < Amid) ?
```

```
    FIND_KTH_SMALLEST(A[], B[],  
                        Astart, Aend,  
                        Bstart + BmidInd + 1, Bend,  
                        k - (BmidInd + 1)) :
```

```
    FIND_KTH_SMALLEST(A[], B[],  
                        Astart + AmidInd + 1, Aend,  
                        Bstart, Bend,  
                        k - (AmidInd + 1)) ;
```

```
} else {
```

```
    return (Bmid < Amid) ?
```

```
    FIND_KTH_SMALLEST(A[], B[],  
                        Astart, Astart + AmidInd,  
                        Bstart, Bend, k) :
```

```
    FIND_KTH_SMALLEST(A[], B[],  
                        Astart, Aend,  
                        Bstart, Bstart + BmidInd, k) ;
```


}

Time Complexity Analysis:

Every time half an array is discarded, the problem size is reduced by half, and the rest of the operation takes constant time; this happens for both arrays, \therefore the overall time complexity is $O(\log n + \log m)$.

Problem 4

Intuition:

Usually, we run binary search to check whether a number is present in a sorted integer array. However, in order to do that, we need to know the "right boundary" of the binary search. Therefore, the first step in solving this problem would be finding the portion of the array in which we should be running binary search, and then we can run the classical binary search to find the target index, or return -1 if the target integer is not in the array.

e.g. $A = [1, 3, 5, 7, 9, 11, 13, 15, \infty, \infty, \infty, \infty, \infty, \dots]$

First, we set the left boundary to be 0 and the right boundary to be 1; at any time, if $A[\text{right}] < \text{target}$, we know that the target is not in our current range now, so we change the position of right boundary from i to $2i$; if $A[\text{right}] > \text{target}$ or we encounter a ∞ , we have found the boundary.

Suppose target = 15:

$A = [1, 3, 5, 7, 9, 11, 13, 15, \infty, \infty, \infty, \infty, \infty, \infty, \dots]$

$l=0 \quad r=1$

$l=1 \quad r=2$

$l=2 \quad r=4$

$l=4$

$r=8 \neq \infty$! we have found the

portion to perform
binary search:

$A = [1, 3, 5, 7, 9, 11, 13, 15, \infty]$

Then, we run classical binary search on A .

- **Pseudocode** (assembly that when the number is not found, we return -1, and we represent " ∞ " with "null")

```
FUNC_RANGE (A[], int target){  
    int left = 0;  
    int right = 1;  
    while (A[right] < target){  
        left = right;  
        right = 2 * right;  
    }  
    BINARY_SEARCH (A[], 0, right, target);  
}
```

```
BINARY_SEARCH (A[], int left, int right, int target){  
    int l = left;  
    int r = right - 1;  
    int mid;  
  
    while (l ≤ r){  
        mid = left + (right - left) / 2;  
        if (A[mid] != null && A[mid] == target){  
            return mid;  
        } else if (A[mid] != null && A[mid] > target){  
            right = mid - 1;  
        } else {  
            left = mid + 1;  
        }  
    }  
    return -1;  
}
```

Time Complexity Analysis

This algorithm consists of two parts: finding the range and performing binary search. When finding range, every time $A[\text{right}] < \text{target}$, we multiply the right index by 2, \therefore in the worst case, it will take $\log N$ steps to find the correct bounding. (i.e. in the worst case, after $\log N$ jumps, n being the number of integers currently in array, $A[\text{right}]$ will either be a number greater than the target, or " ∞ ". So we know that we have found the boundary. Classical binary search takes $O(\log n)$, \therefore the overall time complexity is $O(\log N)$.

When $n=8$ and $\text{target}=27$:

$[1, 3, 7, 9, 10, 18, 27, 30, \infty, \infty, \infty, \infty, \dots]$

init: $l \quad r$

1st jump: $l \quad r$

2nd jump: $l \quad r$

3rd jump: $l \quad r$

Found range for binary search in $\log_2 8$ jumps.

Problem 5

Intuition:

We can use elimination to narrow down the search range until we find the target or conclude that the target is not in the 2D matrix (return $[-1, -1]$).

e.g. $[$

$[1, 4, 7, 11, 18]$

① Suppose we start from this index; $A[\text{index}] > \text{target}$, therefore we can eliminate all values in the same

$[2, 5, 8, 12, 14]$, column, as they will be even larger
 $[3, 6, 9, 16, 22]$, then the target
 $[10, 13, 14, 17, 24]$,
 $[18, 21, 23, 26, 30]$

]

target = 5

- ② look at the next column; $A[\text{index}]$ is still larger than the target, \therefore we can eliminate this column too.
- ③ Same for this column.
- ④ Because $A[\text{index}] < \text{target}$ and all elements to the right of it are already eliminated, the 1st row can be eliminated completely since the value(s) to its left side are even smaller
- ⑤ Found 5.

• **Pseudocode** returns the coordinates of the target if it is in the matrix, otherwise, return $[-1, -1]$.

SEARCH-MATRIX (matrix $[][]$, int target) {

// corner cases

if (matrix == null || matrix.length == 0 ||
 matrix[0] == null || matrix[0].length == 0) {
 return new int[] {-1, -1};
}

}

int row = 0;

int col = matrix[0].length - 1; // always start from the top
 // right corner

if (matrix[row][col] == target) {
 return new int[] {row, col};
}

}

if (matrix[row][col] > target) { // all elements in the current
 col--; // column can be eliminated
} else { // all elements in the current row can be eliminated
 row++;
}

}

return new int[] {-1, -1}; // if not found

}

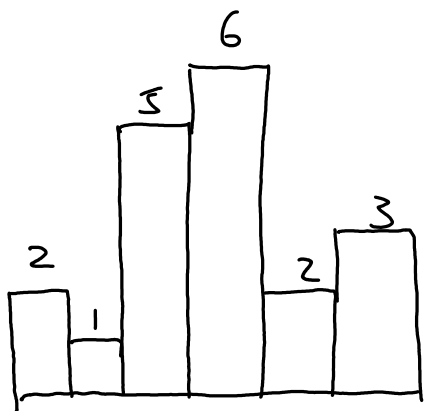
Time Complexity Analysis

$O(m+n)$ there are m rows and n columns in the matrix and every time we can check & eliminate one row or one column; in the worst case, the number of checks can be $\# \text{rows} + \# \text{columns}$, hence the time complexity is $O(m+n)$.

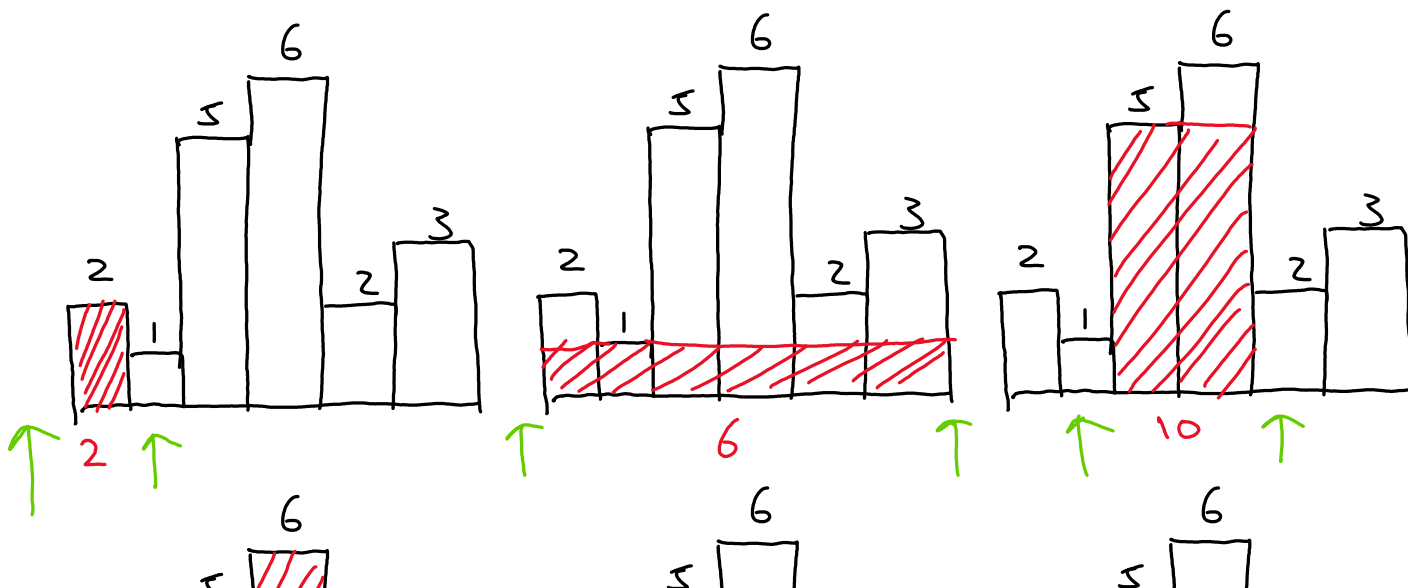
Problem 6

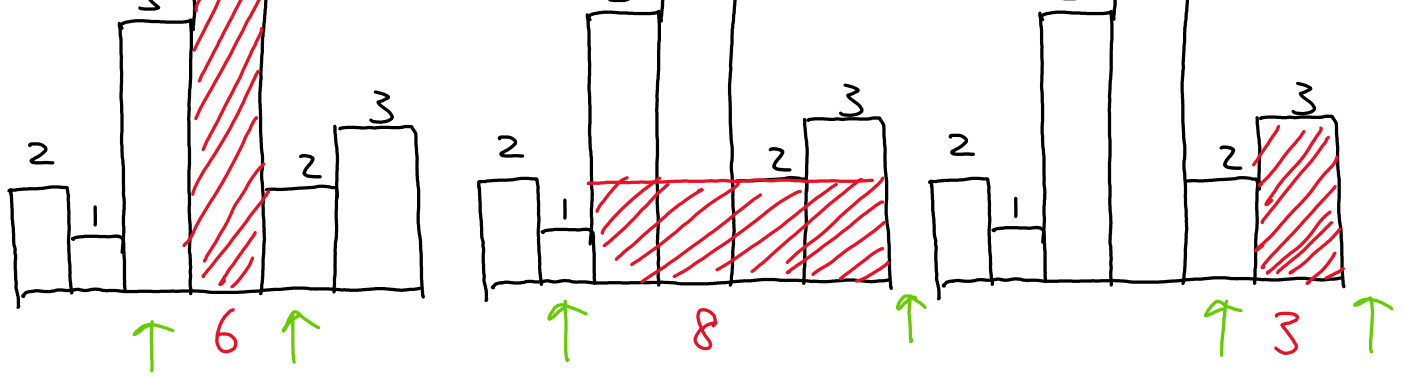
Intuition

e.g. $[2, 1, 5, 6, 2, 3]$



We can look at each bar separately; calculate the maximum area of rectangle based on its height; the maximum value among those areas would be the solution to the problem.





In order to calculate these areas, we must find these boundaries (indicated by the green arrows). Therefore, everytime that we encounter a bar with height less than the previous one, we know that we've hit a boundary. A stack can be used here: we keep adding more bars (i.e. increasing the width) until reaching a bar with smaller height.

. Pseudocode

LARGEST_RECTANGLE_IN_HISTOGRAM(heights[])

// base cases

if (heights == null || heights.length == 0) return 0;

int maxArea = 0; // update the maximum area to date
// when necessary

Stack<Integer> stack = new Stack<>();

int right, left, h;

↑
index of
right
boundary

↑
index of
left
boundary

↑
index of maximum height
of the current rectangle

Keep adding bars as long as
their heights are
increasing

for (int i = 0 ... heights.length - 1)

if (stack.isEmpty() || heights[i] ≥ heights[stack.peek()])

stack.push(i);

} else {

right = i; // right boundary

h = stack.pop(); // the max height possible

left = stack.isEmpty() ? -1 : stack.peek();

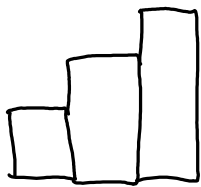
↓
// the left boundary;

// -1 for cases like this

// 

```
maxArea = Math.max(maxArea,  
                    (right - left - 1) * heights[ch]);  
i--; // because for loop is increased by one each time  
    // and we haven't checked the current index yet  
}  
}
```

// At this point, all we have are bars with increasing
// lengths; they have a common right boundary:



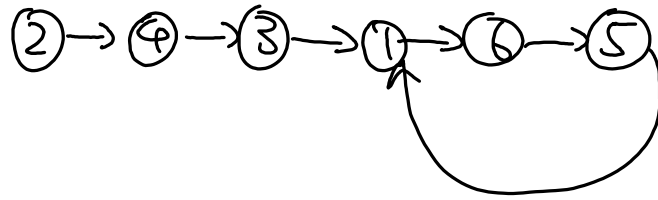
right = stack.peek() + 1

```
right = stack.peek() + 1;  
while (!stack.isEmpty()) {  
    h = stack.pop();  
    left = stack.isEmpty() ? -1 : stack.peek();  
    maxArea = Math.max(maxArea,  
                        (right - left - 1) * heights[ch]);  
}  
return maxArea;  
}
```

• Time Complexity Analysis:

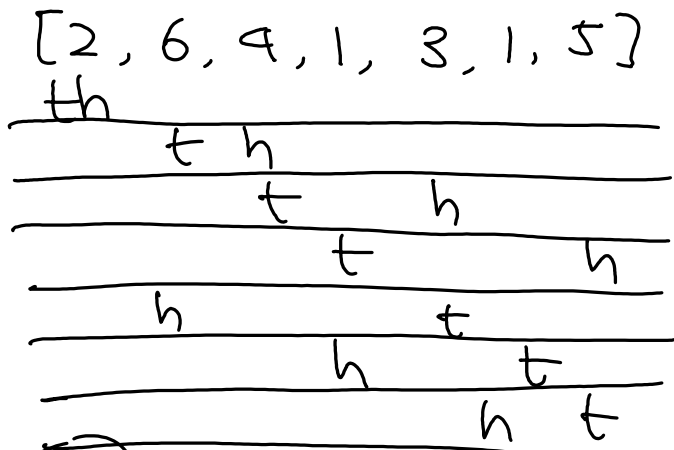
This algorithm iterated through each bar (i.e. each entry in the array); and for each bar, we did constant time operations such as comparing, popping out from the stack, calculating area... ∴ this algorithm runs in linear time $O(n)$.

$A[0] = 2$
 $A[2] = 4$
 $A[4] = 3$
 $A[3] = 1$
 $A[1] = 6$
 $A[6] = 5$
 $A[5] = 1$

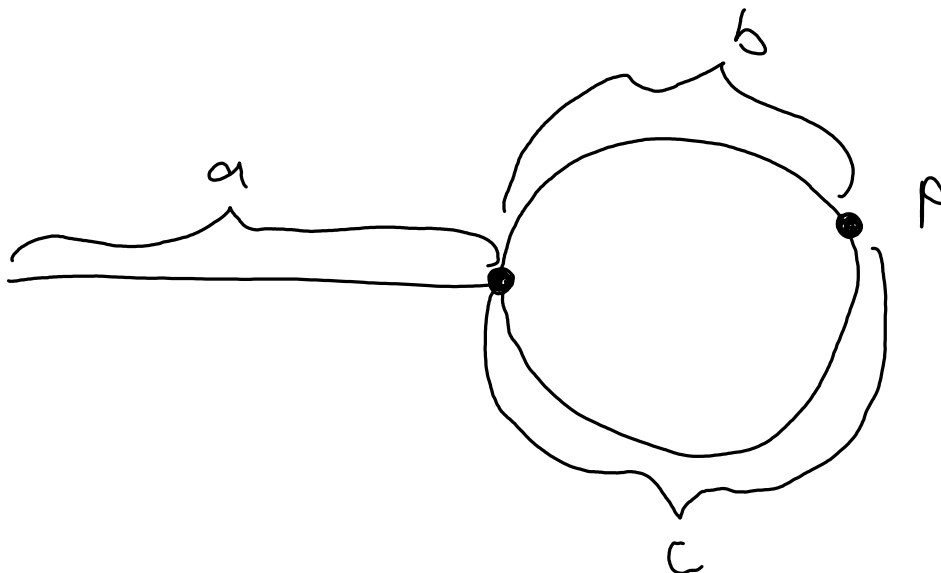


A cycle appears because A contains duplicates. And the duplicate node is the cycle entrance.

Floyd's algorithm makes use of two pointers: tortoise, which is analogous to a slow pointer, and hare, which is analogous to a fast pointer. We let the hare move 2 times as fast as the tortoise.



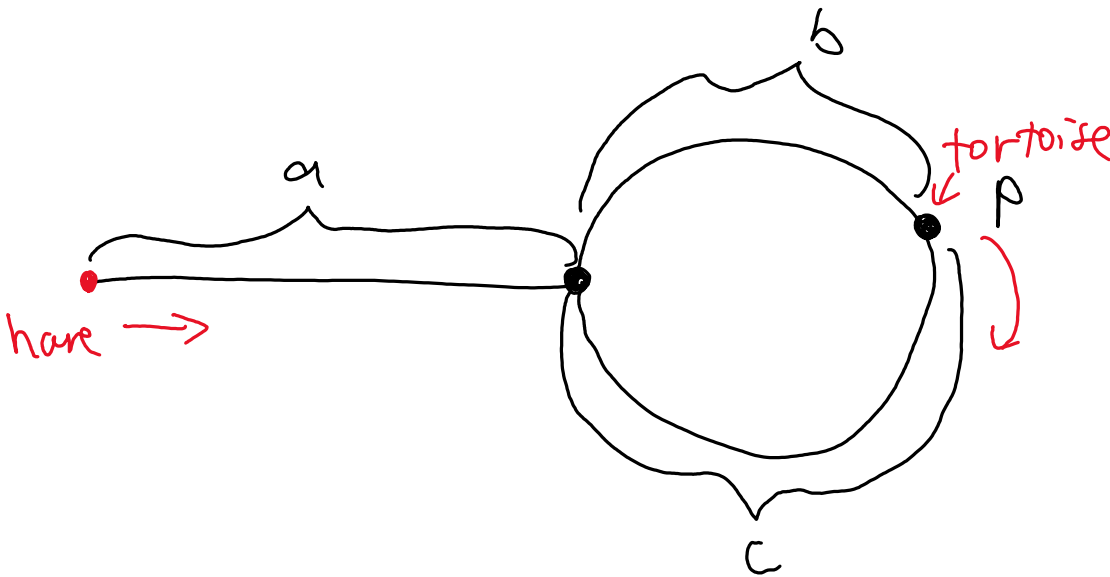
$\text{th} \rightarrow t \text{ and } h \text{ meet at } A[0]$



• In a more general case, since the hare moves 2 times faster than the tortoise, it enters the loop first. By the time that tortoise and hare meet at p , the tortoise has travelled $a+b$, and the hare has travelled $a+2b+c$. Since $\text{distance}(\text{hare}) = 2 * \text{distance}(\text{tortoise})$:

$$a+2b+c = 2(a+b)$$

$$\boxed{a=c}$$



Next, we reset the hare to the starting point and leave tortoise at the current intersection point. And now we set $\text{speed}(\text{hare}) = \text{speed}(\text{tortoise})$; then they meet again (after traveling the same distance) at the loop entrance.

• Pseudocode

```
FIND_DUPLICATE_NUM (A[]) {
```

```
    int t = A[0];
```

```
    int h = A[0];
```

```
    do {
```

```
        t = A[t];
```

```
        h = A[A[h]];
```

```
    } while (t != h);
```

// Now, tortoise & hare intersect for the 1st time.

```

h = A[t];
while (t != h) {
    h = A[h];
    t = A[t];
}
return h;
}

```

• Analysis

Time: $O(n)$ → This is a linear-time algorithm; we used two pointers to traverse the array.

Space: $O(1)$ → Constant space complexity since we only initialized some variables; no new data structures initialized.

Problem 8

• Intuition:

$$A = \begin{bmatrix} B & C \\ D & E \end{bmatrix}$$

$$AA = \begin{bmatrix} B & C \\ D & E \end{bmatrix} \begin{bmatrix} B & C \\ D & E \end{bmatrix}$$

According to the Strassen's algorithm, we can break two 2×2 matrices into eight 1×1 matrices and perform the matrix multiplication blockwise.

$$AA = \begin{bmatrix} B & C \\ D & E \end{bmatrix} \begin{bmatrix} B & C \\ D & E \end{bmatrix} = \begin{bmatrix} BB + CD & BC + CE \\ DB + ED & DC + EE \end{bmatrix}$$

In order to compute the result using only 5 multiplications, we need to come up with 5 matrices such that each sum of matrices in AA can be represented as a sum/subtraction

among two or more of the 5 matrices.

$$\begin{bmatrix} BB+CD & BC+CE \\ DB+ED & DC+EE \end{bmatrix} = \begin{bmatrix} \overset{1^{st}}{B^2} + \overset{2^{nd}}{CD} & \overset{3^{rd}}{C(B+E)} \\ \overset{4^{th}}{D(B+E)} & CD + \overset{5^{th}}{E^2} \end{bmatrix}$$

∴, we only need 5 multiplications to compute the square of a 2×2 matrix.

Time Complexity analysis:

- 5 subproblems
- original problem: multiplying two 2×2 matrices
- new subproblems: multiplying two 1×1 matrices

Master's theorem
 $a = 5$

$$b = 2$$

What is c ?

∵ since we know that we are dealing with 2×2 matrices and the size of each submatrix is 1×1 , computing the product of each of the 5 submatrices takes $O(1)$ only, since the calculations only consists of multiplying two numbers together, or adding two numbers and multiply it against another number in the worst case (e.g. $C(B+E)$). ∴ $c = 1$ (i.e. the additional time spent on each subproblem is constant).

$$\text{Recurrence relation: } T(n) = 5T\left(\frac{n}{2}\right) + 1$$

$$\log_2 5 > 2, \quad T(n) = O(n^{\log_2 5})$$

Conclusion: Yes, we can say that the running time is $O(n^{\log_2 5})$.