

Time Complexity 2



AGENDA:

- Asymptotic Analysis
- Big O
- Issues with Big O
- Space complexity
- TLE

Comparing Algorithms

Given an array, sort it.

Sachin
Supersort

10 sec
Macbook M2

10 sec
Python

5 sec
Hill station

5 sec

Both on Mac M2

Both on C++

Both on hill station

Aravay
Awesome-sort

15 sec
Old Laptop - Windows 98

7 sec
C++

7 sec
Close to volcano

5 sec

Same

Execution Time - Not a reliable measure of performance for algo's

→ It depends on external factors

→ SW / HW / Environment

for (i=0; i<N; i++) {

→ N iterations

==

}

No of iterations is independent of external factors

Angeline

$100 \log_2 N$

Shubhankur

$N/10$

Before ISSO

Shubhankur preferred

After ISSO

Angeline preferred

Overall

-

Angeline's algo
is more efficient

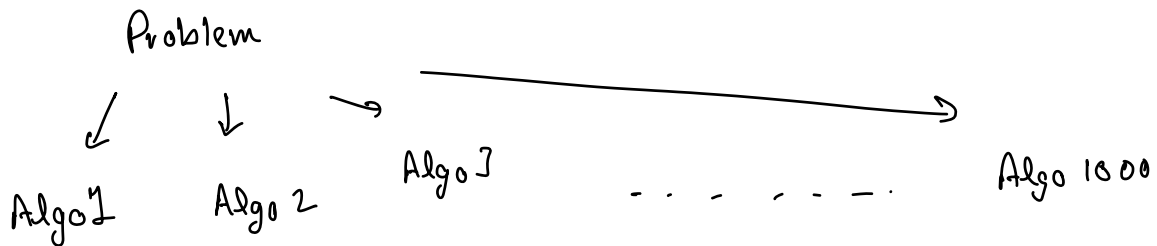
Hotstar - 2×10^8 people

Google - 10^8 search results in 0.012 s

Despacito - 7B+

Huge data

Increasing



Graph method is not possible to
Compare.

Asymptotic Analysis of Algorithms

Observing performance of algorithms for very large inputs.

↳ Big O

Comparisons using Big O notation

$$\begin{array}{c} \text{Angeline} \\ 100 \log_2 N \\ \hline \downarrow \\ O(\log_2 N) \end{array}$$

Better

$$\begin{array}{c} \text{Shubhankur} \\ N/10 \\ \hline \downarrow \\ O(N) \end{array}$$

- 1) Calculate the no of iterations
- 2) Neglect all lower order terms
- 3) Neglect constant coefficients

Why neglect lower order terms ?

Algo : $N^2 + 10N$ ← Lower order

% contribution of lower order term

$$N=100 \rightarrow 10^4 + 10^3$$

$$\frac{10^3}{10^4 + 10^3} \times 100 = 9.09\%$$

$$N=10^4 \rightarrow 10^8 + 10^5$$

$$\frac{10^5}{10^8 + 10^5} \times 100 = 0.1\%$$

Contribution of lower order terms is significantly small for larger inputs

Negligible

Why neglect constant coefficient ?

Manaswini

$$10 \log_2 N$$

$$10^2 \log_2 N$$

$$10^3 \log_2 N$$

$$10^4 \log N$$

Sufyan

$$N$$

$$N$$

$$N$$

$$10N - 10^3$$

Issues with Big-O

Issue 1

	<u>Ajith</u>	<u>Abin Das</u>	<u>More efficient</u>
	$100N$	N^2	
$N = 50$	100×50	50×50	Abin Das
$N = 80$	100×80	80×80	Abin Das
$N = 100$	100×100	100×100	Same
$N = 120$	100×120	120×120	Ajith
$N = 150$	100×150	150×150	Ajith
	\downarrow $O(N)$	\downarrow $O(N^2)$	

Big O doesn't give you complete picture.
Big O comparison is not true for all input sizes.

Issue 2

Vignesh

$$N^2 + 10N$$

$$\downarrow$$
$$O(N^2)$$

Manikanta

$$2N^2 + 5N$$

$$\downarrow$$
$$O(N^2)$$

Issue: Comparison says \rightarrow Both are same

$$N^2 + 10N$$

$$2N^2 + 5N$$

Note: Big O will solve 99% of your problems

Linear Search

for ($i=0; i < N; i++$)

if ($arr[i] == x$)
return true

return false

Best - $O(1)$

Worst - $O(N)$

Default - worst

Space Complexity

Break till 10:14 AM

Amount of extra space taken by your algorithm.

Extra
space

Q1

```
func (int N) {  
    int x = N  
    int y = x + x  
    int z = x + y  
}
```

int - 4 bytes

3 x 4 = 12 bytes

Constant

↓
 $O(1)$

Q2

```
func (int N) {
```

```
    int x = N
```

```
    int y = x2
```

```
    int z = x + y
```



```
    → arr[] = int[N]    ← Array of integers
                        ↑
                    size of array
}
```

Quiz 1

4B + 4B + 4B + 4N bytes

= (12 + 4N) bytes



O(N)

Q3

```
func (int N) {
```

```
    int x = N    - 4 bytes
```

```
    int y = x2  - 4 bytes
```

```
    int z = x + y - 4 bytes
```

```
    arr[] = int[N]    ← 4N bytes
                        ← 1D Array of size N
```

```
    l[][] = int[N][N] ← 2D Array of N x N
                        ← 4N2 bytes
```

```
}
```

Total = (4 + 4 + 4 + 4N + 4N²) bytes



O(N²)

Quiz 2

Q4

```
sumOf Array ( int arr[], int N ) {  
    sum = 0  
    for ( i = 0 ; i < N ; i++ ) {  
        sum = sum + arr[i]  
    }  
    return sum  
}
```

Array of int
↓

Size of array
↓

- 4B

- 4B

Total extra
space

= (4 + 4) bytes

= 8 bytes

↓

$O(1)$

Q5

Quiz 3

What is the space complexity of the `abc()` function of the following code snippet, assuming the input matrix is of size $N \times M$?

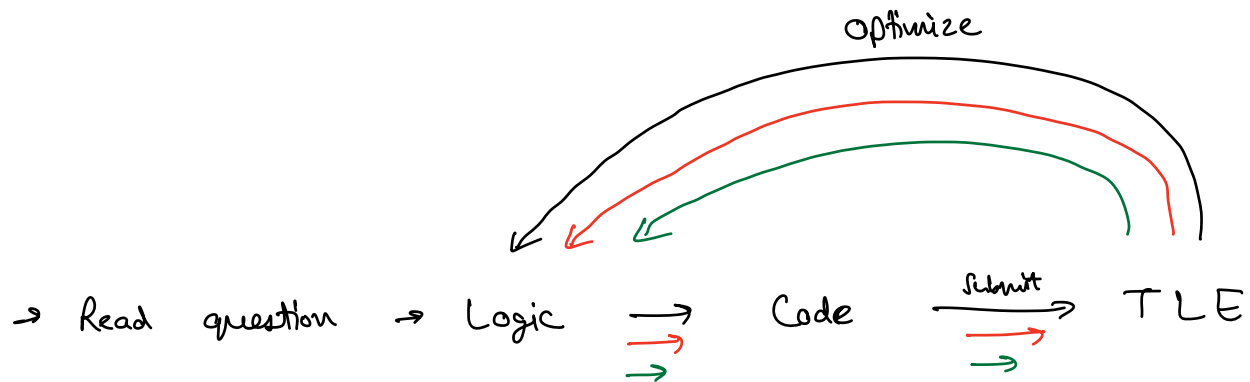
```
1 class Main {  
2  
3     static int[] abc(int[][] a) {  
4         int rows = a.length;  
5         int cols = a[0].length;  
6         int[] copy = new int[rows * cols]; ←  $N \times M$   
7         int k = 0;  
8         for (int i = 0; i < rows; i++) {  
9             for (int j = 0; j < cols; j++) {  
10                copy[k] = a[i][j];  
11                k++;  
12            }  
13        }  
14        return copy;  
15    }  
16  
17    public static void main(String args[]) {  
18        int[][] a = { { 2, 7, 9 }, { 0, 1, 5 } };  
19        int[] b = abc(a);  
20        for (int x : b) {  
21            System.out.print(x + " ");  
22        }  
23    }  
24 }  
25
```

```
1 def abc(a):  
2     rows = len(a)  
3     cols = len(a[0])  
4  
5     copy = [0] * (rows * cols) ←  $N \times M$   
6     k = 0  
7     for i in range(rows):  
8         for j in range(cols):  
9             copy[k] = a[i][j]  
10            k += 1  
11  
12     return copy  
13  
14  
15 def main():  
16     a = [[2, 7, 9], [0, 1, 5]]  
17     b = abc(a)  
18     print(b)  
19  
20  
21     main()  
22
```

Extra space $O(N \times M)$

TLE - Time Limit Exceeded

Google Contest → 2 hrs
3 Questions



// Check whether TLE

without even writing a single line of code

Online Judges → Their servers → 1 GHz

Time limit - 1 sec

↓
 10^9 operations / second

At max, our code can have

10^9 operations

Operation - Variable declaration, +, -, ÷, x, %

```
for ( i=0; i < N; i=i+1 ) {  
    if ( i%2 == 1 )  
        print(i)  
}
```

Loop

Operations

1 + 5N

Assumption

1 iteration → 10 operations

10^8 iterations → 10^9 operations

At max, our code can have

10^8 iterations

(Approx)

Process to solve

1) Read & understand the question

2) Logic

3) Checking correctness
Try it for multiple testcases

4) Check if TLE occurs

↓ If no TLE

5) Write code & execute

If TLE



Importance of constraints

Eg

$$1 \leq N \leq 10^6$$

$$1 \leq arr[i] \leq 10^8$$

Algo - $O(N^2)$ time

$$N = 10^6$$

→

10^{12} iterations

1 sec → 10^8 iterations

TLE

Eg

$$1 \leq N \leq 5 \times 10^3$$

Algo - $O(N^2)$ ← Not optimized

$$N = 5 \times 10^3$$

$$N^2 \Rightarrow (5 \times 10^3)^2 = 25 \times 10^6 < 10^8$$

Will work

No TLE

Eg

$$1 \leq N \leq 5 \times 10^2$$

Algo: $O(N^3)$ time

Rare

$$N = 5 \times 10^2$$

$$N^3 = 125 \times 10^6$$

$$= 1.25 \times 10^8 \text{ iterations}$$

Can't be said

$\approx 10^8$ iterations

↙
It might
work

→
It might
not work

Corner
Case

Doubts

Thank
you

C++ \rightarrow Compiled language

Python \rightarrow Interpreted language

Python \rightarrow C++ \rightarrow

$\frac{10^8}{N}$
 \uparrow
Cannot
be ignored

$$1 \leq N \leq 10^8$$

for $i \rightarrow [1, n]$
for $j \rightarrow [1, 3^i]$

i	j	Iterations
1	$1 \rightarrow 3^1$	$3^1 +$
2	$1 \rightarrow 3^2$	$3^2 +$
3	$1 \rightarrow 3^3$	$3^3 +$
\vdots		$\vdots +$
N	$1 \rightarrow 3^N$	$3^N +$

$$\text{Total} = 3^1 + 3^2 + 3^3 + \dots + 3^N$$

GP formula

10 operations \rightarrow 1 iteration

1 operation \rightarrow $\frac{1}{10}$ iteration

10^9 operations \rightarrow $\frac{1}{10} \times 10^9$ iterations
 $= 10^8$ iterations

10000 log x

10x - 10000

for (i=1; i <= n; i+=2)

$i \leq N$

i \rightarrow 1, 3, 5, 7, 9, 11, ...

Approx - $\frac{N}{2}$ iterations $\rightarrow O(N)$

$$\frac{N}{2} = \underbrace{\frac{1}{2}}_{\substack{\uparrow \\ \text{constant} \\ \text{coefficient}}} \times N$$

for $i \rightarrow [0, n-1]$
for $j \rightarrow [0, i]$

i	j	Iterations
0	0 \rightarrow 0	1
1	0 \rightarrow 1	2
2	0 \rightarrow 2	3
3	0 \rightarrow 3	4
\vdots		
n-1		

Total =
 $1 + 2 + 3 + 4 + \dots + N$

$$= \frac{N(N+1)}{2}$$

$$\begin{aligned} 1 &\leq N \leq 10^3 \\ 1 &\leq \text{arr}[i] \leq 10^8 \end{aligned}$$

$O(N^2)$ $O(\max(\text{arr}[i]))$

arr = []

for i → [0, n-1]
arr.append(i)

} Space - $O(N)$

O , Θ , Ω ,

→ Discrete mathematics

for (i=0; i < 100; i++)

==

$N = 100 \rightarrow 100$ iterations

$N = 10^{25} \rightarrow 100$ iterations

Does no of iterations depend on N ?

↳ No

Constant no of iterations = 100
Time - $O(1)$

main() {
 sum(N, m)
}

↑
Come from input

sum(a, b) {
 return arr[ats]
}

}
↓
Space - $O(N+M)$

Good
Night

Thank
You

Friday