

L13

Time & Space Complexity

For discord mail to support@learnyard.com

Recap

▶ Introduction, Variables, Operators, Input/Output

▶ Control Flow (if-else, loops), Methods/Functions

▶ Array Basics, Strings

▶ Object-oriented programming Concepts

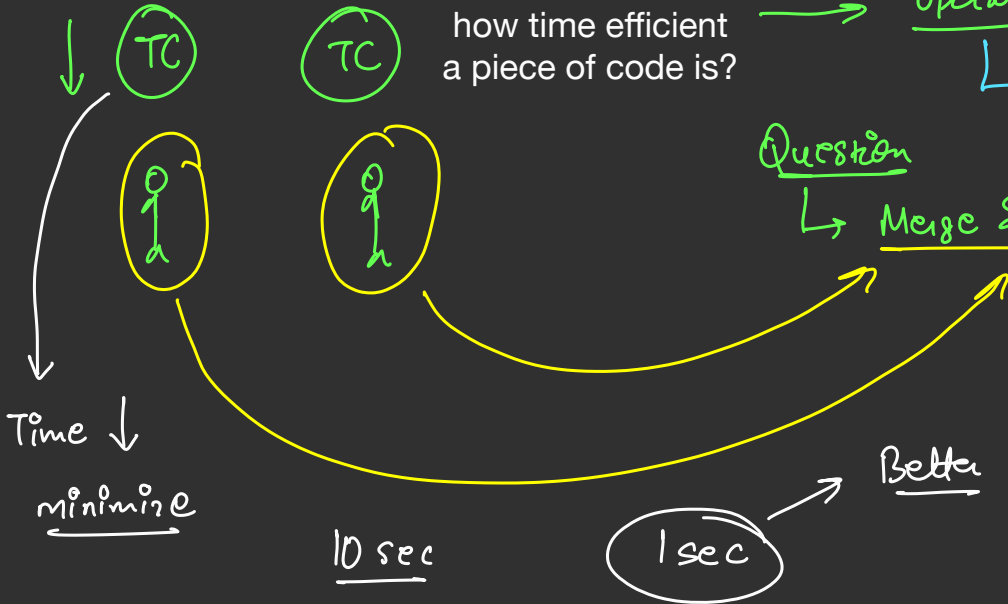
How to measure
how time efficient
a piece of code is?

Operations

↳ TC

Question

↳ Merge Sort



100GB RAM → 3.12

3.12 sec (16GB)
→ RAM

```
1 import java.io.*;
2 import java.util.*;
3
4 class PalindromeNumber {
5
6     // function
7     static boolean isPal(int n)
8     {
9         int ReversedNumber = 0;
10
11         int temp = n;
12         while(temp != 0)
13         {
14             int LastDigit = temp % 10;
15
16             ReversedNumber = ReversedNumber * 10 + LastDigit;
17
18             temp = temp / 10;
19         }
20
21         return ReversedNumber == n;
22     }
23
24     public static void main (String[] args) {
25
26         int number = 959;
27
28         System.out.println(isPal(number));
29
30     }
31 }
```

Palindrome

121 (121)



↓
3 min

RUN

10 min

⌵
2GB
5.12 sec

⌵
20GB
1.2 sec

But, the time taken also depends on:

never compare



Device



Programming Language

C++ >>

Java

```
Enter a number: 5
Factorial of N = 5 is 120.
logout
```

Input(s) given

Then, what's the right way to measure time complexity?

└─→ Operations

int a = 5; → 1 operation

cout << "System.out.println"
└─→ 1 single operation

max
operation



Rule #1

int a = 5; → 1

if (a > 4) → 1

{

print("Big"); → 1

}

else

{

→ 1

print("Less"); → 1

}

Example - Finding the sum of 1st N natural numbers

Loop → for

int sum = 0;

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

{

sum = sum + i;

}

print(sum);



N = 5

1 + 2 + 3 + 4 + 5

→ sum

max → N

SC → 1 → no data structure

Example - Finding the sum of 1st N natural numbers

formula

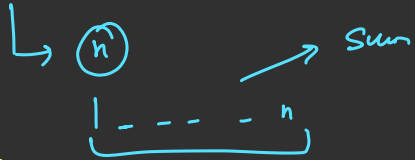
int sum = (n * (n + 1)) / 2 ;

print (sum);

max operation $\rightarrow 1$

$$\boxed{\frac{n * (n + 1)}{2}} \rightarrow$$

Sum of
N natural number



N = 5

$$\underline{1 + 2 + 3 + 4 + 5}$$

\hookrightarrow sum

[Brute Approach
Naïve Approach] → Basic Approach
↓
More operations

Optimal Approach → + Min DS
Less operations

[Microsoft
Google
Amazon] → DSA? → Problem Solving

Formal Definition

Time complexity is a measure of how the running time of an algorithm grows as the size of the input increases.

↳ Operations #1 → Max operation
#2 → ignore constant

Space Complexity → Data Structure

What about Space Complexity?

$q_1 \rightarrow \underline{\underline{\text{variable}}}$

73 bytes?

100 KB?

24 MB?

Data
structure

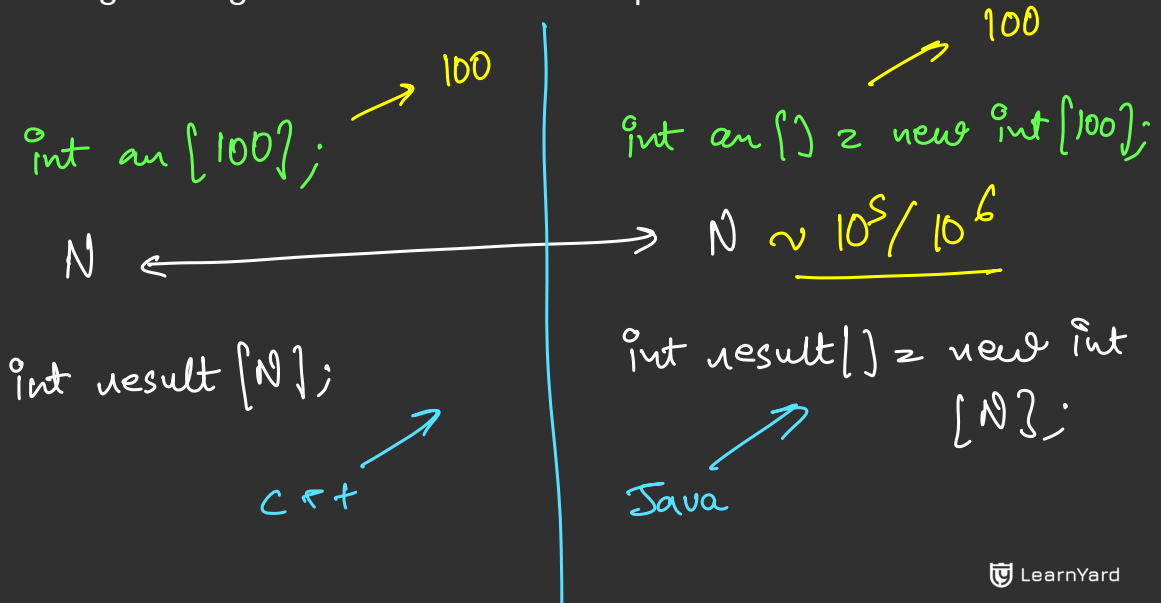
↓
number of elements

$q_1 \rightarrow 1000$

$q_1 \rightarrow \underline{\underline{10}}$

Similar to TC, this is not the right way

Space complexity measures how the memory/space required by an algorithm grows as the size of the input increases.



Example : Sum of 100 numbers

Variable

No data

structure

OP ≈ 1

int sum = (n * (n + 1)) / 2;

SC \rightarrow

DS X

TC ≈ 1

\rightarrow ①

N = 100

Sum $\rightarrow 1 \dots N$

1 + 2 - - - N
 \rightarrow sum

Different Notations

money



₹ 10000

\$ 10000

TC / SC → Notations

Big O

TC / SC → 1

O(1)

100%

O()

TC / SC

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

→ N times

{

for (int j = 1; j <= i; j++)

{

print(j);

}

}

1, 2, 3, ..., N

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

1 + 2 + 3 + 4 + ... + N

Here are some common time complexities (ordered best to worse):

1. $O(1)$: Constant time complexity



2. $O(\log n)$: Logarithmic time complexity

3. $O(n)$: Linear time complexity



4. $O(n \log n)$: Linearithmic time complexity

5. $O(n^2)$: Quadratic time complexity



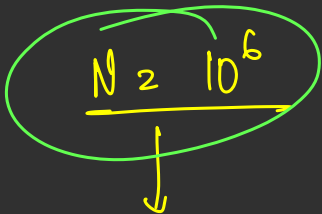
~~6.~~ $O(2^n)$: Exponential time complexity

→ Recursion

$$O(1) < O(\log n) < O(n) < O(n \log n) < O(n^2)$$

stick figure $\rightarrow O(1)$

stick figure $\rightarrow O(\log N)$



Class 8

$\rightarrow \log$

$$\log_{10} 10^6 \rightarrow \textcircled{6}$$

$$\log_a a^b \rightarrow b$$

```
for (int i = 1; i <= n; i = i * 2)
```

```
{
```

```
    print(i);
```

3 $\rightarrow \log n$

$i = 1$

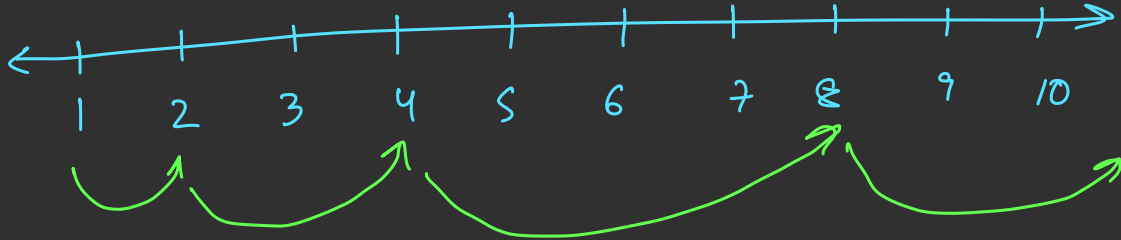
$i = 2$

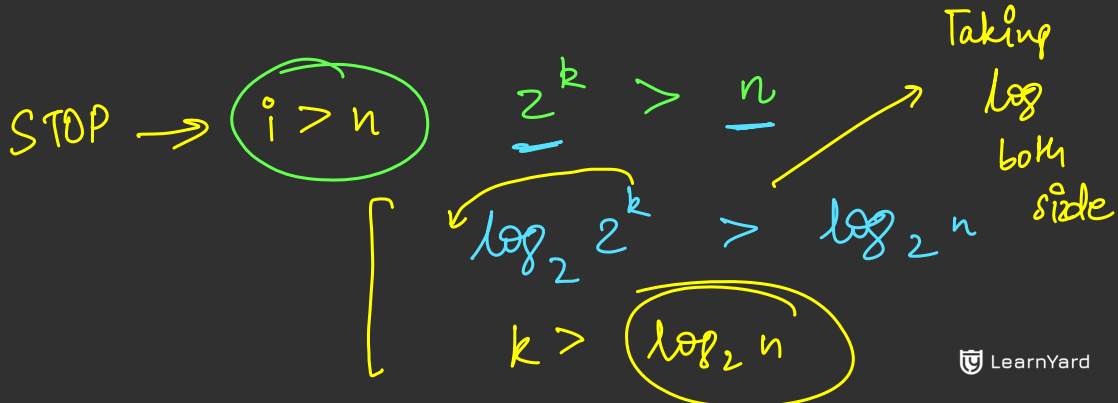
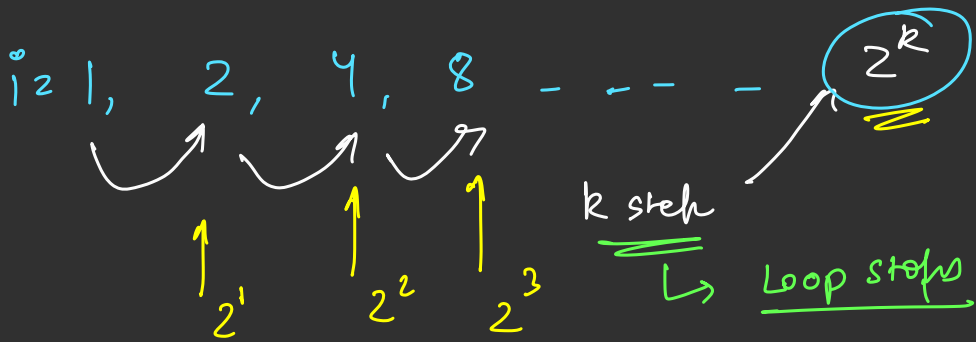
$i = 4$

$i = 8$

Exponentially

inc 1





$$\underline{i = i + 2}$$

$$i = 1$$



log n

$$\underline{i = n, \quad i = i/2}$$

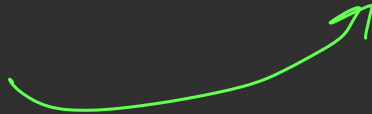


TC →

log n



Exponentially dec ↓



Comparing different time complexities

Time Comp Input Size	$O(\log N)$	$O(\sqrt{N})$	$O(N)$	$O(N \log N)$	$O(N^2)$	$O(N^3)$	$O(2^N)$
20	~20 ns	~22 ns	~100 ns	~450 ns	~2 μ s	~40 μ s	~2 ms
50	~30 ns	~35 ns	~250 ns	~2 μ s	~12 μ s	~625 μ s	~ 2 months
500	~45 ns	~111 ns	~3 μ s	~25 μ s	~1 ms	~650 ms	Out of Syllabus xD
5000 ($5 \cdot 10^3$)	~60 ns	~350 ns	~25 μ s	~300 μ s	125 ms	~11 mins	Out of Syllabus xD
1 million (10^6)	~100 ns	~5 μ s	~5 ms	~100 ms	~1.5 hours	~159 years	Out of Syllabus xD
100 mil (10^8)	~135 ns	~50 μ s	~500 ms	~13 secs	~1.6 years	~159 megayears	Out of Syllabus xD
1 billion (10^9)	~150 ns	~0.2 ms	5 secs	~2.5 mins	~159 years	~159 eons	Out of Syllabus xD
1 trillion (10^{12})	~200 ns	~5 ms	~1.5 hours	~5.5 hours	~159 megayears	~159 billion eons	Out of Syllabus xD
10^{15}	~250 ns	~200 ms	~2 months	~8 years	~159K eons	Out of Syllabus xD	Out of Syllabus xD
10^{18}	~300 ns	~ 5 secs	~159 years	~95 centuries	~159 billion eons	Out of Syllabus xD	Out of Syllabus xD

Approximate Time Taken
(assuming $2 \cdot 10^8$ operations per second)

How to calculate time complexity?

Example

$O(N^2)$

```
1  int doRandomStuff(int n) {  
2      int randomVar = 0;  
3      for(int i = 1; i <= n; ++i) {  
4          randomVar++;  
5          randomVar %= n;  
6          for(j = 1; j <= n; ++j) {  
7              randomVar += 2;  
8          }  
9      }  
10     while(n > 0) {  
11         randomVar /= 2;  
12         n /= 2;  
13     }  
14     randomVar = 0;  
15     return randomVar;  
16 }
```

N times

N^2

$\log N$

$N^2 \gg \log N$

Let's try some problems

Let's start with a simple one. Time Complexity of the following code?

```
int Sum1ToN(int n) {  
    int ans = n*(n+1)/2;  
    return ans;  
}
```

$O(1)$

- ☒ $O(N)$
- ☐ $O(1)$
- ☐ $O(N*N)$
- ☐ $O(\text{Log}N)$

Still easy, what is the time complexity of the following code?

```
int getSum(int n, int m) {  
    int ans = 0;  
    for(int i = 1; i <= n; ++i)  
        for(int j = 1; j <= m; ++j)  
            ans++;  
    return ans;  
}
```

Copy

N times

M times

TC $\rightarrow O(N * M)$

☐ $O(N)$

☐ $O(M)$

☐ $O(N + M)$

☒ $O(N * M)$

Recorded Example

What is the time complexity of the following code?

```
int doRandomStuff(int n, int m) {  
    int ans = 0;  
    for(int i = 1; i <= n; ++i) {  
        int var = n;  
        while(var > 0) {  
            // do some O(1) operation.  
            var /= 2;  
        }  
    }  
  
    for(int j = 1; j <= m; ++j)  
        ans++;  
    return ans;  
}
```

→ N times
} → log N times

→ M times

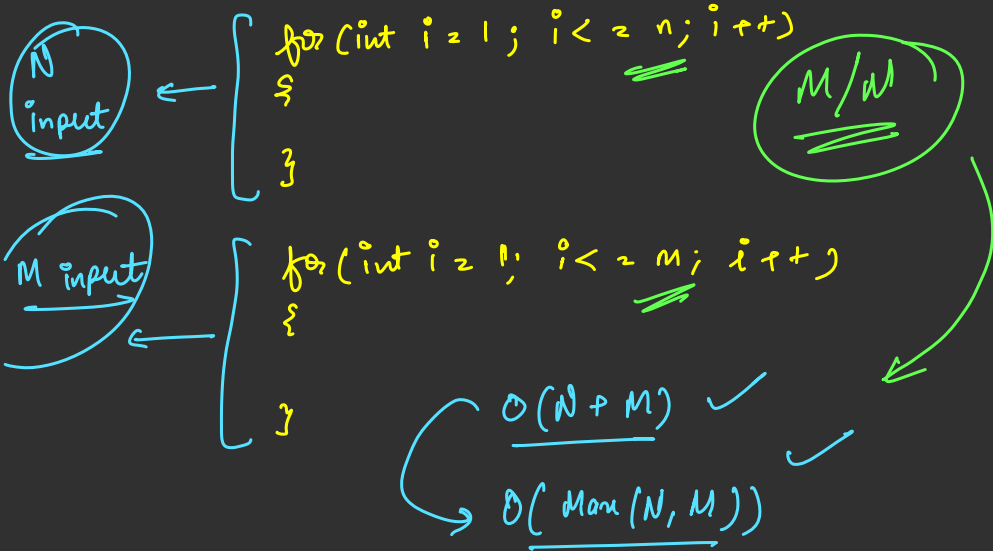
$$N \approx 10^3$$

$$M \approx 10^7$$

$$O(N \log N + M)$$

$$\rightarrow \text{Max}(N \log N, M)$$

- ☐ $O(N \cdot \log N)$
- ☐ $O(N + \log N + M)$
- ☐ $O(N + M)$
- ☒ $O(N \cdot \log N + M)$



Thank You!

Reminder: Going to the gym & observing the trainer work out can help you know the right technique, but you'll muscle up only if you lift some weights yourself.

So, PRACTICE, PRACTICE, PRACTICE!