

Steps to find Big-O

- 1) Find no. of iterations ✓
- 2) Neglect the lower order terms
- 3) Neglect the constant co-efficient

Quiz 1: $F(N) = 3N^2 + 6N + 10^3 \Rightarrow O(N^2)$

Quiz 2: $F(N) = 3N^2 + 6N^3 + 10^3 \Rightarrow O(N^3)$

Quiz 3: $F(N) = 3N + 6N \log N + 10^3 N^0 \Rightarrow O(N \log N)$

How to compare two algorithms.

Task: Given 10^5 integers, sort them in increasing order

Ashish [Sort Algo]

Arjun [Fier Algo]

15sec

(Windows 95)

10sec

(Macbook Pro M1)

7sec

(Macbook Pro M1)

(C++)

10sec

(Macbook Pro M1)

(Python)

7sec

C++

(Hot Mountains)

5sec

C++

(Antartica)

Execution time depends on lots of factors

```
for(i=1; i ≤ N; i++){  
    print(i)  
}
```

#iterations = N

No. of iterations/operations is always fixed and doesn't depend on any external factors

Sort Algo
 $100 \log N$

Flex Algo
 $\frac{N}{10}$

N: $[0, 3550]$: Flex Algo has lesser iterations

N: $[3550, \infty]$: Sort Algo has lesser iterations



Asymptotic Analysis of Algorithms

→ Observing performance of algorithms at higher value of N (Input Size)

1) Big - O

2) Omega

3) Theta

Steps to find Big-O \rightarrow [To compare algorithms]

- 1) Find no. of iterations
- 2) Neglect the lower order terms
- 3) Neglect the constant co-efficient

1) Find no. of iterations

It is always fixed and doesn't depend on external factors

2) Neglect the lower order terms

$$f(N) = N^2 + 10N$$

$$N = 10 \quad = 10^2 + 10 \cdot 10 = 200$$

N^2	$10N$	Contribution of lower order term
100	100	$\frac{100}{200} \times 100 = 50\%$

$$N = 100$$

N^2	$10N$	Contribution of lower order term
10^4	10^3	$\frac{10^3}{10^4 + 10^3} \times 100$

$$= \frac{10^3}{10^3(1+10)} \times 100$$

$$= \frac{100}{11} \approx 9.9\%$$

$$N = 10^4$$

N^2	$10N$	Contribution of lower order term
10^8	10^5	$\frac{10^5}{10^8 + 10^5} \times 100$

$$= \frac{10^5}{10^5(1+1000)} \times 100 = \frac{100}{1000} \approx 0.1\%$$

As $N \uparrow$, contribution of lower order term decreases. Hence, neglect the lower order terms.

3) Neglect the constant co-efficient

Sort Algo

N

N

N

$\frac{N^2}{10}$

Flex Algo

$10 \log N$

$100 \log N$

$1000 \log N$

$100N$

For larger N

Flex Algo

Flex Algo

Flex Algo

Flex Algo

$$N = 2^{32}$$

$$\text{Sort Algo} \Rightarrow 2^{32} \text{ iters} = 10^9$$

$$\text{Flex Algo} \Rightarrow 10 \cdot \log_2 2^{32} = 10 \times 32 = 320$$

$$N = 10^6$$

$$\text{Sort Algo} = \frac{10^{12}}{10} = 10^{11}$$

$$\text{Flex Alg} = 100 \times 10^6 = 10^8$$

Issues with Big - O

Issue 1:

	Sort Algo	flex Algo	
	$100N$	N^2	
	$O(N)$	$O(N^2)$	
$N=10$	1000	100	Flex Algo is better
$N=50$	5000	2500	Flex Algo is better
$N=100$	10^4	10^4	Both are same
$N > 100$	100×101	101×101	Sort Algo is better

$O(N)$ is better than $O(N^2)$ only after a certain threshold

Issue 2:

$$\begin{array}{l} \text{Sort Algo} \\ 10N^2 + 5N \\ O(N^2) \end{array}$$

$$\begin{array}{l} \text{Flex Algo} \\ 5N^2 + 100N \\ O(N^2) \end{array}$$

Worst Case Scenario

```
boolean func (int arr[], int N, int K) {  
    for (i=0; i<N; i++) {  
        if (arr[i] == K) {  
            return True;  
        }  
    }  
}
```

```
    }  
    return False;  
}
```

#iterations]

Best Case

↑ A = 5 4 6 1 7 K = 5 [1 iteration]

A = 5 4 6 1 7 K = 7 [N iterations]

↙ A = 5 4 6 1 7 K = 100 [N iterations]
Worst Case

#iterations in Worst Case $\Rightarrow N$

8 mins

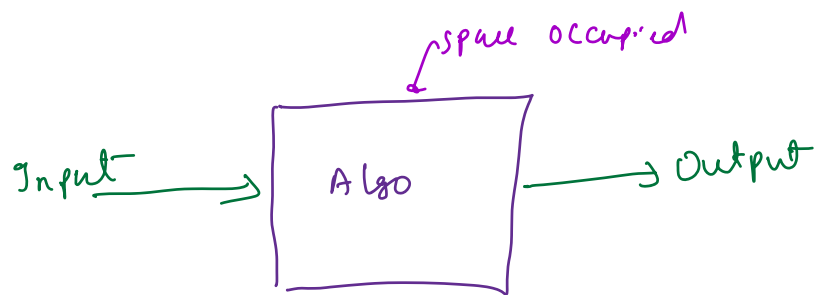
8:2

Time Complexity

- 1) Find no. of iterations [Function of N]
- 2) Neglect lower order terms
- 3) Neglect constant coefficient

Space Complexity

Extra space used apart from input and output



void function (int N) {

int[10] arr; $\rightarrow 10 \times 4 = 40$ bytes

float f; $\rightarrow 4$ bytes

int[N] arr2; $\rightarrow 4N$ bytes

}

Space Complexity

- 1) Find the memory/space occupied in bytes
- 2) Neglect lower order terms
- 3) Neglect constant coefficient

$$\text{Total} = 4N + 44 \text{ bytes} \Rightarrow \boxed{O(N)}$$

$N=10, N=100, N=10^{100}$

```

void function (int N) {
    int [10] arr;      => 40
    float f;           => 4
    int x;             => 4
}
  
```

$$\text{Space} = 48 \text{ bytes} = 48 \cdot N^0 = O(1) \text{ Space complexity}$$

```

void function (int N) {
    int [10] arr;      => 40 bytes
    float f;           => 4 bytes
    int [N] arr2;      => 4N bytes
    int [N][N] arr3;   => 4N^2 bytes
}
  
```

$$\text{Space} = 4N^2 + 4N + 44$$

\Downarrow
 $O(N^2)$

Ex: void function (int N) {

int [] arr1 = new int[n]; \Rightarrow $4N$

int [] arr2 = new int[n]; \Rightarrow $4N$

}

Space = $8N \Rightarrow O(N)$

Ex:

int sum (int arr[], int N) {

int ans = 0;

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

ans += arr[i];

}

return ans;

}

i \Rightarrow bytes \Rightarrow $O(1)$

Time Limit exceed error

Limit: 1-2 sec

1 sec $\Rightarrow 10^8$ iterations X

	$O(N)$	$O(N^2)$	$O(N^3)$
$N=10$	✓	✓	✓
$N=10^3$	✓	✓	X
$N=10^6$	✓	X	X
$N=10^9$	X	X	X

$$(10^3)^2 = 10^6$$

$$(10^3)^3 = 10^9 \Rightarrow \text{NE}$$

$$O(N^3) \cdot N = 10^9$$
$$N^3 = (10^3)^3 = 10^9$$

$$N \leq 10^6$$
$$N \leq 10^9$$

y

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

$$(10^6)^2 = 10^{12}$$