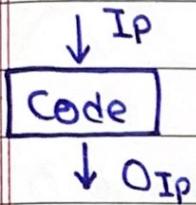


## \* DS Algo



### \* Algo

- Work for any input
- Produce correct output
- Consumes bounded resources

time, space  
power, data  
packet

### \* Heuristic:

Case if any algo does not follow one or more of  
above mentioned points

## \* Data Structure

Storing data in structured manner

- Storing
- accessing
- retrieving
- rearrange
- update

### \* How to prove the three points for algo

- Model of computation

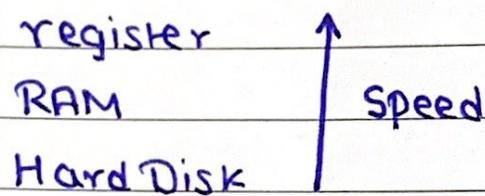
**Word-RAM** → Random access memory

↓  
number / float

Randomly  
access any  
address in cons  
time

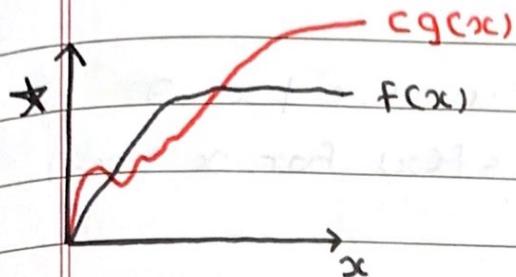
- ★ Operation in constant time
- All the mathematical operation  
 $+,-,*,/,\cdot, \text{L1}, [\cdot]$
- Copy any word
- Accessing an address
- Read any address
- Control Operation ( $\leq, <, \geq, >$ , if, returning)

- ★ There is no memory hierarchy in Word-RAM



```

int ct;
ct = 0;
for (int i = 0; i < 10; i++)
    ct++;
Output ct
  
```



1)  $O(g(x))$ : { $f(x)$ :  $\exists$  a positive constant  $c \neq x_0 \ni$

$$0 \leq f(x) \leq c g(x) \text{ for } x \geq x_0}$$

then  $f(x) \in O(g(x))$

$$\text{eg: } x^2 + 2x + 1 \in O(x^2)$$

$$x^2 + 2x + 1 \leq x^2 + 2x^2 + x^2 \quad x \geq 1$$

$$\leq 4x^2 \quad \begin{matrix} \uparrow \\ x_0 \end{matrix}$$

$$n! \in O(n^n)$$

$$\log(n!) \in O(n \log n)$$

$$n \in O(2^n)$$

$$\log n \in O(n)$$

$$f(x) = \sum_{i=0}^n a_i x^i \in O(x^n)$$

$$f(x) \leq \sum_{i=0}^n |a_i| x^i \leq x^n \left( \sum_{i=0}^n |a_i| \right) \text{ for } x \geq 1$$

$$f_1(x) \in O(g_1(x))$$

$$f_2(x) \in O(g_2(x))$$

$$\text{then } (f_1 + f_2)(x) \in O(\max(g_1(x), g_2(x)))$$

$$(f_1 f_2)(x) \in O(g_1 g_2(x))$$

2)  $\Omega(g(x)) = \{f(x) : \exists \text{tre const } c & x_0 \exists$   
 $0 \leq cg(x) \leq f(x) \text{ for } x \geq x_0\}$

3)  $\Theta(g(x)) = \{f(x) : \exists \text{tre const } c_1, c_2, x_0 \exists$   
 $0 \leq c_1 g(x) \leq f(x) \leq c_2 g(x) \text{ for } x \geq x_0\}$   
 f(x) is order of g(x)

\*  $\log(n!) \in \Theta(n \log n)$

$$\begin{aligned} \log(n!) &= \log n + \dots + \log(n/2) \\ &\quad + \log(n/2 - 1) + \dots + \log(2) + \log 1 \\ &\geq \left(\frac{n}{2} + 1\right) \log\left(\frac{n}{2}\right) + \left((n-1) - \left(\frac{n}{2} + 1\right)\right) \log 2 \\ &\geq \frac{n}{2} \log n - 3 \geq \frac{n}{3} \log n \quad \text{for } n \geq n_0 \end{aligned}$$

\*  $\max(f(x), g(x)) \in \Theta(f(x) + g(x))$

4)  $O(g(x)) = \{f(x) : \lim_{x \rightarrow \infty} f(x)/g(x) = 0\}$

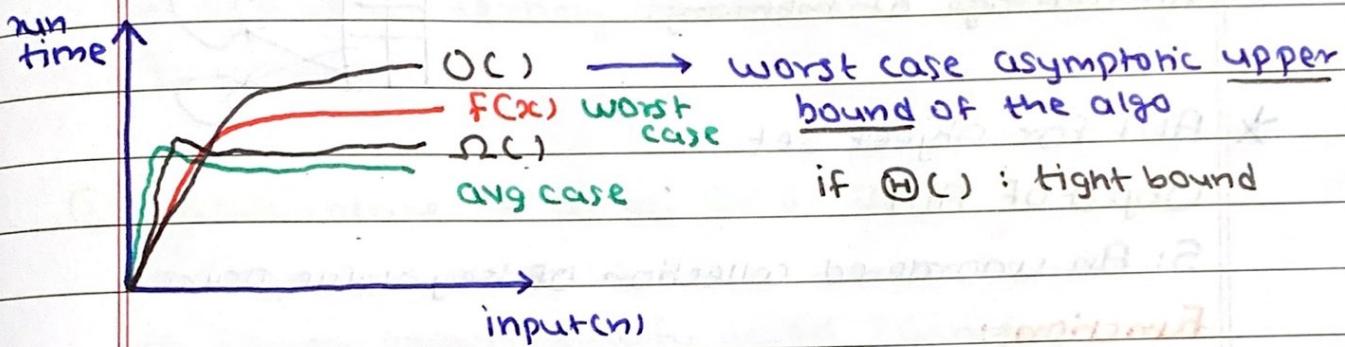
5)  $W(g(x)) = \{f(x) : \lim_{x \rightarrow \infty} f(x)/g(x) = \infty\}$

\* Prb.... Instance  $I_p \dots (n) \leftarrow$  Input Complexity

algo

$\rightarrow O(\dots)$

Output  $\leftarrow$  Output complexity



\* Space complexity:

Input complexity + Algo complexity + Output complexity

Workspace complexity

IF  $O(1)$ : Inplace algo

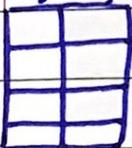
\* Hard Problem: No efficient algo is known

\* ADT (Abstract Data type)

Before coding we define structure of data like class, struct, object

(These org. structures known as ADT)

key obj



### \* Satellite Data:

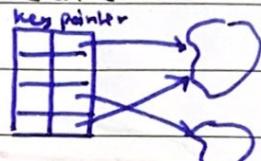
In this type of structure Data is outside &

We have to structure the key with pointer to data.

→ Adv:

multiple key can point to same data

no wastage of memory.



### \* ADT for object set

Object of ADT:

S: An unordered collection of key value pairs

Functions:

→ Search (S, key)

insert (S, xc)

delete (S, key)

min (S)

max (S)

replace (S, key, new)

traverse (S, (func\*) (obj))

## \* Array vs Linked List

Array Adv: VS Linked List Adv

### ① Disadvantage of array: (dynamic)

- contiguous memory requirement
- resizing involves bulk copy
- deleting / inserting an element  $r$  in the middle is inefficient

### ② Disadvantage of Singly linked list:

- Sequential traversal
- Cannot exploit locality based caching
- maintaining & storing pointers with each block.

## \* Adv of doubly linked list

- reverse traversal

## \* Disadv of doubly linked list

- additional pointer to prev node to be maintained & saved with each node.

★ Dummy Blocks in DS (Sentinel)

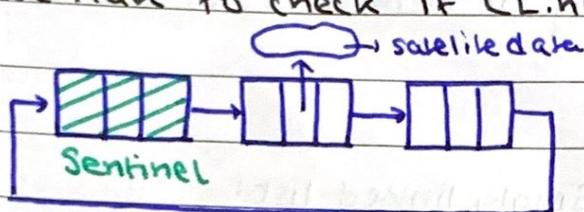
1) Increased speed of operations

2) Reduced algo complexity & code size

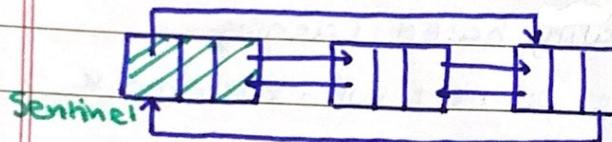
★ To add node to head of linked list

we have to check if ( $L.\text{head} \neq \text{NULL}$ )

Circular  
Singly  
linked  
list



Doubly



## ★ Stack

### 1) LIFO

→ Dec to Binary Conversion ( $25_{10} \rightarrow 11001_2$ )

→ Postfix expression evaluation

→ Infix to postfix conversion

### 2) Precedence

^ Right to Left

\* / } Left to right

+ -

## ★ Infix → Postfix

1) Scan from L to R

2) If Scanned chrc is operand output it

3) If stack empty or top has '(' or precedence  
of scanned op > s.top push the operator to stack.

4) Else pop

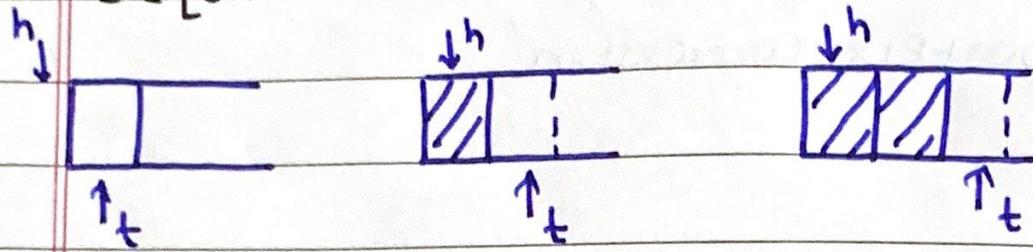
(A + (B \* C - (D \* E ^ F)) \* G) \* H) ....

A B C \* D E F ^ G \* - H \* +

## \* Queue

- 1) Job Scheduling, Message buffers - FIFO
- 2) enqueue t shifts by 1 - O(1)

dequeue h shifts by 1 - O(1)



## \* Deque (Deck)

ADT:

void\* dequefront()

void\* dequeback()

int enqueuefront(void\*)

int enqueueback(back\*)

## \* Sorting

1) Worst Case Time

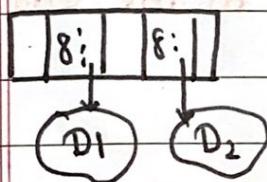
2) Work space

3) Avg case time

4) Avg work space

5) Inplace: O(1)-workspace

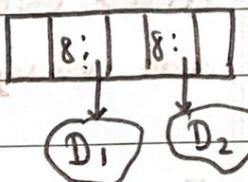
6) Stable:



Order before

sorting of two

keys i same value  
preserved



7) Adaptive:

Algorithm should work acc. to no. of inversions

2 4 1 3 5      No. of inversions : 3

(2,1); (4,1); (4,3)

8) Online: (Interactive problem types)

\* Bubble Sort:

5 1 4 2 8

(If inversion two consecutive elements are swapped)

1 5 4 2 8

1 4 5 2 8

least ← 1 4 2 5 8 → absolute max element.  
after pass Pass 1

\* After every pass max element is to the end of the array, total  $(n-1)$  passes

Pass 0 5 3 1 9 8 2 4 7

Pass 1 3 1 5 8 2 4 7 9

2 1 3 5 2 4 7 8

3 1 3 2 4 5 7

4 1 2 3 4 5

5 1 2 3 4

6 1 2 3

1 2

$$1) O(n^2) \# \sum_{i=1}^{n-1} n-i = n(n-1)/2$$

5) Adaptive (Flag)

6) No. of Comp  $\Theta(n^2)$

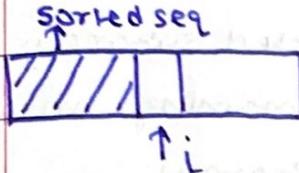
7) No. of swap  $\Theta(n^2)$

2) Inplace algo

3) Stable (Swap only if strictly less)

4) Online (Flag)

## \* Insertion Sort:



6 5 3 1 8 7 2 4  
 5 6 3 1 8 7 2 4  
 3 5 6 1 8 7 2 4  
 1 3 5 6 8 7 2 4  
 1 3 5 6 8 7 2 4  
 1 3 5 6 7 8 2 4  
 1 2 3 5 6 7 8 4  
 1 2 3 4 5 6 7 8

\* NO OF comparisons

$$1 + \dots + (n-1) = n(n-1)/2$$

\* NO. OF swaps =  $n(n-1)/2$

1)  $O(n^2)$

2) Inplace algo

3) Stable

4) Online

5) Adaptive (depends)

6) No of comp  $\Theta(n^2)$

7) No of swap  $\Theta(n^2)$

★ Selection Sort:

64 25 12 22 **11**

**11** 25 **12** 22 64

**11** **12** 25 **22** 64

**11** **12** 22 **25** 64

**11** **12** 22 **25** 64

★ Sorted subarray

★ Remaining unsorted  
subarray

★ min element from unsorted subarray moved to  
sorted subarray.

1)  $O(n^2)$

2) Inplace algo

3) Stable

4) Adaptive

5) No. of Swaps  $O(n)$

6) No. of Comp  $O(n^2)$

★ To Prove correctness of a Algorithm:

① Initialization:

The invariant is true prior to the first iteration of the loop

② Maintenance:

If invariant is true for iteration  $n$ , it is true for iteration  $n+1$ .

③ Termination:

When the loop terminates the invariant is true on the entire input.

★ For Bubble Sort

→ Invariant is:

At iteration  $i$ , the subarray  $A[1..i]$  is sorted and any element in  $A[i+1..A.size()]$  is greater or equal to any element in  $A[1..i]$

↑ sorting in descending order

## \* Avg Case Analysis:

### 1) Hiring Problem

best  $\leftarrow 0$

for  $i \leftarrow 0$  to  $n$

Interview cost  $i \dots c_i$

if  $i$  has a better score

best  $= i$

hire  $i \dots c_h$

Prob (ith candidate best among  $1 \dots i$ ) =  $1/i$

X: hiring cost for  $1 \dots n$

$x_i$ : cost in hiring  $i^{\text{th}}$  candidate

$$X = \sum_{i=1}^n x_i$$

$$\Rightarrow E[X] = E\left[\sum_{i=1}^n x_i\right] = \sum_{i=1}^n E[x_i]$$

$$E[x_i] = \Pr(\text{hire cand } i) * c_h + \Pr(\text{not hire}) * 0$$

$$= \frac{c_h}{i}$$

$$\therefore E[X] = c_h \sum_{i=1}^n \frac{1}{i}$$

$$\begin{aligned} 1 + \underbrace{\frac{1}{2} + \frac{1}{3}} + \underbrace{\frac{1}{4} + \frac{1}{5} + \dots + \frac{1}{7}} &\leq \sum_{i=0}^{\lfloor \log n \rfloor} \sum_{j=0}^{2^i-1} \frac{1}{2^i+j} \\ &\leq \sum_{i=0}^{\lfloor \log n \rfloor} \sum_{j=0}^{2^i-1} \frac{1}{2^i} \\ &\leq \lg n + 1 \end{aligned}$$

$\therefore \text{Avg case cost } O(c_{in} + c_n \lg n)$

## 2) Hiring Problem 2

best  $\leftarrow 0$

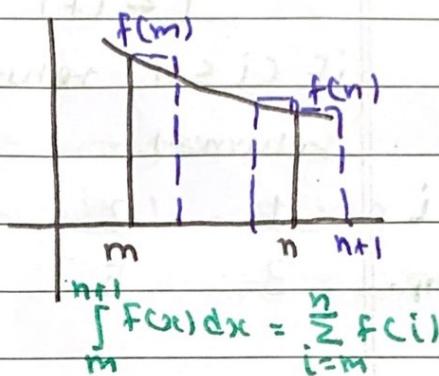
for  $i \leftarrow 0$  to  $n$

Interview ...  $c_i$

if  $i$  has a better score

best  $= i$

hire  $i \dots c_n$



Stop if  $\text{best}[1, k] < a[j]$   $j \in [k+1, n]$

Find opt  $k \ni$  best guy is chosen

S: event in which we hire the best

$S_i$ :  $i^{\text{th}}$  is the best in  $[1, n]$  & algo picks  $i$

$\Pr(S_i) = \text{Prob(Best in } [1, n]) * \text{Algo picks } i$

$$= \frac{1}{n} \times \frac{k}{i-1}$$

1 ... k    k+1 ... i-1    i  
best was here

$$\therefore P(S) = \sum_{i=k+1}^n P(S_i)$$

$$= \sum_{i=k+1}^n \frac{1}{n} \left( \frac{k}{i-1} \right) = \frac{k}{n} \sum_{i=k}^{n-1} \frac{1}{i}$$

$$\geq \frac{k}{n} \int_k^n \frac{1}{i} dx = \frac{k}{n} (\lg n - \lg k)$$

$$\frac{d}{dk} \left( \frac{k}{n} \lg n - \lg k \right) = 0 \Rightarrow k = \frac{n}{e}$$

### 3) Linear Search $(x, a_1, \dots, a_n)$

$i \leftarrow 1$

while ( $i \leq n$ , and  $x \neq a_i$ )  $\rightarrow 2i$  comp

$i \leftarrow i + 1$

if ( $i \leq n$ ) return  $i \rightarrow 1$  comp

return -1.

$(x=a_i)$	$i$	1	2	$\dots$	$i$	$\dots$	$n$
Comp.		3	5		$2i+1$		$2n+1$

\* If  $x$  not in list  $(2n+2)$  comp # checked

$\frac{P}{a_1, a_2, \dots, a_n} \rightarrow$  Not in list  $(1-P)$

$$E[X_i] = P(2i+1)$$

$$\therefore E[X] = \sum_{i=1}^n E[X_i] + (2n+2)(1-P)$$

$$= (2n+2) - np$$

4) Avg no. of comparisons in insertion sort

a<sub>1</sub> ... a<sub>i-1</sub> a<sub>i</sub>  
i slots

X: no. of comparisons

X<sub>i</sub>: no. of comparisons to put at curr pos

$$E[X] = \sum_{i=2}^n E[X_i] + \sum_{k=1}^i \left(\frac{1}{i}\right) k = \frac{(i+1)}{2} = E[X_i]$$

$$\therefore E[X] = \sum_{i=2}^n \frac{(i+1)}{2} = O(n^2)$$

5) No. of inversions in a permutation

i	j
---	---

 where a[i] > a[j] / inversion

$$X_{ij} = \begin{cases} 1 & (\text{Inversion}) \\ 0 & \end{cases}$$

$E[X_{ij}] = \Pr(i, j)$  is an inversion in given permutation

$$= \frac{1}{2}$$

$$\therefore X = \sum_{1 \leq i < j \leq n} X_{ij} \Rightarrow E[X] = \sum E[X_{ij}] = \frac{n(n-1)}{4}$$

★ Randomised Algorithm:

→ Whatever we did previously calculated the avg case running time

(Prob. Deterministic Algo)

where prob. distribution was over the inputs to the algorithm

→ In randomised algo we discuss the expected running time when algo itself makes random choices.

A random permutation of input is fed to the algo

→ The only change we make in hiring problems is we permute the inputs randomly

Las Vegas  
Algo

Monte  
Carlo Algo

In HP1 : Always produces the best output

In HP2: May not produce correct output

### \* Random Permutation of input

1  $n = A.length$

2 for  $i = 1$  to  $n$

swap  $A[i]$  with  $A[\text{rand}(i, n)]$

### \* $\text{rand}(i, j)$ Prob. of generating a particular no.

between  $i$  &  $j$  is  $\frac{1}{j-i+1}$

### \* Loop invariant:

Just prior to  $i$ th iteration of for loop for each possible  $(i-1)$ th permutation of the  $n$  elements the subarray  $A[1 \dots i-1]$  contains this  $(i-1)$  permutation with prob.  $(n-i+1)! / n!$

### \* Use Initialization $i=1$

Maintainence  $i=i$  (Induction)

Termination  $i=n+1$

$\Pr(A) = \frac{1}{n!}$  each permutation equally likely