



**BITS Pilani**  
Pilani Campus

# Course Name : Data Structures & Algorithms

Bharat Deshpande  
Computer Science & Information Systems

# What is a program?

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- **Algorithm**

An algorithm is a step-by-step procedure for solving a problem in a finite amount of time.

- **Data Structures**

Is a systematic way of organizing and accessing data, so that data can be used efficiently.

**Algorithms + Data Structures = Program**

# Algorithmic problem

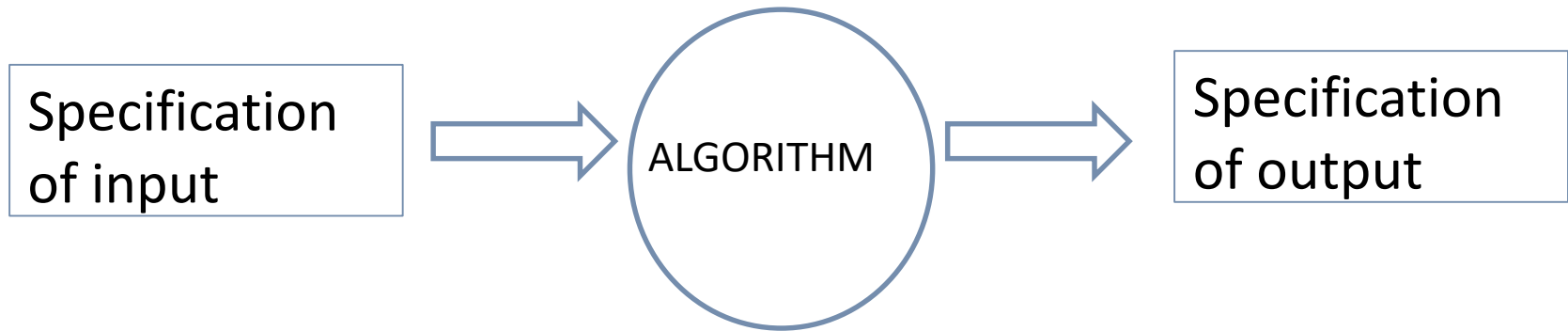


**For eg:** Sorting of integers

Input Instance : 8,4 ,5,2,10

Output Instance as a permutation of input : 2,4,5,8,10

# Algorithmic Solution



- Algorithm describes actions on the input instance.
- Infinitely many correct algorithm for the same problem.

**Infinite number of input instances satisfying the specification.**

**Two key points: Repeatable argument & Correctness**

# What is good algorithm?

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- Resources Used
  - Running time
  - Space used
- Resource Usage
  - Measured proportional to (input) size

# Measuring the running time

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- Write a program implementing the algorithm.
- Run the program with inputs of varying size and composition.
- Use a method like `System.currentTimeMillis()` to get an accurate measure of the actual running time.

# Limitations of experimental studies

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- Implementation is a must.
- Execution is possible on limited set of inputs.
- If we need to compare two algorithms we need to use the same environment (like hardware, software etc)

# Analytical model to analyze algorithm



- Algorithm should be analyzed by using general methodology.
- This approach uses:
  - High level description of the algorithm.
  - Takes into account all possible inputs.
  - Allows one to evaluate the efficiency of any algorithm in a way that is independent of the hardware and the software environment.



- A mixture of natural language and high level programming concepts that describes the main ideas behind a generic implementation of a data structure and algorithms.

**Algorithm** *arrayMax(A, n)*

**Input:** An array *A* of *n* integers

**Output:** The maximum element of *A*

*currentMax*  $\leftarrow A[0]$

for *i*  $\leftarrow 1$  to *n* - 1 do

    if *A[i]* > *currentMax* then *currentMax*  $\leftarrow A[i]$

return *currentMax*

- Is structured than usual prose but less formal than a programming language.
- Expressions
  - Use standard mathematical symbols to describe numeric and Boolean expressions.
  - Uses  $\leftarrow$  for assignment.
  - Use  $=$  for the equality relationship.
- Method declaration
  - Algorithm name(param1,param2...)

# Assumptions

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Individual statement considered as “unit” time

- Not applicable for function calls and loops

Individual variable considered as “unit” storage

**Often referred to as “algorithmic complexity”**

# Complexity Example [1]

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**Example 1** (Y and Z are input)

$X = Y * Z;$

$X = Y * X + Z;$

// 2 units of time and 1 unit of storage

// Constant Unit of time and Constant Unit of storage

# Complexity Example [2]

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**Example 2** (a and N are input)

```
j = 0;
```

```
while (j < N) do
```

```
    a[j] = a[j] * a[j];
```

```
    b[j] = a[j] + j;
```

```
    j = j + 1;
```

```
endwhile;
```

```
// 3N + 1 units of time and N+1 units of storage
```

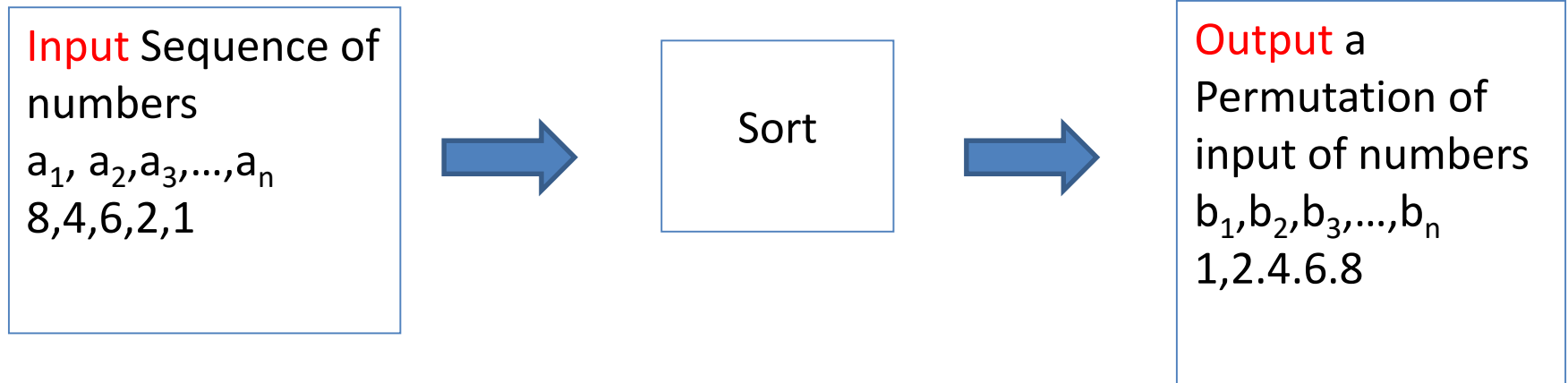
```
// time units prop. to N and storage prop. to N
```

# Complexity Example [3]

**Example 3** (a and N are input)

```
j = 0;
while (j < N) do
  k = 0;
  while (k < N) do
    a[k] = a[j] + a[k];
    k = k + 1;
  endwhile;
  b[j] = a[j] + j;
  j = j + 1;
endwhile;
//??? units of time and ??? units of storage
// time prop. to  $N^2$  and storage prop. to N
```

# Example of sorting



## Correctness(Requirement for the output)

For any input algorithm halts with the output:

- $b_1 < b_2 < b_3 < \dots < b_n$
- $b_1, b_2, b_3, \dots, b_n$  is a permutation of  $a_1, a_2, a_3, \dots, a_n$

## Running time of algorithm depends on

- Number of elements  $n$ .
- How (partially) sorted they are.

# Order Notation

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- Purpose
  - Capture proportionality
  - Machine independent measurement
  - Asymptotic growth  
(i.e. large values of input size  $N$ )



# Motivation for Order Notation

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## Examples

- $100 * \log_2 N < N$  for  $N > 1000$
- $70 * N + 3000 < N^2$  for  $N > 100$
- $10^5 * N^2 + 10^6 * N < 2^N$  for  $N > 26$

# Asymptotic Analysis

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- Goal: To simplify analysis of running time of algorithm .eg  $3n^2 = n^2$ .
- Capturing the essence: how the running time of the algorithm increases with the size of the input in the limit.

# Asymptotic Notation

- The big O notation

## Definition

Let  $f$  and  $g$  be functions from the set of integers to the set of real numbers. We say that  $f(x)$  is in  $O(g(x))$  if there are constants  $C > 0$  and  $k$  such that  $|f(x)| \leq C |g(x)|$ , whenever  $x \geq k$ .

- This is read as  $f(x)$  is *big-oh* of  $g(x)$

**Note:** Pair of  $C$  and  $k$  is never unique.

# Order Notation

## Examples

$$g(n) = 17*N + 5$$

$$\lim_{n \rightarrow \infty} g(n) / f(n) = c$$

$$\lim_{n \rightarrow \infty} (17*N + 5)/N = 17. \text{ The asymptotic complexity is } O(N)$$

$$g(n) = 5*N^3 + 10*N^2 + 3$$

$$\lim_{n \rightarrow \infty} (5*N^3 + 10*N^2 + 3) / N^3 = 5. \text{ The asymptotic complexity is } O(N^3)$$

$$g(n) = C1*N^k + C2*N^{k-1} + \dots + Ck*N + C$$

$$\lim_{n \rightarrow \infty} (C1*N^k + C2*N^{k-1} + \dots + Ck*N + C) / N^k = C1.$$

The asymptotic complexity is  $O(N^k)$

$$2^N + 4*N^3 + 16 \text{ is } O(2^N)$$

$$5*N*\log(N) + 3*N \text{ is } O(N*\log(N))$$

$$1789 \text{ is } O(1)$$

# Linear Search

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```
function search(X, A, N)
j = 0;
while (j < N)
    if (A[j] == X) return j;
    j++;
endwhile;
return "Not-found";
```

# Linear Search - Complexity

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## Time Complexity

“if” statement introduces possibilities

- Best-case:  $O(1)$
- Worst case:  $O(N)$
- Average case: ???

# Binary Search Algorithm

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**Assume:** Sorted Sequence of numbers

low = 1; high = N;

while (low <= high) do

    mid = (low + high) / 2;

    if (A[mid] == x) return x;

    else if (A[mid] < x) low = mid + 1;

    else high = mid - 1;

endwhile;

    return Not-Found;

# Binary Search - Complexity

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- Best Case
  - $O(1)$
- Worst case:
  - Loop executes until  $low \leq high$
  - Size halved in each iteration
  - $N, N/2, N/4, \dots 1$
  - How many steps ?



# Binary Search - Complexity

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- Worst case:
  - K steps such that  $2^K = N$   
i.e.  $\log_2 N$  steps is  $O(\log(N))$