

INTRODUCTION TO ALGORITHMS

FOURTH EDITION

Algorithms (Recap)

Algorithm

Definition

- An algorithm is any well-defined computational procedure that
 - takes as input a value or a set of values,
 - outputs some value or a set of values,
 - } in a finite amount of time.

Algorithm

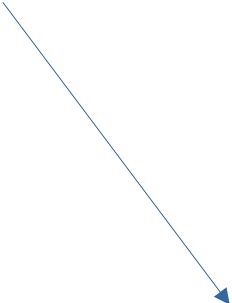
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Each step must be clear
and unambiguous

Algorithm

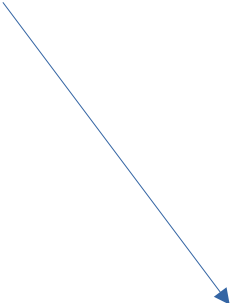
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If the number looks big, show something different.

Vs

If the number is greater than 10, then print 'High'

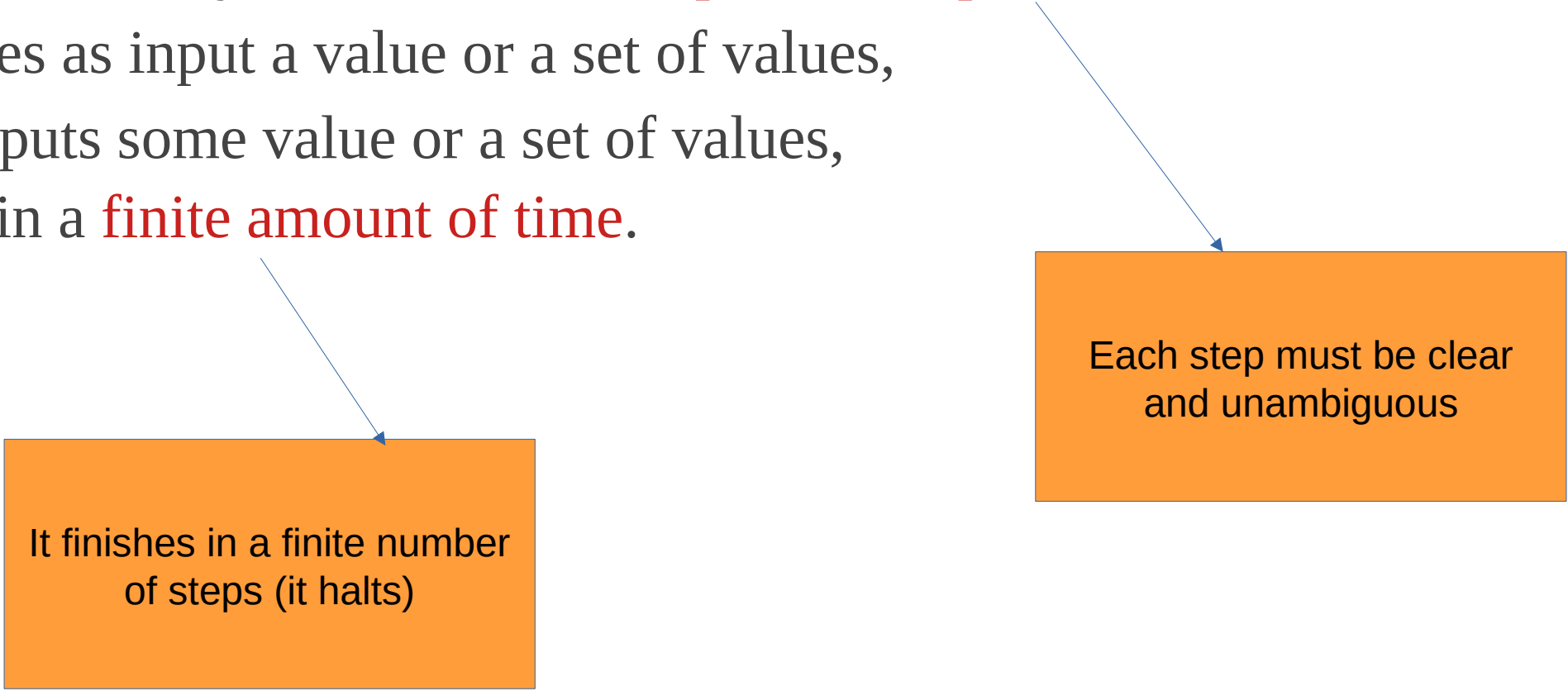


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Algorithm

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 - takes as input a value or a set of values,
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It finishes in a finite number of steps (it halts)

Each step must be clear and unambiguous



- * well-defined (unambiguous)
- * halt

Problems

- Checking if a number is prime

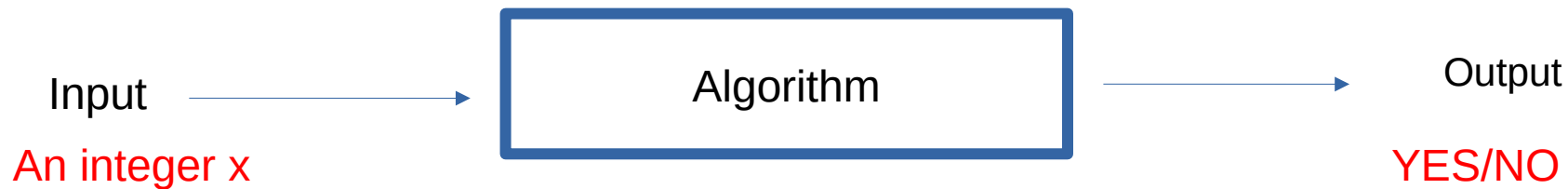


Do you have an
algorithm?

Problems

- Checking if a number is prime

Do you have an algorithm?



- Check if x is divisible by any of the numbers 2 to $x-1$.
- If yes, output YES, otherwise output NO.

Problems

- Checking if a number is prime

Do you have an algorithm?



- Check if x is divisible by any of the numbers from
- 2 to $x-1$ in an iterative fashion.
- If yes, output YES, otherwise output NO.

Well-defined?

Halt?

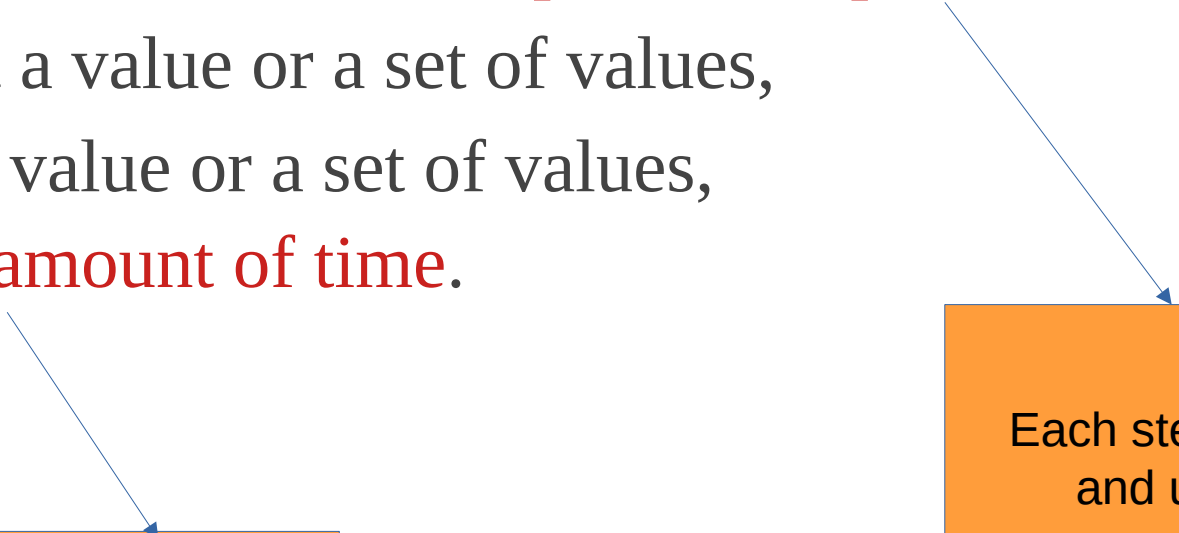
Some Problems

- Checking if a number is prime
- Gcd/hcf of two numbers
- Finding mean/median/mode of a list of number
- Calculating SI/CI
- Finding the maximum of a list of numbers
- Matrix multiplication
- Distance between two points in a plane
- Area/perimeter of some shapes
-

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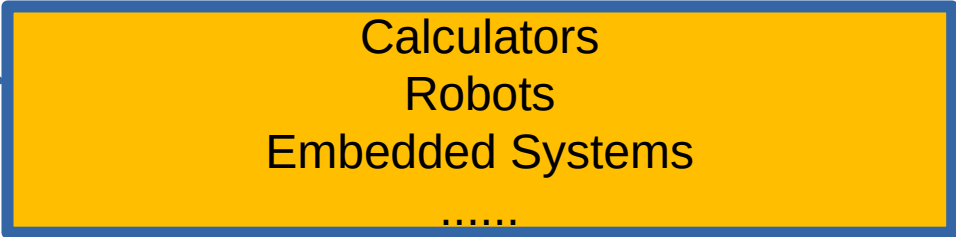


It finishes in a finite number of steps (it halts)

Each step must be clear and unambiguous

Computational Problem

- A problem that can be solved using an **algorithm** by a computer or any **computational device**.

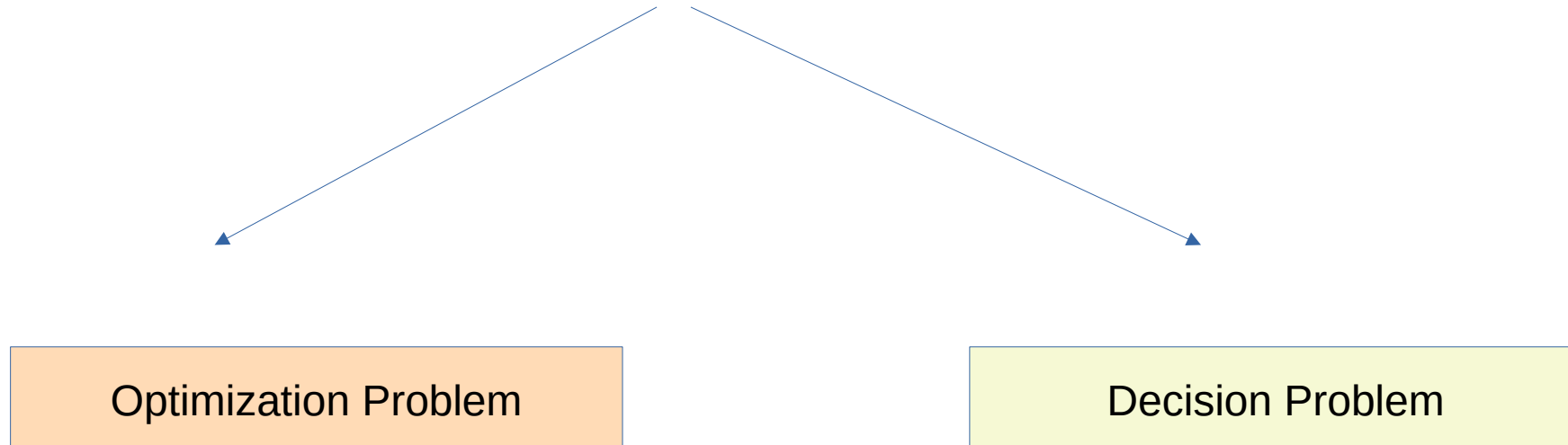


Calculators
Robots
Embedded Systems
.....

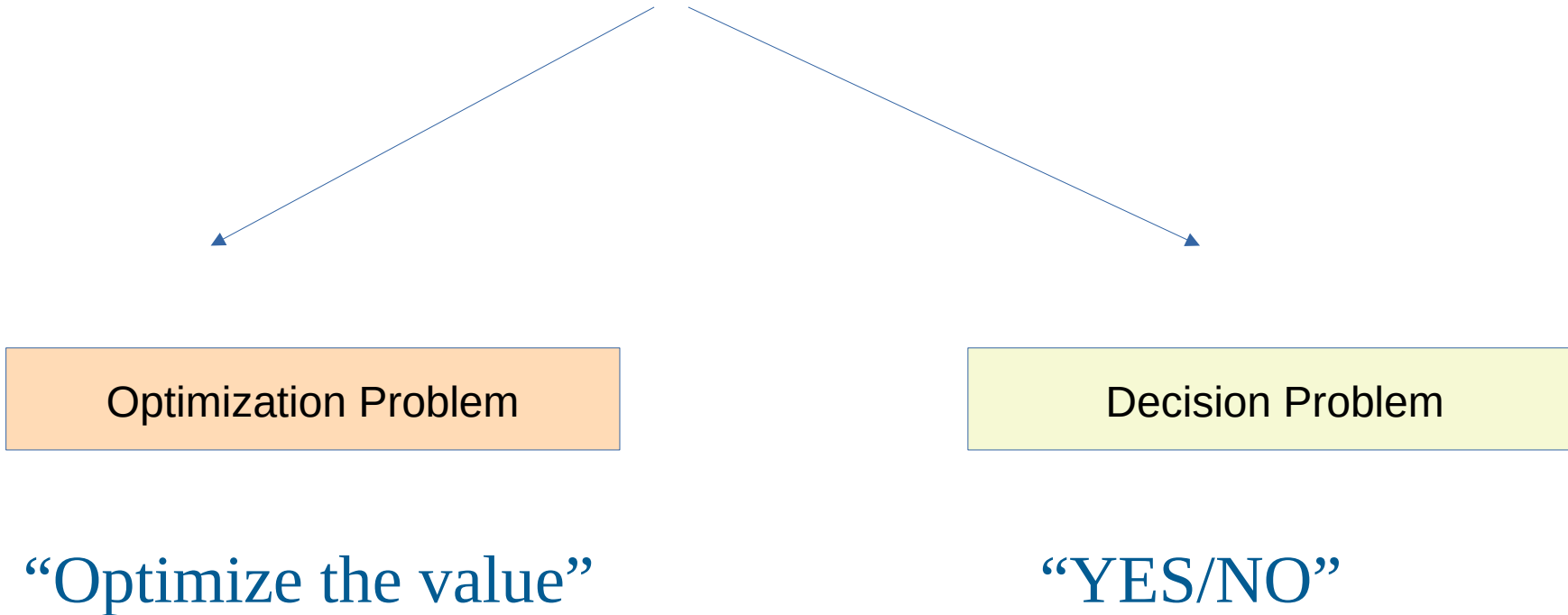
Take-away

- Algorithm is a tool for solving a well-specified computation problem.

Computational Problem



Computational Problem



Computational Problem

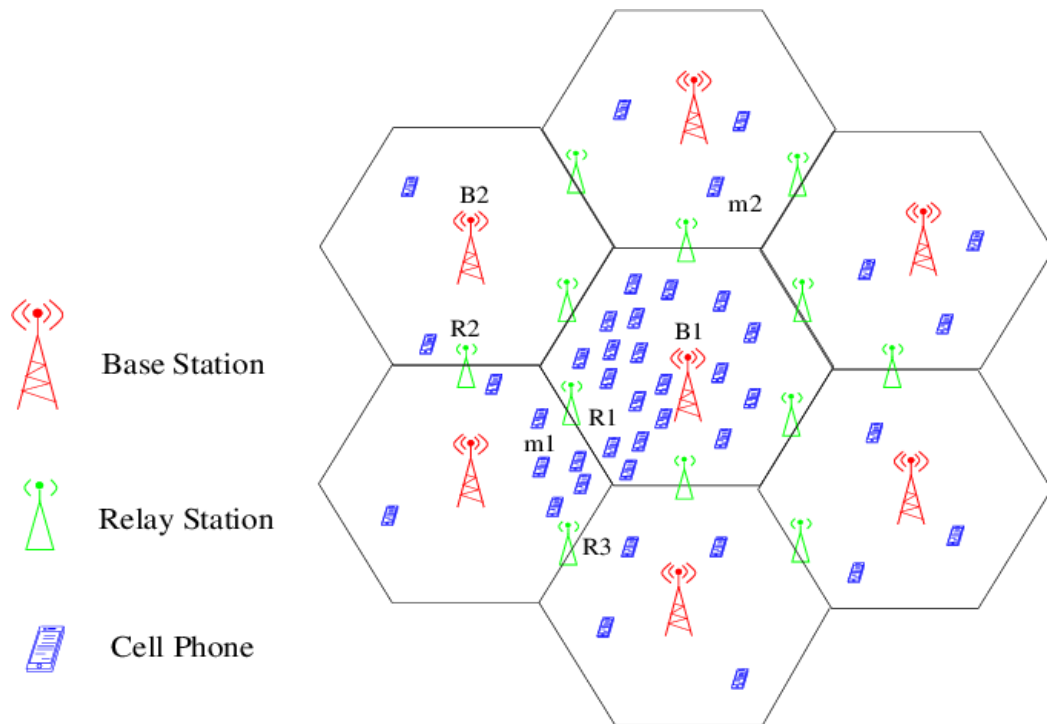
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- **Output:** A permutation $\langle b_1, b_2, \dots, b_n \rangle$ of the input sequence such that $b_1 \leq b_2 \leq \dots \leq b_n$.



Approaches?

Computational Problem

- **Input:** A set of base stations and clients.
- **Output:** The minimum number of frequencies required to be assigned to base stations for proper communication.



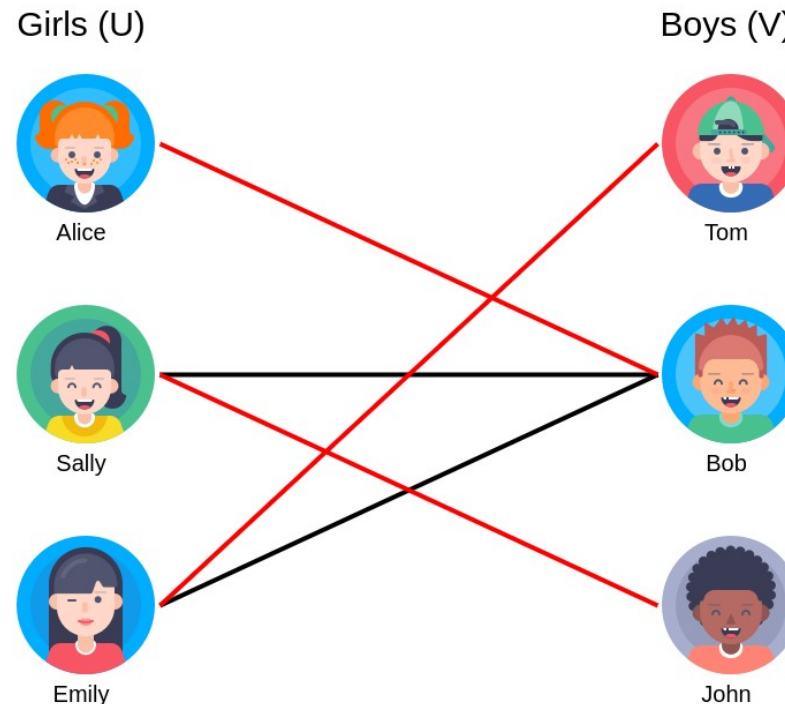
Computational Problem

- **Input:** Map
- **Output:** The minimum number of colors required to color the states such that
 - States that share a boundary are
 - colored distinctly.



Computational Problem

- **Input:** A set of Girls and Boys, and their compatibilities.
- **Output:** Find the maximum number of pairs that are compatible.

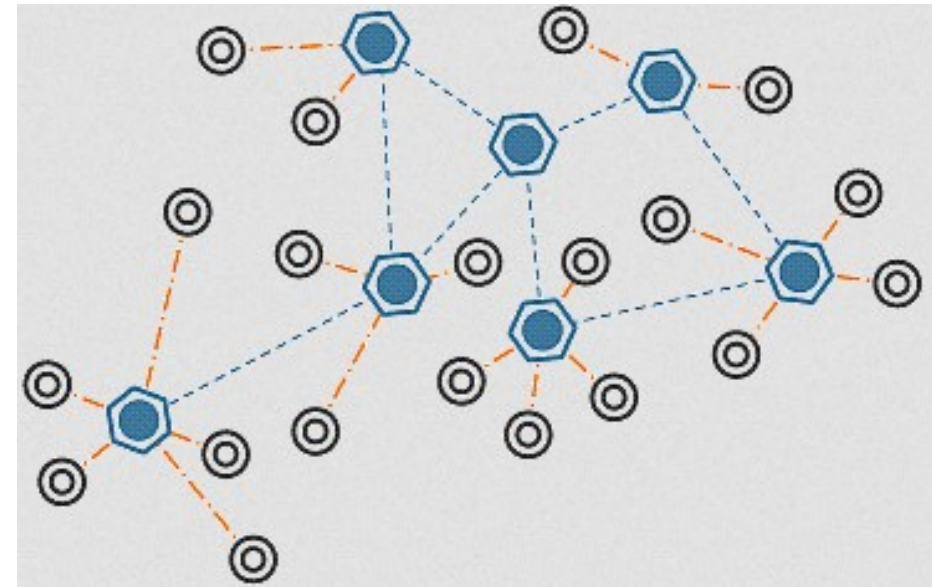


Computational Problem

- **Input**: Potential surveillance points, and the underlying graph.
- **Output**: The minimum number of cameras to be installed such that each region is covered.

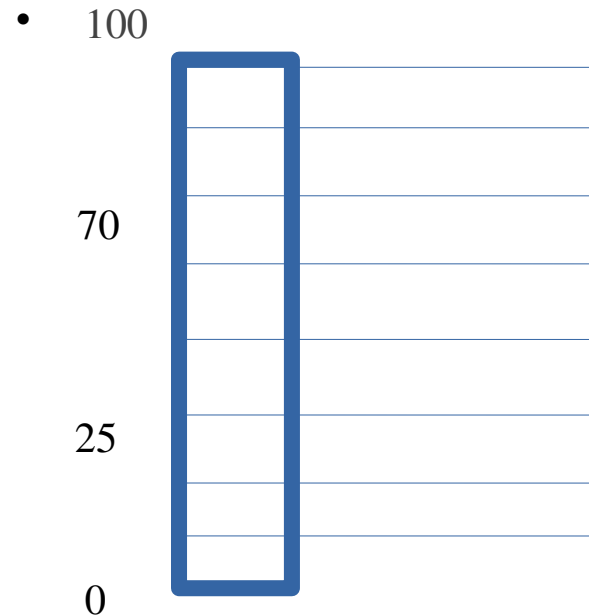
Computational Problem

- **Input:** Potential surveillance points, and the underlying graph.
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Computational Problem *

- **Input:** 2 eggs, and a 100-floor building
- **Output:** Find the highest floor from which you can drop an egg without breaking it, using the minimum number of drops.



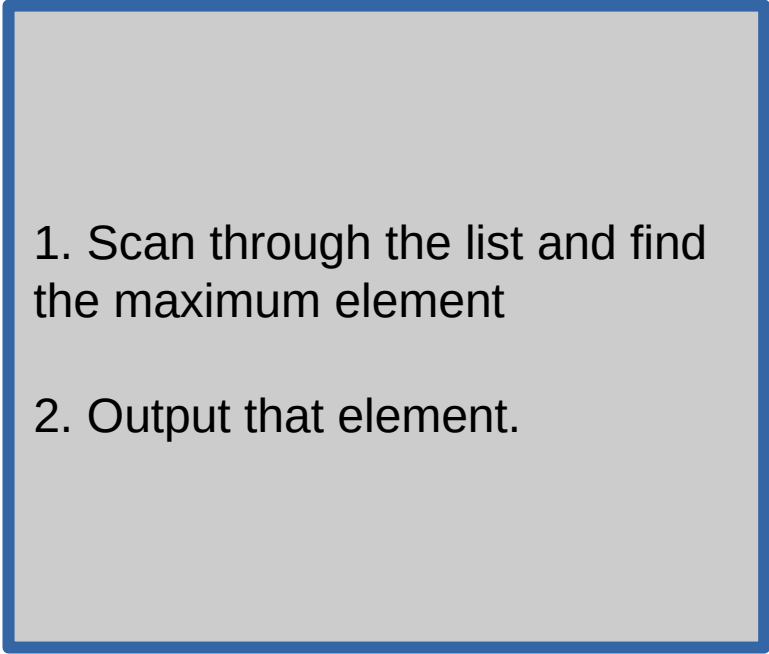
Approaches
?

How to Solve these problems?

- Algorithms using
 - ✓ Recursion
 - ✓ Divide and conquer
 - ✓ Dynamic programming
 - ✓ Greedy
- Reduction to an known problem
- Advanced techniques like combinatorial optimization, LP, randomization, advanced data structures, etc.

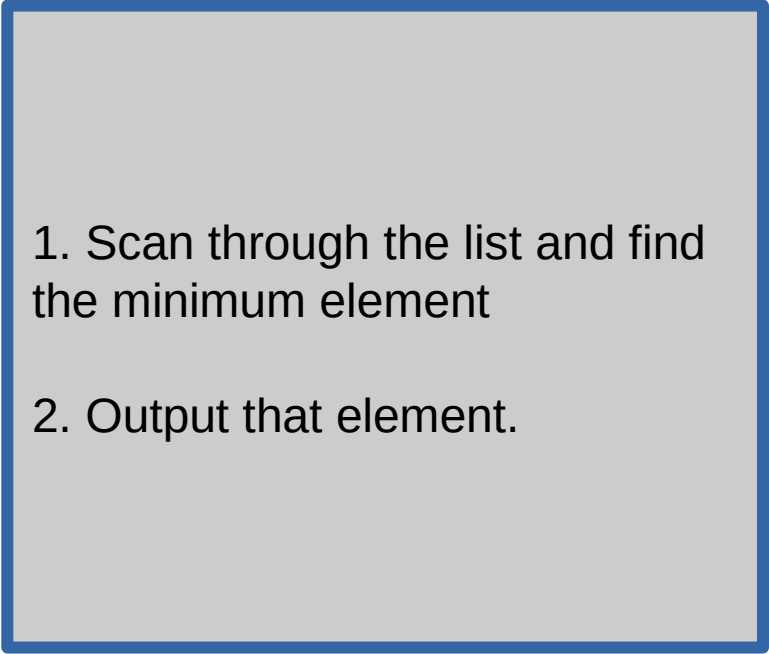
Correct Algorithm

- Problem: find the minimum of all the numbers in a list.



1. Scan through the list and find the maximum element
2. Output that element.

Alg-1

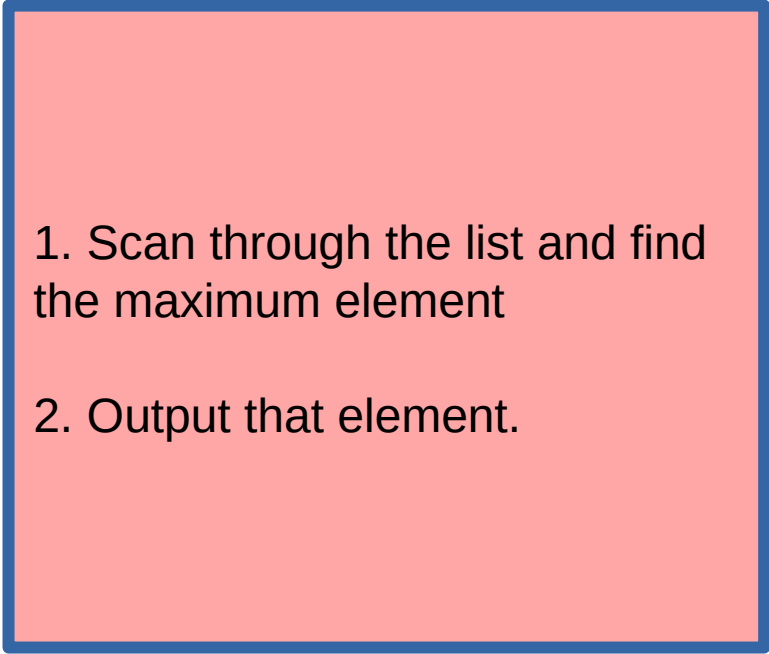


1. Scan through the list and find the minimum element
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Alg-2

Correct Algorithm

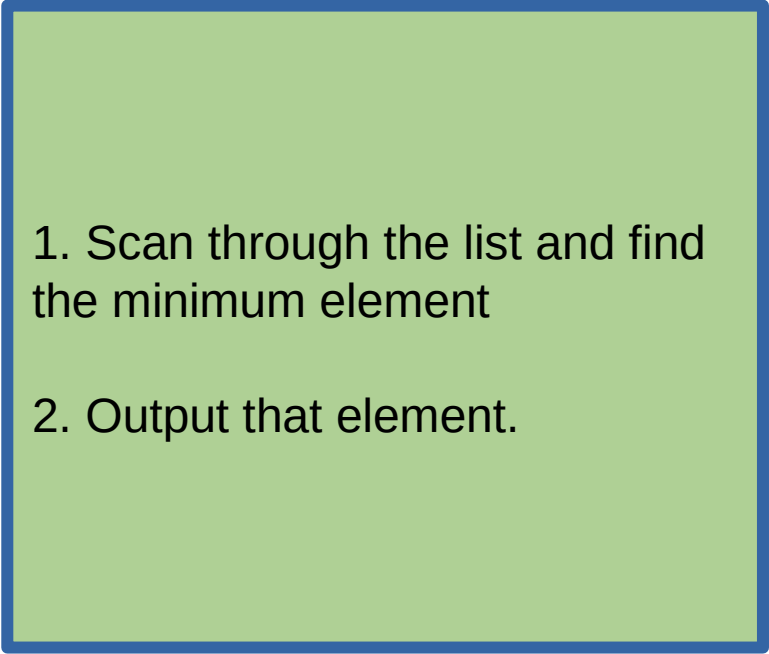
- Problem: find the minimum of all the numbers in a list.



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Alg-1



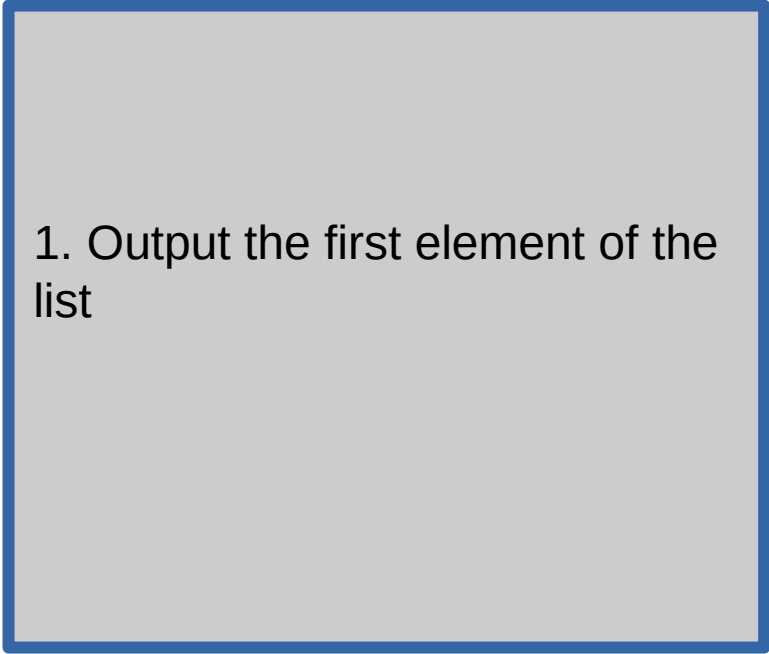
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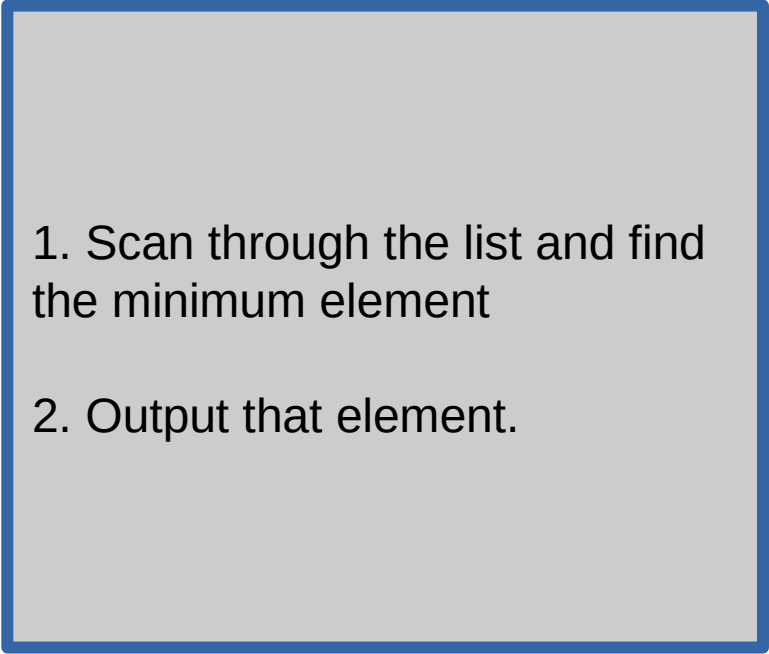
Correct Algorithm

- Problem: find the minimum of all the numbers in a list.



1. Output the first element of the list

Alg-1

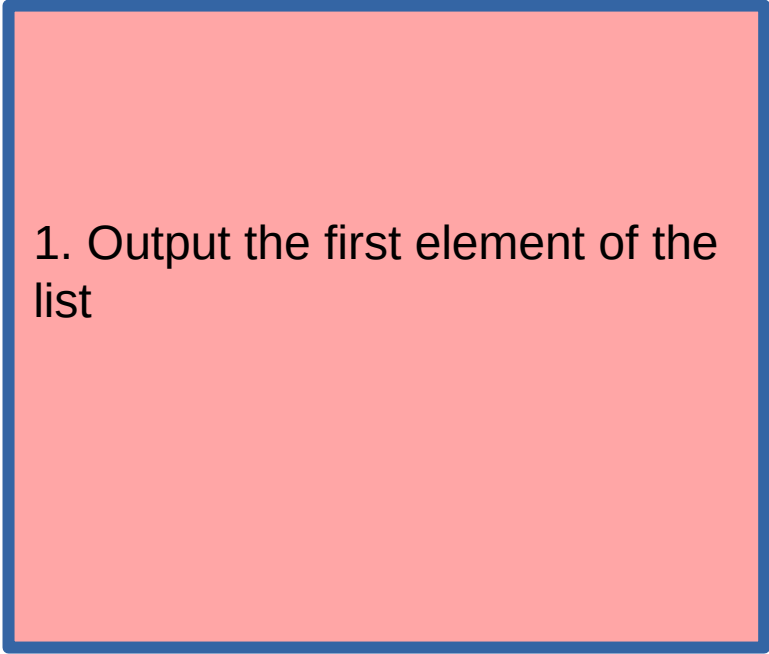


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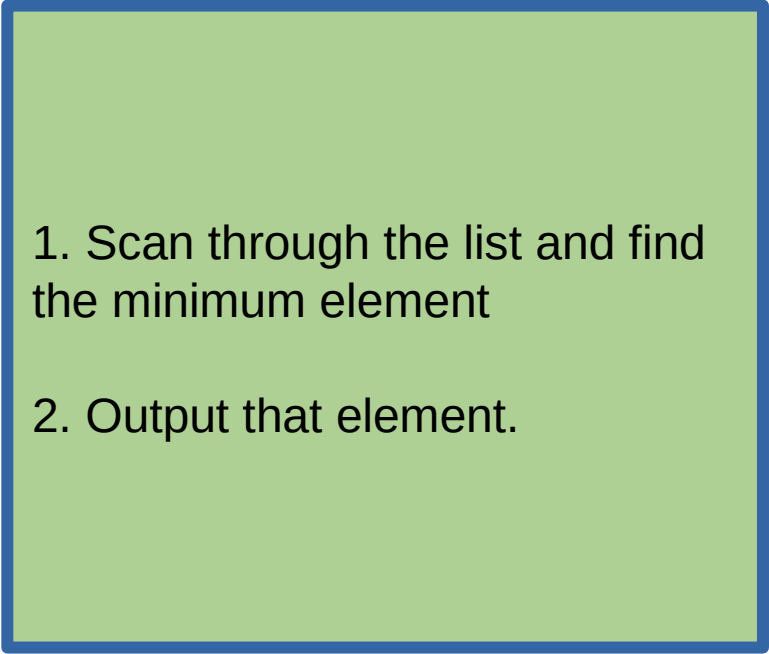
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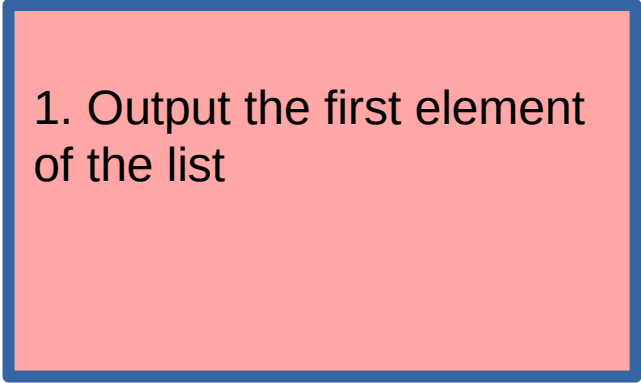


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Alg-2

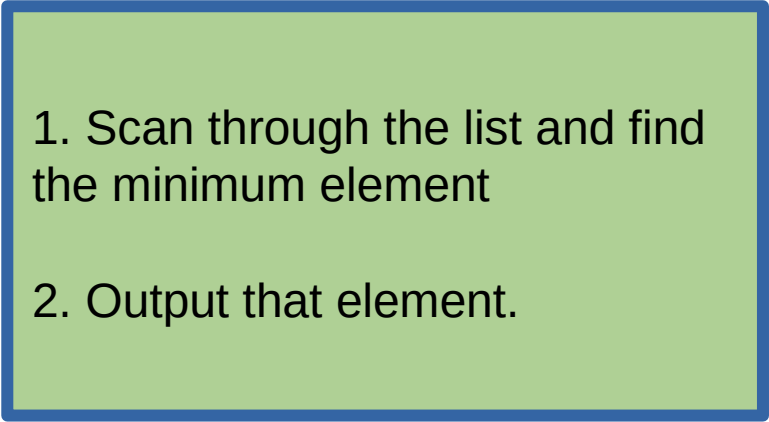
Correct Algorithm

- An algorithm
 - ✓ is **correct** if it returns the **correct answer**
 - × for all the instances.



1. Output the first element of the list

Alg-1



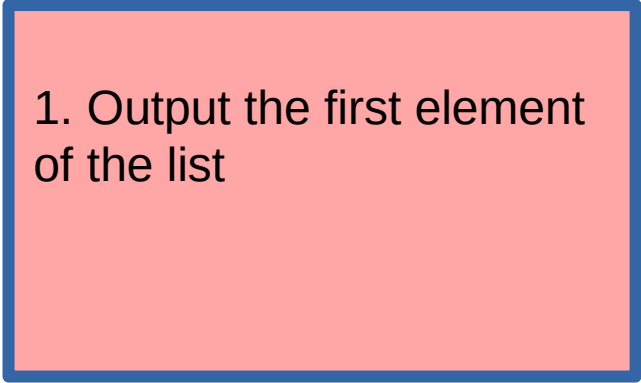
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Alg-2

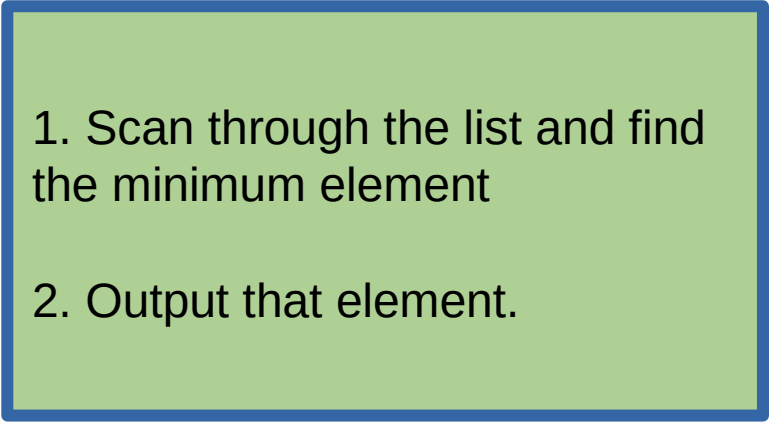
Correct Algorithm

- An algorithm for a **computational problem**
 - ✓ is **CORRECT** if it returns the **correct answer**
 - × for all the instances.



1. Output the first element of the list

Alg-1



1. Scan through the list and find the minimum element

2. Output that element.

Alg-2

What is the need to study algorithms if computers were infinitely fast?

- Algorithm should halt and output the correct solution on each instance.
- Any correct method for solving a problem is good enough.

Computational Problem (revisited)

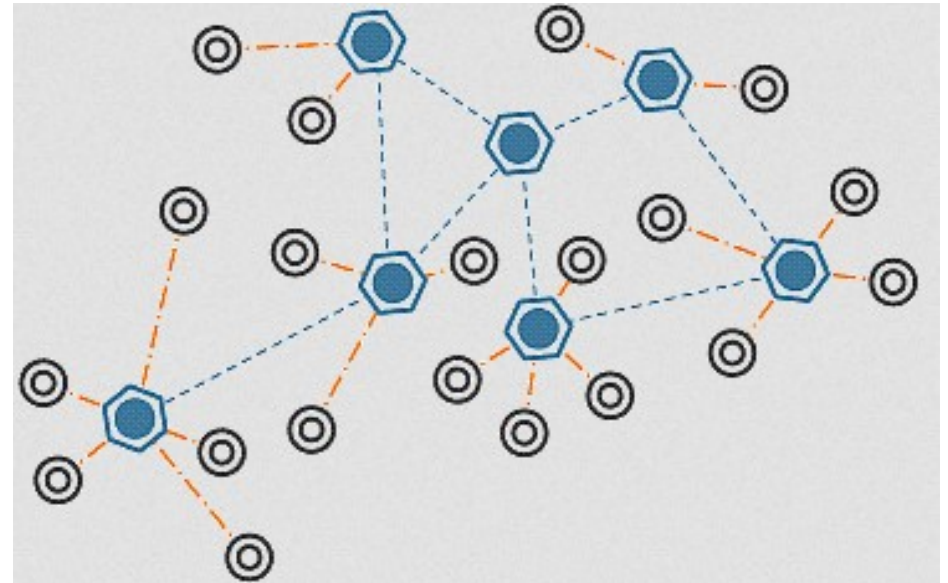
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Approaches?

Computational Problem (revisited)

- **Input:** Potential surveillance points
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Approaches?

What is the need to study algorithms if computers were infinitely fast?

- Algorithm should halt and output the correct solution on each instance.
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Computers are not infinitely fast!

- Computing time is a bounded resource.
- Storage space is another resource.

- **Models of Computation vs Computers**
- **Model of Computation:** an idealized mathematical construct that describes the primitive instructions and other details
- **Computer:** an actual physical device that implements a very specific model of computation

Question: What model of computation will we use to design algorithms? (in this course)

- RAM (Random-Access Machine)

Informal description:

- Basic data types are integer number/float/character
- Instructions execute one after another (no concurrent operations)
- Each instruction takes the same amount of time
- Each data access or storing – takes the same amount of time.

- RAM (Random-Access Machine)

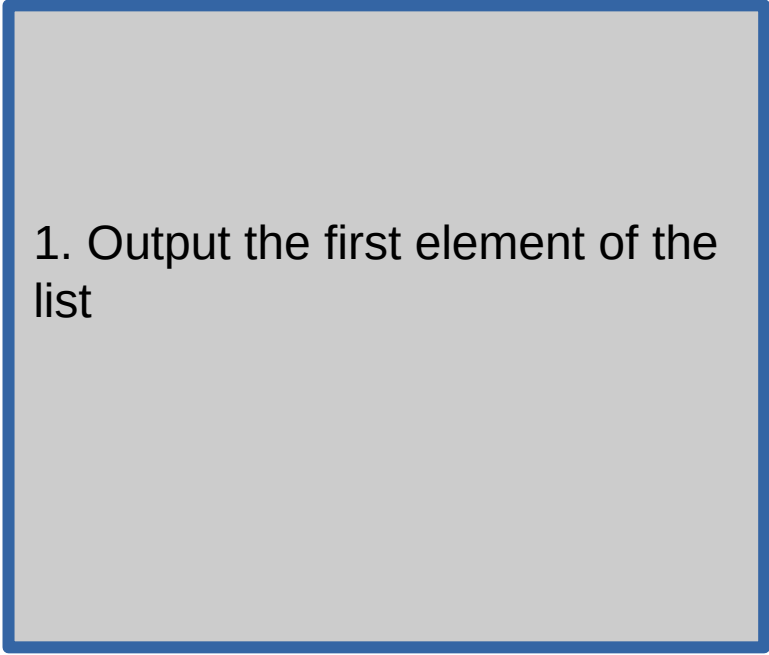
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In this course: we design algorithms assuming RAM model

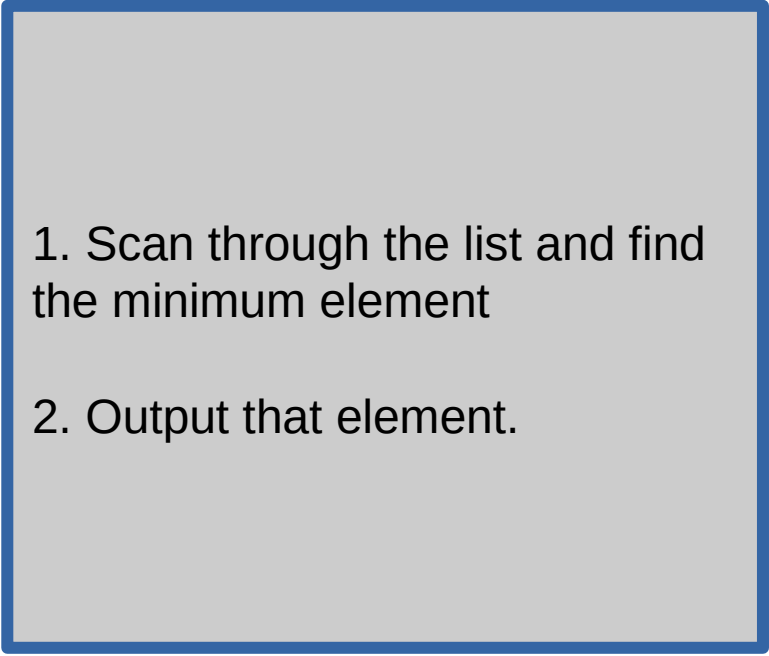
Correct Algorithm

- Problem: find the minimum of all the numbers in a **sorted** list (say ascending order).

A light gray rectangular box with a blue border containing the text for Algorithm 1.

1. Output the first element of the list

Alg-1

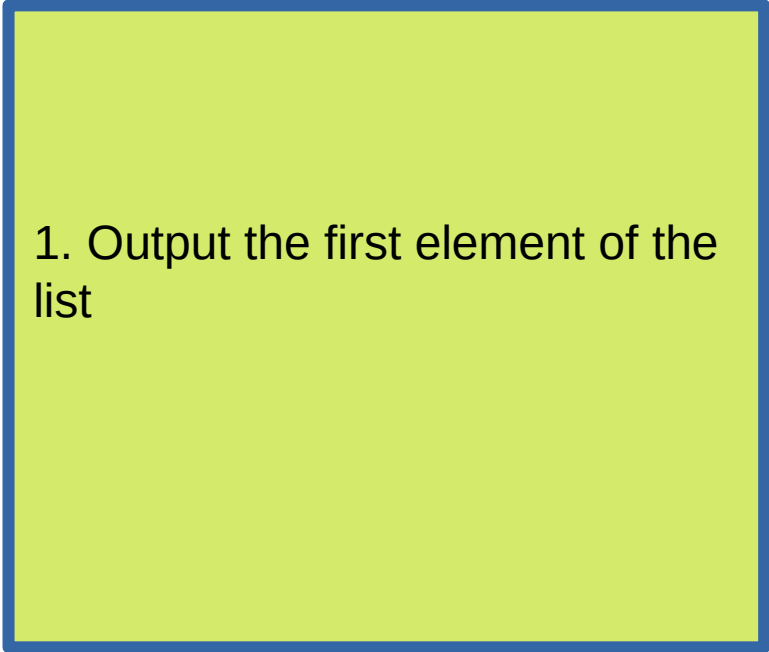
A light gray rectangular box with a blue border containing the text for Algorithm 2.

1. Scan through the list and find the minimum element
2. Output that element.

Alg-2

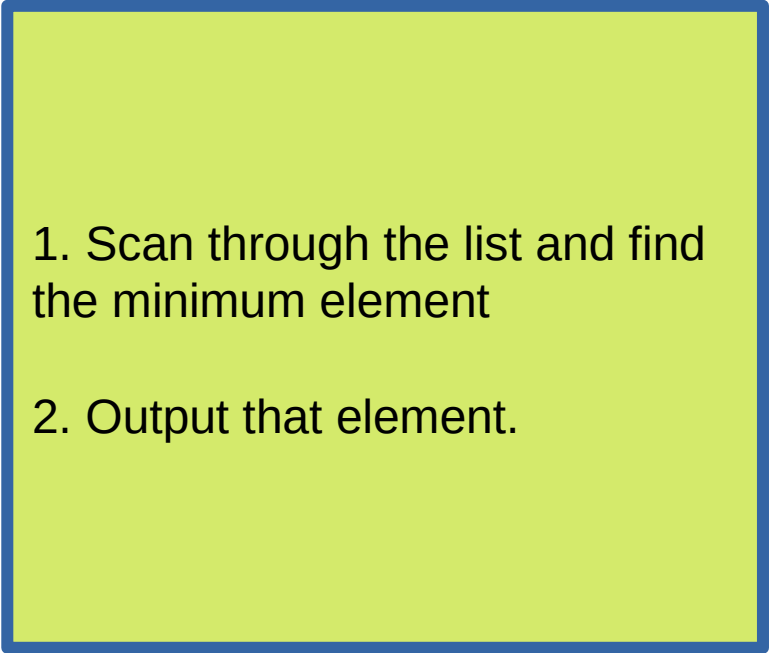
Correct Algorithm

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Alg-1



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Alg-2

Computational Problem

- **Input:** A sequence of numbers $\langle a_1, a_2, \dots, a_n \rangle$
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Approaches?

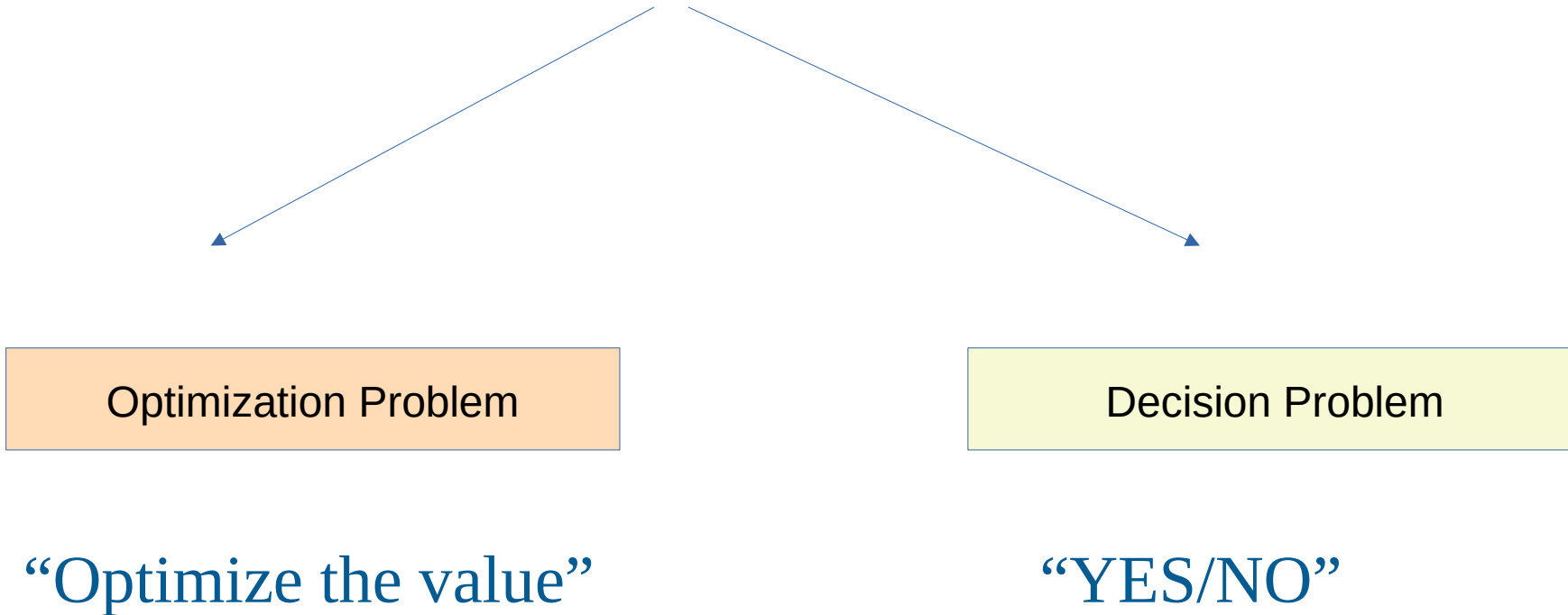
Algorithm

- Correctness of the algorithm
- Resources (time and space)



Efficiency

Computational Problem



Optimization/Decision Problem

GRAPH COLORING

Optimization/Decision Problem

GRAPH COLORING

min number of colors for a proper coloring of the graph

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(s,t)-SHORTEST PATH

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(s,t)-SHORTEST PATH

length of a shortest path between two vertices s and t

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HAMILTONIAN CYCLE

Optimization/Decision Problem

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HAMILTONIAN CYCLE

does there exist a cycle that contains every vertex of the graph

Optimization/Decision Problem

GRAPH COLORING

min number of colors for a proper coloring of the graph

(s,t)-SHORTEST PATH

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MST

Optimization/Decision Problem

GRAPH COLORING

min number of colors for a proper coloring of the graph

(s,t)-SHORTEST PATH

length of a shortest path between two vertices s and t

HAMILTONIAN CYCLE

does there exist a cycle that contains every vertex of the graph

MST

minimum weight of a tree that contains every vertex of the graph

SORTING

Optimization or Decision version?

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Input: A sequence of numbers $\langle a_1, a_2, \dots, a_n \rangle$

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Suggestions?

- Maximize the sum of difference between consecutive elements?
- Minimize the sum of difference between consecutive elements?
- Does there exist a permutation in increasing sequence?
-

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Inference?

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Questions

Is GRAPH COLORING polynomial time solvable?

Questions

Is GRAPH COLORING polynomial time solvable?

Is MAP COLORING polynomial time solvable?



Questions

Can you formulate GRAPH COLORING as a **decision problem**?

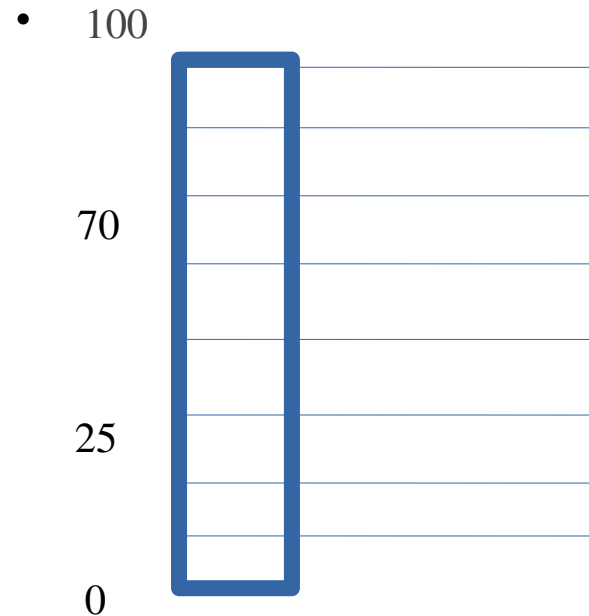
Can you formulate GRAPH COLORING as an **optimization problem**?

Questions

Can you use decision version to find the optimum value, for GRAPH COLORING?

Computational Problem *

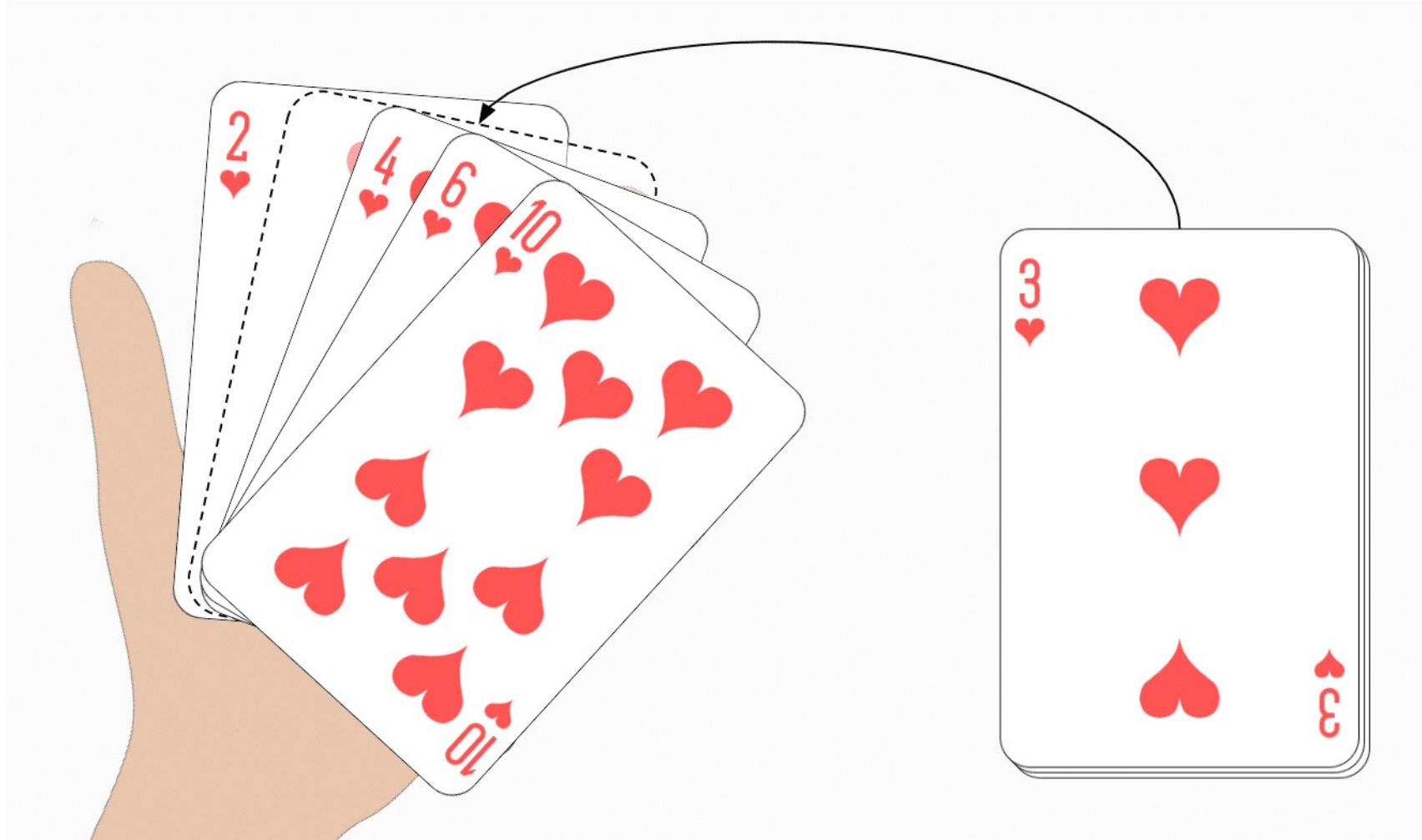
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Approaches
?

INSERTION-SORT

INSERTION-SORT



INSERTION-SORT

EXAMPLE: INSERTION-SORT

INSERTION-SORT(A, n)

```
1  for  $i = 2$  to  $n$ 
2       $key = A[i]$ 
3      // Insert  $A[i]$  into the sorted subarray  $A[1 : i - 1]$ .
4       $j = i - 1$ 
5      while  $j > 0$  and  $A[j] > key$ 
6           $A[j + 1] = A[j]$ 
7           $j = j - 1$ 
8       $A[j + 1] = key$ 
```

INSERTION-SORT

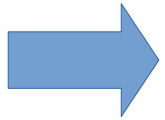
Will you get the same run time of the code when you run multiple times?

INSERTION-SORT

NO

Will you get the same run time of the code when you run multiple times?

So, we better analyse the algorithm itself



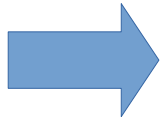
- How many times each line of pseudocode is executed?
- How long each line takes to run?

INSERTION-SORT

NO

Will you get the same run time of the code when you run multiple times?

So, we better analyse the algorithm itself



- How many times each line of pseudocode is executed?
- How long each line takes to run?

Find the dominating factor (to analyze other algorithms)

Design and Analysis of Algorithms

Analyzing time complexity

Exercise: For each function $f(n)$ and time t in the following table, determine the largest size n of a problem that can be solved in time t , assuming that the algorithm to solve the problem takes $f(n)$ microseconds.

	1 second (10^6 us)	1 minute ($6 \cdot 10^7$ us)	1 hour ($3.6 \cdot 10^9$ us)	1 day ($8.64 \cdot 10^9$ us)
$\log n$				
n				
$n \log n$				
n^2				
n^3				
2^n				
$n!$				

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$\log n$	2^{10^6}			
n				
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Analyzing time complexity

Exercise: For each function $f(n)$ and time t in the following table, determine the largest size n of a problem that can be solved in time t , assuming that the algorithm to solve the problem takes $f(n)$ microseconds.

	1 second (10^6 us)	1 minute ($6 \cdot 10^7$ us)	1 hour ($3.6 \cdot 10^9$ us)	1 day ($8.64 \cdot 10^9$ us)
$\log n$	2^{10^6}			
n	10^6			
$n \log n$	$\sim 62,746$			
n^2	$\sim 1,000$			
n^3	~ 100			
2^n	~ 19			
$n!$	~ 9			

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$\log n$	2^{10^6}			$2^{8.64 \cdot 10^9}$
n	10^6			
$n \log n$	$\sim 62,746$			
n^2	$\sim 1,000$			
n^3	~ 100			
2^n	~ 19			~ 36
$n!$	~ 9			~ 16