

# Data Structures and Algorithms

(ESO207)

## Lecture 13:

- **Majority element** : an efficient and practical algorithm
- **word RAM** model of computation: further refinements.

# Majority element

**Definition:** Given a **multiset**  $S$  of  $n$  elements,

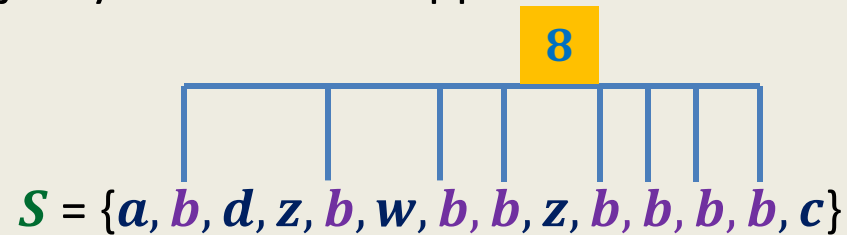
$x \in S$  is said to be majority element **if** it appears more than  $n/2$  times in  $S$ .

$$S = \{a, b, d, z, b, w, b, b, z, b, b, b, b, c\}$$

# Majority element

**Definition:** Given a **multiset**  $S$  of  $n$  elements,

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**Problem:** Given a **multiset**  $S$  of  $n$  elements, find the majority element, if any, in  $S$ .

# Majority element

Trivial algorithms:

## Algorithm 1:

1. Count occurrence of each element
2. If there is any element with count  $> \frac{n}{2}$ , report it.

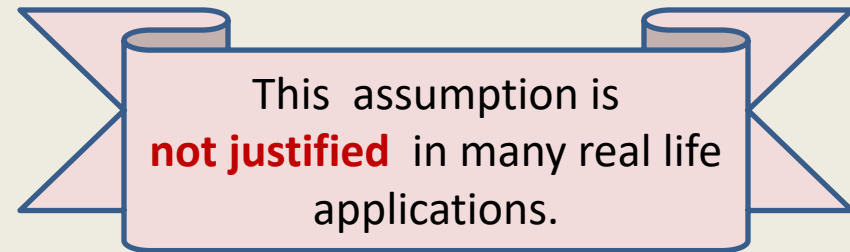
Running time:  $O(n^2)$  time

# Majority element

## Trivial algorithms:

### Algorithm 2:

1. Sort the set  $S$  to find its median
2. Let  $x$  be the median
3. Count the occurrence of  $x$ , and
4. return  $x$  if its count is more than  $\frac{n}{2}$



Running time:  $O(n \log n)$  time

**Critical assumption** underlying Algorithm 2 :

elements of set  $S$  can be compared under some total order ( $=, <, >$ )

# A real life application

Slots for inserting any two cards



Card-matching machine

## Problem:

Given  $n$  credit cards, determine if there is a pair of cards that are identical using minimum no. of operations on cards.

This machine takes two cards and determines whether they are identical or not.

# Some observations

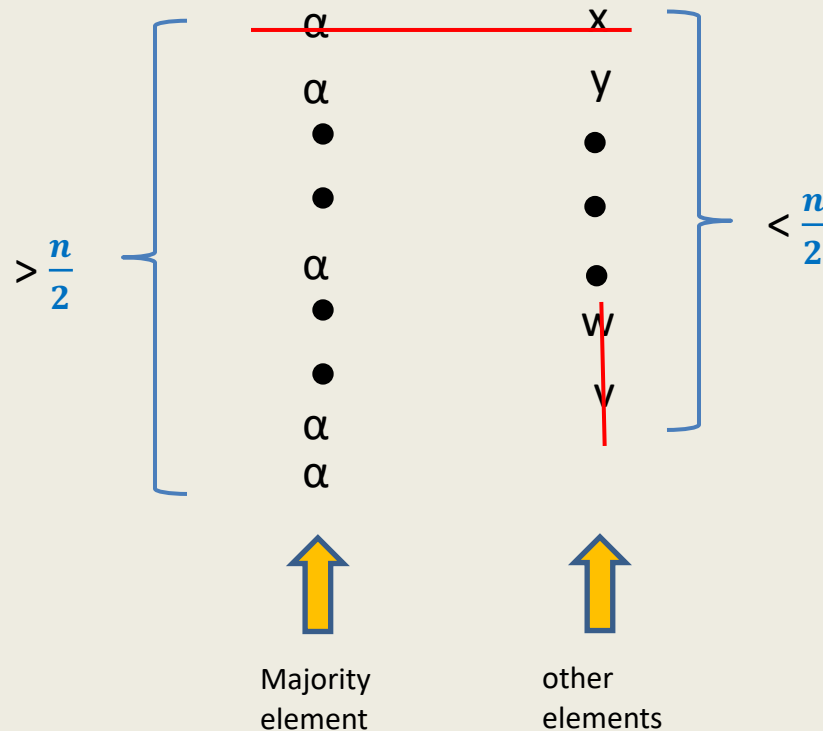
**Problem:** Given a **multiset**  $S$  of  $n$  elements,  
where the only relation between any two elements is  $\neq$  or  $=$  ,  
find the majority element, if any, in  $S$ .

**Question:** How much time does it take to determine if an element  $x \in S$  is majority ?

**Answer:**  $O(n)$  time

**Observation 1:** It is easy to verify whether an element is a majority

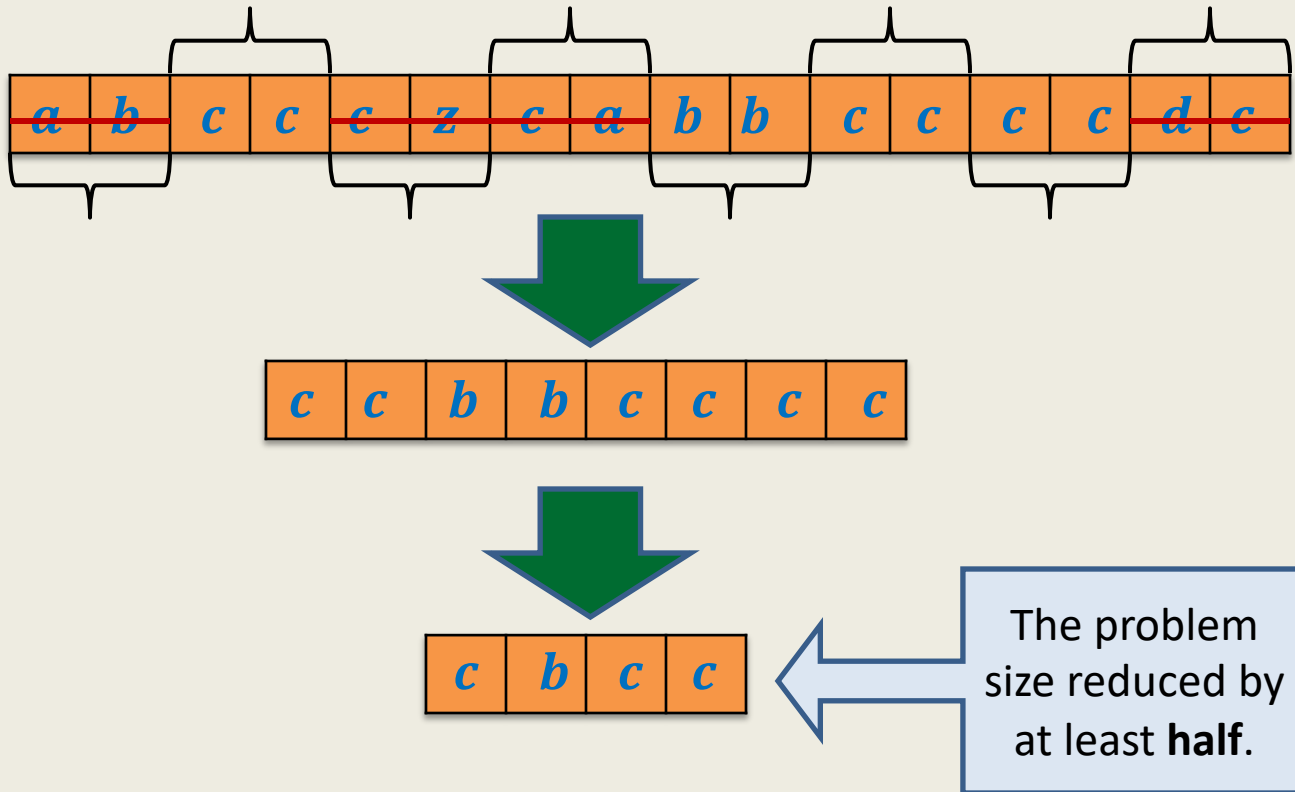
# Some observations



**Observation 2:** whenever we cancel a pair of distinct elements from the array, the majority element of the array remains preserved.



# Some observations



**Observation 3:** If there are  $m$  pairs of **identical elements**, then majority element is preserved even if we keep **one element** per pair.

# Algorithm for 2-majority element

## Repeat

1. Pair up the elements; Take care if the no. of elements is odd
2. **Eliminate** all pairs of distinct elements;
3. **Keep one element** per pair of identical elements.

**Until** only one element is left.

Verify if the last element is a **majority** element.

**Time complexity:**

$$T(n) = c n + c \frac{n}{2} + c \frac{n}{4} + \dots$$

**$O(n)$**  time

**Extra/working space requirement** (assuming input is “read only”)

**$O(n)$**

# Further **restrictions** on the problem

## Restrictions:

- We are allowed to make single scan.
- We have very limited extra space.



Our current algorithm doesn't work for this real life example.

## Real life example:

There are  $10^{12}$  numbers stored on hard disk.

**RAM** can't provide  $O(n)$  extra (working) space in this case.

# ALGORITHM FOR 2-MAJORITY ELEMENT

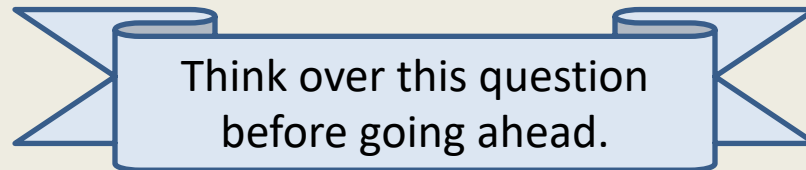
- Single scan and
- $O(1)$  extra space

# Designing algorithm for 2-majority element single scan and using $O(1)$ extra space

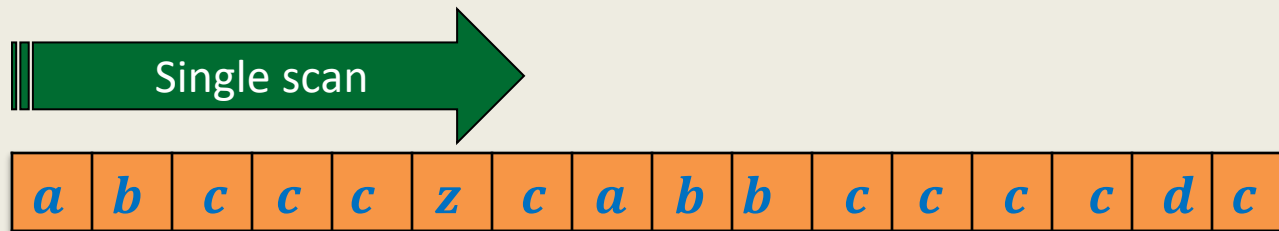
**Question:** Should we design algorithm from scratch to meet these constraints ?

**Answer:** No! We should try to adapt our current algorithm to meet these constraints.

**Question:** How crucial is pairing of elements in our current algorithm ?



# Designing algorithm for 2-majority element single scan and using $O(1)$ extra space



## Insightful questions:

- Do we really need to keep more than one element ?

**No.** Just cancel suitably whenever encounter two *distinct* elements.

- Do we really need to keep multiple copies of an element **explicitly** ?

**No.** Just keeping its count will suffice.

Ponder over these insights and make an attempt to design the algorithm  
before moving ahead 😊

# Algorithm for 2-majority element single scan and using $O(1)$ extra space

**Algo-2-majority(A)**

```
{  count ← 0;
  for( $i = 0$  to  $n - 1$ )
  {    if ( count=0 ){  $x \leftarrow A[i]$ ;
                                count ← 1;
      }
    else if( $x \neq A[i]$ ) count ← count - 1 ;
    else               count ← count + 1 ;
  }
```

Count the occurrences of  $x$  in  $A$ , and if it is more than  $n/2$ , then  
**print**( $x$  is 2-majority element) **else print**(there is no majority element in A)

```
}
```

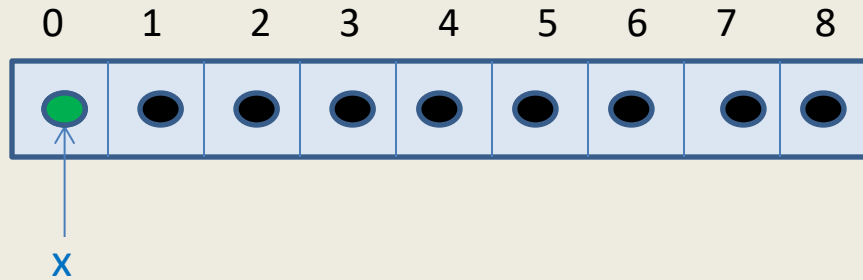
# Algorithm for 2-majority element single scan and using $O(1)$ extra space

**Theorem:** There is an algorithm that makes just a **single scan** and uses  $O(1)$  **extra space** to compute majority element for a given multi-set.

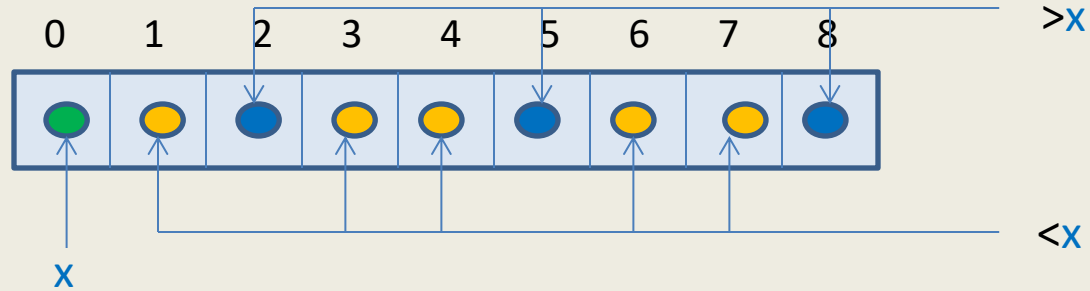
**Homework:** Algorithm for 3-majority element



# A nice programming exercise ?



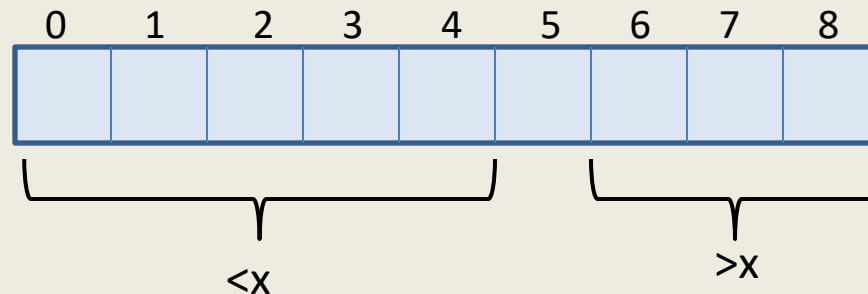
# A nice programming exercise ?



# A nice programming exercise ?



Implement **Partition()**  
in  $O(n)$  time  
using  $O(1)$  space?



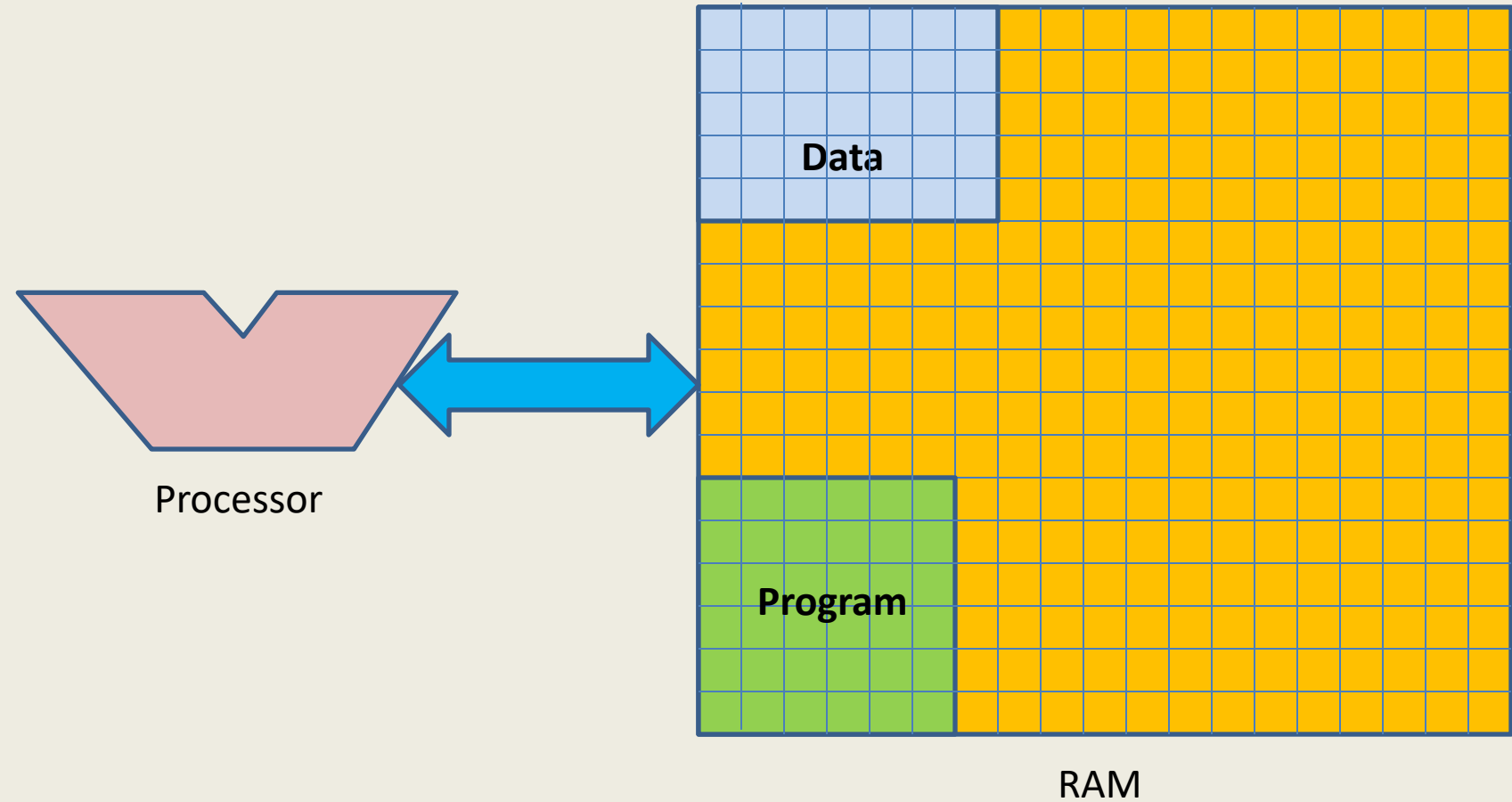
This procedure is called **Partition**.

It **rearranges** the elements so that all elements less than  $x$  appear to the left of  $x$  and all elements greater than  $x$  appear to the right of  $x$ .

# **Word RAM** model of computation

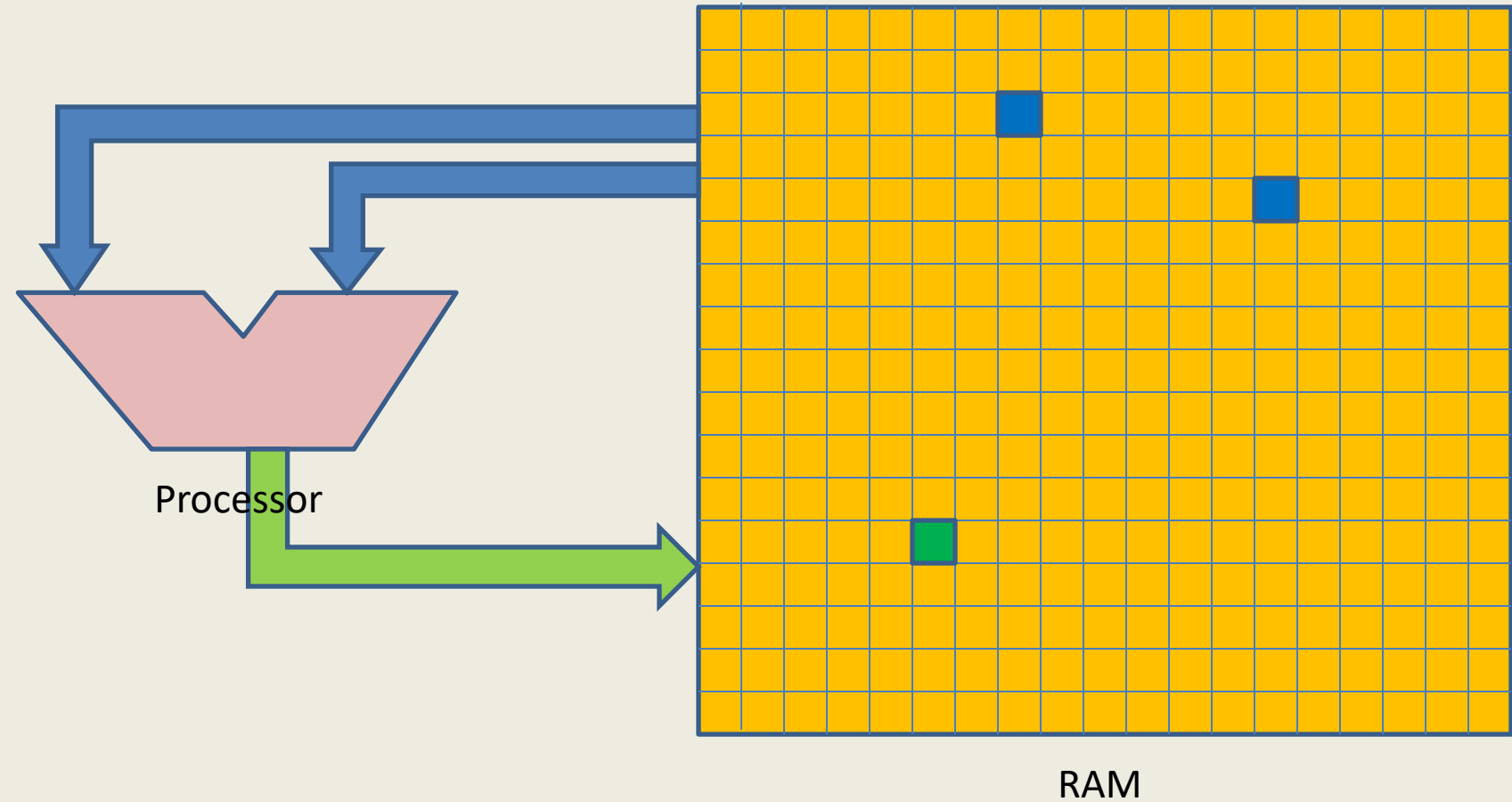
Further refinements

# word RAM : a model of computation



# Execution of a instruction

(fetching the operands, arithmetic/logical operation, storing the result back into RAM)



# A more realistic RAM

$n$  : input size

**Input** resides completely in **RAM**.

**Question:** How many bits are needed to access an input item from **RAM** ?

**Answer:** At least  $\log n$ .

( $k$  bits can be used to create at most  $2^k$  different addresses)

**Current-state-of-the-art computers:**

- RAM of size **4GB**

Hence 32 bits to address any item in RAM.

- Support for **64-bit arithmetic**

Ability to perform arithmetic/logical operations on any two 64-bit numbers.

# word RAM model of computation:

## Characteristics

- Word is the basic storage unit of RAM. Word is a collection of few bytes.
- Data as well as Program reside fully in RAM.
- Each input item (number, name) is stored in binary format.
- RAM can be viewed as a huge array of words. Any arbitrary location of RAM can be accessed in the same time irrespective of the location.
- Each arithmetic or logical operation (+, -, \*, /, or, xor, ...) involving  $O(\log n)$  bits takes a constant number of steps by the CPU, where  $n$  is the number of bits of input instance.