

Parma University, Math Department

Algorithms and Data Structures
(models of computation)

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Preliminaries

- Materials: Books, Syllabus, Handouts
- Homeworks and Exams
- Contact: pellegrini@imc.pi.cnr.it,
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- Summary of first lecture: models of computation, informal definition of algorithms, formal definitions, pseudocode.

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Example: Euclid's Algorithm

Algorithm E (*Euclid's algorithm*).

Given two positive integers m and n , find their greatest common divisor (gcd), that is, the largest positive integer that divides both m and n .

- E0.** [Ensure $n \leq m$] If $m < n$ exchange m and n .
E1. [Find remainder] Divide m by n , let r be the remainder.
E2. [Is it zero?] If $r=0$, terminate and n is the answer.
E3. [Reduce] Set $m \leftarrow n$, $n \leftarrow r$, and go back to step E1.

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Informal notion of Algorithm

Synonymous: recipe, process, method, technique, procedure, routine.

- 1) Finiteness. Must terminate after a finite number of steps; must have a finite description.
- 2) Definiteness. Each step must be defined precisely.
- 3) Input. Inputs come from a specified domain.
- 4) Output. Having a predefined relation to the input.
- 5) Effectiveness. Each step must be basic for an agent (person or device).

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A formal definition: I

An algorithm is a quadruple (Q, I, Ω, f) .

Q is the set of states. $I \subset Q$ is the set of input states.

$\Omega \subset Q$ is the set of output states. $f: Q \rightarrow Q$ is a function that leaves Ω pointwise fixed.

For every $x \in I$ a computational sequence is as follows:

$$x_0 = x, \quad x_{k+1} = f(x_k) \quad \text{for } 0 \leq k.$$

Let h be the smallest integer such that $f(x_h) \in \Omega$.

If h is defined the computation terminates in h steps with output x_h .

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A formal definition II: rewriting system

Let Σ be a finite set of symbols. Let Σ^* be the set of finite strings in the alphabet Σ . Let N be a positive integer. Encode $Q = \Sigma^* \times [0, N]$, $I = \Sigma^* \times \{0\}$, $\Omega = \Sigma^* \times \{N\}$.

For every $j \in [0, N[$, define θ_j and ϕ_j strings Σ^* and a_j, b_j in $[0, N]$.

$f(\sigma, j) = (\sigma, a_j)$ if θ_j is not a substring of σ .

$f(\sigma, j) = (\alpha \phi_j \omega, b_j)$ if α is the shortest string s.t. $\sigma = \alpha \theta_j \omega$

$f(\sigma, N) = (\sigma, N)$.

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A formal definition III

k-tape Turing machine

A k-tape TM is made of:

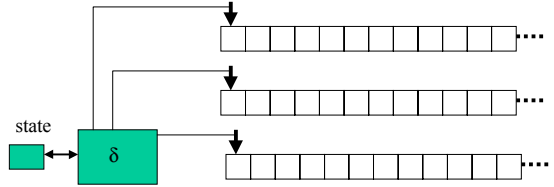
- (1) a finite control set U ,
- (2) k semi-infinite tapes made of cells, each tape has a R/W head.
- (3) Each cell holds a character from the alphabet Σ_i .
- (4) The input alphabet is $\Sigma_i \subset \Sigma_i$, and the blank $b \in \Sigma_i \setminus \Sigma_i$.
- (5) Initial state is $u_0 \in U$, final state is $u_f \in U$.
- (6) The move function $\delta: U \times \Sigma_i^k \rightarrow U \times (\Sigma_i \times \{L, R, S\})^k$

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Initially:

- (a) the state is u_0 ;
- (b) all R/W heads are in tape position 1;
- (c) The input string is in tape 1, from position 1 followed by blanks, all other tapes are blank.



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Interpretation of a δ -move:

- (1) read the current state, the characters under the k heads as arguments of δ ,
- (2) interpret the value of δ as, the new state, characters to be written under the R/W head, moves of the R/W heads to the Left, Right or Stay.

Termination is when u_f is reached.

The output is a string of Σ_i^* in the last tape from position 1.

Optionally we may ask the TM to be reset (i.e. all other tapes blank, all heads in position 1).

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A formal definition IV

Successor-RAM

- (1) Each variable holds a natural number.
- (2) A denumerable set of input variables X_1, X_2, \dots
- (3) A denumerable set of output variables Z_1, Z_2, \dots
- (3) A denumerable set of local variables Y_1, Y_2, \dots
- (4) A Program, that is a sequence of statements.
- (5) An Instruction Register pointing at the next program instruction to be executed.

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Instruction repertoire:

- (a) [label] $V \leftarrow V+1$
- (b) [label] $V \leftarrow V-1$
- (c) [label] $V \leftarrow V$
- (d) [label] if ($V=0$) goto label
- (e) stop

Initially all variables are set to 0, except the variables holding the input. The IR points at the first instruction.

The algorithm stops when the *stop* instruction is reached; the last instruction of the program is always *stop*.

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A classical RAM model

- 1) each cell or register holds a natural number
- 2) A semi-infinite input tape of cells X_1, X_2, \dots together with a Read head.
- 3) A semi-infinite output tape of cells Z_1, Z_2, \dots together with a Write head.
- 4) A semi-infinite memory of registers R_1, R_2, \dots
- 5) An Accumulator Register, an Instruction register
- 6) A Program, a sequence of statements (with labels).

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Instruction repertoire:

- (a) Input/Output control (read, write, move heads)
- (b) Load/Store from the Accumulator
- (c) Arithmetic operations / Boolean operations.
- (d) Branching (conditional, unconditional)
- (e) Termination

Addressing modes:

- (a) literal constant
- (b) direct addressing
- (c) indirect addressing

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Operational Stements have a typical form:
 ([label] Operation code, address mode, operand).

Branching Stements have a typical form:
 ([label] Operation code, label).

This RAM model is rather close to the actual functioning of computers from the 1950's onward. Except that:

- (a) memory is a *finite* sequence of registers
- (b) each cell can store a *finite* subset of integers in binary.

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Time Cost Models

For $x \in I$, the Turing machine time cost $T_{TM}(x)$ is the number of steps of the computation of the TM having x as input.

For $x \in I$, the Unit Cost RAM time $T_{URAM}(x)$ is the number of stements executed in a computation of the RAM machine having x as input.

For $x \in I$, the Logarithmic cost RAM time $T_{LRAM}(x)$ is the sum of local costs of stements executed in a computation of the RAM machine having x as input.

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The local cost function

Define the following auxilairy logarithmic like function:

$$l(0) = 1$$

$$l(i) = 1 + \lceil \log |i| \rceil$$

For (op,i) in literal mode: $t_{op} + l(i)$.

For (op,i) in direct mode: $t_{op} + l(i) + l(R[i])$.

For (op,i) in indirect mode: $t_{op} + l(i) + l(R[i]) + l(R[R[i]])$.

The Log cost model is more faithful, but harder to use.

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Worst, best, average cases

Let A be any of the algorithms seen so far, and C any of the cost models seen so far we have $T_{AC}: I \rightarrow \mathbb{N}$.

Define a complexity measure $\| : I \rightarrow \mathbb{N}$. (e.g. input length)

Worst case time cost: $T_{AC}^W(n) = \max_{x \in I, \|x\|=n} T_{AC}(x)$

Best case time cost: $T_{AC}^B(n) = \min_{x \in I, \|x\|=n} T_{AC}(x)$

Let us associate a positive probability $p(x)$ to every $x \in I$

Average case time cost: $T_{AC}^{Av}(n) = \sum_{x \in I, \|x\|=n} p(x) T_{AC}(x)$

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Arithmetic operations

- SRAM (Successor RAM): allows only inceremetns and decremetns.
- RAM (Standard RAM): allows sums and subtractions.
- MRAM (Multiplicative RAM): allows sums, subtraction, multiplication and division.
- MBRAM (Multiplicative Boolean RAM): allows sums, subtraction, multiplication, division and bit-wise operations.

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Simulations

An algorithm A is composed of a machine model M and a Program P . If for every program P on M we have on a machine M' a program P' simulating P then we talk of *machine simulations*.

How does the Time complexity of algorithms behave across machine simulations?

All RAM models with Logarithmic Cost are *polynomially* related to TM.

The MRAM with Unit Cost is *exponentially* related to MRAM with Logarithmic Cost.

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Sorting on RAM

Simulations involve *all* programs in a machine model. What can we say about programs realizing *specific* functions?

Sorting in the unit cost comparison-RAM requires $\Omega(n \log n)$ time.

Sorting in a RAM with $+$, $-$, and $*$ (but no division, nor bit-wise operations) requires $\Omega(n \log n)$ time in the unit cost model.

BUT

Sorting in a RAM with $+$, $-$, $*$, division and bit-wise operations) is done in $O(n)$ time in the unit cost model.

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Bounded Word RAM

Since 1990's the sorting and searching problems are studied in a more advanced model called Bounded Word RAM.

Each register can hold up to b bits, thus store a number between 0 and $2^b - 1$.

The time complexity is a function of b and $n < 2^b$.

Unit Cost RAM Models are the machine of choice for the analysis of *specific* algorithms and this is safe provided tricks are not allowed, such as using long integers and precomputed lookup tables.

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Pseudo-codes

Some textbooks describe algorithms using pseudo-codes similar to Pascal or Algol or C or Java etc..

The underlying model is still a (Unit Cost) RAM, and we assume the existence of a Compiler that translates the pseudo-code into a RAM program at cost $O(1)$ per instruction.

Pseudocodes have:

(1) structured control, (2) basic types and aggregate types, (3) assignments, (4) arithmetic, (5) subroutines with parameter passing conventions, (6) comments (7) de-referencing.

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Code (C) vs Pseudo-code (P-C)

- (a) Occasionally we use natural language in P-C.
- (b) Type declarations are avoided in P-C.
- (c) Allowable basic types and aggregates are not limited.
- (d) In P-C we use standard mathematical notation.
- (e) In P-C we avoid issues like Input/Output from peripherals, error handling, memory management, etc..
- (f) P-C is usually *imperative*, since functional of logical languages tend not to have efficient simulations on RAM machines.

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Example: Insertion-Sort

```
INSERTION-SORT(A:array of integers)
FOR j:=2 TO length[A]
  DO key := A[j]
  i := j-1
  WHILE i > 0 AND A[i] > key
    DO A[i+1] := A[i]
    i := i-1
  END WHILE
  A[i+1] := key
END FOR
```

Insertion-sort works incrementally, assuming $A[1..j]$ sorted, finds the proper position of $A[j+1]$ thus obtaining $A[1..j+1]$ sorted.

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Considerations on insertion-sort

- INSERTION-SORT terminates on every input.
- INSERTION-SORT is correct, that is, always gives the elements of the input array A in sorted order in the output array A.
- INSERTION-SORT uses only the input storage plus 3 registers (i, j, key).
- We have used arrays with indices starting from 1.
- What happens with an array of one element only?

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Time analysis of INSERTION-SORT

```

INSERTION-SORT(A:array)
FOR j:=2 TO length[A]..... (n-1)
DO key := A[j]..... (n-1)
i := j-1..... (n-1)
WHILE i > 0 AND A[i] > key..... 2(t2+...+tn)
DO A[i+1] := A[i]..... (t2-1+...+tn-1)
i := i-1..... (t2-1+...+tn-1)
END WHILE
A[i+1] := key..... (n-1)
END FOR
    
```

Where n is the number of elements of A and t_j is the number of elements in $A[1..j]$ that are $\geq A[j]$.

$$T(n) = 4(n-1) + 4(t_2 + \dots + t_n) - 2(n-1)$$

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Since $1 \leq t_j \leq j$ we have:

- (a) Best case: $t_j=1$ for every j, so $T(n) = 6(n-1)$.
 (b) Worst case: $t_j=j$ for every j, so $T(n) = 4n-5 + n(n+1)/2$

We have counted in a unit cost model for pseudo-code instructions. To have the RAM unit cost we should take into consideration the compilation overhead.

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Conclusions

We have seen:

- (1) an example of an algorithm: Euclid's algorithm
- (2) Informal notion of algorithm
- (3) Several formalizations (TM, RAM models)
- (4) Simulations. Time complexity.
- (5) Unit cost RAM models: pros and cons.
- (6) Example: insertion-sort.

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