Fundamental Computer Science

Giorgio Lucarelli

giorgio.lucarelli@imag.fr

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http://moais.imag.fr/membres/giorgio.lucarelli/FCS

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Definitions

Consider a Turing Machine $M = (K, \Sigma, \Gamma, \delta, s, H)$ such that $H = \{y, n\}$.

Any halting configuration whose state component is y (for "yes") is called an **accepting configuration**, while a halting configuration whose state component is n (for "no") is called a **rejecting configuration**.

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We say that M decides a language $L \subseteq \Sigma^*$ if for any string $w \in \Sigma^*$: if $w \in L$ then M accepts w; and if $w \notin L$ then M rejects w.

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We say that M recognizes (or semidecides) a language $L \subseteq \Sigma^*$ if for any string $w \in \Sigma^*$: $w \in L$ if and only if M accepts w.

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A language L is called **Turing-recognizable** (or **recursively enumerable**) if there is a Turing Machine that recognizes it.

Theorem

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Proof.

Basic theorems

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Proof.

$$\delta'(q,a) = \left\{ \begin{array}{ll} n & \text{if } \delta(q,a) = y \\ y & \text{if } \delta(q,a) = n \\ \delta(q,a) & \text{otherwise} \end{array} \right.$$

$$(s, {\underline{\sqcup}} w) \vdash^*_M (h, {\underline{\sqcup}} y)$$

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Example



The output with input $\sqcup 100010111$ is ...

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The output with input $\Box 100010111$ is ... $\Box 100011000$

Computes the function succ(n) = n + 1 in binary

Prove that the language $L = \{a^n b^n c^n : n \ge 0\}$ is decidable.

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- ▶ Present Turing Machines that decide the following languages over {a, b}:
 (a) Ø
 (b) {€}
 (c) {a}
 (d) {a}*
- Give a Turing Machine that *recognizes* the language a^*ba^*b .

We have already seen an extension:

- write in the tape and move left or right at the same time
- ► modify the definition of the transition function initial: from (K \ H) × Γ to K × (Γ ∪ {←, →}) extended: from (K \ H) × Γ to K × Γ × {←, →}

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- ► modify the definition of the transition function initial: from (K \ H) × Γ to K × (Γ ∪ {←, →}) extended: from (K \ H) × Γ to K × Γ × {←, →}
- ▶ if the extended Turing Machine halts on input w after t steps, then the initial Turing Machine halts on input w after at most 2t steps

A k-tape Turing Machine (M) is a sextuple $(K, \Sigma, \Gamma, \delta, s, H)$, where K, Σ , Γ , s and H are as in the definition of the ordinary Turing Machine, and δ is a transition function

 $\text{from} \quad (K \setminus H) \times \Gamma^k \quad \text{ to } \quad K \times (\Gamma \cup \{\leftarrow, \rightarrow\})^k$



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from $(K \setminus H) \times \Gamma^k$ to $K \times (\Gamma \cup \{\leftarrow, \rightarrow\})^k$ (from $(K \setminus H) \times \Gamma^k$ to $K \times \Gamma^k \times \{\leftarrow, \rightarrow\}^k$)



Theorem

Every k-tape, k > 1, Turing Machine $M = (K, \Sigma, \Gamma, \delta, s, H)$ has an equivalent single tape Turing Machine $M' = (K', \Sigma', \Gamma', \delta', s', H')$.

If M halts on input $w\in \Sigma^*$ after t steps, then M' halts on input w after O(t(|w|+t)) steps.

Sketch of the proof:

- M' simulates M in a single tape
- \blacktriangleright # is used as delimiter to separate the contents of different tapes
- dotted symbols are used to indicate the actual position of the head of each tape
 - for each symbol $\sigma \in \Gamma$, add both σ and $\overset{\bullet}{\sigma}$ in Γ'
- use the same set of halting states



M' = "On input $w = w_1 w_2 \dots w_n$:

1. Format the tape to represent the \boldsymbol{k} tapes:

 $#w_1w_2\dots w_n\# \stackrel{\bullet}{\sqcup} \# \stackrel{\bullet}{\sqcup} \#\dots \#$

2. For each step that M performs, scan the tape from left to right to determine the symbols under the virtual heads. Then, do a second scan to update the tapes according to the transition function of M.

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Number of steps for M':

1. O(|w|)

2. & 3. O(|w|+t) per step $\Rightarrow O(t(|w|+t))$ in total

• size of the tape no more than O(|w|+t)

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... and it can be used to simulate functions in an easier way (a function can use one or more not used tapes)





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- σ^2 (as a state): write in the tape 2 the symbol σ
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initially	$\Box w$	
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extend notation:

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at the end	$\sqcup w \sqcup w \underline{\sqcup}$	$\sqcup w \underline{\sqcup}$

transforms w to $w \sqcup w$

Multiple tapes: exercise

 Construct a Turing Machine that adds two binary numbers. Tip: use 2 tapes.

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Give a Machine Turing with two heads that transforms the input $\underline{\Box}w$ to $\underline{\Box}w \sqcup w$.

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$$> R^2_{\sqcup} R^{1,2} \xrightarrow{\sigma^1 \neq \sqcup} \sigma^2$$

$$\downarrow \sqcup^1$$

$$L^{1,2}_{\sqcup} L^2_{\sqcup}$$

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Theorem

Every two-dimensional tape Turing Machine M has an equivalent single-dimensional tape Turing Machine M'.

The simulation by M' of M on an input w which leads to a halting state takes time polynomial to the size of the input |w| and the number of steps t that M performs.

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- use a multiple tape Turing Machine
- ▶ each tape corresponds to one line of the two-dimensional memory

Discussion

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- we can even combine the presented extensions and still not get a stronger model
- Observation: a computation in the prototype Turing Machine needs a number of steps which is bounded by a polynomial of the size of the input and of the number steps in any of the extended model

- Give an example of a Turing machine with one halting state that does not *compute* a function from strings to strings.
- ► Give an example of a Turing machine with two halting states, *y* and *n*, that does not *decide* a language.
- Can you give an example of a Turing machine with one halting state that does not *recognize* a language?
- ► Give a Turing Machine which takes as input an integer written in unary and *computes* the binary representation of the same integer (for example < 11111111111 >₁ becomes < 1011 >₂).

A small exam...

 Construct a Turing Machine that multiplies two binary numbers. Tip: use 3 tapes and the machine that performs the addition of two binary numbers as a subroutine.

Instructions

- groups of at most 4 (and at least 3)
- ▶ 1 answer per group
- ▶ 1 author clearly defined per group
- do not forget to give the names of all members of the group
- ▶ you have 30 minutes