

Universal Turing Machines and Undecidability

Nabil Mustafa

Computational Complexity

Turing machine recap

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- A special register stores the current state.
- 1 input tape, 1 output tape and 1 work tape

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Church-Turing Hypothesis

Every physically realizable computation device can be simulated by a **TM**.

Alphabet size doesn't matter

Claim

*If function f is computable by a **TM** M using alphabet Γ , then it is computable in time $4 \log |\Gamma| \cdot T(n)$ by a **TM** M' using the alphabet $\{0, 1, \square, \triangleright\}$.*

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 - ▶ Use binary encoding. Each symbol encoded by $\log |\Gamma|$ bits.
- How to simulate each step of M .
 - ▶ Read the encoded symbol via $\log |\Gamma|$ bits. **Problem:** remember the bits read.
 - ▶ Modify the transition table appropriately
 - ▶ Lookup the (remembered) read bits in the (modified) table

Remembering bits read

Problem: How to remember the bits read?

Q	Γ	Q	Γ	$\{L,R,S\}$
q	i	q'	j	R

n	x	y	i	b	j	3
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Remembering bits read

Problem: How to remember the bits read?

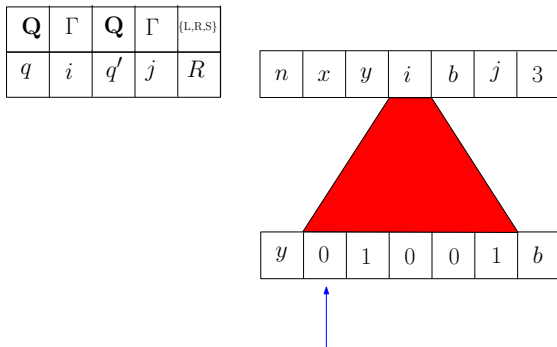
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-----	-----	-----	-----	-----	-----	---

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-----	-------	------	-------	-----

y	0	1	0	0	1	b
-----	---	---	---	---	---	-----



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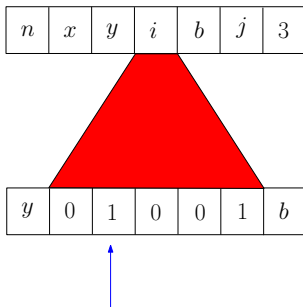


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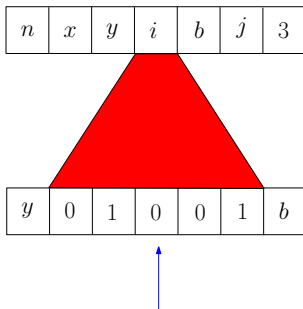


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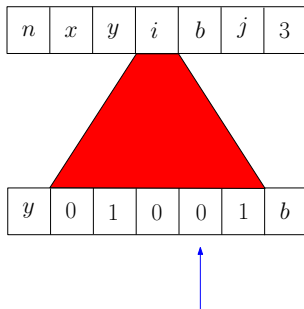


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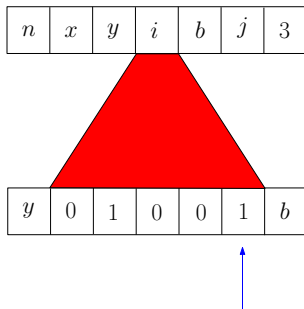


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Lets say that $i \rightarrow 01001$ and $j \rightarrow 01010$. Then,

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$qw_{1.01001}$	—	$qw_{2.01001}$	0	R
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$qw_{4.01001}$	—	$qw_{5.01001}$	1	R
$qw_{5.01001}$	—	q'	0	R

Note: need to move back $2 \log |\Gamma|$ steps as well!

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- Total number of new states required: $|Q||\Gamma|4 \log |\Gamma|$.
- Each step of M requires $5 \log |\Gamma|$ steps of M' .
- Total time taken: $5 \log |\Gamma| T(n)$ steps.

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Proof

- Lets consider that a **TM** M computes the function f and has k tapes (plus additional input and output tapes)
- Next we consider a single work tape Turing machine \hat{M}
- \hat{M} encodes the k tapes of M on a single tape by using locations $1, k+1, 2k+1, \dots$ to encode the first tape, locations $2, k+2, 2k+2, \dots$ to encode the second tape etc.
- For every symbol a in M 's alphabet, \hat{M} will contain both the symbol a and the symbol \hat{a} . In the encoding of each tape, exactly one symbol will be of the ' $\hat{}$ ' type', indicating that the corresponding head of M is positioned in that location.

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Proof Cont'd

- To simulate one step of M , the machine makes two passes of its work tape: first it traverses the tape in the left-to-right direction and records (via additional states) the k symbols of the form \hat{a}
- Then \hat{M} uses M 's transition function to determine the new state, symbols, and head movements and sweeps the tape back in the right-to-left direction to update the encoding accordingly.
- \hat{M} will never reach more than location $kT(n)$ of its work tape, meaning that for each of the at most $T(n)$ steps of M , \hat{M} performs at most $5kT(n)$ work (sweeping back and forth requires about $2T(n)$ steps, and some additional steps needed for updating head movement and book keeping).

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- So *UTM* takes α and x , and simulates M_α on x .

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- So we just have to design a **TM** that can run the above algorithm.

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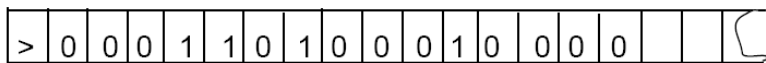
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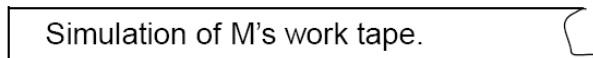
Simulating M_α

Input
tape

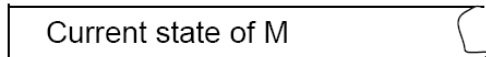
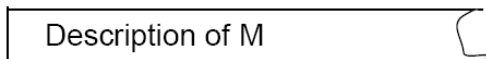


(used in the same way as M)

Work
tapes



(used in the same way as M)



Output
tape



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A Quote

“If we were so clever that we could understand our brain, our brain would be so complex that we couldn’t understand it.”

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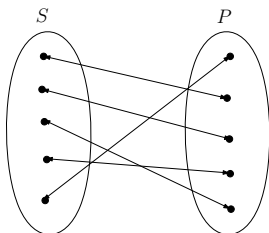
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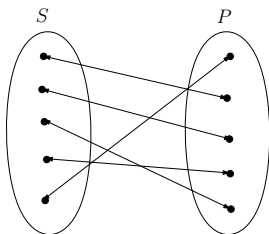
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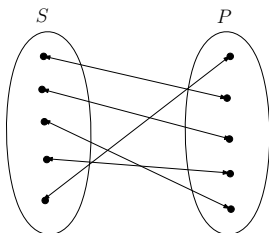
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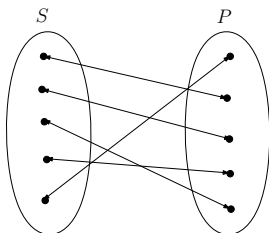
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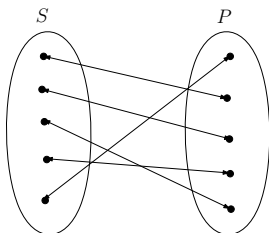
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Question: What about an infinite set, and its power set?

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- Consider the following set $A' \in P$:

$$A' = \{i \in S : i \notin f(i)\}$$

- A' : All i which are not present in the set $f(i)$

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- If the answer is **'No'**:
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Proof Cont'd

- Now let's look at A' more closely
- Since f is a bijection, $\exists j$ such that $f(j) = A'$
- Here is the fatal question: Is $j \in A'$?
- If the answer is 'Yes':
 - ▶ If $j \in A'$, then by definition of A' , j maps to a set which does not contain j
 - ▶ Contradiction!
- If the answer is 'No':
 - ▶ If $j \notin A'$, then j is mapping to a set (A') which doesn't contain j . So by definition of A' , j should be in A' .
 - ▶ Contradiction!

Important Corollary

Given *any* function $f : S \rightarrow P$, there always exists a $p_j \in P$ such that no $s_i \in S$ maps to p_j .

A Quote

“It seemed unworthy of a grown man to spend his time on such trivialities, but what was I to do?” –Bertrand Russell.

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- By previous corollary, $\exists p_k \in P$ s.t. no s_i maps to p_k
 - ▶ Then there is no **TM** that decides the language L_k !

HALT

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 - ▶ When M_H would halt with a 'No', D also halts.



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- This type of argument is called a *diagonalization* argument.

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