# Foundations of Computing 

Lecture 13

Arkady Yerukhimovich

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## Outline

## (1) Lecture 12 Review

## (2) Some More Turing Machines

## (3) Turing Machine Variants

## Lecture 12 Review

- Turing Machines
- Definition
- Examples
- Church-Turing Thesis Informally: Anything that can be computed can be computed by a Turing Machine.


## Running $M$ on $w=00$



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Let's consider an execution on input 00 (as a sequence of configurations)

$$
q_{1}: 0 \cup \sqcup \rightarrow \sqcup q_{2} \circ \sqcup \rightarrow \sqcup \times y_{3} \sqcup \rightarrow \sqcup q_{5} \times \sqcup
$$

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## Specification of a Turing Machine

There are several levels of detail for specifying a TM
(1) Full specification

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- Explain algorithmically what happens on the tape
- For example, scan the tape until you find a \#, zig-zag on the tape, etc.
- Don't bother specifying a DFA for the control state


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- Explain algorithmically what happens on the tape
- For example, scan the tape until you find a \#, zig-zag on the tape, etc.
- Don't bother specifying a DFA for the control state
(3) Algorithm specification
- Give algorithm in pseudocode
- Don't explicitly spell out what happens on the tape


## Example 1: $L=\left\{a^{i} b^{j} c^{k} \mid i \times j=k\right.$ and $\left.i, j, k \geq 1\right\}$

## Machine $M$ deciding $L$

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$i$ times

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(1) Restore all the $b$ 's, find next uncrossed off $a$ and repeat Step 3.
(5) If all a's are crossed off, check if all c's are crossed off. Accept if yes, reject if no.


## Example 2 - Build a TM deciding $L$ Below

$L=\left\{\# x_{1} \# x_{2} \# \cdots \# x_{\ell} \mid\right.$ each $x_{i} \in\{0,1\}^{*}$ and $x_{i} \neq x_{j}$ for all $\left.i \neq j\right\}$

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## Multi-Tape Turing Machines



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In each step:

- $M$ can read each tape
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- M can move each tape head Left or Right


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Formally, for $k$ tapes

$$
\delta: Q \times \Gamma^{k} \rightarrow Q \times \Gamma^{k} \times\{L, R\}^{k}
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## Multi-Tape Turing Machines

## Theorem

Every multi-tape TM has an equivalent single-tape TM


## Nondeterministic Turing Machines

## Control (NFA)

Tape: | 0 | 1 | 1 | 0 | ப |
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Intuition:

- The control unit is non-deterministic - many transitions possible on each input
- Execution corresponds to a tree of possible executions
- Accept if any of possible execution leads to accept


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Every nondeterministic TM has an equivalent deterministic TM.

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- Execution of an NTM is a tree of configurations (branches correspond to non-deterministic choices)
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## Theorem

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- Recall that an execution of a DTM is a
 sequence of configurations
- Execution of an NTM is a tree of configurations (branches correspond to non-deterministic choices)
- If any node in the tree is an accept node, the NTM accepts
- To simulate an NTM by a DTM, need to try all configurations in the tree to see if we find an accepting one


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(2) Simulation tape - work tape for the NTM on one branch of nondeterminism

## Nondeterministic Turing Machines



To simulate an NTM $N$ by a DTM $D$, we use three tapes:
(1) Input tape - stores the input and doesn't change
(2) Simulation tape - work tape for the NTM on one branch of nondeterminism
(3) Address tape - use to store which nondeterministic branch you are on

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## Simulating an NTM $N$

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Must traverse NTM tree in breadth-first, not depth-first order

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Must traverse NTM tree in breadth-first, not depth-first order

- Depth-first traversal may get stuck in an infinite loop, and not detect terminating branch


## Next Week

- Languages about machines
- Decidable and undecidable languages

