

# Intro. Algorithms & Models of Computation

CS/ECE 374A, Fall 2022

# Turing Machines

## Lecture 8

Tuesday, September 20, 2022

LaTeXed: October 13, 2022 14:17

## 8.1

### In the search for thinking machines

# “Most General” computer?

1. **DFA**s are simple model of computation.
2. Accept only the regular languages.
3. Is there a kind of computer that can accept any language, or compute any function?
4. Recall counting argument. Set of all languages:  
 $\{\mathbf{L} \mid \mathbf{L} \subseteq \{0, 1\}^*\}$  is ~~countably infinite~~ / uncountably infinite
5. Set of all programs:  
 $\{\mathbf{P} \mid \mathbf{P} \text{ is a finite length computer program}\}$ :  
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6. **Conclusion:** There are languages for which there are no programs.

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# What can be computed?

Most General Computer:

1. If not all functions are computable, which are?
2. Is there a “most general” model of computer?
3. What languages can they recognize?

# History: Formalizing mathematics

1. 19th century: Oops. Math is a mess. Oy.  
Fix calculus, invented set theory (Cantor), etc.
2. David Hilbert (1862–1943)
  - 2.1 1900: The list of 23 problems.
  - 2.2 Early 1900s – crisis in math foundations  
attempts to formalize resulted in paradoxes, etc.
  - 2.3 1920: Hilbert's Program: "mechanize" mathematics.
  - 2.4 Finite axioms, inference rules turn crank, determine truth needed: axioms consistent & complete
  - 2.5 Hilbert: "No one shall expel us from the paradise that Cantor has created."
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German logician, at age 25 (1931) proved: "There are true statements that can't be proved or disproved". (i.e., "no" to Hilbert)  
Shook the foundations of mathematics/philosophy/science/everything.

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## More history: Turing...

Alan Turing (1912–1954):

1. British mathematician
2. cryptoanalysis during WW II (enigma project)
3. Defined a computing model/program. In 1936 (age 23) provided foundations for investigating fundamental question of what is computable, what is not computable.
4. Gay, suicide.
5. Movies, UK apology.
6. Proved the halting theorem: Deciding if a computer program stops on a given input can not be decided by a program.

## Turing original paper...

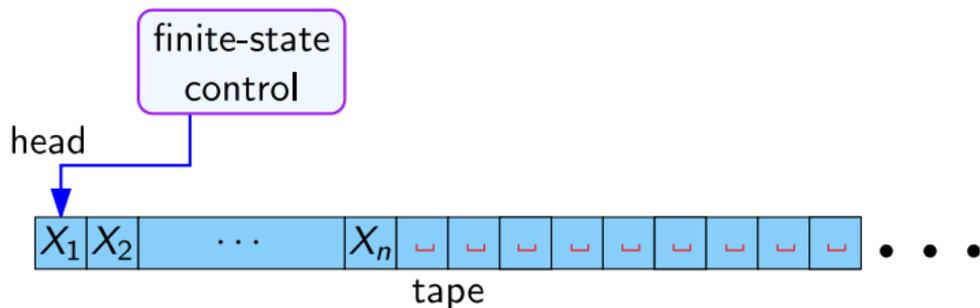
Is quite readable. Available here:

[https://www.cs.virginia.edu/~robins/Turing\\_Paper\\_1936.pdf](https://www.cs.virginia.edu/~robins/Turing_Paper_1936.pdf)

## 8.2

# What is a Turing machine

# Turing machine



1. Input written on (infinite) one sided tape.
2. Special blank characters.
3. Finite state control (similar to **DFA**).
4. Ever step: Read character under head, write character out, move the head right or left (or stay).

## High level goals

1. Church-Turing thesis: **TMs** are the most general computing devices. So far no counter example.
2. Every **TM** can be represented as a string.
3. Existence of Universal Turing Machine which is the model/inspiration for stored program computing. **UTM** can simulate any **TM**
4. Implications for what can be computed and what cannot be computed

# Turing machine: Formal definition

A Turing machine is a 7-tuple

$$(Q, \Sigma, \Gamma, \delta, q_0, q_{\text{acc}}, q_{\text{rej}})$$

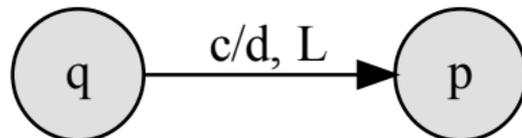
- ▶  $Q$ : finite set of states.
- ▶  $\Sigma$ : finite input alphabet.
- ▶  $\Gamma$ : finite tape alphabet.
- ▶  $\delta : Q \times \Gamma \rightarrow Q \times \Gamma \times \{L, R, S\}$ : Transition function.
- ▶  $q_0 \in Q$  is the initial state.
- ▶  $q_{\text{acc}} \in Q$  is the accepting/final state.
- ▶  $q_{\text{rej}} \in Q$  is the rejecting state.
- ▶  $\sqcup$  or  $\sqsubset$ : Special blank symbol on the tape.

# Turing machine: Transition function

$$\delta : \mathbf{Q} \times \mathbf{\Gamma} \rightarrow \mathbf{Q} \times \mathbf{\Gamma} \times \{L, R, S\}$$

As such, the transition

$$\delta(\mathbf{q}, \mathbf{c}) = (\mathbf{p}, \mathbf{d}, L)$$



1. **q**: current state.
2. **c**: character under tape head.
3. **p**: new state.
4. **d**: character to write under tape head
5. **L**: Move tape head left.

Missing transitions lead to hell state.

“Blue screen of death.”

“Machine crashes.”

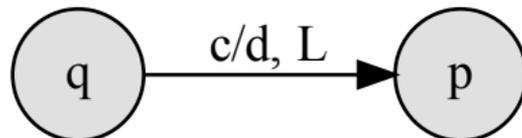
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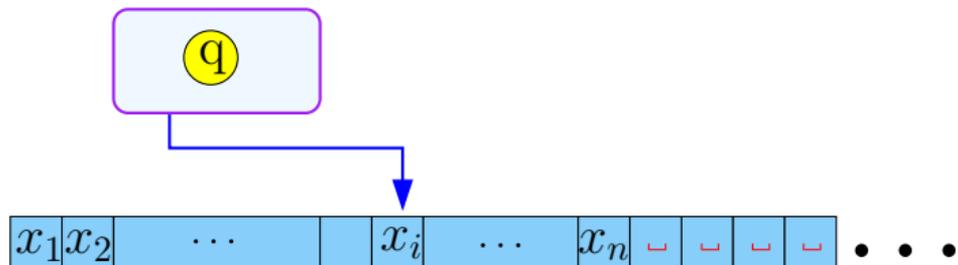
# Snapshots, computation as sequence of strings

# Snapshot = ID: Instantaneous Description

1. Contains all necessary information to capture “state of the computation”.
2. Includes
  - 2.1 state  $q$  of  $M$
  - 2.2 location of read/write head
  - 2.3 contents of tape from left edge to rightmost non-blank (or to head, whichever is rightmost).

# Snapshot = ID: Instantaneous Description

As a string



ID:  $x_1x_2 \dots x_{i-1}\mathbf{q}x_ix_{i+1} \dots x_n$

$x_1, \dots, x_n \in \Gamma, \mathbf{q} \in \mathbf{Q}.$

## A step in computation as rewriting strings

$x_1 x_2 \dots x_{i-1} q x_i x_{i+1} \dots x_n$

If transition is  $\delta(q, X_i) = (p, Y, L)$ , new ID is:

$$\begin{array}{l} \text{current ID :} \\ \delta(q, X_i) = (p, y, L) \implies \end{array} \quad \begin{array}{l} x_1 x_2 \dots x_{i-2} x_{i-1} q x_i x_{i+1} \dots x_n \\ x_1 x_2 \dots x_{i-2} p x_{i-1} y x_{i+1} \dots x_n \end{array}$$

If no transition defined, or illegal transition, then no next ID (crash).

**Shockingly:** Computation is just a string rewriting system.

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# A step in computation as rewriting strings

1. Initial ID:  $q_0w$ :
2. Accepting ID:  $\alpha q_{acc}\alpha'$ , for some  $\alpha, \alpha' \in \Gamma^*$ .
3. Rejecting ID:  $\alpha q_{rej}\alpha'$ , for some  $\alpha, \alpha' \in \Gamma^*$ .
4.  $\mathcal{I} \rightsquigarrow \mathcal{J}$ : Denotes that if we start execution of **TM** with configuration/ID encoded by  $\mathcal{I}$ , leads **TM** (after maybe several steps) to ID  $\mathcal{J}$
5. **M** accepts  $w$ : If for some  $\alpha, \alpha' \in \Gamma^*$ , we have

$$q_0w \rightsquigarrow \alpha q_{acc}\alpha'.$$

Acceptance happens as soon as **TM** enters accept state.

6. Language of **TM** **M**:  $L(M) = \{w \in \Sigma^* \mid M \text{ accepts } w\}$ .

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# Non-accepting computation

**M** does not accept **w** if:

1. **M** enters  $q_{rej}$  (i.e., **M** rejects **w**)
2. **M** crashes (moves to left of tape, no transition available, etc).
3. **M** runs forever.

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Everything is a number

## 8.4

### Languages defined by a Turing machine

# Recursive vs. Recursively Enumerable

1. Recursively enumerable (aka RE) languages

$$L = \{L(M) \mid M \text{ some Turing machine}\}.$$

2. Recursive / decidable languages

$$L = \{L(M) \mid M \text{ some Turing machine that halts on all inputs}\}.$$

3. Fundamental questions:

3.1 What languages are RE?

3.2 Which are recursive?

3.3 What is the difference?

3.4 What makes a language decidable?

3.5 How much wood would a TM chuck, if a TM could chuck wood?

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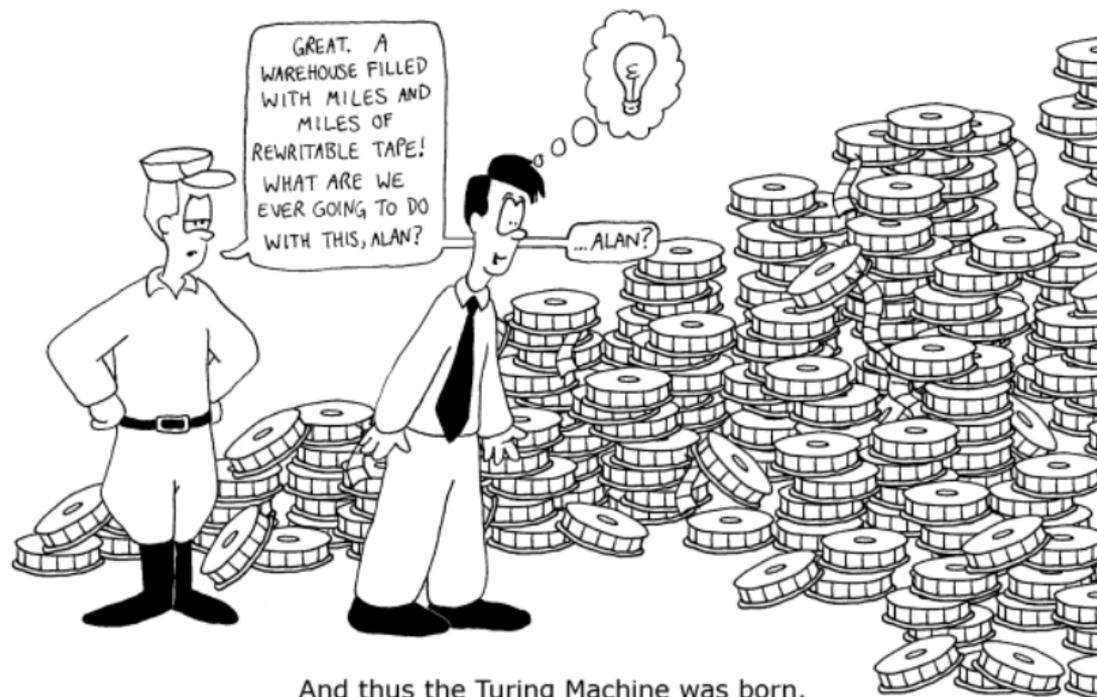
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# How was the Turing Machine invented...



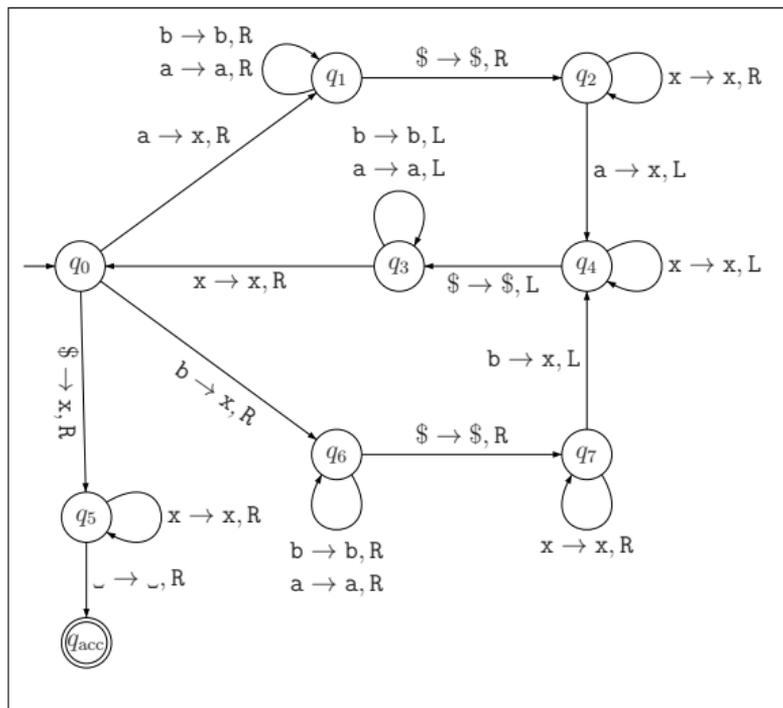
## 8.5

### Some examples of Turing machines

## 8.5.1

Turing machine for  $w\$w$

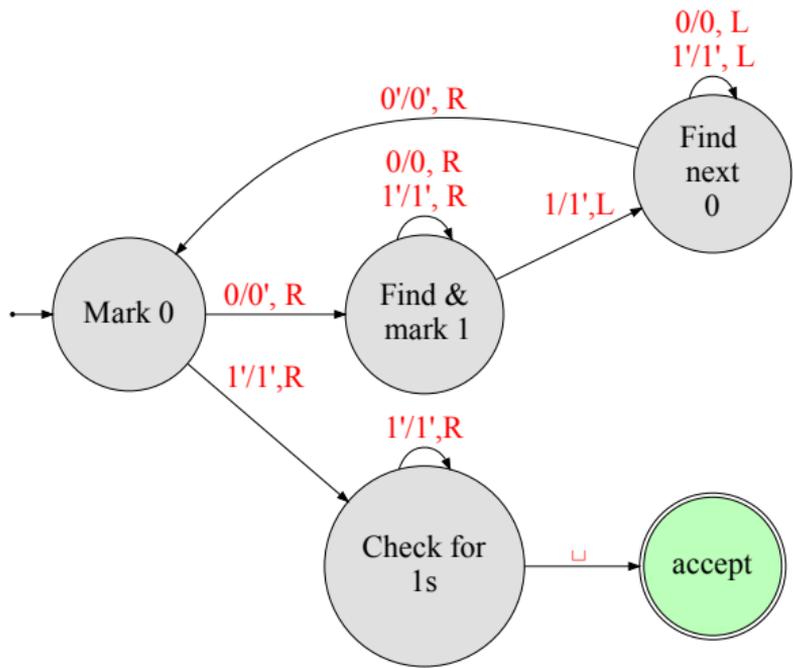
# Example: Turing machine for $w\$w$



## 8.5.2

Turing machine for  $0^n1^n$

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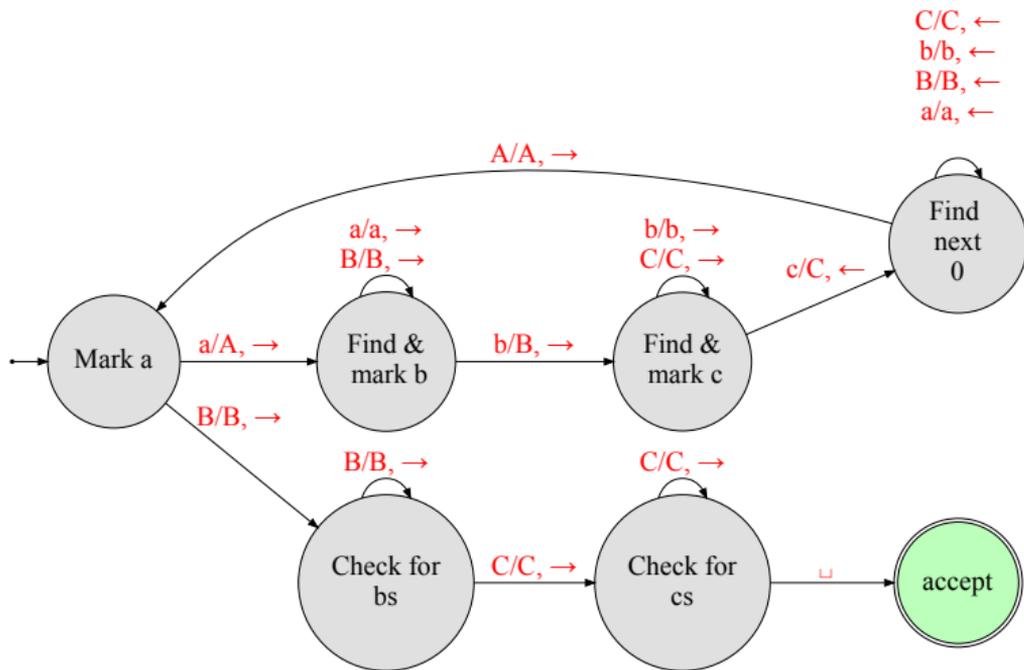


## 8.5.3

Turing machine for  $a^n b^n c^n$

# Example: Turing machine for $a^n b^n c^n$

A language that is not context free...



## 8.6

Why Turing Machine is a “real” computer?

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**TM** can compute anything that a real computer can, if very very very tediously.

1. Add/multiply two numbers in binary representation.
2. Move input tape one position to the right.
3. Simulate a TM with two tapes.
4. Simulate a TM with many tapes.
5. Stack.
6. Subroutines.
7. Compile say any C program into a **TM**.
8. Conclusion: **TM** can do what a regular program can do.
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## So what Turing Machines are good for?

1. Simplest mathematical way to describe a computer/program.
2. A good sandbox to argue about what programs can and can not do.
3. A terrible counter-intuitive model, completely unlike real world programs.
4.  $\text{TM} = \text{PROGRAM}$ .

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# Universal Turing Machine

Turing Machine that simulates another Turing Machine

**UTM:** A Turing machine that can simulate another Turing machine.

1. Programs can self replicate.
2. Program can modify themselves (a big no no nowadays).
3. Program can rewrite a program.
4. Turing had created a Pandora box...  
...which we will open in the next lecture.