

cse303

# ELEMENTS OF THE THEORY OF COMPUTATION

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## LECTURE 13

## CHAPTER 4

# TURING MACHINES

1. The definition of Turing machine
2. Computing with Turing machines
3. Extensions of Turing machines

## CHAPTER 5

### UNDECIDABILITY

1. The Church-Turing thesis
2. Universal Turing machines
3. Undecidable problems about Turing machines



## CHAPTER 4

### TURING MACHINES

1. The definition of Turing machine
2. Computing with Turing machines
3. Extensions of Turing machines

## The definition of Turing machine

## Short History

The **Turing machine** was invented in 1936 by Alan Turing

From Wikipedia:

” . **Alan Mathison Turing** (23 June 1912 – 7 June 1954), was a British mathematician, logician, cryptanalyst, and computer scientist. He was highly influential in the development of computer science, giving a formalization of the concepts of “algorithm” and “computation” with the Turing machine, which can be considered a model of a general purpose computer. He is widely considered to be the father of computer science and artificial intelligence”

## Short History

**Automata Theory** is a theoretical branch of **computer science** developed by **mathematicians** during the **20th Century**

It deals with the **logic** of **computation** with respect to simple **machines**, referred to as **automata**

Through **automata**, computer scientists are able to **understand** how machines **compute** functions and **solve** problems and what it means for a **function** to be **defined** as **computable** or for a **question** to be **described** as **decidable**

## Short History

The **first** description of **finite automata** was presented in **1943** by **Warren McCulloch** and **Walter Pitts**, two neurophysiologists

Their theory was **generalized** to much more powerful **machines** by **G.H. Mealy** and **E.F. Moore** in separate papers, published in **1955 - 56**

**Turing machine** is the most **general** and the most **powerful automata**

## Short History

**Context-free Grammars** were developed after **Chomsky** work published **1957**

From Wikipedia:

” . **Avram Noam Chomsky** (born **December 7, 1928**) is an American **linguist**, philosopher, **cognitive scientist**, logician, political commentator and **activist**. Sometimes is described as the ”**father of modern linguistics**”

**Chomsky** has spent most of his career at the **Massachusetts Institute of Technology (MIT)**, where he is currently Professor Emeritus, and has authored over **100 books**. He has been described as a prominent cultural figure, and was voted the ”**world's top public intellectual**” in a **2005** poll.”

## The definition of Turing machine

**Finite** and **Pushdown** automata **can't be regarded** as **truly general** models of computers, or computations because they **can't recognize** even such simple languages as

$$L = \{a^n b^n c^n : n \geq 0\}$$

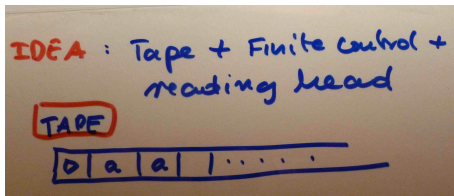
**Turing machines** can recognize those- and more complicated languages and **much more!**

**Turing machines** are **not automata**, but are similar in their design

## The definition of Turing machine

The **main idea** of the **TMachine** is similar to the **Finite** and **Pushdown automata**;

We also have a **tape**, a **finite control** module and a **reading head**



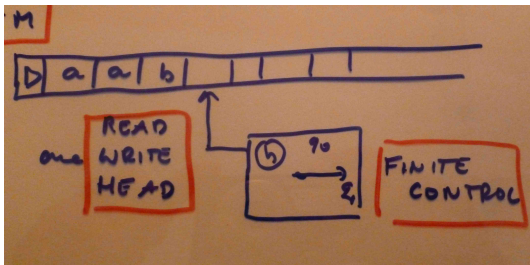
We assume that the tape has a special symbol **▷** for the **leftmost end** of the **tape**

We can have the **Turing Machines models** without it



## The definition of Turing machine

**Turing Machine** consists of a **Finite Control** unit, a **tape**, and a **read/write head** that moves in **both** directions



The **read/write head reads** symbols from the tape and is also used to **change** symbols on the tape

**T Machine** can move the head **one square** at the time

We visit only a **finite number** of squares during a **finite computation**

## The definition of Turing machine

**Finite Control** at each step performs 2 functions dependent on a current state and a symbol scanned by the **reading head**

**Function 1:** puts the **FC** unit in a new state

**Function 2:** performs either;

(a) writes a symbol in the tape square currently scanned, replacing the one already there; or

(b) moves the read/write head one tape square to the left or right

The tape has left end, but it extends indefinitely to the right

## The definition of Turing machine

To **prevent** the machine from **moving its head off** the left end of the tape we assume that the tape has **always** a special symbol  $\blacktriangleright$  for the **leftmost end** of the **tape**

We **also assume** that all our **T Machines** are so designed that, whenever the **head reads** a symbol  $\blacktriangleright$ , it immediately **moves** to the **right**

We use the distinct symbols  $\leftarrow$  and  $\rightarrow$  to denote movement of the **head** to the **left** and the **right**, respectively

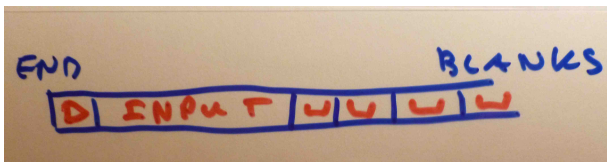
The symbols  $\leftarrow$  and  $\rightarrow$  are not members of any **alphabet** we consider

The symbol  $\blacktriangleright$  is **never erased**

## The definition of Turing machine

**Turing Machine** is supplied with **input** by writing the **input string** on the tape immediately after the symbol ►

The rest of the tape initially contains **blank** symbols, denoted by □



**T Machine** is free to **alter** its **input**

It also can **write** on the **unlimited blank portion** of the tape to the right

# Turing Machine Mathematical Model

## Definition

A **Turing Machine** is a quintuple

$$TM = (K, \Sigma, \delta, s, H)$$

where

$K$  is a finite set of **states**

$\Sigma$  as an **alphabet**

$\Sigma$  contains a **blank** symbol  $\sqcup$  and a **left end** symbol  $\blacktriangleright$

$\Sigma$  **does not** contain symbols  $\leftarrow$  and  $\rightarrow$

$s \in K$  is the **initial state**

$H \subseteq K$  is the set of **halting states**

We usually use different symbols for  $K, \Sigma$ , i.e. we have that

$$K \cap \Sigma = \emptyset$$

## Turing Machine Mathematical Model

**Turing Machine** components continue

$\delta$  is a **transition function**

$$\delta: (K - H) \times \Sigma \longrightarrow K \times (\Sigma \cup \{\rightarrow, \leftarrow\})$$

such that the following conditions hold

1. If  $\delta(q, \triangleright) = (p, b)$  then  $b \neq \rightarrow$
2. If  $\delta(q, a) = (p, b)$  then  $b \neq \triangleright$

**Observe** that  $\delta$  is a function, so **Turing Machine** is always **deterministic**

## Operation of Turing machine

If  $q \in K - H$ ,  $a \in \Sigma$  and

$$\delta(q, a) = (p, b)$$

then TM in state  $q$  scanning  $a$  on the tape will enter state  $p$  and

① If  $b \in \Sigma$ , then M - RE-WRITES  
 $a$  as  $b$  (Replaces  $a$  by  $b$ )  
OR ② If  $b \in \{\rightarrow, \leftarrow\}$  M moves in  
the indicated direction

## Operation of Turing machine

**TM stops** only when enters a **halting** state  $h \in H$

**Observe** that  $\delta$  is not defined for  $h \in H$

**TM** has also two **extra requirements** -

the two **extra conditions** in the definition of  $\delta$

**Condition 1.** If **TM** sees  $\triangleright$  (end of the tape) then **TM** must move **right**:

If  $\delta(q, \triangleright) = (p, b)$  then  $b \Rightarrow$

It means that symbol  $\triangleright$  is never erased and **TM** never gets out of the tape



## Operation of Turing machine

**Condition 2.** of the definition of  $\delta$  is

If  $\delta(q, a) = (p, b)$  then  $b \neq \triangleright$

It says that **TM never** writes on  $\triangleright$

Observe that the **conditions 1.** and **2.** guarantee that the symbol  $\triangleright$  is well defined and acts a **protective barrier**

## Turing Machine Examples

### Example 1

Let  $M = (K, \Sigma, \delta, s, H)$  where  $K = \{q_0, q_1, h\}$ ,  $s = q_0$ ,  $\Sigma = \{a, \sqcup, \triangleright\}$ ,  $H = \{h\}$  and  $\delta$  is given by the table

$q$	$\sigma$	$\delta(q, \sigma)$
$q_0$	$a$	$(q_1, w)$ ← erase $a$ !
$q_0$	$\sqcup$	$(h, w)$ , top
→ $q_0$	$\triangleright$	$(q_0, \rightarrow)$ — MUST go right, by definition
$q_1$	$a$	$(q_0, a)$ ← keep $a$ , definition changes state
$q_1$	$\sqcup$	$(q_0, \rightarrow)$
→ $q_1$	$\triangleright$	$(q_1, \rightarrow)$ — MUST

M starts at  $q_0$ , CHANGES  $a$  to  $w$

## Examples

Operation of **M** - lets look at  $\delta$  again

$q$	$\sigma$	$\delta(q, \sigma)$
$q_0$	$a$	$(q_1, \sqcup)$ ← erase $a$ !
$q_0$	$\sqcup$	$(q_0, \rightarrow)$ stop
→ $q_0$	$\triangleright$	$(q_0, \rightarrow)$ — MUST go right, by definition
$q_1$	$a$	$(q_0, a)$ ← keep $a$ , definition change state
$q_1$	$\sqcup$	$(q_0, \rightarrow)$
→ $q_1$	$\triangleright$	$(q_1, \rightarrow)$ — MUST

$M$  starts at  $q_0$ , CHANGES  $a$  to  $\sqcup$

**M** starts at  $q_0$ , changes  $a$  to  $\sqcup$  (erases  $a$ ) and goes to  $q_1$

When **M** in  $q_1$  sees  $a$  - and goes to  $q_0$  - and  $q_0$  erases  $a$

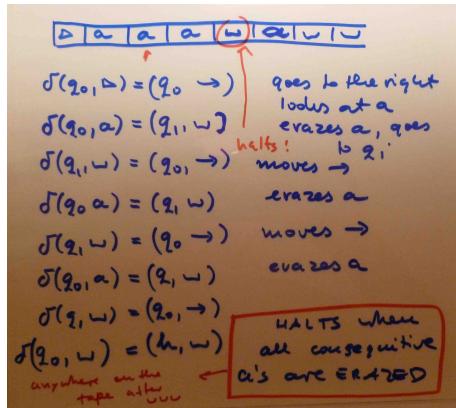
When **M** in  $q_0$  sees  $\sqcup$  - **M halts**

When **M** in  $q_1$  sees  $\sqcup$  - **M** goes to  $q_0$  and **moves** right

## Examples

Operation of **M**

**Remark:** assignment  $\delta(q_1, a) = (q_0, a)$  is irrelevant because **M** never can be in state  $q_1$  scanning  $a$ ) if it started at  $q_0$  - THIS is like a TRAP State;  $\delta$  must be a function  
Here a computation of **M**



## Turing Machine Examples

### Example 2

Let  $M = (K, \Sigma, \delta, s, H)$  where  $K = \{q_0, h\}$ ,  $s = q_0$ ,  $\Sigma = \{a, \sqcup, \triangleright\}$ ,  $H = \{h\}$  and  $\delta$  is given by the table

$q$	$\sigma$	$\delta(q, \sigma)$
$q_0$	$a$	$(q_0 \leftarrow)$
$q_0$	$\sqcup$	$(h, \sqcup)$
$q_0$	$\triangleright$	$(q_0 \rightarrow)$ MUST

$M$  scans LEFT  
until find  
 $\sqcup$  - HALTS

If every tape square from the **head** position to the **left** contains an **a** the **M** will go to the **left end** of the tape and then **M** **indefinitely** goes between the **left end** and the square to its **right**

Operation of **M** may **never stop**

## Formal Definition

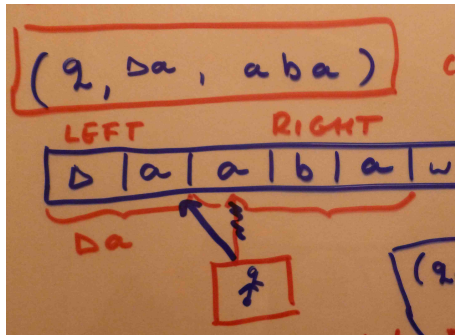
**Formal** definition of operation of Turing Machine is similar to the one for FA and PD automata

We define first a notion of a configuration

**Configuration** of **M** is any element

$$(q, \triangleright w, u) \in K \times \triangleright \Sigma^* \times (\Sigma^*(\Sigma - \{\sqcup\}) \cup \{e\})$$

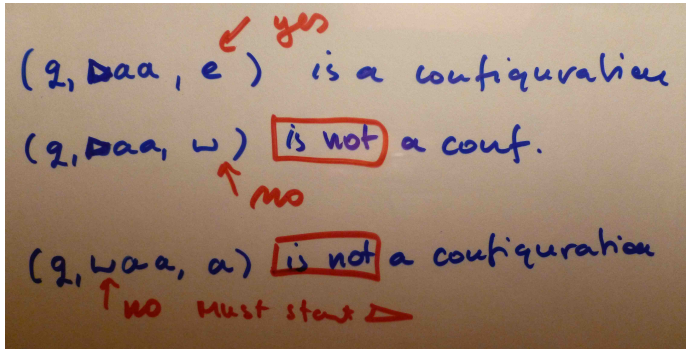
**Picture**



## Configuration

Configuration/not Configuration examples

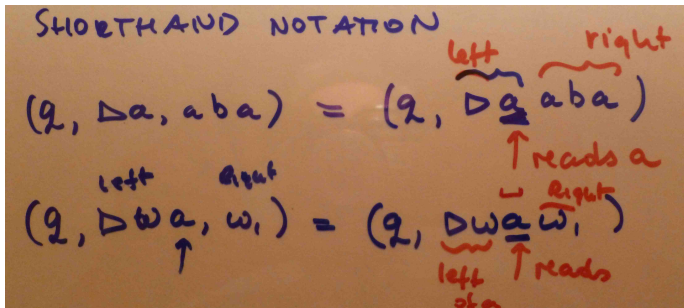
Picture



## Configuration

### Configuration shorthand notation

#### Picture



**Halted Configuration** is a configuration whose state components is in **H**



## Transition Relation

Given a set  $S$  of **all configurations** of  $M$

$$S \subseteq K \times \triangleright \Sigma^* \times (\Sigma^*(\Sigma - \{\sqcup\}) \cup \{e\})$$

The **transition relation** acts between two **configurations** and hence  $\vdash_M$  is a certain binary relation defined on  $S \times S$ , i.e.

$$\vdash_M \subseteq (K \times \triangleright \Sigma^* \times (\Sigma^*(\Sigma - \{\sqcup\}) \cup \{e\}))^2$$

We write

$$C_1 \vdash_M C_2$$

and say  $C_1$  YIELDS  $C_2$

Formal definition follows

## Transition Relation

Definition of  $C_1 \vdash_M C_2$

**DEFINITION**  $C_1 \vdash_M C_2$

$(q_1, \triangleright w_1 \underline{a_1} u_1) \vdash_M (q_2, \triangleright w_2 \underline{a_2} u_2)$

iff

for some  $b \in \Sigma \cup \{\leftarrow, \rightarrow\}$

$\delta(q_1, a_1) = (q_2, b)$

and **either**

## Transition Relation

and **either**

1.  $b \in \Sigma$ ,  $w_1 = w_2$ ,  $u_1 = u_2$   $b = a_2$  **OR**
2.  $b = \leftarrow$ ,  $w_1 = w_2 a_2$  **and either**
  - a.  $u_2 = a_1 u_1$  if  $a_1 \neq \sqcup$  or  $u_1 \neq e$  **OR**
  - b.  $u_2 = e$  if  $a_1 = \sqcup$  and  $u_1 = e$  **OR**
3.  $b = \rightarrow$ ,  $w_2 = w_1 a_1$ , and either
  - a.  $u_1 = a_2 u_2$  **OR**
  - b.  $u_1 = u_2 = e$  and  $a_2 = \sqcup$

## Computation by TM

Given a **transition relation**  $\vdash_M$

We **denote** as usual, its **reflexive, transitive closure** is denoted by  $\vdash_M^*$  and

$$C_1 \vdash_M^* C_n$$

is a **computation** of the **length n** in **M** from  $C_1$  to  $C_n$

By definition of  $\vdash_M^*$  we have that

$$C_1 \vdash_M^* C_n$$

if and only of

$$C_1 \vdash_M C_2 \vdash_M \dots \vdash_M C_n$$

## Computation by TM

Let **M** be the Turing Machine from **Example 1** that **scans** the tape to the right **changing** **a**'s to **␣** until **finds** a blank **␣** and then **halts**

Here is a computation of **M** of lengths 10

Handwritten computation of a Turing Machine **M** on a tape of length 10. The computation shows 10 steps, starting from state  $q_1$  and ending in state  $h$  (halt). The tape initially contains  $\square a a a a \square$ . In each step, the machine moves the head to the right and changes 'a' to ' $\square$ '. After 10 steps, the tape is  $\square \square \square \square \square \square \square \square \square \square$  and the machine halts.

Steps shown:

- $(q_1, \square \underline{a} a a a \square)$
- $(q_0, \square \square \underline{a} a a a \square)$
- $(q_1, \square \square \square \underline{a} a a \square)$
- $(q_0, \square \square \square \square \underline{a} a \square)$
- $(q_1, \square \square \square \square \square \underline{a} \square)$
- $(q_0, \square \square \square \square \square \square \underline{a} \square)$
- $(q_1, \square \square \square \square \square \square \square \underline{a} \square)$
- $(q_0, \square \square \square \square \square \square \square \square \underline{a} \square)$
- $(q_1, \square \square \square \square \square \square \square \square \square \underline{a})$
- $(q_0, \square \square \square \square \square \square \square \square \square \square \underline{\square})$

Transitions shown:

- $\delta(q_1, \square) = (q_0, \rightarrow)$
- $\delta(q_0, a) = (q_1, \square)$
- $\delta(q_0, \square) = (h, \square)$

10 STEPS

**HALTS**

Final state:  $(h, \square \square \square \square \square \square \square \square \square \square)$

## A Notation for Turing Machines

## A Notation for Turing Machines

The **Turing machines** we have seen so far are extremely **simple** but their **transition function** is already complex and **difficult** to understand and interpret

We shall now adopt a **graphical representation** for **Turing machines** similar to the **diagrams** for **finite automata**

However, in this case the diagrams' **nodes** will be **not states**, but ***themselves* Turing machines**

## A Notation for Turing Machines

We use a *hierarchical* notation, in which more and more **complex** machines are built from **simpler** materials

To this end we define a very simple **repertoire** of **basic machines**, together with **rules** for **combining machines**

We will be **building** machines by combining the **basic machines**, and then we shall further **combine** the **combined machines** to obtain more **complex** machines, and so on



## Basic Machines

### Basic Machines

We fix the alphabet  $\Sigma$  and define the *symbol-writing* and *head moving* machines as follows

For each  $a \in (\Sigma \cup \{\rightarrow, \leftarrow\}) - \{\triangleright\}$  we define a TM

$$M_a = (\{s, h\}, \Sigma, \delta, s, \{h\})$$

where for each  $b \in \Sigma - \{\triangleright\}$

$$\delta(s, b) = (h, a) \text{ and as always, } \delta(s, \triangleright) = (s, \rightarrow)$$

## Basic Machines

Given the **TM** machine

$$M_a = (\{s, h\}, \Sigma, \delta, s, \{h\})$$

the **only thing** this machine **does** is to **perform action** of

**writing** a symbol **a** if  $a \in \Sigma$

and  $M_a$  is called a **symbol-writing** machine,

**moving** to the direction indicated by **a** if  $a \in \{\rightarrow, \leftarrow\}$

and  $M_a$  is called a **head-moving** machine,

and then  $M_a$  immediately **halts**

If **scanned** symbol is a **▷**,

then the machine will dutifully **move** to the **right**

## Basic Machines

Let  $M_a$  be a **symbol -writing** or **head-moving** machine

We adopt the following **notation**:

1. If  $a \in \Sigma$ , we write

$a$  instead of  $M_a$

for **a-writing** machine  $M_a$

2. If  $a \in \{\rightarrow, \leftarrow\}$ , we write

$L$  and  $R$  instead of  $M_{\leftarrow}$  and  $M_{\rightarrow}$ , respectively

## The Rules for Combining Machines

### The Rules for Combining Machines

We **combine** the machines treating the individual **machines** like the **states** of finite **automata**

The machines may be **connected** to each other in the way that the **states** of finite **automaton** are connected **together**

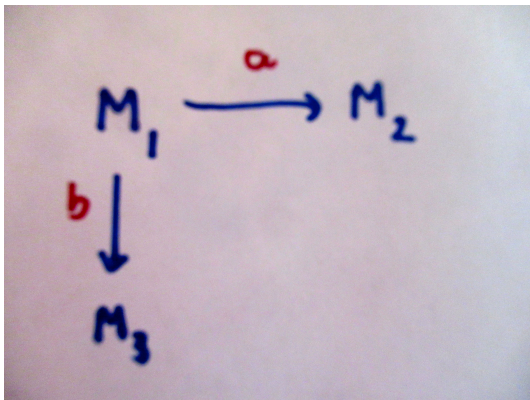
But the **connection** from one machine to the other **does not** happen **until** the **first** machine **halts**

The **other** machine is then **started** from the **initial state** with the **tape** and **head** position as they were **left** by the **first** machine

## Turing Machine Diagram

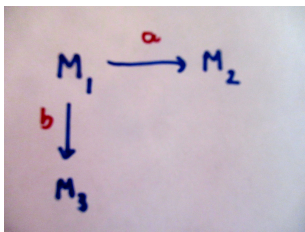
Given Turing Machines  $M_1, M_2, M_3$

Here us a **diagram** of a machine  $M = (K, \Sigma, \delta, s, H)$   
composed of  $M_1, M_2, M_3$



## Turing Machine Diagrams

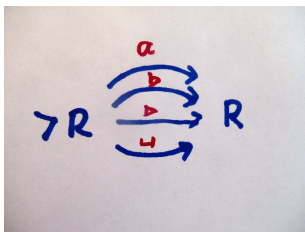
Given a diagram of of a machine  $M = (K, \Sigma, \delta, H)$



**M starts** at the initial state of  $M_1$ ; **operates** as  $M_1$  until  $M_1$  **halts**; **then**  
if the currently scanned symbol is an **a** **initiates**  $M_2$ , and **operates** as  $M_2$ ; **otherwise**,  
if the currently scanned symbol is a **b**, then **initiates**  $M_3$ , and operates as  $M_3$

## Turing Machine Diagrams

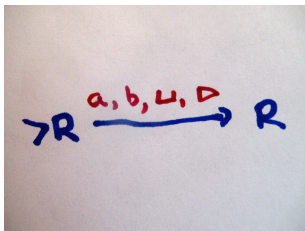
Here is a **diagram** of a machine **M** consisting of **two copies** of the **basic** machine  $R = M_{\rightarrow}$



**M moves** its head **right** one square;  
if that square contains an **a**, or a **b**, or a  **$\triangleright$** , or a  **$\sqcup$** ,  
it **moves** its head one square to the **right**

## Diagrams of Turing Machines

It is convenient to represent the machine **M** consisting of **two copies** of the **R** machine as follows



If an arrow is **labelled** by **all** symbols of the alphabet  $\Sigma$  of the machines, then the **labels** can be **omitted** and we denote the **diagram** as

$R \longrightarrow R$  or under this convention, as  $RR$  or even  $R^2$

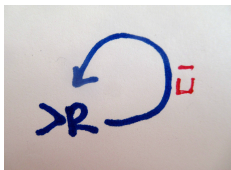


## Diagrams of Turing Machines

Here are some more **convenient diagrams**

Let  $a \in \Sigma$  be any symbol. We use a symbol  $\bar{a}$  to say  
*"any symbol except  $a$ "*

The **diagram**



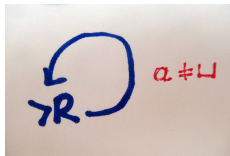
represents a machine that **scans** the tape to the **right** **until** it  
finds a blank  $\square$ . We denote it by  $R_{\square}$

## Diagrams of Turing Machines

Let  $a \in \Sigma$  be any symbol

We write a symbol  $a \neq \sqcup$  to denote a statement  
"any symbol  $a$  other than  $\sqcup$ "

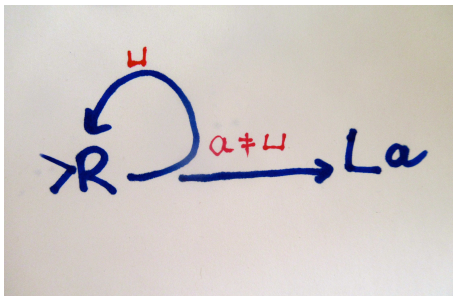
The **diagram**



is another **representation** of the machine  $R_{\sqcup}$  that **scans** the tape to the **right** **until** it finds a blank  $\sqcup$

## Diagrams of Turing Machines

The **diagram**

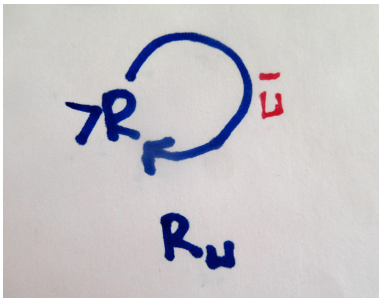


depicts a **machine** that **scans** to the **right** **until** it finds a **nonblank square**, then **copies** the symbol in that square **onto** the square immediately to the **left** of where it was **found**

## Some Simple Special Machines

Here are machines to find marked or unmarked squares

The **diagram**

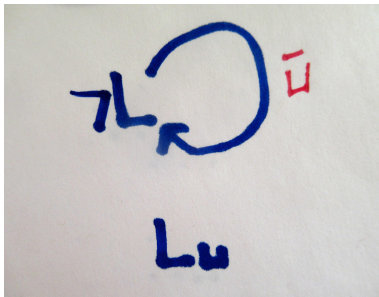


depicts a machine  $R_{\bar{1}}$  that **finds** the **first blank** square to the **right** of the currently **scanned** square

## Some Simple Special Machines

Here are machines to find marked or unmarked squares

The **diagram**

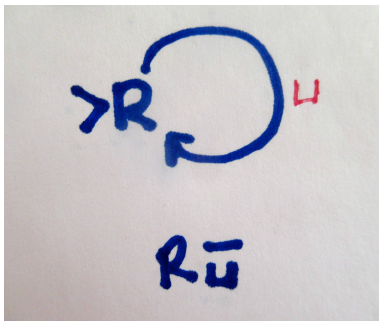


depicts a **machine**  $L_{\bar{u}}$  that **scans** the tape to the **left** **until** it **finds** a blank  $\bar{u}$

## Some Simple Special Machines

Here are machines to find marked or unmarked squares

The **diagram**

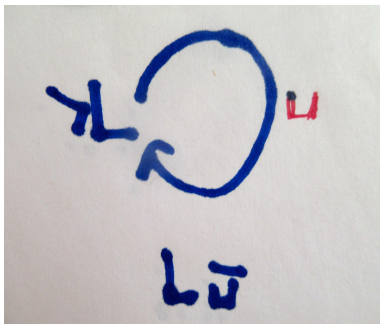


depicts a machine  $R_{\square}$  that **finds** the **first NONBLANK** square to the **right** of the currently **scanned** square

## Some Simple Special Machines

Here are machines to find marked or unmarked squares

The **diagram**



depicts a machine  $L_{\square}$  that **finds** the **first NONBLANK** square to the **left** of the currently **scanned** square

## CHAPTER 4

# TURING MACHINES

1. The definition of Turing machine
2. Computing with Turing machines
3. Extensions of Turing machines



## Computing with Turing machines

## Computing with Turing machines

We introduced **Turing Machines** with the **goal** that they **outperform**, as **language acceptors**, all of **automata** we introduced and examined

To be able discuss this **goal** we have to **define** (and examine) how they are to be **used** to perform a task of **language recognition**

In order to do so we **need** to fix some **conventions** for **use** of **Turing machines**

## Computing with Turing machines

We **adopt** the following **policy** for presenting **input** to Turing machines

1. The **input** string, with **no blank** symbols in it, is written to the **right** of the leftmost symbol **▷**, **with** a blank on its **left**, and blanks to its **right**
2. The **head** is **positioned** at the tape square containing the **blank** between the **▷** and the **input**
3. Machine **starts** operation in its **initial** state

## Computing with Turing machines

Given a **Turing machine**

$$M = (K, \Sigma, \delta, s, H)$$

and let

$$w \in (\Sigma - \{\sqcup, \triangleright\})^*$$

The **initial configuration** of **M** on **input** word **w** is

$$(s, \triangleright \sqcup w)$$

## Computing with Turing machines

Consider a **Turing Machine**  $M = (K, \Sigma, \delta, s, H)$   
for  $H = \{y, n\}$  where  $y$  denotes **accepting** configuration  
 $n$  denotes **rejecting** configuration

**M accepts** a word  $w \in (\Sigma - \{\sqcup, \triangleright\})^*$  if and only if  
the **initial** configuration  $(s, \triangleright \sqcup w)$  on input word  $w$  yields an  
**accepting** configuration

**M rejects** a word  $w \in (\Sigma - \{\sqcup, \triangleright\})^*$  if and only if  
the **initial** configuration  $(s, \triangleright \sqcup w)$  on input word  $w$  yields an  
**rejecting** configuration

## Computing with Turing machines

Given a Turing machine  $M = (K, \Sigma, \delta, s, H)$  for  $H = \{y, n\}$

The alphabet

$$\Sigma_0 \subseteq \Sigma - \{\sqcup, \triangleright\}$$

is called an **input alphabet** of  $M$

By fixing  $\Sigma_0$  to be subset of  $\Sigma - \{\sqcup, \triangleright\}$  we allow our **Turing machines** to use **extra** symbols during their computation, besides those appearing in their **inputs**

## Recursive Languages

Given an **input alphabet**  $\Sigma_0 \subseteq \Sigma - \{\sqcup, \triangleright\}$  of  $M$

### Definition

$M$  **decides** a language  $L \subseteq \Sigma_0^*$  if for any word  $w \in L$  the following condition holds

If  $w \in L$  then  $M$  **accepts**  $M$  **decides**  $w$ ;

and if  $w \notin L$  then  $M$  **rejects**  $w$

### Definition

The language  $L \subseteq \Sigma_0^*$  is **recursive** if there is a Turing machine  $M$  that **decides** it

## Recursive Languages

**Observe** that **M decides** a language if, when started with input **w**, it always **halts**, and does so in a halt state that is a **correct response** to the input:

**y** if  $w \in L$ ,

**n** if  $w \notin L$

**Notice** that **no guarantees** are given about what happens if the input to **M** contains **blank** or the **left end** symbol



# Recursive Languages

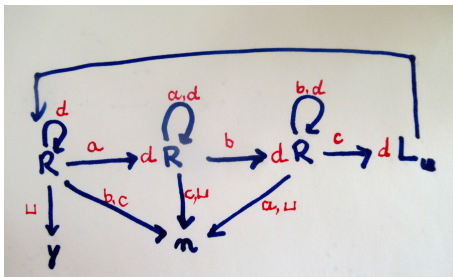
## Theorem

The **not context-free** language

$$L = \{a^n b^n c^n : n \geq 0\}$$

is **recursive**

**Proof** Here is a **diagram** of a Turing machine **M** that **decides** **L**



# Recursive Functions

## Recursive Functions

Let  $f$  be any function from  $\Sigma_0^*$  to  $\Sigma_0^*$

### Definition

A Turing machine  $M$  **computes** function  $f$  if for **all** words  $w \in \Sigma_0^*$  it eventually **halts** on input  $w$ , and when it does **halt**, its tape **contains** the string

$$\triangleright \sqcup f(w)$$

### Definition

A function  $f$  is called **recursive**, if **there is** a Turing machine  $M$  that **computes**  $f$

## Recursively Enumerable Languages

### Definition

A Turing machine **M** **semidecides** a language  $L \subseteq \Sigma_0^*$  if and only if for **any** word  $w \in \Sigma_0^*$  the following is true:  
 $w \in L$  if and only if **M halts** on input  $w$

### Definition

A language  $L \subseteq \Sigma_0^*$  is **recursively enumerable** if **there is** a Turing machine **M** that **semidecides** it

## Recursively Enumerable Languages

**Observe** that a Turing machine **M** that **semidecides** a language **L** when presented with **input**  $w \in L$ , is required to **halt eventually**

We **do not** care precisely **which halting configuration** it reaches, as long as it does **eventually arrive** at a **halting configuration**

# Recursively Enumerable Languages

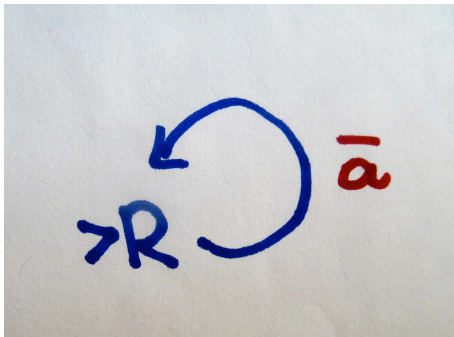
## Theorem

The language

$$L = \{w \in \{a.b\}^* : w \text{ contains at least one } a \}$$

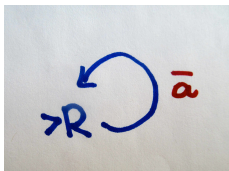
**recursively enumerable**

**Proof**  $L$  is **semidecided** by  $M$  defined by the following diagram



## Recursively Enumerable Languages

The machine **M**



when **started** in **initial configuration** on **input** **w**, i.e. in configuration  $(s, \triangleright \underline{\sqcup} w)$  for some  $w \in \{a.b\}^*$  simply scans right until an **a** is **found** and then **halts**

If **no** **a** is **found**, the machine goes on **forever** onto the blanks that follow its input, **never halting**

## Two important Theorems

### Theorem 1

If a language is **recursive** then it is **recursively enumerable**

### Theorem 2

If  $L \subseteq \Sigma_0^*$  is a **recursive** language, then its complement  $\Sigma_0^* - L$  is also **recursive**



## CHAPTER 4

# TURING MACHINES

1. The definition of Turing machine
2. Computing with Turing machines
3. Extensions of Turing machines

## Extensions of Turing machines

Multiple tapes

**ORIGINAL** Turing Machine **1936** : two way infinite tape

Two dimensional tape

Random access machines

Non-deterministic machines

### **Theorem**

All models of **Turing Machine** are computationally **equivalent** to the **standard** Turing machine **M**

## ChurchTuring Thesis

A **Turing machine** that is able to **simulate** any **other** Turing machine is called a **universal** Turing machine **UTM**, or simply a **universal machine**

A more mathematically-oriented **definition** with a similar **"universal" nature** was introduced by **Alonzo Church**

**Church** work on **lambda calculus** intertwined with **Turing's** in a statement known in the a **formal** theory of computation as **ChurchTuring Thesis**

## ChurchTuring Thesis

The **ChurchTuring thesis** states that **Turing machines** indeed **capture** the **informal** notion of **effective method** in logic and mathematics, and **provide** a **precise definition** of an **algorithm** or "mechanical procedure"

Studying the **abstract properties** of the **Turing machines** yields many **insights** into **computer science** and **complexity theory**