

## Informatique Fondamentale - IMA S8 - Mars - Avril 2001

### **Contenu :**

- Transparents du cours 1 : automates finis, expressions régulières, notion de langage.
- Transparents du cours 2 : automates à piles, grammaires et langages hors contexte.
- Transparents du cours 3 : automates à compteurs, programmes, machines de turing et décidabilité

### **Enseignants S8 :**

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# Informatique Fondamentale IMA S8

## Cours 1 - Intro + schedule + finite state machines

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March/April 2011



## Until now

During S5,S6,S7, IMA students have learnt :

- (programming stuff) C programming and compiling,
  - (conception stuff) algorithm design and encoding,
  - (microelec) circuits and embedded systems hardware,
  - (auto) design flows of industrial processes
- Solved (computation) *problems* by **ad-hoc** solutions.

Course introduction and schedule

Laure Gonnord (Lille1/Polytech)

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## Until now 2/2

But :

- No general scheme to design algorithms.
  - (manual) evaluation of the *cost* of our programs.
  - **worse** no assurance of correctness.
  - **even worse** is there always a solution ?
- All these problems will be addressed in this course

## Schedule

- Finite state machines (regular automata), regular languages. Notion of non determinism. Link with circuits.
- I/O automata, stack automata and grammars. Link to “simple” languages.
- Counter automata, Turing machines and undecidable problems. Link to “classical” programs.
- Graphs and classical problems/algorithms on graphs.
- Compiler Construction : front end + classical static analysis.
- Compiler Construction : code generation + classical dynamic analysis.

## I - Regular languages and automata

- 1 Finite state machines
- 2 Regular Languages
- 3 The notion of non determinism
- 4 Classical Algorithms
- 5 Expressivity of regular languages
- 6 Link to other models

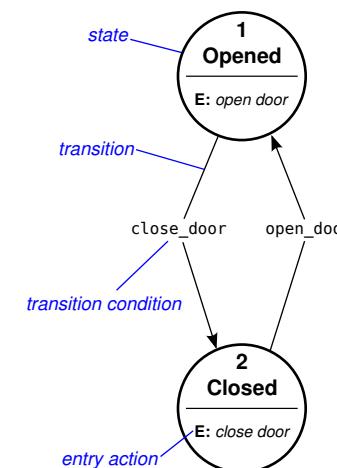
## What for ?

We want to model :

- the behaviour of systems with behavioural **modes**.
- the behaviour of (Boolean) circuits.
- sets of words.
- ▶ A finite representation.

## Example

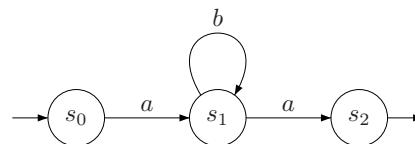
Opening/Closing door - Source Wikipedia.



## General definition

### Finite state machine (FSM) or regular automata

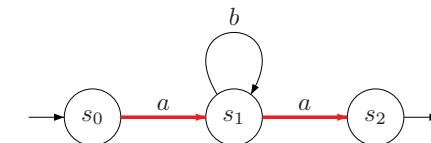
- States are labeled, and there are finitely many ( $s \in Q$ )
  - Initial state(s) ( $i \in I$ ) and accepting (terminating/finishing) states ( $t \in F$ )
  - Transitions are finitely many.
  - Transitions are labeled with letters ( $a \in A$ ).
- The transition function is  $\delta : Q \times A \rightarrow Q$ .



## Accepted language 1/2

### Accepted word

A word  $w$  on the alphabet  $A$  is accepted by the automaton iff there exists a finite path from an initial state to an accepting state which is labeled by  $w$ .



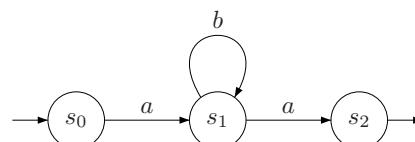
- $w = aa$  is accepted/recognised.

## Accepted language 2/2

### Accepted language

The accepted language of a given automaton  $\mathcal{A}$  is the set of all accepted words and is denoted by  $\mathcal{L}(\mathcal{A})$ .

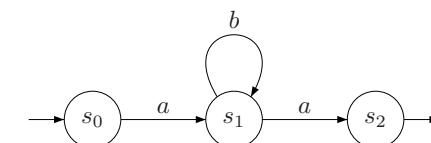
- Remark : it can be infinite.



- $\mathcal{L}(\mathcal{A}) = \{ab^k a, k \in \mathbb{N}\}$ .

## Data Structure for implementation

Problem : how to encode an automata ?



The transition function can be (for instance) encoded as a transition table :

	$s_0$	$s_1$	$s_2$
$s_0$	--	$a$	--
$s_1$	--	$b$	$a$
$s_2$	--	--	--

## Goal

- 1 Finite state machines
- 2 Regular Languages
- 3 The notion of non determinism
- 4 Classical Algorithms
- 5 Expressivity of regular languages
- 6 Link to other models

Problem : how to describe languages easily in a textual “linear” way ?

► use **regular expressions**.

## Regular expressions

### Regular expression (recursive def)

A **regular expression**  $e$  on the alphabet  $A$  is defined by induction. It can be of any of the following kinds :

- the empty word  $\varepsilon$
- a letter  $a \in A$
- a choice between an expression  $e_1$  and another expression  $e_2$  :  $e_1 + e_2$
- two successive expressions :  $e_1 \cdot e_2$
- 0,1 or more successive occurrences of  $e_1$  :  $e_1^*$ .

**Example with**  $A = \{a, b, c, d\}$  :  $e = a \cdot (b + c \cdot d)^*$

## Regular expression vs word

A regular expression “encodes” the form of a word. For instance :

$$i \cdot m \cdot a \cdot (3 + 4 + 5)$$

(on the alphabet  $\{i, m, a, 3, 4, 5\}$ ) describes all words beginning by the prefix “ima” and finishing by one of the numbers 3, 4 or 5.

► A regular expression describes a **language**

## Regular language

### Regular language

Given a regular expression  $e$ ,  $\mathcal{L}(e)$  denotes the set of words (the **language**) that are described by the regular expression  $e$ .

**Example with**  $A = \{0, \dots, 9\}$  :

$e = (1 + 2 + \dots + 9) \cdot (0 + 1 + 2 + \dots + 9)^*$ . What is  $\mathcal{L}(e)$  ?

## Linux world

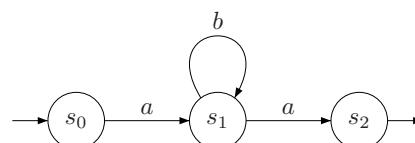
Some commands use (extended) regular expressions (regexp) :

- `ls *.pdf` lists all pdfs of the current directory
- `grep ta*.* *.c` find all lines in .c files that contains words that begin with t + some a's.
- `sed ''s ta*.*/toto/g''` file replace all occurrences...

## Relationship between automata and languages - 1/3

First, some experiments.

Given the following automata  $\mathcal{A}$ , are you able to give a regular expression  $e$  such that  $\mathcal{L}(e) = \mathcal{L}(\mathcal{A})$  ?



►  $e = ?$

## Relationship between automata and languages - 2/3

And the converse :

Given the following regular expression  $e = b^* \cdot (c + a)^*$ , are you able to give an automaton  $\mathcal{A}$  such that  $\mathcal{L}(\mathcal{A}) = \mathcal{L}(e)$  ?

## Relationship between automata and languages - 3/3

### General result - Kleene Theorem

The regular languages are exactly the languages that are described by finite automata.

- ▶ What we've done before is **always** possible.

1 Finite state machines

2 Regular Languages

3 The notion of non determinism

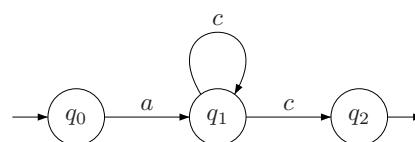
4 Classical Algorithms

5 Expressivity of regular languages

6 Link to other models

## Goal

Sometimes some info lacks to make a choice between two transitions :



- ▶ From state  $q_1$ , there is a **non deterministic choice** while reading  $c$  : either go to state  $q_2$  or stay in  $q_1$ .

## Definition

### Non deterministic FSM

- A deterministic automaton is  $\mathcal{A} = \langle A, Q, I, F, \delta \rangle$  with

$$\delta : A \times Q \rightarrow Q$$

- A **non deterministic** automata is the same with :

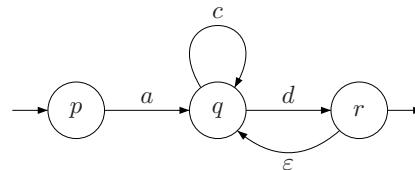
$$\delta : A \times Q \rightarrow P(Q)$$

- A **non deterministic** automata with  $\varepsilon$ -transitions is the same with

$$\delta : (A \cup \{\varepsilon\}) \times A \rightarrow P(Q)$$

## Example

A non deterministic automata with  $\varepsilon$ -transitions :



► Then  $\mathcal{L}(\mathcal{A}) = a \cdot (c^* \cdot d)^*$ .

1 Finite state machines

2 Regular Languages

3 The notion of non determinism

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## Find the associated language

Goal : Given  $\mathcal{A}$  an automaton, find the associated language.

► Exercises !

## Construction of automaton from a regular expression

Goal : Given a regular expression, construct a regular automaton that “**recognises**” it.

► Exercises !

## Determinisation

Goal : transform a non deterministic automaton into a deterministic one.

► Exercises !

## Other Algorithms

In the literature you will easily find :

- algorithms to eliminate  $\varepsilon$  transitions without determinising ( $\varepsilon$  closure) ;
- algorithms to minimise automata (the number of states) ;
- algorithms to use automata to find words in a text ;
- algorithms to test language inclusion (if they are regular)
- ...

## Non regular languages

1 Finite state machines

2 Regular Languages

3 The notion of non determinism

4 Classical Algorithms

5 Expressivity of regular languages

6 Link to other models

### Important result

There exists some **non-regular** languages.

### Examples of non-regular languages :

- $\{a^n b^n, n \in N\}$ .
- palindromes on a non-singleton alphabet.
- $\{a^p, p \text{ prime}\}$

► There exists a quite systematic way to prove that a given language is not regular (Pumping Lemma).

1 Finite state machines

2 Regular Languages

3 The notion of non determinism

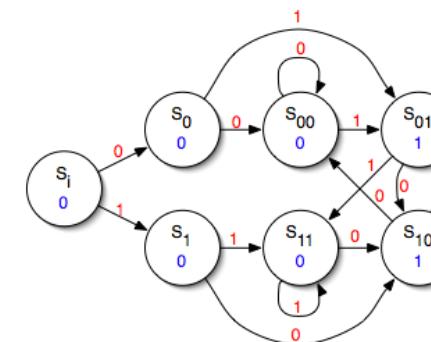
4 Classical Algorithms

5 Expressivity of regular languages

6 Link to other models

## Moore and Mealy Machines - 1

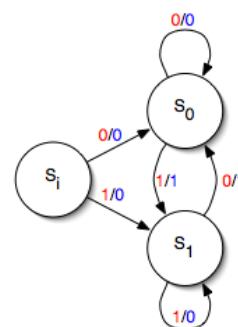
Moore : I/O machine whose output values are determined solely by the current state :



source Wikipedia

## Moore and Mealy Machines - 2

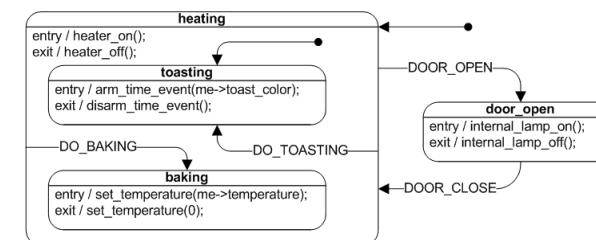
Mealy : output values are determined both by the current state and the value of the input.



source Wikipedia

## UML Implementation of FSMs

UML variants of FSMs are **hierarchical**, react to messages and call functions.



source Wikipedia

## Hardware Implementation of FSMs

It requires :

- a register to store state variables
- a block of combinational logic for the state transition
- (optional) a block of combinatorial logic for the output

## Summary

Regular Automata or **Finite State Machines** are :

- Acceptors for regular languages. But some languages are **not regular**.
- Algorithmically efficient.
- Useful to describe (simple) behaviours of systems.
- Closely linked to circuits.

# Informatique Fondamentale IMA S8

Cours 2 - Stack automata + Grammars

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II - Stack automata and Grammars

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March/April 2011



Stack automata

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Stack automata

1 Stack automata

2 Grammars

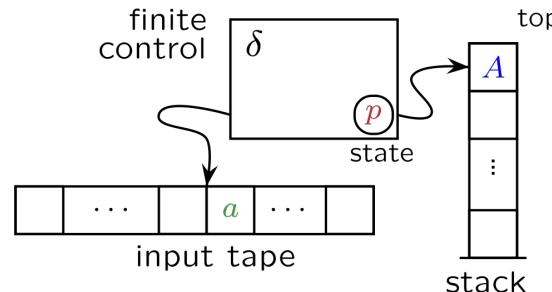
What for ?

Express more than regular languages !

► Give a way for automata to “**count**”, to “have a memory”.

## Example

(source : Wikipedia)



## General definition

### Stack/P automata

- States ( $Q$ ), initial state ( $q_0$ ), finite states ( $F$ ).
- Two alphabets (one for read :  $\Sigma$  one for stack :  $\Gamma$ )
- $\gamma_0 \in \Gamma$  the end of stack character.
- Transitions are finitely many.
- A **stack** to write into.
- Transitions use the stack.

► The transition function is :

$$Q \times (\Sigma \cup \varepsilon) \times \Gamma \rightarrow \mathcal{P}(Q \times \Gamma^*)$$

## How it works ? 1/3

### Configuration

A **configuration** is a triple  $(q, w, \alpha)$  where :

- $q$  is the current state
- $w \in \Sigma^*$  the part of the input tape which is not yet read
- $\alpha \in \Gamma^*$  the current stack word

Two different conditions for accepting words :

- “**accepting state**” : the read word leads to a configuration of the form  $(q, \varepsilon, \alpha)$  where  $q \in F$  (with any  $\alpha$ )
- “**empty stack**” : ...  $(q, \varepsilon, \gamma_0)$  (with any  $q$ , but  $\gamma_0$  is the “empty stack” character.)

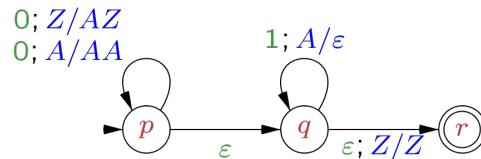
## How it works ? 2/3

Given a configuration  $(q, w, \alpha)$ , the next one is computed by the help of the transition function  $Q \times (\Sigma \cup \varepsilon) \times \Gamma \rightarrow \mathcal{P}(Q \times \Sigma^*)$  :

- **enabled transitions** : those of the form  $(q, a, A) \rightarrow (q', A')$  where  $a$  is the next letter to read on the input tape (or  $\varepsilon$ ), and  $A$  the letter on top of the stack :  $w = aw'$  and  $\alpha = A\alpha'$ .
- Pick one enabled transition, and compute the next configuration  $(q', w', A'\alpha')$ .

## How it works ? 3/3

(source : wikipedia)



- ▶ Try to derive 0011 and 00111 !
- ▶ The PDA recognises  $\{0^n 1^n \mid n \in \mathbb{N}\}$  by accepting state.

## Important theoretical results on PDA

- **Important** Stack automata are non deterministic !
- The two acceptance criteria define the same class of languages

## Goal

1 Stack automata

2 Grammars

Problem : Express languages with the same expressivity as stack automata.

- ▶ use **grammars**

## General grammars

### Grammar rule

A **grammar** rule (production rule) is of the form

$$w \rightarrow w'$$

where  $w$  and  $w'$  are words.

A grammar is a set of rules.

## Grammars

### Grammar

A **grammar** is composed of :

- A finite set  $N$  of non terminal symbols
- A finite set  $\Sigma$  of terminal symbols (disjoint from  $N$ )
- A finite set of production rules, each rule of the form  $w \rightarrow w'$  where  $w$  is a word on  $\Sigma \cup N$  with **at least** one letter of  $N$ .  $w'$  is a word on  $\Sigma \cup N$ .
- A start symbol  $S \in N$ .

## Grammars

### Example :

$$S \rightarrow aSb$$

$$S \rightarrow \varepsilon$$

is a grammar with  $N = \dots$  and  $\dots$

## Associated Language

### Derivation

$G$  a grammar defines the relation :

$$x \Rightarrow_G y \text{ iff } \exists u, v, p, qx = upv \text{ and } y = uqv \text{ and } (p \rightarrow q) \in P$$

- ▶ A grammar describes a **language** (the set of words on  $\Sigma$  that can be derived from the start symbol).

## Examples

$$S \rightarrow aSb$$

$$S \rightarrow \varepsilon$$

The grammar defines the language  $\{a^n b^n, n \in \mathbb{N}\}$

$$S \rightarrow aBSc$$

$$S \rightarrow abc$$

$$Ba \rightarrow aB$$

$$Bb \rightarrow bb$$

The grammar defines the language  $\{a^n b^n c^n, n \in \mathbb{N}\}$

### ► Exercises

## Context-free grammars

### Context-free grammar

A **CF-grammar** is a grammar where all production rules are of the form  $N \rightarrow (\Sigma \cup N)^*$ .

## Example of CF-grammar

$$S \rightarrow S + S | S * S | a$$

The grammar defines a language of arithmetical expressions.

### ► Notion of **derivation tree**.

Draw a derivation tree of  $a^*a+a$ , of  $S+S$  !

## Relationship between stack automata and grammars

### General result

The context-free/algebraic languages are exactly the languages that are described by stack automata.

- The proof is not difficult.
- Exercises

## Some other results/definitions

- Regular languages are algebraic languages, but not the converse.
- There exists normal forms for algebraic grammars
- A grammar can be ambiguous.

## Summary

Stack Automata or **PushDown Automata** are :

- Acceptors for context-free languages. But some languages are **not context free**.
- Non deterministic.

► [http://en.wikipedia.org/wiki/Pushdown\\_automaton](http://en.wikipedia.org/wiki/Pushdown_automaton) for useful pointers

# Informatique Fondamentale IMA S8

Cours 3: Counter automata, Turing Machines and decidable problems

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III - Counter automata, Turing Machines and decidable problems

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Counter automata

Laure Gonnord (Lille1/Polytech)

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Counter automata

1 Counter automata

2 Programs

3 Turing Machines

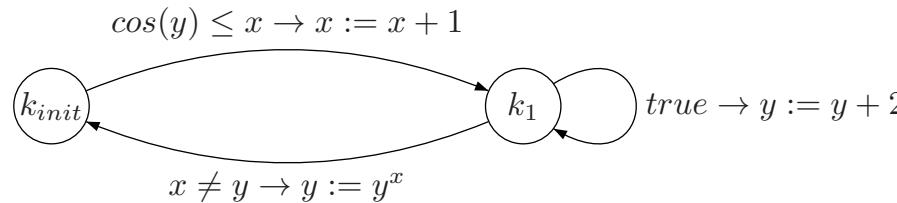
4 Decidability - Complexity

What for ?

Express more than context-free languages !

► Give a way for automata to “**count** more” : include **variables**.

## Example



## General definition

### Counter Automata

- A finite number of **counters** (variables)
  - A finite number of **control points**
  - Transitions between them that operate on counters.
- The transition function is of the form  $g \rightarrow a$  ( $g$  is the **guard**,  $a$  is the **action**)

## How it works ? 1/3

### State

A **state** is  $(q, \sigma)$

- $q$  is the current control point
- $\sigma : Var \rightarrow Val$  is a function that assigns a value (a real one or  $\perp$ ) to all counters.

► Non deterministic/No notion of acceptance/Notion of **reachability**.

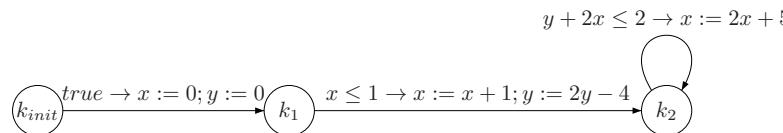
## How it works ? 2/3

Given a state  $(q, \sigma)$ , the next one is computed by the help of the transition function :

- **enabled transitions** are transition of the current control points where the current valuations of variables satisfy the guard.
- Pick one enabled transition, and compute the next state :  $(q', \sigma')$ . The new values for the variables are computed w.r.t. the action.

## How it works ? 3/3

Example of an affine automata :

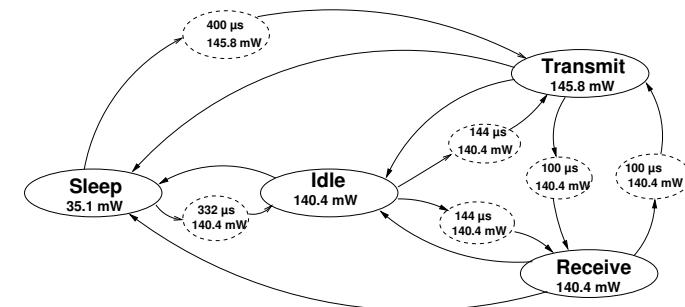


- ▶ Compute successive states.
- ▶ Exercises.

## What kind of systems ?

These automata are used to encode, for example :

- Simple systems (coffee machine, ...) **specifications**
- Energy consumption of sensors :



## What for ?

Some classical problems :

- Automatically finding invariants
- **Reachability** analysis
- Formula proving.
- (deterministic) Code generation.

### 1 Counter automata

### 2 Programs

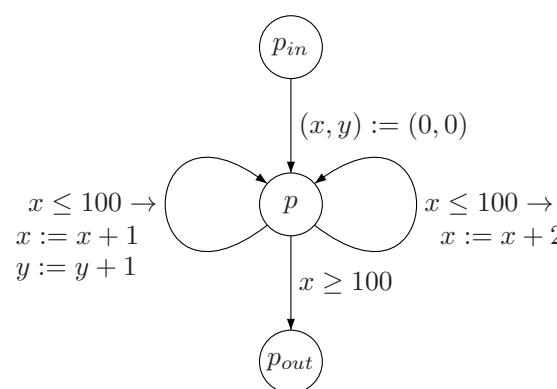
### 3 Turing Machines

### 4 Decidability - Complexity

## Expressing programs as counter automata

An **example** :

```
x:=0; y:=0
while (x<=100) do
  read(b);
  if b then
    x:=x+2
  else begin
    x:=x+1;
    y:=y+1;
  end;
  endif
endwhile
```



- ▶ Some approximations are made (arrays, Boolean, ...)

## Expressing properties of programs - 2

Automatically deriving bad states :

```
int j;
char user[USERSZ];

for(j = 0; line[j] != EOS; ++j)
  if (!strchr("-", line[j]))
    break;

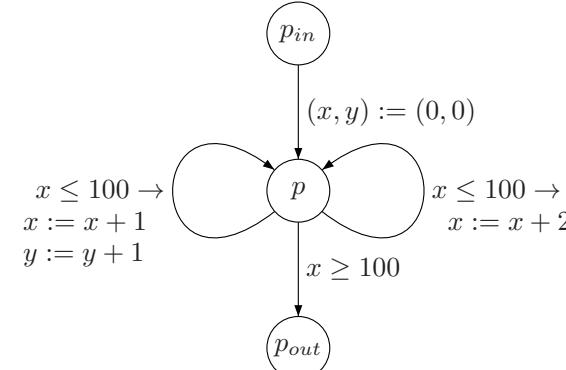
if(j == J && line[j] == ',') { /* long list */
  /* BUG! No bounds check. */
  assert(USERSZ>=N-j, "badstate");

  r_strncpy (user, line + j);
}
```

- ▶ “badstate” is reachable.

## Expressing properties of programs

Some (**safety**) properties of programs can be expressed inside the counter automaton :



- ▶ Encode the fact that  $state = p_{out} \wedge y > 100$  is “bad”
- ▶ Some modifications of the automaton can be automatically done.

## Expressing programs as counter automata

- **Pros** : finding and proving program properties
- **Cons** : how do we define the operations ? the fact that integers are encoded on bits ?

- ▶ There is a need for a more accurate (not specialised) model !

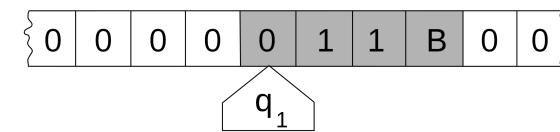
## Turing Machine, def - 1

1 Counter automata

2 Programs

3 Turing Machines

4 Decidability - Complexity



### Turing Machine, Turing, 1935

- A **tape** (infinite in both sides) : the memory. (it has a working alphabet which contains a **blank symbol**).
  - A **head** : read/write symbols on the tape.
  - A finite transition table (or function)
- A PushDown automaton which is more flexible.

image credits : Wikipedia.org

## Turing Machine, def - 2

### Turing Machine elements

- States (Q), initial state ( $q_0$ ), final (accepting) states (F).
  - One alphabet  $\Gamma$  for the tape.
  - $b \in \Gamma$  the blank letter.
  - Transitions are finitely many : read the letter under the head, and then :
    - Erase a symbol or write one under the head
    - Move the head (read, write, or stays)
    - The “state” can be modified.
- The transition function is :

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

### An Example

TM that decides if  $x$  is even : (final State :  $q_4$ )

State/char	0	1	B
$q_1$	$(q_1, 0, R)$	$(q_1, 1, R)$	$(q_2, B, L)$
$q_2$	$(q_3, B, L)$	$(q_4, B, L)$	—

Play on BBBB BBBB 11 BBBB and BBBB BBBB 10 BBBB

- A **configuration** is a tuple (word on the tape, position of the head, state).

Adapted from : [http://www.madchat.fr/coding/algo/algo\\_epfl.pdf](http://www.madchat.fr/coding/algo/algo_epfl.pdf) slide 4

## Another Example

Demo of a TM recognising a language :  $a^n b^n c^n$

Program found here :

<http://www.cs.columbia.edu/~zeph/software/BJDweck/>

## General results 1/2

There exists Turing machines for the following languages :

- palindromes
- $a^n b^n c^n$  (non algebraic language)
- $a^i$  with  $i$  prime (non algebraic)
- $a^{n^2}$ , with  $n \geq 0$

► Turing machines are more powerful than all other models (we have seen yet)

### Decidable Languages

A language that is recognised by a Turing Machine is said to be **decidable**.

## Accepting or computing

A TM can also compute functions

TM that writes 1 if  $x$  is even, 0 else ( $q_6$  is final state) :

State/char	0	1	B
$q_1$	$(q_1, 0, R)$	$(q_1, 1, R)$	$(q_2, B, L)$
$q_2$	$(q_3, B, L)$	$(q_4, B, L)$	—
$q_3$	$(q_3, B, L)$	$(q_3, B, L)$	$(q_5, 1, R)$
$q_4$	$(q_4, B, L)$	$(q_4, B, L)$	$(q_5, 0, R)$
$q_5$	—	—	$(q_6, B, R)$

## Another Example

Demo of a TM computing the subtraction.

Play on  $BBBBBBB11BBBBB$  and  $BBBBBBB10BBBBB$

## General results 2/2

There exists Turing machines for the computation of :

- $x \mapsto x + 1$
- $(x, y) \mapsto x + y$
- $x \mapsto x^2$
- all the functions you are able to write on computers

### Computable functions

A function (defined for all its input) that is computable by a Turing Machine is said to be **TM computable**

- ▶ A Model of what can be computed with machines. (**Church Thesis**)

1 Counter automata

2 Programs

3 Turing Machines

4 Decidability - Complexity

## Decidable - Semi-decidable languages

If  $L$  is a language,  $L$  is **decidable** if there exists a Turing Machine (or an algorithm) that outputs for all  $w$  :

- 1 if  $w \in L$
- else 0.

**Semi-decidable** :

- 1 if  $w \in L$
- else does not terminate
- ▶ equivalent definition for problems.

## Complexity

Link with computational complexity :

- The number of steps in the execution of a TM gives the **complexity in time**,
- The number of seen squares in the execution of a TM gives the **complexity in space**.

## Examples of undecidable problems

- The halting problem for TM or counter automata (for more than 2 counters)
- Given a program, does it loops ?
- Is a given algebraic expression (with log, \*, exp, sin, abs) equal to 0 ? (Richardson, 1968)
- The 10<sup>th</sup> Hilbert Problem (Diophantine equations)

## Summary

Turing Machines :

- A model closed to **programming languages**.
- Non deterministic.
- Acceptors for decidable languages. But some languages are **not decidable** !
- (equivalently) Computes solutions to problems. But ...

### Important fact

Some common problems are undecidable !

Counter automata :

- are a more simpler model
- have the same power of expression as Turing Machines.
- Reachability is **undecidable** too. But we can do approximations.