

# The theory of regular cost functions.

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PhD under supervision of Thomas Colcombet

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# Introduction

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Toolbox to decide many problems arising naturally.  
Verification of systems can be done automatically.  
Theoretical and practical advantages.

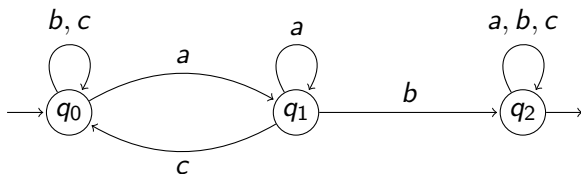
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- **Problem:**  
Decidability is still open for some automata-related problems.

- 1 Automata theory
- 2 Regular Cost Functions
- 3 Contributions of the thesis
- 4 Zoom: Aperiodic Cost Functions



# Descriptions of a language

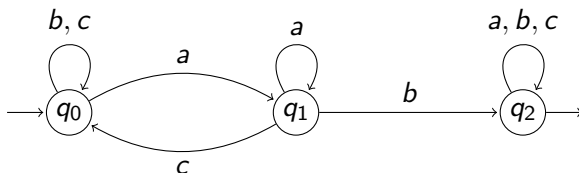


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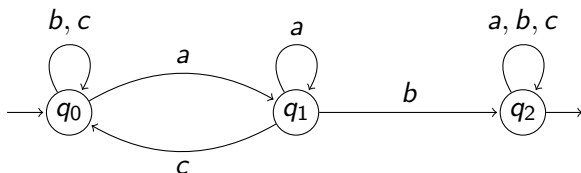


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- **Finite monoid** :  $M = \{1, a, b, c, ba, 0\}$ ,  $P = \{0\}$   
 $ab = 0$ ,  $aa = ca = a$ ,  $bb = bc = b$ ,  $cc = ac = cb = c$

# Regular Languages

All these formalisms are effectively equivalent.

$a^n b^n$

## ***Regular Languages***

Expressions

MSO

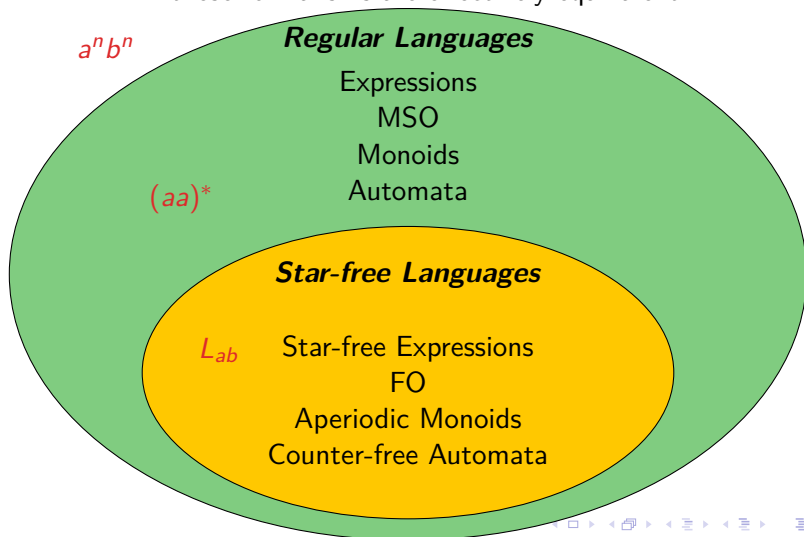
Monoids

Automata

$(aa)^*$

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# Historical motivation

Given a class of languages  $\mathcal{C}$ , is there an algorithm which given an automaton for  $L$ , decides whether  $L \in \mathcal{C}$  ?

## Theorem (Schützenberger 1965)

*It is decidable whether a regular language is star-free, thanks to the equivalence with aperiodic monoids.*

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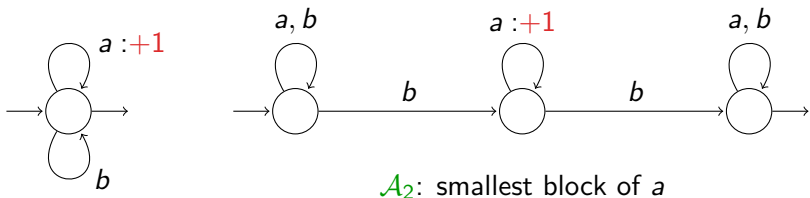
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**Finite Power Problem:** Given  $L$ , is there  $n$  such that  
$$(L + \varepsilon)^n = L^* ?$$

There is no known algebraic characterization, other technics are needed to show decidability.

# Distance Automata



**Unbounded:** There are words with arbitrarily large value.

Deciding **Boundedness** for distance automata  $\Rightarrow$  solving finite power problem.

**Theorem (Hashiguchi 82, Kirsten 05)**

*Boundedness is decidable for distance automata.*



# Problems solved using counters

- **Finite Power** (finite words) [Simon '78, Hashiguchi '79]

Is there  $n$  such that  $(L + \varepsilon)^n = L^*$ ?

- **Fixed Point Iteration** (finite words)

[Blumensath+Otto+Weyer '09]

Can we bound the number of fixpoint iterations in a MSO formula ?

- **Star-Height** (finite words/trees)

[Hashiguchi '88, Kirsten '05, Colcombet+Löding '08]

Given  $n$ , is there an expression for  $L$ , with at most  $n$  nesting of Kleene stars?

- **Parity Rank** (infinite trees)

[reduction in Colcombet+Löding '08, decidability open, deterministic input Niwinski+Walukiewicz '05]

Given  $i < j$ , is there a parity automaton for  $L$  using ranks  $\{i, i + 1, \dots, j\}$ ?

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# Theory of Regular Cost Functions

**Aim:** General framework for previous constructions.

- Generalize from languages  $L : \mathbb{A}^* \rightarrow \{0, 1\}$   
to functions  $f : \mathbb{A}^* \rightarrow \mathbb{N} \cup \{\infty\}$
- Accordingly generalize automata, logics, semigroups, in order to obtain a **theory of regular cost functions**, which behaves as well as possible.
- Obtain decidability results thanks to this new theory.

# Cost automata over words

**Nondeterministic** finite-state automaton  $\mathcal{A}$

+ **finite set of counters**

(initialized to 0, values range over  $\mathbb{N}$ )

+ **counter operations on transitions**

(increment I, reset R, check C, no change  $\varepsilon$ )

**Semantics:**  $\llbracket \mathcal{A} \rrbracket : \Sigma^* \rightarrow \mathbb{N} \cup \{\infty\}$

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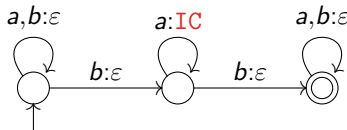
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$val_B(\rho) := \max$  checked counter value during run  $\rho$

$\llbracket \mathcal{A} \rrbracket_B(u) := \min\{val_B(\rho) : \rho \text{ is an accepting run of } \mathcal{A} \text{ on } u\}$

## Example

$\llbracket \mathcal{A} \rrbracket_B(u) = \min$  length of block of  $a$ 's surrounded by  $b$ 's in  $u$



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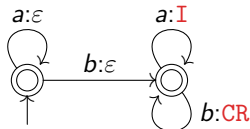
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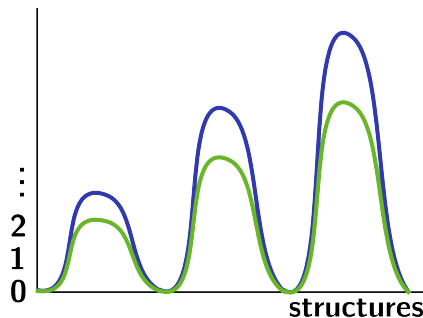
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“ $[[\mathcal{A}]]_B \approx [[\mathcal{B}]]_B$ ”: decidable on words

[Colcombet '09, following Bojányk+Colcombet '06]  
for all subsets  $U$ ,  $[[\mathcal{A}]](U)$  bounded iff  $[[\mathcal{B}]](U)$  bounded



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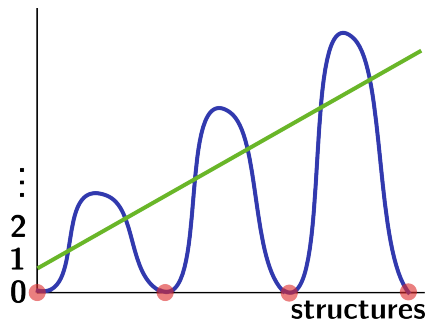


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$$[[\mathcal{A}]] \neq [[\mathcal{B}]]$$

Therefore we always identify two functions if they are bounded on the same sets.

### Example

For any function  $f$ , we have  $f \approx 2f \approx \exp(f)$ .

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### Theorem (Colcombet '09, following Hashiguchi, Leung, Simon, Kirsten, Bojańczyk+Colcombet)

*Cost automata  $\Leftrightarrow$  Cost logics  $\Leftrightarrow$  Stabilisation monoids.*

*For some suitable models of Cost Logics and Stabilisation Monoids, extending the classical ones.*

*Boundedness decidable.*

All these equivalences are only valid up to  $\approx$ .

It provides a toolbox to decide boundedness problems.

# Languages as cost functions

A language  $L$  is represented by its characteristic function

$$\chi_L(u) = \begin{cases} 0 & \text{if } u \in L \\ \infty & \text{if } u \notin L \end{cases}$$

If  $\mathcal{A}$  is a classical automaton for  $L$ , then  $\llbracket \mathcal{A} \rrbracket_B = \chi_L$  and  $\llbracket \mathcal{A} \rrbracket_S = \chi_{\bar{L}}$ . Switching between  $B$  and  $S$  is the generalization of **language complementation**.

Cost function theory strictly extends language theory.

All theorems on cost functions are in particular true for languages.

**Goal of the thesis:** Studying cost function theory, and generalise known theorems from languages to cost functions.

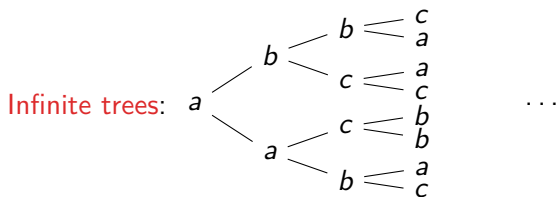
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# Contributions of the thesis

## Input structures:

Finite words: *accba*

Infinite words: *abaabaccbaba...*



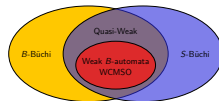
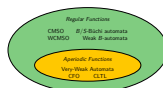
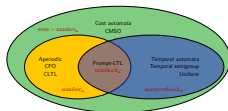
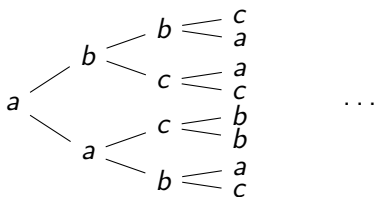
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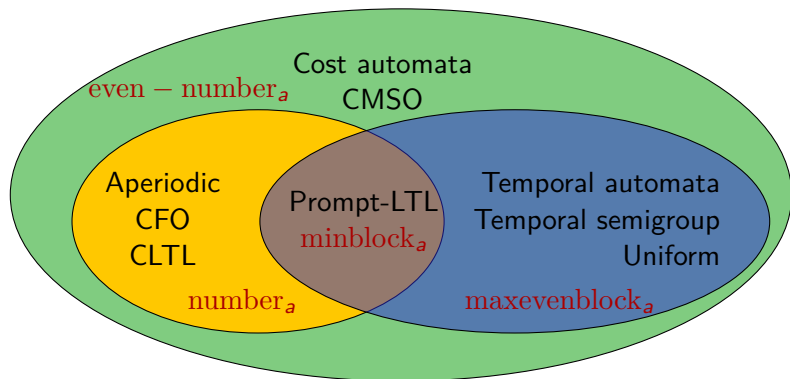
Infinite trees:



## Different kinds of results:

- Generalisation of language notions and theorems,
- Study of classes specific to cost functions,
- Reduction of classical decision problems to boundedness problems.

# Cost Functions on finite words



Decidability of membership and effectiveness of translations

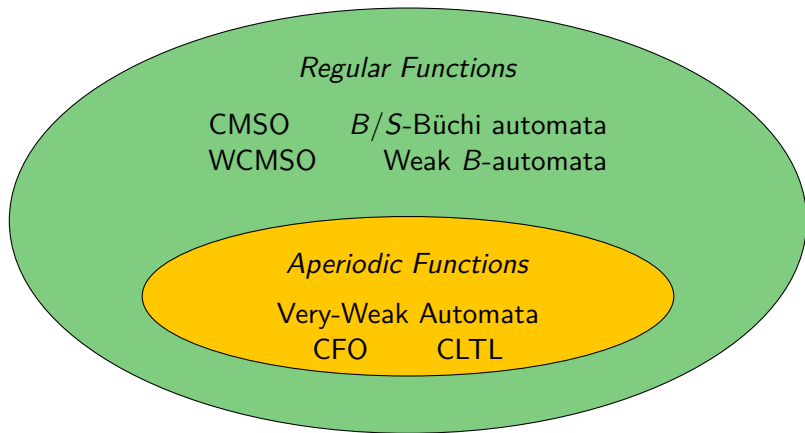
[Colcombet+K.+Lombardy ICALP '10, K. STACS '11].

Generalization of Myhill-Nerode Equivalence [K. STACS '11].

Boundedness of CLTL is PSPACE-complete [Submitted to LMCS].



# Cost Functions on infinite words



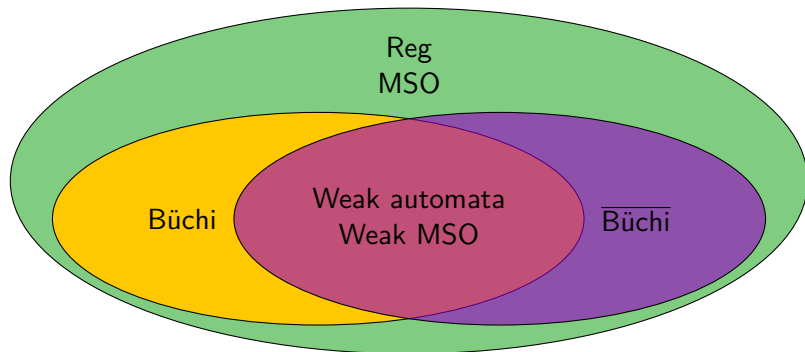
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# Languages on infinite trees

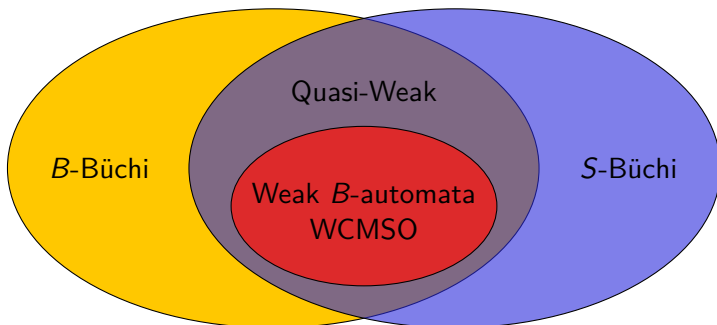
## Theorem (Rabin 1970, Kupferman + Vardi 1999)

$L$  recognizable by an alternating weak automaton  $\Leftrightarrow$

$L$  recognizable by WMSO  $\Leftrightarrow$  there are Büchi automata  $\mathcal{U}$  and  $\mathcal{U}'$  such that  $L = L(\mathcal{U}) = \overline{L(\mathcal{U}')}$ .



# Cost functions on infinite trees



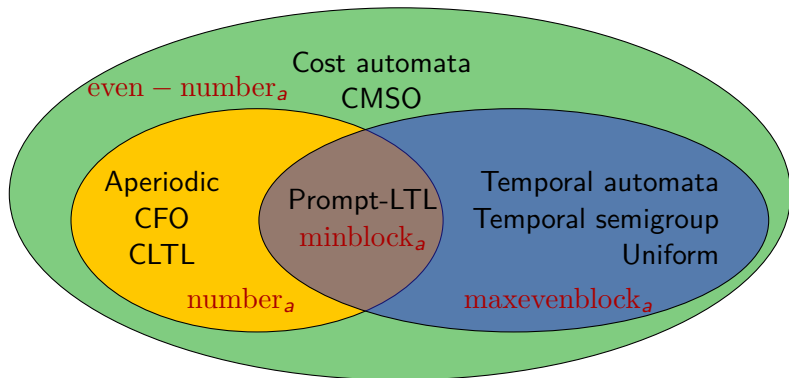
Decidability of boundedness for Quasi-Weak automata. [K.+Vanden Boom, FSTTCS '11].

If  $\mathcal{A}$  is a Büchi automaton, it is decidable whether  $L(\mathcal{A})$  is weak [submitted to CSL '13].

Logic for the Quasi-Weak class.

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# Logics on Finite Words

- **First-Order Logic (FO)**: we quantify over positions in the word.

$$\varphi := a(x) \mid x \leq y \mid \neg\varphi \mid \varphi \vee \psi \mid \exists x\varphi$$

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- **Linear Temporal Logic (LTL)** over  $\mathbb{A}^*$ :

$$\varphi := a \mid \Omega \mid \neg\varphi \mid \varphi \vee \psi \mid \mathbf{X}\varphi \mid \varphi \mathbf{U}\psi$$

$$\varphi \mathbf{U}\psi: \quad \begin{array}{cccccccccccc} \varphi & \varphi & \varphi & \varphi & \varphi & \varphi & \varphi & \varphi & \psi \\ a_0 & a_1 & a_2 & a_3 & a_4 & a_5 & a_6 & a_7 & a_8 & a_9 & a_{10} \end{array}$$

Future operators **G** (Always) and **F** (Eventually).

**Example**: To describe  $L_{ab}$ , we can write  $\mathbf{F}(a \wedge \mathbf{X}b)$ .



# Generalisation: cost LTL

- **CLTL** over  $\mathbb{A}^*$ :

$$\varphi := a \mid \Omega \mid \varphi \wedge \psi \mid \varphi \vee \psi \mid \mathbf{X}\varphi \mid \varphi \mathbf{U}\psi \mid \varphi \mathbf{U}^{\leq N}\psi$$

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- “Error variable”  $N$  is unique, shared by all occurrences of  $\mathbf{U}^{\leq N}$ .
- $\mathbf{G}^{\leq N}\varphi$ :  $\varphi$  is false at most  $N$  times in the future ( $\varphi \mathbf{U}^{\leq N}\Omega$ ).

# Generalisation : Cost FO and Cost MSO

- **CFO** over  $\mathbb{A}^*$ :

$$\varphi := a(x) \mid x = y \mid x < y \mid \varphi \wedge \varphi \mid \varphi \vee \varphi \mid \exists x \varphi \mid \forall x \varphi \mid \forall^{\leq N} x \varphi$$

Negations pushed to the leaves.

- As before,  $N$  unique free variable.
- $\forall^{\leq N} x \varphi(x)$  means  $\varphi$  is false on at most  $N$  positions.
- **CMSO** extends CFO by allowing quantification over sets.

# Semantics of Cost Logics

From formula to cost function:

Formula  $\varphi \longrightarrow$  cost function  $\llbracket \varphi \rrbracket : \mathbb{A}^* \rightarrow \mathbb{N} \cup \{\infty\}$ , defined by

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Example with the alphabet  $\{a, b\}$

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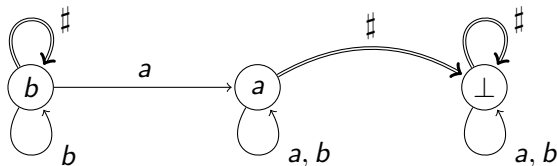
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Example: Stabilisation Monoid for number  $a$

$M = \{b, a, \perp\}$ ,  $P = \{a, b\}$ ,

$b$ : “no  $a$ ”,  $a$ : “a little number of  $a$ ”,  $\perp$ : “a lot of  $a$ ”.



Cayley graph

# Aperiodic Monoids

**Definition:** A [stabilisation] monoid  $M$  is **aperiodic** if for all  $x \in M$  there is  $n \in \mathbb{N}$  such that  $x^n = x^{n+1}$ .

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## Theorem (McNaughton-Papert, Schützenberger, Kamp)

*Aperiodic Monoids*  $\Leftrightarrow$  *FO*  $\Leftrightarrow$  *LTL*  $\Leftrightarrow$  *Star-free Expressions*.

We want to generalise this theorem to cost functions.

The problems are:

- No complementation  $\Rightarrow$  No Star-free expressions.
- Deterministic automata are strictly weaker.
- Heavy formalisms (semantics of stabilisation monoids).
- New quantitative behaviours.
- Original proofs already hard.

# Aperiodic cost functions

## Theorem (K. STACS 2011)

*Aperiodic stabilisation monoid*  $\Leftrightarrow$  CLTL  $\Leftrightarrow$  CFO.

Proof Ideas:

- Generalisation of Myhill-Nerode  $\Rightarrow$  Syntactic object.
- Induction on  $(|M|, |\mathbb{A}|)$ .
- Extend functions to sequences of words.
- Use bounded approximations.
- Extend CLTL with Past operators, show Separability.

