

# Bounded-Regret Determinization of Max-Plus Automata

Guillermo A. Pérez

Université libre de Bruxelles  
University of Oxford

Highlights'17 @ London

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(Weighted) automata

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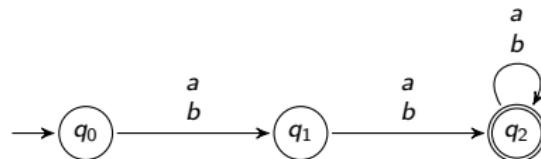


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- ▶ an alphabet  $A = \{a, b, \dots\}$ , and transition relation  $\Delta \subseteq Q \times A \times Q$

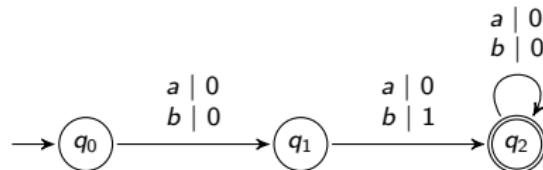


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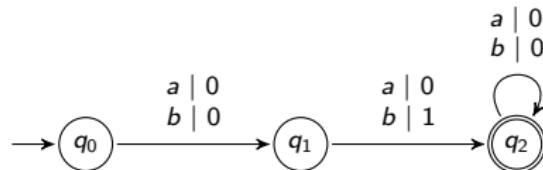


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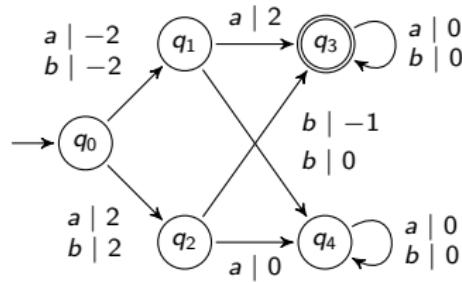
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it is **deterministic** if ' $\Delta$  is functional' and  $I$  is a singleton  $\{q_I\}$

# Max-plus automata

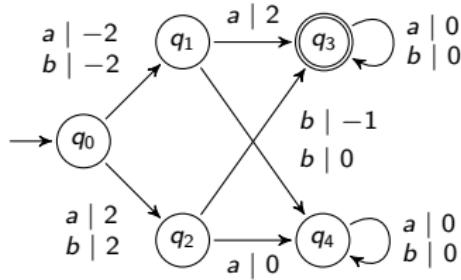


## Runs, acceptance, and value

A **run** (on input word) is a state-letter sequence, e.g.  $q_0 b q_1 a q_3$ ; it can be initial, final, or **accepting**; it has a **value** e.g.

$$w(q_0 b q_1 a q_3) = w(q_0, b, q_1) + w(q_1, a, q_3).$$

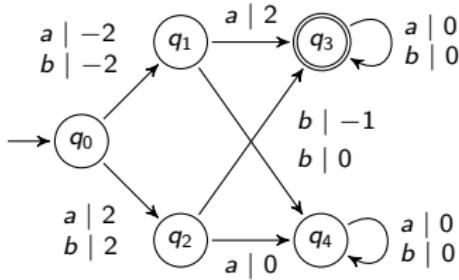
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## Language, function, maximal runs

- ▶ A (finite) word  $\alpha$  is accepted if the automaton has an accepting run on  $\alpha$ ; the set  $\mathcal{L}_{\mathcal{A}}$  of all such words is the **language** of the automaton.

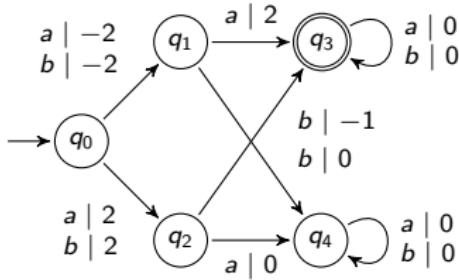
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- ▶ The automaton induces a **function**  $\llbracket \mathcal{A} \rrbracket : \mathcal{L}_\mathcal{A} \rightarrow \mathbb{Z}$  by mapping words  $\alpha$  to the maximal value of an accepting run on  $\alpha$ .

# Max-plus automata



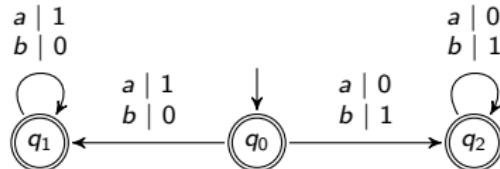
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- ▶ An accepting run  $\rho$  on  $\alpha$  is **maximal** if  $w(\rho) = \llbracket \mathcal{A} \rrbracket(\alpha)$ .

# Motivation: determinizability

## Proposition

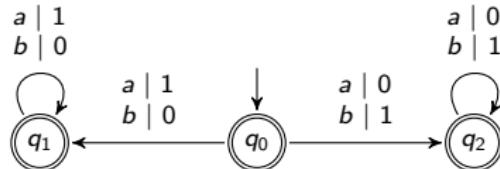
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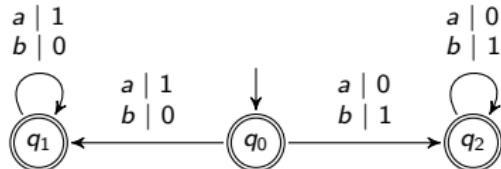


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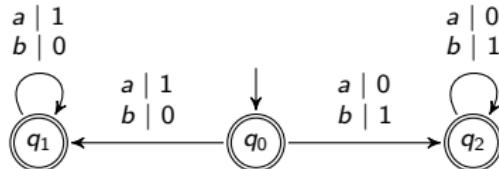
**Proposition (Krob 1992; Almagor, Boker, Kupferman 2011)**

Determining if  $\llbracket \mathcal{A} \rrbracket \leq \llbracket \mathcal{B} \rrbracket$  (quantitative language inclusion) is undecidable.

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Deciding determinizability is open!

- ▶ Sufficient (and decidable) conditions for determinizability are known [Mohri 1997; Aminof, Kupferman, Lampert 2013].
- ▶ Determining if a polynomially ambiguous weighted automaton is determinizable is decidable [Kirsten, Lombardy 2009].

# Motivation: bounded-regret determinizability

## Determinizing on the fly

A weighted automaton  $\mathcal{A}$  is determinizable on-the-fly if there is a non-determinism resolving strategy constructing a run of  $\mathcal{A}$  as the input word is spelled (letter by letter).

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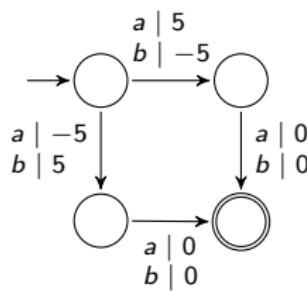
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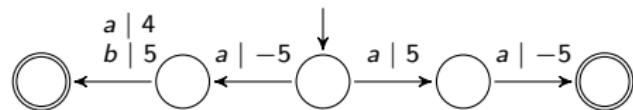
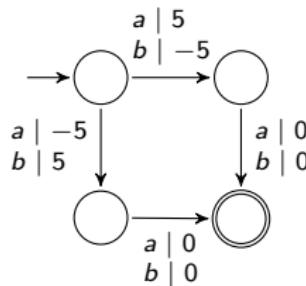
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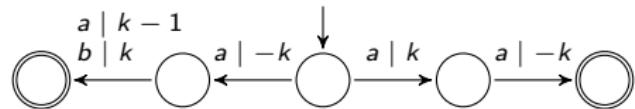
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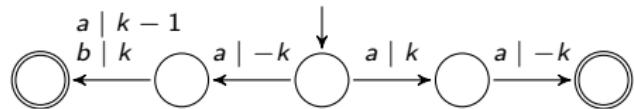
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- ▶ If  $\mathcal{A}$  is determinizable on the fly, then it is determinizable [Aminof, Kupferman, Lampert 2010].
- ▶ On-the-fly determinizability is equivalent to the following. There exists a deterministic automaton  $\mathcal{D}$  such that  $\llbracket \mathcal{D} \rrbracket = \llbracket \mathcal{A} \rrbracket$  and there is a homomorphism from  $\mathcal{D}$  to  $\mathcal{A}$  [Colcombet 2012].

# Motivation: bounded-regret determinizability



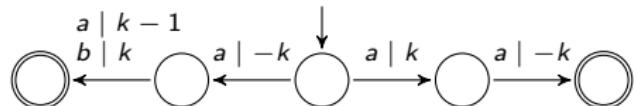
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Approximate determination on the fly

If a non-zero regret bound  $r$  is allowed, the automaton is approximately determinizable on-the-fly.

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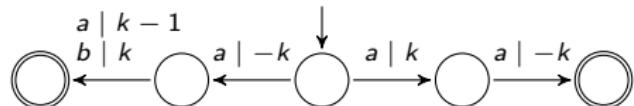


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- ▶ Can be used to formalize the notion of competitive online algorithms [Aminof, Kupferman, Lampert 2010].

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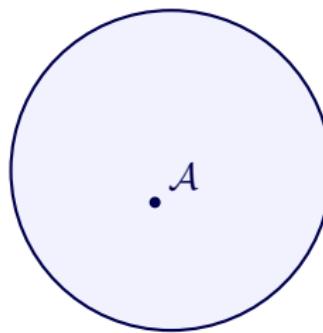
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- ▶ Can be used to formalize the notion of competitive online algorithms [Aminof, Kupferman, Lampert 2010].
- ▶ Quantitative generalization of good-for-games automata [Hunter, P., Raskin 2016].
- ▶ (These automata suffice as observers for approximate quantitative games.)

# Bounded-regret determinization I

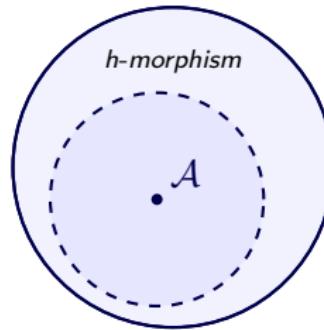
0-regret: stronger notion of determinization



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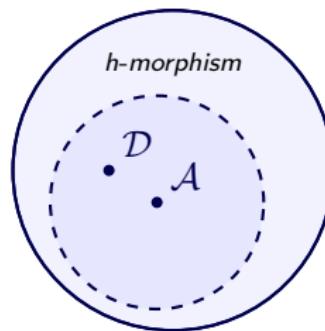
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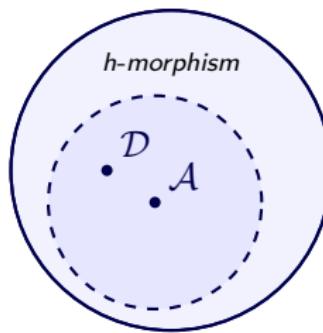
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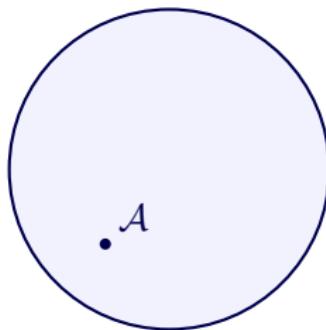
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Proposition (Aminof, Kupferman, Lampert 2010)

*Determining if a given weighted automaton is 0-regret determinizable is decidable in polynomial time.*

## Bounded-regret determinization II

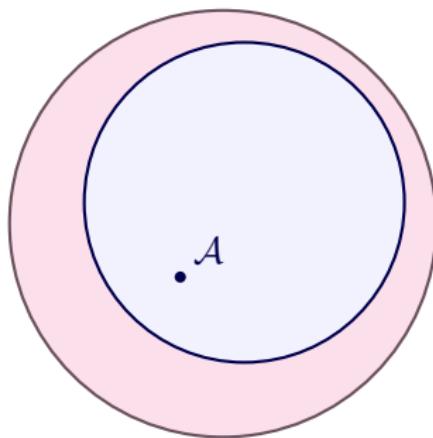
$r$ -regret: approximate determinization under a structural restriction



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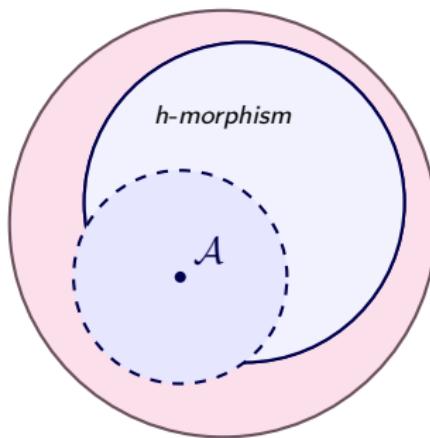
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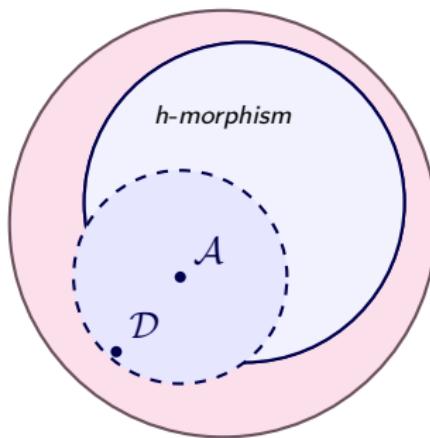
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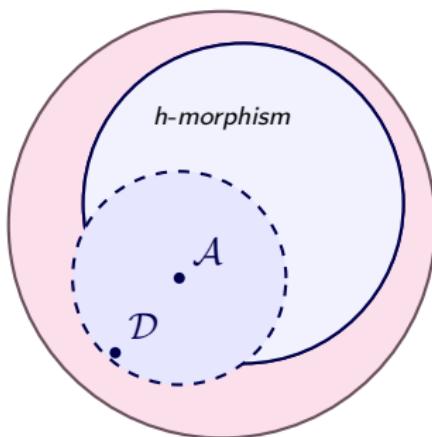
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## Theorem

*The  $r$ -regret determinization problem is decidable in exponential time (using a quantitative generalization of Joker games [Kuperberg, Skrzypczak 2015]).*

# Conclusion

	the 0 case	general $r$
Bounded regret	polynomial time	EXP-complete

- ▶ Are the regret and quantitative Joker games equivalent?
- ▶ What is the complexity of deciding if  $\exists r$  s.t. an automaton is  $r$ -regret determinizable?
- ▶ What if we define regret w.r.t. ratio instead of difference?

For more details...

- ▶ Emmanuel Filiot, Ismael Jecker, Nathan Lhote, Guillermo A. Pérez, Jean-François Raskin. **On delay and regret determinization of max-plus automata.** LICS 2017: 1-12.