

# Memory Requirements of Omega-Regular Objectives: the Regular Case

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Laboratoire  
Méthodes  
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# Outline

## Synthesis problem

Synthesizing **controllers** for **reactive systems** with an **objective**.  
Systems and their environment modeled with **zero-sum games**.

## Strategy complexity

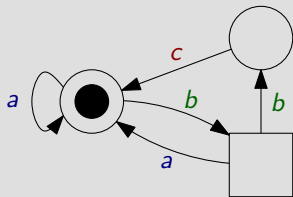
Given an objective, what are the **smallest** optimal controllers?  
↪ What is the *smallest automatic structure* that remembers **sufficient information** to make **optimal decisions**?

## Results

**Characterization** of automatic structures for *regular objectives*;  
**computational complexity** of finding small structures.

# Games

## Zero-sum turn-based games on graphs



- $C = \{a, b, c\}$ ,  $\mathcal{A} = (V_1, V_2, E)$ .
- Two players  $\mathcal{P}_1$  ( $\circ$ ) and  $\mathcal{P}_2$  ( $\square$ )

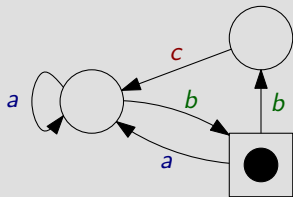
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A **strategy** of  $\mathcal{P}_1$  is a function  $\sigma: E^* \rightarrow E$ .

A strategy  $\sigma$  is **winning for  $W$  from  $v \in V$**  if all infinite paths from  $v$  consistent with  $\sigma$  induce an infinite word in  $W$ .

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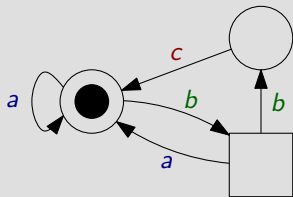
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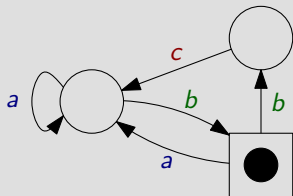
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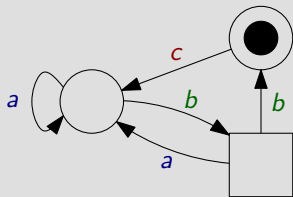
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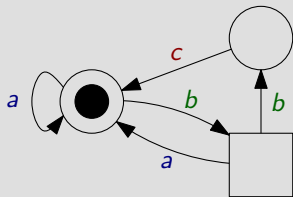
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## Strategies

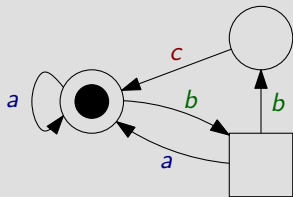
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# Games

## Zero-sum turn-based games on graphs



- $C = \{a, b, c\}$ ,  $\mathcal{A} = (V_1, V_2, E)$ .
- Two players  $\mathcal{P}_1$  ( $\circ$ ) and  $\mathcal{P}_2$  ( $\square$ ) generate an infinite word  $w = babbcb \dots \in C^\omega$ .
- **Objective** of  $\mathcal{P}_1$  is a set  $W \subseteq C^\omega$ .
- **Zero-sum**: objective of  $\mathcal{P}_2$  is  $C^\omega \setminus W$ .

## Strategies

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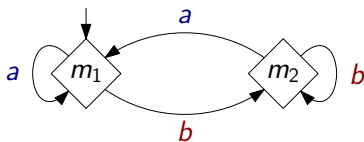
## Representations of a strategy

In general, a strategy  $\sigma: E^* \rightarrow E$  has an **infinite** representation.  
For synthesis, we like when winning strategies admit a **finite** representation with a **computable** size. Usual finite representation:

### Memory structure

*Memory structure*  $(M, m_{\text{init}}, \alpha_{\text{upd}})$ : finite set of states  $M$ , initial state  $m_{\text{init}}$ , update function  $\alpha_{\text{upd}}: M \times C \rightarrow M$ .

Ex.: remember whether  $a$  or  $b$  was last played (**not yet a strategy!**):



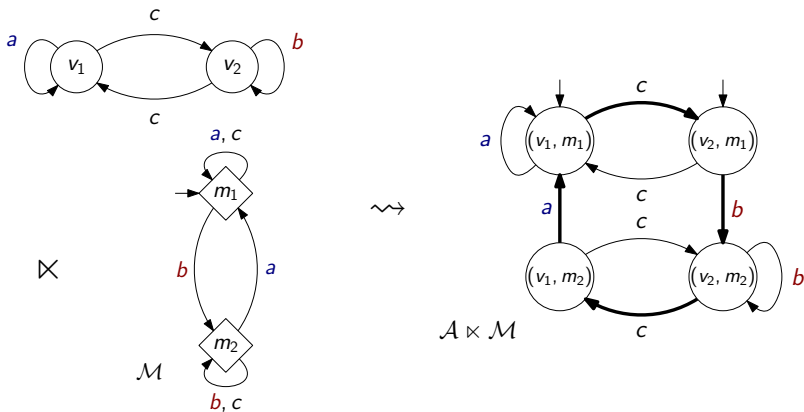
Given an arena  $\mathcal{A} = (V_1, V_2, E)$ : *next-action function*  $\alpha_{\text{nxt}}: V_i \times M \rightarrow E$ .

# Finite memory $\approx$ no memory in the product

Memory  $\mathcal{M}$  in  $\mathcal{A} \approx$  no memory in arena  $\mathcal{A} \times \mathcal{M}$ .

If  $C = \{a, b, c\}$ ,

$W = \{w \in C^\omega \mid a \text{ is seen } \infty \text{ly often and } b \text{ is seen } \infty \text{ly often}\}$ :



## $\omega$ -regular objectives

The  $\omega$ -regular objectives are the ones that can be expressed with  $\omega$ -regular expressions, or equivalently, the ones that can be expressed by deterministic Muller automata.

Examples with  $C = \{a, b\}$ :

- $W = b^*ab^*aC^\omega$ ;
- $W = (b^*a)^\omega$ ;
- $W = ((ab) \mid (ba))C^\omega$ .

### Theorem (Büchi, Landweber, 1969)<sup>1</sup>

All  $\omega$ -regular objectives admit **finite-memory winning strategies** in all arenas.

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<sup>1</sup>Büchi and Landweber, "Definability in the Monadic Second-Order Theory of Successor", 1969.

## Well-studied case: *Muller conditions*

For  $\mathcal{F} \subseteq 2^C$ , *objective Muller*( $\mathcal{F}$ ) is the set of words whose set of colors seen infinitely often is in  $\mathcal{F}$ .

Examples with  $C = \{a, b\}$ :

- $\text{Muller}(\{\{a\}, \{a, b\}\}) = (b^*a)^\omega$ ,
- $\text{Muller}(\{\{a, b\}\}) = (b^*a)^\omega \cap (a^*b)^\omega$ .

### Memory requirements of Muller conditions

- First upper bound of size  $\mathcal{O}(|C|!)$  in 1982 (*later appearance record*);<sup>2</sup>
- Followed by many works about specific cases;<sup>3,4</sup>
- **Characterization** of precise memory requirements and **algorithm** to compute them in 1997 ([DJW97]<sup>5</sup>).

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<sup>2</sup>Gurevich and Harrington, "Trees, Automata, and Games", 1982.

<sup>3</sup>Emerson and Jutla, "Tree Automata, Mu-Calculus and Determinacy (Extended Abstract)", 1991.

<sup>4</sup>Klarlund, "Progress Measures, Immediate Determinacy, and a Subset Construction for Tree Automata", 1994.

<sup>5</sup>Dziembowski, Jurziński, and Walukiewicz, "How Much Memory is Needed to Win Infinite Games?", 1997.

# Is that it?

We have:

- 1 that all  $\omega$ -regular objectives can be represented by a **deterministic automaton using a Muller acceptance condition**;
- 2 a complete understanding of the **memory requirements of Muller conditions**.

**Does this settle the question of the memory requirements of all  $\omega$ -regular objectives?**

Sometimes quoted as such,<sup>6</sup> but **not the case** (it is only an upper bound)!

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<sup>6</sup>In *Handbook of Model Checking* (Bloem, Chatterjee, and Jobstmann, “Graph Games and Reactive Synthesis”, 2018): “The results of Dziembowski et al. [80] give precise memory requirements for strategies in 2-player games with  $\omega$ -regular objectives”.

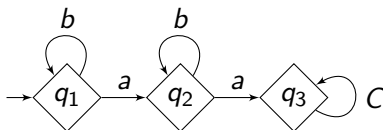
## Why only an upper bound?

Let  $C = \{a, b\}$ ,  $W = b^*ab^*aC^\omega$  ( $\approx$  seeing  $a$  two or more times).

Express it as a **Muller condition**?

Not directly a Muller condition  $\text{Muller}(\mathcal{F})$  with  $\mathcal{F} \subseteq 2^C$

$\rightsquigarrow$  needs an **automaton structure**.



$\rightsquigarrow W = \text{Muller}(\{F \subseteq \{q_1, q_2, q_3\} \mid q_3 \in F\})$ .

Using [DJW97],<sup>7</sup> we need 1 memory state...

... **after** augmenting the game graph with the automaton,  
so **upper bound of 3 states of memory**.

But **1 memory state** suffices for winning strategies!

<sup>7</sup>Dziembowski, Jurdziński, and Walukiewicz, "How Much Memory is Needed to Win Infinite Games?", 1997.

# Orthogonal quest: **regular** objectives

## How to go further?

Study the memory requirements of  $\omega$ -regular objectives with **non-trivial automaton structures**.

We consider “the simplest ones”.

## Regular objectives

- A **regular reachability objective** is a set  $LC^\omega$  with  $L \subseteq C^*$  regular.
- A **regular safety objective** is a set  $C^\omega \setminus LC^\omega$ .
- A player wants to realize a word in  $L$ , the other wants to prevent it.
- Expressible as standard **deterministic finite automata**.
- *Special cases of open and closed sets, at the first level of the Borel hierarchy.*



# Comparing words

Let  $W \subseteq C^\omega$  be an objective.

## Winning continuations

For  $x \in C^*$ ,  $x^{-1}W = \{w \in C^\omega \mid xw \in W\}$ .

For  $x, y \in C^*$ ,

- $x \sim_W y$  if  $x^{-1}W = y^{-1}W$  ( $\approx$  Myhill-Nerode equivalence relation),
- $x \preceq_W y$  if  $x^{-1}W \subseteq y^{-1}W$  (called **prefix preorder**).

*Blackboard example for a regular safety objective.*

# Necessary condition for the memory

Let  $W$  be an objective.

## Lemma

The memory structure  $\mathcal{M} = (M, m_{\text{init}}, \alpha_{\text{upd}})$  needs to **distinguish incomparable words** (for  $\preceq_W$ ), i.e.,

if  $x, y \in C^*$  are incomparable for  $\preceq_W$ ,  
then  $\alpha_{\text{upd}}^*(m_{\text{init}}, x) \neq \alpha_{\text{upd}}^*(m_{\text{init}}, y)$ .

Why?

*Blackboard example.*

In other words, the memory structure needs to be able to know a chain for  $\preceq_W$  in which we are, but it is OK not to remember the precise automaton state.

# Characterization: safety

Let  $W$  be a **regular safety objective**.

## Theorem

A memory structure suffices to win in all arenas for  $W$  **if and only if** it distinguishes incomparable words.

## Question

How to find the smallest such memory structure?

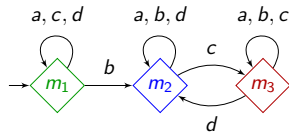
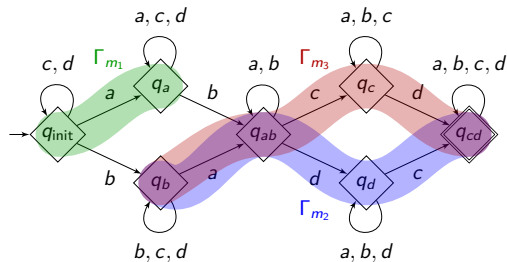
# A more involved example

*Blackboard example.*

Two constructions that always work for upper bounds:

- 1 just take the whole automaton as a memory structure;
- 2 build a memory state for each maximal chain.

Possible to do better? **Yes!**



# Reformulation using **chain coverings**

Let  $W$  be the regular safety objective derived from automaton  $\mathcal{D} = (Q, C, q_{\text{init}}, \delta, F)$ .

## Lemma

There is a memory structure  $\mathcal{M}$  with  $k$  states that suffices for  $W$  *if and only if* there are  $k$  sets  $\Gamma_1, \dots, \Gamma_k \subseteq Q$  such that

- 1  $Q = \bigcup_{i=1}^k \Gamma_i$ ,
- 2 for all  $i \in \{1, \dots, k\}$ ,  $\Gamma_i$  is a chain for  $\preceq_W$ , and
- 3 for all  $i \in \{1, \dots, k\}$ , for all  $c \in C$ , there is  $j \in \{1, \dots, k\}$  such that  $\delta(\Gamma_i, c) \subseteq \Gamma_j$ .

# Computational complexity: safety

## Decision problem

MEMORYSAFE

**Input:** An automaton  $\mathcal{D}$  inducing the regular safety objective  $W$  and an integer  $k \in \mathbb{N}$ .

**Question:** Does there exist a memory structure  $\mathcal{M}$  with at most  $k$  states which suffices to play optimally for  $W$ ?

Thanks to the reformulation, we get that MEMORYSAFE is in NP. We also showed NP-hardness thanks to a reduction from HAMILTONIANCYCLE.

## Theorem

MEMORYSAFE is NP-complete.

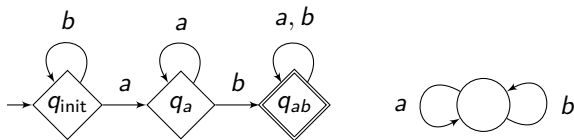
# Regular reachability

Let  $W$  be a regular **reachability** objective.

Memory structures still need to distinguish incomparable words.

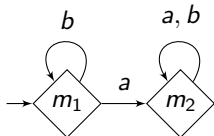
But not sufficient!

$W = b^*aa^*bC^\omega$ :



Main idea: seeing  $a$  is necessary and *makes progress*. However, we cannot just play  $a$  to win. Word  $a$  is an *insufficient progress*.

This memory structure distinguishes this insufficient progress.



# Condition necessary for reachability

Let  $W \subseteq C^\omega$  be an objective.

## Necessary property

Let  $\mathcal{M} = (M, m_{\text{init}}, \alpha_{\text{upd}})$  be a memory structure.

Memory structure  $\mathcal{M}$  **distinguishes insufficient progress** if for all  $w_1 \in C^*$  with  $m = \alpha_{\text{upd}}^*(m_{\text{init}}, w_1)$ , for all  $w_2 \in C^*$ , if  $w_1(w_2)^\omega \notin W$  and  $w_1 \prec w_1 w_2$ , then  $\alpha_{\text{upd}}^*(m, w_2) \neq m$ .

Necessary for  $\mathcal{M}$  to be optimal. Why?

*Blackboard proof.*



# Characterization: reachability

Let  $W$  be a **regular reachability objective**.

## Theorem

Memory structure  $\mathcal{M}$  suffices to win in all arenas if and only if  $\mathcal{M}$  *distinguishes incomparable words* and  $\mathcal{M}$  *distinguishes insufficient progress*.

## Remark

*Distinguishing insufficient progress* is necessary for all objectives, even for regular safety ones. . .

. . . but there is *no insufficient progress* for regular safety objectives!

# Computational complexity: reachability

## Decision problem

MEMORYREACH

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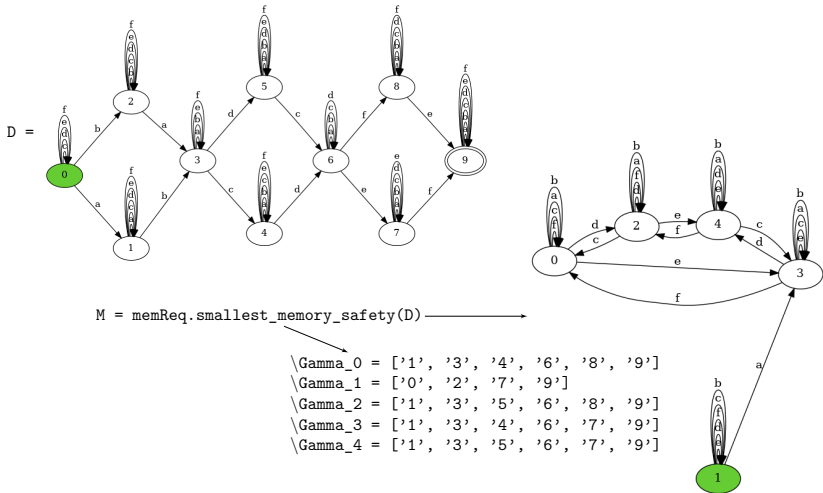
## Theorem

MEMORYREACH is NP-complete.

Needed to show that “ $\mathcal{M}$  distinguishes insufficient progress” is in NP, but the same hardness proof as for MEMORYSAFE.

# Implementation

We have implemented algorithms that automatically find minimal memory structures for regular objectives. **Simple ideas:** binary search on the minimal size, encoding properties as SAT instances and use of a SAT solver.



# Conclusion

## Summary

- Characterization of the memory structures for **regular objectives**.
- **NP-completeness** of finding small memory structures.
- Implementation using a SAT solver.

## Future work

- Two orthogonal directions are understood: *Muller conditions*<sup>8</sup> and *regular objectives*.<sup>9</sup>  
↪ What about objectives recognized by deterministic Muller automata, i.e.,  **$\omega$ -regular objectives**?
- Partial recent results for objectives recognized by **deterministic Büchi automata** and **memoryless strategies**.<sup>10</sup>

<sup>8</sup>Dziembowski, Jurdziński, and Walukiewicz, "How Much Memory is Needed to Win Infinite Games?", 1997.

<sup>9</sup>Bouyer, Fijalkow, et al., "How to Play Optimally for Regular Objectives?", 2022.

<sup>10</sup>Bouyer, Casares, et al., "Half-Positional Objectives Recognized by Deterministic Büchi Automata", 2022.