Strategy Complexity of Zero-Sum Games on Graphs

Pierre Vandenhove^{1,2}

Thesis supervized by Patricia Bouyer¹ and Mickael Randour²

¹Université Paris-Saclay, CNRS, ENS Paris-Saclay, LMF, France ²F.R.S.-FNRS & UMONS – Université de Mons, Belgium

March 14, 2023 - LMF Seminar



Context

- Present work part of my thesis.
- Thesis **supervised** by...





Mickael Randour. Université de Mons. Belgium



Patricia Bouyer, Université Paris-Saclay, LMF

Thesis defense in Mons at the end of April.

Strategy Complexity of Zero-Sum Games on Graphs

Problem: synthesis

- An (incomplete, *reactive*) system,
- living in an (uncontrollable) environment,
- with a purpose/**specification**.
- \rightsquigarrow Modeling through a zero-sum game.



Zero-sum turn-based games on graphs



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

- **Objective** of \mathcal{P}_1 is a set $W \subseteq C^{\omega}$.
- **Zero-sum**: objective of \mathcal{P}_2 is $C^{\omega} \setminus W$.

- A **strategy** of a player is a function $\sigma: E^* \to E$.
- A strategy σ of \mathcal{P}_1 is **winning for** W **from** $v \in V$ if all infinite paths from v consistent with σ induce an infinite word in W.

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 → infinite word w = babbc ... ∈ C^ω.
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Strategy complexity

- Given a game and an initial vertex ~> who can win?
- To decide it, exhibit a **winning strategy** of a player.
- Issues:
 - strategies $\sigma \colon E^* \to E$ may not have a finite representation;
 - there are infinitely many of them.

Strategy complexity

Given an **objective**, *when winning is possible*, understand if **simple** strategies suffice to win, or if **complex** strategies are required.

Desirable properties:

- winning strategies can use bounded information (finite representation!);
- computable bounds on this information (finite number of strategies!).

Simple strategies

Memoryless strategies

A strategy is **memoryless** if it makes decisions based only on the **current** arena vertex ($\sigma: V_i \rightarrow E$).

Finite-memory strategies

A strategy is **finite-memory** if it makes decisions based on the current arena vertex **and** the current state of a *memory structure* ($\sigma : V_i \times M \rightarrow E$).

Finite *memory structure* $\mathcal{M} = (M, m_{init} \in M, \alpha_{upd} : M \times C \to M)$. E.g., to remember whether *a* or *b* was last played:



Memoryless strategies use memory structure

 $\rightarrow \bigcirc C$.

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



→ Memoryless strategies do **not** suffice... but **two memory states** do!

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→ Memoryless strategies do **not** suffice... but **two memory states** do!

Finite-memory determinacy

Memoryless determinacy

An objective is memoryless-determined if in all arenas, memoryless strategies suffice for both players.

Finite-memory determinacy

An objective is finite-memory-determined if in all arenas, finite-memory strategies suffice for both players.

Various definitions depending on

- the class of arenas considered (finite, infinite, finitely branching...),
- whether we focus on **both** players or a **single** player.

Strategy Complexity of Zero-Sum Games on Graphs

State of the art: memoryless determinacy

Many "classical" objectives are **memoryless-determined**: reachability, Büchi, parity, energy, mean payoff, discounted sum...

Memoryless determinacy is well-understood:

- Sufficient conditions for both players,¹ for a single player.²
- **Characterizations** for **both** players over finite³/infinite⁴ arenas, for **a single** player over infinite arenas.⁵

¹Gimbert and Zielonka, "When Can You Play Positionally?", 2004; Aminof and Rubin, "First-cycle games", 2017.

²Kopczyński, "Half-Positional Determinacy of Infinite Games", 2006; Bianco et al., "Exploring the boundary of half-positionality", 2011.

³Gimbert and Zielonka, "Games Where You Can Play Optimally Without Any Memory", 2005.

⁴Colcombet and Niwiński, "On the positional determinacy of edge-labeled games", 2006.

⁵Ohlmann, "Characterizing Positionality in Games of Infinite Duration over Infinite Graphs", 2022.

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State of the art: finite-memory determinacy

- Finite-memory determinacy is understood for specific objectives,⁶ but few results of wide applicability.⁷
- Central class: ω -regular objectives. Examples with $C = \{a, b\}$:



Theorem^{8,9}

All ω -regular objectives are finite-memory-determined.

⁶Chatterjee, Randour, and Raskin, "Strategy synthesis for multi-dimensional quantitative objectives", 2014; Colcombet, Fijalkow, and Horn, "Playing Safe", 2014; Bouyer, Hofman, et al., "Bounding Average-Energy Games", 2017.

⁷Le Roux, Pauly, and Randour, "Extending Finite-Memory Determinacy by Boolean Combination of Winning Conditions", 2018; Bouyer, Le Roux, and Thomasset, "Finite-Memory Strategies in Two-Player Infinite Games", 2022.

⁸Büchi and Landweber, "Definability in the Monadic Second-Order Theory of Successor", 1969.

⁹Rabin, "Decidability of Second-Order Theories and Automata on Infinite Trees", 1969.

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Significance

Consequences of a fine-grained understanding of strategy complexity:

- **Decidability** of logical theories through FM det. (see *monadic second-order logic*, linked to ω-regular objectives).
- Practical synthesis problems through FM det. (see, e.g., LTL specifications¹⁰).
- At the core of algorithms to **solve** games (see, e.g., *parity games*¹¹).
- Controllers as **compact** as possible.

¹⁰Pnueli, "The Temporal Logic of Programs", 1977.

¹¹Zielonka, "Infinite Games on Finitely Coloured Graphs with Applications to Automata on Infinite Trees", 1998.

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Overview of our contributions

I. General conditions for finite-memory determinacy

- Arbitrary objectives
- Algebraic characterizations of the sufficiency of a memory structure for both players
- Theoretical tools to find memory structures
- Generalizations of memoryless determinacy results

- II. Precise memory requirements of classes of objectives
 - *ω*-regular objectives
 - Observation: memory requirements not settled
 - **1** *Regular* objectives (pprox DFAs)
 - Effective characterization of precise memory structures
 - (Computational) complexity
 - 2 Objectives recognizable by deterministic Büchi automata
 - Effective characterization of "no memory for P₁"
 - Complexity

I. General conditions for finite-memory determinacy

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- Arbitrary objectives
- Algebraic characterizations of the sufficiency of a memory structure for both players
- Theoretical tools to help find erminac memory structures
 - One-to-two-player lifts
 - 2 Memory structures → automata for the objectives
- Generalizations of memoryless determinacy results

One-to-two-player lift

One-to-two-player memoryless lift (finite arenas)¹²

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

- in all **one-player** arenas of \mathcal{P}_1 , \mathcal{P}_1 has memoryless winning strategies,
- in all **one-player** arenas of \mathcal{P}_2 , \mathcal{P}_2 has memoryless winning strategies,

then both players have memoryless winning strategies in two-player arenas.

Extremely useful in practice. Very easy to recover **memoryless** determinacy of, e.g., parity¹³ and mean-payoff¹⁴ games.

What about finite-memory determinacy?

¹²Gimbert and Zielonka, "Games Where You Can Play Optimally Without Any Memory", 2005.

¹³Emerson and Jutla, "Tree Automata, Mu-Calculus and Determinacy (Extended Abstract)", 1991.

¹⁴Ehrenfeucht and Mycielski, "Positional Strategies for Mean Payoff Games", 1979.

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• What about finite-memory determinacy?

- Counterexample to a one-to-two-player lift for FM determinacy (2).
- In the counterexample, **the size of the memory depends** on the size of the one-player **arenas**. **Motivates the restriction to**...

Arena-independent memory

An objective has arena-independent finite-memory winning strategies if

there exists a memory structure \mathcal{M} such that for all arenas \mathcal{A} ,

strategies using \mathcal{M} suffice to win in \mathcal{A} .

- Still holds for ω-regular objectives!
- Restriction over finite arenas, not so much over infinite arenas.
- One-to-two-player lift works!

One-to-two-player lifts

When does memory determinacy in two-player zero-sum games reduce to **one-player** memory determinacy?

Arenas $\$ Str. comp.	Memoryless	FM " $\exists \mathcal{M} \forall \mathcal{A}$ "	Mildly growing
Finite	[GZ05] ¹⁵	[BLORV22] ¹⁶	[Koz22] ¹⁷
Infinite	[CN06] ¹⁸	[BRV23] ¹⁹	
Finite stochastic	[GZ09] ²⁰	[BORV21] ²¹	

By-products of algebraic/language-theoretic characterizations.

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¹⁵Gimbert and Zielonka, "Games Where You Can Play Optimally Without Any Memory", 2005.

¹⁶Bouyer, Le Roux, Oualhadj, et al., "Games Where You Can Play Optimally with Arena-Independent Finite Memory", 2022.

¹⁷Kozachinskiy, "One-To-Two-Player Lifting for Mildly Growing Memory", 2022.

¹⁸For prefix-independent objectives; Colcombet and Niwiński, "On the positional determinacy of edge-labeled games", 2006.

¹⁹Bouyer, Randour, and Vandenhove, "Characterizing Omega-Regularity Through Finite-Memory Determinacy of Games on Infinite Graphs", 2023.

²⁰Gimbert and Zielonka, "Pure and Stationary Optimal Strategies in Perfect-Information Stochastic Games with Global Preferences", 2009.

²¹Bouyer, Oualhadj, et al., "Arena-Independent Finite-Memory Determinacy in Stochastic Games", 2021.

I. General conditions for finite-memory determinacy

- Arbitrary objectives
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• Theoretical tools to help find memory structures

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- Generalizations of memoryless determinacy results

Link with automaton representation

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

pprox Myhill-Nerode congruence

For $x, y \in C^*$, $x \sim_W y$ if for all $z \in C^{\omega}$, $xz \in W \iff yz \in W$.

I.e., x and y have the same winning continuations; as good as each other.

Properties

- If W is ω -regular, then \sim_W has finitely many equivalence classes.
- There is a DFA S_W "prefix classifier" associated with \sim_W .

Might not "recognize" the language (\neq languages of *finite* words)...

2 Two examples

... but we noticed a *decomposition* involving **prefix classifiers** and **memory structures**.

Let $C = \{a, b\}$. Objective **Prefix-classifier** S_W Sufficient memory $W = b^* a b^* a C^{\omega}$ а а W = "a and $b \infty$ ly often"

2 Main result

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

Theorem

If a finite memory structure ${\cal M}$ suffices to play optimally in $\ensuremath{\text{infinite}}$ arenas for both players, then

W is recognized by a *parity automaton* ($S_W \otimes M, p$).

 $\implies W$ is ω -regular!

Generalizes [CN06]²² (prefix-independent, memoryless case).

²²Colcombet and Niwiński, "On the positional determinacy of edge-labeled games", 2006.

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Corollary

Characterization

Let W be an objective.

W is **finite-memory-determined** over infinite arenas \iff W is ω -regular.

 \Leftarrow is well-known.^{23,24}

 \implies follows from the previous slide.

²³Büchi and Landweber, "Definability in the Monadic Second-Order Theory of Successor", 1969.

²⁴Rabin, "Decidability of Second-Order Theories and Automata on Infinite Trees", 1969.

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Part I: Summary

- Useful **notion** of *arena-independent* FM determinacy.
- General characterizations over finite and infinite arenas.
- Theoretical **tools** to determine memory requirements.
- Central place of ω-regular objectives.

Related publications

- Bouyer, Le Roux, Oualhadj, Randour, V. (CONCUR'20 & LMCS) "Games Where You Can Play Optimally with Arena-Independent Finite Memory"
- Bouyer, Randour, V. (STACS'22 & TheoretiCS) "Characterizing Omega-Regularity through Finite-Memory Determinacy of Games on Infinite Graphs"

Limits

Wide applicability, but...

- not fully effective;
- in general, no tight memory requirements for **each** player.

II. Precise memory requirements of classes of objectives

II. Precise memory requirements of classes of objectives ω-regular objectives • **Observation**: memory requirements not settled **1** *Regular* objectives (\approx DFAs) Effective characterization of of classes of objectives precise memory structures Existence of small structures is NP-complete 2 Objectives recognizable by deterministic Büchi automata Effective characterization of "no memory for \mathcal{P}_1 " Decidable in polynomial time

Regular objectives

Well-understood ω -regular objectives: *Muller conditions*, focusing on what is seen **infinitely often**.^{25,26} E.g., $b^*ab^*aC^{\omega}$ is not a Muller condition.

Missing pieces

Orthogonal quest: objectives where "finite prefixes matter".

We consider the "simplest" ones.

Regular objectives

- A regular reachability objective is a set LC^{ω} with $L \subseteq C^*$ regular.
- A regular safety objective is a set C^ω \ LC^ω.

Expressible as standard deterministic finite automata.

²⁵Gurevich and Harrington, "Trees, Automata, and Games", 1982.

²⁶Dziembowski, Jurdziński, and Walukiewicz, "How Much Memory is Needed to Win Infinite Games?", 1997.

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Memory requirements of regular objectives

Characterize the memory structures that suffice to make optimal decisions for regular objectives **in any arena**. Compute **minimal** ones.

Ideas

- A DFA recognizing the language, taken as a memory structure, always suffices for both players.
- But can be much smaller in general!
- Properties linked to the Myhill-Nerode congruence.

Comparing words

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

Comparing prefixes

For $x, y \in C^*$, $x \preceq_W y$ if for all $z \in C^{\omega}$, $xz \in W \Longrightarrow yz \in W$.

I.e., y has more winning continuations than x; better situation.

Example

Let W be the regular **reachability** objective induced by this DFA.



E.g., $\varepsilon \prec_W a$, $a \prec_W ab$, *a* and *b* are *incomparable* for \preceq_W .

Necessary condition for the memory

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

Lemma

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

if
$$x, y \in C^*$$
 are incomparable for \leq_W ,
then $\alpha^*_{upd}(m_{init}, x) \neq \alpha^*_{upd}(m_{init}, y)$.

Why? (Example) need to make the right decision in this arena.



Characterizations

Theorem

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

A memory structure \mathcal{M} suffices in all arenas for \mathcal{P}_1 if and only if \mathcal{M} distinguishes incomparable words.

Theorem

Let W be a regular reachability objective.

Memory structure \mathcal{M} suffices in all arenas for \mathcal{P}_1 if and only if

 \mathcal{M} distinguishes incomparable words **and** \mathcal{M} distinguishes insufficient progress.

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Computational complexity

Decision problems

Input: An automaton \mathcal{D} inducing the regular **reachability** (or **safety**) objective W and $k \in \mathbb{N}$. **Question**: \exists a memory structure \mathcal{M} with $\leq k$ states that suffices for W?

Thanks to the "effectiveness" of the two properties, we showed that:

Theorem

These problems are NP-complete.

Implementation

Algorithms that find minimal memory structures for regular objectives, using a **SAT solver**.



II. Precise memory requirements of classes of objectives ω-regular objectives **Observation**: memory requirements not settled **1** Regular objectives (\approx DFAs) Effective characterization of of classes of objectives precise memory structures Existence of small structures is NP-complete 2 Objectives recognizable by deterministic Bijchi automata Effective characterization of "no memory for \mathcal{P}_1 " Decidable in polynomial time

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2 Deterministic Büchi automata

A deterministic Büchi automaton \mathcal{B} on C

- reads **infinite** words (in C^{ω}),
- accepts words that see infinitely many Büchi transitions



 $\mathcal{L}(\mathcal{B}) = \{ w \in \{a, b\}^{\omega} \mid w \text{ sees } \infty \text{ly many } a \text{ and } \infty \text{ly many } b \}$

Question

Given \mathcal{B} , can \mathcal{P}_1 win without memory for objective $W = \mathcal{L}(\mathcal{B})$? (Is $\mathcal{L}(\mathcal{B})$ half-positional?)

Strategy Complexity of Zero-Sum Games on Graphs

2 Results

Let \mathcal{B} be a **deterministic Büchi automaton**.

Theorem

For objective $W = \mathcal{L}(\mathcal{B})$, \mathcal{P}_1 does not need memory **if and only if**

- all prefixes are comparable for \leq_W ,
- W is progress-consistent, and
- W is recognized by its prefix classifier as a DBA.



Polynomial-time algorithm

Can be **decided** in $\mathcal{O}(|\mathcal{B}|^4)$ time.

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Part II: Summary

- Tools to study memory req. of classes of ω -regular objectives.
- Effective characterizations for DFAs and DBAs.
- Decidability and complexity of the related decision problems.

Related publications

- Bouyer, Fijalkow, Randour, V. (Submitted preprint) "How to Play Optimally for Regular Objectives?"
- Bouyer, Casares, Randour, V. (CONCUR'22) "Half-Positional Objectives Recognized by Deterministic Büchi Automata"

Future works

- (*Part I*) General results for arena-*dependent* memory requirements.
 - Observing *edges* rather than colors in the model.
 - Well-behaved nondeterminism (*history-determinism*).²⁷
- (*Part II*) Automatically compute minimal memory structures for all ω-regular objectives?
- More expressive settings (e.g., stochastic, concurrent,²⁸ or timed games).
- More expressive **strategy models** than finite-state machines (e.g., pushdown²⁹ or register³⁰ automata).

Thanks!

²⁷Boker and Lehtinen, "When a Little Nondeterminism Goes a Long Way: An Introduction to History-Determinism", 2023.
²⁸Bordais, Bouyer, and Le Roux, "Optimal Strategies in Concurrent Reachability Games", 2022.

²⁹Walukiewicz, "Pushdown Processes: Games and Model-Checking", 2001.

³⁰Exibard et al., "Computability of Data-Word Transductions over Different Data Domains", 2022.

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