# Infinite Games 

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## Let's Play



You move at circles and want to reach $T$ from $S$.

## Motivation

■ Model-checking and satisfiability for fixed-point logics, e.g., the modal $\mu$-calculus, CTL, CTL*.
■ Automata emptiness often expressible in terms of games.
■ Semantics of alternating automata in terms of games.

- Synthesis of correct-by-construction controllers for reactive systems (non-terminating, interacting with antagonistic environment).


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Earliest appearance: Church's problem (1957)
Given requirement $\varphi$ on input-output behavior of boolean circuits, compute a circuit $C$ that satisfies $\varphi$ (or prove that none exists).



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## Earliest appearance: Church's problem (1957)

Given requirement $\varphi$ on input-output behavior of boolean circuits, compute a circuit $C$ that satisfies $\varphi$ (or prove that none exists).

Game theoretic formulation:

- Player 0 generates infinite stream of input bits.
- Player 1 has to answer each input bit by output bit.
- Player 1 wins, if combination of streams satisfies $\varphi$.


## Church's Problem: Example

$\varphi$ is conjunction of following properties:

1. Whenever the input bit is 1 , then the output bit is 1 , too.
2. If there are infinitely many 0 's in the input stream, then there are infinitely many 0 's in the output stream.
3. At least one out of every three consecutive output bits is a 1 .

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## Outline

## 1. Definitions

## 2. Reachability Games

3. Parity Games
4. Muller Games
5. Outlook

## Arenas and Games

- An arena $\mathcal{A}=\left(V, V_{0}, V_{1}, E\right)$ consists of

■ a finite set $V$ of vertices,
■ a set $V_{0} \subseteq V$ of vertices owned by Player 0 (circles),

- the set $V_{1}=V \backslash V_{0}$ of vertices owned by Player 1 (squares),
- a directed edge-relation $E \subseteq V \times V$.



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- a directed edge-relation $E \subseteq V \times V$.

- A play is an infinite path through $\mathcal{A}$.


## Strategies

■ A strategy for Player $i$ in $\mathcal{A}$ is a mapping $\sigma: V^{*} V_{i} \rightarrow V$ satisfying $\left(v_{n}, \sigma\left(v_{0} \cdots v_{n}\right)\right) \in E$ (only legal moves).

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- A play $v_{0} v_{1} v_{2} \cdots$ is consistent with $\sigma$, if $v_{n+1}=\sigma\left(v_{0} \cdots v_{n}\right)$ for every $n$ with $v_{n} \in V_{i}$.


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- Note: if we fix an initial vertex and strategies $\sigma$ and $\tau$ for Player 0 and Player 1, then there is a unique play that starts in $v$ and is consistent with $\sigma$ and $\tau$.


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Special types of strategies:
■ Positional strategies: $\sigma\left(v_{0} \cdots v_{n}\right)=\sigma\left(v_{n}\right)$ for all $v_{0} \cdots v_{n}$ : move only depends on position the token is at at the moment.

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■ Finite-state strategies: implemented by DFA with output reading play prefix $v_{0} \cdots v_{n}$ and outputting $\sigma\left(v_{0} \cdots v_{n}\right)$.

## Winning

- A game $\mathcal{G}=(\mathcal{A}$, Win $)$ consists of an arena $\mathcal{A}$ and a set Win $\subseteq V^{\omega}$ of winning plays for Player 0 .
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Player 0 wins from every vertex with positional strategies.

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- Strategy $\sigma$ for Player $i$ is winning strategy from $v$, if every play that starts in $v$ and is consistent with $\sigma$ is winning for him.
- Winning region $W_{i}(\mathcal{G})$ : set of vertices from which Player $i$ has a winning strategy.
- Always: $W_{0}(\mathcal{G}) \cap W_{1}(\mathcal{G})=\emptyset$.
- $\mathcal{G}$ determined, if $W_{0}(\mathcal{G}) \cup W_{1}(\mathcal{G})=V$.

■ Solving a game: determine the winning regions and winning strategies.

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There are many other winning conditions.

## What Are We Interested in?

Given a type of winning condition (e.g., reachability, parity, Muller),..

- .. are games with this condition always determined?

■ .. what kind of strategy do the players need (e.g., positional, finite-state)?
■ .. if finite-state strategies are necessary, how large do they have to be?

■ How hard is it to solve the game?

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## Attractor Construction

$\operatorname{Attr}_{i}^{\mathcal{A}}(R)=\bigcup_{n \in \mathbb{N}} A_{n}$ where $A_{0}=R$ and

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A_{j+1}= & A_{j} \cup\left\{v \in V_{i} \mid \exists\left(v, v^{\prime}\right) \in E \text { s.t. } v^{\prime} \in A_{j}\right\} \\
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Remark: Attractors can be computed in linear time in $|E|$.

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Applications:
■ Normal form for $\omega$-regular languages: deterministic parity automata.

- Model-checking game of the modal $\mu$-calculus.
- Emptiness of parity tree automata equivalent to parity games.
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Now $n>1$ and $\min \Omega(V)=0$.


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Induction hypothesis applicable..


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.. yields winning regions $W_{i}^{\prime}$ and positional strategies $\sigma^{\prime}, \tau^{\prime}$.


## Proof Sketch

$W_{1}^{\prime}$ empty:


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$W_{1}^{\prime}$ empty: Player 0 wins from everywhere.
Winning strategy: combine $\sigma^{\prime}$ and attractor strategy, play arbitrarily at $\Omega^{-1}(0)$.


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$W_{1}^{\prime}$ non-empty: Player 0 wins from $W_{0}^{\prime \prime}$ with $\sigma^{\prime \prime}$.

## $W_{0}^{\prime \prime}$




## Proof Sketch

$W_{1}^{\prime}$ non-empty: Player 1 wins from $W_{1}^{\prime \prime} \cup \operatorname{Attr}_{1}\left(W_{1}^{\prime}\right)$.
Winning strategy: combine $\tau^{\prime}, \tau^{\prime \prime}$, and attractor strategy.

## $W_{0}^{\prime \prime}$

MWMWMWMWMWN


## Algorithms for Parity Games

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- Intriguing complexity-theoretic status: in NP $\cap$ Co-NP (even in UP $\cap \mathrm{Co}-\mathrm{UP}$ and thus unlikely to be complete for NP or Co-NP).
■ Open problem: is solving parity games in polynomial time?


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## Latest Appearance Records

Need to estimate set of vertices in $\{A, B, C, D\}$ visited infinitely often during the play:

- Track order of last appearance of vertices in $\{A, B, C, D\}$

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4
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2

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| C | A B C D \# | A | A D B \# C |
| :---: | :---: | :---: | :---: |
| 4 |  | 3 |  |
| B | B A \# C D | C | C A B \# |
| 2 |  | 4 |  |
| D | D B A C \# | C | C \# A D B |

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| :---: | :---: | :---: | :---: | :---: | :---: |
| 4 |  | 3 |  | 2 |  |
| B | B A \# C D | C | C A D B \# | C | C A \# D B |
| 2 |  | 4 |  |  |  |
| D | D B A C \# | C | C \# A D B |  |  |
| 4 |  | 1 |  |  |  |

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| 4 |  | 3 |  | 2 |  |
| B | B A \# C D | C | C A D B \# | C | C A \# D B |
| 2 |  | 4 |  | 2 |  |
| D | D B A C \# | C | C \# A D B | A | A \# D D |
| 4 |  | 1 |  |  |  |

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| C | A B C D \# | A | A D B \# C | A | AC \# D B |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 4 |  | 3 |  | 2 |  |
| B | B A \# C D | C | C A D B \# | C | C A \# D B |
| 2 |  | 4 |  | 2 |  |
| D | D B A C \# | C | C \# A D B | A | A \# D B |
| 4 |  | 1 |  | 2 |  |

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| :---: | :---: | :---: | :---: | :---: | :---: |
| 4 |  | 3 |  | 2 |  |
| B | B A \# C D | C | C A D B \# | C | C A \# D B |
| 2 |  | 4 |  | 2 |  |
| D | D B A C \# | C | C \# A D B | A | A C \# D B |
| 4 |  | 1 |  | 2 |  |

- From some point onwards only vertices that are visited infinitely often are in front of $\#$, and
■ infinitely often exactly the set of vertices that are visited infinitely often is in front of \#.


## Muller Games

■ Bookkeeping works in general (use permutations over $V$ ).
■ Product of arena and LAR-structure can be turned into equivalent parity game from which finite-state strategies can be derived ("Muller games are reducible to parity games").

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Theorem
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## Theorem

Muller games are determined with finite-state strategies of size $n \cdot n$ !.

- Matching lower bounds via DJW ${ }_{n}$ games.
- Complexity depends on encoding of $\mathcal{F}$ :

■ P , if $\mathcal{F}$ is given as list of sets.

- NP $\cap \mathrm{Co}-\mathrm{NP}$, if $\mathcal{F}$ is encoded by a tree.
- PsPACE-complete, if $\mathcal{F}$ is encoded by circuit or boolean formula (with variables $V$ ).


## Outline

## 1. Definitions

## 2. Reachability Games

3. Parity Games
4. Muller Games

## 5. Outlook

## Concurrent Games

■ Both players choose their moves simultaneously Matching pennies:


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Matching pennies: randomized strategy winning with probability 1.


The "Snowball Game": for every $\varepsilon$, randomized strategy winning with probability $1-\varepsilon$.


## Games of Imperfect Information

■ Players do not observe sequence of states, but sequence of non-unique observations (yellow, purple, blue, brown).
■ Player 0 picks action ( $a$ or $b$ ), Player 1 resolves non-determinism.


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■ Player 0 picks action ( $a$ or b), Player 1 resolves non-determinism.


No winning strategy for Player 0: every fixed choice of actions to pick at $(\bigcirc \bigcirc)^{*}(\bigcirc)$ can be countered by going to $v_{1}$ or $v_{2}$.

## (Simple) Stochastic Games

■ Enter a new player $(\diamond)$, it flips a coin to pick a successor.


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More formally: Value of the game

$$
\max _{\sigma} \min _{\tau} p_{\sigma, \tau}
$$

where $p_{\sigma, \tau}$ is the probability that Player 0 wins when using strategy $\sigma$ and Player 1 uses strategy $\tau$.

## Pushdown Games

Use configuration graphs of pushdown machines as arena (in general infinite).


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- Positional determinacy still holds, but positional strategies are infinite objects!
■ Solution: winning strategies implemented by pushdown machines with output.


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- Player 1 wins example from everywhere (stay at 2 longer and longer).


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And: any combination of extensions discussed above.

## Literature

■ Lecture notes "Infinite Games" (hidden in the Teaching section)
www.react.uni-saarland.de/teaching/infinite-games-13-14
■ Lectures in Game Theory for Computer Scientists. Krzysztof Apt and Erich Grädel (Eds.), Cambridge University Press, 2011.

■ Automata, Logics, and Infinite Games. Erich Grädel, Wolfgang Thomas, and Thomas Wilke (Eds.), LNCS 2500, Springer-Verlag, 2002.

