

On algorithmic aspects of infinite games played on weighted graphs

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UMONS Belgium

MPS 2016

1 Topic

2 Qualitative two-player zero-sum games

3 Quantitative two-player zero-sum games

4 Multidimensional two-player zero-sum games

5 Multiplayer non zero-sum games

6 Conclusion

This talk

- Focus on **algorithmic game theory** for the **synthesis** of correct computer systems

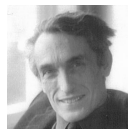
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- Focus on **algorithmic game theory** for the **synthesis** of correct computer systems
- Some **classical** results and recent **UMONS** results



This talk

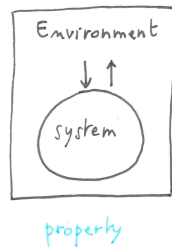
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Algorithmic game theory

Reactive system

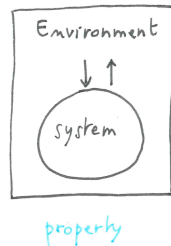
- **System** embedded into an uncontrollable **environment**
- It must satisfy some **property** against **any** behavior of the environment
- How to automatically design a correct **controller** for the system?



Algorithmic game theory

Reactive system

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Example

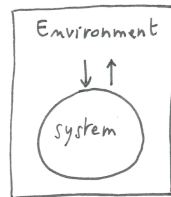
- System: airplane
and environment: weather
- The airplane must land safely in any weather conditions
- How to design a correct autopilot?



Algorithmic game theory

Reactive system

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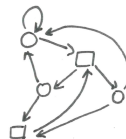


property

Modelization

- **Two-player zero-sum game** played on a finite directed **graph**
- Property = **objective** for the system
- Synthesis of a controller = construction of a **winning strategy**

game played
on a graph



objective

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Basic model

Basic model

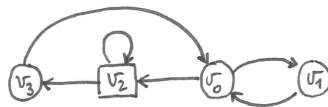
Definition

Two-player zero-sum game $G = (V, V_1, V_2, E, v_0)$:

- (V, E) finite directed graph (with no deadlock)
- (V_1, V_2) partition of V with V_p controlled by player $p \in \{1, 2\}$
- initial vertex v_0

Paths

- **Play**: infinite path from v_0
 $\rho = \rho_0 \rho_1 \dots \in V^\omega$ in G
- **History**: prefix h of a play
- **Unravelling** of G : infinite tree of all paths from v_0



Player 1 ○, Player 2 □

Basic model

Objective: set $\Omega \subseteq V^\omega$ of plays

Zero-sum game:

- objective Ω for player 1
- opposite objective $V^\omega \setminus \Omega$ for player 2

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Given a set $U \subseteq V$, classical **qualitative** objectives are:

- **Reachability** objective: visit a vertex of U at least once
- **Büchi** objective: visit a vertex of U infinitely often

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- **opposite** objective $V^\omega \setminus \Omega$ for player 2

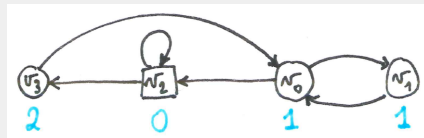
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Given a coloring $c : V \rightarrow \{0, 1, \dots, C\}$

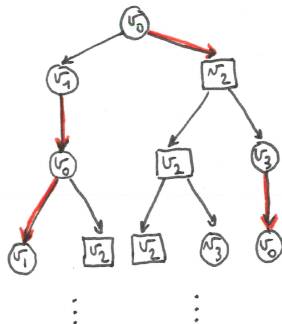
- **Parity** objective: the maximum color seen infinitely often is even



Strategies

Strategy for player p :

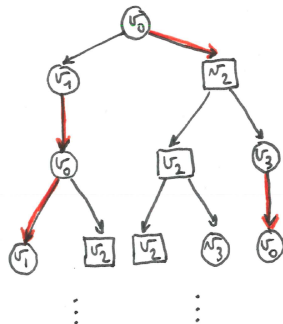
function $\sigma : V^* V_p \rightarrow V$ such that
 $\sigma(hv) = v'$ with $(v, v') \in E$



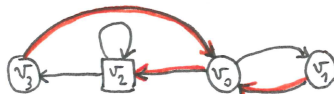
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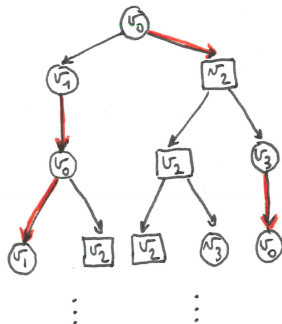
Memoryless: when $\sigma(hv) = \sigma(v)$



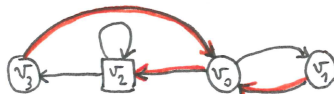
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Finite-memory: when σ is recorded by a finite automaton

Strategies

Winning strategy for player p : ensure his objective against any strategy of the other player

A game is **determined** from initial vertex v_0 when

- either player 1 is winning for Ω from v_0
- or player 2 is winning for $V^\omega \setminus \Omega$ from v_0

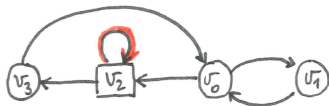
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Example



- Objective of player 1: **visit v_3**
- Player 1 is (trivially) winning from v_3
- Player 2 is winning from v_0 , v_1 , and v_2
Memoryless strategy: looping on v_2

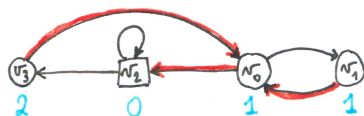
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Another example



Parity game: Player 1 is winning from every vertex with a memoryless strategy

- Either player 2 eventually stays at v_2
 $\rightarrow$ max color seen infinitely often = 0
- Or he infinitely often visits v_3
 $\rightarrow$ max color seen infinitely often = 2

Martin's theorem

Theorem [Mar75]

Every game with **Borel** objectives is determined

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Every game with **Borel** objectives is determined

- Need of the **axiom of choice** to exhibit a non-determined game
- **No** information about the winning strategies

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Every game with **ω -regular** objectives is determined

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Corollary

Every game with **ω -regular** objectives is determined

Algorithmic questions

- **Who** is the winner from initial vertex v_0 ?
- **Complexity** class of this decision problem?
- Can we **construct** a winning strategy for the winner?
- **What kind** of winning strategy? Memoryless, finite-memory?

Algorithmic results for one-player games

Classical question in automata theory: **Player 1 wins** iff there exists a play satisfying the objective

- **Reachability** objective: emptiness of automata on finite words
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- reachable **simple** cycle for **memoryless** strategies

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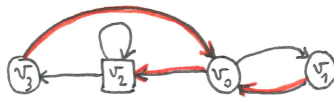
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Remark: Given a **two-player** game G , by fixing a strategy σ for player p , we get a **one-player** (infinite/finite) game G_σ



Algorithmic results for two-player games

[Bee80, Imm81, EJ91], see also [Zie98, GTW02]

	Reach	Büchi	Parity
Complexity	P-complete		$\text{NP} \cap \text{co-NP}$
Player 1 strategy	memoryless		
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- Remember the previous examples
- More information on the proofs in the next slides

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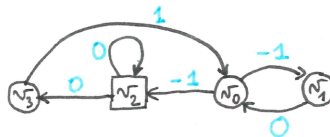
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Major open problem: can we solve Parity games in P?

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Basic model

Extension with **weights** on the edges



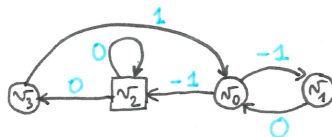
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Two-player zero-sum game $G = (V, V_1, V_2, E, v_0, w)$ as before, with:

- $w : E \rightarrow \mathbb{Z}$ weight function

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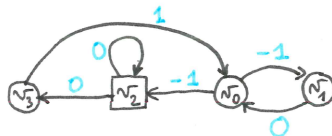
- $w : E \rightarrow \mathbb{Z}$ weight function

Classical **payoff** $f(\rho)$ of a play $\rho = \rho_0 \rho_1 \rho_2 \dots$:

- $\text{Inf}(\rho) = \inf_{n \in \mathbb{N}} w(\rho_n, \rho_{n+1})$
- $\text{LimInf}(\rho) = \liminf_{n \rightarrow \infty} w(\rho_n, \rho_{n+1})$
- Total-payoff $\text{TP}(\rho) = \liminf_{n \rightarrow \infty} \sum_{k=0}^{n-1} w(\rho_k, \rho_{k+1})$
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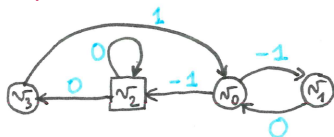
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Similar definitions with $\text{Sup}(\rho)$, $\text{LimSup}(\rho)$, $\overline{\text{TP}}(\rho)$, $\overline{\text{MP}}(\rho)$

Quantitative objectives

Example



play $\rho = (v_0 v_1)^\omega$

$$\blacksquare \quad \underline{\text{TP}}(\rho) = \liminf_{n \rightarrow \infty} \sum_{k=0}^{n-1} w(\rho_k, \rho_{k+1})$$

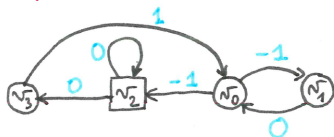
$$(-1, -1, -2, -2, -3, -3, \dots, -n, -n, \dots) \rightarrow -\infty = \underline{\text{TP}}(\rho) = \overline{\text{TP}}(\rho)$$

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$$\left(\frac{-1}{1}, \frac{-1}{2}, \frac{-2}{3}, \frac{-2}{4}, \frac{-3}{5}, \frac{-3}{6}, \dots, \frac{-n}{2n-1}, \frac{-n}{2n}, \dots\right) \rightarrow -\frac{1}{2} = \underline{\text{MP}}(\rho) = \overline{\text{MP}}(\rho)$$

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Lemma: If **eventually periodic** $\rho = hg^\omega$,
then $\underline{\text{MP}}(\rho) = \overline{\text{MP}}(\rho) = \text{mean payoff of the cycle } g$

Quantitative objectives

Definition

Classical **quantitative** objectives are, given a **threshold** $\nu \in \mathbb{Q}$:

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- Similarly for the other payoff functions **LimInf**, **TP**, ...

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Corollary of Martin's Theorem

Games with **such quantitative objectives** are determined

- **Inf**, **LimInf**: ω -regular
- **TP**, **MP**: not ω -regular, but Borel

Algorithmic results for two-player games

[EM79, ZP96, BSV04]

	Reach	Büchi	Parity	<u>TP</u> , $\overline{\text{TP}}$	<u>MP</u> , $\overline{\text{MP}}$
Complexity	P-complete		NP $\cap$ co-NP		
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Reductions:

- Parity games $\rightarrow$ Mean-payoff games [Jur98]
- Total-payoff games $\leftrightarrow$ Mean-payoff games

Major open problem: can we solve Parity, Mean-payoff and Total-payoff games in P?

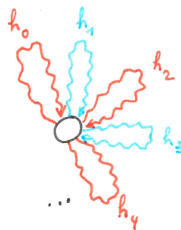
Algorithmic results

Theorem [GZ04]

Let G be a weighted game. If the payoff function f is **fairly mixing**, i.e.:

- 1 $f(\rho) \leq f(\rho') \Rightarrow f(h\rho) \leq f(h\rho')$
- 2 $\min\{f(\rho), f(h^\omega)\} \leq f(h\rho) \leq \max\{f(\rho), f(h^\omega)\}$
- 3 $\min\{f(h_0 h_2 h_4 \dots), f(h_1 h_3 h_5 \dots), \inf_i f(h_i^\omega)\} \leq f(h_0 h_1 h_2 h_3 \dots) \leq \max\{f(h_0 h_2 h_4 \dots), f(h_1 h_3 h_5 \dots), \sup_i f(h_i^\omega)\}$

then both players have **memoryless** (optimal) winning strategies



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- **Many applications:** Parity, Inf, LimInf, Mean-payoff, Total-payoff, ...
- If the payoff function is **prefix-independent**, i.e. $f(\rho) = f(h\rho)$, then conditions 1. and 2. are satisfied
- **Simple proof** by induction on the number of edges

Algorithmic results

Parity games in $\text{NP} \cap \text{co-NP}$

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Parity games in $\text{NP} \cap \text{co-NP}$

- in NP:

- **Guess** a memoryless winning strategy σ player 1
- In the one-player game G_σ , check in **polynomial time** whether there exists a reachable cycle with odd maximum color

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Mean-payoff games in $\text{NP} \cap \text{co-NP}$

- Same approach
- One can compute in polynomial time the minimum (resp. maximum) mean weight cycle in a weighted graph [Kar78]

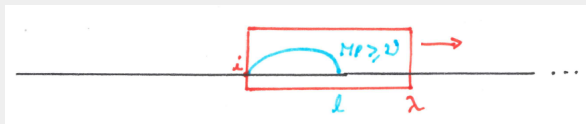
Window games

Objective to satisfy inside a finite **window sliding along the play** [CHH09], [CDRR15, BHRR16]

Definition

Given a **window size** λ and a threshold ν

- **WMP** objective: ensure for all positions i of the window, $\frac{1}{\ell} \sum_{k=0}^{\ell-1} w(\rho_{i+k}, \rho_{i+k+1}) \geq \nu$ for some $\ell \leq \lambda$



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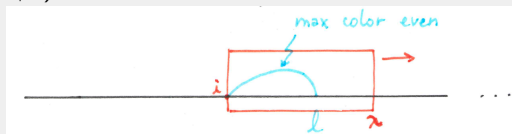
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Given a **window size** λ and a coloring c

- **WParity** objective: ensure for all positions i of the window, $\max_{0 \leq k \leq \ell} c(\rho_{i+k})$ even for some $\ell \leq \lambda$



Window games

Motivations

- **Strengthening** of the Mean-payoff and Parity objectives
Guarantee within a bounded time, not in the limit
- More **computationally** tractable
(Open problem: Mean-payoff and Parity games are in P?)

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Remark: ω -regular objectives, thus determined games

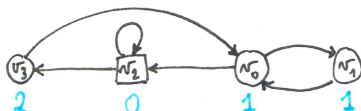
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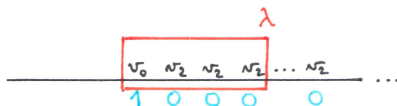
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Guarantee within a bounded time, not in the limit
- More computationally tractable
(Open problem: Mean-payoff and Parity games are in P?)

Remark: ω -regular objectives, thus determined games

Example



- Player 1 winning for Parity
- but loosing for WParity for all window sizes λ



Window games

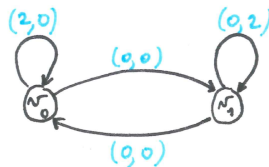
Results

	$\underline{\text{MP}}, \overline{\text{MP}}$	Parity	WMP	WParity
Complexity	$\text{NP} \cap \text{co-NP}$		P-complete polynomial windows	P-complete
Player 1 strategy	memoryless		finite-memory	
Player 2 strategy	memoryless		finite-memory	

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Extension to k -dimensional weighted games with $k \geq 2$



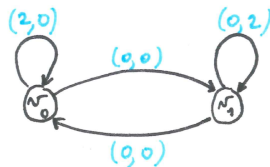
Definition

Two-player zero-sum game $G = (V, V_1, V_2, E, v_0, w)$ as before except:

- $w : E \rightarrow \mathbb{Z}^k$ weight function

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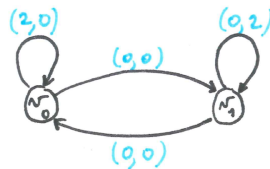
Definition

Quantitative objective Ω :

- Intersection $\cap_{\ell=1}^k \Omega_\ell$ such that Ω_ℓ is an objective for dimension ℓ
- More generally, Boolean combination of such objectives Ω_ℓ , $1 \leq \ell \leq k$

Example

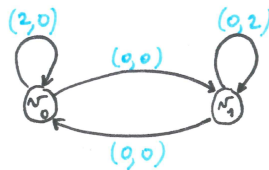
- One-player game
- $k = 2$, $\Omega = \Omega_1 \cap \Omega_2$
 with $\Omega_1 = \underline{\text{MP}}(\rho) \geq 1$ for dimension 1
 and $\Omega_2 = \underline{\text{MP}}(\rho) \geq 1$ for dimension 2



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 and $\Omega_2 = \underline{\text{MP}}(\rho) \geq 1$ for dimension 2
- Player 1 is **losing** with **finite-memory** strategies
 - Eventually periodic play $\rho = hg^\omega$
 - Mean-payoff of cycle g equal to

$$a \cdot (2, 0) + b \cdot (0, 0) + c \cdot (0, 2) = (2 \cdot a, 2 \cdot c) \not\geq (1, 1)$$
 with $a + b + c = 1$ and $b > 0$



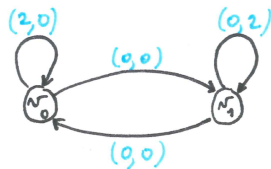
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- Player 1 is **winning** with **infinite-memory** strategies

- Alternate visits to v_0 and v_1

- At alternation n , loop n times on v_0 and then loop n times on v_1

$$a_n \cdot (2, 0) + \epsilon_n \cdot (0, 0) + a_n \cdot (0, 2)$$

with $\epsilon_n \rightarrow 0$ and $a_n \rightarrow \frac{1}{2}$

- Mean-payoff equal to $(1, 1)$

Results with the same objective on all dimensions

[CDHR10],[CRR14, CDRR15]

	<u>TP</u> , <u>TP</u>	<u>MP</u>	<u>MP</u>
Complexity	Undecidable	$\text{NP} \cap \text{co-NP}$	coNP-complete
Player 1 strategy	-	infinite-memory	
Player 2 strategy	-	memoryless	

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[CDRR15, BHRR16]

	WMP	WParity
Complexity	Exptime-complete	
Player 1 strategy	finite-memory	
Player 2 strategy	finite-memory	

Results with heterogeneous objectives

Only preliminary results

Theorem

- [Vel15]: Undecidability for Boolean combinations of $\underline{\text{MP}}$ and $\overline{\text{MP}}$ objectives
- [BHR15]: Decidability for Boolean combinations of WMP, Inf, Sup, LimInf, LimSup objectives, and finite-memory winning strategies for both players

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Definition

n -player non zero-sum game $G = (V, (V_p)_{p \in \Pi}, E, v_0, \bar{w})$:

- Set Π of n players, $n \geq 1$
- $(V_p)_{p \in \Pi}$ partition of V with V_p controlled by player $p \in \Pi$
- optional: $\bar{w} = (w_p)_{p \in \Pi} : E \rightarrow \mathbb{Z}^n$ such that
 - w_p is the weight function of player p
 - leading to his payoff function f_p

Model

Definition

Objective Ω_p for each player $p \in \Pi$

- qualitative
- quantitative (depending on f_p)

Strategy profile $\bar{\sigma} = (\sigma_p)_{p \in \Pi}$ and outcome $\rho = \langle \bar{\sigma} \rangle_{v_0}$ from initial vertex v_0 .

Model

Definition

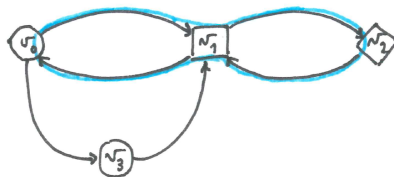
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Example

- 3-player game (player 1 $\bigcirc$, player 2 $\square$, player 3 $\diamond$)
- Each player wants to visit one of his vertices infinitely often
- Outcome $(v_0 v_1 v_2 v_1)^\omega$: good solution for each player that needs cooperation



Nash equilibria (NE)

Classical notion such that each player is

- **rational** (he wants to maximize his payoff)
- **selfish** (he is only concerned with his own payoff)

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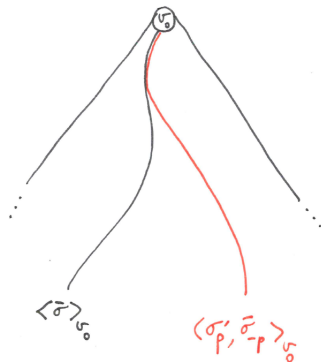
Informally, $\bar{\sigma}$ is an NE if no player has an incentive to deviate from his strategy, if the other players stick to their own strategies

Definition [Nas50]

The strategy profile $\bar{\sigma}$ is a **Nash equilibrium** from v_0 if, for each player $p \in \Pi$, for each strategy σ'_p of p ,

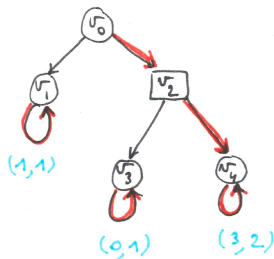
$$f_p(\langle \sigma'_p, \bar{\sigma}_{-p} \rangle_{v_0}) \leq f_p(\langle \bar{\sigma} \rangle_{v_0}).$$

Notation: $\bar{\sigma}_{-p} = (\sigma_i)_{i \in \Pi \setminus \{p\}}$.



Nash equilibria

Example of NE: outcome $v_0 v_2 v_4^\omega$ with payoff $(3, 2)$

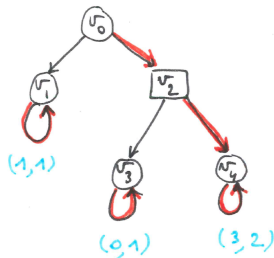


No incentive to deviate:

- If player 1 deviates to v_1 , he will get 1 instead of 3
- If player 2 deviates to v_3 , he will get 1 instead of 2

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Algorithmic questions

- Does there **exist** an NE from initial vertex v_0 ?
- Can we **construct** it?
- With **what kind** of strategies? Memoryless, finite-memory?

Some results

Theorem

Qualitative objectives

- [GU08]: Existence of an NE in case of Borel objectives

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Quantitative objectives

- [Kuh53]: **Construction** of an NE for games played on a **finite tree**
- [FL83, Har85]: Existence of an NE if the payoff function f_p of each player p is **bounded** and **continuous**

Some results

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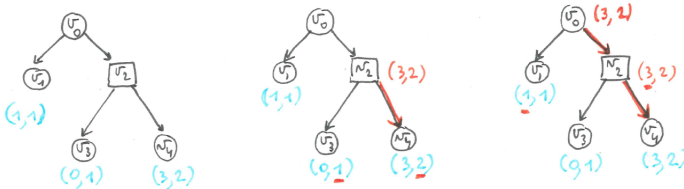
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Proof of [Kuh53]: Backward induction from the leaves to the root



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Proof of [FL83, Har85]:

- On the unravelling of the game G truncated at depth d , construction of an NE $\bar{\sigma}^d$ by [Kuh53]
- A subsequence of $(\bar{\sigma}^d)_{d \in \mathbb{N}}$ converges to a strategy profile $\bar{\sigma}^*$ that is proved to be an NE

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Remark: The LimInf, LimSup and MP payoff functions are **not continuous**

For example, $\rho^n = v_0^n v_1^\omega \rightarrow \rho = v_0^\omega$ and

$$\lim_{n \rightarrow \infty} \text{LimInf}(\rho^n) = 1 \neq 0 = \text{LimInf}(\rho)$$



Some results

Theorem [BDS13]

Constuction of a finite-memory NE in the game G if for all p

- the payoff function f_p satisfies: $f_p(\rho) \leq f_p(\rho') \Rightarrow f_p(h\rho) \leq f_p(h\rho')$
- the two-player zero-sum game G^p
 - where player 1 is p and player 2 is the coalition of the other players
 - is determined with memoryless optimal winning strategies for both players

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Proof:

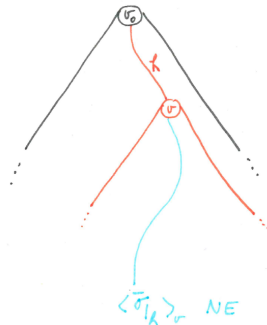
- Let σ_p (resp. σ_{-p}) be an optimal winning strategy of player p (resp. the coalition) in G^p
- Construct the profile $\bar{\sigma}$:
 - play as σ_p for each player p
(p plays selfishly and optimally for his own objective)
 - and as soon as some player p deviates, punish p by playing σ_{-p}
(the coalition plays against p 's objective)

Other kinds of equilibria

Subgame perfect equilibrium (SPE)

[Sel65]

- takes into account the sequential nature of games played on graphs
- i.e., is an NE from the initial vertex v_0 , but also **after every history** h of the game

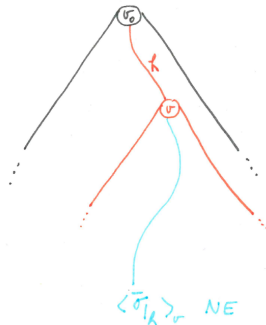


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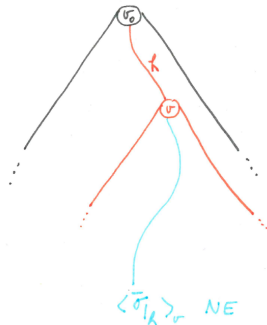
- Previous results [Kuh53] and [FL83, Har85] provide NE and more generally **SPE**

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- Previous results [Kuh53] and [FL83, Har85] provide NE and more generally **SPE**
- [BBMR15]: Construction of a **finite-memory** SPE for **quantitative reachability** games

Other kinds of equilibria

Secure equilibrium (SE) [CHJ06]

- each player wants to maximize his payoff, as a **first** objective
- and then minimize the payoff of the other players, as a **second** objective

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Theorem

- [CHJ06]: Existence of an SE for **2-player** games with **Borel qualitative objectives**
- [DFK⁺14]: Existence of an SE
 - if the payoff function f_p of each player p is **bounded** and **continuous**
 - or if each f_p is **Borel measurable** and have **finite range**
- [BMR14]: Previous result [BDS13] extended to **SE** for **2-player** games

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Thank you!



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