### The Multiple Dimensions of Mean-Payoff Games

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RP 2017

#### About

Basics about mean-payoff games

- Algorithms & Complexity
- Strategy complexity Memory

Focus

- Equivalent game forms
- Techniques for memoryless proofs

















Switching policy to get average power (1,1)?



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$$\frac{n \cdot (2,0) + n \cdot (0,2) + 2 \cdot (0,0)}{2n+2} = \frac{(2n,2n)}{2n+2} \to (1,1)$$



weight 
$$: Q \to \mathbb{Z}^d$$

Mean-payoff value = limit-average of the visited weights

$$\mathsf{MP}(q_0q_1\dots) = \lim_{n \to \infty} \frac{1}{n} \cdot \sum_{i=0}^{n-1} \mathsf{weight}_k(q_i)$$
$$1 \le k \le d$$



weight 
$$: Q \to \mathbb{Z}^d$$

Switching policy

• Infinite memory: (1,1) vanishing frequency in  $q_0$ 



$$\mathsf{MP} = \lim_{n \to \infty} \frac{1}{n} \cdot \sum_{i=0}^{n-1} \mathsf{weight}_k(q_i)$$

limit?





Mean-payoff is prefix-independent



Switching policy

• Infinite memory: (1,1) for liminf





Switching policy

• Infinite memory: (1,1) for liminf & (2,2) for limsup







$$G = (Q, E)$$
$$\begin{cases} Q = Q_{\circ} \cup Q_{\Box} \\ E \subseteq Q \times Q \end{cases}$$



Player 1 (maximizer)

Player 2 (minimizer)

- Turn-based
- Infinite duration

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**Strategies** = recipe to extend the play prefix

Player 1: 
$$\sigma : Q^* \cdot Q_0 \to Q$$

Player 2:  $\pi: Q^* \cdot Q_{\Box} \to Q$ 



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**Strategies** = recipe to extend the play prefix

Player 1: 
$$\sigma : Q^* \cdot Q_\circ \to Q$$
  
Player 2:  $\pi : Q^* \cdot Q_\Box \to Q$ 

outcome of two strategies is a play



# Mean-payoff games



Mean-payoff game: positive and negative weights (encoded in binary)  $\mathrm{w}: E \to \mathbb{Z}$ 

Decision problem:

Decide if there exists a player-1 strategy to ensure mean-payoff value  $\geq 0$ 

$$\exists \sigma \cdot orall \pi : \mathsf{MP}(\mathsf{outcome}_q^{\sigma,\pi}) \geq 0$$

Value problem:

$$\sup_{\sigma} \inf_{\pi} \mathsf{MP}(\mathsf{outcome}_q^{\sigma,\pi})$$

# Mean-payoff games



Key ingredients:

- identify memory requirement: infinite vs. finite vs. memoryless
- solve 1-player games (i.e., graphs)

Key arguments for memoryless proof:

- backward induction
- shuffle of plays
- nested memoryless objectives

#### **Reduction to Reachability Games**



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If player 1 wins  $\rightarrow$  only positive cycles are formed  $\rightarrow$  mean-payoff value  $\geq 0$ 

If player 2 wins  $\rightarrow$  only negative cycles are formed  $\rightarrow$  mean-payoff value < 0 (Note: limsup vs. liminf does not matter)

## **Reduction to Reachability Games**



Mean-payoff game ⇔ Ensuring positive cycles

Memoryless strategy transfers to finite-memory mean-payoff winning strategy







Progress measure: minimum initial credit to stay always positive



Progress measure: minimum initial credit to stay always positive





Memoryless mean-payoff winning strategy ?

Progress measure: minimum initial credit to stay always positive



Memoryless mean-payoff  
winning strategy ?Choose successor to stay above minimum credit
$$\mu: Q \to \mathbb{N}$$
 minimum credit such that $\exists \sigma \cdot \forall \pi \cdot \forall n : \mu(q_0) + \sum_{i=0}^{n} w(q_i, q_{i+1}) \ge 0$ 

Progress measure: minimum initial credit to stay always positive

In  $q \in Q_{\circ}$  choose q' such that  $\mu(q) + w(q,q') \ge \mu(q')$ 



Progress measure: minimum initial credit to stay always positive

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## Memoryless proofs

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## **Energy Games**





Energy: min-value of the prefix. (if positive cycle; otherwise  $\infty$ )

Mean-payoff: average-value of the cycle.

 $\mu = -\min_{n \in \mathbb{N}} \sum_{i=0}^{n-1} \mathsf{w}_i$ 

$$\mathsf{MP} = \lim_{n \to \infty} \frac{1}{n} \cdot \sum_{i=0}^{n-1} \mathsf{w}_i$$





### **Energy Games**



Winning strategy ?

## **Energy Games**



Winning strategy ?

Follow the minimum initial credit !





Multiple resources  $w: Q \to \mathbb{Z}^d$ 

- Energy: initial credit to stay always above (0,0)
- Mean-payoff:  $MP(w_1) \ge 0 \land MP(w_2) \ge 0$



Multiple resources  $w: Q \to \mathbb{Z}^d$ 

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```
same ?
same as positive
cycles ?
```



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- Energy: initial credit to stay always above (0,0)
- Mean-payoff:  $MP(w_1) \ge 0 \land MP(w_2) \ge 0$

```
same ?
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```

If player 1 can ensure positive simple cycles, then energy and mean-payoff are satisfied.

Not the converse !

If player 1 has initial credit to stay always positive (Energy) then finite-memory strategies are sufficient

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wqo + Koenig's lemma

If player 1 has initial credit to stay always positive (Energy) then finite-memory strategies are sufficient

For player 2 ?

For player 2, memoryless strategies are sufficient

- induction on player-2 states
- if ∃ initial credit against all memoryless strategies, then ∃ initial credit against all arbitrary strategies.





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## Memoryless proofs

Key arguments for memoryless proof:

- backward induction
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If player 1 has initial credit to stay always positive (Energy) then finite-memory strategies are sufficient

For player 2, memoryless strategies are sufficient coNP ?

not necessarily

simple cycle!

If player 1 has initial credit to stay always positive (Energy) then finite-memory strategies are sufficient

For player 2, memoryless strategies are sufficient coNP ?

- guess a memoryless strategy п for Player 2
- Construct  $G_{n}$
- check in polynomial time that  $G_{\mbox{\tiny n}}$  contains no cycle with nonnegative effect in all dimensions

Detection of nonnegative cycles  $\Rightarrow$  polynomial-time

- Flow constraints using LP
- Divide and conquer algorithm



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Mark the edges that belong to some (pseudo) solution.

Solve the connected subgraphs.



Detection of nonnegative cycles  $\Rightarrow$  polynomial-time

- Flow constraints using LP
- Divide and conquer algorithm

Mark the edges that belong to some (pseudo) solution.

Solve the connected subgraphs.



If player 1 has initial credit to stay always positive (Energy) then finite-memory strategies are sufficient

For player 2, memoryless strategies are sufficient

Equivalent with mean-payoff games (under finite-memory):

If player 1 wins  $\rightarrow$  positive cycles are formed  $\rightarrow$  mean-payoff value  $\geq 0$ Otherwise, for all finite-memory strategy of player 1 (with memory M), player 2 can repeat a negative cycle (in G x M)

Player 1	Energy	<u>MP</u> - liminf	MP - limsup
Finite memory	PI	coNP-complete ayer 2 memoryless	
Infinite memory			

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Finite memory	coNP-complete Player 2 memoryless		
Infinite memory		coNP-complete Pl. 2 memoryless	

Player 2 memoryless (shuffle argument)

• Graph problem in PTIME (LP argument)

 $\min(\mathsf{MP}(\rho_L),\mathsf{MP}(\rho_R)) \le \mathsf{MP}(\operatorname{shuffle}(\rho_L,\rho_R)) \quad \begin{cases} \bullet \text{ True for } \underline{\mathsf{MP}} \\ \bullet \text{ False for } \overline{\mathsf{MP}} \end{cases}$
# Multi-mean-payoff games

The winning region R of player 1 has the following characterization:

Player 1 wins  $\bigwedge_{i} \overline{MP}(w_{i}) \geq 0$  from every state in R if and only if player 1 wins each  $\overline{MP}(w_{i}) \geq 0$  from every state in R Proof idea:  $\Box \Diamond (1 \land 2) \equiv \Box \Diamond 1 \land \Box \Diamond 2$  (without leaving R)

# Multi-mean-payoff games

The winning region R of player 1 has the following characterization:



# Memoryless proofs

Key arguments for memoryless proof:

- backward induction
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## Multi-dimension games

Player 1	Energy	MP - liminf	MP - limsup
Finite memory	coNP-complete Player 2 memoryless		
Infinite memory		coNP-complete Pl. 2 memoryless	NP $\cap$ coNP Pl. 2 memoryless



Issues with mean-payoff

• limsup vs. liminf



- limit-behaviour, unbounded delay
- complexity



0

Issues with mean-payoff

- limsup vs. liminf
- limit-behaviour, unbounded delay
- complexity

unbounded window



Sliding window of size at most B At every step,  $MP \ge 0$  within the window

Window objective:

from some point on, at every step,  $MP \ge 0$  within window of B steps

prefix-independent

Implies the mean-payoff condition

bounded delay

Window objective:

from some point on, at every step, MP  $\geq$  0 within window of B steps

prefix-independent

Implies the mean-payoff condition

Complexity, Algorithm ?

• like coBüchi objective  $\Diamond \Box(\Sigma^{\leq B} \geq 0)$   $O(V^2 \cdot E \cdot B \cdot \log W)$ 

```
min-max cost (for \leq B steps)
```

bounded delay

```
stable set (safety)
```

attractor & subgame iteration

Window objective:

from some point on, at every step, MP  $\geq$  0 within window of B steps

prefix-independent

Implies the mean-payoff condition

Complexity, Algorithm ?

• like coBüchi objective  $\Diamond \Box(\Sigma^{\leq B} \geq 0)$   $O(V^2 \cdot E \cdot B \cdot \log W)$ 

bounded delay

multi-dimension: EXPTIME-complete

Multi-dimension mean-payoff (liminf): coNP-complete

Naive algorithm: exponential in number of states

Hyperplane separation: reduction to single-dimension mean-payoff games

$$\vec{\lambda} = (1, 3)$$
  
$$\vec{\lambda} \cdot \mathbf{w}^T = 1 \cdot (-1) + 3 \cdot 2 = 5$$
  
$$\mathbf{w} = (-1, 2)$$



Multi-dimension

Single dimension



 $\mathsf{MP}_{\vec{\lambda}} \ge 0$ 





Player 1 cannot ensure  $MP_{\lambda} \ge 0$  for some  $\lambda$ 

 $\Leftrightarrow$ 





Player 1 wins  $MP_{\lambda} \ge 0$  for all  $\lambda \in (\mathbb{R}^+)^d$ 

 $\Leftrightarrow$ 



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 $\Leftrightarrow$ 

- Multi-dimension mean-payoff (liminf): coNP-complete
- Naive algorithm: exponential in number of states
- Hyperplane separation: reduction to single-dimension mean-payoff games

Player 1 wins  $MP_{\lambda} \ge 0$  for all  $\lambda \in (\mathbb{R}^+)^d$ 

 $\Leftrightarrow$ 

Player 1 wins the multi-dimension game

In fact, it is sufficient for player 1 to win for all  $\lambda \in \{0, ..., (d \cdot n \cdot W)^{d+1}\}^d$ 

Fixpoint algorithm:

- remove states if losing for some  $\boldsymbol{\lambda}$
- remove attractor (for player 2) of losing states

Solving  $O(n \cdot M^d)$ mean-payoff games in  $O(n \cdot m \cdot M)$ 



#### Conclusion

Multiple dimensions of mean-payoff games

- Reachability game
- Energy game
- Cycle-forming game

Multi-dimension mean-payoff games

Memoryless proofs

Other directions: parity condition, stochasticity, imperfect information

## Credits

• Energy/Mean-Payoff Games is joint work with *Lubos Brim, Jakub Chaloupka, Raffaela Gentilini, Jean-Francois Raskin*.

- Multi-dimension Games is joint work with *Krishnendu Chatterjee, Jean-Francois Raskin, Alexander Rabinovich, Yaron Velner*.
- Window games is joint work with *Krishnendu Chatterjee, Michael Randour, Jean-Francois Raskin*.

Other important contributions:

[BFLMS08] Bouyer, Fahrenberg, Larsen, Markey, Srba. *Infinite Runs in weighted timed automata with energy constraints*. FORMATS'08.

[BJK10] Brazdil, Jancar, Kucera. *Reachability Games on extended vector addition systems with states*. ICALP'10. [CV14] Chatterjee, Velner. *Hyperplane Separation Technique for Multidimensional Mean-Payoff Games*. FoSSaCS'14. [Kop06] Kopczynski. *Half-Positional Determinacy of Infinite Games*. ICALP'06.

[KS88] Kosaraju, Sullivan. Detecting cycles in dynamic graphs in polynomial time. STOC'88.





# Thank you !

# **Questions** ?