Average-Energy Games

Patricia Bouyer¹ Nicolas Markey¹ Mickael Randour¹ Kim G. Larsen² Simon Laursen²

¹LSV - CNRS & ENS Cachan

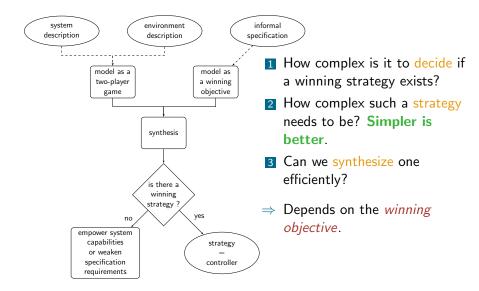
²Aalborg University

09.06.2015 - Séminaire annuel du LSV - Dourdan





General context: strategy synthesis in quantitative games



Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

The talk in one slide

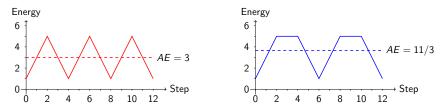
"New" quantitative objective

- \triangleright Total-payoff (TP) "refines" mean-payoff (MP) (MP value = 0)
- Average-energy (AE) "refines" TP

The talk in one slide

"New" quantitative objective

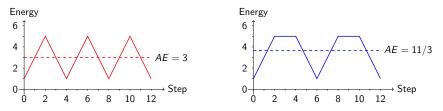
- ▷ Total-payoff (TP) "refines" mean-payoff (MP) (MP value = 0)
- Average-energy (AE) "refines" TP
- \hookrightarrow characterizes the average energy level along an infinite play



The talk in one slide

"New" quantitative objective

- \triangleright Total-payoff (TP) "refines" mean-payoff (MP) (MP value = 0)
- Average-energy (AE) "refines" TP
- \hookrightarrow characterizes the average energy level along an infinite play



 Conjunction with energy constraints: lower and/or upper bounds on the energy level (e.g., fuel tank)

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	0000000000	0000000	000

1 Context & Definitions

- 2 Average-Energy Games
- 3 Average-Energy with Energy Constraints

4 Conclusion

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
00000	0000000000	0000000	000

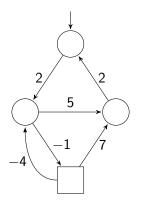
1 Context & Definitions

- 2 Average-Energy Games
- 3 Average-Energy with Energy Constraints
- 4 Conclusion

AE + Energy Constraints

Conclusion 000

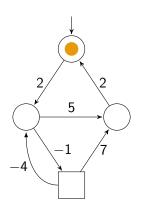
Two-player turn-based games on graphs

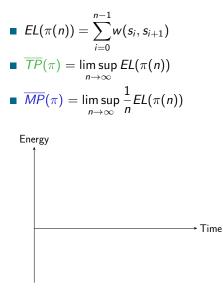


- $\bullet G = (S_1, S_2, T, w)$
- $S = S_1 \cup S_2, S_1 \cap S_2 = \emptyset, T \subseteq S \times S,$ $w: T \to \mathbb{Z}$
- \mathcal{P}_1 states = \bigcirc
- \mathcal{P}_2 states =
- Plays have values
 - $\triangleright f: Plays(G) \rightarrow \mathbb{R} \cup \{-\infty, \infty\}$
- Players follow pure strategies
 - $\triangleright \sigma_i : Prefs_i(G) \rightarrow S$

AE + Energy Constraints

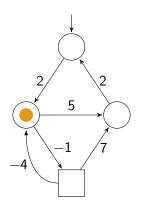
Conclusion 000

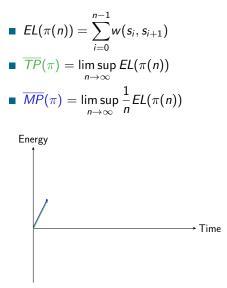




AE + Energy Constraints

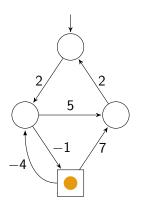
Conclusion 000

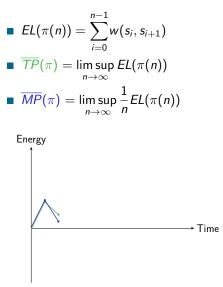




AE + Energy Constraints

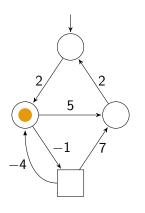
Conclusion 000

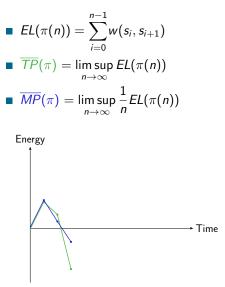




AE + Energy Constraints

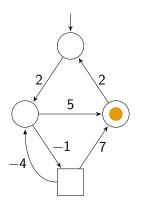
Conclusion 000

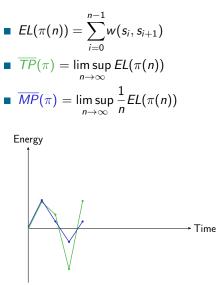




AE + Energy Constraints

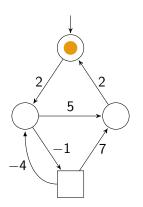
Conclusion 000

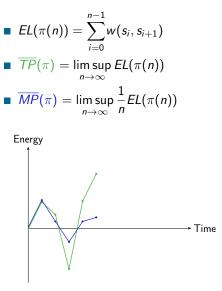




AE + Energy Constraints

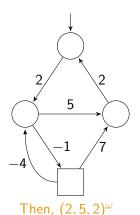
Conclusion 000

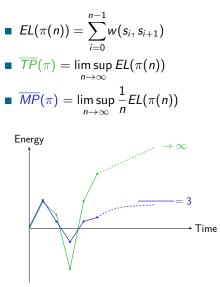




AE + Energy Constraints

Conclusion 000





AE + Energy Constraints

Decision problems

TP (MP) threshold problem

 $\begin{tabular}{l} & \begin{tabular}{ll} & \begin{tabular}{ll}$

 \hookrightarrow we take the **minimizer** point of view

Lower-bounded energy problem

 $\hookrightarrow \textbf{ fixed initial credit}$

Lower- and upper-bounded energy problem

Context &	Definitions
000000	

AE + Energy Constraints

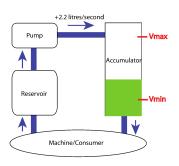
Known results

Objective	1-player	2-player	memory
MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
TP	P [FV97]	$NP \cap coNP \ [GS09]$	memoryless [GZ04]
EG_L	P [BFL ⁺ 08]	$NP \cap coNP$ [CdAHS03, BFL ⁺ 08]	memoryless [CdAHS03]
EG _{LU}	PSPACE-c. [FJ13]	EXPTIME-c. [BFL ⁺ 08]	pseudo-polynomial

▷ For all objectives but EG_{LU}, memoryless strategies suffice for both players.

Average-energy: motivating example

 Hydac oil pump industrial case study [CJL⁺09] (Quasimodo research project).



Goals:

- **1** Keep the oil level in the safe zone. $\hookrightarrow EG_{LU}$
- 2 Minimize the average oil level. $\hookrightarrow AE$
- \Rightarrow **Conjunction**: AE_{LU}

Context & Definitions	AE Games 0000000000	AE + Energy Constraints	Conclusion 000

Related work

- AE appeared in [TV87] as an alternative total reward definition.
 - \hookrightarrow Not studied until recently.
- Chatterjee and Prabhu use a variant in [CP13].
 - \hookrightarrow Average debit-sum level objective.
 - $\hookrightarrow \ \mathsf{Pseudo-polynomial\ algorithm}.$
 - \hookrightarrow Complexity and memory requirements are open.
- AE studied independently by Boros et al. in [BEGM15].
 - \hookrightarrow Stochastic context.
 - \hookrightarrow Similar results but different approach.
- Nothing is known for AE_{LU} .

AE + Energy Constraints

1 Context & Definitions

- 2 Average-Energy Games
- 3 Average-Energy with Energy Constraints

4 Conclusion

Average-energy: definition

Recall

$$EL(\pi(n)) = \sum_{i=0}^{n-1} w(s_i, s_{i+1})$$
$$\overline{TP}(\pi) = \limsup_{n \to \infty} EL(\pi(n))$$
$$\overline{MP}(\pi) = \limsup_{n \to \infty} \frac{1}{n} EL(\pi(n))$$

+ infimum variants <u>TP</u>, <u>MP</u>, <u>AE</u>

Average-energy (AE)

Describes the average energy level along a play:

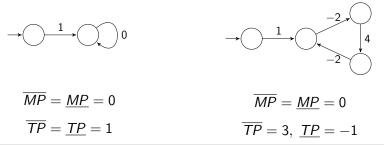
$$\overline{AE}(\pi) = \limsup_{n \to \infty} \frac{1}{n} \sum_{i=1}^{n} EL(\pi(i))$$

TP "refines" MP

- If \mathcal{P}_1 (minimizer) can ensure $\underline{MP} = \overline{MP} < 0$ (memoryless), he can ensure $\underline{TP} = \overline{TP} = -\infty$.
- If \mathcal{P}_2 (maximizer) can ensure $\underline{MP} = \overline{MP} > 0$ (memoryless), he can ensure $\underline{TP} = \overline{TP} = \infty$.

TP "refines" MP

- If \mathcal{P}_1 (minimizer) can ensure $\underline{MP} = \overline{MP} < 0$ (memoryless), he can ensure $\underline{TP} = \overline{TP} = -\infty$.
- If \mathcal{P}_2 (maximizer) can ensure $\underline{MP} = \overline{MP} > 0$ (memoryless), he can ensure $\underline{TP} = \overline{TP} = \infty$.
- ⇒ **TP discriminates "MP-zero" strategies** depending on the high points (\overline{TP}) or low points (\underline{TP}) of cycles.



Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	000000000	0000000	000

AE "refines" TP

AE describes the long-run average EL

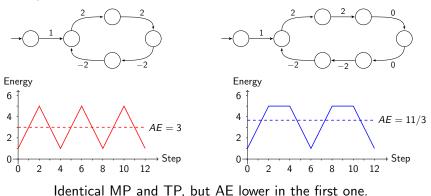
 \hookrightarrow By definition, <u>AE(π), <u>AE</u>(π) \in [<u>TP(π)</u>, <u>TP</u>(π)].</u>

AE "refines" TP

AE describes the long-run average EL

 \hookrightarrow By definition, <u>AE(π), $\overline{AE}(\pi) \in [\underline{TP}(\pi), \overline{TP}(\pi)]$.</u>

⇒ AE discriminates strategies with identical high/low points.



Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

Memoryless determinacy (1/2)

Classical criteria from the literature cannot be applied out-of-the-box [EM79, BSV04, AR14, GZ04, Kop06].

- → Common approach: connect *first cycle* games and infinite-duration ones.
- → Requires e.g., closure under cyclic permutation and concatenation [AR14].

Intuitively: ability to mix and shuffle good cycles and stay good.

Memoryless determinacy (1/2)

Classical criteria from the literature cannot be applied out-of-the-box [EM79, BSV04, AR14, GZ04, Kop06].

- → Common approach: connect *first cycle* games and infinite-duration ones.
- → Requires e.g., closure under cyclic permutation and concatenation [AR14].

Intuitively: ability to mix and shuffle good cycles and stay good.

Not true in general for AE!

$$\mathcal{C}_1 = \{-1\}, \ \mathcal{C}_2 = \{1\}, \ \mathcal{C}_3 = \{1, -2\}$$

 $\textit{AE}(\mathcal{C}_{1}\mathcal{C}_{2}) = (-1+0)/2 = -1/2 < \textit{AE}(\mathcal{C}_{2}\mathcal{C}_{1}) = (1-0)/2 = 1/2$

$$AE(\mathcal{C}_3) = 0$$
 but $AE(\mathcal{C}_3\mathcal{C}_3) = -1/2 < 0$

Average-Energy Games

Memoryless determinacy (1/2)

Classical criteria from the literature cannot be applied out-of-the-box [EM79, BSV04, AR14, GZ04, Kop06].

- → Common approach: connect *first cycle* games and infinite-duration ones.
- → Requires e.g., closure under cyclic permutation and concatenation [AR14].

Intuitively: ability to mix and shuffle good cycles and stay good.

We can only shuffle/repeat cycles that are neutral w.r.t. the energy level! \hookrightarrow zero-cycles

Memoryless determinacy (2/2)

Two key properties:

1 Extraction of prefixes

▷ Let $\rho \in Prefs(G)$, $\pi \in Plays(G)$. Then,

$$\overline{AE}(\rho \cdot \pi) = EL(\rho) + \overline{AE}(\pi).$$

2 Extraction of a best cycle

Given an infinite sequence of *zero-cycles*, one can select and repeat a *best cycle* to minimize the average-energy.

One-player games: strategy Sketch (minimizer)

- **1** If you can ensure MP < 0, do it.
 - ▷ Memoryless [EM79], implies $AE = -\infty$.
- If you *cannot* ensure MP = 0, forget it.
 ▷ You are doomed. AE = ∞.
- **3** Play the strategy that minimizes

$$\overline{\mathsf{AE}}(\rho \cdot \mathcal{C}^{\omega}) = \mathsf{EL}(\rho) + \overline{\mathsf{AE}}(\mathcal{C}),$$

where C is a simple zero-cycle.

 \hookrightarrow Picking the best combination can be done without memory.

One-player games: P algorithm (1/2)

■ Case *MP* < 0 is easy

▷ Look for a negative cycle (e.g., Bellman-Ford, $O(|S|^3)$)

One-player games: P algorithm (1/2)

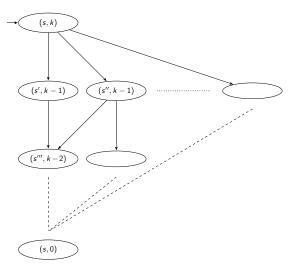
- Case *MP* < 0 is easy
 - \triangleright Look for a negative cycle (e.g., Bellman-Ford, $\mathcal{O}(|S|^3)$)
- Assume MP = 0: pick the best combination of ρ and C
 - \triangleright Computing the best ρ for each state is easy with classical graph algorithms (e.g., Bellman-Ford).
 - \triangleright Main task: computing the best C (AE-wise) for each state.

One-player games: P algorithm (1/2)

- Case *MP* < 0 is easy
 - \triangleright Look for a negative cycle (e.g., Bellman-Ford, $\mathcal{O}(|S|^3)$)
- Assume MP = 0: pick the best combination of ρ and C
 - \triangleright Computing the best ρ for each state is easy with classical graph algorithms (e.g., Bellman-Ford).
 - \triangleright Main task: computing the best C (AE-wise) for each state.
- For each state, we compute the best cycle of length k, for all $k \in \{1, ..., |S|\}$, then pick the best one.
 - ▷ Need to compute $C_{s,k}$ in polynomial time.

One-player games: P algorithm (2/2)

Computing $C_{s,k}$: build a **new graph** $\mathcal{G}_{s,k}$ of size $|S| \cdot (k+1)$.

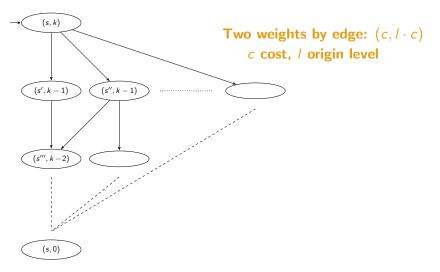


Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

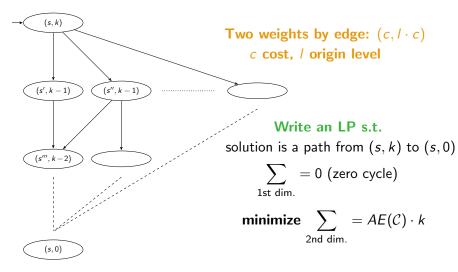
One-player games: P algorithm (2/2)

Computing $C_{s,k}$: build a **new graph** $\mathcal{G}_{s,k}$ of size $|S| \cdot (k+1)$.



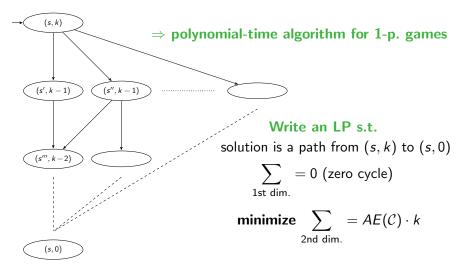
One-player games: P algorithm (2/2)

Computing $C_{s,k}$: build a **new graph** $\mathcal{G}_{s,k}$ of size $|S| \cdot (k+1)$.



One-player games: P algorithm (2/2)

Computing $C_{s,k}$: build a **new graph** $\mathcal{G}_{s,k}$ of size $|S| \cdot (k+1)$.



Average-Energy Games

Two-player games

Memoryless determinacy

 Follows from the 1-p. results (minimizer and maximizer) using Gimbert and Zielonka [GZ05].

Threshold problem in NP \cap coNP.

 \triangleright Memoryless determinacy + P for one-player games.

• "Mean-payoff" hard.

- ▷ Replace any edge of weight *c* by two consecutive edges of values $2 \cdot c$ and $-2 \cdot c$.
- ▷ Use decomposition techniques.
- \triangleright MP(π) in G = AE(π) in G'.

Context & Definitions

AE Games

AE + Energy Constraints

Conclusion 000

Wrap-up

Objective	1-player	2-player	memory
MP	P [Kar78]	$NP \cap coNP \ [ZP96]$	memoryless [EM79]
TP	P [FV97]	$NP \cap coNP \ [GS09]$	memoryless [GZ04]
EG_L	P [BFL+08]	$NP \cap coNP$ [CdAHS03, BFL+08]	memoryless [CdAHS03]
EG_{LU}	PSPACE-c. [FJ13]	EXPTIME-c. [BFL ⁺ 08]	pseudo-polynomial
AE	Р	$NP \cap coNP$	memoryless

▷ For all objectives but EG_{LU}, memoryless strategies suffice for both players.

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	0000000000	0000000	000

1 Context & Definitions

2 Average-Energy Games

3 Average-Energy with Energy Constraints

4 Conclusion

Two settings

1 AE_{LU} : AE with lower (0) and upper ($U \in \mathbb{N}$) bounds.

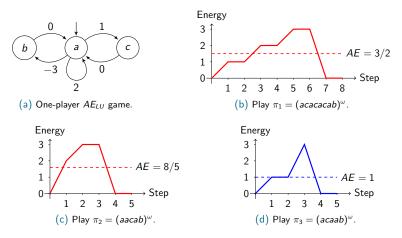
2 AE_L : AE with only the lower bound (0).

 \hookrightarrow Fixed initial credit $c_{\text{init}} = 0$.

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	0000000000	0000000	000

Memory is needed!

Example: $AE_{LU} \rightarrow \text{minimize } AE$ while keeping $EL \in [0, 3]$.



Minimal AE with π_3 : alternating between the +1, +2 and -3 cycles.

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	0000000000	0000000	000

Memory is needed!

Example: $AE_{LU} \rightsquigarrow$ minimize AE while keeping $EL \in [0, 3]$.

$\label{eq:Non-trivial behavior in general!} \hookrightarrow \text{Need to choose carefully which cycles to play.}$

Memory is needed!

Example: $AE_{LU} \rightsquigarrow$ minimize AE while keeping $EL \in [0, 3]$.

$\label{eq:Non-trivial behavior in general!} \hookrightarrow \text{Need to choose carefully which cycles to play.}$

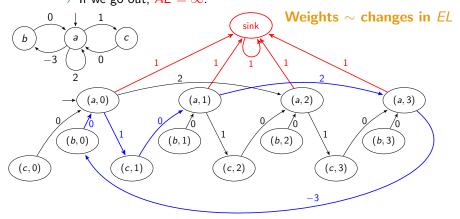
The AE_{LU} problem is EXPTIME-complete.

 $\label{eq:reduction} \hookrightarrow \mbox{Reduction from } AE_{LU} \mbox{ to } AE \mbox{ on pseudo-polynomial game} \\ (\Rightarrow \ AE_{LU} \in \mbox{NEXPTIME} \ \cap \ \mbox{coNEXPTIME}).$

 $\hookrightarrow \mbox{Reduction from this } AE \mbox{ game to } MP \mbox{ game } + \mbox{pseudo-poly. algorithm}.$



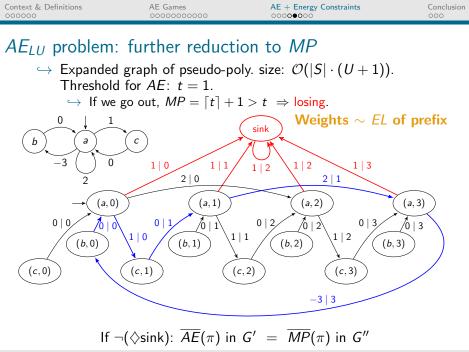
 \hookrightarrow Expanded graph constraining the game within the energy bounds [0, U]. **Pseudo-polynomial size**: $\mathcal{O}(|S| \cdot (U+1))$. \hookrightarrow If we go out, $AE = \infty$.



minimal $AE \land EL \in [0,3]$ in $G \iff$ minimal AE in G'

Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen



Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

AE_{LU} problem: complexity

Objective	1-player	2-player	memory
MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
TP	P [FV97]	$NP \cap coNP \ [GS09]$	memoryless [GZ04]
EG_L	P [BFL ⁺ 08]	$NP \cap coNP \ [CdAHS03, \ BFL^+08]$	memoryless [CdAHS03]
EG_{LU}	PSPACE-c. [FJ13]	EXPTIME-c. [BFL ⁺ 08]	pseudo-polynomial
AE	Р	$NP\capcoNP$	memoryless
AE_{LU} (poly. U)	Р	$NP\capcoNP$	polynomial
AE _{LU} (arbitrary)	EXPTIME-e./PSPACE-h.	EXPTIME-c.	pseudo-polynomial

 \triangleright Pseudo-poly. algo. to solve the *MP* problem (e.g., [BCD⁺11]).

- ▷ Lower bounds follow from EG_{LU} .
- > Pseudo-polynomial memory is both necessary and sufficient.

AE_L problem: partial answers

One-player games.

- ↔ Key argument: upper-bounding the value of the energy over a witness winning path.
- \hookrightarrow Pseudo-polynomial bound for *U*, then reduction to an AE_{LU} problem.
- \hookrightarrow EXPTIME-algorithm.
- \hookrightarrow **Lower bound:** NP-hard via subset sum problem [GJ79].

AE_L problem: partial answers

One-player games.

- ↔ Key argument: upper-bounding the value of the energy over a witness winning path.
- \hookrightarrow Pseudo-polynomial bound for *U*, then reduction to an AE_{LU} problem.
- \hookrightarrow EXPTIME-algorithm.
- \hookrightarrow **Lower bound:** NP-hard via *subset sum problem* [GJ79].

Two-player games.

- \hookrightarrow Decidability is open.
- → Lower bound: EXPTIME-hard via *countdown games* [JSL08].

AE + Energy Constraints ○○○○○○○●

AE_L problem: complexity

Objective	1-player	2-player	memory
MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
TP	P [FV97]	$NP \cap coNP \ [GS09]$	memoryless [GZ04]
EG_L	P [BFL+08]	$NP \cap coNP \ [CdAHS03, \ BFL^+08]$	memoryless [CdAHS03]
EG_{LU}	PSPACE-c. [FJ13]	EXPTIME-c. [BFL+08]	pseudo-polynomial
AE	Р	$NP \cap coNP$	memoryless
AE_{LU} (poly. U)	Р	$NP\capcoNP$	polynomial
AE _{LU} (arbitrary)	EXPTIME-e./PSPACE-h.	EXPTIME-c.	pseudo-polynomial
AE_L	EXPTIME-e./NP-h.	open/EXPTIME-h.	open (\geq pseudo-poly.)

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
000000	0000000000	0000000	•00

1 Context & Definitions

- 2 Average-Energy Games
- 3 Average-Energy with Energy Constraints
- 4 Conclusion

Wrap-up

"New" quantitative objective.

- ▷ Practical motivations (e.g., HYDAC).
- \triangleright "Refines" *TP* (and *MP*).
- \triangleright Same complexity class as EG_L , MP and TP games.
- \triangleright *AE*_{LU} well-understood.
- \triangleright Open questions for AE_L .

AE + Energy Constraints

Thank you! Any question?

Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen

References I



Benjamin Aminof and Sasha Rubin.

First cycle games.

In Proceedings of the 2nd International Workshop on Strategic Reasoning (SR'14), volume 146 of Electronic Proceedings in Theoretical Computer Science, pages 83–90, March 2014.



L. Brim, J. Chaloupka, L. Doyen, R. Gentilini, and J.-F. Raskin.

Faster algorithms for mean-payoff games. Formal Methods in System Design, 38(2):97–118, 2011.



E. Boros, K. Elbassioni, V. Gurvich, and K. Makino.

Markov decision processes and stochastic games with total effective payoff. In Proc. of STACS, LIPIcs 30, pages 103–115. Schloss Dagstuhl - LZI, 2015.



Patricia Bouyer, Uli Fahrenberg, Kim Gulstrand Larsen, Nicolas Markey, and Jiří Srba.

Infinite runs in weighted timed automata with energy constraints. In Franck Cassez and Claude Jard, editors, Proceedings of the 6th International Conferences on Formal Modelling and Analysis of Timed Systems, (FORMATS'08), volume 5215 of Lecture Notes in Computer Science, pages 33–47. Springer-Verlag, September 2008.



Henrik Björklund, Sven Sandberg, and Sergei Vorobyov.

Memoryless determinacy of parity and mean payoff games: A simple proof. Theoretical Computer Science, 310(1-3):365–378, January 2004.

References II

Arindam Chakrabarti, Luca de Alfaro, Thomas A. Henzinger, and Mariëlle Stoelinga.

Resource interfaces.

In Rajeev Alur and Insup Lee, editors, Proceedings of the 3rd International Conference on Embedded Software (EMSOFT'03), volume 2855 of Lecture Notes in Computer Science, pages 117–133. Springer-Verlag, October 2003.



Krishnendu Chatterjee, Laurent Doyen, Mickael Randour, and Jean-François Raskin.

Looking at mean-payoff and total-payoff through windows. Information and Computation, 242:25 – 52, 2015.



Franck Cassez, Jan J. Jensen, Kim Gulstrand Larsen, Jean-François Raskin, and Pierre-Alain Reynier.

Automatic synthesis of robust and optimal controllers – an industrial case study. In Rupak Majumdar and Paulo Tabuada, editors, Proceedings of the 12th International Workshop on Hybrid Systems: Computation and Control (HSCC'09), volume 5469 of Lecture Notes in Computer Science, pages 90–104. Springer-Verlag, April 2009.



K. Chatterjee and V.S. Prabhu.

Quantitative timed simulation functions and refinement metrics for real-time systems. In Proc. of HSCC, pages 273–282. ACM, 2013.



Andrzej Ehrenfeucht and Jan Mycielski.

Positional strategies for mean payoff games. International Journal of Game Theory, 8(2):109–113, June 1979.

References III



John Fearnley and Marcin Jurdziński.

Reachability in two-clock timed automata is PSPACE-complete.

In Fedor V. Fomin, Rusins Freivalds, Marta Kwiatkowska, and David Peleg, editors, <u>Proceedings of the 40th</u> International Colloquium on Automata, Languages and Programming (ICALP'13) – Part II, volume 7966 of Lecture Notes in Computer Science, pages 212–223. Springer-Verlag, July 2013.



Jerzy Filar and Koos Vrieze.

Competitive Markov decision processes. Springer-Verlag, 1997.



Michael R. Garey and David S. Johnson.

Computers and intractability: a guide to the Theory of NP-Completeness. Freeman New York, 1979.



Thomas Gawlitza and Helmut Seidl.

Games through nested fixpoints.

In Ahmed Bouajjani and Oded Maler, editors, Proceedings of the 21st International Conference on Computer Aided Verification (CAV'09), volume 5643 of Lecture Notes in Computer Science, pages 291–305. Springer-Verlag, June 2009.



Hugo Gimbert and Wiesław Zielonka.

When can you play positionnaly?

In Jiří Fiala, Václav Koubek, and Jan Kratochíl, editors, Proceedings of the 29th International Symposium on Mathematical Foundations of Computer Science (MFCS'04), volume 3153 of Lecture Notes in Computer Science, pages 686–697. Springer-Verlag, August 2004.

References IV



Hugo Gimbert and Wiesław Zielonka.

Games where you can play optimally without any memory.

In Martín Abadi and Luca de Alfaro, editors, <u>Proceedings of the 16th International Conference on</u> Concurrency Theory (CONCUR'05), volume 3653 of Lecture Notes in Computer Science, pages 428–442. Springer-Verlag, August 2005.



Marcin Jurdziński, Jeremy Sproston, and François Laroussinie.

Model checking probabilistic timed automata with one or two clocks. Logical Methods in Computer Science, 4(3), 2008.



Richard M. Karp.

A characterization of the minimum cycle mean in a digraph. Discrete Mathematics, 23(3):309–311, September 1978.



Eryk Kopczynski.

Half-positional determinacy of infinite games.

In Michele Bugliesi, Bart Preneel, Vladimiro Sassone, and Ingo Wegener, editors, Proceedings of the 33rd International Colloquium on Automata, Languages and Programming (ICALP'06)) – Part II, volume 4052 of Lecture Notes in Computer Science, pages 336–347. Springer-Verlag, July 2006.



F. Thuijsman and O.J. Vrieze.

The bad match; a total reward stochastic game. OR Spektrum, 9(2):93–99, 1987.



Uri Zwick and Mike Paterson.

The complexity of mean payoff games on graphs. Theoretical Computer Science, 158(1-2):343–359, May 1996.

Average-Energy Games

Bouyer, Markey, Randour, Larsen, Laursen