Average-Energy Games

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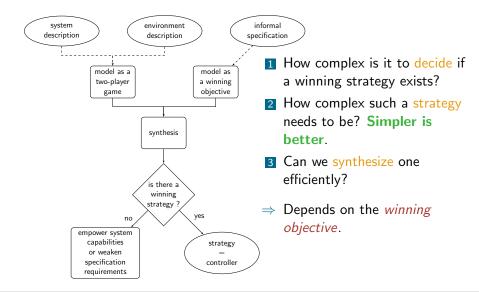
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18.05.2015 - 5th Cassting Meeting - ULB





General context: strategy synthesis in quantitative games



Average-Energy Games

The talk in one slide

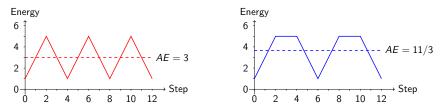
"New" quantitative objective

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

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"New" quantitative objective

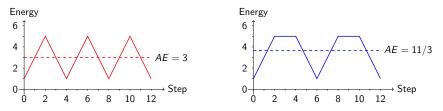
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 Conjunction with energy constraints: lower and/or upper bounds on the energy level (e.g., fuel tank)

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
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- **1** Context & Definitions
- 2 Average-Energy Games
- 3 Average-Energy with Energy Constraints
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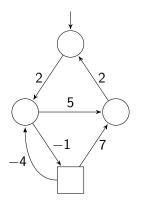
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AE + Energy Constraints

Conclusion 000

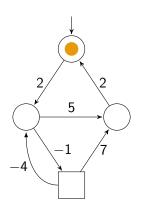
Two-player turn-based games on graphs

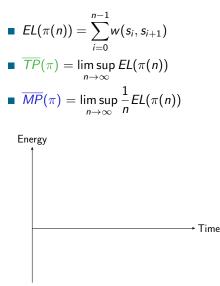


- $\bullet G = (S_1, S_2, T, w)$
- $S = S_1 \cup S_2, S_1 \cap S_2 = \emptyset, T \subseteq S \times S,$ $w: T \to \mathbb{Z}$
- \mathcal{P}_1 states = \bigcirc
- \mathcal{P}_2 states =
- Plays have values
 - $\triangleright f: Plays(G) \rightarrow \mathbb{R} \cup \{-\infty, \infty\}$
- Players follow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

AE + Energy Constraints

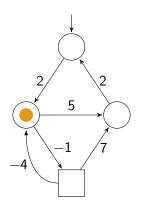
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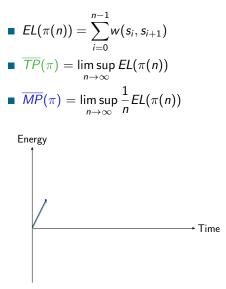




AE + Energy Constraints

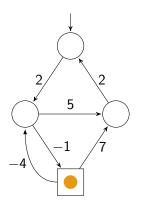
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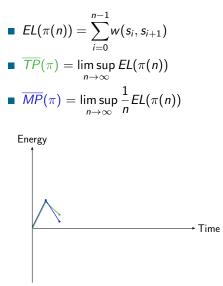




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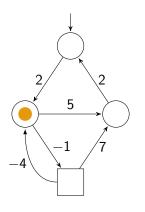
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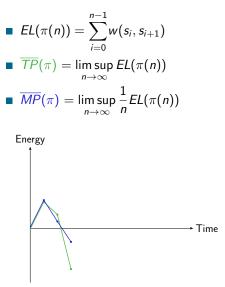




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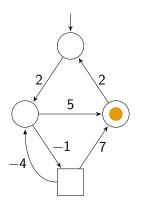
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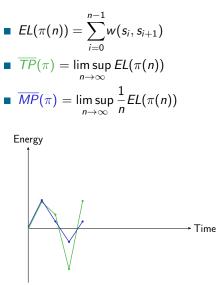




AE + Energy Constraints

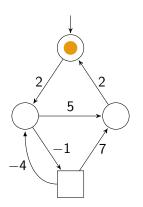
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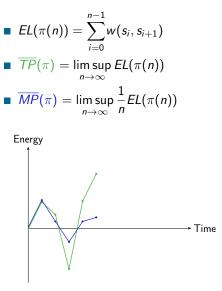




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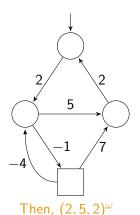
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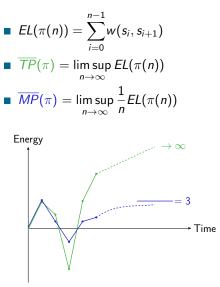




AE + Energy Constraints

Conclusion 000





AE + Energy Constraints

Decision problems

TP (MP) threshold problem

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 \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
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AE + Energy Constraints

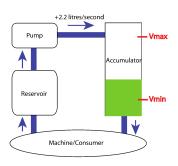
Known results

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]	exponential

▷ 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
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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

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Average-energy: definition

Recall

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

-1

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

Average-energy (AE)

Describes the average energy level along a play:

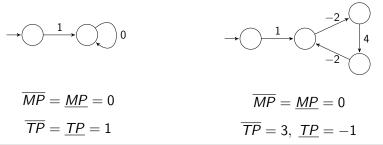
$$\overline{AE}(\pi) = \limsup_{n \to \infty} \frac{1}{n} \sum_{i=1}^{n} EL(\pi(i))$$

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 $\underline{TP} = \overline{TP} = \infty$.

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- 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, Larsen, Laursen, Markey, Randour

Context & Definitions	AE Games	AE + Energy Constraints	Conclusion
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AE "refines" TP

AE describes the long-run average EL

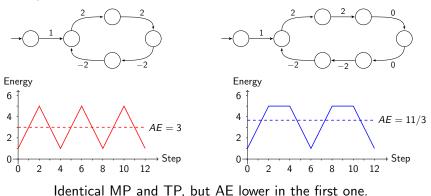
 \hookrightarrow By definition, <u>AE(π), <u>AE</u>(π) \in [<u>TP(π)</u>, <u>TP</u>(π)].</u>

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, Larsen, Laursen, Markey, Randour

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.

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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

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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)

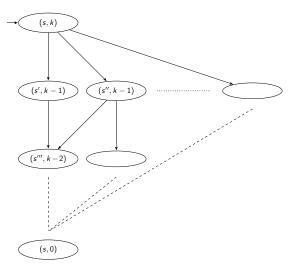
- Case *MP* < 0 is easy
 - \triangleright Look for a negative cycle (e.g., Bellman-Ford, $\mathcal{O}(|S|^3)$)
- Assume MP = 0: pick the best combination of ρ and C
 - \triangleright Computing the best ρ for each state is easy with classical graph algorithms (e.g., Bellman-Ford).
 - \triangleright Main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

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 - \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.

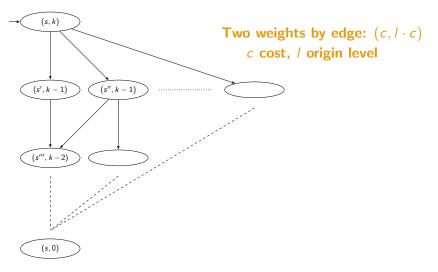
One-player games: P algorithm (2/2)

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



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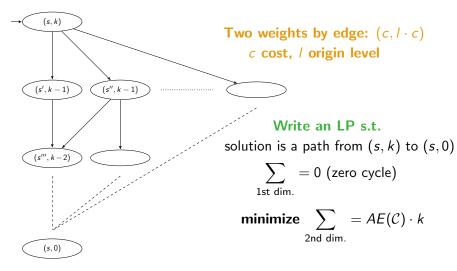


Average-Energy Games

Bouyer, Larsen, Laursen, Markey, Randour

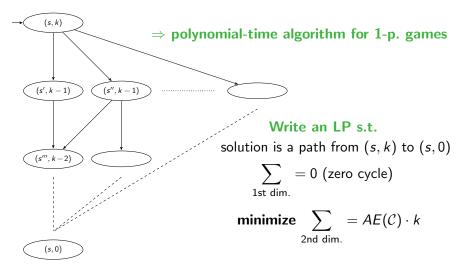
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AE Games

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.

▷ 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

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Conclusion 000

Wrap-up

Objective	1-player	2-player	memory
MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
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EG_{LU}	PSPACE-c. [FJ13]	EXPTIME-c. [BFL ⁺ 08]	exponential
AE	Р	$NP \cap coNP$	memoryless

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

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AE Games

Two settings

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

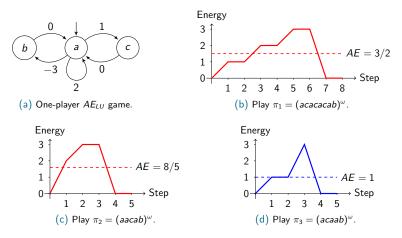
2 AE_L : AE with only the lower bound (0).

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

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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.

Average-Energy Games

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Memory is needed!

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

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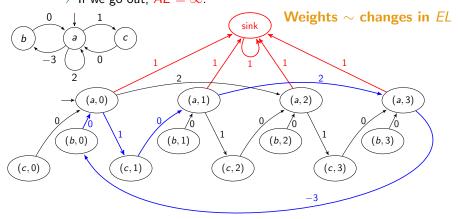
The AE_{LU} problem is EXPTIME-complete.

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

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

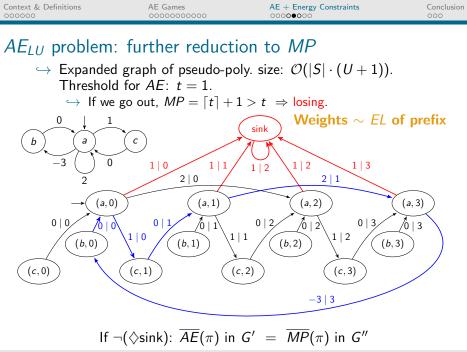


 \hookrightarrow Expanded graph constraining the game within the energy bounds [0, U]. **Pseudo-polynomial size**: $\mathcal{O}(|S| \cdot (U+1))$. \hookrightarrow If we go out, $AE = \infty$.



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

Average-Energy Games



Average-Energy Games

AE_{LU} problem: complexity

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

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

- \triangleright Lower bounds follow from EG_{LU} .
- ▷ Exponential 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

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- ↔ Key argument: upper-bounding the value of the energy over a witness winning path.
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- \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 Games

AE + Energy Constraints ○○○○○○○●

AE_L problem: complexity

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AE	Р	$NP \cap coNP$	memoryless
AE_{LU} (poly. U)	Р	$NP\capcoNP$	polynomial
AE _{LU} (arbitrary)	EXPTIME-e./PSPACE-h.	EXPTIME-c.	exponential
AE_L	EXPTIME-e./NP-h.	open/EXPTIME-h.	open (required)

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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 .
 - \hookrightarrow Mostly theoretical interest (unbounded energy capacity is not realistic).

AE Games

AE + Energy Constraints

Thank you! Any question?

Average-Energy Games

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