

Average-Energy Games and Beyond

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Based on joint works with:

Nicolas Markey

Mickael Randour

Kim G. Larsen

Simon Laursen

GandALF'15 / Acta Informatica

Piotr Hofman

Nicolas Markey

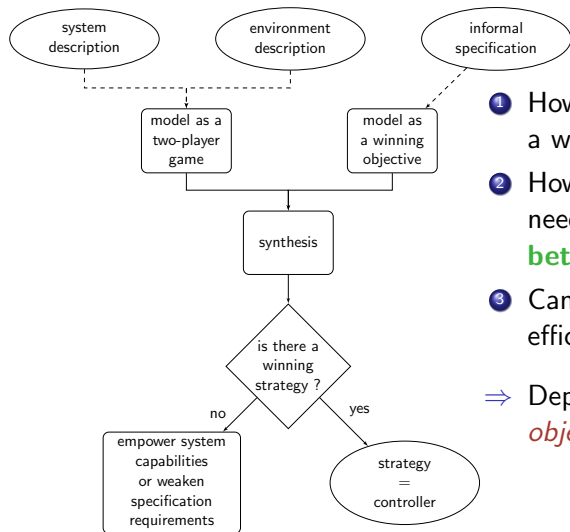
Mickael Randour

Martin Zimmermann

FoSSaCS'17

Thanks to Mickael for his slides!

General context: strategy synthesis in quantitative games

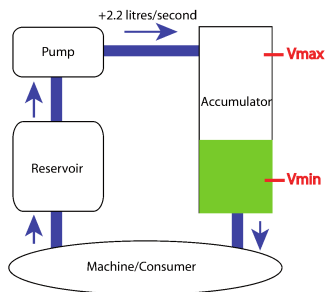


- ① How complex is it to **decide** if a winning strategy exists?
 - ② How complex such a **strategy** needs to be? **Simpler is better.**
 - ③ Can we **synthesize** one efficiently?
- ⇒ Depends on the **winning objective**.

Motivating example

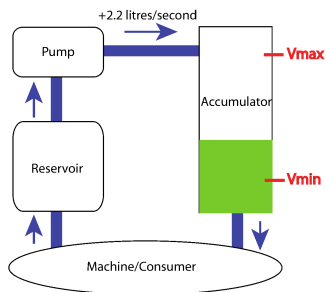
HYDAC oil pump industrial case study [CJL⁺09] (Quasimodo research project).

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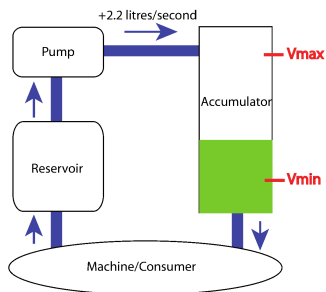


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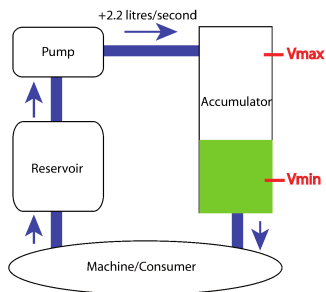


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 - ↳ **Average-energy objective: AE**

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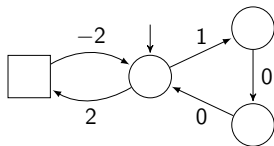
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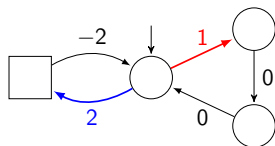
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- ⇒ **Conjunction: AE_{LU}**

Average-energy: illustration



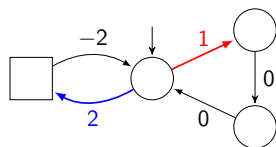
- Two-player turn-based games with integer weights.

Average-energy: illustration



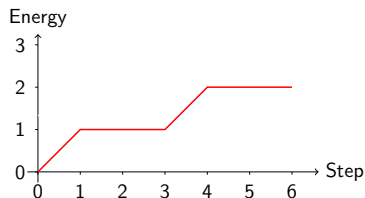
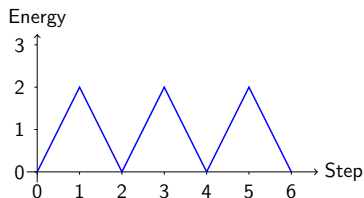
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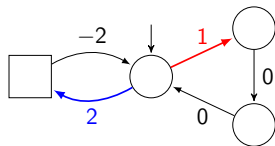


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⇒ We look at the **energy level** (EL) along a play.

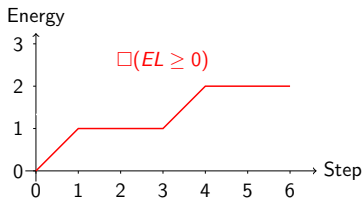
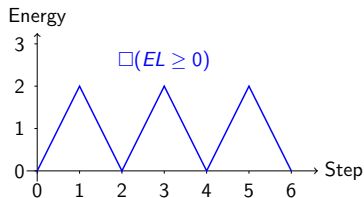


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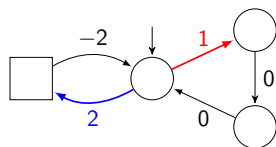
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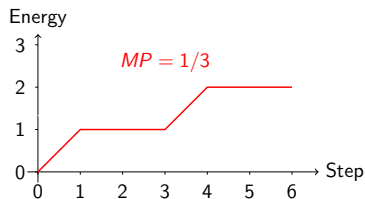
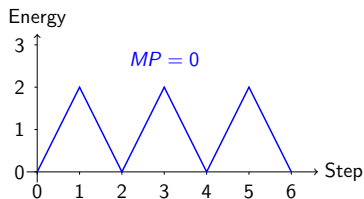
Energy objective (EG_L/EG_{LU}): e.g., always maintain $EL \geq 0$.

Average-energy: illustration



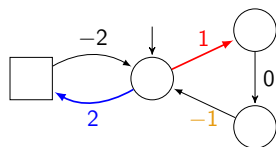
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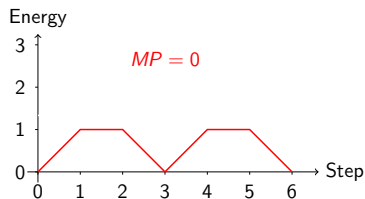
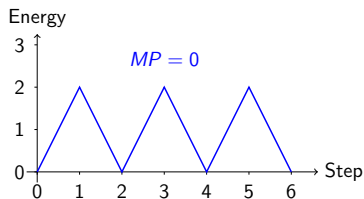
Mean-payoff (MP): long-run average payoff per transition.

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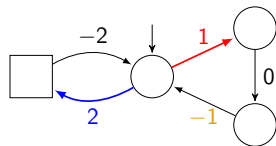
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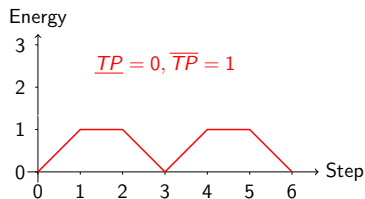
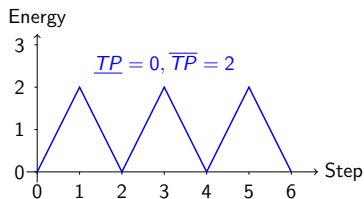
⇒ **Let's change the weights of our game.**

Average-energy: illustration



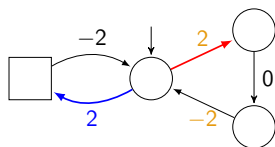
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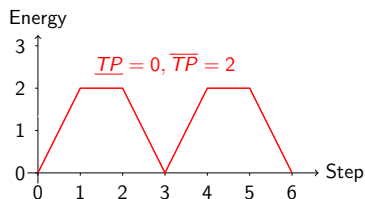
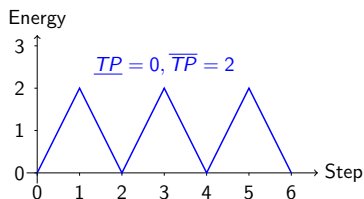
Total-payoff (TP) *refines MP* in the case $MP = 0$ by looking at high/low points of the sequence.

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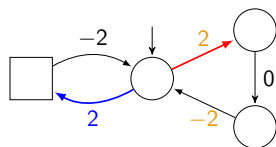
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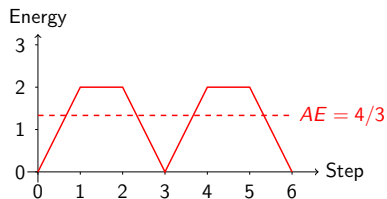
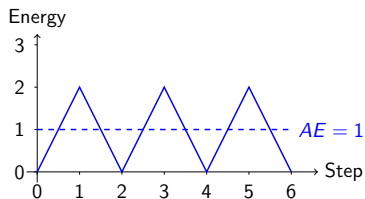
⇒ **Let's change the weights again.**

Average-energy: illustration



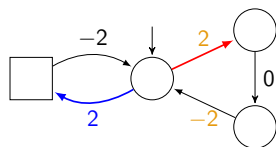
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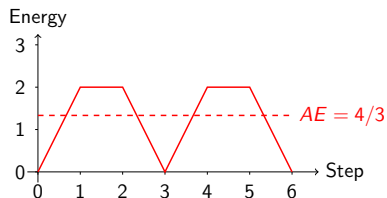
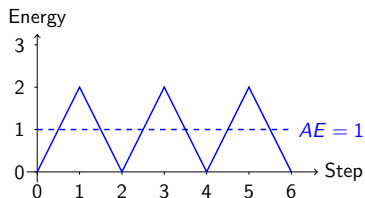
Average-energy (AE) *further refines* TP : average EL along a play.

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Average-energy (AE) *further refines TP*: average EL along a play.

⇒ **Natural concept** (cf. case study).

Average-energy: overview

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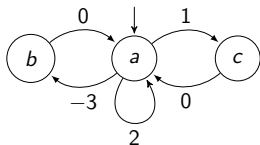
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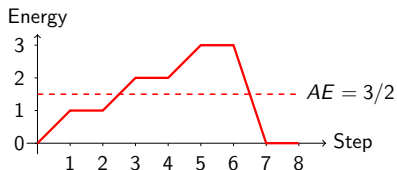
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- ▷ MP -hardness.

With LU energy constraints, memory is needed!

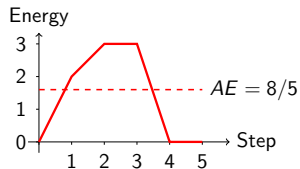
$AE_{LU} \rightsquigarrow$ minimize AE while keeping $EL \in [0, 3]$ (init. $EL = 0$).



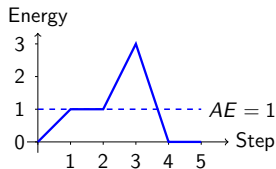
(a) One-player AE_{LU} game.



(b) Play $\pi_1 = (acacacab)^\omega$.



(c) Play $\pi_2 = (aacab)^\omega$.



(d) Play $\pi_3 = (acaab)^\omega$.

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

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Non-trivial behavior in general!

\hookrightarrow **Need to choose carefully which cycles to play.**

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The AE_{LU} problem is EXPTIME-complete.

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

\hookrightarrow Reduction from this AE game to MP game +
 pseudo-poly. algorithm.

What about L constraints?

One-player case only!

- Upper bound on the energy level, thanks to Lafourcade et al [LLT04]
- Results for AE_{LU} apply!
- Unfortunately hard to extend to two-player games

With energy constraints: results overview

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Status at Barbizon last year!

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AE_L	PSPACE-e./NP-h.	2-EXPTIME-e./EXPSPACE-h.	<i>super-exp.</i> (doubly exp.)

Thanks to a fresh idea by Piotr Hofman

Two-player games with L-constraints

The crux idea

If the average is low (smaller than t), then there must be a large number of configurations with energy level smaller than t !

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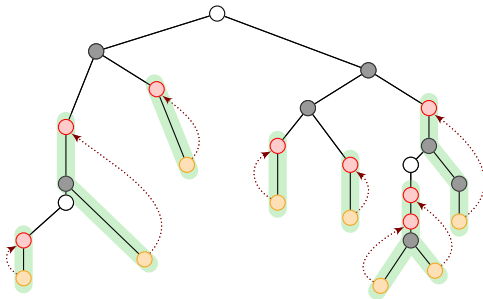
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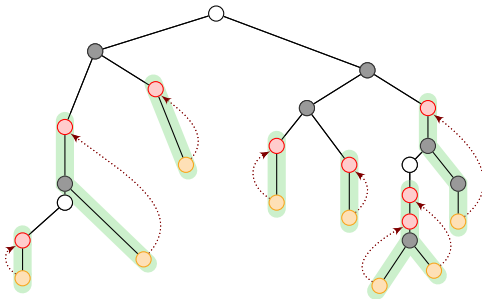
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- All (reachable) good cycles with no strict good sub-cycles have length bounded by $8t_1 t_2 (t+1)^3 |S|^2$

Seeing strategies as (finite) trees

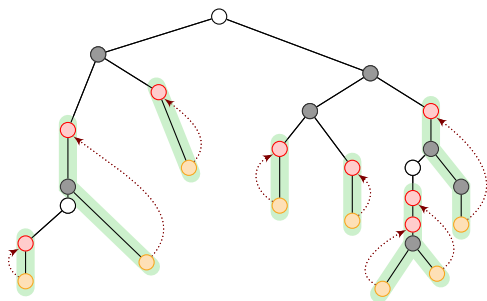


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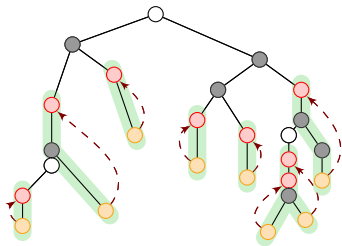
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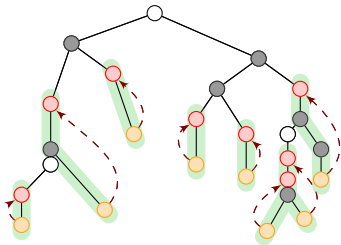
- A finite **good** tree represents a winning strategy
- Fix a winning strategy, and build a finite tree by “closing” minimal good cycles. We then have a finite good tree, hence a winning strategy!

What is missing?



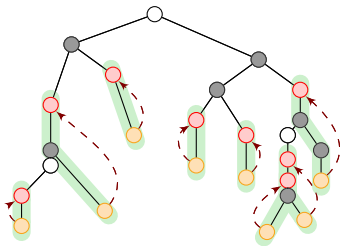
What is missing?

- energy level is bounded in green parts



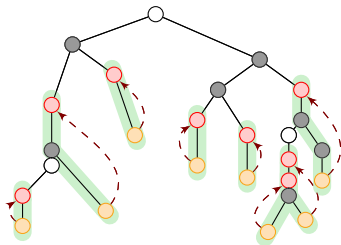
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- what about outside green parts?
 - ↳ better understand winning strategies in pushdown games
an original idea by [Wal01], revisited in [FZ12], from which we can derive a doubly-exponential upper bound on the energy level!



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- reduced to AE_{LU} problem!



With energy constraints: results overview

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	P	$NP \cap coNP$	memoryless
AE_{LU} (poly. U)	P	$NP \cap coNP$	polynomial
AE_{LU} (arbitrary)	PSPACE-c.	EXPTIME-c.	pseudo-polynomial
AE_L	PSPACE-e./NP-h.	2-EXPTIME-e./EXPSPACE-h.	<i>super-exp. (doubly exp.)</i>

Wrap-up

“New” quantitative objective.¹

- ▷ Yields natural payoff functions.
- ▷ AE “refines” TP (and MP).
- ▷ Same complexity class as EG_L , MP and TP games.
- ▷ AE_{LU} and AE_L now well-understood.
- ▷ Interesting proofs techniques.

¹Appeared in [TV87] as an alternative *total reward* definition but not studied until recently. See also [CP13, BEGM15].

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