

# Average-energy games

Patricia Bouyer-Decitre

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Based on joint works with:

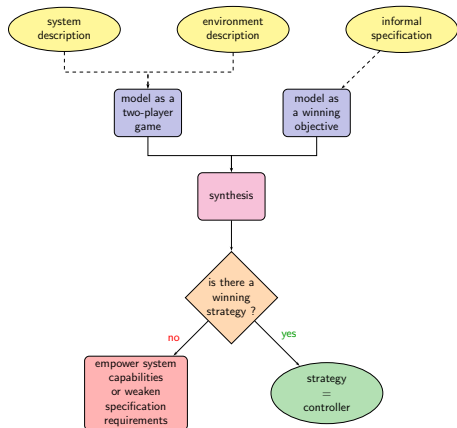
N. Markey, M. Randour  
K.G. Larsen, S. Laursen  
(*GandALF'15 / Acta Informatica*)

P. Hofman, N. Markey  
M. Randour, M. Zimmermann  
(*FoSSaCS'17*)

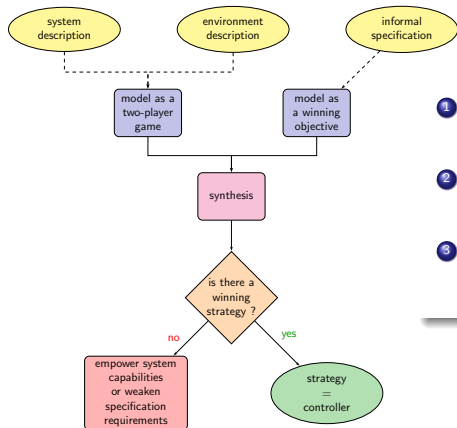
Thanks to Mickael for his slides!



# General context: strategy synthesis in quantitative games



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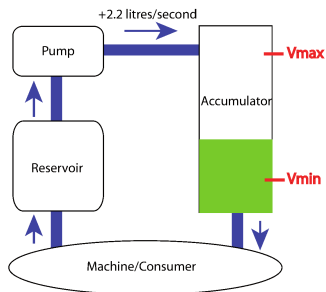


- 1 Can we decide if a winning strategy exists?
- 2 How complex such a strategy needs to be? Simpler is better...
- 3 Can we synthesize one efficiently?

~> Depends on the winning objective

# Motivating example

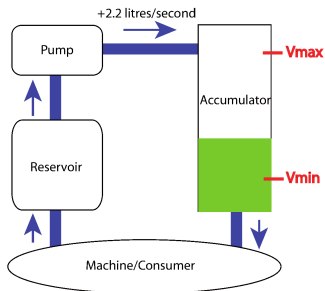
Hydac oil pump industrial case study (Quasimodo research project)



## Goals

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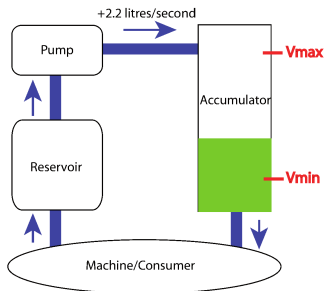


## Goals

- Keep the oil level in the safe zone
  - Energy objective with lower and upper bounds:  $EG_{LU}$

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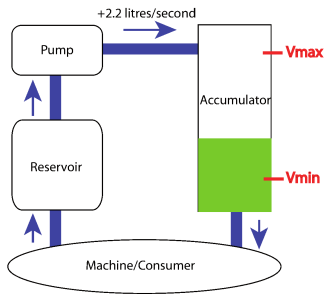


## Goals

- 1 Keep the oil level in the safe zone  
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- 2 Minimize the average oil level  
↳ Average-energy objective:  $AE$

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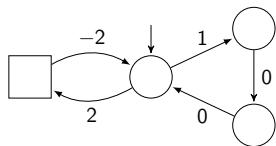
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↳ Average-energy objective:  $AE$
- 3 Conjunction:  $AE_{LU}$

# Outline

- 1 Average-energy games
- 2 Average-energy with energy constraints

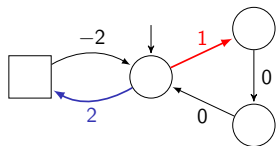


## Average-energy: illustration



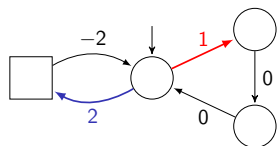
- Two-player turn-based games with integer weights

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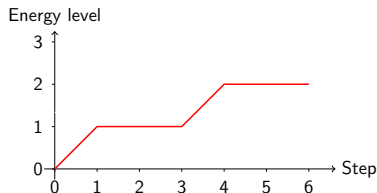
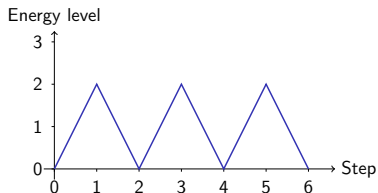
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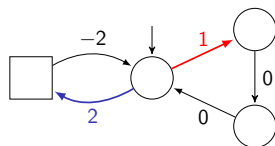


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~ We look at the **energy level** ( $EL$ ) along a play

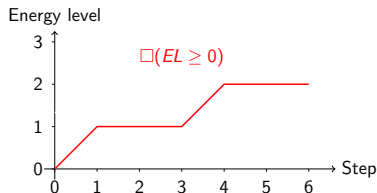
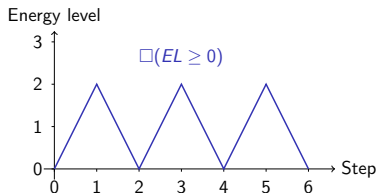


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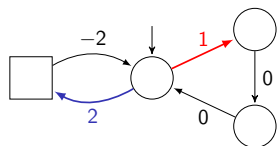
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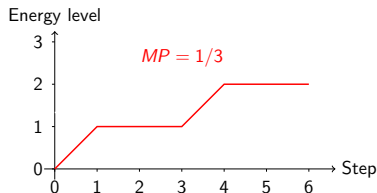
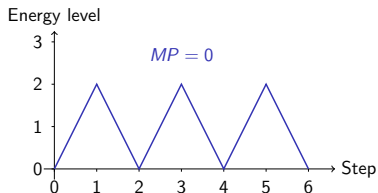
**Energy objective** ( $EG_L/EG_{LU}$ ): e.g., always maintain  $EL \geq 0$

# Average-energy: illustration



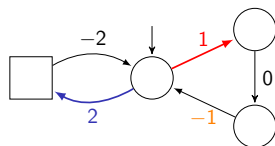
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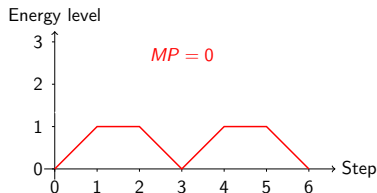
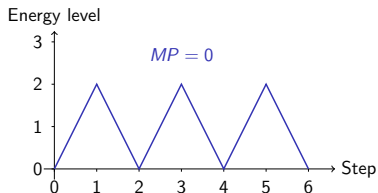
**Mean-payoff (MP):** long-run average payoff per transition

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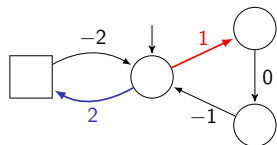
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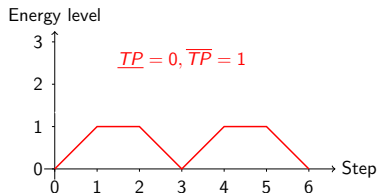
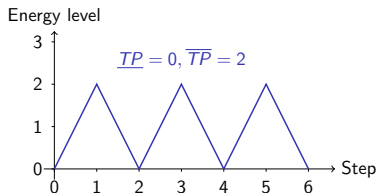
⇒ Let's change the weights of our game

## Average-energy: illustration



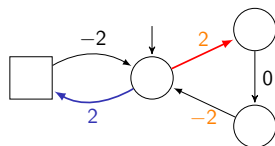
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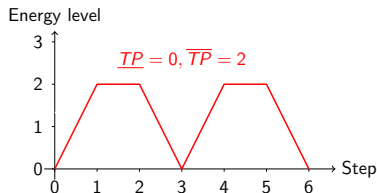
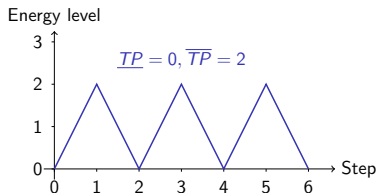
**Total-payoff (TP)** refines *MP* in the case  $MP = 0$  by looking at high/low points of the sequence

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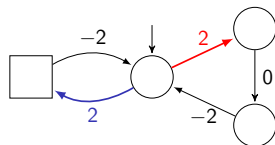


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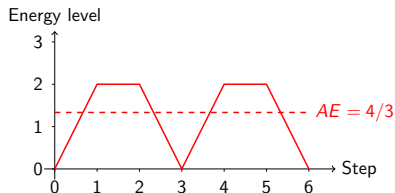
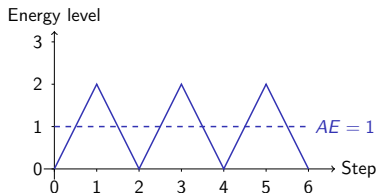


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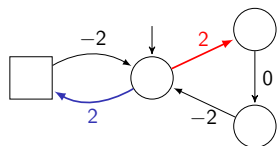
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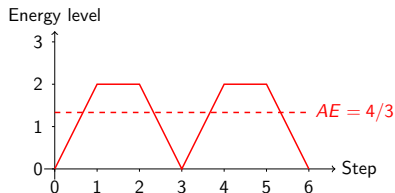
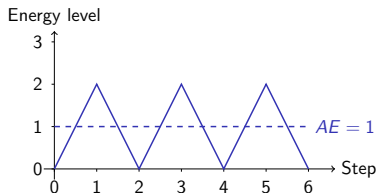
**Average-energy** ( $AE$ ) further refines  $TP$ : average  $EL$  along a play

## Average-energy: illustration



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

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

# Average-energy: overview

Objective	1-player	2-player	memory
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$EG_{LU}$	PSPACE-c. [FJ13]	EXPTIME-c. [BFL+08]	pseudo-polynomial

[Kar78] Karp. A characterization of the minimum cycle mean in a digraph (*Discrete Mathematics*)

[ZP96] Zwick, Paterson. The complexity of mean payoff games on graphs (*Theoretical Computer Science*)

[EM79] Ehrenfeucht, Mycielski. Positional strategies for mean payoff games (*Int. Journal of Game Theory*)

[FV97] Filar, Vrieze. Competitive Markov decision processes (*Springer*)

[GS09] Gawlitza, Seidl. Games through nested fixpoints (*CAV'09*)

[GZ04] Gimbert, Zielonka. When can you play positionally? (*MFCS'04*)

[BFL+08] Bouyer, Fahrenberg, Larsen, Markey, Srba. Infinite runs in weighted timed automata with energy constraints (*FORMATS'08*)

[CDHS03] Chakrabarti, De Alfaro, Henzinger, Stoelinga. Resource interfaces (*EMSOFT'03*)

[FJ13] Fearnley, Jurdziński. Reachability in two-clock timed automata is PSPACE-complete (*ICALP'13*)

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## Techniques

- Classical criteria **cannot be applied out-of-the-box** [EM79,BSV04,AR14,GZ04,Kop06]
  - ↪ we cannot mix nor shuffle cycles, but only 0-cycles!

[GZ04] Gimbert, Zielonka. When can you play positionally? (MFCS'04)

[EM79] Ehrenfeucht, Mycielski. Positional strategies for mean payoff games (Int. Journal of Game Theory)

[BSV04] Björklund, Sandberg, Vorobyov. Memoryless determinacy of parity and mean payoff games: A simple proof (Theoretical Computer Science)

[AR14] Aminof, Rubinfeld. First cycle games (SR'14)

[Kop06] Kopczynski. Half-positional determinacy of infinite games (ICALP'06)

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- *MP*-hardness



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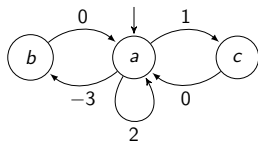
## Two settings

- ①  $AE_{LU}$ : AE with lower (0) and upper ( $U \in \mathbb{N}$ ) bounds
- ②  $AE_L$ : AE with only the lower bound (0)

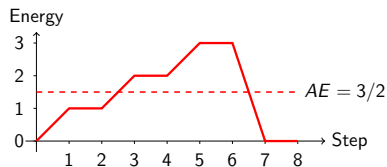
↪ Fixed initial credit  $c_{\text{init}} = 0$

# With LU energy constraints, memory is needed!

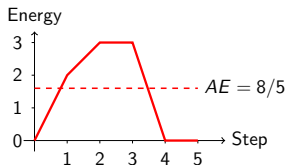
$AE_{LU} \rightsquigarrow$  minimize  $AE$  while keeping  $EL \in [0, 3]$  (init.  $EL = 0$ ).



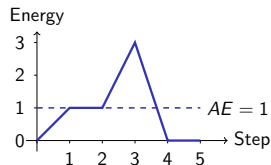
(a) One-player  $AE_{LU}$  game.



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



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



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

Minimal  $AE$  with  $\pi_3$ : alternating between the +1, +2 and -3 cycles

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Non-trivial behavior in general!

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### Result

The  $AE_{LU}$  problem is EXPTIME-complete.

- Reduction from  $AE_{LU}$  to  $AE$  on pseudo-polynomial game
- Reduction from this  $AE$  game to  $MP$  game + pseudo-poly. algorithm.

# Complexity results for $AE_{LU}$

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## What happens with only L-constraints?

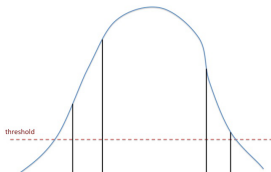
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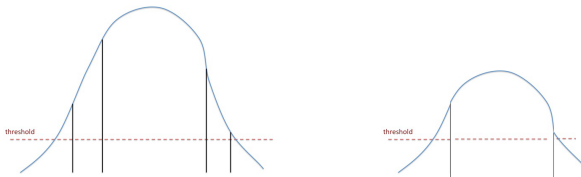


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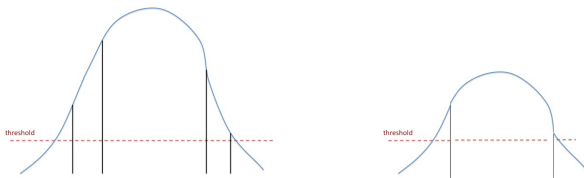


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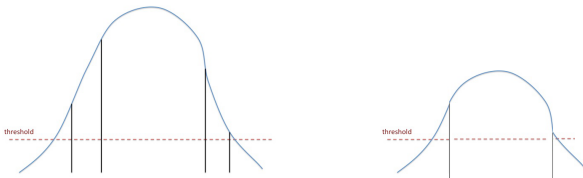
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This cannot easily be extended to two-player games...

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- There is a reachable cycle with average  $\leq t$  (called **good**)

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

Assume  $AE(\pi) \leq t$ :

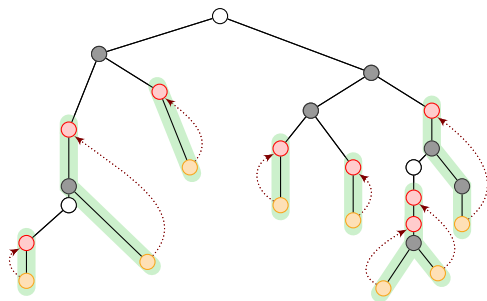
- $\exists \gamma \in \Gamma^{\leq t}$  s.t.  $\forall n, \exists^\infty n' \geq n$ ,

$$\text{density}(\gamma, \pi_{[n, n']}) \geq \frac{\tilde{t}}{4(t+1)^2 |S|}$$

- There is a reachable cycle with average  $\leq t$  (called **good**)
- All (reachable) good cycles with no strict good sub-cycles have length bounded by  $8t_1 t_2 (t+1)^3 |S|^2$



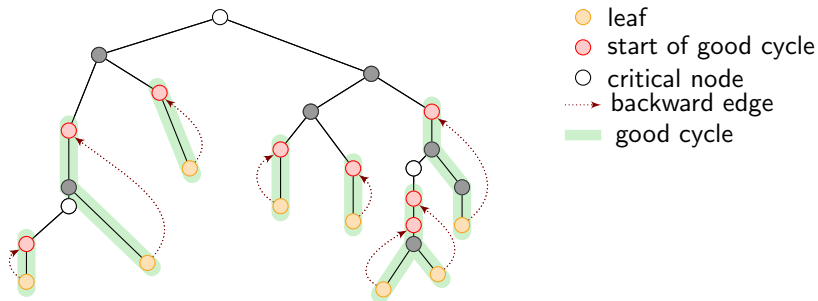
## Seeing strategies as (finite) trees



- leaf
- start of good cycle
- critical node
- backward edge
- good cycle



## Seeing strategies as (finite) trees



- 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!

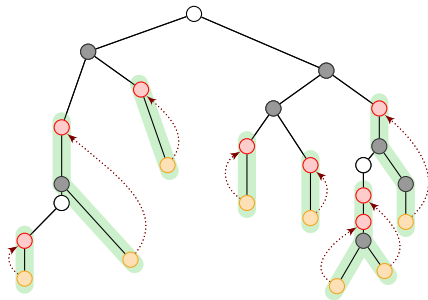






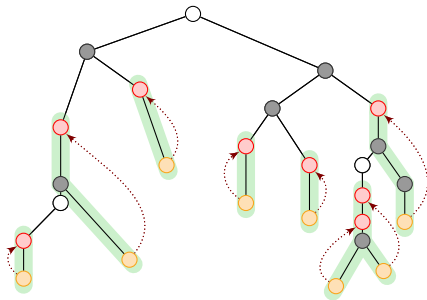
# What is missing?

- energy level is bounded in green parts (**good cycles**)
- what about white/gray parts?
  - ~ better understand winning strategies in **pushdown games**



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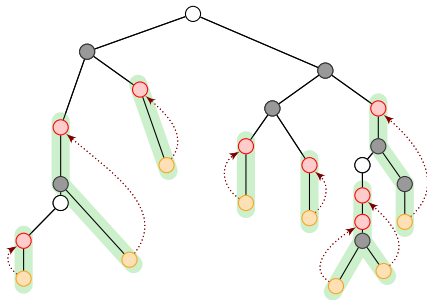
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  - ~ an original proof by [Wal01], revisited in [FZ12], from which we can derive a doubly-exponential upper bound on the energy level!





# What is missing?

- energy level is bounded in green parts (**good cycles**)
- what about white/gray parts?
  - ~ better understand winning strategies in **pushdown games**
  - ~ an original proof by [Wal01], revisited in [FZ12], from which we can derive a doubly-exponential upper bound on the energy level!
- 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]	$NP \cap coNP$ [CDHS03,BFL+08]	memoryless [CDHS03]
$EG_{LU}$	PSPACE-c. [FJ13]	EXPTIME-c. [BFL+08]	pseudo-polynomial
$AE$	P	$NP \cap coNP$	memoryless
$AE_{LU}$	PSPACE-c.	EXPTIME-c.	pseudo-polynomial
$AE_L$	PSPACE-e./NP-h.	2-EXPTIME-e./EXPSPACE-h.	super-exp. (doubly exp.)

↪ Lower bounds for  $AE_{LU}$  inferred from [Hun14,Hun15]

[Hun14] Hunter. Reachability in succinct one-counter games (CoRR abs/1407.1996)

[Hun15] Hunter. Reachability in succinct one-counter games (RP'15)

# Conclusion

- “New” quantitative objective  
Appeared in [TV87] as an alternative *total reward* definition but not studied until recently. See also [CP13,BEGM15]
- Yields natural payoff functions
- *AE* “refines” *TP* (and *MP*)
- Same complexity class as *EG<sub>L</sub>*, *MP* and *TP* games
- *AE<sub>LU</sub>* and *AE<sub>L</sub>* now well-understood

## Next...

- Investigate further that payoff function
- Investigate further mean-payoff pushdown games?
  - Undecidable in general
  - By-product of this work: decidable restricted subclass

[TV87] Thuijsman, Vrieze. The bad match; A total reward stochastic game (*IR Spektrum*)

[CP13] Chatterjee, Prabhu. Quantitative timed simulation functions and refinement metrics for real-time systems (*HSCC'13*)

[BEGM15] Boros, Elbassioni, Gurvich, Makino. Markov decision processes and stochastic games with total effective payoff (*STACS'15*)