# Average-Energy Games

Patricia Bouyer<sup>1</sup> Nicolas Markey<sup>2</sup> Mickael Randour<sup>3</sup> Kim G. Larsen<sup>4</sup> Simon Laursen<sup>4</sup>

<sup>1</sup>LSV - CNRS & ENS Cachan
<sup>2</sup>IRISA - CNRS Rennes
<sup>3</sup>ULB - Université libre de Bruxelles
<sup>4</sup>Aalborg University

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## Advertisement

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Bouyer, Markey, Randour, Larsen, Laursen

## General context: strategy synthesis in quantitative games



#### Average-Energy Games

#### Bouyer, Markey, Randour, Larsen, Laursen

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- **1** Keep the oil level in the safe zone.
  - → Energy objective with lower and upper bounds: EG<sub>LU</sub>

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  - $\hookrightarrow$  Average-energy objective: AE

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 $\Rightarrow$  **Conjunction**:  $AE_{LU}$ 



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



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



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

 $\implies$  Let's change the weights of our game.



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

### $\implies$ Let's change the weights again.

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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.

 $\implies$  Natural concept (cf. case study).

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 <sup>+</sup> 08]	pseudo-polynomial
AE	Р	$NP\capcoNP$	memoryless

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### Techniques:

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- ▷ MP-hardness.

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With energy constraints, memory is needed!

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



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

### With energy constraints, memory is needed!

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

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

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

### 

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

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

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

# With energy constraints: results overview

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MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
TP	P [FV97]	$NP \cap coNP \ [GS09]$	memoryless [GZ04]
EGL	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 <sub>LU</sub> (arbitrary)	EXPTIME-e./PSPACE-h.	EXPTIME-c.	pseudo-polynomial
$AE_L$	EXPTIME-e./NP-h.	open/EXPTIME-h.	open ( $\geq$ pseudo-poly.)

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AE <sub>LU</sub> (arbitrary)	EXPTIME-e./PSPACE-h.	EXPTIME-c.	pseudo-polynomial
AEL	EXPTIME-e./NP-h.	open/EXPTIME-h.	open ( $\geq$ pseudo-poly.)

⇒ Good news: we are closing in on the open problem and believe it to be EXPTIME-complete.

# Wrap-up

### "New" quantitative objective.<sup>1</sup>

- ▷ Practical motivations (e.g., HYDAC).
- $\triangleright$  "Refines" *TP* (and *MP*).
- $\triangleright$  Same complexity class as  $EG_L$ , MP and TP games.
- $\triangleright$  AE<sub>LU</sub> well-understood.
- $\triangleright$  Closing in on  $AE_L$ .

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

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# Thank you! Any question?

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