

# Bounding Average-Energy Games

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Computation Structures



## The talk in one slide

- Study of **average-energy** games: quantitative two-player games where the goal is to *minimize the average energy level in the long-run*.
- $AE$  games studied in [BMR<sup>+</sup>16], also in conjunction with energy constraints:  $EG_L$  or  $EG_{LU}$  (lower bound only, or lower + upper bounds).

### Goal of this work

Solving a problem left open in [BMR<sup>+</sup>16]: **two-player** games with conjunction of an  $AE$  constraint and an  $EG_L$  one, i.e.,  **$AE_L$  games**.

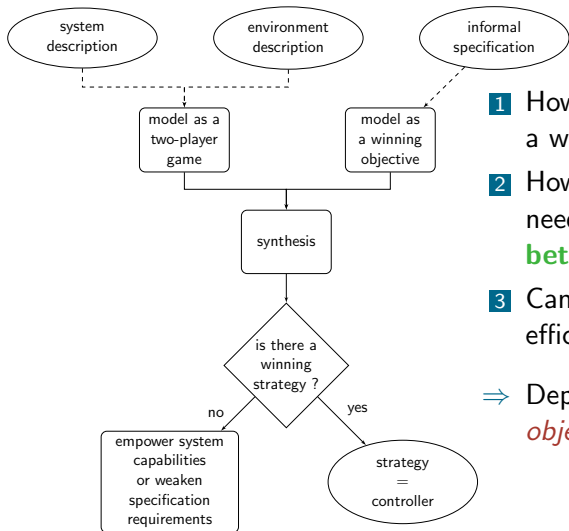
- ▷ To solve them, we make a detour by mean-payoff games on **infinite arenas**.
- ▷ We also consider **multi-dimensional extensions** of  $AE$  games.



- 1 Average-energy games
- 2 Average-energy games with lower-bounded energy
- 3 Multi-dimensional extensions
- 4 Conclusion

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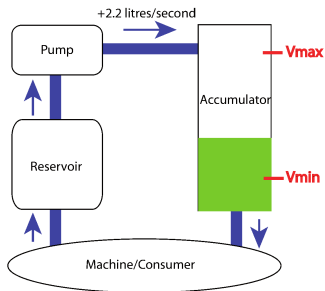
# General context: strategy synthesis in quantitative games



- 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 for average-energy

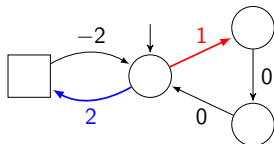
HYDAC oil pump industrial case study [CJL<sup>+</sup>09] (Quasimodo research project).



## Goals:

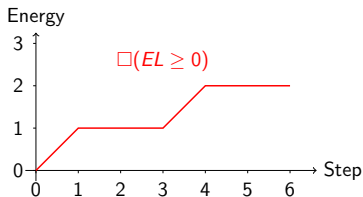
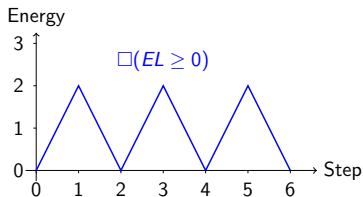
- 1 Keep the oil level in the safe zone.  
↳ **Energy objective with lower and upper bounds:  $EG_{LU}$**
  - 2 Minimize the average oil level.  
↳ **Average-energy objective:  $AE$**
- ⇒ **Conjunction:  $AE_{LU}$**

## Average-energy: illustration



- Two-player turn-based games with integer weights.
- Focus on two *memoryless* strategies.

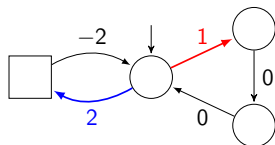
⇒ We look at the **energy level (EL)** along a play.



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

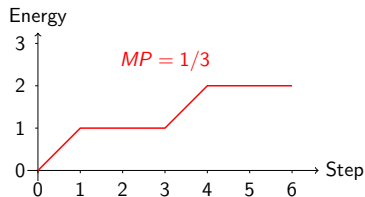
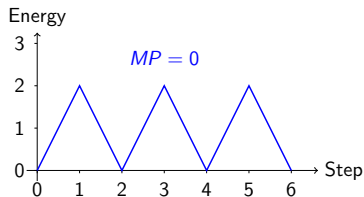


## Average-energy: illustration



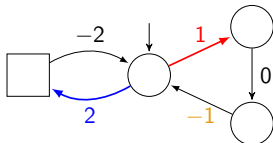
- Two-player turn-based games with integer weights.
- Focus on two *memoryless* strategies.

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



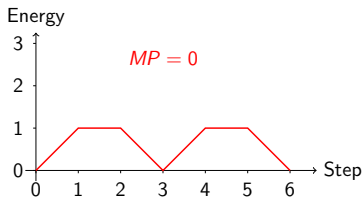
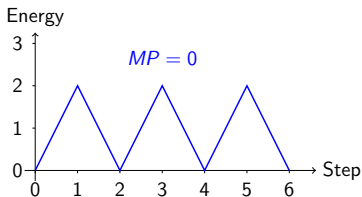
**Mean-payoff** ( $MP$ ): long-run average payoff per transition.

## Average-energy: illustration



- Two-player turn-based games with integer weights.
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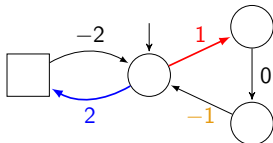
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**Mean-payoff (MP):** long-run average payoff per transition.

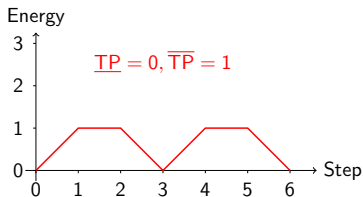
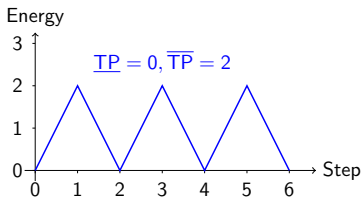
⇒ **Let's change the weights of our game.**

## Average-energy: illustration



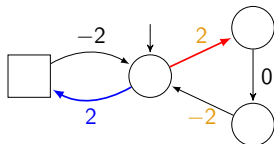
- Two-player turn-based games with integer weights.
- Focus on two *memoryless* strategies.

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



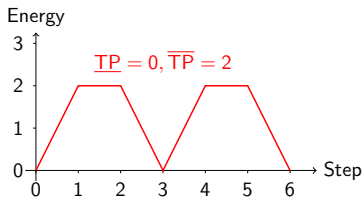
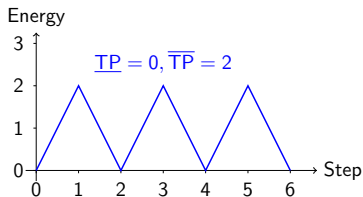
**Total-payoff (TP)** *refines MP* in the case  $MP = 0$  by looking at high/low points of the sequence.

## Average-energy: illustration



- Two-player turn-based games with integer weights.
- Focus on two *memoryless* strategies.

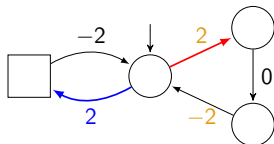
⇒ We look at the **energy level (EL)** along a play.



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

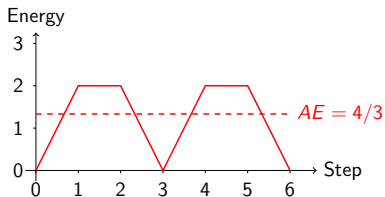
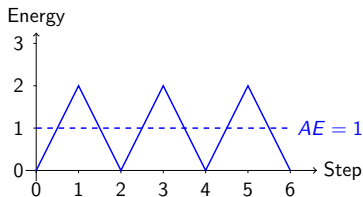
⇒ **Let's change the weights again.**

## Average-energy: illustration



- Two-player turn-based games with integer weights.
- Focus on two *memoryless* strategies.

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



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

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

## Formal definitions

- We consider games  $G = (S_0, S_1, E)$  between players  $P_0$  and  $P_1$ , such that each edge  $e \in E$  has an integer weight  $w(e)$ .
- For a prefix  $\rho = (e_i)_{1 \leq i \leq n}$ , we define
  - its *energy level* as  $EL(\rho) = \sum_{i=1}^n w(e_i)$ ;
  - its *mean-payoff* as  $MP(\rho) = \frac{1}{n} \sum_{i=1}^n w(e_i) = \frac{1}{n} EL(\rho)$ ;
  - its *average-energy* as  $AE(\rho) = \frac{1}{n} \sum_{i=1}^n EL(\rho_{\leq i})$ .
- **Natural extensions to plays** by taking the upper-limit, e.g.,

$$\overline{AE}(\pi) = \limsup_{n \rightarrow \infty} \frac{1}{n} \sum_{i=1}^n EL(\pi_{\leq i}).$$

## Overview of known results

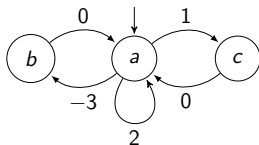
Objective	1-player	2-player	memory
$MP$	P [Kar78]	$NP \cap coNP$ [ZP96]	memoryless [EM79]
$TP$	P [FV97]	$NP \cap coNP$ [GS09]	memoryless [GZ04]
$EG_L$	P [BFL <sup>+</sup> 08]	$NP \cap coNP$ [CdAHS03, BFL <sup>+</sup> 08]	memoryless [CdAHS03]
$EG_{LU}$	PSPACE-c. [FJ15]	EXPTIME-c. [BFL <sup>+</sup> 08]	exponential
$AE$	P	$NP \cap coNP$	memoryless
$AE_{LU}$	PSPACE-c.	EXPTIME-c.	exponential
$AE_L$	PSPACE-e./NP-h.	<i>open</i> /EXPTIME-h.	<i>open</i> ( $\geq exp.$ )

- ▷ Results without references are proved in [BMR<sup>+</sup>16].
- ▷ The one-player  $AE_L$  case is solved by **reduction to an  $AE_{LU}$  game for a sufficiently large upper bound  $U$** , obtained through results on one-counter automata that permit to bound the counter value along a path.

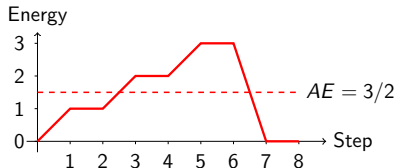
⇒ **Let's first recall how we solve  $AE_{LU}$  games.**

# With energy constraints, memory is needed!

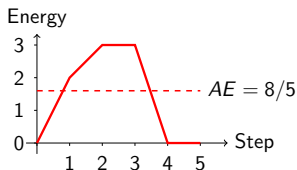
$AE_{LU} \rightsquigarrow$  minimize  $AE$  while keeping  $EL \in [0, 3]$  (init.  $EL = 0$ ).



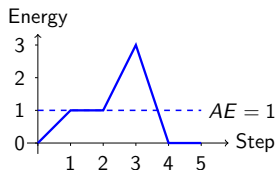
(a) One-player  $AE_{LU}$  game.



(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.



## With energy constraints, memory is needed!

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

**Non-trivial behavior in general!**

↪ **Need to choose carefully which cycles to play.**

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

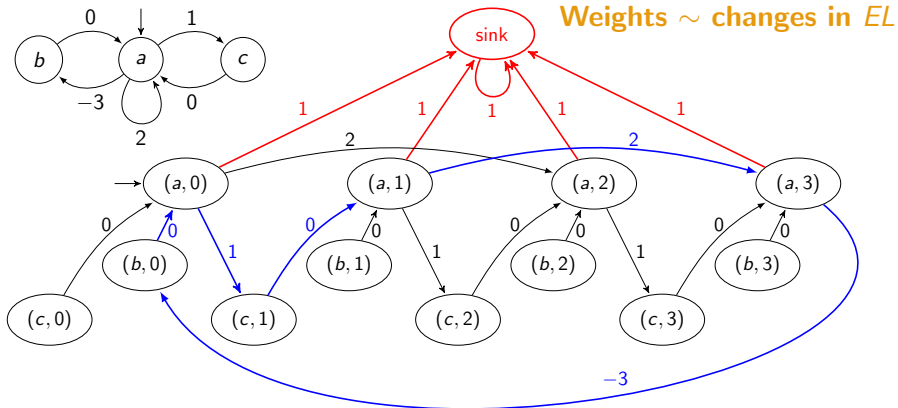
↪ Reduction from  $AE_{LU}$  to  $AE$  on pseudo-polynomial game  
 ( $\implies AE_{LU} \in \text{NEXPTIME} \cap \text{coNEXPTIME}$ ).

↪ Reduction from this  $AE$  game to  $MP$  game +  
 pseudo-poly. algorithm.

## AE<sub>L</sub>U problem: reduction to AE

↪ Expanded graph constraining the game within the energy bounds  $[0, U]$ . **Pseudo-polynomial size:**  $\mathcal{O}(|S| \cdot (U + 1))$ .

↪ If we go out, **AE** =  $\infty$ .



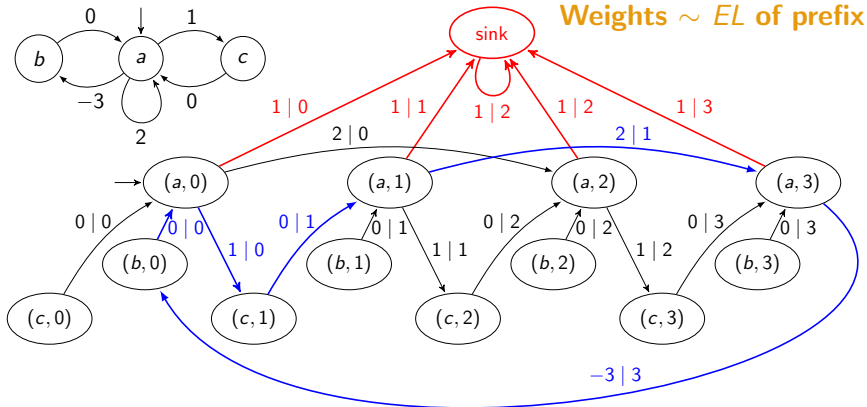
minimal AE  $\wedge EL \in [0, 3]$  in  $G \iff$  minimal AE in  $G'$

## AE<sub>L</sub>U problem: further reduction to MP

↪ Expanded graph of pseudo-poly. size:  $\mathcal{O}(|S| \cdot (U + 1))$ .

Threshold for AE:  $t = 1$ .

↪ If we go out,  $MP = \lceil t \rceil + 1 > t \Rightarrow$  losing.



If  $\neg(\diamond \text{sink})$ :  $\overline{AE}(\pi)$  in  $G' = \overline{MP}(\pi)$  in  $G''$

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## Tackling the two-player $AE_L$ case

### Aim of our approach

Obtain an energy upper bound  $U$  sufficient to **reduce two-player  $AE_L$  games to  $AE_{LU}$  games.**

- ▷ The approach used for one-player games does not suffice: we cannot modify **plays** directly because of  $P_1$ , the adversary.
- ▷ Defining an appropriate notion of **self-covering tree** (e.g., [CRR14]) and using it directly is difficult due to the complexity of the  $AE$  payoff (w.r.t. mean-payoff for example).

### Idea

As in the  $AE_{LU}$  case, we will transform the  $AE_L$  game to an  $MP$  game on an expanded graph, with a similar construction.

⇒ **Problem: this graph will be infinite!**

## From an $AE_L$ game to an infinite $MP$ one

Given  $G = (S_0, S_1, E)$ ,  $s_{\text{init}} \in S$  and  $AE$  threshold  $t \in \mathbb{Q}$ , we define the  $MP$  game  $G' = (\Gamma_0, \Gamma_1, \Delta)$ :

- $\Gamma_0 = S_0 \times \mathbb{N}$  and  $\Gamma_1 = S_1 \times \mathbb{N} \cup \{\perp\}$ ;
- $\Delta$  is given by:
  - $((s, c), c', (s', c')) \in \Delta$  if  $\exists (s, w, s') \in E$  with  $c' = c + w \geq 0$ ,
  - $((s, c), \lceil t \rceil + 1, \perp) \in \Delta$  if  $\exists (s, w, s') \in E$  with  $c + w < 0$ ,
  - $(\perp, \lceil t \rceil + 1, \perp) \in \Delta$ .

⇒ **Essentially the same construction as before, but with energy only bounded from below.**

### Equivalence

$P_0$  has a winning strategy in  $G$  for  $AE_L$  with threshold  $t$  iff  $P_0$  has a winning strategy in  $G'$  for  $MP$  with threshold  $t$ .

⇒ **From now on, we consider the  $MP$  game.**

## Solving the infinite $MP$ game

So, it suffices to solve the  $MP$  game. . .

- ▶ Not much is known about *infinite*  $MP$  game.
- ▶ Our game has a *special structure*: its graph can be seen as the configuration graph of a one-counter pushdown system, where the stack height corresponds to the  $EL$  and the weight of an edge is given by the stack height of the target configuration.

⇒ **Problem:  $MP$  games on pushdown systems with bounded weight functions are already undecidable [CV12], and our weight function is unbounded. . .**

⇒ **We need to use the special structure!**

## Sketch of our approach (1/2)

### Goal

Prove that if a winning strategy exists, there exists one that wins while keeping the energy below a given bound  $U$ .

- 1 Along a winning play for  $MP$ , configurations below threshold  $t$  must be visited *frequently*.

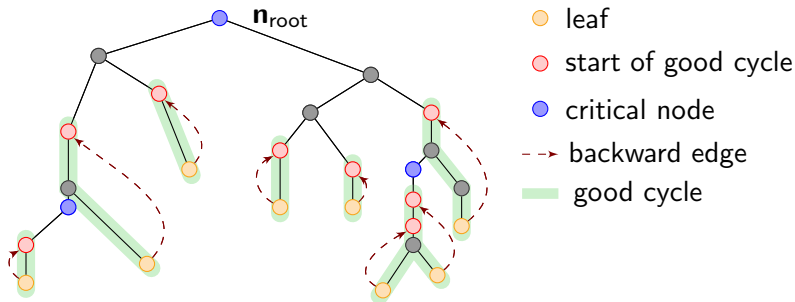
⇒ **Proved through a density argument.**

- 2 Refining the analysis, we give an exponential (in the encoding) upper-bound on the **length of the shortest good cycle** along a winning play.

**Good cycle:  $MP \leq t$  and from a configuration below  $t$ .**



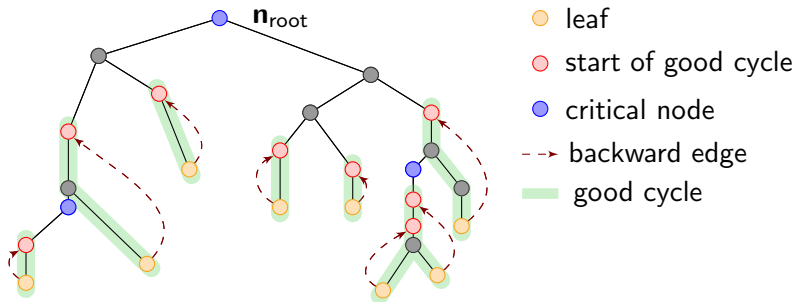
## Sketch of our approach (2/2)



- 3 We define *finite good strategy trees*, which induce finite-memory winning strategies.
- 4 We prove that *any* winning strategy induces a finite good strategy tree.

⇒ **We need to bound the energy level in such a good strategy tree.**

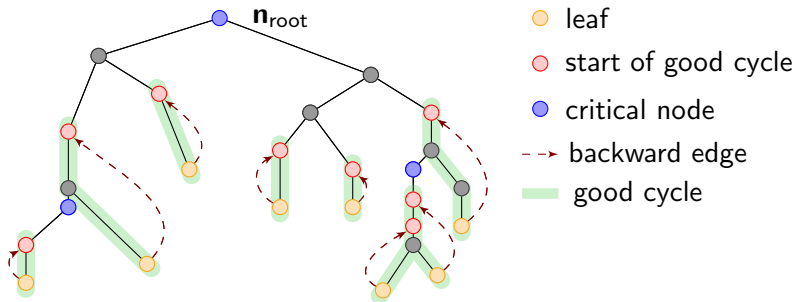
## Sketch of our approach (2/2)



- 5 We build the strategy tree for a strategy  $\sigma$  by considering the shortest good cycles, hence the **good cycles are already of bounded length (exponential)** by Item 2.

⇒ **We need to bound the remaining (i.e., gray) parts.**

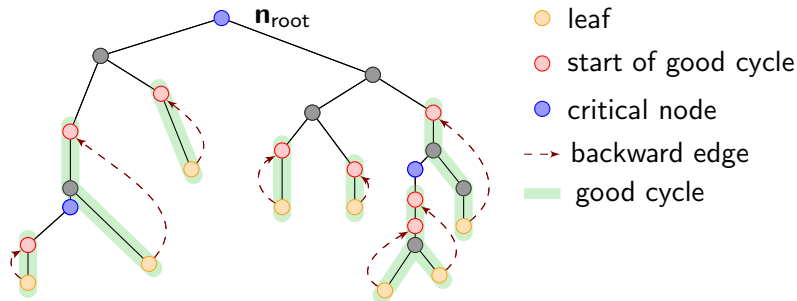
## Sketch of our approach (2/2)



- 6 We consider reachability on our graph (a particular pushdown game) and show that we can bound the energy needed by strategies going from a critical node to the starting nodes of good cycles (by a double-exponential in the encoding).

⇒ We “replace” the strategy described by our tree in those gray parts by one with bounded energy.

## Sketch of our approach (2/2)



⇒ Overall: we obtain that a doubly-exponential bound on the energy suffices to win the  $MP$  game.

⇒ Applying the  $AE_{LU}$  reduction for this bound, we obtain 2-EXPTIME membership of  $AE_L$  games.

## AE<sub>L</sub> games: summary

Objective	1-player	2-player	memory
MP	P [Kar78]	NP ∩ coNP [ZP96]	memoryless [EM79]
TP	P [FV97]	NP ∩ coNP [GS09]	memoryless [GZ04]
EG <sub>L</sub>	P [BFL <sup>+</sup> 08]	NP ∩ coNP [CdAHS03, BFL <sup>+</sup> 08]	memoryless [CdAHS03]
EG <sub>LU</sub>	PSPACE-c. [FJ15]	EXPTIME-c. [BFL <sup>+</sup> 08]	pseudo-polynomial
AE	P	NP ∩ coNP	memoryless
AE <sub>LU</sub>	PSPACE-c.	EXPTIME-c.	exponential
AE <sub>L</sub>	PSPACE-e./NP-h.	2-EXPTIME-e./EXPSPACE-h.	doubly-exp./super-exp.

- ▷ EXPTIME for unary encoding or polynomial weights and thresholds.
- ▷ Memory upper bound follows from our reduction, lower bound is by encoding of a succinct one-counter game [Hun14].
- ▷ EXPSPACE-hardness is also through reduction from succinct one-counter games [Hun15].

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## Multi-dimensional variants of $AE$ games

We considered extensions to multiple dimensions (i.e., vectors of weights, bounds and thresholds) of three classes of games:

- 1  $AE$  games (without energy bounds),
- 2  $AE_{LU}$  games,
- 3  $AE_L$  games.

⇒ We give a quick overview here.

## Multi-dimensional AE games

**Reminder:** one-dimensional version is in  $NP \cap coNP$  and memoryless strategies suffice.

### Undecidability

AE games with **3 or more dimensions** are undecidable.

$\implies$  We prove it via *two-dimensional robot games* [NPR16].

### Robot game

$R = (\{q_0\}, \{q_1\}, T)$  where  $T \subseteq Q \times [-V, V]^2 \times Q$  for some  $V \in \mathbb{N}$ , and  $q_i$  belongs to  $P_i$ . The game starts in  $q_0$  with counter values  $(x_0, y_0) \in \mathbb{Z}^2$  and  $P_0$  tries to reach  $(q_0, (0, 0))$ .



## Multi-dimensional $AE_{LU}$ games

**Reminder:** one-dimensional version is EXPTIME-c. and exponential-memory strategies suffice.

### Decidability

Multi-dim.  $AE_{LU}$  games are in  $NEXPTIME \cap coNEXPTIME$ .

We generalize the construction seen before: *reduction to MP game over an expanded graph*. Two differences:

- ▷ graph is now exponential in the number of dimensions,
- ▷ multi-dim. *limsup MP* games are in  $NP \cap coNP$  [VCD<sup>+</sup>15].

## Multi-dimensional $AE_L$ games

**Reminder:** one-dimensional version is in 2-EXPTIME and doubly-exponential-memory strategies suffice.

### Undecidability

$AE_L$  games with 2 or more dimensions are undecidable.

⇒ We prove it via *two-counter machines*, with a proof similar to the one for total-payoff games [CDRR15].

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## Wrap-up

- We solved the **open case** from [BMR<sup>+</sup>16]: two-player  $AE_L$  games. We proved:
  - ▷ 2-EXPTIME membership,
  - ▷ EXPSPACE-hardness,
  - ▷ almost-tight memory bounds (doubly-exp. vs. super exp.).
- As a by-product, we solved a **specific class of mean-payoff (one-counter) pushdown game with unbounded weight function**.
  - ⇒ Could be interesting to investigate if we can solve larger classes with similar techniques.
- In the multi-dimensional case, we proved that **only  $AE_{LU}$  games remain decidable**.

Thank you! Any question?

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