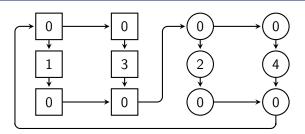
# Easy to Win, Hard to Master: Playing Parity Games with Costs Optimally

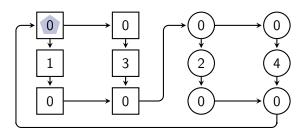
Joint work with Alexander Weinert (Saarland University)

Martin Zimmermann

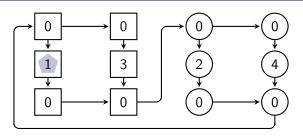
Saarland University

December 16th, 2016 AVeRTS 2016, Chennai, India

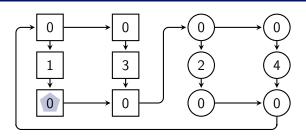




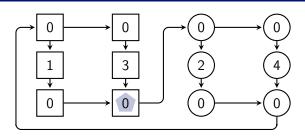
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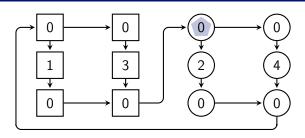
 $0 \rightarrow 1$ 



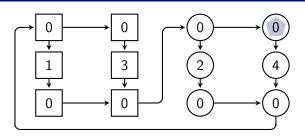
$$0 \rightarrow 1 \rightarrow 0$$



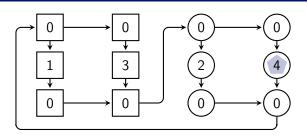
$$0 \rightarrow 1 \rightarrow 0 \rightarrow 0$$



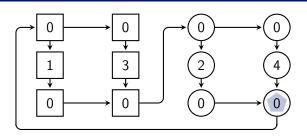
$$0 \rightarrow 1 \rightarrow 0 \rightarrow 0 \longrightarrow 0$$



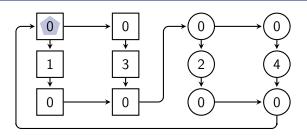
$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0$$



$$0 \rightarrow 1 \rightarrow 0 \rightarrow 0 \longrightarrow 0 \rightarrow 4$$

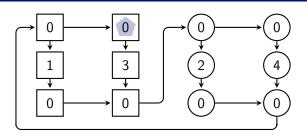


$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0$$



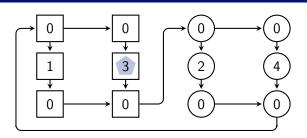
$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0$$

$$\downarrow 0$$



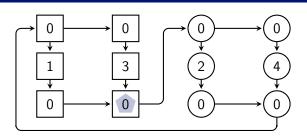
$$0 \to 1 \to 0 \to 0 \longrightarrow 0 \to 0 \to 4 \to 0$$

$$0 \to 0$$



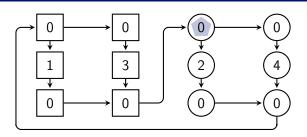
$$0 \to 1 \to 0 \to 0 \longrightarrow 0 \to 0 \to 4 \to 0$$

$$0 \to 0 \to 3$$



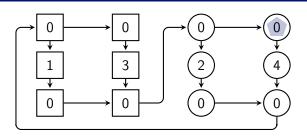
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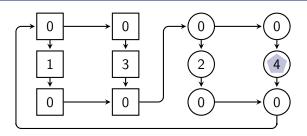
$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0$$

$$0 \longrightarrow 0 \longrightarrow 3 \longrightarrow 0 \longrightarrow 0$$



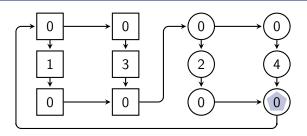
$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0$$

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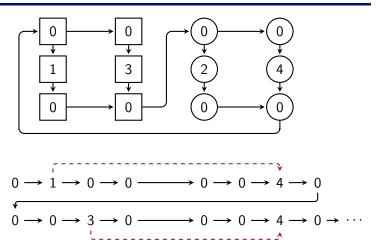
$$0 \longrightarrow 1 \longrightarrow 0 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0$$

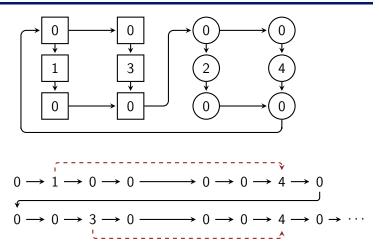
$$0 \longrightarrow 0 \longrightarrow 3 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4$$



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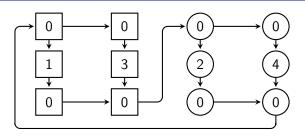
$$0 \longrightarrow 0 \longrightarrow 3 \longrightarrow 0 \longrightarrow 0 \longrightarrow 4 \longrightarrow 0 \longrightarrow \cdots$$

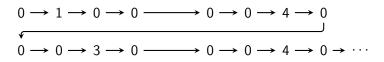




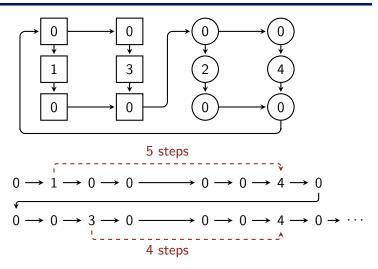
■ Various applications:  $\mu$ -calculus model checking, Rabin's theorem, reactive synthesis, alternating automata,...

# **Finitary Parity Games**

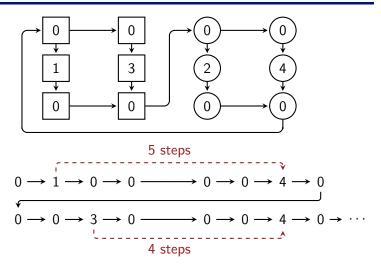




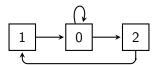
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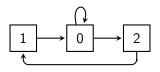


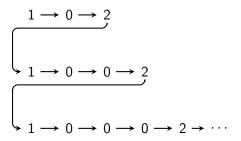
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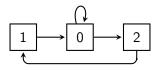


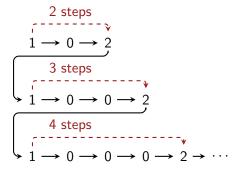
■ A quantitative strengthening of parity games.

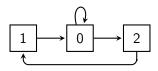


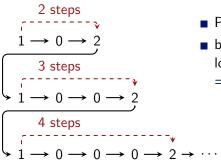












- Player 1 wins from every vertex,
- but needs to stay longer and longer in vertex of color 0.
  - $\Rightarrow$  requires infinite memory.

#### **Previous Work**

- Parity: Almost all requests are answered.
- Finitary Parity: There is a bound *b* such that almost all requests are answered within *b* steps.

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Parity	UP∩co-UP	Memoryless	Memoryless
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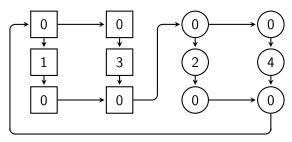
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Finitary Parity	PTime	Memoryless	Infinite

#### **Corollary**

If Player 0 wins a finitary parity game G, then a uniform bound  $b \le |G|$  suffices.

A trivial example shows that the upper bound  $|\mathcal{G}|$  is tight.

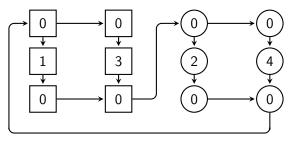
## **Back to the Example**



Answering requests as soon as possible requires memory.

- Every request can be answered within four steps:
  - a 1 by a 2
  - a 3 by a 4
  - $\Rightarrow$  requires one bit of memory.

#### Back to the Example



Answering requests as soon as possible requires memory.

- Every request can be answered within four steps:
  - a 1 by a 2
  - a 3 by a 4
  - $\Rightarrow$  requires one bit of memory.
- But answering a 1 by a 4 takes five steps.
  - $\Rightarrow$  every memoryless strategy has at least *cost* 5.

# **Playing Finitary Parity Games Optimally**

#### Questions

- 1. How much memory is needed to play finitary parity games optimally?
- **2.** How hard is it to determine the optimal bound *b* for a finitary parity game?
- **3.** There is a tradeoff between size and cost of strategies! What is its extent?

#### **Outline**

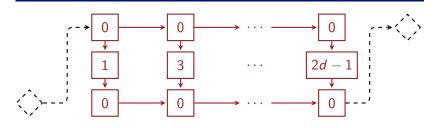
- 1. Memory Requirements of Optimal Strategies
- 2. Determining Optimal Bounds is Hard
- 3. Trading Memory for Quality and Vice Versa
- 4. Generalizations
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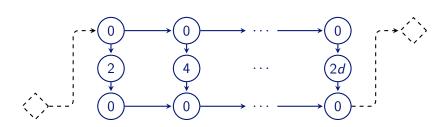
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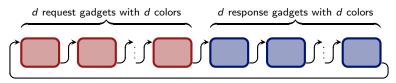
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# **Memory Requirements**



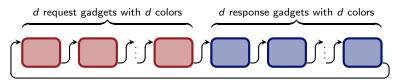


# **Memory Requirements**



- Player 0 has winning strategy with cost  $d^2 + 2d$ : answer j-th unique request in j-th response-gadget.
  - $\Rightarrow$  requires exponential memory (in d).
- Against a smaller strategy Player 1 can enforce a larger cost, as Player 0 cannot store every sequence of requests.

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  - $\Rightarrow$  requires exponential memory (in d).
- Against a smaller strategy Player 1 can enforce a larger cost, as Player 0 cannot store every sequence of requests.

#### Theorem

For every d>1, there exists a finitary parity game  $\mathcal{G}_d$  such that

- ullet  $|\mathcal{G}_d| \in \mathcal{O}(d^2)$  and  $\mathcal{G}_d$  has d odd colors, and
- every optimal strategy for Player 0 has at least size  $2^d 2$ .

# **Outline**

- 1. Memory Requirements of Optimal Strategies
- 2. Determining Optimal Bounds is Hard
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## **PSPACE-Hardness**

### Lemma

The following problem is PSPACE-hard: "Given a finitary parity game  $\mathcal{G}$  and a bound  $b \in \mathbb{N}$ , does Player 0 have a strategy for  $\mathcal{G}$  whose cost is at most b?"

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### **Proof**

- By a reduction from QBF (w.l.o.g. in CNF).
- Checking the truth of  $\varphi = \forall x \exists y. \ (x \lor \neg y) \land (\neg x \lor y)$  as a two-player game (Player 0 wants to prove truth of  $\varphi$ ):

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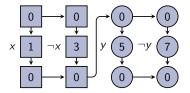
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- Checking the truth of  $\varphi = \forall x \exists y. \ (x \lor \neg y) \land (\neg x \lor y)$  as a two-player game (Player 0 wants to prove truth of  $\varphi$ ):
  - **1.** Player 1 picks truth value for *x*.
  - **2.** Player 0 picks truth value for y.
  - **3.** Player 1 picks clause *C*.
  - **4.** Player 0 picks literal  $\ell$  from C.
  - **5.** Player 0 wins  $\Leftrightarrow \ell$  is picked to be satisfied in step 1 or 2.

$$\varphi = \forall x \exists y . (x \lor \neg y) \land (\neg x \lor y)$$

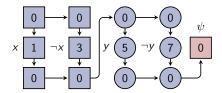
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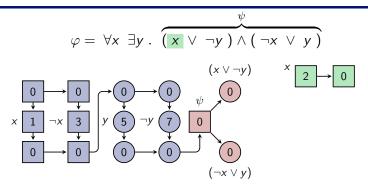
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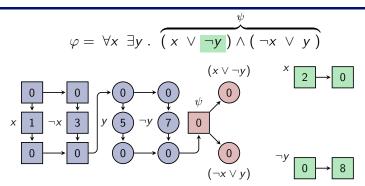
$$x \downarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0$$

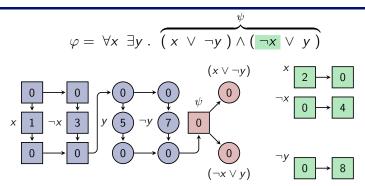
$$x \downarrow 1 \rightarrow x \downarrow 3 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0$$

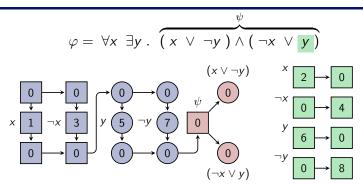
$$x \downarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0$$

$$(\neg x \lor y)$$



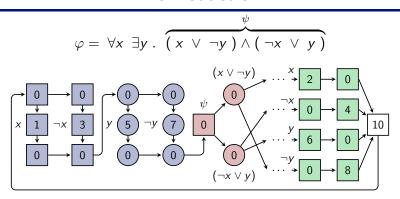


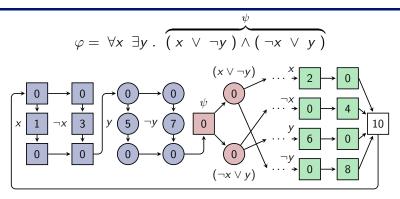


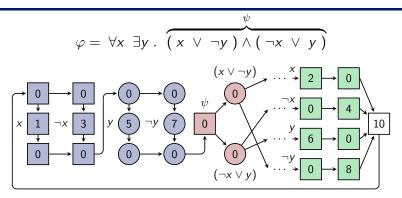


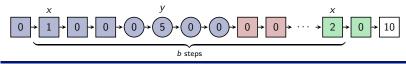
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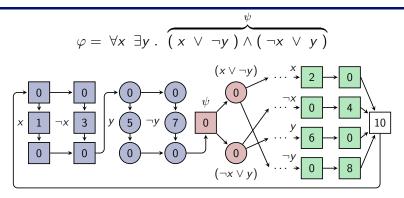
$$\downarrow 0 \qquad \downarrow 0 \qquad \downarrow$$

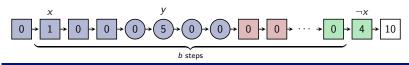


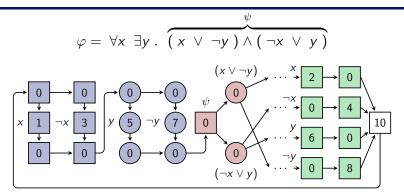


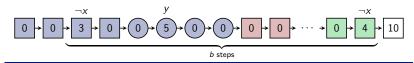












# **PSPACE-Membership**

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### **Proof Sketch**

Fix  $\mathcal{G}$  and b (w.l.o.g.  $b \leq |\mathcal{G}|$ ).

1. Construct equivalent parity game  $\mathcal{G}'$  storing the costs of open requests (up to bound b) and the number of overflows (up to bound  $|\mathcal{G}|) \Rightarrow |\mathcal{G}'| \in |\mathcal{G}|^{\mathcal{O}(d)}$ .

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- **2.** Define equivalent finite-duration variant  $\mathcal{G}'_f$  of  $\mathcal{G}'$  with polynomial play-length.
- 3.  $\mathcal{G}_f'$  can be solved on alternating polynomial-time Turing machine.
- **4.** APTIME = PSPACE concludes the proof.

# **Upper Bounds on Memory**

Equivalence between finitary parity game  $\mathcal{G}$  w.r.t. bound b and parity game  $\mathcal{G}'$  yields upper bounds on memory requirements.

# **Corollary**

Let  $\mathcal{G}$  be a finitary parity game with costs with d odd colors. If Player 0 has a strategy for  $\mathcal{G}$  with cost b, then she also has a strategy with cost b and size  $(b+2)^d = 2^{d \log(b+2)}$ .

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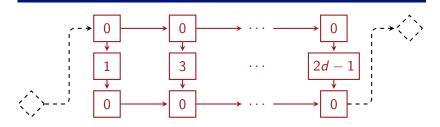
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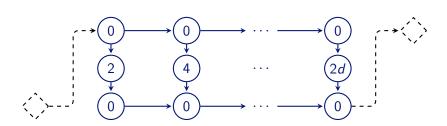
- $\blacksquare$  Recall: lower bound  $2^d$ .
- The same bounds hold for Player 1.

## **Outline**

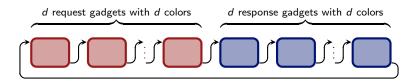
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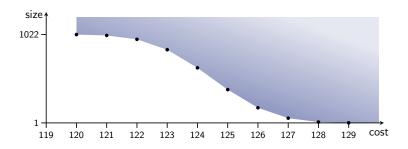
- Recall: Player 0 has winning strategy with cost  $d^2 + 2d$ : answer j-th unique request in j-th response-gadget, which requires memory of size  $2^d 2$ .
- Only store first *i* unique requests, then go to largest answer in next gadget.
  - $\Rightarrow$  achieves cost  $d^2 + 3d i$  and size  $\sum_{j=1}^{i-1} {d \choose j}$ .
- Against a smaller strategy Player 1 can enforce a larger cost, as Player 0 cannot store every sequence of *i* requests.

# **Tradeoffs**

### **Theorem**

Fix some finitary parity game  $\mathcal{G}_d$  as before. For every i with  $1 \leq i \leq d$  there exists a strategy  $\sigma_i$  for Player 0 in  $\mathcal{G}_d$  such that  $\sigma_i$  has cost  $d^2 + 3d - i$  and size  $\sum_{j=1}^{i-1} {d \choose j}$ .

Also, every strategy  $\sigma'$  for Player 0 in  $\mathcal{G}_d$  whose cost is at most the cost of  $\sigma_i$  has at least the size of  $\sigma_i$ .



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## **Generalizations 1: Cost**

## **Parity Games with costs**

- In a finitary parity game, every edge has unit cost.
- In parity games with costs, allow arbitrary weights from  $\mathbb{N}$ .
- Subsumes parity games (cost zero for every edge) and finitary parity games (cost one for every edge) as special cases.

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### New challenges:

- Arbitrarily long infixes of cost zero have to be dealt with.
  - ⇒ Use techniques for parity games.
- A binary encoding of the weights only allows an exponential upper bound on the cost of an optimal strategy.
  - $\Rightarrow$  Adapt finite-duration game  $\mathcal{G}'_f$  accordingly.

## **Generalizations 2: Streett**

#### **Streett Games**

- In parity games, requests and responses are hierarchical.
- In Streett games, use a finite collection  $(Q_j, P_j)_j$  of sets of vertices, requests  $Q_j$  and responses  $P_j$  of condition j.

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■ Streett condition and weights from  $\{1\}$  /  $\mathbb{N}$ .

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## Finitary Streett Games / Streett Games with Costs

■ Streett condition and weights from  $\{1\}$  /  $\mathbb{N}$ .

### New relief:

- Finitary Streett games are already EXPTIME-complete and exponential memory is necessary
  - $\Rightarrow$  Appropriate adaption of  $\mathcal{G}'$  can be solved straightaway in exponential time, yielding exponential upper bounds on memory

# More Results

Condition	Complexity	Mem. Pl. 0	Mem. Pl. 1
Parity	$\mathrm{UP}\cap\mathrm{co}\text{-}\mathrm{UP}$	Memoryless	Memoryless
Finitary Parity	PTIME	Memoryless	Infinite

# More Results

Condition	Complexity	Mem. Pl. 0	Mem. Pl. 1
Parity Finitary Parity Parity with Cost	$UP \cap co$ - $UP$ $PTIME$ $UP \cap co$ - $UP$	Memoryless Memoryless Memoryless	Memoryless Infinite Infinite
Streett Finitary Streett Streett with Cost	$ \begin{array}{c} {\rm CO\text{-}NP\text{-}complete} \\ {\rm EXPTIME\text{-}compl.} \\ {\rm EXPTIME\text{-}compl.} \end{array} $	Exponential Exponential Exponential	

# **More Results**

Condition	Complexity	Mem. Pl. 0	Mem. Pl. 1
Parity	$\begin{array}{c} \text{UP} \cap \text{co-UP} \\ \text{PTIME} \\ \text{UP} \cap \text{co-UP} \end{array}$	Memoryless	Memoryless
Finitary Parity		Memoryless	Infinite
Parity with Cost		Memoryless	Infinite
Streett	$ \begin{array}{c} {\rm CO\text{-}NP\text{-}complete} \\ {\rm EXPTIME\text{-}compl.} \\ {\rm EXPTIME\text{-}compl.} \end{array} $	Exponential	Memoryless
Finitary Streett		Exponential	Infinite
Streett with Cost		Exponential	Infinite
Opt. Finitary Parity Opt. Parity with Cost* Opt. Finitary Streett Opt. Streett with Cost*	PSPACE-compl. PSPACE-compl. EXPTIME-compl. EXPTIME-compl.	Exponential Exponential Exponential Exponential	Exponential Exponential Exponential Exponential

<sup>\*</sup> Holds for binary encoding of the weights.

# **Outline**

- 1. Memory Requirements of Optimal Strategies
- 2. Determining Optimal Bounds is Hard
- 3. Trading Memory for Quality and Vice Versa
- 4. Generalizations
- 5. Conclusion

## **Conclusion**

#### Results

- Playing finitary games/games with costs optimally is harder than just winning them.
- Both in terms of memory requirements and computational complexity.
- Quality can (gradually) be traded for memory and vice versa.

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## Open problems

- Parity games with mutiple cost functions
- Multi-dimensional games
- Tradeoffs in other games (first results for parametric LTL and energy games)