

# Winning Cores in Parity Games

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# Outline

- 1 Motivation
- 2 Introducing parity games
- 3 Contributions
  - Winning cores
  - An approximation algorithm
  - Experimental results
- 4 Summary



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# Why is parity game solving important?

Solving parity games is **polynomial-time equivalent** to

- $\mu$ -calculus model-checking
- Solving boolean equation systems
- Emptiness of parity tree automata on infinite binary trees.

Various problems are **reducible to parity games**, e.g.

- Satisfiability problems
- Model-checking problems
- Synthesis problems

(though, not necessarily by polynomial-time reductions)



# Complexity Status

It is unknown whether  $\text{PARITYGAME}$  is in  $\text{PTIME}$ .

We know:

- $\text{PARITYGAME}$  is in  $\text{NP} \cap \text{CO-NP}$  implying
  - If it is  $\text{NP}$ -complete then  $\text{NP} = \text{CO-NP}$
  - If it is not solvable in  $\text{PTIME}$  then  $\text{P} \neq \text{NP}$
- For a fixed maximal color  $d$ , it is in  $\text{PTIME}$



# Existing Algorithms

The best current algorithms for solving parity games are

- Zielonkas Recursive algorithm  $O(n^d)$  and  $O(2^n)$  [Zielonka, 1998]
- Small Progress Measures  $O(d \cdot m \cdot (n/d)^{d/2})$  [Jurdzinski, 1998]
- Strategy Improvement  $O(n \cdot m \cdot 2^m)$  [Vöge and Jurdzinski, 2000]
- Dominion Decomposition  $O(n^{\sqrt{n}})$  [Jurdzinski et al., 2006]
- Big Step Algorithms  $O(m \cdot n^{d/3})$  [Schewe, 2007]

where  $n$  is the number of states,  $m$  is the number of transitions,  $d$  is the maximal color of the game.

Note:  $d \leq n$



# Contributions

We introduce and study **winning cores**  
They are interesting because they provide

- 1 **knowledge** about parity games
- 2 a **new direction** for solving parity games
- 3 a polynomial-time **approximation algorithm** for solving parity games

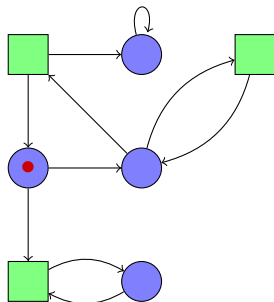
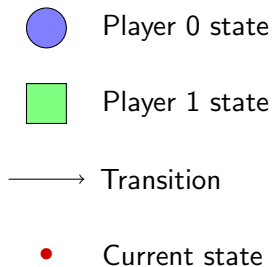


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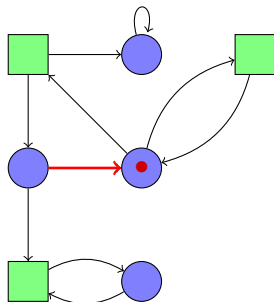
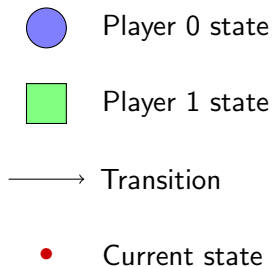
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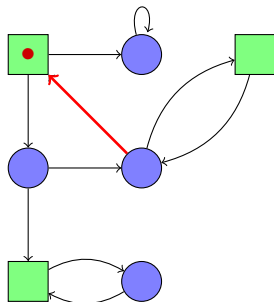
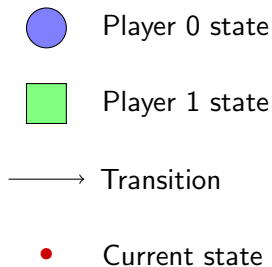
# A game graph



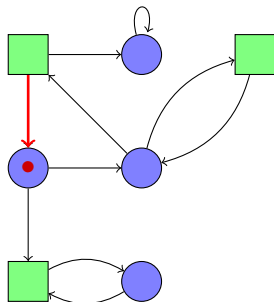
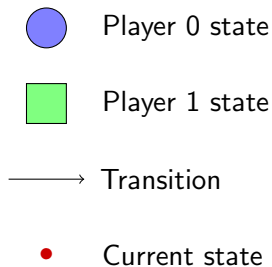
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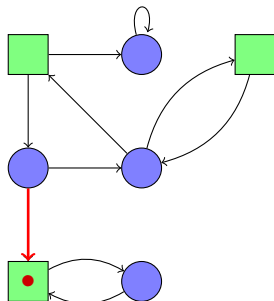
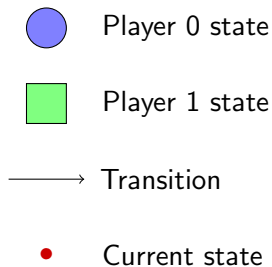
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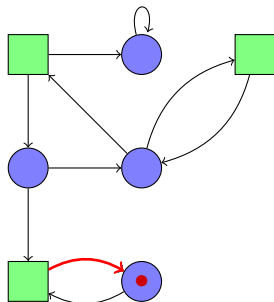
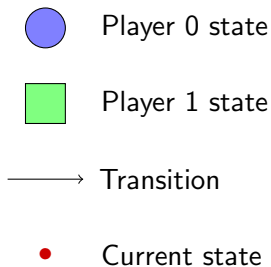
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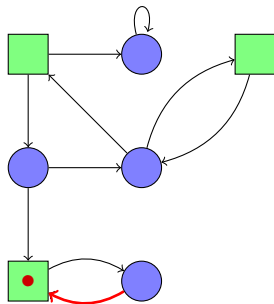
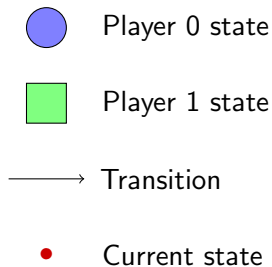
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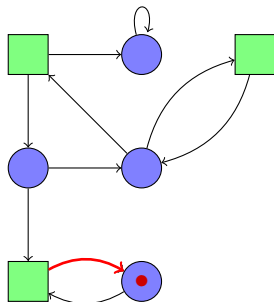
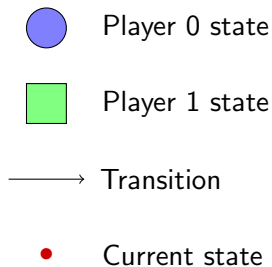
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# A game graph

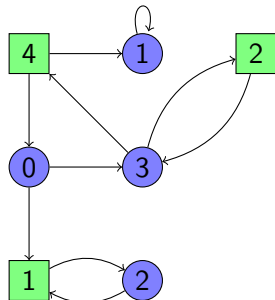
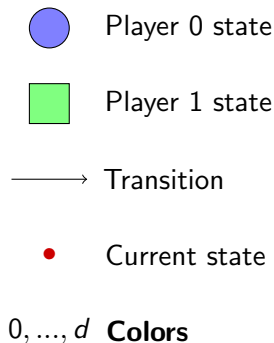


# A game graph





# A Parity Game



- **Player 0** wants the largest color infinitely often visited is **even**
- **Player 1** wants the largest color infinitely often visited is **odd**

# Determinacy

A game is **determined** if for every state  $s$  either

- Player 0 can ensure winning from  $s$  or
- Player 1 can ensure winning from  $s$

Theorem ([Ehrenfeucht and Mycielski, 1979])

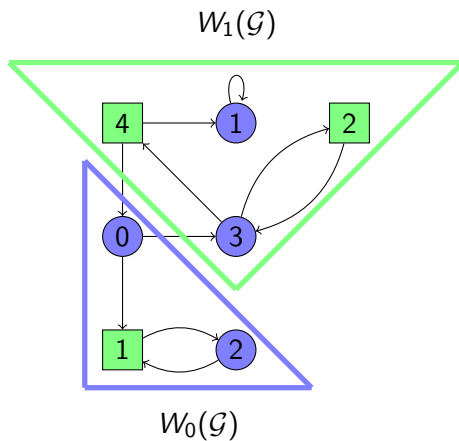
*Parity games are determined*

$\mathcal{G}$  : A parity game

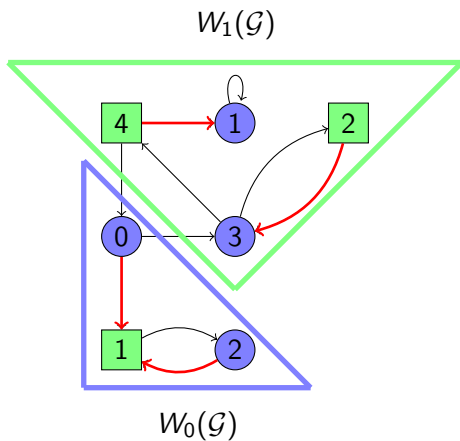
$W_j(\mathcal{G})$  : Set of winning states for player  $j$



# Determinacy Example



# Determinacy Example



# Solving parity games

## PARITYGAME

INPUT: A parity game  $\mathcal{G}$

OUTPUT:  $W_0(\mathcal{G}), W_1(\mathcal{G})$



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# Dominating sequences

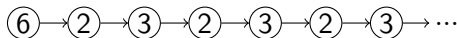
A sequence  $\rho = s_0s_1\dots$  of states is

- 0-dominating if  $\max_{i>0}(c(s_i))$  is even
- 1-dominating if  $\max_{i>0}(c(s_i))$  is odd

Note: Initial state does not count



0-dominating

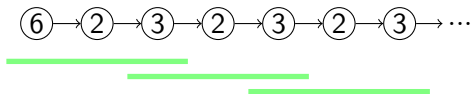
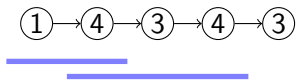


1-dominating

# Consecutive $j$ -dominating sequences

A sequence  $\rho = s_0s_1\dots$  begins with  $k$  consecutive  $j$ -dominating sequences if  $\exists i_0 < i_1 < \dots < i_k$  such that

- $i_0 = 0$
- $\rho_{i_\ell}\rho_{i_\ell+1}\dots\rho_{i_{\ell+1}}$  is  $j$ -dominating for all  $0 \leq \ell < k$



— 0-dominating  
— 1-dominating



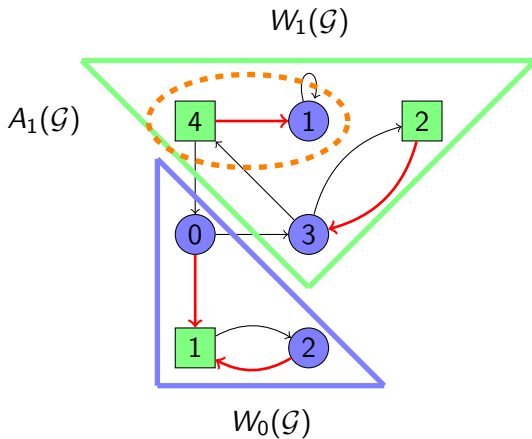
# Winning core

**Winning core**  $A_j(\mathcal{G})$  for player  $j$  in game  $\mathcal{G}$ :

Set of **states** from which player  $j$  can **force** the play to begin with an **infinite number** of consecutive  $j$ -dominating sequences.



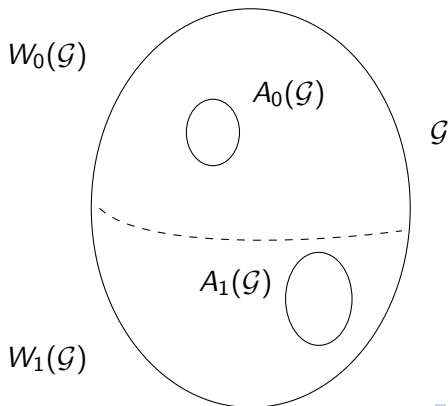
# Winning core example



# Properties of winning cores

## Theorem

- $A_j(\mathcal{G}) \subseteq W_j(\mathcal{G})$
- $A_j(\mathcal{G}) = \emptyset \Leftrightarrow W_j(\mathcal{G}) = \emptyset$



# Winning cores and dominions

A  $j$ -dominion  $D$  is a set of states so player  $j$  can make sure that both

- 1 the play stays in  $D$  and
- 2 that player  $j$  wins the play

Interestingly, the winning core  $A_j(\mathcal{G})$  is not necessarily a  $j$ -dominion.



# Complexity of computing winning cores

## Theorem

There is a **polynomial-time reduction** from PARITYGAME to computing winning cores and vice versa

## Corollary

- Computing winning cores is in  $\text{NP} \cap \text{co-NP}$
- Computing winning cores is in  $\text{P}$  if and only if PARITYGAME is in  $\text{P}$

# Computing winning regions using winning cores

**ParityGameSolver( $\mathcal{G}$ ):**

$A \leftarrow \text{WINNINGCORE}(\mathcal{G}, 0)$

$B \leftarrow \text{WINNINGCORE}(\mathcal{G}, 1)$

**if**  $A = \emptyset$  and  $B = \emptyset$  **then**

**return**  $(\emptyset, \emptyset)$

**end if**

$A' = \text{Attr}_0(\mathcal{G}, A)$

$B' = \text{Attr}_1(\mathcal{G}, B)$

$(W_0, W_1) \leftarrow \text{PARITYGAMESOLVER}(\mathcal{G} \setminus (A' \cup B'))$

**return**  $(A' \cup W_0, B' \cup W_1)$

**Note:** If  $\text{WINNINGCORE}(\mathcal{G}, j)$  returns a subset of  $A_j(\mathcal{G})$  then  $\text{PARITYGAMESOLVER}(\mathcal{G})$  returns subsets of the winning regions



# An underapproximation algorithm

**WinningCoreApp**( $\mathcal{G}, j$ ):

$A \leftarrow S$

$A' \leftarrow \emptyset$

**while**  $A \neq A'$  **do**

$A' \leftarrow A$

$A \leftarrow \{s \mid \text{Player } j \text{ can ensure a } j\text{-dominating sequence ending in } A'\}$

**end while**

**return**  $A$

**Note:** Returns subset of  $A_j(\mathcal{G})$

Combined with previous slide, gives **underapproximations** of **winning regions** in time  $O(d \cdot n^2 \cdot (n + m))$  and  $O(n + m + d)$  space.



# Quality of approximation algorithm

**No guarantees** on the quality of underapproximations :(

**But:**

- 1 It is **easy to check** whether entire winning region is returned
- 2 Preliminary **experimental results** on
  - Random games
  - Difficult benchmark games
  - A few verification cases

are **promising** both w.r.t.

- **(Quality)** All benchmark games and verification cases solved completely. High ratio of random games solved
- **(Running time)** It outperforms existing algorithms in most cases





# Experiments - overview

- Algorithm implemented in PGSOLVER framework in OCaml
- PGSOLVER has implementations of state-of-the-art algorithms for comparison
- Performed on an Intel(R) Core(TM) i7-4610M Processor (2.90 GHz)

# Experimental results - random games

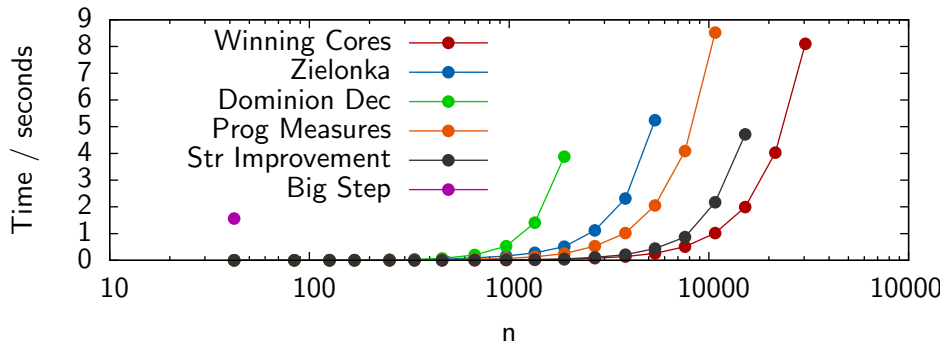
**Ratio** (in %) of games where the algorithm did not return the **entire winning region**

$n \backslash b$	$d = 4$			$d = \lceil \sqrt{n} \rceil$			$d = n$		
	2	5	10	2	5	10	2	5	10
100	0.11	0.20	0.00	0.80	0.04	0.00	1.37	0.05	0.00
1000	0.01	0.00	0.00	2.79	0.00	0.00	4.66	0.00	0.00

$n$  is the number of states,  $d$  is the number of colors and  $b$  is the out-degree.

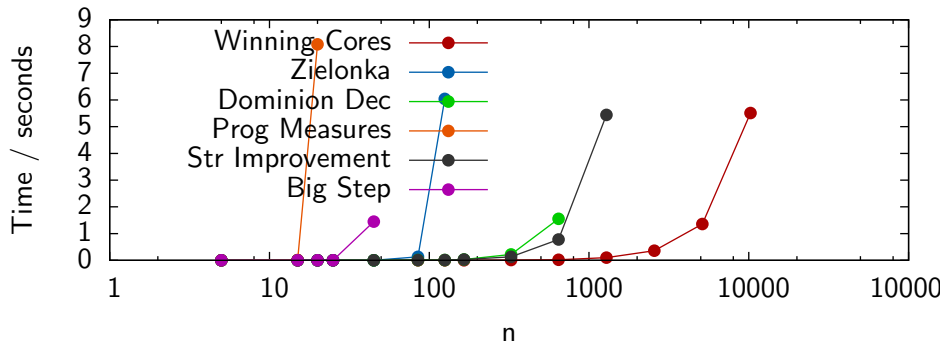
# Experimental results - hard games

Jurdzinski games,  $d = 10$

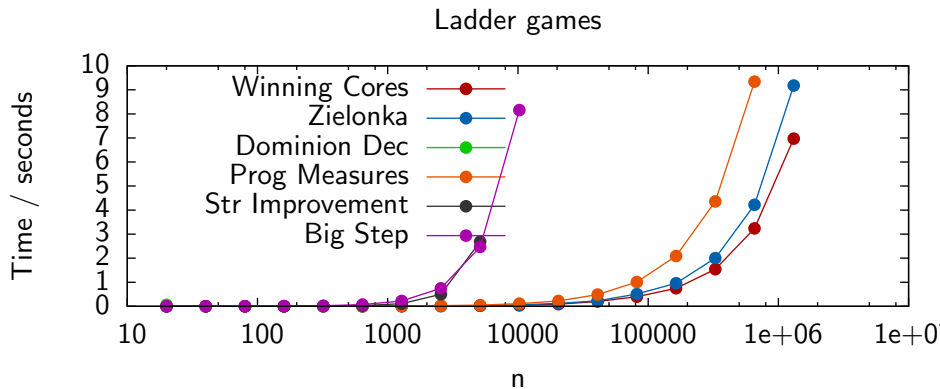


# Experimental results - hard games

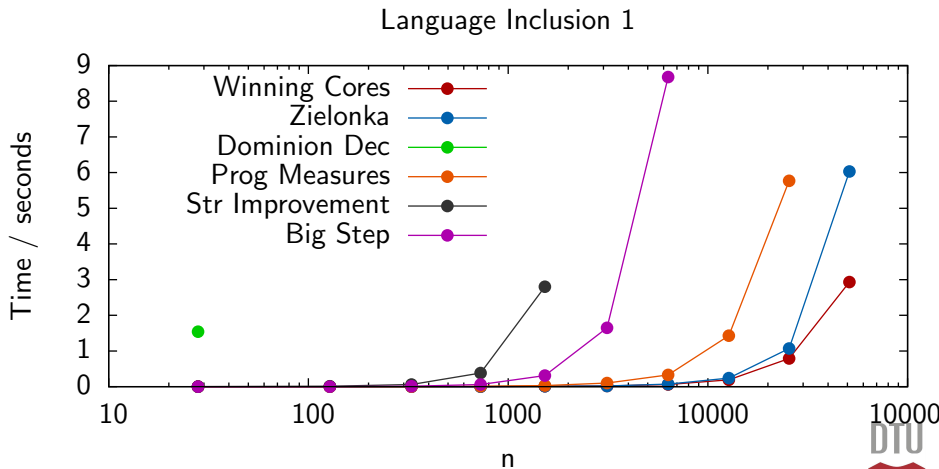
## Recursive Ladder Games



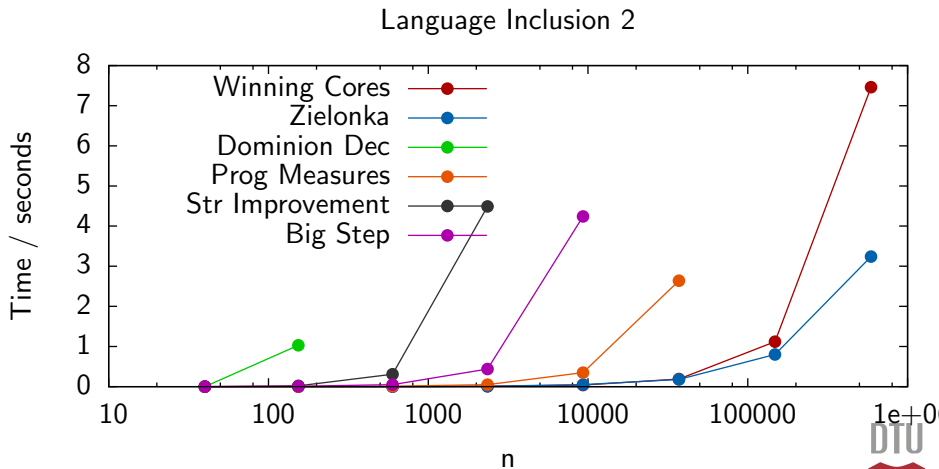
# Experimental results - hard games



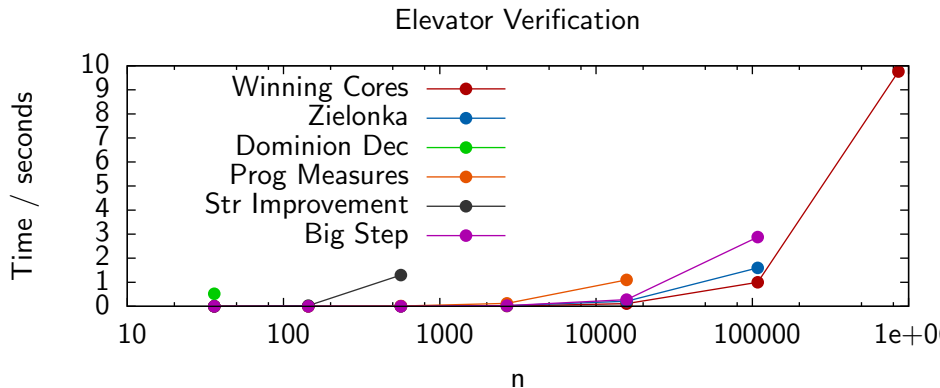
# Experimental results - verification case studies



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## We have





- Introduced winning cores
- Shown interesting properties
- Provided an approximation algorithm for parity games
- Shown promising initial experimental results

## Open questions

- For which games does the approximation algorithm give correct results?
- Do winning cores have further interesting properties?
- Are there fast deterministic algorithms for computing winning cores?
- Can winning cores be computed in polynomial time?



# Bibliography

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