# Improved Complexity Analysis of Quasi-Polynomial Algorithms Solving Parity Games 

Paweł Parys, Aleksander Wiącek

University of Warsaw


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- Player owning the current vertex choses the next vertex
- Player $\square$ wins if the biggest priority seen infinitely often is even.

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Algorithmic problem:
Given a game graph, decide which player has a winning strategy.
Long standing open problem:
Can we solve parity games in PTIME?

## Parity games



## Recent results

Long standing open problem:
Decide in PTIME which player has a winning strategy.
Recent result:
This can be decided in quasi-polynomial time, i.e. $n^{O(\log n)}$
A few algorithms achieving this:

- play summaries - Calude, Jain, Khoussainov, Li, Stephan 2017
- antagonistic play summaries -

Fearnley, Jain, Schewe, Stephan, Wojtczak 2017

- succinct progress measures - Jurdziński, Lazić 2018
- register games - Lehtinen 2018
- recursive à la Zielonka - Parys 2019
- improved recursive à la Zielonka -

Lehtinen, Schewe, Wojtczak 2019

- symmetric progress measures -

Jurdziński, Morvan, Ohlmann, Thejaswini 2020

- strategy iteration - Koh, Loho 2021

This paper:

## Small improvement in the complexity analysis of the algorithms

Previous: $\mathrm{O}\left(m d n^{\log _{2} \mathrm{e}+\log _{2}\left(d / \log _{2} n\right)}\right)$

New: $\quad \mathrm{O}\left(m_{\frac{1}{d}} n^{\log _{2} e+\log _{2}\left(d \log _{2} n\right)}\right)$
where
$n$ - number of nodes
$m$ - number of edges
$d$ - number of priorities
(we skip polylogarithmic factors)

## Universal trees

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## Examples:

$$
\begin{gathered}
C_{n, h}= \\
C_{n, h-1}=C_{n, h-1}^{C_{n, h}} C_{n, h-1} \\
S_{[n / 2], h} \\
S_{n, h-1} \\
S_{[n / 2], h}
\end{gathered}
$$

$$
P_{n, h}=
$$

$$
\underbrace{P_{\lfloor n / 2\rfloor, h-1} \cdots P_{\lfloor n / 2\rfloor, h-1}}_{\lfloor n / 2\rfloor} \underbrace{P_{\lfloor n / 2\rfloor, h-1} \cdots P_{\lfloor n / 2\rfloor, h-1}}_{\lfloor n / 2\rfloor}
$$

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## Examples:

$$
C_{n, h}=
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size $n^{h}$

$$
S_{n, h}=
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Why is it $(n, h)$-universal?
Take any tree $T$ of height $h$ with $n$ leaves.


Subtree with the middle leaf goes to $S_{n, h-1}$.
Left and right part have at most $\lfloor n / 2\rfloor$ or $\lfloor(n-1) / 2\rfloor$ leaves.

## Why universal trees?

1) It is enough to consider positional strategies: given a node, player chooses some fixed successor, no matter what was the history of the play. If a player can win, then he can win positionally.

Consequence: the problem is in NP ncoNP. In fact it is also in UP ncoUP (Jurdziński 1998)
The search variant is in PLS, PPAD, CLS (Daskalakis, Papadimitriou 2011)


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2) After fixing a positional strategy, a game graph defines a tree of height $d / 2$ with $n$ leaves (game node $=$ tree leaf)


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3) Idea: checking a universal tree $=$ checking all positional strategies

## Why universal trees?

All known quasipolynomial algorithms solving parity games use (explicitly or implicitly) universal trees.

Is this necessary?

## Papers

Czerwiński, Daviaud, Fijalkow, Jurdziński, Lazić, Parys 2019
Arnold, Niwiński, Parys 2021
define two general approaches such that

- all known quasipolynomial algorithms follow these approaches
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Complexity of the (best) algorithms?
$\mathrm{O}\left(m \cdot\left|S_{n, d / 2}\right|\right)$
Improvement 1: this can be changed to
$\mathrm{O}\left(m \cdot\left|S_{n / 2, d / 2}\right|\right)$
i.e., we can use universal trees for $n / 2$ leaves
(not really new - already observed in some older papers, but not present in papers with the best complexity)

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Idea: map only nodes of odd priority (or only nodes of even priority) to leaves of the universal tree.
There are at most $n / 2$ of them.
Anyway: it is essential to bound the size of universal trees.

## What is the size?

Recursive formula:
$\left|S_{0, h}\right|=0$
$\left|S_{n, 0}\right|=1$
$\left|S_{n, h}\right|=\left|S_{n, h-1}\right|+\left|S_{\lfloor n / 2], h}\right|+\left|S_{\lfloor(n-1) / 2], h}\right|$


## Theorem

$\left|S_{n, h}\right| \leq n \cdot\binom{h-1+\left\lfloor\log _{2} n\right\rfloor}{\left[\log _{2} n\right\rfloor} \leq n^{1+\log _{2}++\log _{2}\left(1+h h \log _{2} n\right)}$
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(we did better analysis - previous bound was greater $h$ times)

## Lower bound?

Every $(n, h)$-universal tree satisfies
$\left|U_{n, h}\right| \geq\binom{ h+\left\lfloor\log _{2} n\right\rfloor}{\left\lfloor\log _{2} n\right\rfloor} \geq\left(\frac{n}{2}\right)^{\log _{2}\left(1+h / \log _{2} n\right)}$
(Czerwiński, Daviaud, Fijalkow, Jurdziński, Lazić, Parys 2019 + our improvements)

## What is the size?

## Upper bound:

$$
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$$

Lower bound:
$\left|U_{n, h}\right| \geq\binom{ h+\left\lfloor\log _{2} n\right\rfloor}{\left\lfloor\log _{2} n\right\rfloor} \geq\left(\frac{n}{2}\right)^{\log _{2}\left(1+h / \log _{2} n\right)}$
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Lower bound:
$\left|U_{n, h}\right| \geq\binom{ h+\left\lfloor\log _{2} n\right\rfloor}{\left\lfloor\log _{2} n\right\rfloor} \geq\left(\frac{n}{2}\right)^{\log _{2}\left(1+h / \log _{2} n\right)}$
$\frac{\text { upper bound }}{\text { lower bound }} \leq n$
Open questions:

- Can this be improved?
- Is there any universal tree smaller than $S_{n, h}$ ?


## What is the size?

Open questions:

- Can the bounds be improved?
- Is there any universal tree smaller than $S_{n, h}$ ?


## Partial answers:

- For $h=2$ the tree $S_{n, 2}$ is optimal.
- There is exists a "strange" $(5,3)$-universal tree of the same size as $S_{5,3}$



## Summary

Small improvement in the complexity of solving parity games:
Previous: $\mathrm{O}\left(m d n^{\log _{2} \mathrm{e}+\log _{2}\left(d \log g_{2} n\right)}\right)$
New: $O\left(m_{d} n^{\log _{2} e+\log _{2}\left(d \log _{2} n\right)}\right)$

Small improvement in bounds for size of ( $\mathrm{n}, \mathrm{h}$ )-universal tree: $\frac{\text { upper bound }}{\text { lower bound }} \leq n$
(previously: nh)

Thank you!

