

# A Quasi-Polynomial Black-Box Algorithm for Fixed Point Evaluation

André Arnold, Damian Niwiński, **Paweł Parys**

## Plan

- parity games  $\approx$  modal  $\mu$ -calculus  
     $\cap$   
    (black-box) fixed point evaluation
- quasi-polynomial algorithms for parity games  
    ↓  
    quasi-polynomial black-box algorithms for fixed point evaluation
- Our algorithm is an abstract version of recent quasi-polynomial algorithms solving parity games
- We unify two kinds of parity-games algorithms (asymmetric, symmetric) in a common framework
- Some lower bounds for the method (universal trees are needed)

## Considered problem: fixed point evaluation

Compute:  $\forall x_d. \exists x_{d-1} \dots \forall x_2. \exists x_1. f(x_1, x_2, \dots, x_{d-1}, x_d)$

where  $x_i \in \{0,1\}^n$

$f: (\{0,1\}^n)^d \rightarrow \{0,1\}^n$  monotone

access to  $f$ : only evaluation for given arguments ( $f$  is a black-box)

## Considered problem: fixed point evaluation

Compute:  $\forall x_d. \mu x_{d-1} \dots \forall x_2. \mu x_1. f(x_1, x_2, \dots, x_{d-1}, x_d)$

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## Relation to parity games

parity game  
( $n$  nodes,  $d$  priorities)



fixed point evaluation  
( $n$  bits,  $d$  arguments)  
 $f$  of a special form

parity game  
( $\exp(n)$  nodes,  $d$  priorities)



fixed point evaluation  
( $n$  bits,  $d$  arguments)  
arbitrary  $f$

## Parity games vs. fixed point evaluation

$$\forall x_d. \mu x_{d-1} \dots \forall x_2. \mu x_1. f(x_1, x_2, \dots, x_{d-1}, x_d)$$

For parity games:

- $f$  is of a special form: every output bit is either AND or OR of some input bits
- the game graph can be accessed also in other ways, not only by evaluating  $f$

Recent quasipolynomial algorithms for parity games:

- access the game graph only by evaluating  $f$
- work for arbitrary  $f$ , not only for  $f$  coming from parity games



After a careful analysis, they give black-box algorithms for fixed point evaluation

This paper / this talk:

- Why?
- How to prove this in a nice way?

# Recent results on parity games

- Calude, Jain, Khoussainov, Li, Stephan 2017
- Fearnley, Jain, Schewe, Stephan, Wojtczak 2017
- Jurdziński, Lazić 2017
- Lehtinen 2018

asymmetric algo.  
(separator approach)

complexity:  
 $n^{\lg(d/\lg n)+O(1)} \approx |U_{n,d}|$

- Bojańczyk, Czerwiński 2018
- Czerwiński, Daviaud, Fijalkow, Jurdziński, Lazić, Parys 2019

- Parys 2019
- Lehtinen, Schewe, Wojtczak 2019
- Jurdziński, Morvan 2020

symmetric algo.  
(recursive)

complexity:  
 $n^{2\lg(d/\lg n)+O(1)} \approx |U_{n,d}|^2$

- Jurdziński, Morvan, Ohlmann, Thejaswini 2020 – symmetric, in  $n^{\lg(d/\lg n)+O(1)} \approx |U_{n,d}|$

fixed point evaluation:

- Hausmann, Schröder 2019
- Hausmann, Schröder 2020

(blue = after writing this paper)

## Standard exponential algorithm

Notation:  $|(\Theta, f, (\mathbf{0}, \mathbf{1}))| = \nu x_d \cdot \mu x_{d-1} \dots \nu x_2 \cdot \mu x_1 \cdot f(x_1, x_2, \dots, x_{d-1}, x_d)$  for  $\Theta = \nu \mu \dots \nu \mu$   
 $f^{\mapsto A}(x_1, x_2, \dots, x_{d-1}) = f(x_1, x_2, \dots, x_{d-1}, A)$

Algorithm evaluating  $|(\Theta, f, (\mathbf{0}, \mathbf{1}))|$

for  $\Theta = \mu \Theta'$ :

$$A_0 = \mathbf{0}$$

$$A_j = |(\Theta', f^{\mapsto A_{j-1}}, (\mathbf{0}, \mathbf{1}))|$$

return  $A_n$

(where  $j = 1, 2, \dots, n$ )

for  $\Theta = \nu \Theta'$ :

$$B_0 = \mathbf{1}$$

$$B_j = |(\Theta', f^{\mapsto B_{j-1}}, (\mathbf{0}, \mathbf{1}))|$$

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## How to make it quasipolynomial?

- do not start from  $\mathbf{0}$  /  $\mathbf{1}$ , but from some intermediate values (**restrictions**)
- perform less iterations (follow a structure of some **universal trees**)



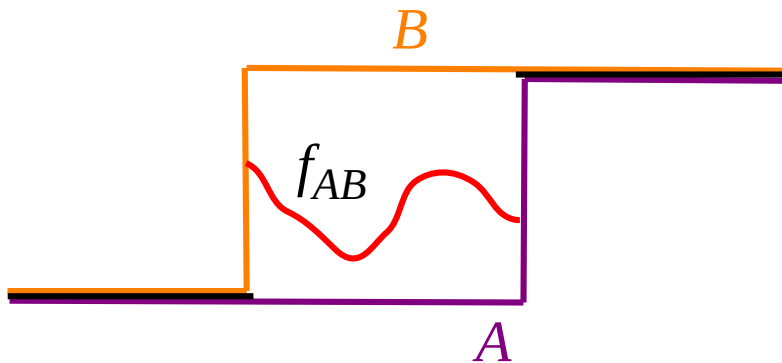
# Restrictions

Notation:  $f_{AB}(x_1, x_2, \dots, x_d) = A + B * f(x_1, x_2, \dots, x_d)$

$A \leq B$

= sup  
= bitwise OR

= inf  
= bitwise AND



# Restrictions

Notation:  $f_{AB}(x_1, x_2, \dots, x_d) = A + B * f(x_1, x_2, \dots, x_d)$   $A \leq B$   
 $|(\Theta, f, (A, B))| = \nu x_d \cdot \mu x_{d-1} \dots \nu x_2 \cdot \mu x_1 \cdot f_{AB}(x_1, x_2, \dots, x_{d-1}, x_d)$  for  $\Theta = \nu \mu \dots \nu \mu$

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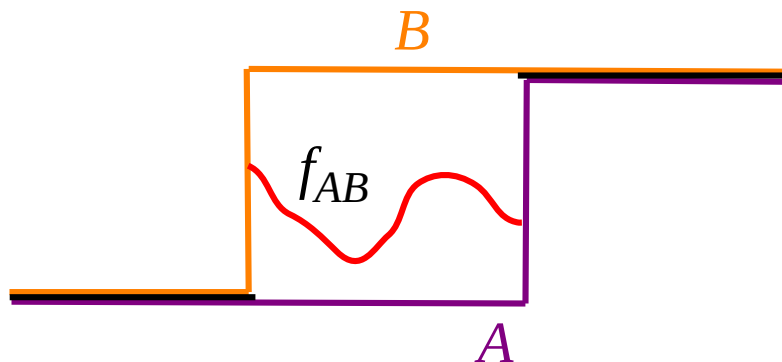
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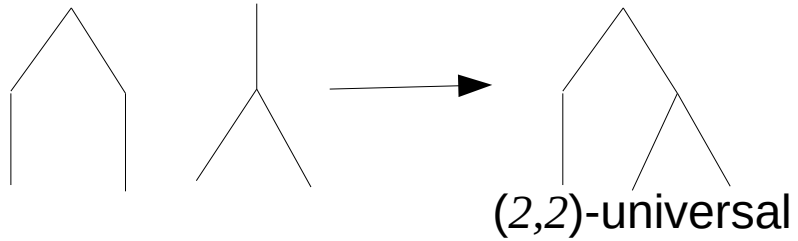
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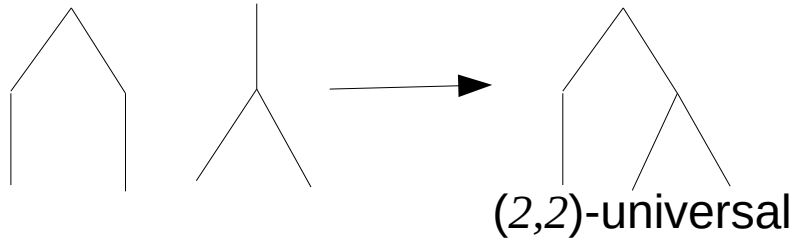
## Universal trees

A tree  $U$  (of height  $h$ ) is  $(n,h)$ -universal if every tree of height  $h$  with  $n$  leaves embeds in  $U$ .

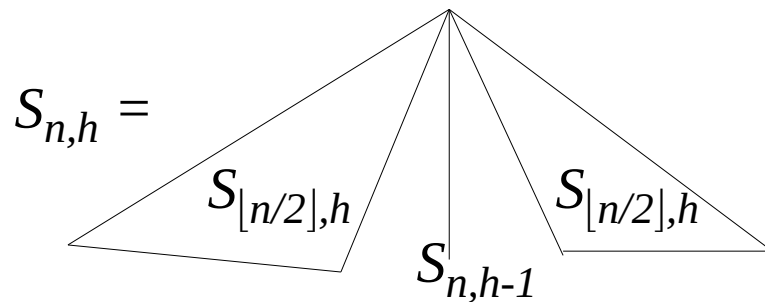
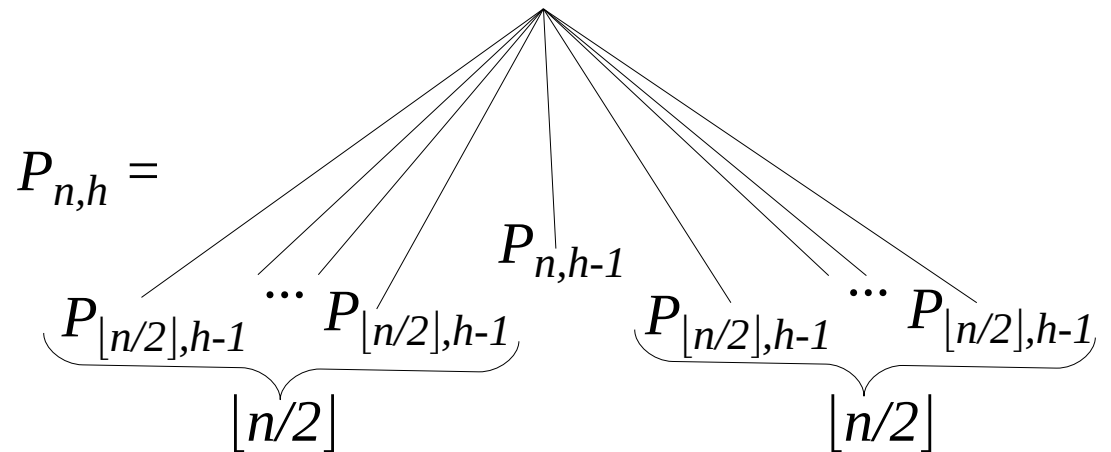
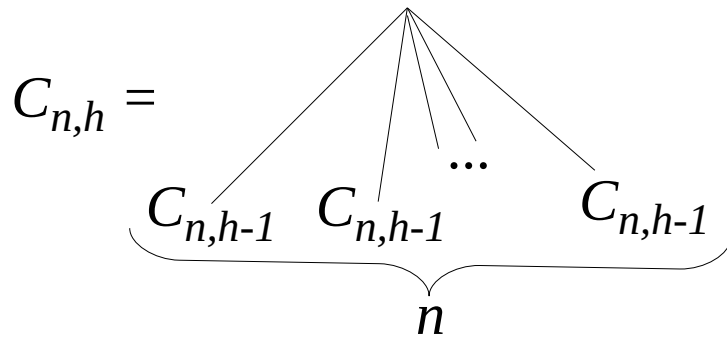


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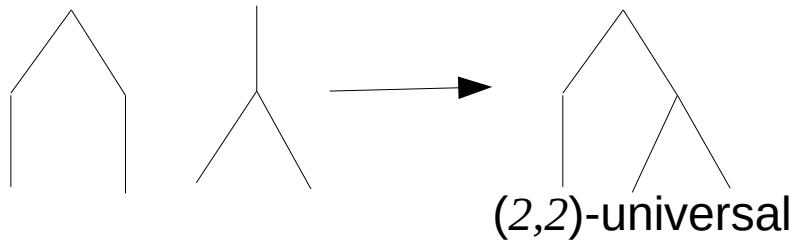


## Examples:

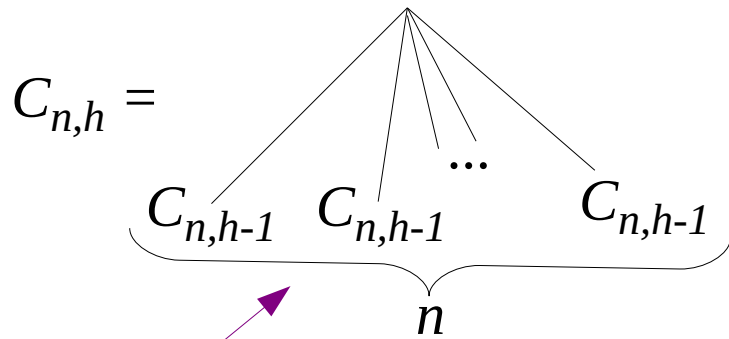


# Universal trees

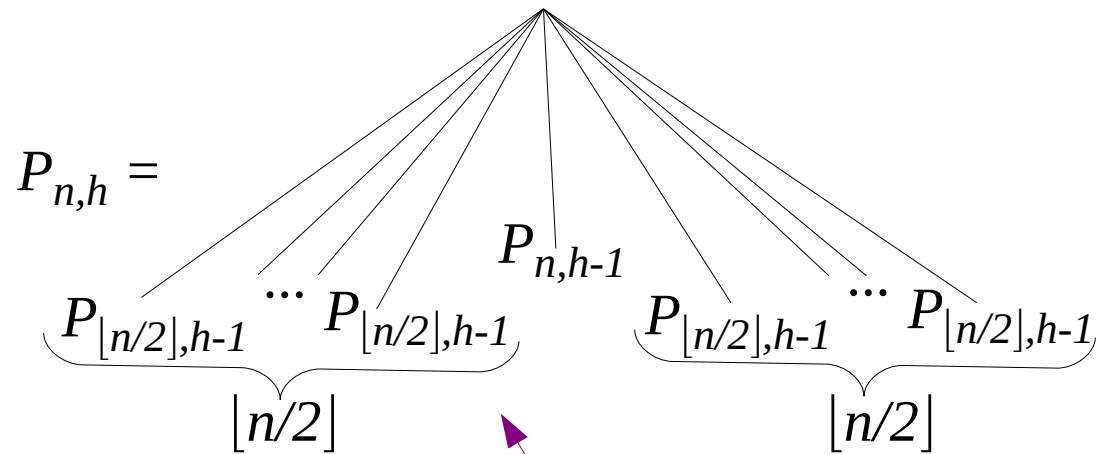
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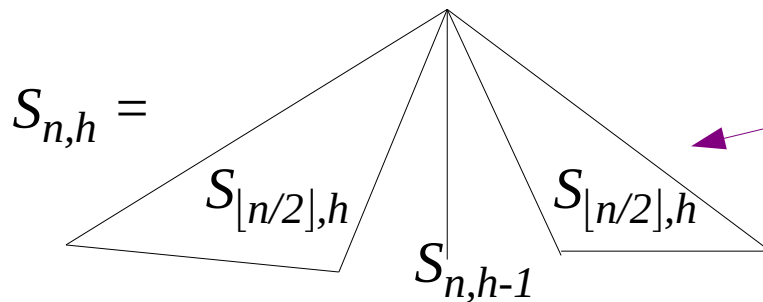
## Examples:



size  $n^h$



size  $n \lg n + \lg(h/\lg n) + O(1)$



size  $n \lg(h/\lg n) + O(1)$

# Symmetric algorithm based on universal trees

≈ the symmetric algorithm for parity games

$U, V$  – (universal) trees

Definition / Algorithm evaluating  $|(\Theta, f, (A, B))|_{U, V}$  (where  $j=1, 2, \dots, p$ )

for  $\Theta = \mu \Theta'$ ,  $U = \langle U_1, \dots, U_p \rangle$

$$A_0 = A$$

$$A_j = |(\Theta', f^{\mapsto A_{j-1}}, (A_{j-1}, B))|_{U_j, V}$$

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## Correctness

If  $U, V$  are  $(n, d/2)$ -universal then  $|(\Theta, f, (\mathbf{0}, \mathbf{1}))|_{U, V} = |(\Theta, f, (\mathbf{0}, \mathbf{1}))|$ .

Proof is based on:

- dominions
  - dominion decomposition
- } adapted from parity games  
[Jurdziński, Morvan 2020]

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Time complexity:  $|U| \cdot |V| = n^{2 \lg(d/\lg n) + O(1)}$

(two universal trees)



# Asymmetric algorithm (Seidl's idea, 1996)

- evaluate recursively  
time:  $n^d$

Seidl '96



- create a system of **least** fixed point equations, and solve it  
time:  $n^{d/2+1}$

- universal trees
- restrictions
- evaluate recursively  
time:  $n^{2\lg(d/\lg n)+O(1)}$



- universal trees
- restrictions
- create a system of **least** fixed point equations, and solve it  
time:  $n^{2\lg(d/\lg n)/2+O(1)}$

⋈

symmetric algorithm  
for parity games

⋈

asymmetric algorithm  
for parity games

## A lower bound (for our method)

Theorem: Fix  $n, d$ .

If  $|(\Theta, f, (\mathbf{0}, \mathbf{1}))| = |(\Theta, f, (\mathbf{0}, \mathbf{1}))|_{U, V}$  for all  $f$ , then  $U, V$  are  $(n, d/2)$ -universal.

Corollary:

It is known that every universal tree has size at least  $n^{\lg(h/\lg n) + \Omega(1)}$

Thus our algorithm cannot work faster (using potentially some smaller tree).

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Corollary:

It is known that every universal tree has size at least  $n^{\lg(d/\lg n) + \Omega(1)}$

Thus our algorithm cannot work faster (using potentially some smaller tree).

Remark:

It is enough to assume equality for functions  $f$  defined by parity games  
(so the lower bound applies also to parity games)

## Conclusions

- quasi-polynomial algorithms for fixed-point evaluation
- an abstract formulation using universal trees
- unified treatment of symmetric / asymmetric variants
- a lower bound for the method

Open problem:

- prove a (quasi-polynomial?) lower bound for the number of queries for black-box fixed point evaluation  
[ we only have  $\Omega(n^2/\log n)$  – Parys 2009 ]

Thank you!