# Parity Games: Zielonka's Algorithm in Quasi-Polynomial Time 

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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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This can be decided in quasi-polynomial time, i.e. $n^{O(\log n)}$
A few algorithms achieving this:

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Older results:

- multiple (sub-)exponential algorithms
- among them: Zielonka's algorithm 1998
$\rightarrow$ very simple recursive algorithm
$\rightarrow$ exponential in the worst case
$\rightarrow$ behaves quite well in practice


## Our contribution

We present a small modification of the simple, recursive Zielonka's algorithm, so that it works in quasi-polynomial time, i.e. $n^{0(\log (n))}$

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- Remove the winning region of Odd, together with attractor; solve the remaining game recursively


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## Zielonka's algorithm

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Formally: procedure Solve $_{\mathrm{E}}(G)$
// highest priority in $G$ is even do

$$
\begin{aligned}
& H=G \backslash \operatorname{Attr}_{\mathrm{E}} \text { (nodes of highest priority) } \\
& W_{\mathrm{O}}=\operatorname{Solve}_{\mathrm{O}}(H) \\
& G=G \backslash \operatorname{Attr}_{\mathrm{O}}\left(W_{\mathrm{O}}\right)
\end{aligned}
$$

while $W_{\mathrm{O}} \neq \varnothing$


## Observation:

- At most one of the regions $W_{0}, W_{1}, W_{2}$ has more than $n / 2$ nodes (they are disjoint)



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Idea:
- Procedure that finds only small winning regions (dominions)

Def. $\underline{\text { Dominion }}=$ set of nodes $W$, such that the player wins from every node of $W$ without leaving $W$


Idea: procedure that finds only small dominions procedure solve $\left(G, n_{E}, n_{O}\right)$ returns a set $W_{E}$ such that:

- if a node $v$ belongs to Even's dominion of size $\leq n_{E}$ then $v \in W_{E}$
- if a node $v$ belongs to Odd's dominion of size $\leq n_{O}$ then $v \notin W_{E}$
- other nodes $v$ are classified arbitrarily


## My modification

procedure $\operatorname{Solve}_{\mathrm{E}}\left(G, n_{E}, n_{O}\right)$
if $n_{E}<1$ then return $\varnothing$ do


$$
\begin{aligned}
& H=G \backslash \operatorname{Attr}_{\mathrm{E}} \text { (nodes of highest priority) } \\
& W_{\mathrm{O}}=\operatorname{Solve}_{\mathrm{O}}\left(H, n_{E}, n_{O} / 2\right) \\
& G=G \backslash \operatorname{Attr}_{\mathrm{O}}\left(W_{\mathrm{O}}\right)
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## Running time

Let:
$n=$ number of nodes
$h=$ maximal priority
$l=\log n_{E}+\log n_{O}$
Then the running time (number of recursive calls) is:

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R(h, l) \leq 1+n \cdot R(h-1, l-1)+R(h-1, l)
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This gives us:

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Implementation?

- Zielonka's algorithm - relatively fast in practice (usually)
- quasi-polynomial-time algorithms - much slower
- (a simple implementation of) my algorithm - also slow (similar to QPT)


## Summary

We present a small modification
of the simple, recursive Zielonka's algorithm, so that it works in quasi-polynomial time, i.e. $n^{\circ(\log (n))}$

Why our algorithm is interesting?

- simplicity
- different approach (all the other quasi-polynomial-time algorithms follow so-called separation approach)

Thank you!

