

# Beyond Value Iteration for Parity Games: Strategy Iteration with Universal Trees

**Zhuan Khye Koh**   Georg Loho



**UNIVERSITY  
OF TWENTE.**

# Overview

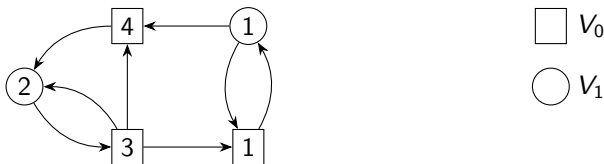
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- ① Parity game
- ② Complexity of deciding the winner
- ③ Winning certificate from a universal tree
- ④ Value iteration
- ⑤ Strategy iteration

# Parity game

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**Setting:** A directed graph  $G = (V, E)$  with partition  $V = V_0 \sqcup V_1$ , and a **priority** function  $\pi : V \rightarrow \{1, 2, \dots, d\}$ .



- Nodes in  $V_0$  and  $V_1$  are owned by players **Even** and **Odd** respectively.
- A token is placed on a starting node  $v \in V$ . In every turn, the owner of the current node moves the token to an out-neighbour.  
 $\implies$  an infinite walk  $P$  (assume  $G$  is sinkless).
- If the **highest priority** occurring **infinitely often** in  $P$  is even, then Even wins. Otherwise, Odd wins.

# Parity game

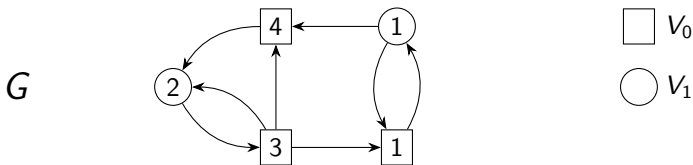
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**Positional Determinacy:** Starting from any node  $v \in V$ , either Even or Odd can guarantee to win using a **positional strategy**.

- A (positional) **strategy** for Even is a function  $\sigma : V_0 \rightarrow V$  such that  $v\sigma(v) \in E$  for all  $v \in V_0$ . Its **strategy subgraph** is  $G_\sigma = (V, E_\sigma)$  where

$$E_\sigma = \{v\sigma(v) : v \in V_0\} \cup \{vw \in E : v \in V_1\}.$$

A strategy  $\tau$  for **Odd** and its strategy subgraph  $G_\tau$  are defined similarly.



**Problem:** Given  $(G, \pi)$  and starting node  $v \in V$ , output the winner.

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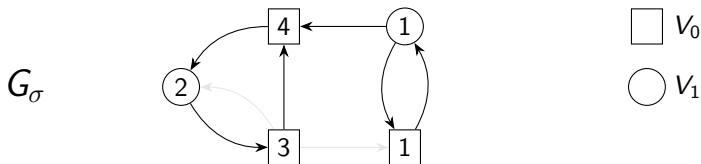
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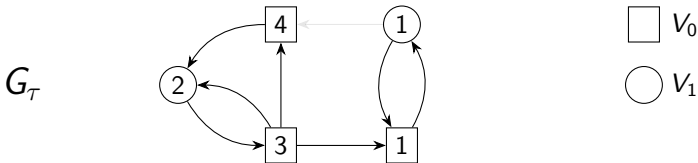
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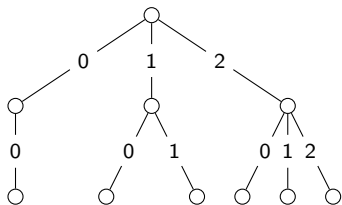
# Complexity of deciding the winner

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- Belongs to **NP**  $\cap$  **coNP**.
- Important in logic and verification, e.g., polynomial-time equivalent to the model-checking problem for modal  $\mu$ -calculus.
- Pre-2017 algorithms were exponential or subexponential time.
- Quasi-polynomial time [Calude, Jain, Khossainov, Li, Stephan '17].
- Many other quasi-polynomial algorithms soon follow: [Fearnley, Jain, Keijzer, Schewe, Stephan, Wojtczak '17] [Gimbert, Ibsen–Jensen '17] [Jurdziński, Lazić '17] [Lehtinen '18] [Parys '19] [Lehtinen, Schewe, Wojtczak '19] [Daviaud, Jurdziński, Thejaswini '20] [Benerecetti, Dell'Erba, Mogavero, Schewe, Wojtczak '21].
- Most of them have been unified via the notion of a **universal tree** [Czerwiński, Daviaud, Fijalkow, Jurdziński, Lazić, Parys '19].

# Ordered tree

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$$M = \{0, 1, 2\}$$

**Def:** Given a totally ordered set  $(M, \leq)$ , an **ordered tree**  $T$  is a prefix-closed set of tuples whose elements are drawn from  $M$ .

- Elements in  $M$  induce branching directions at every vertex  $v \in V(T)$ .
- The tuple corresponding to a vertex  $v$  is given by the root- $v$  path.
- $\leq$  extends lexicographically to  $V(T)$ .
- $L(T) :=$  leaf set of  $T$ . Assume every leaf has the same depth.

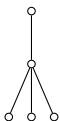


# Universal tree

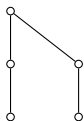
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• Given ordered trees  $T$  and  $T'$ ,  $T$  **embeds into**  $T'$  ( $T \sqsubseteq T'$ ) if there exists an **injective** function  $f : V(T) \rightarrow V(T')$  such that

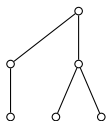
- ①  $uv \in E(T) \implies f(u)f(v) \in E(T')$  (homomorphism)
- ②  $u \leq v \implies f(u) \leq f(v)$  (order-preserving)



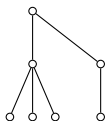
$T_1$



$T_2$



$T_3$



$T_4$

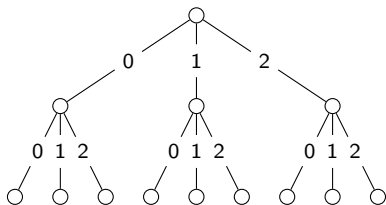
**Def:** An  $(\ell, h)$ -**universal tree** is an ordered tree  $T'$  such that  $T \sqsubseteq T'$  for all ordered trees  $T$  of height at most  $h$  and with at most  $\ell$  leaves.

**Thm:** Every universal tree has at least quasi-polynomially many leaves.  
[Czerwiński et al. '19].

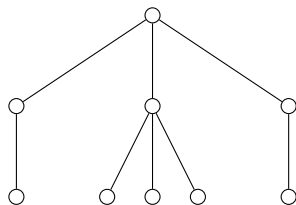
## Examples of universal trees

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- **Perfect**  $(\ell, h)$ -universal tree:
  - ▶ Every leaf is an  $h$ -tuple of integers from  $\{0, 1, \dots, \ell - 1\}$ .
  - ▶ Contains  $\ell^h$  leaves.
- **Succinct**  $(\ell, h)$ -universal tree [Jurdziński, Lazić '17]:
  - ▶ Every leaf is an  $h$ -tuple of binary strings with at most  $\lfloor \log \ell \rfloor$  bits in total.
  - ▶ Contains  $\ell^{\log h + O(1)}$  leaves.



A perfect  $(3,2)$ -universal tree.



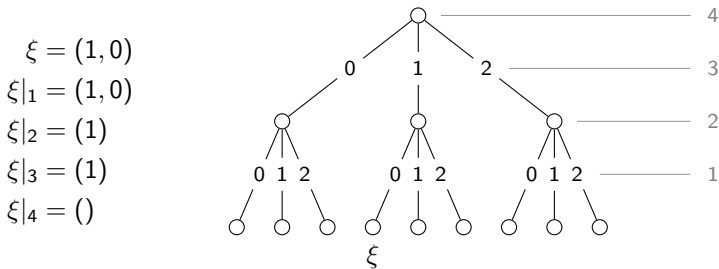
A succinct  $(3,2)$ -universal tree.

## Winning certificate from a universal tree

- Let  $\bar{L}(T) := L(T) \cup \{\top\}$ , where  $\top > v$  for all  $v \in V(T)$ .
- Given an instance  $(G, \pi)$  with  $n = |V|$ , a **node labeling** is a function  $\mu : V \rightarrow \bar{L}(T)$  for some  $(n, d/2)$ -universal tree  $T$ .
- For a leaf  $\xi \in L(T)$ , we index its tuple by  $(\xi_{d-1}, \xi_{d-3}, \dots, \xi_1)$ .

**Intuition:** records how many times an odd priority is encountered.

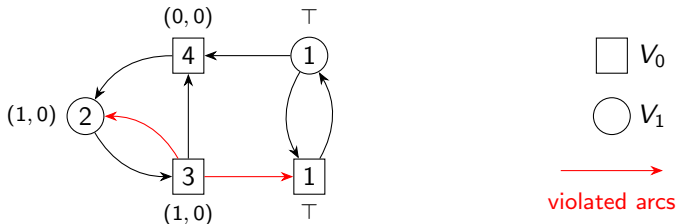
- For a priority  $p$ , the  **$p$ -truncation** of  $\xi$  is obtained by deleting the components with index less than  $p$ .



# Winning certificate from a universal tree

**Def:** A node labeling  $\mu$  is **feasible in  $G$**  if Even has a strategy  $\sigma$  such that every arc  $vw$  in  $G_\sigma$  satisfies

- ▶ If  $\pi(v)$  is even, then  $\mu(v)|_{\pi(v)} \geq \mu(w)|_{\pi(v)}$ .
- ▶ If  $\pi(v)$  is odd, then  $\mu(v)|_{\pi(v)} > \mu(w)|_{\pi(v)}$  or  $\mu(v) = \mu(w) = \top$ .

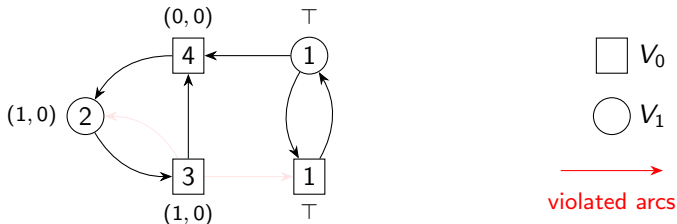


**Thm:** Let  $\mu^*$  be a node labeling which is feasible in  $G$  and has **minimal  $\top$ -support**. Even wins from  $v \in V \iff \mu^*(v) \neq \top$  [Jurdziński '00].

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# Value iteration

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**Def:** Given  $\mu : V \rightarrow \bar{L}(T)$  and  $vw \in E$ , let  $\text{lift}(\mu, vw)$  be the **smallest** element  $\xi \in \bar{L}(T)$  such that  $\xi \geq \mu(v)$  and  $vw$  is **non-violated** after setting  $\mu(v)$  to  $\xi$ .

## Value-Iteration( $G, \pi, T$ )

- 1  $\mu(v) \leftarrow \min L(T)$  for all  $v \in V$
- 2 **while**  $\mu$  is not feasible:  
 $\mu(v) \leftarrow \min_{vw \in \delta^+(v)} \text{lift}(\mu, vw)$  for some node  $v \in V_0$  whose outgoing arcs  $\delta^+(v)$  are **all violated** **or**  
 $\mu(v) \leftarrow \text{lift}(\mu, vw)$  for some **violated** arc  $vw \in E$  where  $v \in V_1$
- 3 **return**  $\mu$

- Returns the **least fixed point of  $G$**  in  $\Theta(n|L(T)|)$  iterations.
- Also called the **progress measure algorithm** [Jurdziński '00].

# Behaviour of value iteration

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- Not robust against its worst-case runtime:



- If  $d$  is even, then the two additional nodes see every element in  $\bar{L}(T)$ .  
 $\implies \Omega(|L(T)|)$  time.

**Idea:** Iterate over strategies instead of arcs:

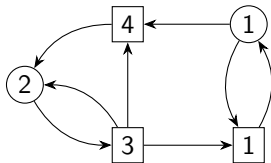
- ▶ Fix a strategy  $\tau$  for Odd.
- ▶ Update  $\mu$  to the **least fixed point of  $G_\tau$** .
- ▶ Pivot to a “better” strategy  $\tau'$  for Odd, and repeat.

**Impossibility result:** The label set  $\bar{L}(T)$  is not fit for strategy iteration [Ohlmann '22].

# Strategy iteration

## Strategy-Iteration( $G, \pi, T, \tau$ )

- 1  $\mu(v) \leftarrow \min L(T)$  for all  $v \in V$
- 2  $\mu \leftarrow$  least fixed point of  $G_\tau$  which is **at least**  $\mu$
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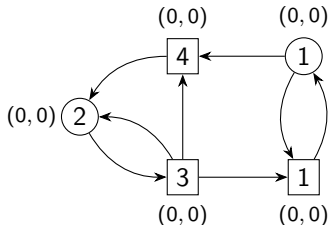




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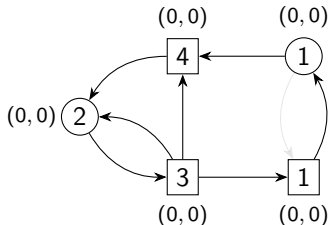
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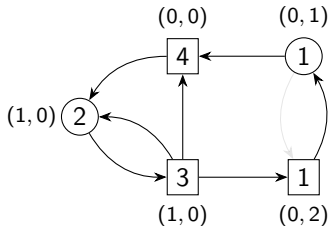
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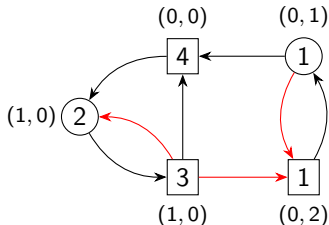
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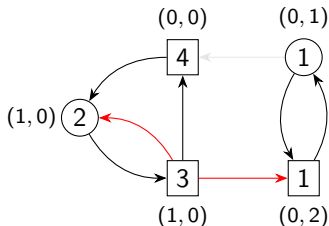
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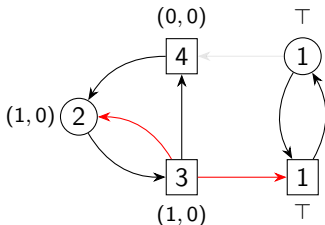
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# Computing the least fixed point of $G_\tau$

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- Value iteration on the 1-player game  $G_\tau$  still takes  $\Theta(|L(T)|)$  time.

**Idea:** Approach the least fixed point from **above**.

- ▶ Inspired by label-correcting (e.g. Bellman–Ford) and label-setting (e.g. Dijkstra) techniques from shortest path.
- We give an efficient method to compute the least fixed point of  $G_\tau$  for any universal tree  $T$ .

## Running times for specific $T$

- ▶  $O(d(m + n \log n))$  for a perfect  $(n, d/2)$ -universal tree.
- ▶  $O(mn^2 \log n \log d)$  for a succinct  $(n, d/2)$ -universal tree.
- ▶  $O(mn^2 \log^3 n \log d)$  for a Strahler  $(n, d/2)$ -universal tree (introduced by [Daviaud, Jurdziński, Thejaswini '20]).

# Conclusion

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- We now have a strategy iteration framework for parity games that works with universal trees.
- Total running time is upper bounded by value iteration's running time.

**Open question:** Is there a subquasi-polynomial pivot rule using **some** universal tree?