

## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor



## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor


How do we determine who wins a play?

## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor

- Each vertex has a priority $\{0,1,2, \ldots, d\}$
- Highest priority seen infinitely often determines winner
- Player Even wins if this number is even


## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor


How do we determine who wins a vertex?

## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor


A player wins a vertex if it has a strategy to win all plays from that vertex

## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor


Which vertices are won by which player?

## Parity Games

- A parity game is played on a directed graph
- Two players: Even O and Odd $\square$
- The players move a token along the edges of the graph
- Each vertex is owned by one player who chooses a successor


Player Odd wins all vertices with strategy $\{\mathbf{d} \rightarrow \mathbf{e}\}$

## Parity Games

## Known facts of parity games

- Some vertices are won by Even, some vertices are won by Odd
- The winner has a memoryless strategy to win

Memoryless strategy
"If I always play from $v$ to $w$, then I win all plays from $v$ "

## Parity Games

## Known facts of parity games

- Some vertices are won by Even, some vertices are won by Odd
- The winner has a memoryless strategy to win


## - Memoryless strategy

"If I always play from $v$ to $w$, then I win all plays from $v$ "

## Solving a parity game

- Determine the winner of each vertex
- Compute the strategy for each player


## Parity Games

Why do we want to solve parity games?

- As expressive as nested least and greatest fixpoint operators
- Polynomial-time equivalent to:
- modal $\mu$-calculus model-checking
- solving Boolean Equation Systems
- Backend for LTL model checking and LTL synthesis


## Parity Games

## Why do we want to solve parity games?

- As expressive as nested least and greatest fixpoint operators
- Polynomial-time equivalent to:
- modal $\mu$-calculus model-checking
- solving Boolean Equation Systems
- Backend for LTL model checking and LTL synthesis

Open question: Is solving parity games in $\mathbf{P}$ ?

- The problem is in NP $\cap$ co-NP
- The problem is in UP $\cap$ co-UP
- It is believed a polynomial solution exists


## Parity Games

| (Incomplete list of) published algorithms |  |  |
| :--- | :--- | :--- |
| McNaughton/Zielonka | $\mathcal{O}\left(e \cdot n^{d}\right), \mathcal{O}\left(2^{n}\right)$ | 1998 |
| Small Progress Measures | $\mathcal{O}\left(d \cdot e \cdot(n / d)^{d / 2}\right)$ | 1998 |
| Strategy Improvement | $\mathcal{O}\left(n \cdot e \cdot 2^{e}\right)$ | 2000 |
| Dominion Decomposition | $\mathcal{O}\left(n^{\sqrt{n}}\right)$ | 2006 |
| Big Step | $\mathcal{O}\left(e \cdot n^{d / 3}\right)$ | 2007 |
| APT | $\mathcal{O}\left(n^{d}\right)$ | 2016 |
| Priority Promotion | Exponential | 2016 |
| Quasi-Polynomial (multiple) | $\mathcal{O}\left(n^{6+\log d}\right)$ | $2016-2018$ |
| Tangle Learning | (tbd) | 2018 |

## Parity Games

## Attractor computation

Compute all vertices from which player $\alpha$ can ensure arrival in a target set

Start with the target set $A$, then iteratively add vertices to $A$ :

- All vertices of $\alpha$ with an edge to $A$
- All vertices of $\bar{\alpha}$ with only edges to $A$


## Parity Games

Example of attractor computation

Computing the $\square$-attractor to a


Initial set: $\{\mathbf{a}\}$
Can attract: d but not b

## Parity Games

Example of attractor computation

Computing the $\square$-attractor to a


## Parity Games

Example of attractor computation

Computing the $\square$-attractor to a


## Contributions

The notion of a tangle

- A tangle is a strongly connected subgraph, such that all plays that stay in the tangle are won by one player
- Therefore the other player must leave the subgraph



## Contributions

The notion of a tangle

- A tangle is a strongly connected subgraph, such that all plays that stay in the tangle are won by one player
- Therefore the other player must leave the subgraph

The role of tangles in parity game solving algorithms

- Many algorithms implicitly explore tangles
- They often explore the same tangles over and over again
- This leads to an exponential number of steps


## Contributions

## Main contribution

Tangles can be used with attractor computation! The loser must leave the tangle Thus we can attract vertices of a tangle together

## Contributions

## Tangle learning

- Extend attractor computation to attract tangles
- Use extended attractor computation to decompose the game
- Compute attractor set to highest priority
- Remove this attractor set from the game
- Analyse decomposition to compute new tangles
- Refine decomposition with new tangles
- Repeat this until the game is solved


## Empirical evaluation

- Evaluated using Oink (TACAS 2018)
- Benchmarks
- Model checking and equivalence checking games [Keiren 2015]
- Random games
- Random games with max out-degree 2
- Runtimes in seconds, timeout 20 minutes

| Solver | MC\&EC <br> time | Random <br> time | Random (low degree) <br> time | timeouts |
| :--- | ---: | ---: | ---: | ---: |

## Empirical evaluation



## Conclusions

- Fast moving field with great progress in the last few years
- Existing algorithms implicitly explore tangles repeatedly
- Tangles can be used with attractor computation
- Tangle learning explicitly remembers tangles
- See for yourself: https://www.github.com/trolando/oink

| Solver | MC\&EC <br> time | Random <br> time | Random (low degree) <br> time | timeouts |
| :--- | ---: | ---: | ---: | ---: |

