## Exact Algorithms and Lowerbounds for Multiagent Pathfinding

Foivos Fioravantes ${ }^{1}$ Dušan Knop ${ }^{1}$ Jan Matyáš Křišťan ${ }^{1}$<br>Nikolaos Melissinos ${ }^{1}$ Michal Opler ${ }^{1}$<br>${ }^{1}$ Department of Theoretical Computer Science, FIT, Czech Technical University in Prague, Czechia

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## Multiagent Pathfinding



The problem:

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions:
swap or not


## Question:

What is the makespan
$=$ minimum number of
rounds?

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## Multiagent Pathfinding - Swaps allowed

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## Multiagent Pathfinding - Swaps allowed

## The problem:



Round 3

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions: swap or not

Question:<br>What is the makespan<br>$=$ minimum number of rounds?<br>$\rightarrow$ Here, at least 5 rounds<br>for the blue robot

## Multiagent Pathfinding - Swaps allowed

## The problem:



Makespan $=5$

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions: swap or not


## Question:

What is the makespan
$=$ minimum number of rounds?
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## Multiagent Pathfinding - Swaps allowed

## The problem:



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## Multiagent Pathfinding - Swaps not allowed

## The problem:



Round 0

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions: swap or not

Question:<br>What is the makespan<br>$=$ minimum number of rounds?<br>$\rightarrow$ Here, at least 5 rounds<br>for the blue robot

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## Multiagent Pathfinding - Swaps not allowed

## The problem:



Round 3

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Question:<br>What is the makespan<br>$=$ minimum number of<br>rounds?<br>$\rightarrow$ Here, at least 5 rounds<br>for the blue robot

## Multiagent Pathfinding - Swaps not allowed

## The problem:



Round 4

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions: swap or not

Question:<br>What is the makespan<br>$=$ minimum number of<br>rounds?<br>$\rightarrow$ Here, at least 5 rounds<br>for the blue robot

## Multiagent Pathfinding - Swaps not allowed

## The problem:



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## Multiagent Pathfinding - Swaps not allowed

## The problem:



Makespan $\leq 7$

- Each robot wants to reach its colour
- Move in parallel
- Centralised decisions
- Two versions: swap or not

Question:<br>What is the makespan<br>$=$ minimum number of rounds?<br>$\rightarrow$ Here, at least 5 rounds<br>for the blue robot

## What is already known?

The problem is hard

- NP-complete (2010, Surynek),
- even on planar graphs (2019, $\mathrm{Yu})$


## Heuristics (2019, Stern)

- $A^{*}$-based (1968, Hart, Nilsson, Raphael)
- SAT-based (2017, Surynek et al.)
- Scheduling (2018, Barták, Švancara, Vlk)


## Theorem (2023, Eiben, Ganian, Kanj)

When allowing swaps, deciding if makespan $\leq 26$ remains NP-complete even when $G$ is planar and $\Delta(G)=4$.

## Similar problems

- Same problem but sequential moves of the robots (1984, Kornhauser, Miller, Spirakis)
- One robot on each vertex: Token swapping (2022, Aichholzer et al.), (2018, Bonnet, Miltzow, Rzazewski)


## What we did

Studied parameterised complexity of the problem:


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## Theorem

When (not resp.) allowing swaps, deciding if makespan $\leq 3$ ( $\leq 2$ resp.) remains NP-complete even when $G$ is planar and $\Delta(G)=4(\Delta(G)=5)$.

## Main tool for polynomial algorithms

## Time-expanded graph



Time expanded graph with 3 layers: $G_{T}(3)$

## Time-expanded graph



## Time-expanded graph



## Time-expanded graph



G


## Time-expanded graph



Time expanded graph with 3 layers: $G_{T}(3)$

## Time-expanded graph



Time expanded graph with 3 layers: $G_{T}(3)$

## Ingredients:

1 Given $G$, starting and ending positions $s_{i}, t_{i}, 1 \leq i \leq k$, the makespan is $\ell$ iff there exist $k$ VERTEX-DISJOINT PATHS from the $s_{i}$ 's to the $t_{i}$ 's in $G_{T}(\ell)$.

## Time-expanded graph



Time expanded graph with 3 layers: $G_{T}(3)$

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1 Given $G$, starting and ending positions $s_{i}, t_{i}, 1 \leq i \leq k$, the makespan is $\ell$ iff there exist $k$ VERTEX-DISJOINT PATHS from the $s_{i}$ 's to the $t_{i}$ 's in $G_{T}(\ell)$.
2 FPT algorithm for $k$ VERTEX-DISJOINT PATHS parameterised by treewidth (1994, Scheffler).
3 FPT algorithm for $k$ VERTEX-DISJOINT PATHS parameterised by $k+\ell$ (2011, Golovach and Thilikos).

## Time-expanded graph



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Careful: $G_{T}(\ell)$ has treewidth bounded by $t w(G)+\ell$.

# NP-hardness for trees 

## Multiagent Pathfinding on Trees

## Theorem

When not allowing swaps, it is NP-hard to compute the makespan of $T$, even when $T$ is a tree with $\Delta(T)=5$.

Reduction from Token Swapping:

- same problem as ours, one robot on each vertex
- swaps allowed
- NP-hard for trees (2022, Aichholzer et al.)


## Multiagent Pathfinding is hard on Trees

Main idea on graphs of treewidth 2:


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To go to trees:

- Replace rhombuses by complete binary trees of height $\lceil\log (\Delta)+1\rceil$
- Carefully adjust the lengths and agents of the extra paths


## Conclusion

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## Merci!

