

# Grid Multi-Robot Path Planning with the Corner Following Constraint: Tighter Bounds and Intractability

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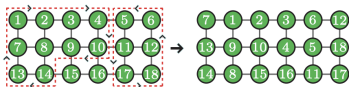
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# Multi-Robot Path Planning (MRPP) Problems

**Grid MRPP:** Suppose you have a grid graph  $G(V, E)$  and  $n$  robots with start configuration  $S = \{s_1, \dots, s_n\} \subseteq V$  and goal configuration  $G = \{g_1, \dots, g_n\} \subseteq V$ . We seek to route the robots along collision-free paths  $P_i$  efficiently. In particular, we seek to minimize the overall makespan where motion is uniform without any meet or head-on collisions.

**MRPP with CFC:** Additionally, we may have a corner following constraint.



(a) Single time step move [1]



(b) Corner Following Constraint [2]

# Motivation



(a) Ocado Systems <sup>a</sup>

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<sup>a</sup>“Inside a Warehouse Where Thousands Of Robots Pack Groceries.” Tech Insider.



(b) Automated Garages <sup>a</sup>

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<sup>a</sup>“Automated Multistory Parking Facilities.” Trends in Japan.

**Rubik Tables:** an  $m \times n$  grid can be arbitrarily permuted in three phases, permuting  $m$  rows,  $n$  columns, and then  $m$  rows again [1].

**Grid MRPP:** sub-1.5 time-optimal algorithms via Rubik Tables [3].

**MRPP with CFC:**

	$\Theta(m_1 m_2)$ Escorts	$\Theta(m_1 + m_2)$ Escorts	$\Theta(1)$ Escorts
Upper Bound	$O(m_1 + m_2)$	$O(m_1 m_2)^*$	-*
Lower Bound	h.p. $\Omega(m_1 + m_2)$	h.p. $\Omega(m_1 + m_2)$	exp. $\Omega(m_1 m_2)$

Note: escorts are the empty spaces in our MRPP instance.

## Theorem (Single Escort MRPP with CFC Makespan)

*A given MRPP with CFC instance on an  $m_1 \times m_2$  grid for  $m_1, m_2 \geq 2$  containing a single escort can be solved in  $O(m_1 m_2)$  time.*

This matches the  $\Omega(m_1 m_2)$  expected lower bound.

## Theorem ( $k$ Escorts MRPP with CFC Makespan)

*A given MRPP with CFC instance on an  $m_1 \times m_2$  grid for  $m_1, m_2 \geq 2$  containing  $k \leq \min(m_1, m_2)$  escorts can be solved in  $O(m_1 m_2 / k)$  time, and for  $k > \min(m_1, m_2)$ , it can be solved in  $O(\max(m_1, m_2))$  time.*

These match the  $\Omega(m_1 m_2 / k)$  expected lower bound and  $\Omega(\max(m_1, m_2))$  high probability lower bound respectively.

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Overall Strategy: Rubik Tables

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**Lemma (Linear  $3 \times m$  Sort)**

*Given a single escort, a  $3 \times m$  grid can be arbitrarily permuted except possibly with two adjacent tiles swapped, which can be arbitrarily chosen, in  $O(m)$  time.*



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## Lemma (Linear $2 \times m$ Sort)

*Given a single escort, a  $2 \times m$  grid can be arbitrarily permuted except possibly with two adjacent tiles swapped, which can be arbitrarily chosen, in  $O(m)$  time.*

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**Corollary (Linear  $2 \times m$  Half-Sort)**

*Given a single escort, a  $2 \times m$  grid can be permuted to fill one of its rows arbitrarily in  $O(m)$  time.*

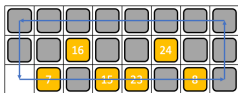
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# Linear $3 \times m$ Sort

How can we permute the robots while leveraging batched movement with just a single escort?

- 1 We solve a subgrid, ignoring the other elements, giving us “room” to arrange the chosen elements.
- 2 We use a “highway” to move elements in batches into the right order.



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# MRPP with CFC Related Decision Problems

**MRPP<sub>CFC</sub>**: The corresponding decision problem for general MRPP with CFC, which asks whether there exists a solution routing with a makespan bounded by a given number  $k$ .

- Motivation: automated garages, warehouse automation, ...

**SnPUZ**: Single Escort MRPP<sub>CFC</sub>, or Synchronous nPUZ (referring to the  $(n^2 - 1)$ -puzzle, which is known to be NP-hard [4], [5])

- Motivation: making full use of automated garages in locations where space is a premium

**BSnPUZ**: binary SnPUZ, i.e. tiles are black or white

- Motivation: rearranging quickly when exact object placement isn't important, e.g. AG pickup interval

**PSnPUZ**: partial SnPUZ, i.e. tiles are unique except for some number of indistinguishable white tiles

- Motivation: partially sorting AG prioritizing urgent (time or importance) pickup times

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Likewise, the same construction can be used to show that

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*PSnPUZ is NP-hard.*

The above intractability holds if we require exactly  $\lfloor n^\epsilon \rfloor$  escorts/white tiles for a fixed constant  $0 < \epsilon < 2$ . In addition, they all belong to NP and thus are NP-complete.

# Acknowledgements

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