# Multi-Robot Path Planning with Due Times

#### Hanfu Wang and Weidong Chen

Institute of Medical Robotics and Department of Automation, Shanghai Jiao Tong University

January 16, 2022

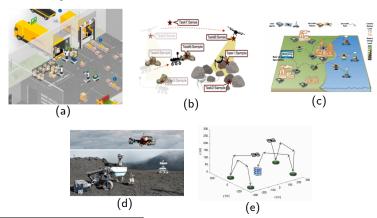


### Outline

- Introduction and Motivation
- 2 Problem Formulation
- Methodology
- Results and Analysis
- Conclusions and Future Work
- 6 References

# Introduction: Multi-Robot Path Planning

• multi-robot path planning (MRPP)<sup>1</sup> or multi-agent path finding (MAPF)<sup>2</sup> is an enabling research field for practical deployment of multi-robot systems



<sup>&</sup>lt;sup>1</sup>Lynne E. Parker. "Multiple Mobile Robot Teams, Path Planning and Motion Coordination in". In: Encyclopedia of Complexity and Systems Science (2009), pp. 5783-5800, DOI: 10.1007/978-0-387-30440-3 344.

<sup>&</sup>lt;sup>2</sup>Roni Stern. "Multi-Agent Path Finding – An Overview". In: Artificial Intelligence. Springer International Publishing, 2019 DOI: 10 1007/978-3-030-33274-7

#### Introduction: Solutions

- MRPP or MAPF can be solved by various methodologies:
  - reduction-based (SAT, ILP, AST...)
  - search-based, optimal (CBS, ICBS, M\*...)
  - search-based, bounded suboptimal (ECBS, CBS-HWY...)
  - search-based, unbounded suboptimal (HCA\*,WHCA\*,co-WHCA\*...)
  - rule-based (Push&Swap, Push&Rotate, traffic rules...)
  - decoupled (prioritized planning, path coordination...)
  - sensor-based or reactive (ORCA...)
  - learning-based (PRIMAL,PRIMAL2,MAGAT...)
  - **...**

#### Motivation

- in practice, multi-robot systems have to accomplish tasks with due times can be anticipated
- multi-robot path planning with time and distance-based objectives:<sup>3</sup>
  - makespan
  - total travel times
  - maximum distance
  - total distances
- multi-agent path finding with deadline-based objectives:<sup>4</sup>
  - the number of successful agents
- none of existing problem formulations could reflect soft temporal constraints of tasks<sup>5</sup>

<sup>&</sup>lt;sup>3</sup> Jingjin Yu and Steven M. LaValle. "Optimal Multirobot Path Planning on Graphs: Complete Algorithms and Effective Heuristics". In: IEEE Transactions on Robotics 32.5 (2016), pp. 1163–1177. ISSN: 15523098. DOI: 10.1109/TRN.2016.2593448. arXiv: 1507.03290.

<sup>&</sup>lt;sup>4</sup>Hang Ma et al. "Multi-agent path finding with deadlines". In: *IJCAI International Joint Conference on Artificial Intelligence* 2018-July (2018), pp. 417–423. ISSN: 10450823.

<sup>&</sup>lt;sup>5</sup>Ernesto Nunes et al. "A taxonomy for task allocation problems with temporal and ordering constraints". In: Robotics and Autonomous Systems 90 (2017), pp. 55–70. ISSN: 09218890. DOI: 10.1016/j.robot.2016.109008.4 \*\*\(\frac{1}{2}\) \*\(\frac{1}{2}\) \*\(\frac{1}

### Problem Formulation: MRPP-DT

- inputs:
  - underlying graph G = (V, E)
  - ightharpoonup robot set R composed of n robots
  - ightharpoonup start vertices  $V_s$
  - ightharpoonup goal vertices  $V_q$
  - due times D
- outputs:
  - ▶ n feasible collision-free paths  $P = \{p_1, \dots, p_n\}$
- three due time-related objectives:
  - ightharpoonup minimization of maximum lateness  $L_{max}$
  - minimization of total tardiness  $\sum_{i=1}^{n} H_i$
  - lacktriangle minimization of total unit penalties  $\sum_{i=1}^n U_i$

### Problem: Multi-Robot Path Planning with Due Times

Given  $(G,R,V_s,V_g,D)$  as is described previously, find an optimal solution  $P=\{p_1,\cdots,p_n\}$  composed of n feasible collision-free paths for all robots with objective 1, 2, or 3.

# **Examples and Problem Analysis**

## Examples

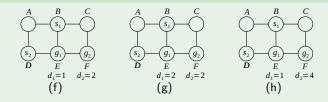


Figure: Three examples with the same start and goal vertices, but different due times. The underlying graph has 6 vertices.

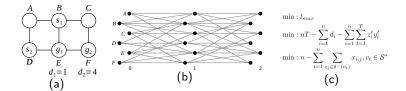
#### Intractrability

The MRPP-DT problem is NP-hard.

#### Parato Structure

Any two of seven objectives cannot be optimized simultaneously.

# Reduction-based Algorithms



### Completeness Theorem

MINMAXLAT, MINTOTALTARD, MINTOTALUP are all complete.

# Instance Design

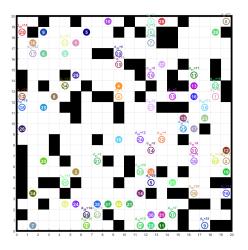


Figure: An MRPP-DT instance with 40 robots on a  $20 \times 20 \times 20\%$  grid map.

# Results of Objective 1

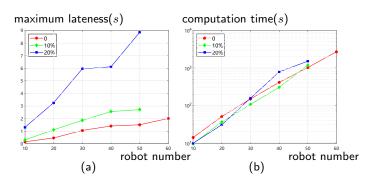


Figure: Performance of  $\operatorname{MinMaxLat}$  over MRPP-DT instances.

## Results of Objective 2

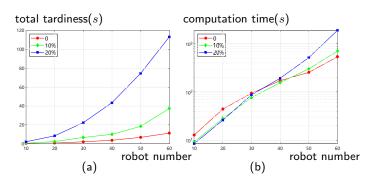


Figure: Performance of  $\operatorname{MinTotalTard}$  over MRPP-DT instances.

## Results of Objective 3

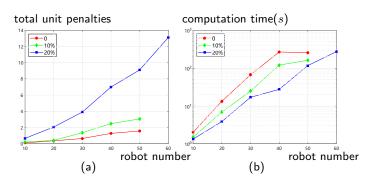


Figure: Performance of  $\operatorname{MinTotalUP}$  over MRPP-DT instances.

12 / 14

#### Conclusions and Future Work

- conclusions:
  - MRPP-DT is formulated to address task awareness in path coordination level
  - complete reduction-based algorithms are developed
- future work:
  - develop fast algorithms
  - apply related ideas in practical applications, i.e., logistics
  - combined task and path planning

## **Key References**

- Lynne E. Parker. "Multiple Mobile Robot Teams, Path Planning and Motion Coordination in". In: Encyclopedia of Complexity and Systems Science (2009), pp. 5783–5800. DOI: 10.1007/978-0-387-30440-3\_344.
- [2] Roni Stern. "Multi-Agent Path Finding An Overview". In: Artificial Intelligence. Springer International Publishing, 2019, pp. 96–115. DOI: 10.1007/978-3-030-33274-7 6.
- [3] Jingjin Yu and Steven M. LaValle. "Optimal Multirobot Path Planning on Graphs: Complete Algorithms and Effective Heuristics". In: *IEEE Transactions on Robotics* 32.5 (2016), pp. 1163–1177. ISSN: 15523098. DOI: 10.1109/TR0.2016.2593448. arXiv: 1507.03290.
- [4] Hang Ma et al. "Multi-agent path finding with deadlines". In: IJCAI International Joint Conference on Artificial Intelligence 2018-July (2018), pp. 417–423. ISSN: 10450823.
- [5] Ernesto Nunes et al. "A taxonomy for task allocation problems with temporal and ordering constraints". In: *Robotics and Autonomous Systems* 90 (2017), pp. 55–70. ISSN: 09218890. DOI: 10.1016/j.robot.2016.10.008.