# Multi-Agent Path Finding for Large Agents

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#### **1 Abstract**

Multi-Agent Path Finding (MAPF) has been widely studied in the AI community. For example, Conflict-Based Search (CBS) is a state-of-the-art MAPF algorithm based on a two-level tree-search. However, previous MAPF algorithms assume that an agent occupies only a single location at any given time, e.g., a single cell in a grid. This limits their applicability in many real-world domains that have geometric agents in lieu of point agents. Geometric agents are referred to as "large" agents because they can occupy multiple points at the same time. In this paper, we formalize and study LA-MAPF, i.e., MAPF for large agents. We first show how CBS can be adapted to solve LA-MAPF. We then present a generalized version of CBS, called Multi-Constraint CBS (MC-CBS), that adds multiple constraints (instead of one constraint) for an agent when it generates a high-level search node. Experimental results show that all MC-CBS variants outperform CBS by up to three orders of magnitude in terms of runtime.

## **3 Multi-Agent Path Finding for Large Agent (LA-MAPF)**

MAPF is the planning problem of finding a set of paths for a team of agents on a given graph. Each agent is required to move from a start location to a goal location, while avoiding collisions with other agents.

- MAPF: Agents are point agents. They collide when they are at the same vertex.
- LA-MAPF: Agents have extent. Different agents could have different shapes. They collide when their shapes overlap.



Figure 3: Agent model.

**Figure 4:** A collision example for LA-MAPF.

## **5 Multi-Constraint CBS (MC-CBS**

# **2** Application



Figure 1: Autonomous towing ve-Figure 2:Autonomoushicles for taxiing aircraft [1].warehouse robots [3].

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1. Find a path for every agent independently.

- 2. Check for collisions among paths.
- 3. If there is a collision
  - <agent A, agent B, vertex v, time t>:
    - Option 1: prohibit A from being at v at t by adding constraint <A, v, t>.

4 Conflict-Based Search (CBS) [2]

- Option 2: prohibit B from being at v at t by adding constraint <B, v, t>.
- 4. Repeat until finding collision-free paths.





**Figure 6:** MC-CBS adds a constraint set, instead of a single constraint, to a child node.

![](_page_0_Figure_29.jpeg)

Figure 7: An MC-CBS example.

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![](_page_0_Figure_32.jpeg)

Figure 5: Applying CBS to solve an LA-MAPF instance.

\* A/B means the center of A/B cannot be at cell A/B. Large agents usually have a large set of related collisions in close proximity. CBS has to resolve them one by one.

7 Experimental Results

![](_page_0_Figure_36.jpeg)

**Ellipsoid agents on a 3D roadmap.** The environment is a 7.5 m  $\times$  6.5 m  $\times$  2.5 m space with (0.15 m, 0.15 m, 0.3 m) ellipsoid quadrotors. Quadrotors are required to fly through 3 windows in

a wall in opposite directions. The roadmap has 869 vertices and 3,371 edges.

![](_page_0_Picture_39.jpeg)

MC-CBS can resolve a set of related collisions in a single step.

To guarantee the optimality of MC-CBS, any pair of conflict-free paths should satisfy at least one of the constraint sets  $C_1$  and  $C_2$ .

# **6 Mutually Disjunctive**

**Definition 1**. Two constraints for A and B, respectively, are *mutually disjunctive* iff any pair of conflict-free paths for A and B satisfies at least one of the two constraints.

**Definition 2**. Two constraint sets are *mutually disjunctive* iff each constraint in one set is mutually disjunctive with each constraint in the other set.

**Theorem 1**. If two constraint sets  $C_1$  and  $C_2$  are mutually disjunctive, any pair of conflict-free paths satisfies at least one of the constraint sets.

Approaches for choosing mutually disjunctive constraint sets:

#### **Square agents on 2D grids.**

![](_page_0_Figure_48.jpeg)

**Figure 8:** Success rates (=solved instances) on 2D grids. The runtime limit for left figures is 5 minutes. The right figures are results of all numbers of agents. Summary:

- All MC-CBS variants outperform CBS in all domains by up to 3 orders of magnitude in terms of runtime.
- MDD-SAT is strong for difficult problems in small domains.
- MAX is strong for easy problems or in large domains.

- ASYM: |C<sub>1</sub>| = 1 and |C<sub>2</sub>| > 1 (e.g., Fig. 5).
  SYM: |C<sub>1</sub>| ≈ |C<sub>2</sub>|.
- MAX:  $C_1$  and  $C_2$  maximize the increased costs of the child nodes.

## References

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Figure 10: Runtime on the 3D roadmap.