# Multi-Agent Pathfinding with Matching using Increasing Cost Tree Search

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#### **Experimental** results **Research** questions Multi-agent pathfinding with matching 1 3 6 100 In **Multi-agent pathfinding (MAPF)**, the goal is to move k agents to their goals 1. How can ICTS be used to solve MAPF with matching? without collisions. 2. How does ICTS compare to alternative algorithms for MAPFM? 75 50 Multi-agent pathfinding with Matching (MAPFM) generalizes MAPF to allow agents to be matched with one or more goals: each agent and goal is assigned Two strategies for solving MAPFM using ICTS were identified. 25 Exhaustive ICTS a color, and in a solution agents may move to any goal of the same color. ICTS-m There are as many goals as agents of each color. 12 13 14 8 9 10 11 15 **Exhaustive ICTS** Δ 100 Objective: minimize the Sum of Individual agent Costs (SIC) C, the total amount of time spent travelling to the goals by agents. Matchings are enumerated as MAPF instances and solved using ICTS. To 75 improve performance, the lowest C found so far can be used as upper bound 50 in the search. Additionally, matchings can be ordered by C\* to heuristically Bounding Child pruning improve the bounding. Exhaustive ICTS agents Ordering 12 13 14 8 10 11 15 A\*-OD-ID - CBM goals 2, 1, 2 1, 2, 2 1, 1, 3 EPEA\* Exh+E+B+O $(2,1,2) \rightarrow C = 5$ 50 $C^* = 4$ Edge labels indicate the shortest path cost from agent to goal $C^* = 6$ for this matching so it is pruned 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25

Each graph indicates the fraction of problems solved as function of k within 120s by different algorithms. Each problem was set on a 20x20 grid with 25% of tiles being obstacles and the k agents were evenly divided into three teams.

## Conclusion

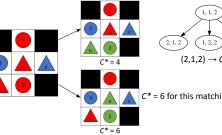
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Exhaustive ICTS clearly outperforms ICTS-m but does not scale well. Both bounding and ordering make a significant difference in terms of performance. Exhaustive ICTS performs similar to other exhaustive methods, but exhaustive methods in general are often outperformed by CBM.

#### Increasing Cost Tree Search 2

Increasing Cost Tree Search (ICTS) is a two-level algorithm for MAPF.

- Level 1. Starting with the sum of the shortest path costs C\*, all combinations of individual agent costs adding up to a target C are enumerated. This is done by a breadth-first traversal of an Increasing Cost Tree, with cost combinations as nodes.
- Level 2. For each combination of agent costs, all combinations of agent paths corresponding to those agent costs are searched for a solution. This is done using MDDs, data structures that can compactly represent paths.



## ICTS-m

Both levels of ICTS were modified to optimally solve MAPFM.

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- Level 1. Instead of C\*, the sum of shortest paths to any matching goal is the first target C considered.
- Level 2. For each agent, all paths to any matching goal corresponding to its ICT-node cost are generated.