

# A SAT-Based Approach to Cooperative Path-Finding Using All-Different Constraints



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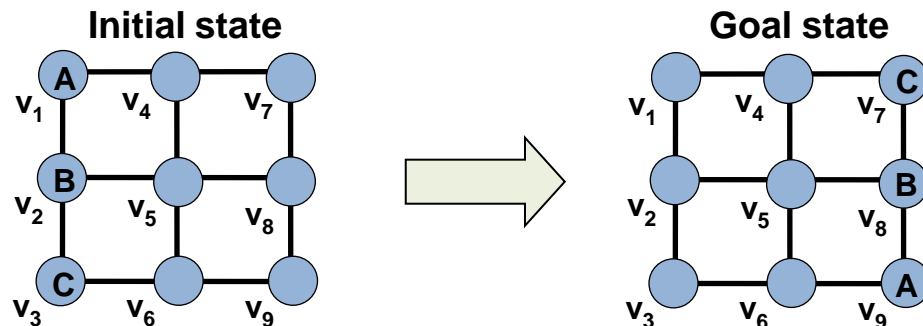
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# Cooperative Path-finding (CPF)

- plan movements of agents in **space** and **time**
  - **time** – discrete  $\Rightarrow$  time steps
  - **space** – abstract  $\Rightarrow$  graph  $G=(V,E)$
- **requirements**
  - all agents reach a given **goal vertex**
  - agents do **not collide** with each other  
(move only to vacant vertices)



Set of **agents** = {1,2,3}

plan for **agent A** = [ $v_1$ ,  $v_4$ ,  $v_7$ ,  $v_8$ ,  $v_9$ ,  $v_9$ ,  $v_9$ ]

plan for **agent B** = [ $v_2$ ,  $v_2$ ,  $v_1$ ,  $v_4$ ,  $v_7$ ,  $v_8$ ,  $v_8$ ]

plan for **agent C** = [ $v_3$ ,  $v_3$ ,  $v_3$ ,  $v_2$ ,  $v_1$ ,  $v_4$ ,  $v_7$ ]

Time step: 1 2 3 4 5 6 7  
makespan = 7

# Current Techniques / Our Approach

○ fast, complete  
✗ long makespan

○ relatively fast  
✗ incomplete

○ optimal makespan  
✗ slow

polynomial time  
sub-optimal

+

**SAT Solver**

+

**encoding of CPF**

+

optimization **strategy**

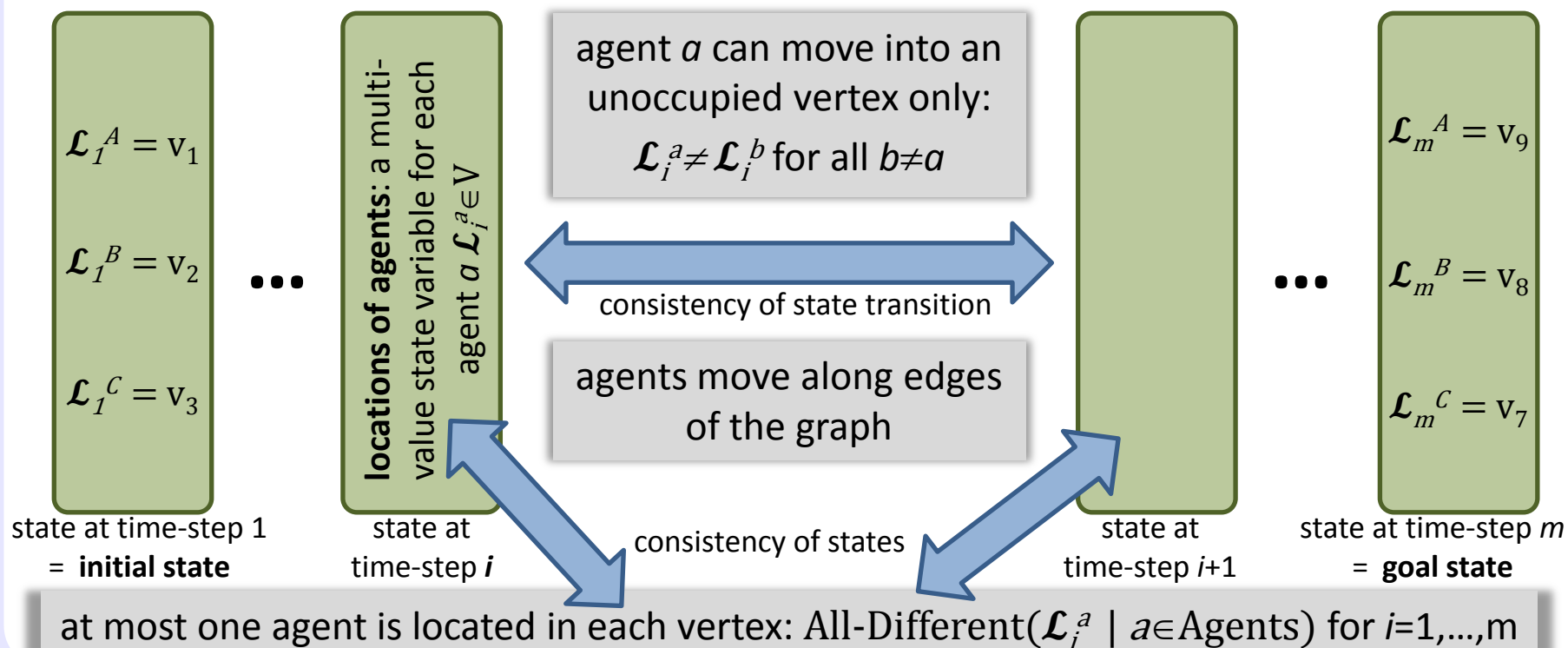
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**Our new approach – iCoBoPT**

- (quickly) find sub-optimal solution
- replace sub-sequences with makespan-optimal sub-solutions
- repeat the process

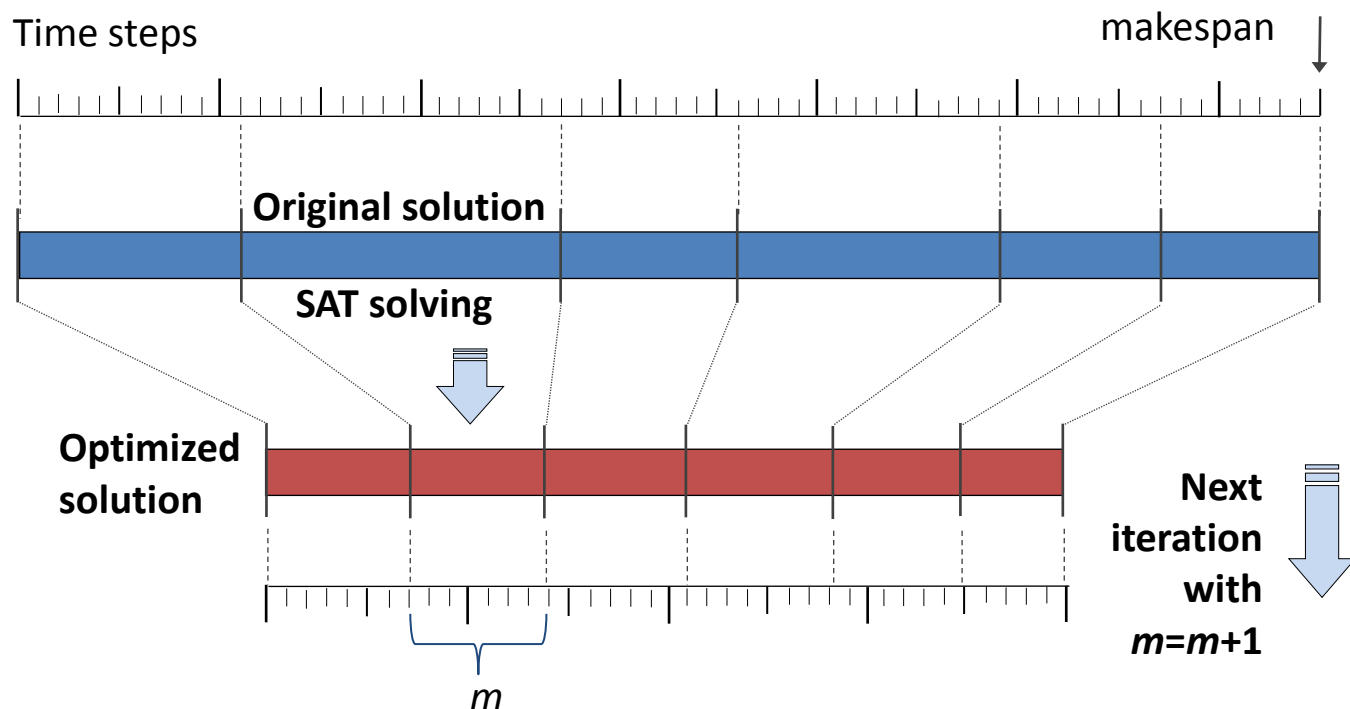
# SAT Encoding of CPF

- encoding for the **fixed makespan**  $m$
- encode state **at each time-step**
  - multi-value state variables  $\Rightarrow$  bit-vectors



# Optimization Strategy - iCOBOPT

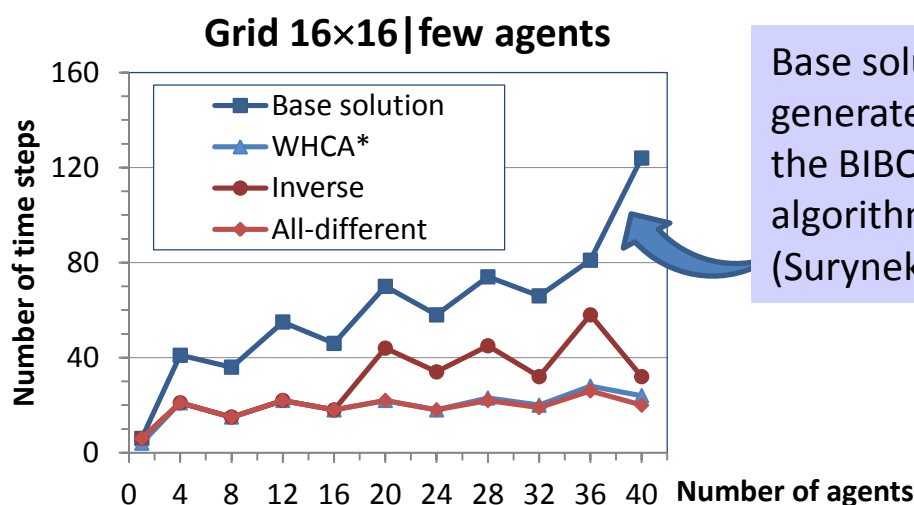
- for a fixed makespan  $m$  find the longest sub-sequence of the original solution that can be replaced with corresponding optimal sub-solution of makespan  $m$



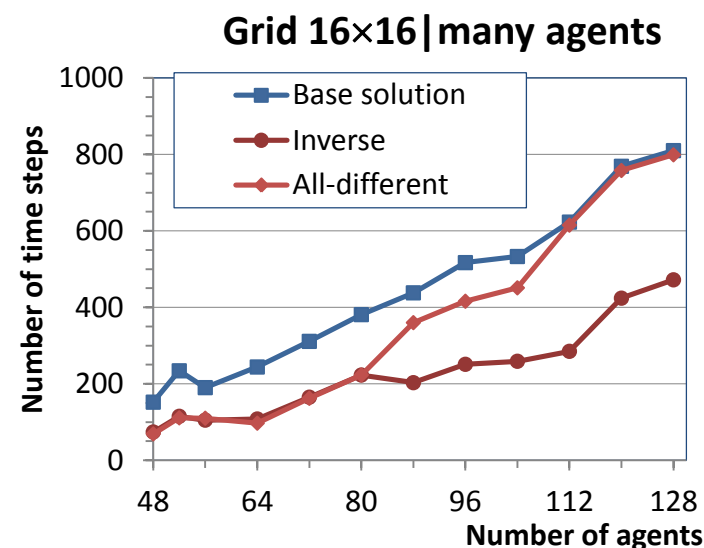
- iCOBOPT is similar to turbo-fullstep

# Experimental Results and Comparison

- setup:  $G=(V,E)$  = 4-connected grid  
**random** initial and goal arrangement of agents



Base solutions  
 generated by  
 the BIBOX  
 algorithms  
 (Surynek, 2009)



Number of agents	4-connected grid 16x16		
	Optimal makespan	SATPLAN Runtime (s)	SASE Runtime (s)
1	4	0.68	1.66
4	21	195.5	17.98
8	15	1396.07	128.87
16	N/A	Out of memory	Timeout

Number of agents	4-connected grid 16x16		
	Computed makespan	INVERSE Runtime (s)	ALL-DIFF Runtime (s)
1	6/6	0.074	0.070
4	21/21	319.785	45.367
8	15/15	152.625	62.955
16	18/18	1833.080	910.391

# Conclusions and Related Works

- Good performance on graphs with dense population agents
- Sometimes optimal solution can be found
- Encoding, sub-optimal algorithm, and optimization strategy can be improved independently

## References

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