

# Subgoal Graphs for Fast Optimal Pathfinding

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- 4 Conclusion

## Introduction

Simple Subgoal Graphs  
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General Idea  
Setting  
Octile Distance

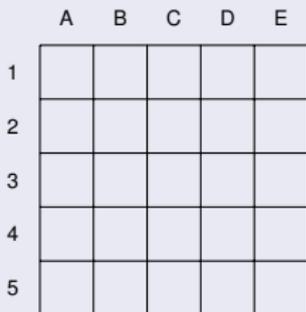
# Introduction

## General Idea

- Don't search on whole grid
- Use subgoal graph:
  - smaller
  - Nodes = Certain cells which are “subgoals”
  - Edges in the subgoal graph connect nodes which are visible to each other
  - preserve optimality

# Introduction

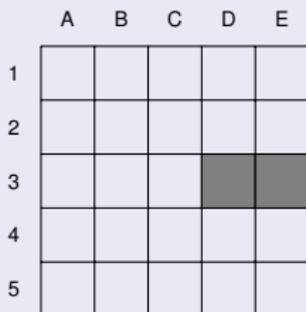
## Setting



■ 8-neighbor grid

# Introduction

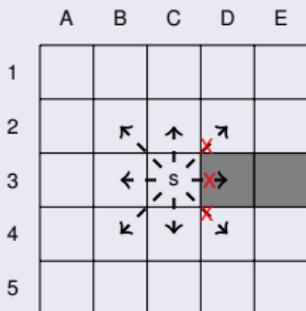
## Setting



- 8-neighbor grid
- blocked cells

# Introduction

## Setting



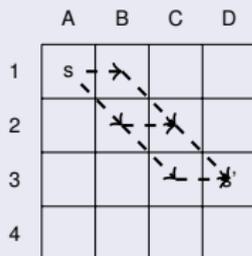
- 8-neighbor grid
- blocked cells
- actor:
  - occupies cell
  - may move in diagonal or cardinal direction if unblocked

## Octile Distance

	A	B	C	D
1	s			
2				
3				s'
4				

- Used as a heuristic for distance between two cells  $h(s, s')$ .
- $h(s, s')$  = length of shortest path between  $s$  and  $s'$ , disregarding obstacles

## Octile Distance

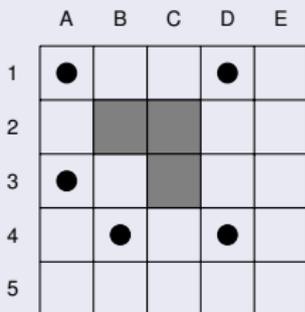


- Used as a heuristic for distance between two cells  $h(s, s')$ .
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- Here:  $h(s, s') = 2\sqrt{2} + 1$

# Simple Subgoal Graphs

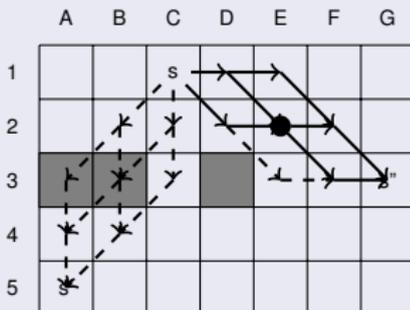
# Subgoal

## Subgoal



- Subgoals are defined as the cells at corners of obstacles

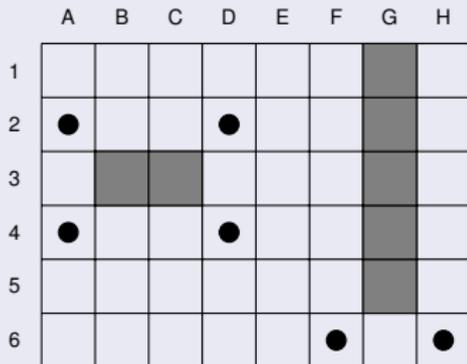
## (direct-)h-reachability



Let  $s$  and  $s'$  be two cells. Cells  $s$  and  $s'$  are:

- *h-reachable* if there is a shortest path between them
- *direct-h-reachable* if none of the shortest paths between them move over a subgoal

## Construction of a Simple Subgoal Graph

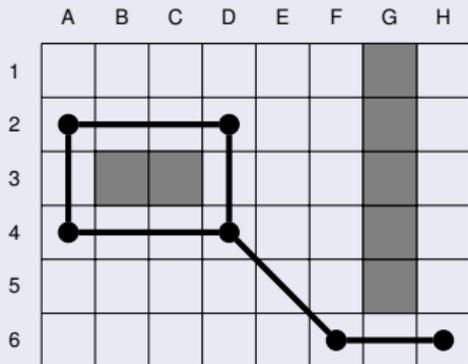


Given a grid:

- 1 Find subgoals
- 2 Connect direct-h-reachable subgoals

Grid setting taken from Uras and Koenig [2015]

## Construction of a Simple Subgoal Graph



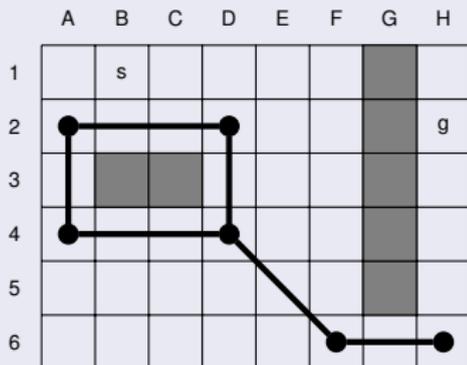
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## Searching on a simple subgoal graph

Given a start cell  $s$  and a goal cell  $g$ :

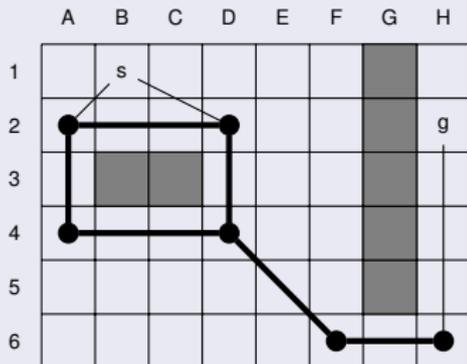


Grid setting taken from Uras and Koenig [2015]

- 1 Connect  $s$  and  $g$  to simple subgoal graph via direct-h-reachable subgoals
- 2 Search high-level path on simple subgoal graph with  $A^*$
- 3 Search segments of high-level path for with  $A^*$  to find low-level path on grid

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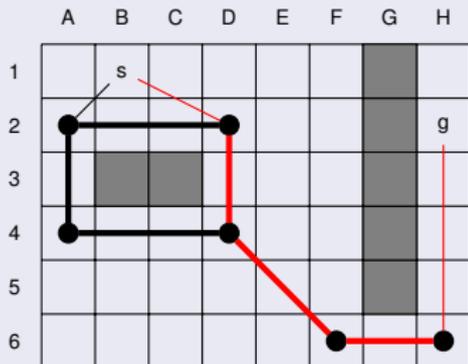


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To construct simple subgoal graph, and to connect start and goal cells to simple subgoal graph:

- Need to find all direct-h-reachable subgoals in vicinity of given cell

Speed up process?

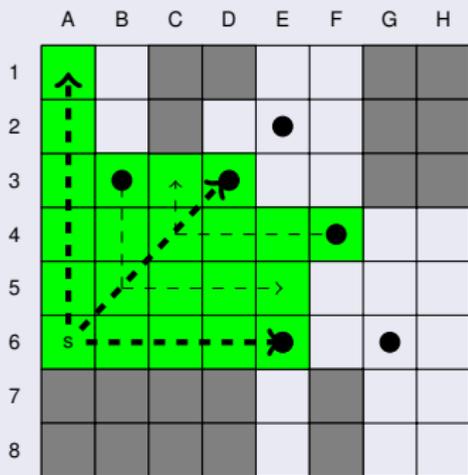
## Clearance value

Use clearance values!

Given cell  $s$  and cardinal or diagonal direction  $d$ :

- $Clearance(s, d)$  = how many moves can we take in direction  $d$ 
  - i before we reach an obstacle, or
  - ii until we reach a subgoal

## Getting all direct-h-reachable subgoals of a given cell



Example taken from Uras et al. [2013]

- Precompute clearance values of every cell on the grid in all diagonal and cardinal directions

Then, given cell  $s$ :

- 1 Partition space around  $s$  in octants.
- 2 For each octant, sweep horizontal lines beginning from diagonal lines

# Two-Level Subgoal Graphs

## Idea

Decrease search space with further abstraction:

- Partition subgoals into local and global subgoals, prune local subgoals from graph
- Perform high-level search only on global subgoals

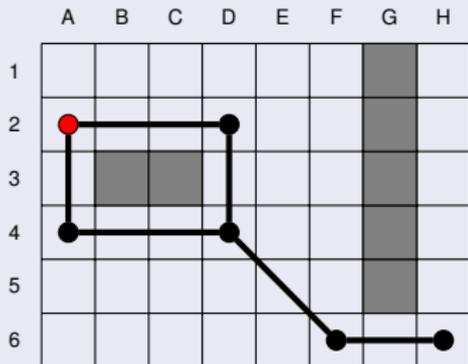
## Local and global subgoals

Given subgoal  $s$  and subgoals  $s'$  and  $s''$  to which it is connected via an edge.

$s$  is a local subgoal if:

- i there exists path from  $s'$  to  $s''$  through only global subgoals and not through  $s$ .
  - May not be longer than the original path through  $s$ !
- or
- ii  $s'$  and  $s''$  are h-reachable

## Construction of a Two-Level Subgoal Graph



Subgoal  $A_2$ :

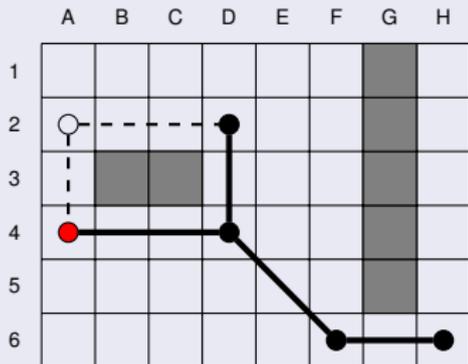
■ Neighbors  $D_2$  and  $A_4$

i ✓  
ii ✗

$A_2$  is local!

Grid setting from Uras and Koenig [2015]

## Construction of a Two-Level Subgoal Graph



Subgoal  $A_4$ :

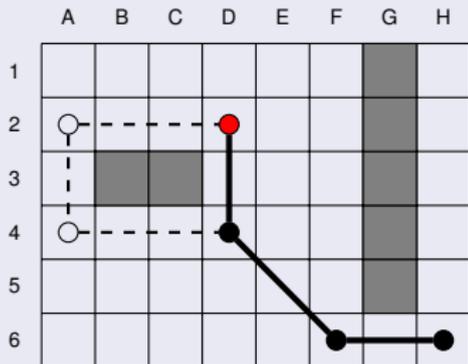
■ Neighbors  $A_2$  and  $D_4$

i ✓  
ii ✗

$A_4$  is local!

Grid setting from Uras and Koenig [2015]

## Construction of a Two-Level Subgoal Graph



Subgoal  $D2$ :

■ Neighbors  $A2$  and  $D4$

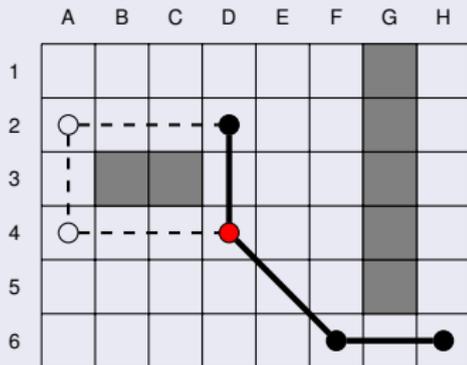
i ×

ii ×

$D2$  is global!

Grid setting from Uras and Koenig [2015]

## Construction of a Two-Level Subgoal Graph



Grid setting from Uras and Koenig [2015]

### Subgoal $D4$ :

- Neighbors  $D2$  and  $A4$

- i ×

- ii ×

- Neighbors  $A4$  and  $F6$

- i ×

- ii ✓

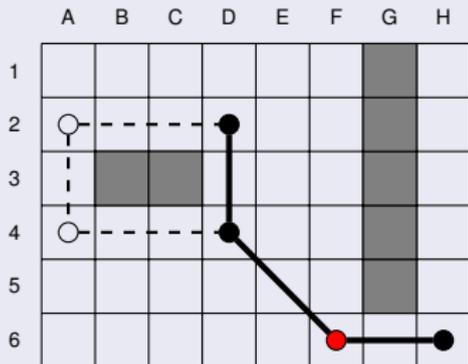
- Neighbors  $D2$  and  $F6$

- i ×

- ii ✓

$D4$  is global!

## Construction of a Two-Level Subgoal Graph



Subgoal  $F6$ :

■ Neighbors  $D4$  and  $H6$

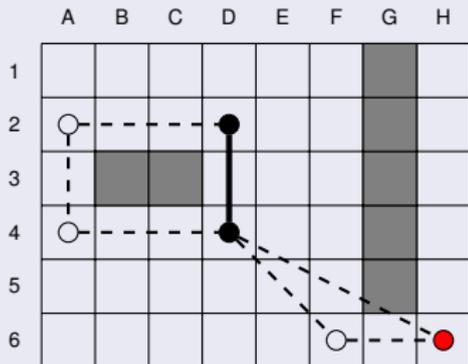
i ×

ii ✓

Add edge between  $D4$  and  $H6$ ,  
 $F6$  is then local

Grid setting from Uras and Koenig [2015]

## Construction of a Two-Level Subgoal Graph



Subgoal  $H6$ :

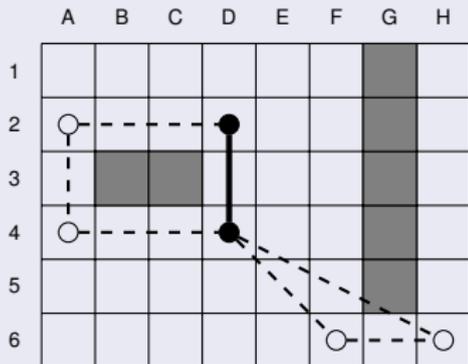
■ Neighbors  $D4$  and  $F6$

- i ✓
- ii ✓

$H6$  is local!

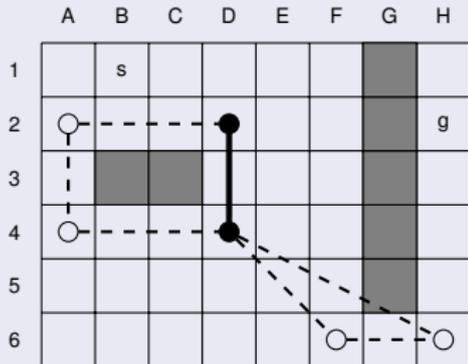
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## Construction of a Two-Level Subgoal Graph



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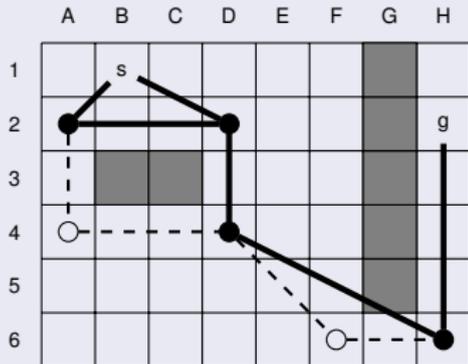
## Searching in a Two-Level Subgoal Graph



Grid setting from Uras and Koenig [2015]

- 1 Connect  $s$  and  $g$  to global subgoals.
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  - may need to make some local subgoals global, temporarily
- 2 search for high-level path on global subgoals
- 3 search for actual path on grid between each segment

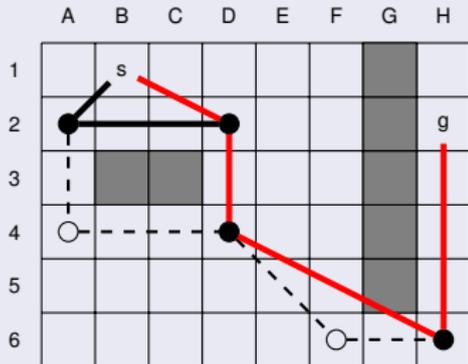
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## Further remarks

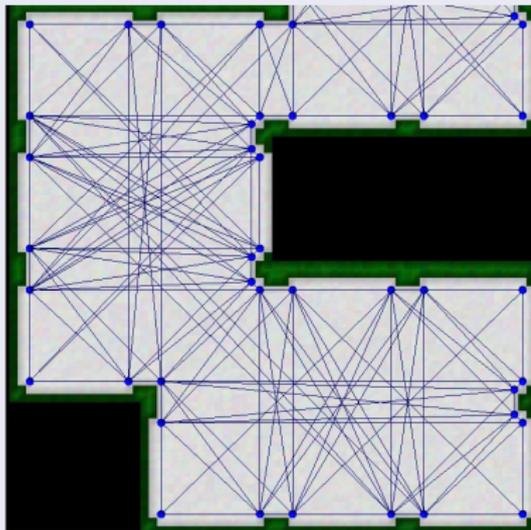


Figure: Single Subgoal Graph  
[Uras et al., 2013]

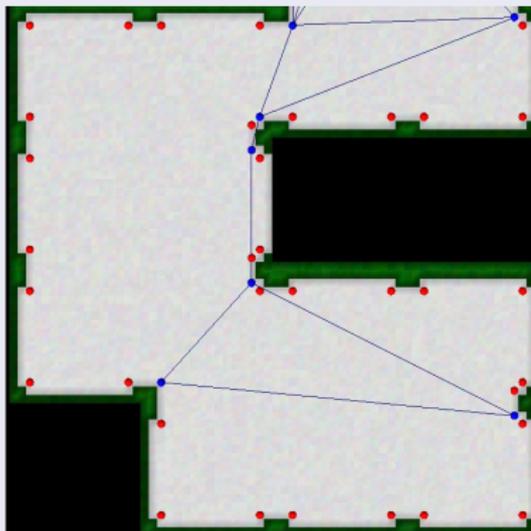
Two-Level subgoal graphs may drastically reduce search space!

- Especially on bigger maps

But:

- More complex search between subgoals

## Further remarks



Two-Level subgoal graphs may drastically reduce search space!

- Especially on bigger maps

But:

- More complex search between subgoals

Figure: Two-Level Subgoal Graph  
[Uras et al., 2013]

# Conclusion

## Conclusion

### Simple Subgoal graphs

- preprocessing strategy for 8-neighbor grid problems
- Reduce search space
  - search nodes = corners of obstacles, “subgoals”
  - edges between direct-h-reachable subgoals

### Two-Level subgoal graphs

- Further abstraction to reduce search space
- Prune graph and retain only global nodes: h-reachable!
- Strong performance (Grid-Based Path Planning Competition 2012 and 2013 “nondominated”)

Thank you for your attention!

## References

Tansel Uras and Sven Koenig. Subgoal graphs for fast optimal pathfinding. In Steven Rabin, editor, *Game AI Pro 2: Collected Wisdom of Game AI Professionals*. A K Peters/CRC Press, 2015.

Tansel Uras, Sven Koenig, and Carlos Hernández. Subgoal graphs for optimal pathfinding in eight-neighbor grids. In *Proceedings of the Twenty-Third International Conference on Automated Planning and Scheduling, ICAPS 2013, Rome, Italy, June 10-14, 2013*, 2013. URL

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