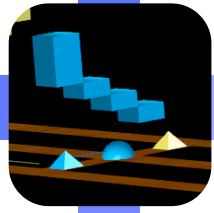


Improved Collaborative Pathfinding

Nathan Sturtevant
Michael Buro
University of Alberta

AIIDE - June 23, 2006



Cooperative Pathfinding

- Goal: Multiple agents cooperate during path planning and execution
- Different applications than flocking
 - Coordinate movement to avoid collisions
 - User may control the main character
 - Grid-based worlds



Local Player was victorious.

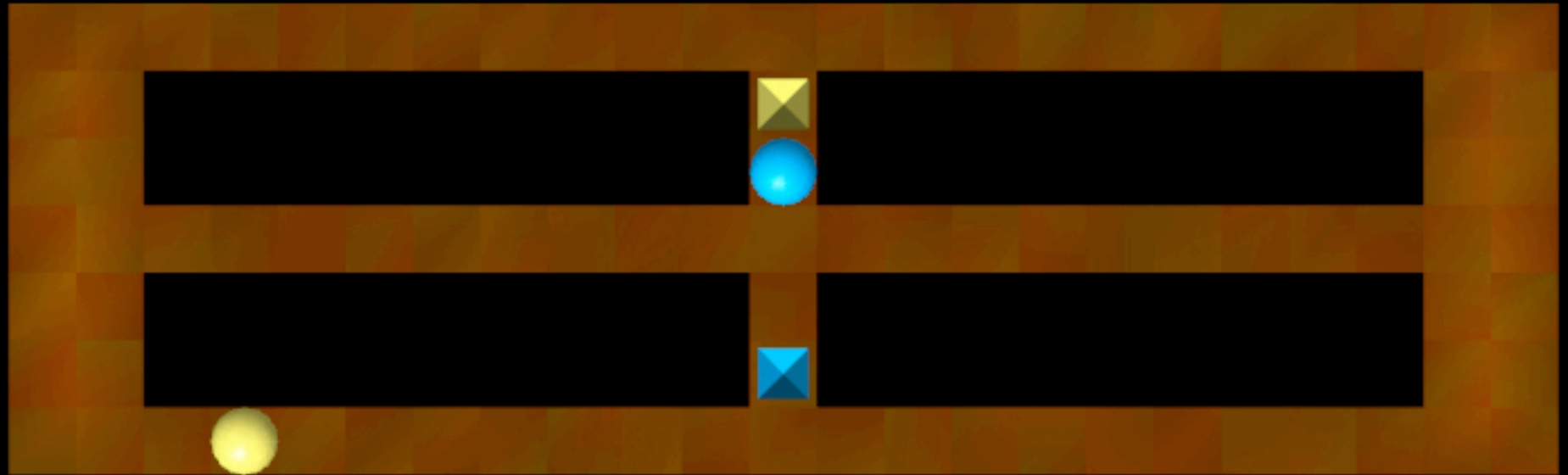




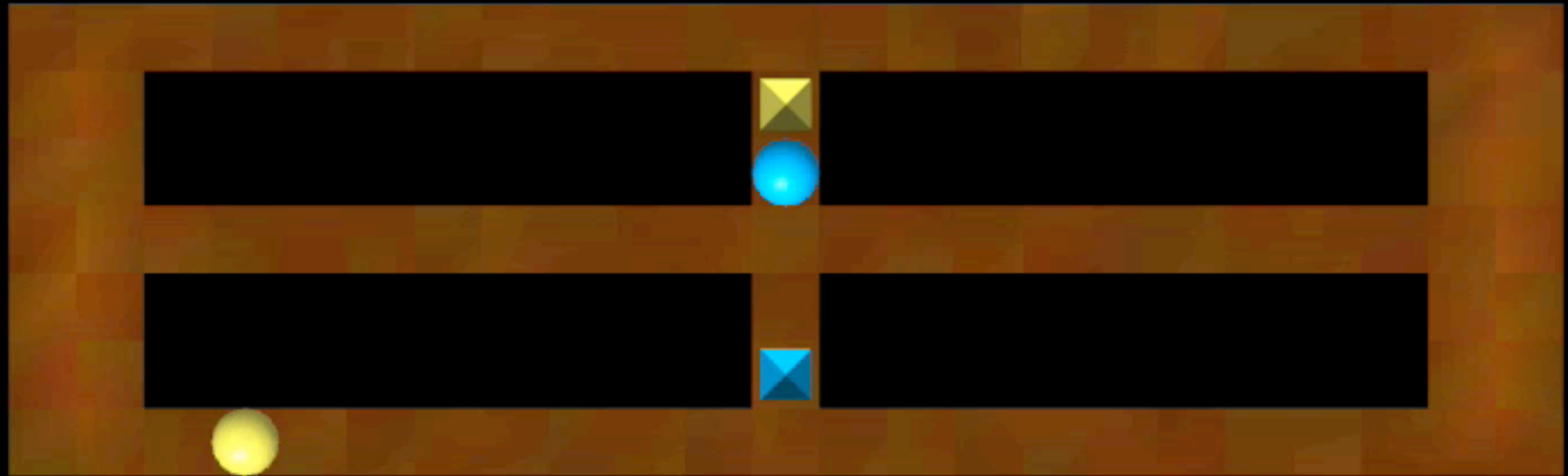
Local Player was victorious.

The bottom UI panel features a minimap on the left showing a green area with a white square and a small blue icon. To the right of the minimap are four icons: a target, a mountain, crossed swords, and a cluster of dots. Further right is a portrait icon with the number 5, a stone archway, a decorative blue emblem, and a 3x3 grid.

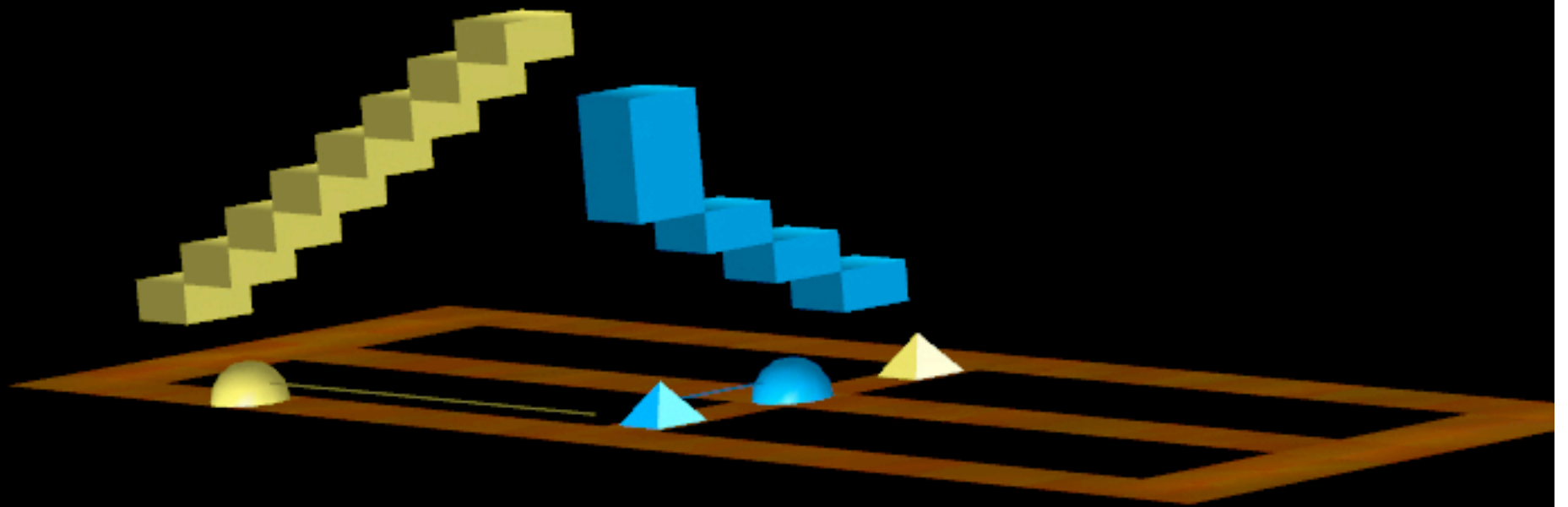
Camera at (-0.0, 0.0, -12.5) looking at (-0.0, -0.0, 12.5) with 5.9 aperture
Simulation time elapsed: 1.91



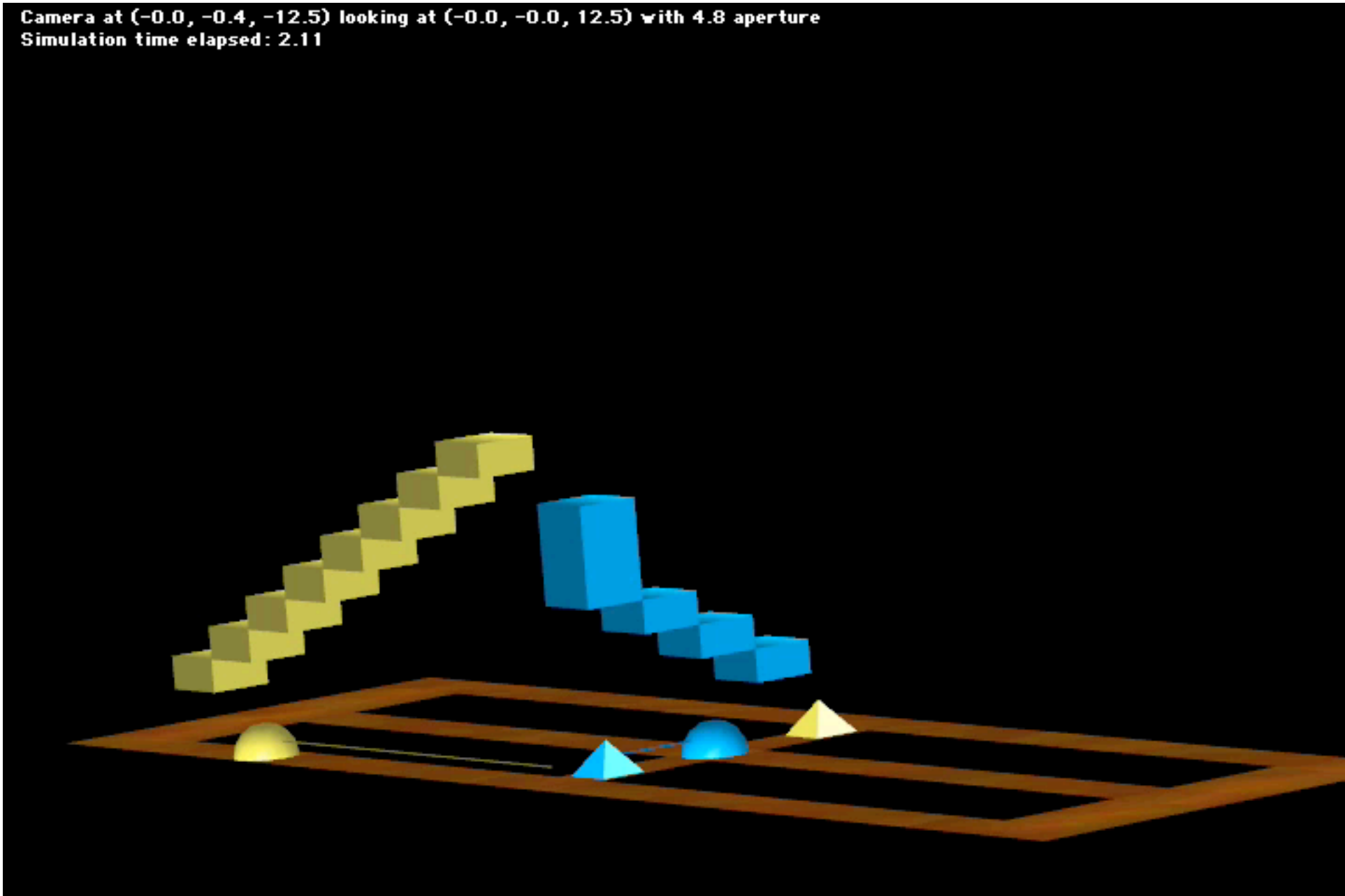
Camera at (-0.0, 0.0, -12.5) looking at (-0.0, -0.0, 12.5) with 5.9 aperture
Simulation time elapsed: 1.91

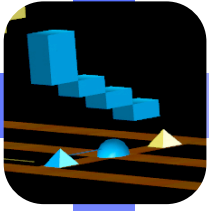


Camera at $(-0.0, -0.4, -12.5)$ looking at $(-0.0, -0.0, 12.5)$ with 4.8 aperture
Simulation time elapsed: 2.11



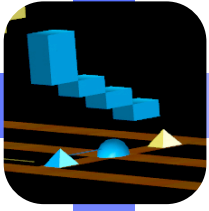
Camera at $(-0.0, -0.4, -12.5)$ looking at $(-0.0, -0.0, 12.5)$ with 4.8 aperture
Simulation time elapsed: 2.11





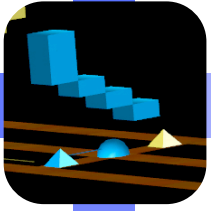
Possible Strategies

- Plan all units simultaneously
 - Computationally intractable
 - $(units \times actions)^{depth}$
- Plan individual units
 - Not complete
 - A lot of techniques needed to be practical



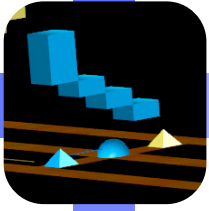
Overview

- Previous Work
 - Why problem is hard
 - What techniques simplify the problem
 - Drawbacks of current approach
- New Techniques
- Evaluation



WHCA*(w)

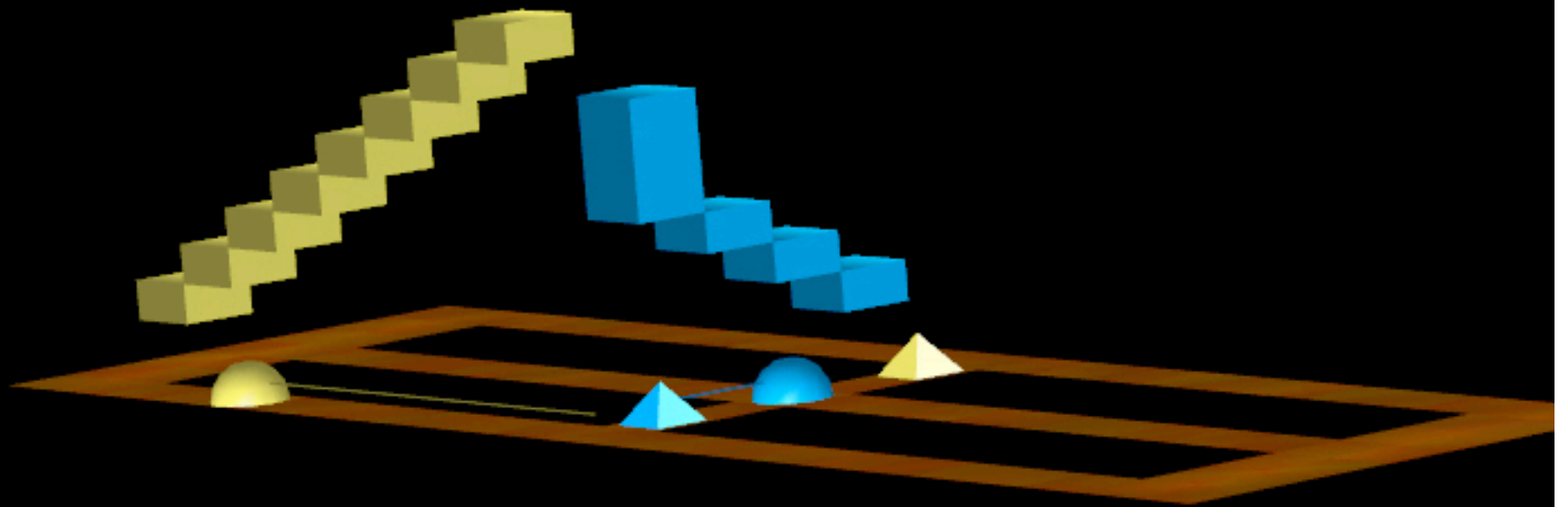
- Windowed Hierarchical Cooperative A*
- Cooperative A*
- Hierarchical Heuristic
- Windowed cooperation
- Silver, 2005

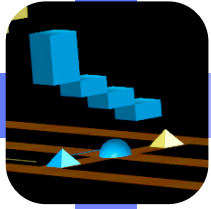


WHCA*

- Use a hash table to store time-space indexed reservations
 - Constant time access
 - Is a space/time cell free?
 - Reserve a space/time cell
 - Free a space/time cell

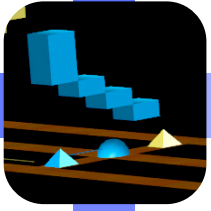
Camera at $(-0.0, -0.4, -12.5)$ looking at $(-0.0, -0.0, 12.5)$ with 4.8 aperture
Simulation time elapsed: 2.11





A*

- A* relies on a heuristic to guide search
 - Poor heuristics cause extra node expansions
 - Cost is the **area** in which the heuristic is poor



Cooperative A*

- 3-dimensional search problem
 - x-location, y-location, time
 - Still need a heuristic
 - Cost is the **area** in which the heuristic is poor *times* the time to get out of that area = **volume**

	S						
						G	

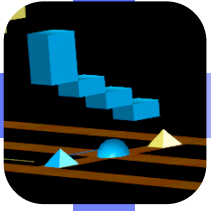
	S	6					
	6	6				G	

	S	7					
	7	7				G	

	8	8					
8	S	8					
8	8	8				G	

	9	9					
9	S	9					
9	9	9				G	

	10	10	10	10	10	10	
10	10	10		10	10	10	
10	S	10		10	10	10	
10	10	10				G	
10							



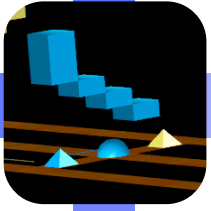
Heuristics

- Need a very accurate heuristic
- Where can we get a heuristic?
 - Run A^* from the goal to the start state to get $h()$ value for many states

	S						
						G	

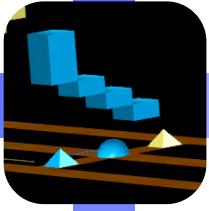
	8+2	7+3	6+4	5+5	4+6	3+7	
	9+1	8+2		4+4	3+5	2+6	3+7
	S			3+3	2+4	1+5	2+6
				2+4	1+5	G	1+7
				3+5	2+6	1+7	2+8
				4+6	3+7	2+8	

	8	7	6	5	4	3	
	9	8		4	3	2	3
	S			3	2	I	2
				2	I	G	I
				3	2	I	2
				4	3	2	



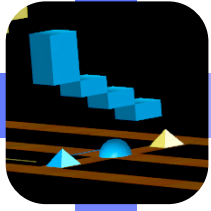
Windowed Search

- We now have a perfect heuristic
 - With a perfect heuristic only 1-step lookahead is needed
 - Stop search at any time and be guaranteed to be on a path to the goal
- Do k -step lookahead in cooperative space



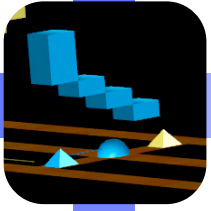
WHCA*(k)

- Do single A^* search from goal to start
- Do k -step forward cooperative search
- Expand original search if new heuristic values needed



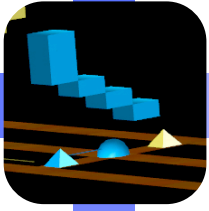
WHCA* Drawbacks

- First step is expensive
 - Compute complete reverse A^* search
 - Compute forward CA^* search
- Memory per unit is expensive
 - Keep whole search frontier in memory
- Goal State can't change



Improving WHCA*

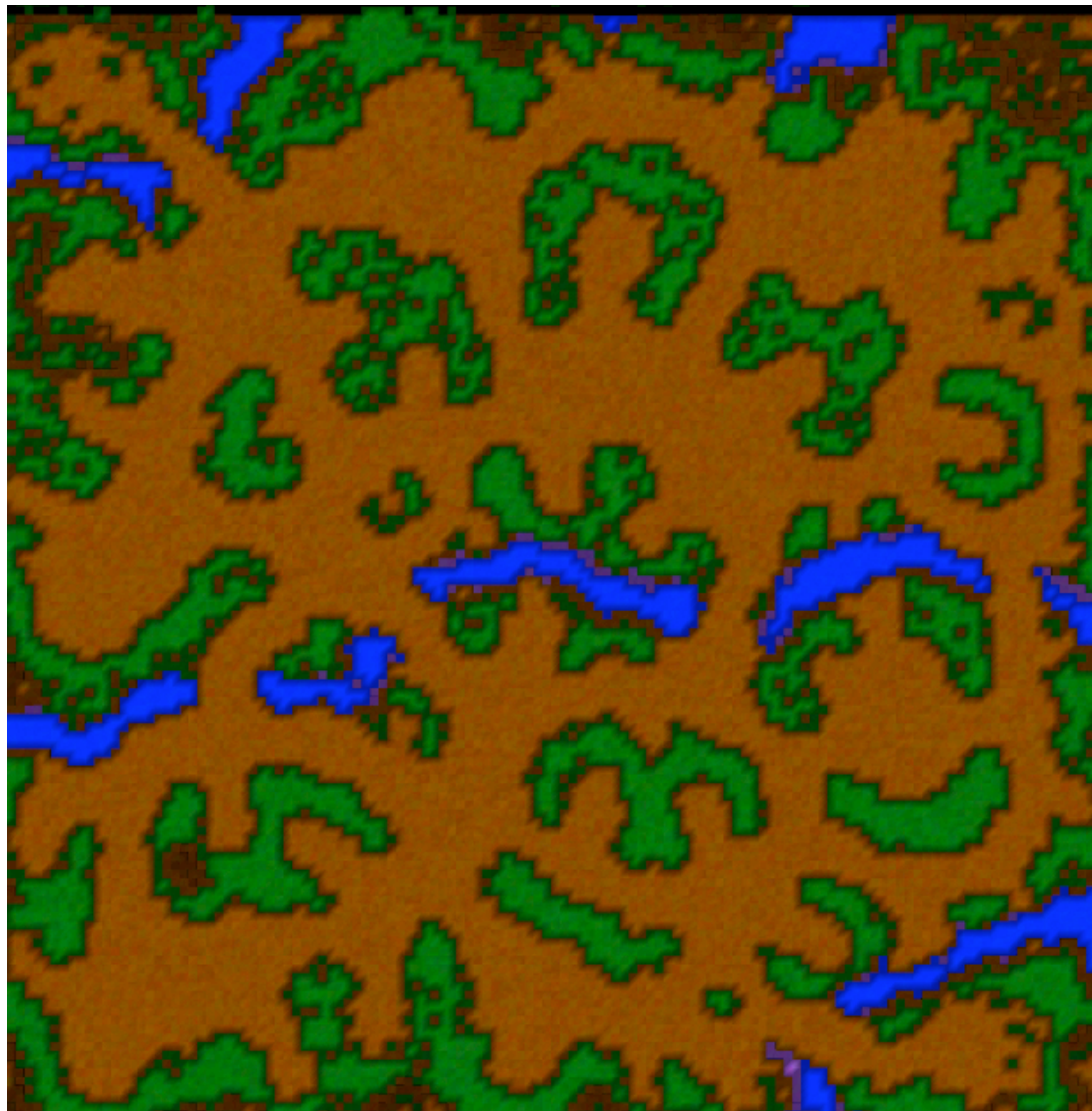
- Abstraction
 - Widely used idea (eg Holte, 1996)
- Two proposed usages
 - $WHCA^*(w, a)$
 - $CPRA^*(k)$



Abstraction

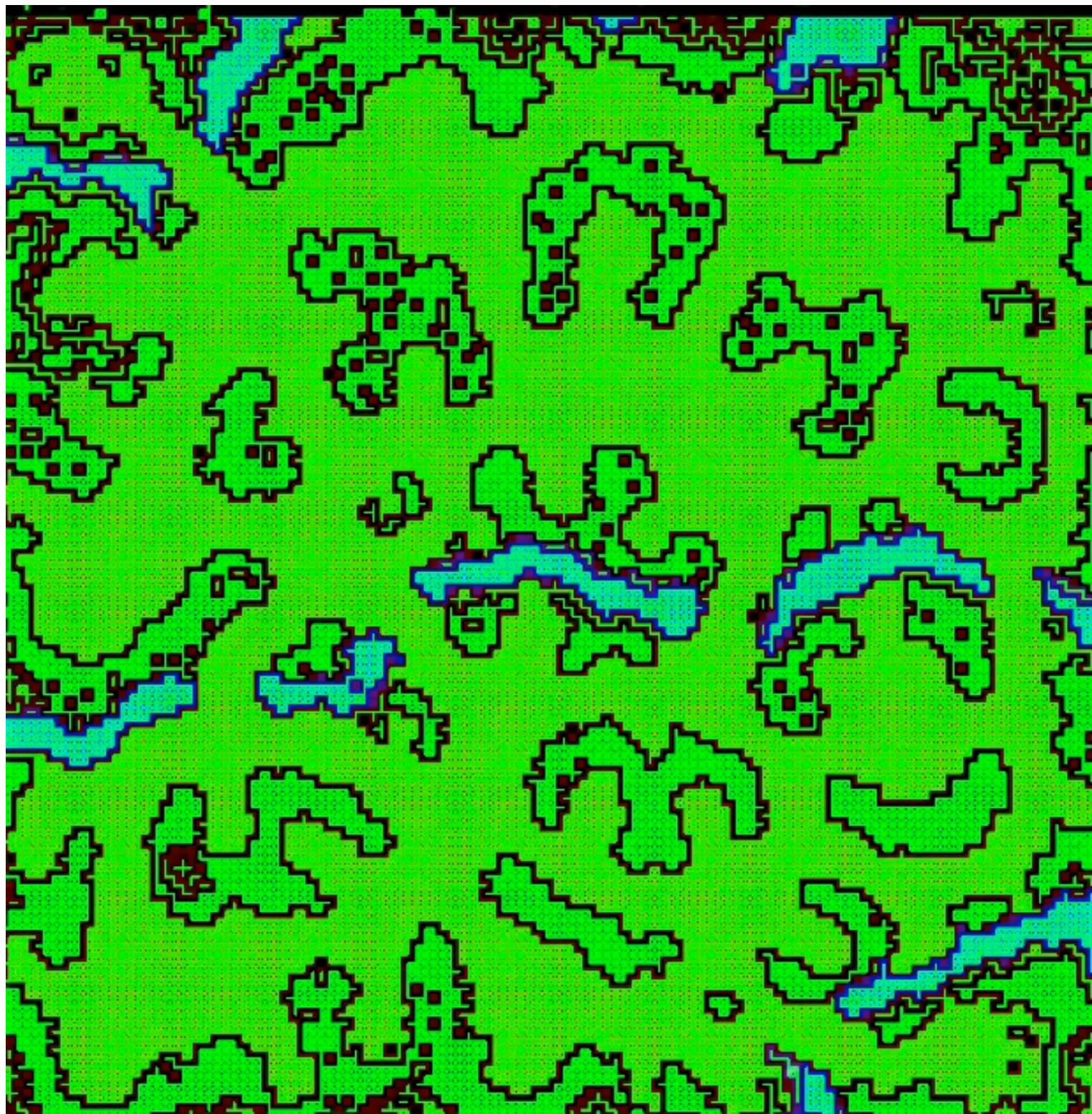
- Build “abstract” version of map
 - Lower resolution map
 - Automatic abstraction techniques
- Use one or more map abstractions to speed cooperative pathfinding
 - Clique reduction

Sample Map



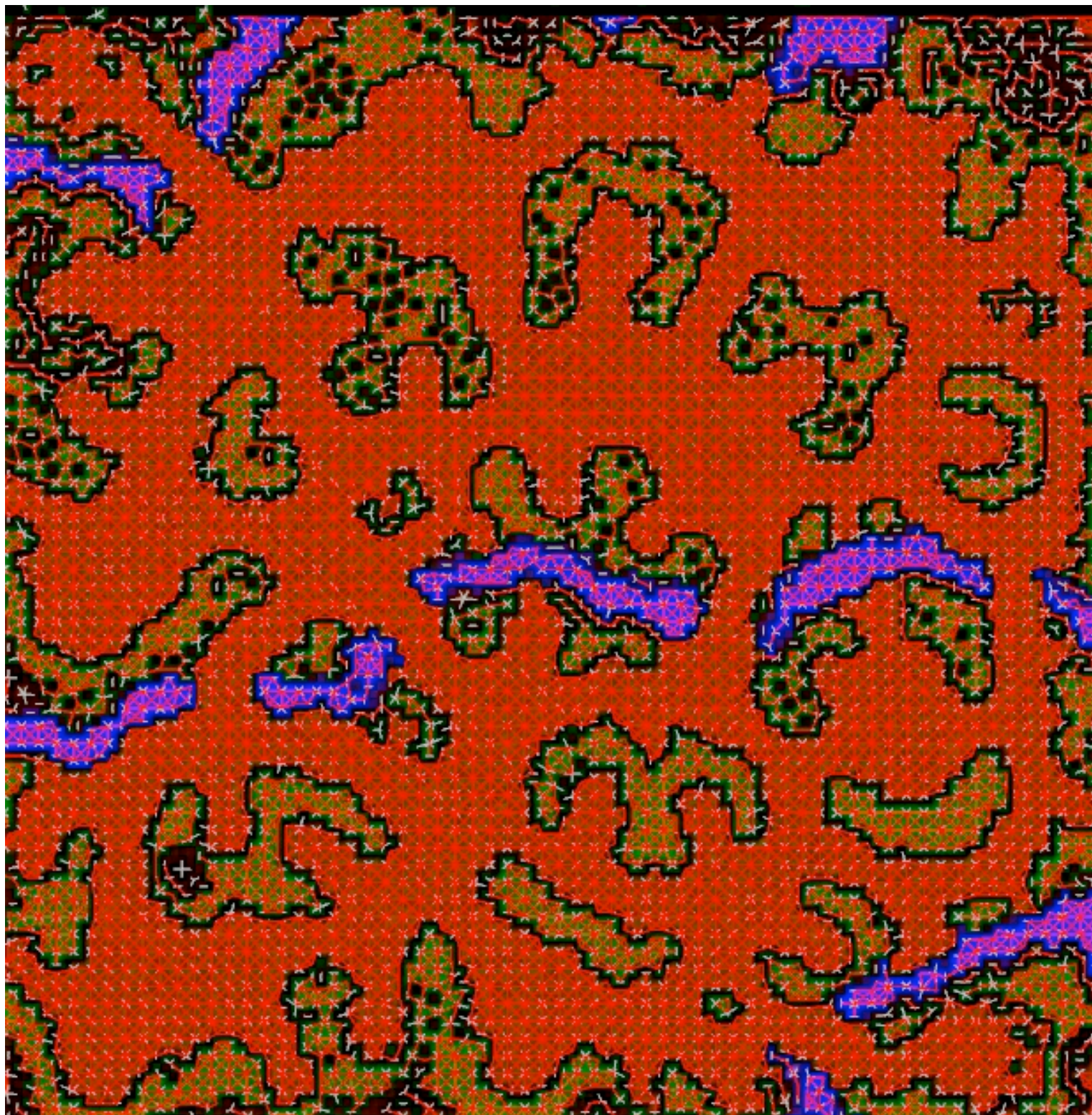
Base Graph

16,807 nodes



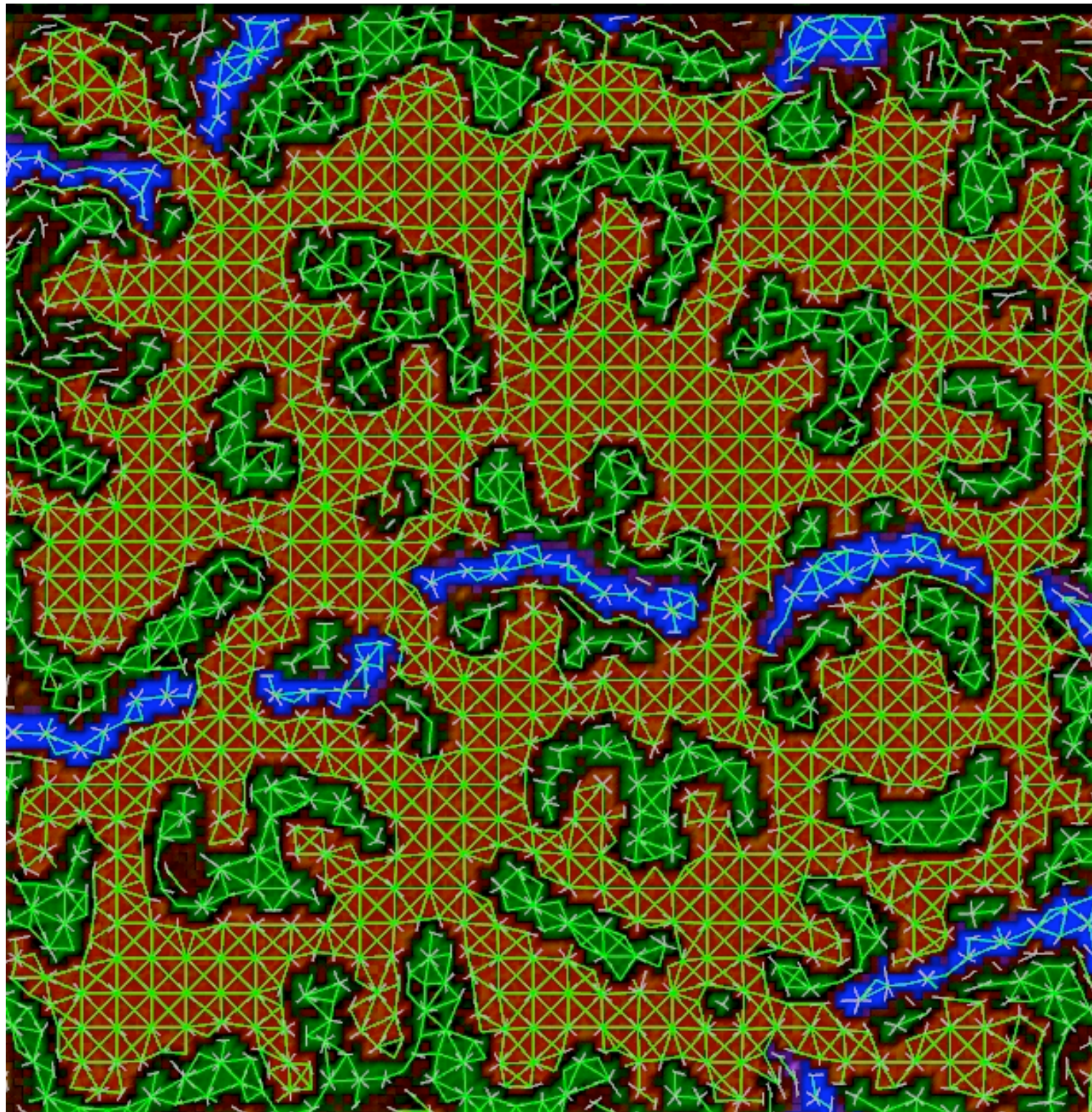
Abstraction I

5,212 nodes



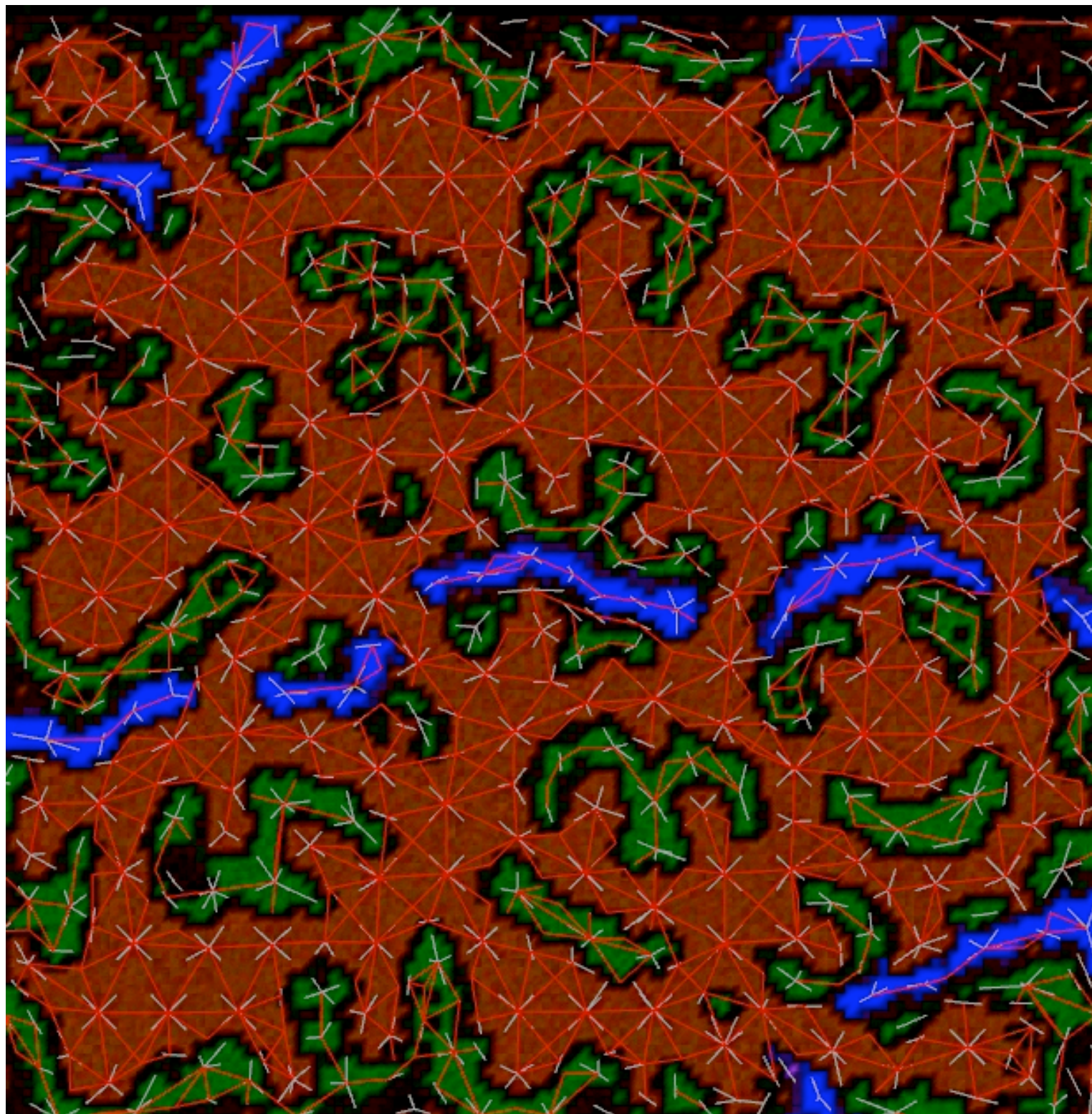
Abstraction 2

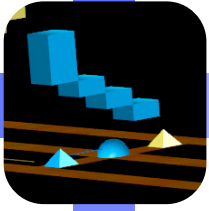
1,919 nodes



Abstraction 3

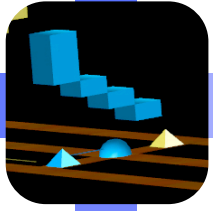
771 nodes





WHCA^{*}(*k*, *a*)

- Same as WHCA^{*}(*k*) but do reverse A^{*} search at level *a*
- Keep smaller A^{*} open/closed list in memory
- Faster A^{*} computation
- Eventually less accurate

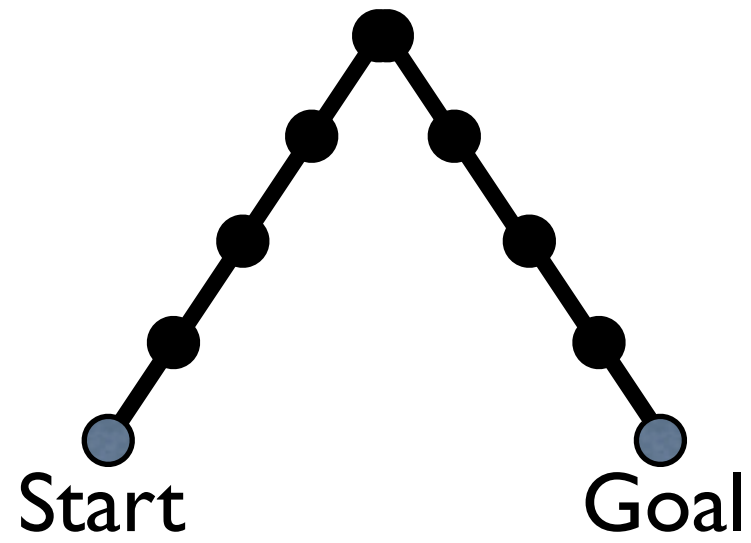


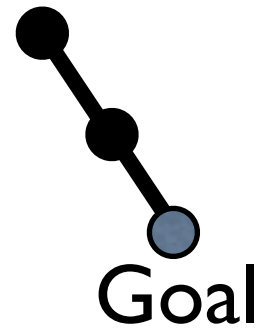
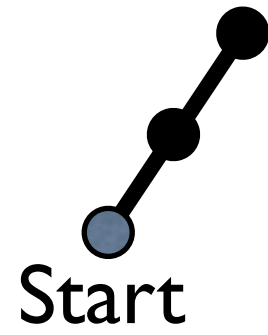
PRA*

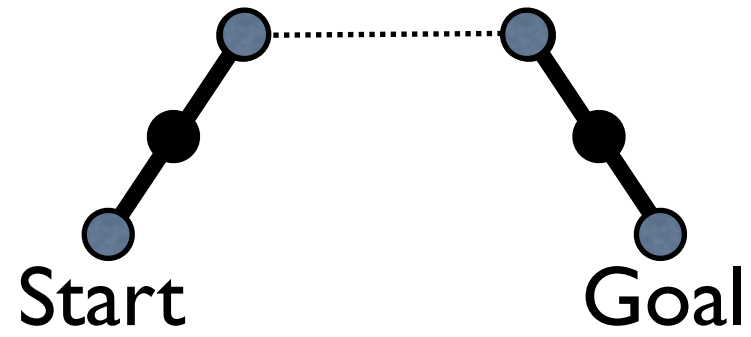
- Partial-Refinement A*
- Use multiple abstraction levels
- Refine abstract paths using A*

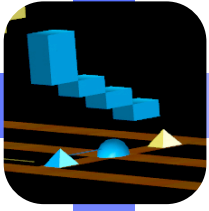
●
Start

●
Goal





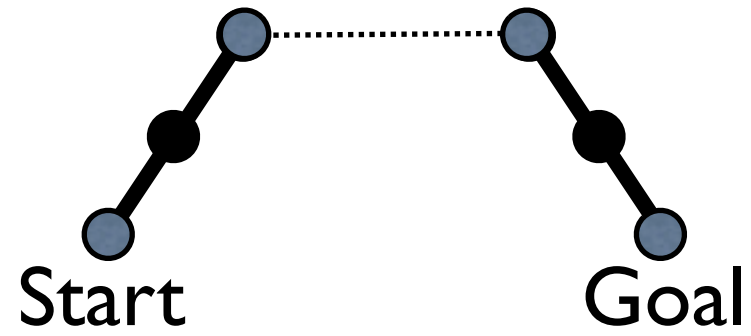




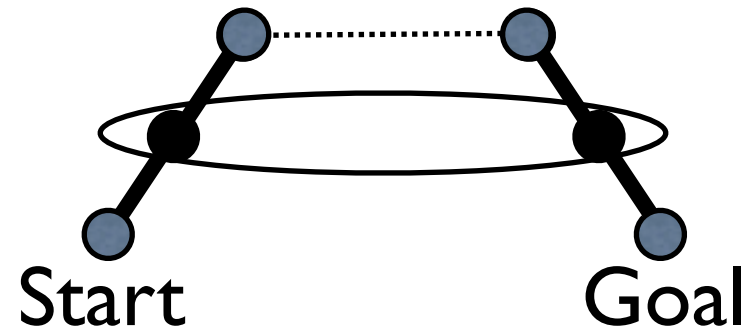
Pathfinding

- Given abstract path:
 - Path defines a *corridor* in the lower level of abstraction
 - Run A^* in this corridor to find next path
 - Repeat until done

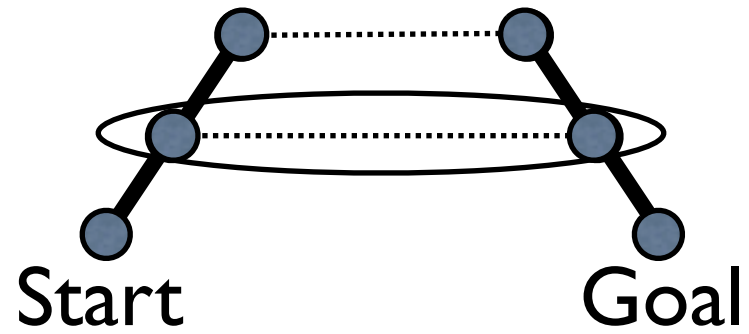
$\text{PRA}^*(\infty)$



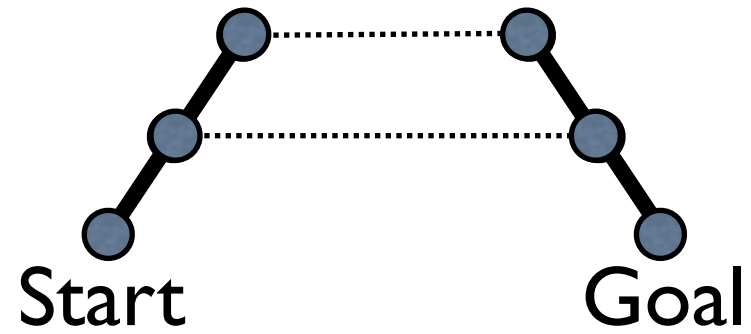
$\text{PRA}^*(\infty)$



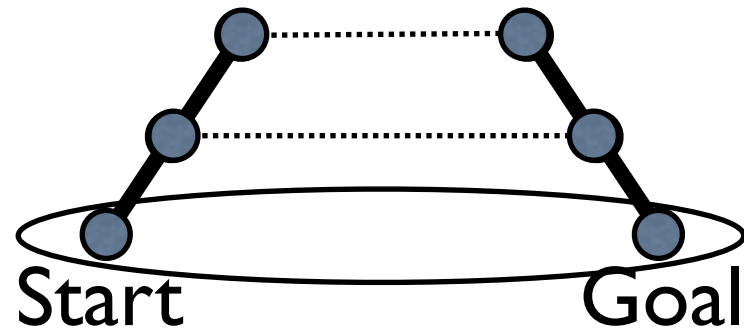
$PRA^*(\infty)$



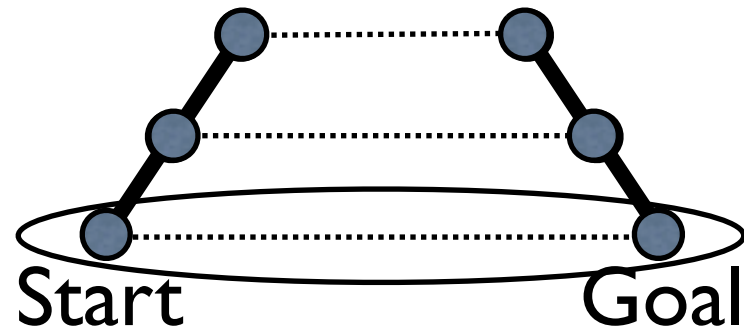
$\text{PRA}^*(\infty)$



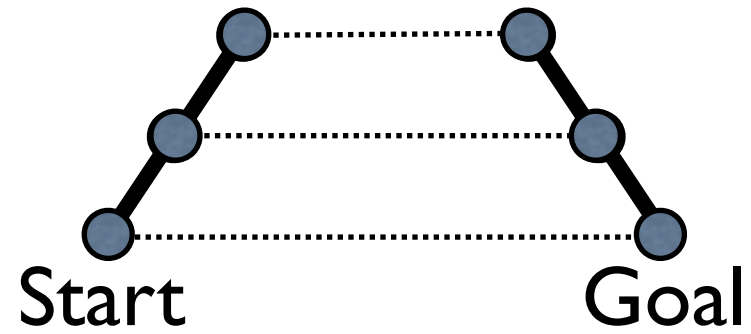
$\text{PRA}^*(\infty)$



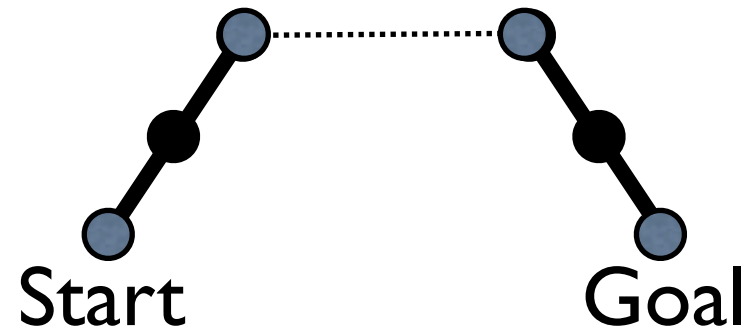
$\text{PRA}^*(\infty)$



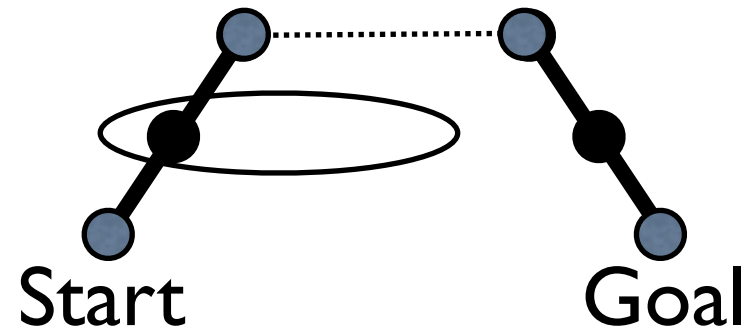
$PRA^*(\infty)$



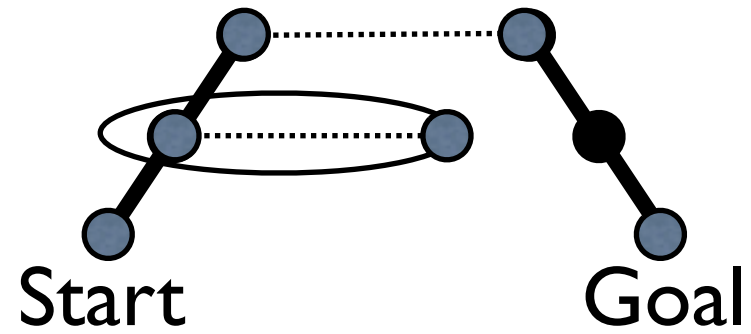
PRA*(k)



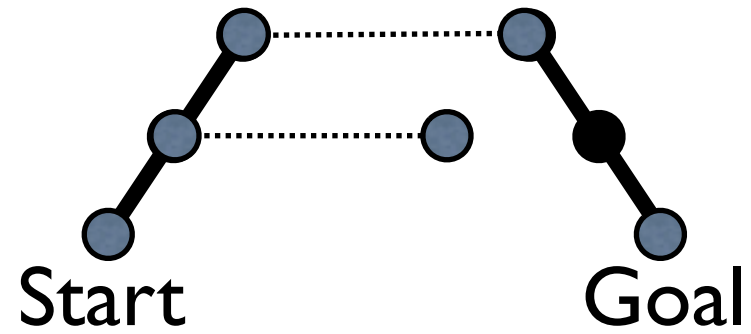
PRA*(k)



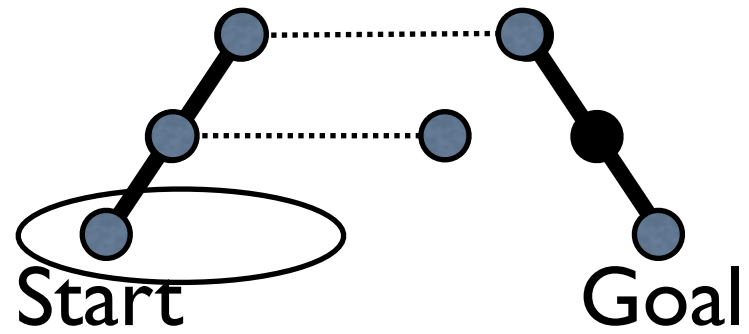
PRA*(k)



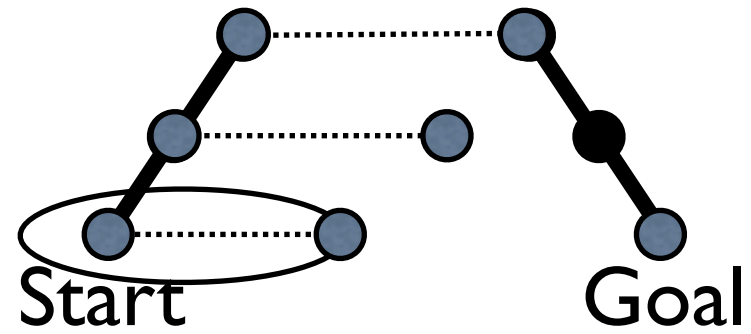
PRA*(k)



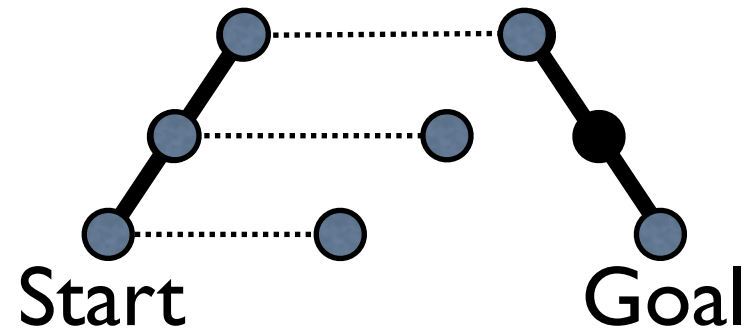
PRA*(k)

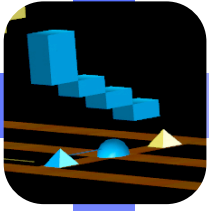


PRA*(k)



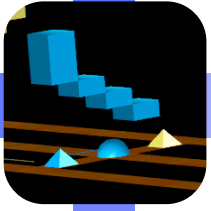
PRA*(k)





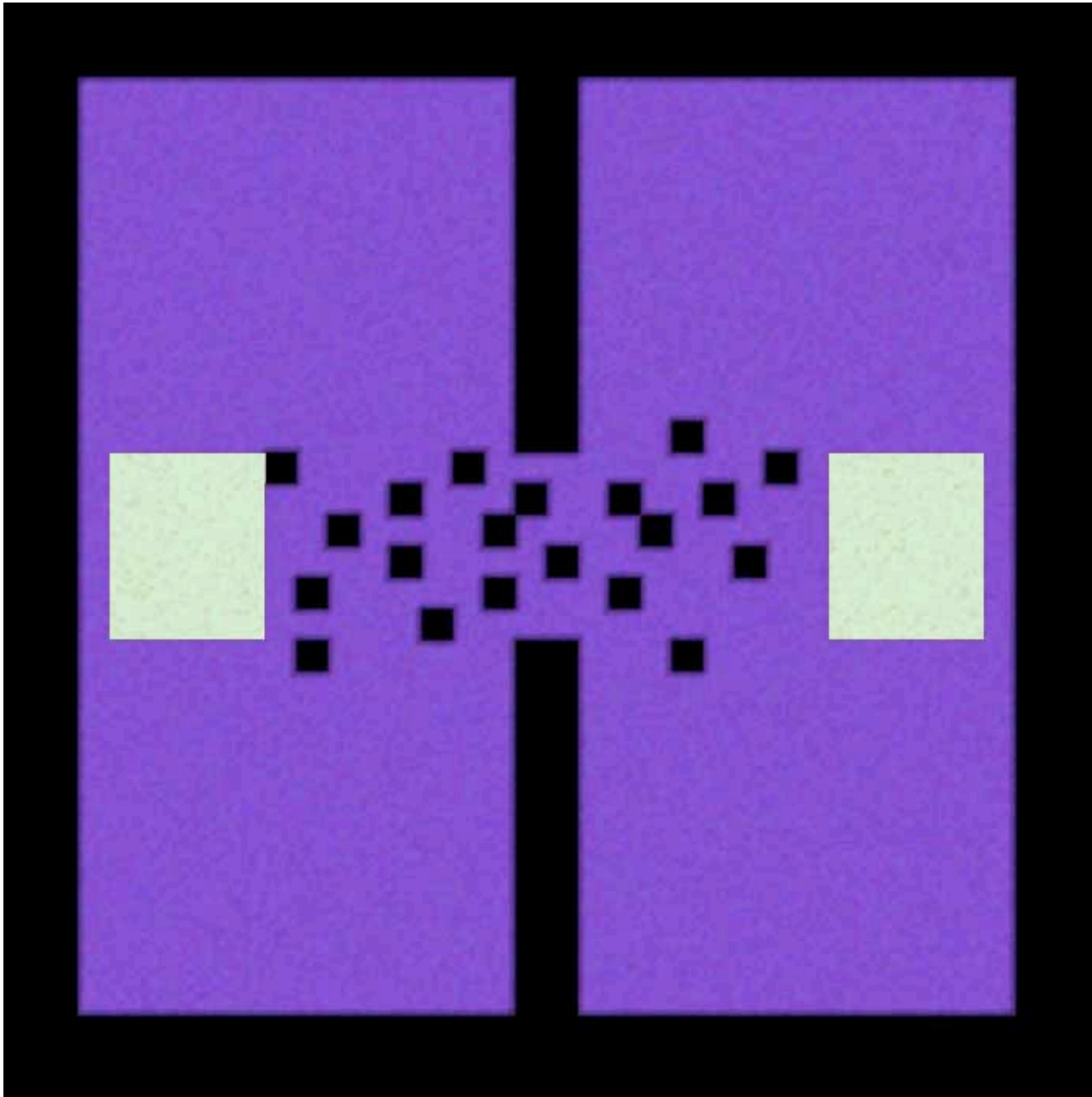
CPRA*(k)

- Same as PRA*(k), but do WHCA*(k, l) at last refinement level
- Only plan part of total path
 - Much lower first-step cost
- Repeated WHCA* calls after executing each path



Experiments

- Run algorithms on 256x256 map
- Place units on opposite sides of map and ask them to cross sides
- Report 95%

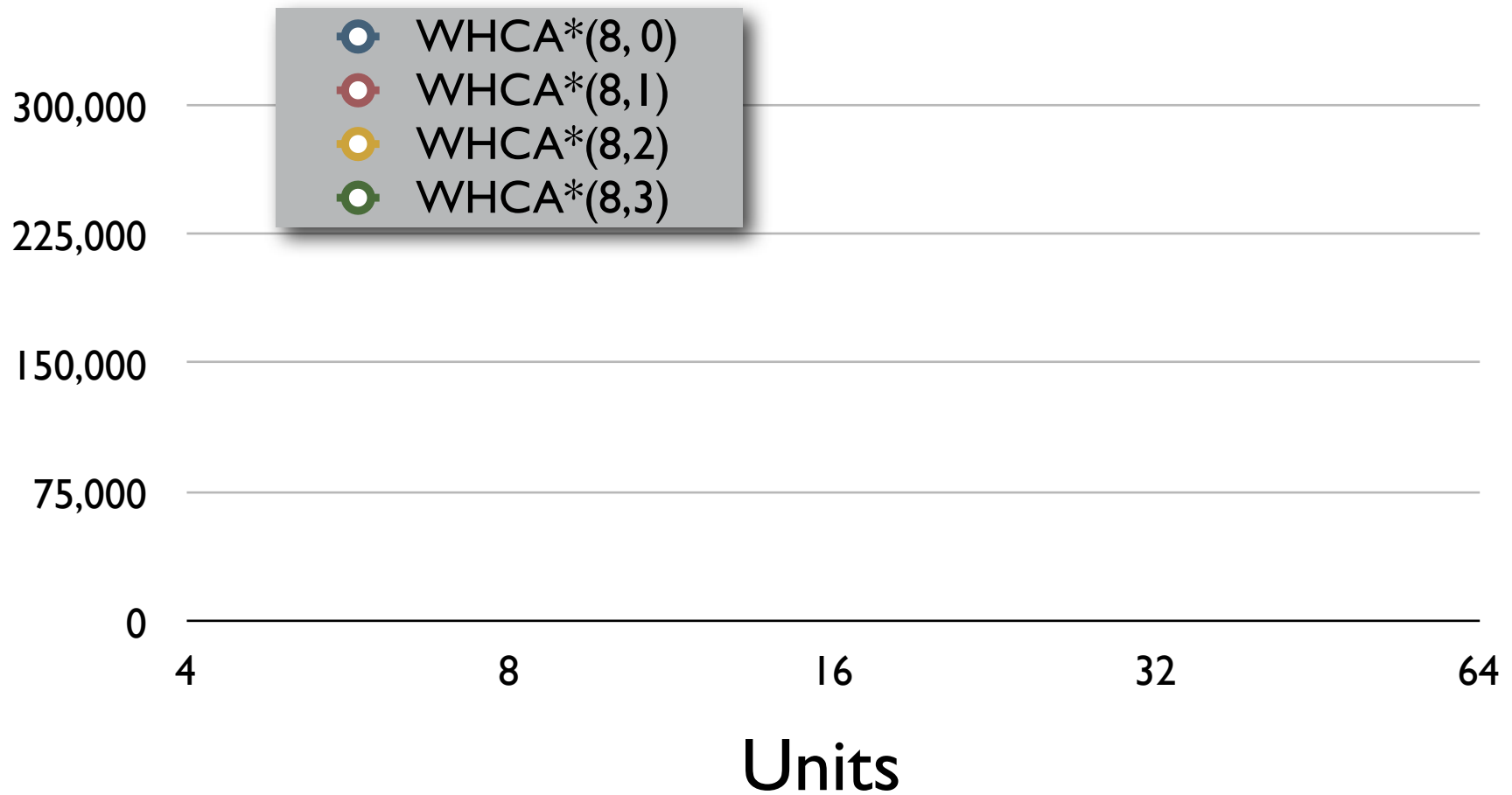


Memory Usage

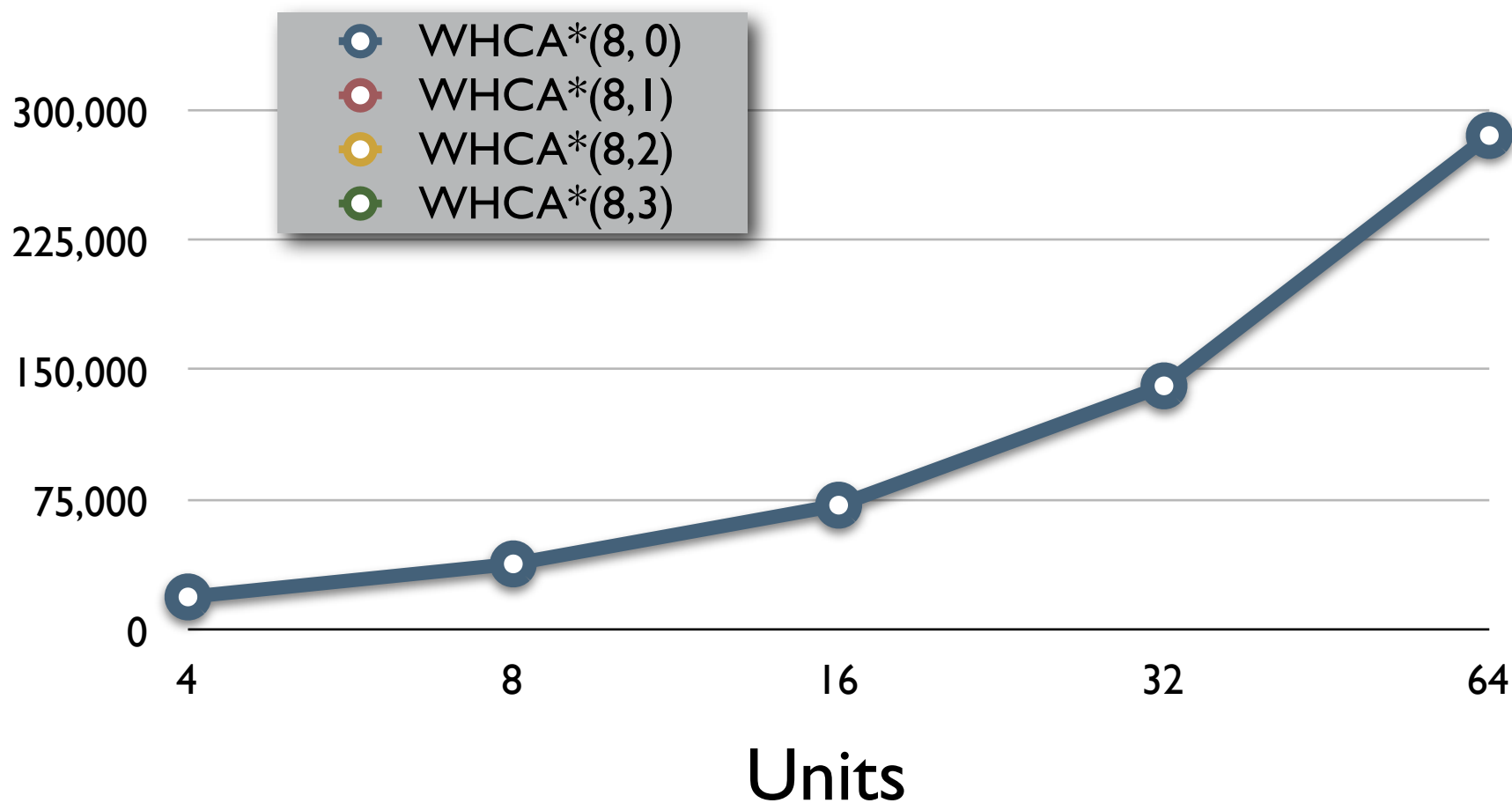
-  WHCA*(8, 0)
-  WHCA*(8, 1)
-  WHCA*(8, 2)
-  WHCA*(8, 3)

Units

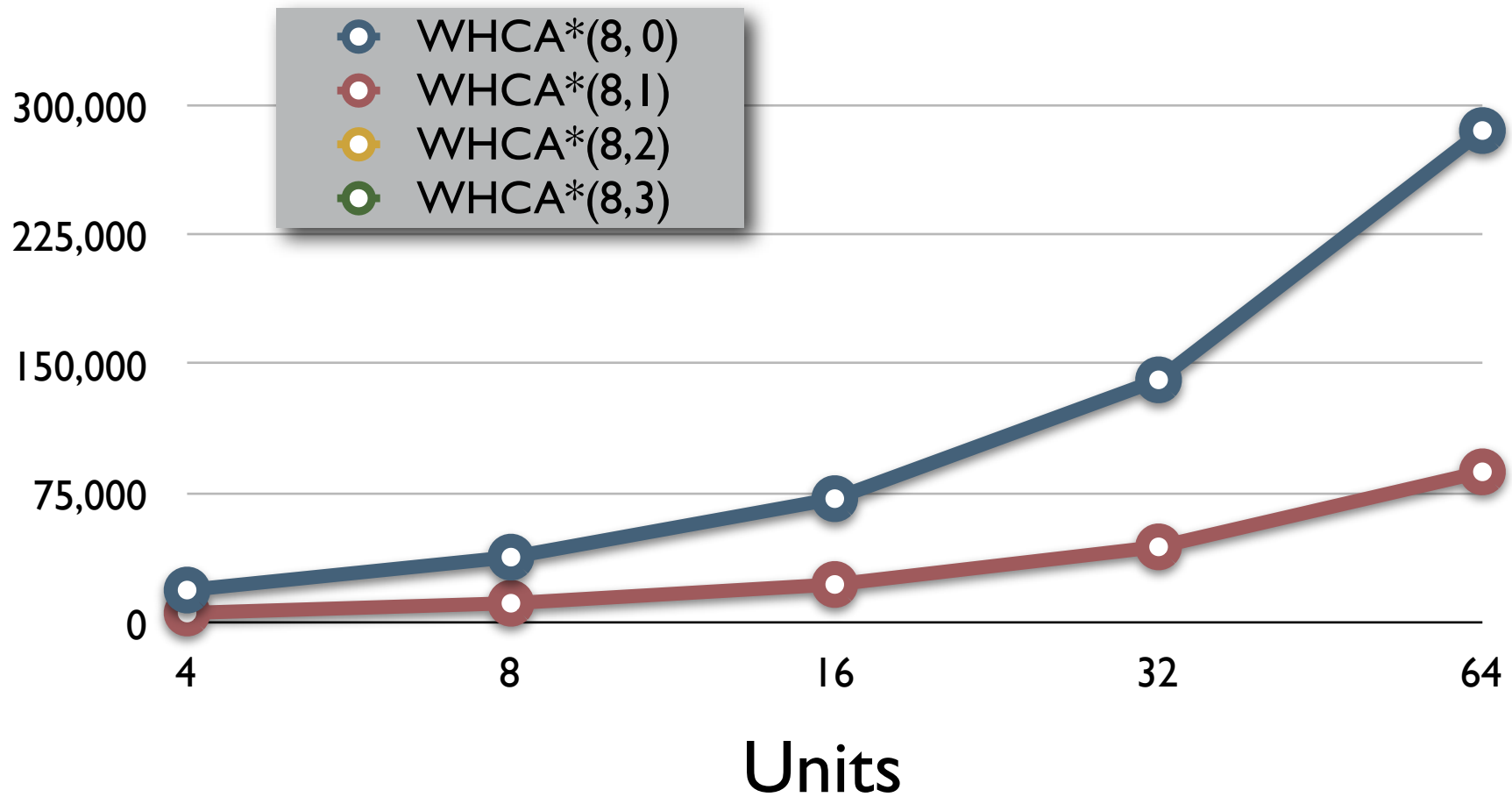
Memory Usage



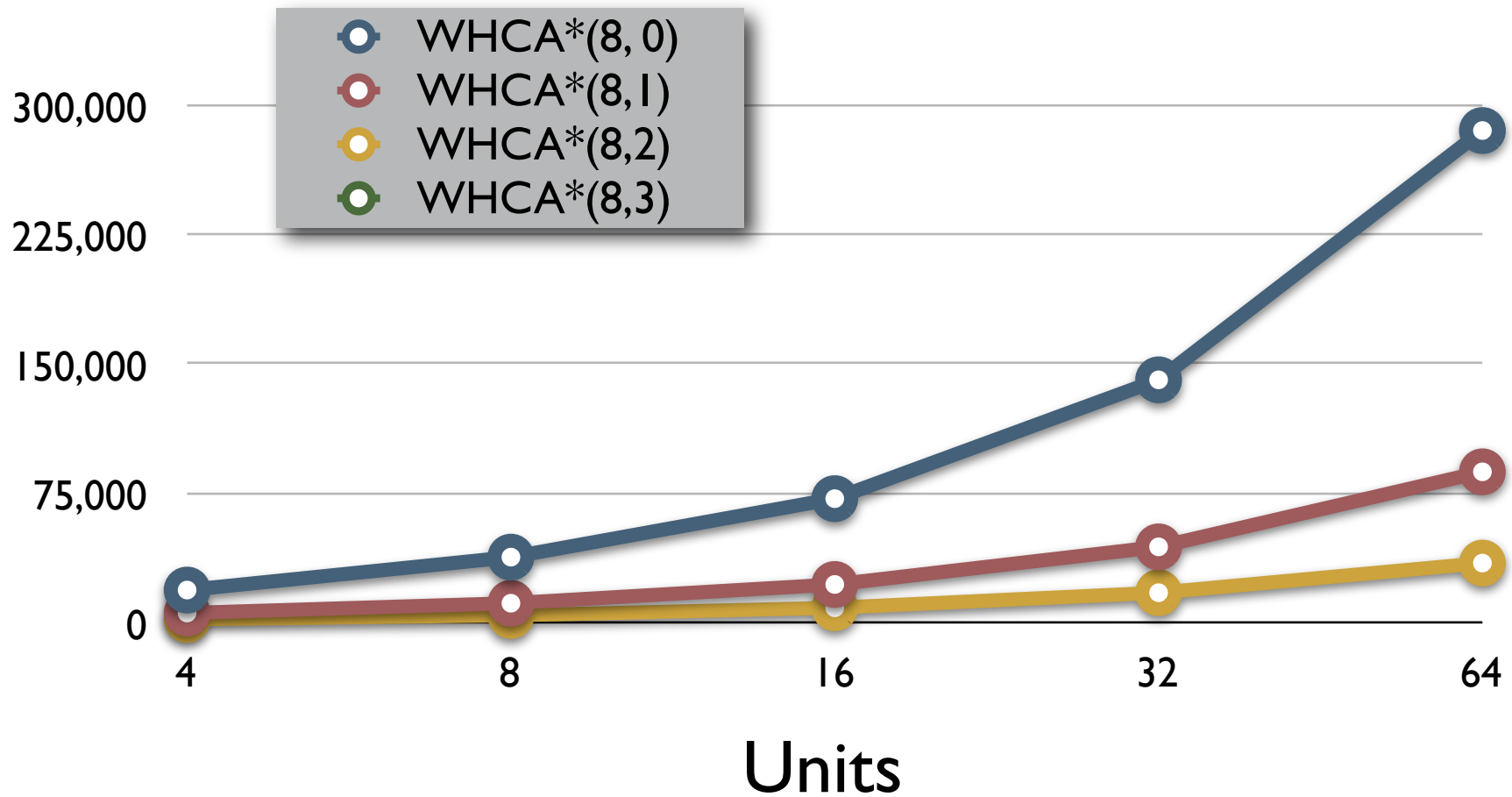
Memory Usage



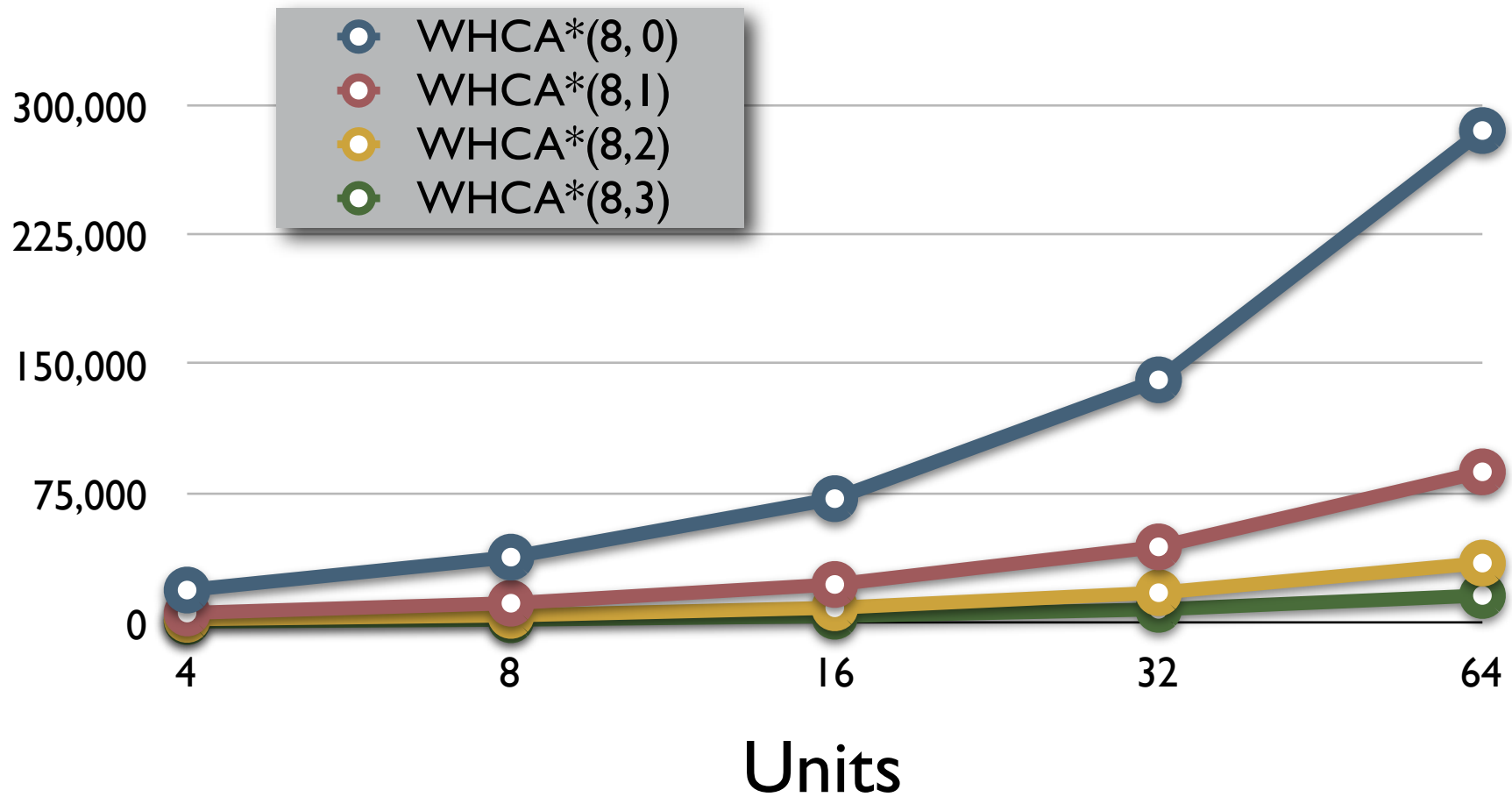
Memory Usage



Memory Usage





Memory Usage



Nodes

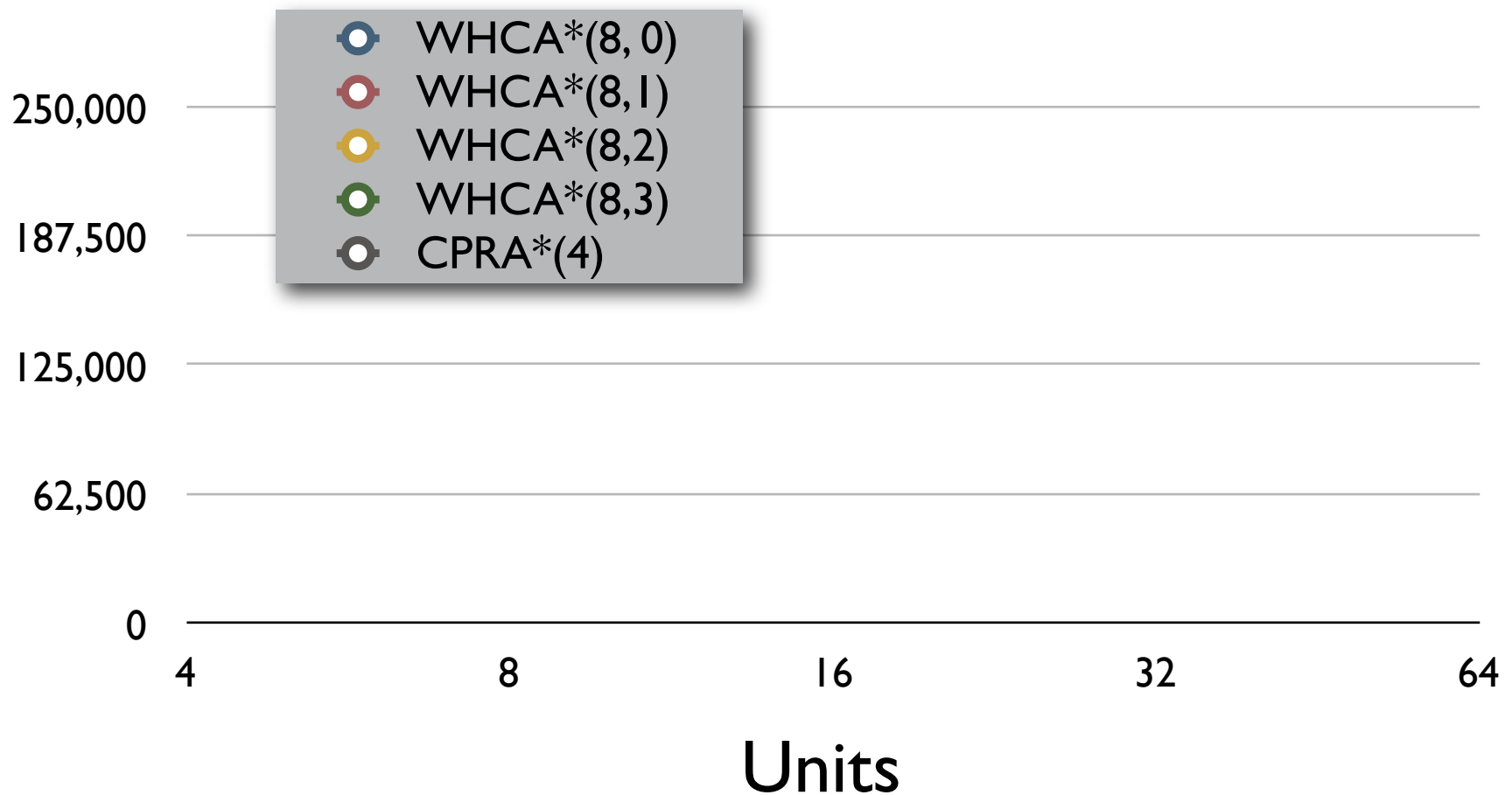
First second

-  WHCA*(8, 0)
-  WHCA*(8, 1)
-  WHCA*(8, 2)
-  WHCA*(8, 3)
-  CPRA*(4)

Units

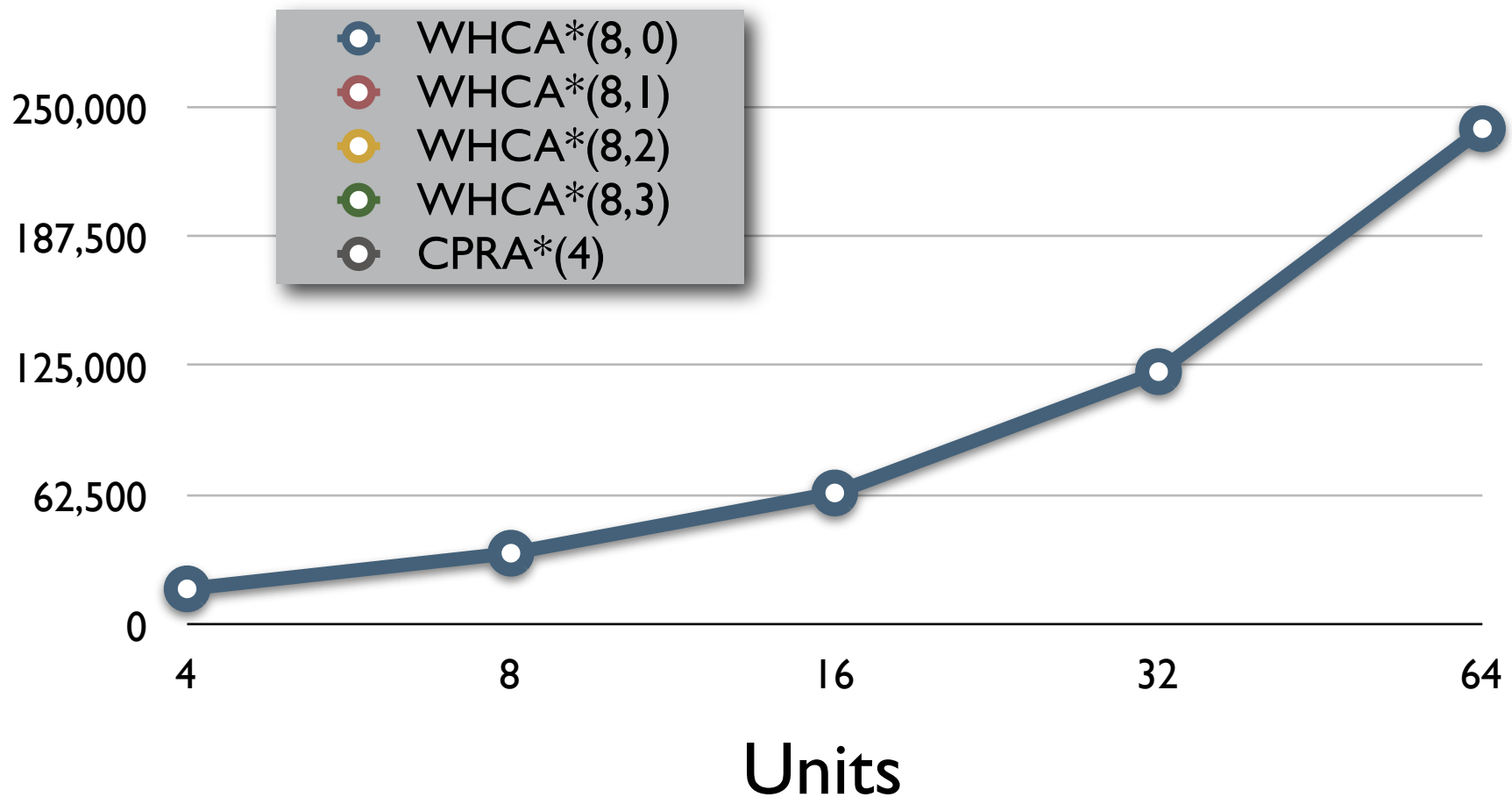
Nodes

First second



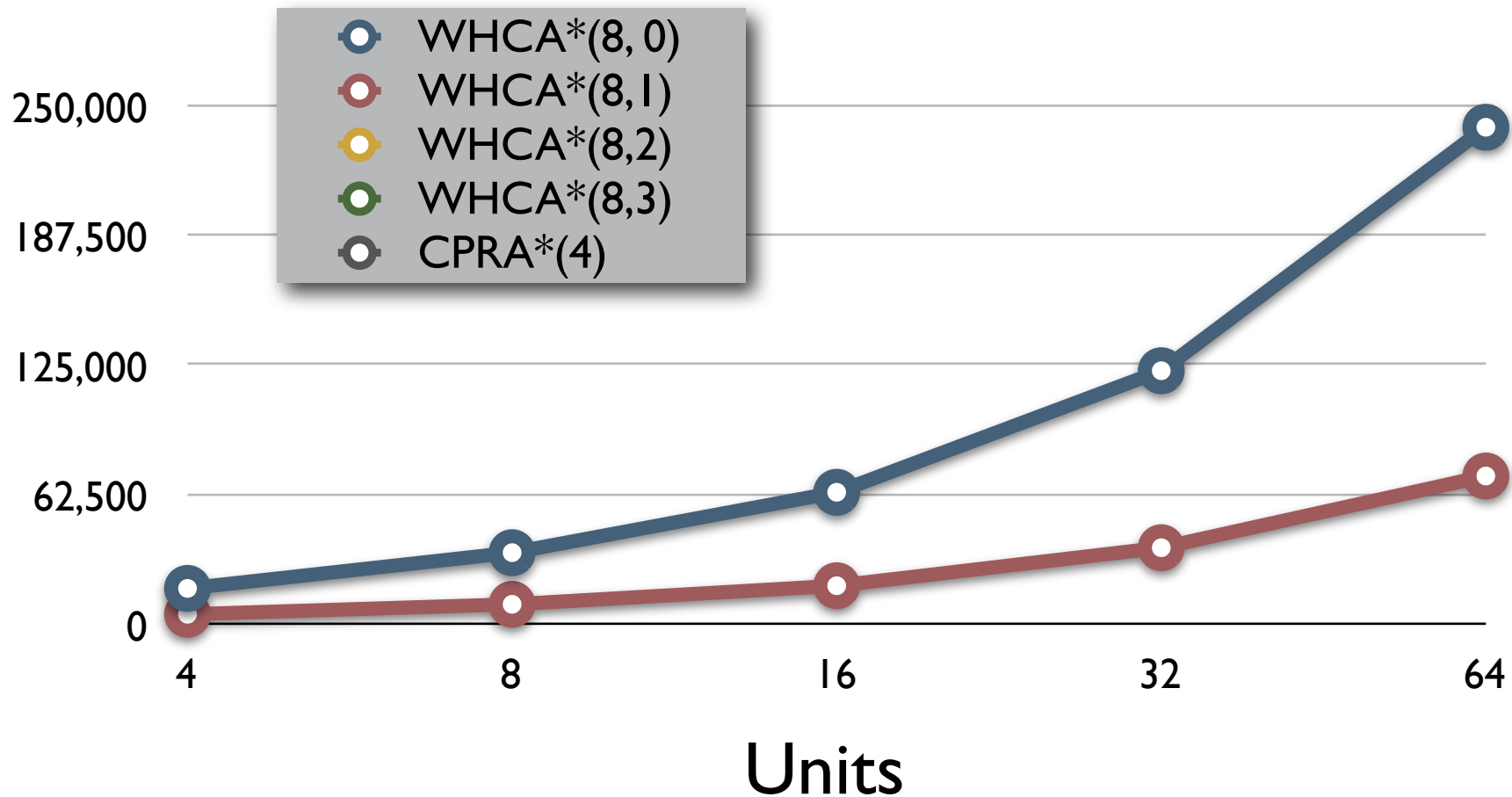
Nodes

First second



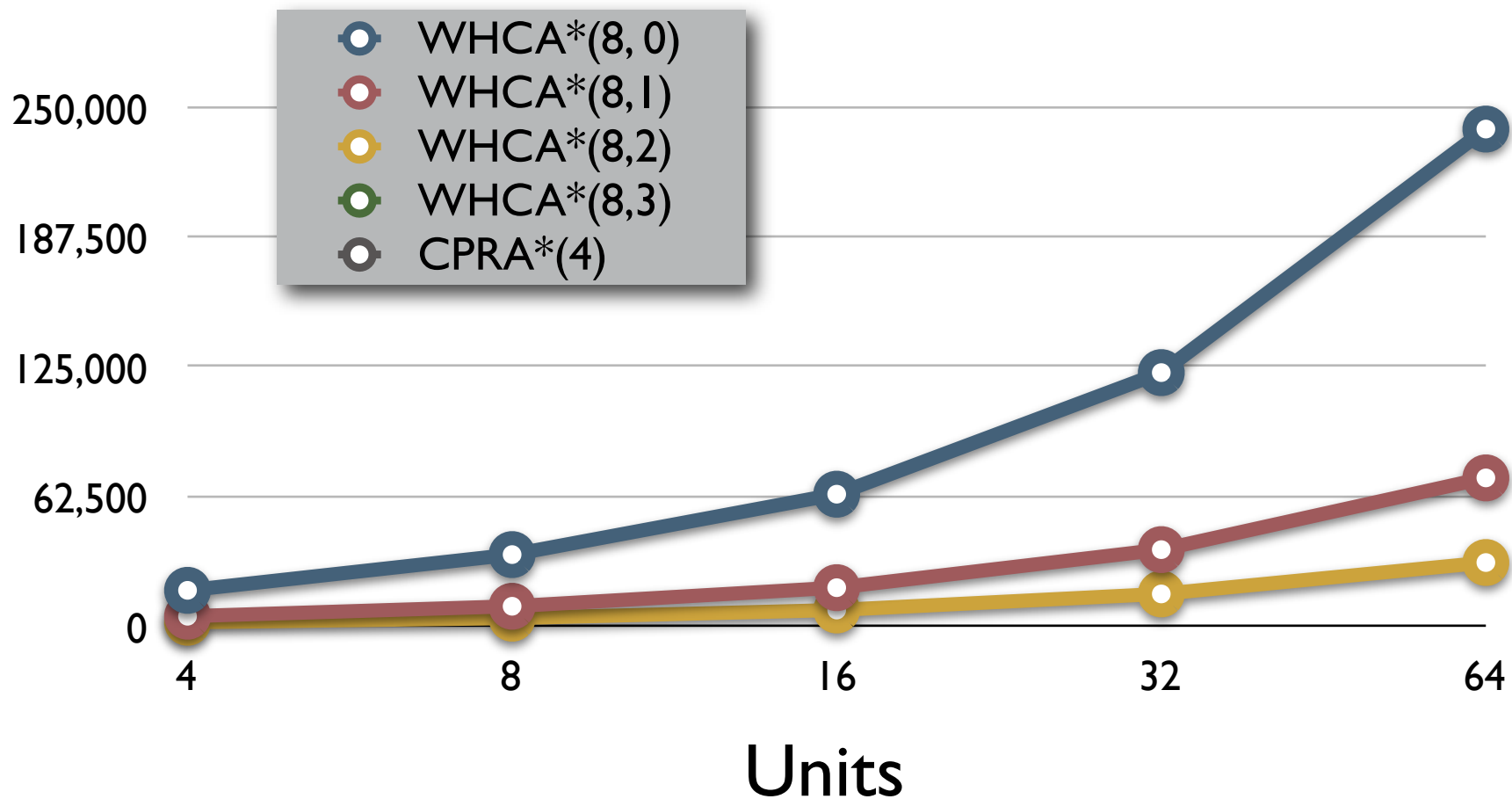
Nodes

First second



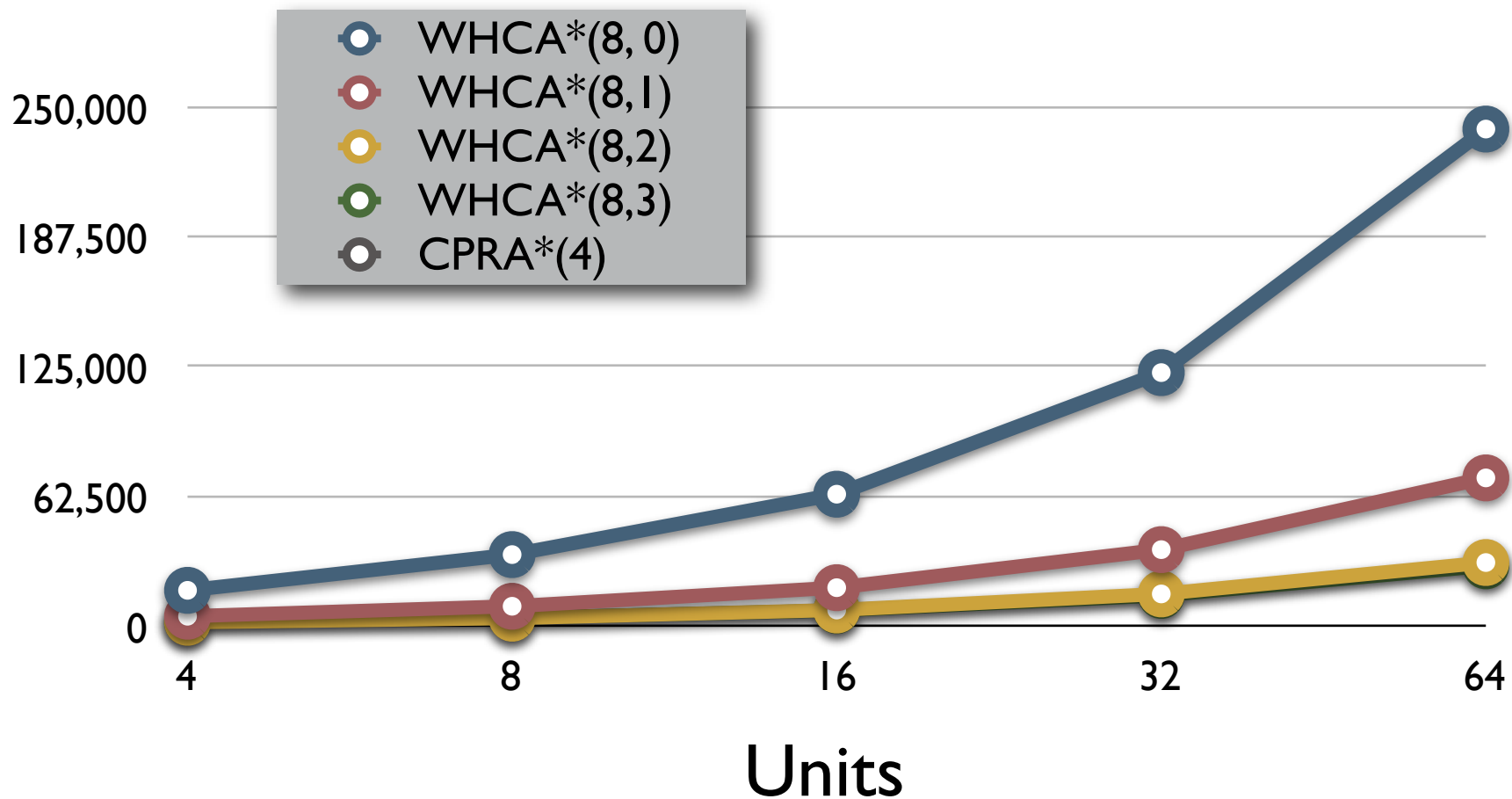
Nodes

First second



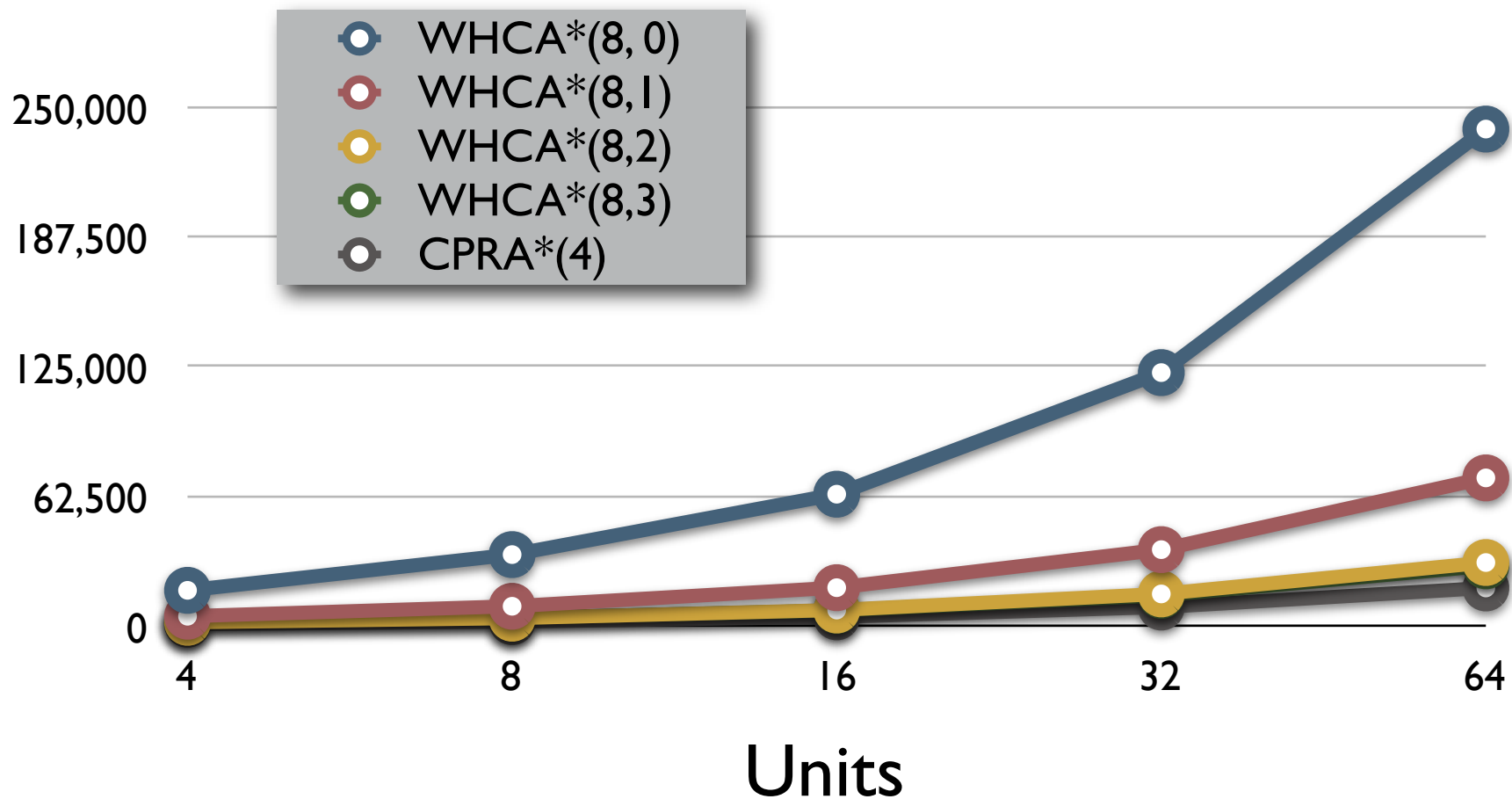
Nodes

First second



Nodes

First second



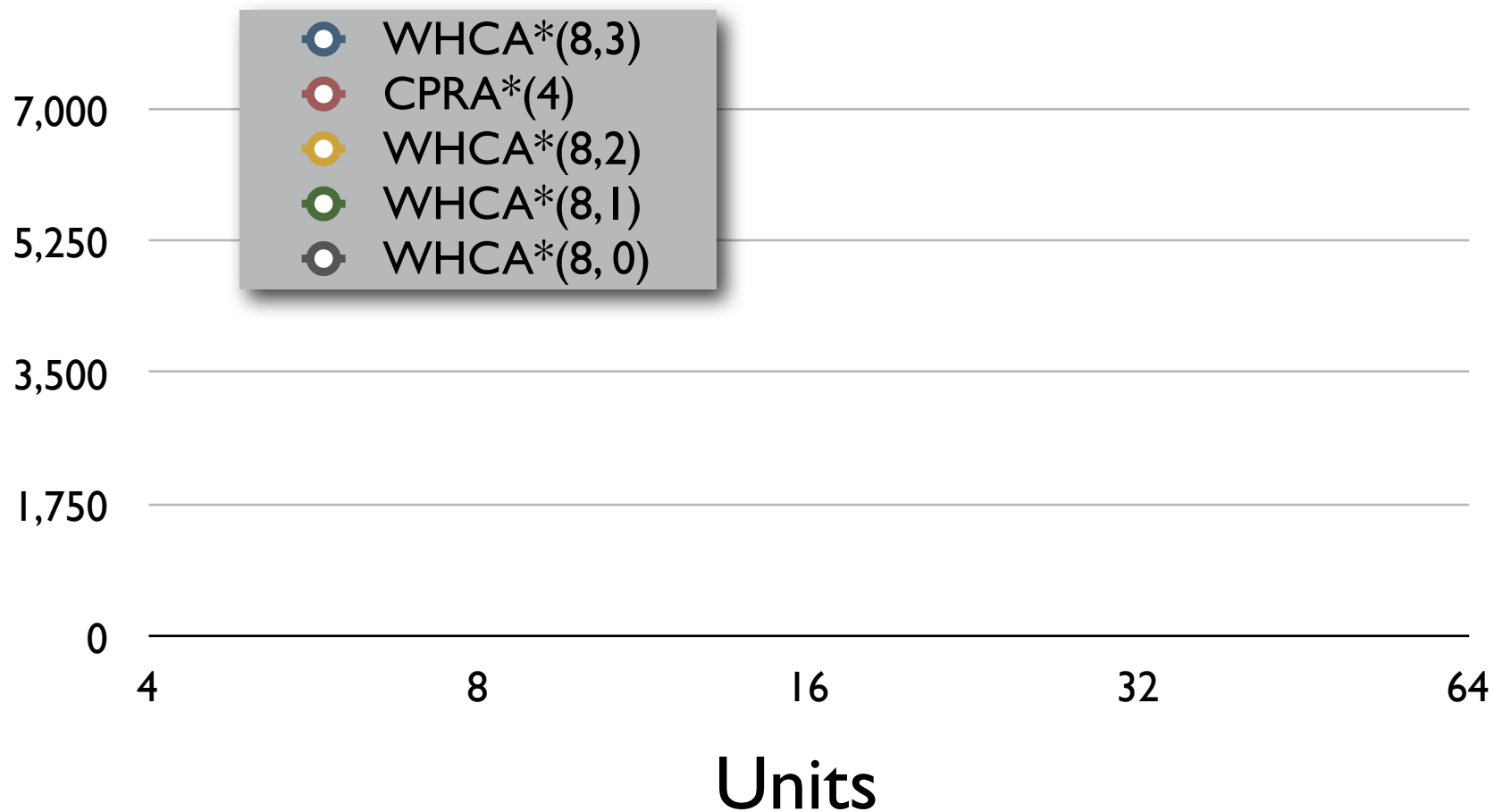
Nodes

Average per second

- WHCA*(8,3)
- CPRA*(4)
- WHCA*(8,2)
- WHCA*(8,1)
- WHCA*(8,0)

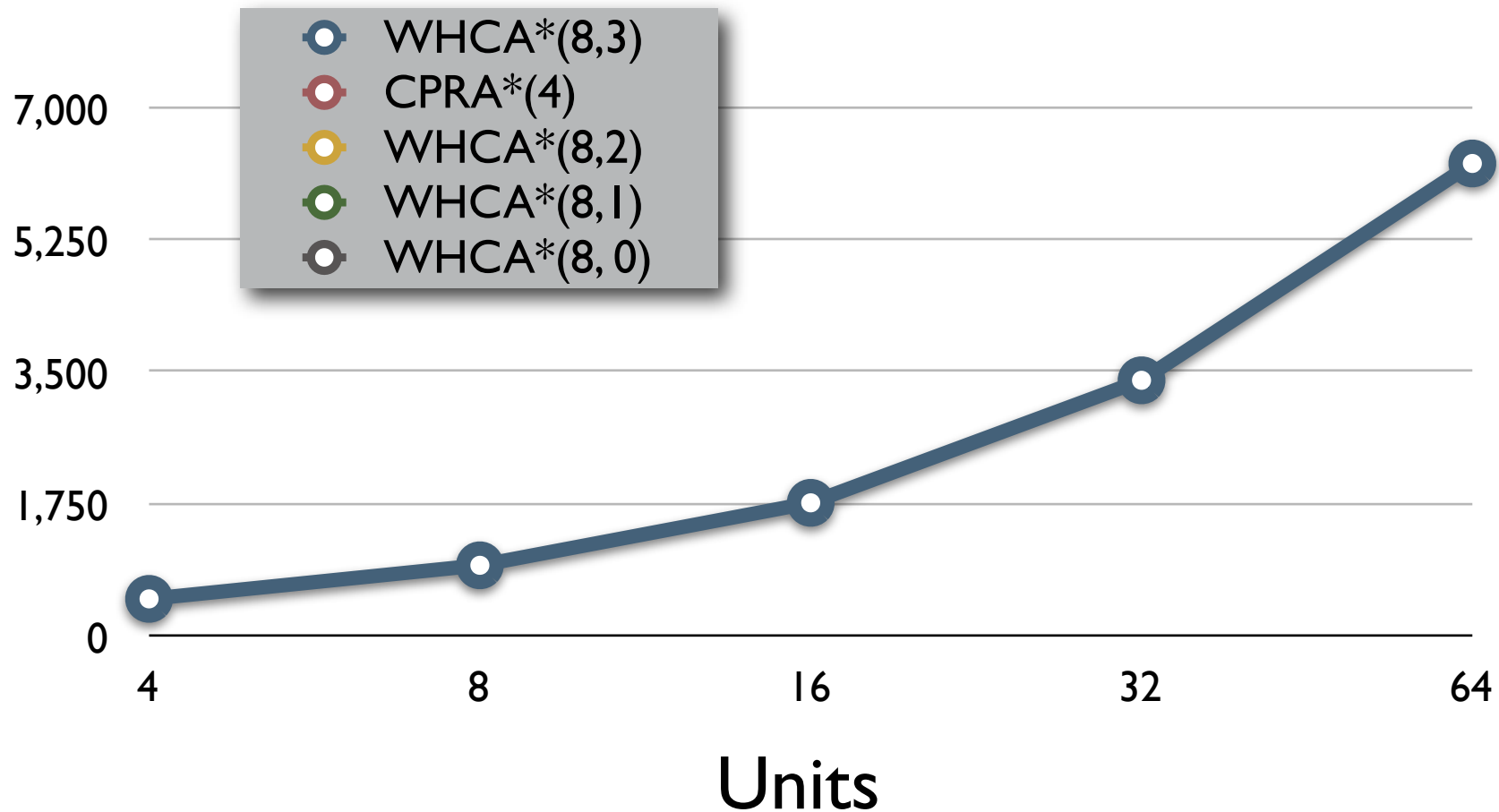
Units

Nodes Average per second



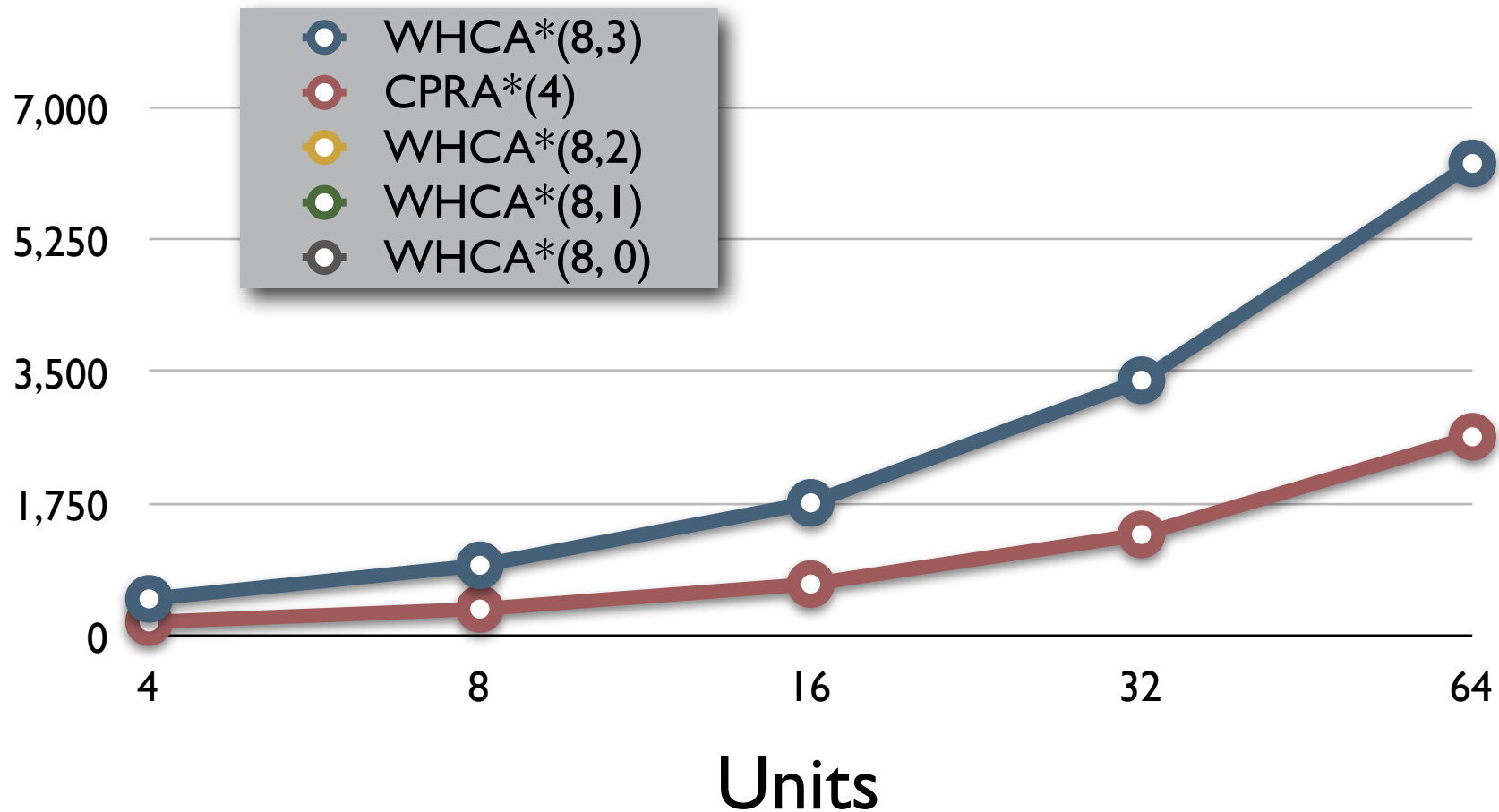
Nodes

Average per second



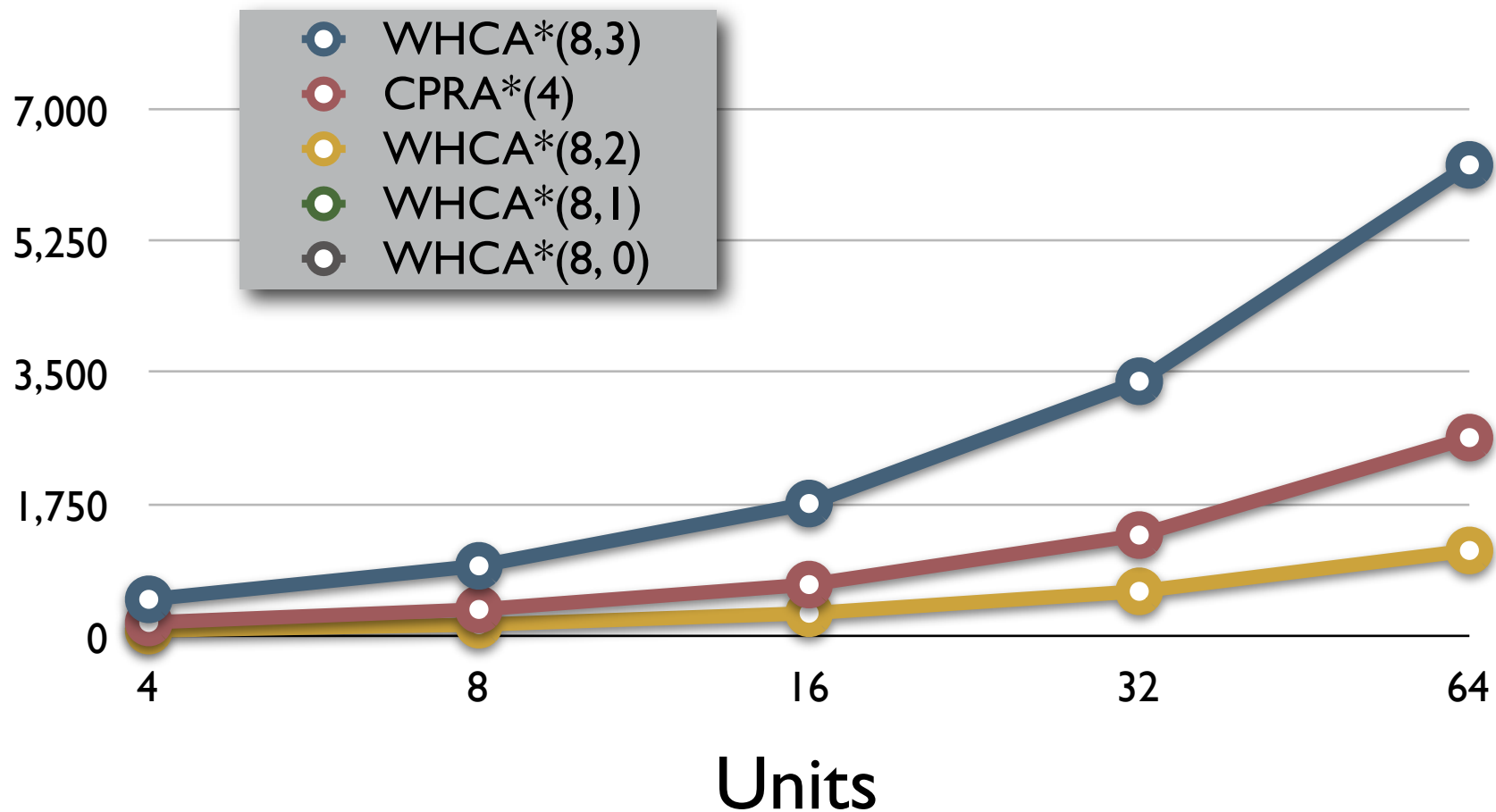
Nodes

Average per second



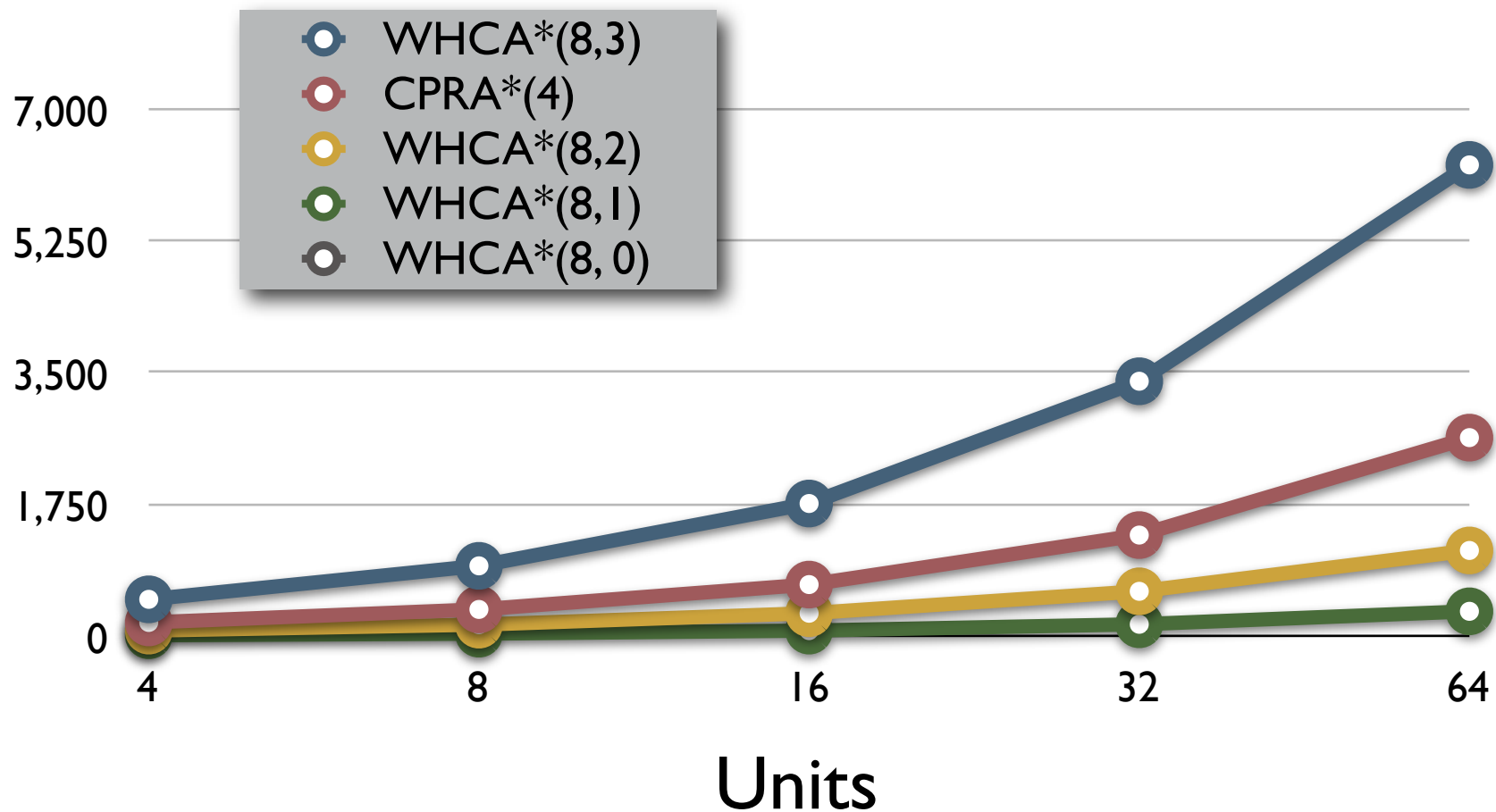
Nodes

Average per second



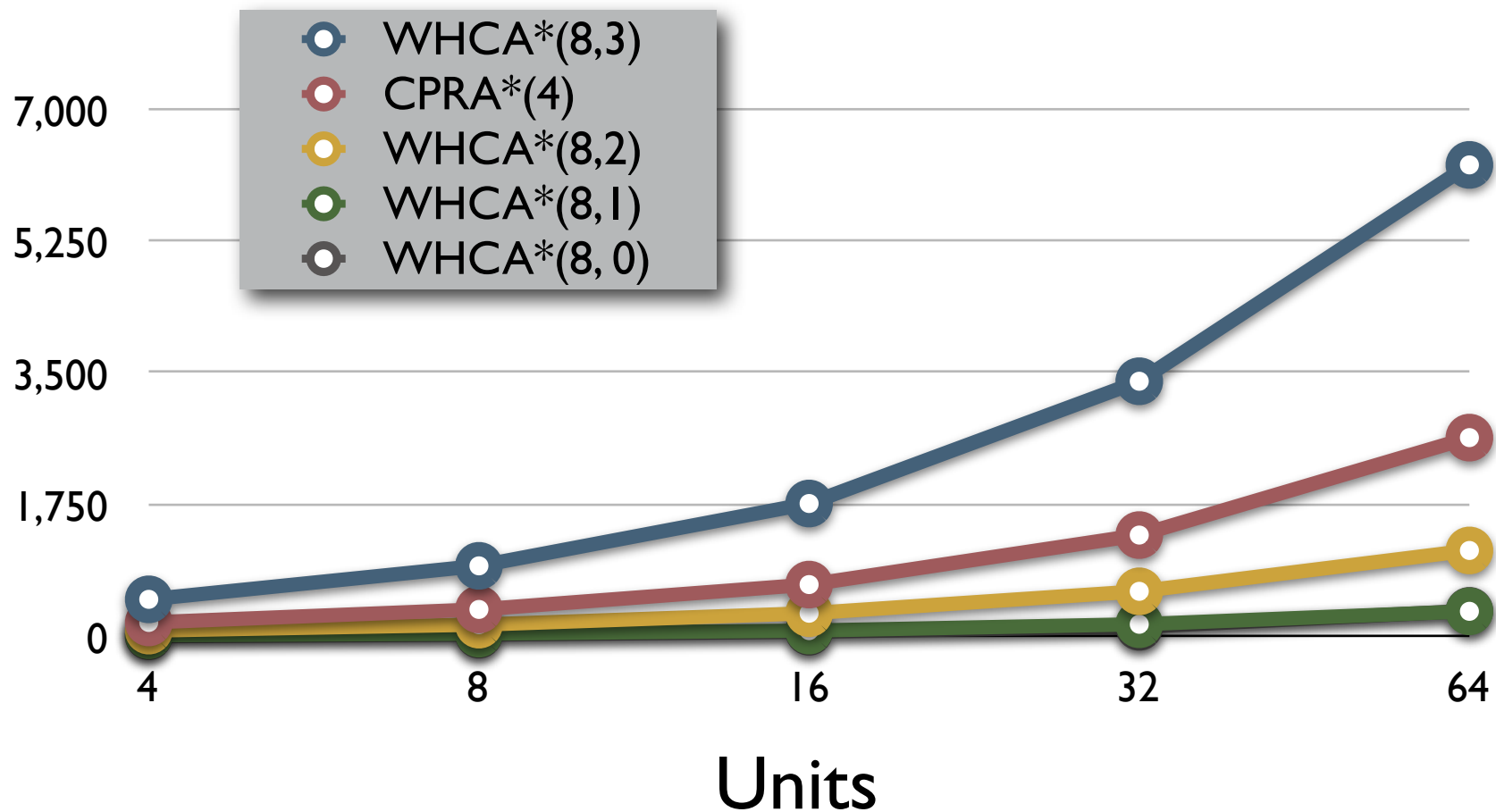
Nodes

Average per second

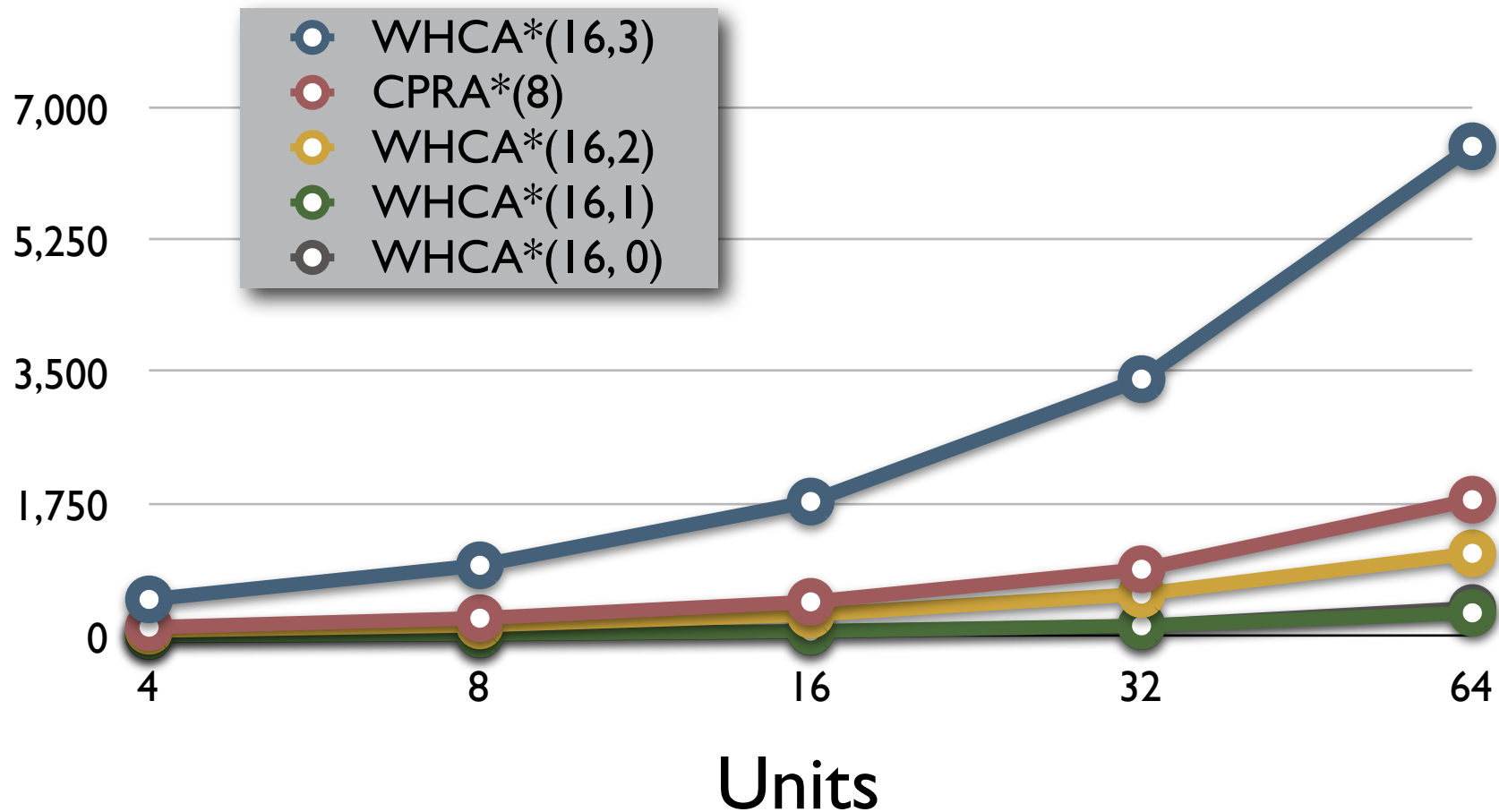


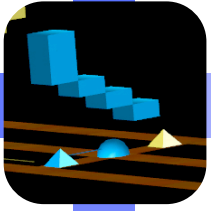
Nodes

Average per second



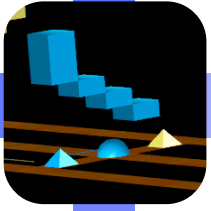
Nodes Average per second





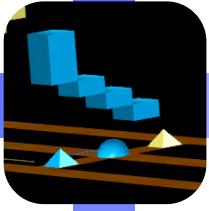
Summary

- Two new algorithms for cooperative pathfinding
- Use abstract maps to reduce computational costs



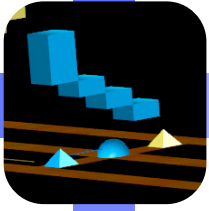
Future Work

- Dynamically adjust reservation windows
 - Use congestion information
- Where does the user notice this?



Generalizing

- General technique for n -dimensional pathfinding problems
 - Solve problem in $n-1$ dimensional space
 - Use as heuristic in n -dimensional search
 - If possible use “lower resolution” version of $n-1$ dimensional problem



Thanks

- Markus Enzenberger

INFORMATICS



C O R E

CIRCLE OF RESEARCH EXCELLENCE