## Flexible Dynamic Space Partitioning for Robotic Rescue

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# Outline

- Introduction
- Path Planning
- Binary Space Partitioning
- Entropy and Information Gain Heuristic
- Empirical Evaluation
- Conclusion

### Introduction

#### • Keystone Rescue Team

- Cheap robotic platforms
- Computer vision as only/main sensor

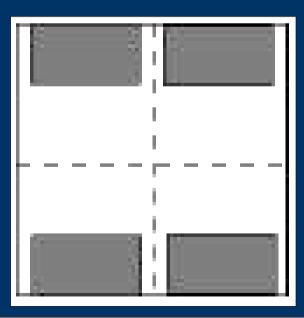


# Path Planning

- Skeletonization
  - Visibility graphs
  - Voroni diagrams
  - Problem: dynamic environments
- Local approaches
  - Potential fields
  - Gradient based method
  - Problem: local minima
- Cell decomposition
  - Quadtree decomposition
  - Recursively subdivide environment
  - Problem: sub-optimal partitioning

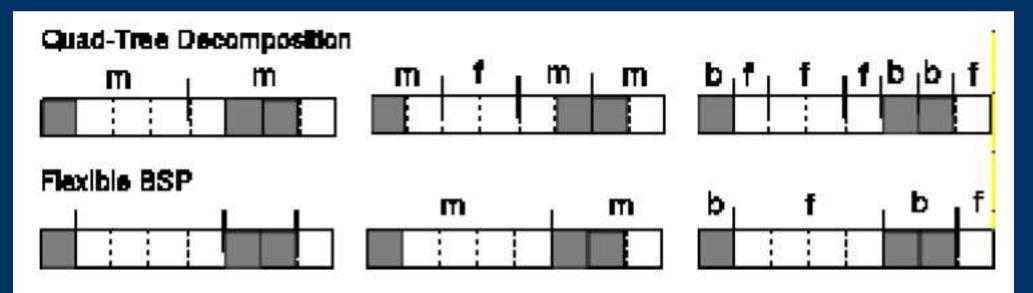
### **Quadtree Decomposition**

- All cells are broken into four equal sized regions
- Position of cells is fixed
- Computational cost, adjacency lists
- Example: all mixed cells



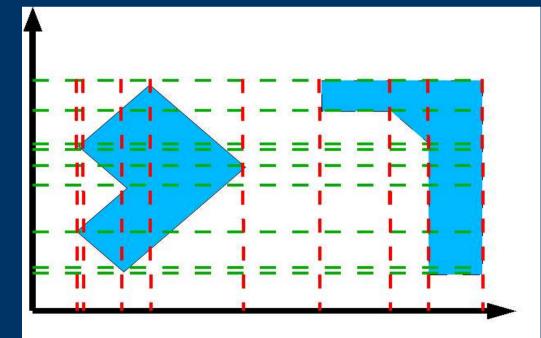
# Flexible Binary space partitioning

- Binary space paritioning subsumes quadtree decomposition
- Extend to allow partitioning at an arbitrary point
- One dimensional example of flexible BSP:



# Finding partitioning points

- Need to select
  - partitioning dimension
  - partitioning point
- Only check projection points
- Large jump in info. gain
- Linear complexity





#### • Minimum length to encode area

$$Entropy(A) = -p_f \log_2 p_f - p_b \log_2 p_b$$

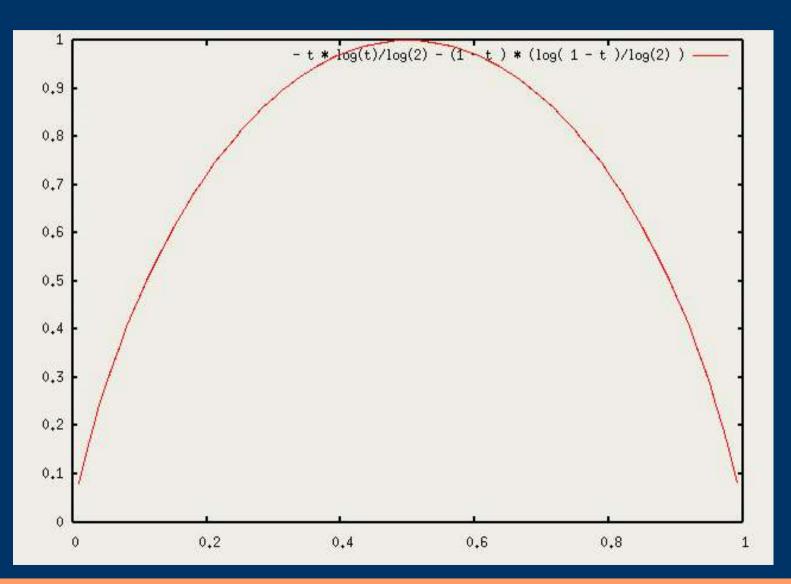
Percentage of free area 
$$p_f = \frac{|f|}{|A|}$$

Percentage of blocked area

$$p_b = \frac{|b|}{|A|}$$

1. . .

# Entropy

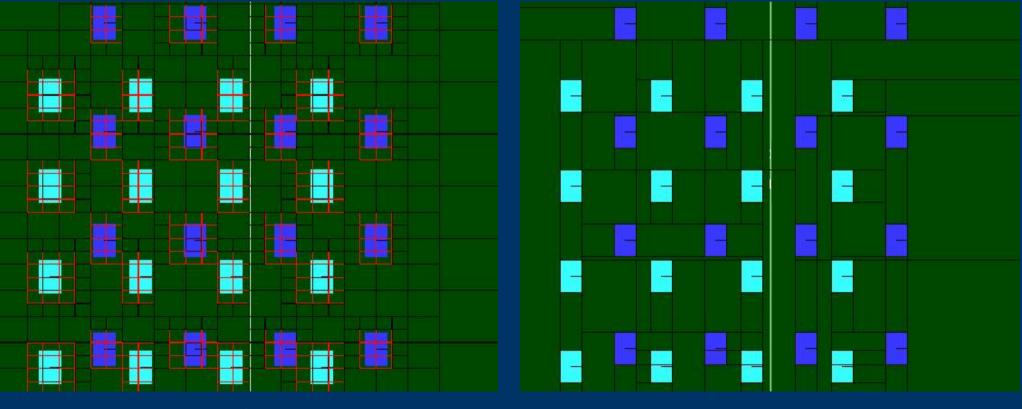


### Information Gain Heuristic

- Heurisitic used by ID3 and other machine learning algorithms
  - Create a minimum depth decision tree
  - Entropy
- Pick partition point *p* that maximizes products of entropy and cell size

$$\operatorname{gain}(p_i, A) = \operatorname{E}(A) - \sum \frac{|P|}{|A|} \operatorname{E}(|P|)$$

### **Example: 32 Obstacles**



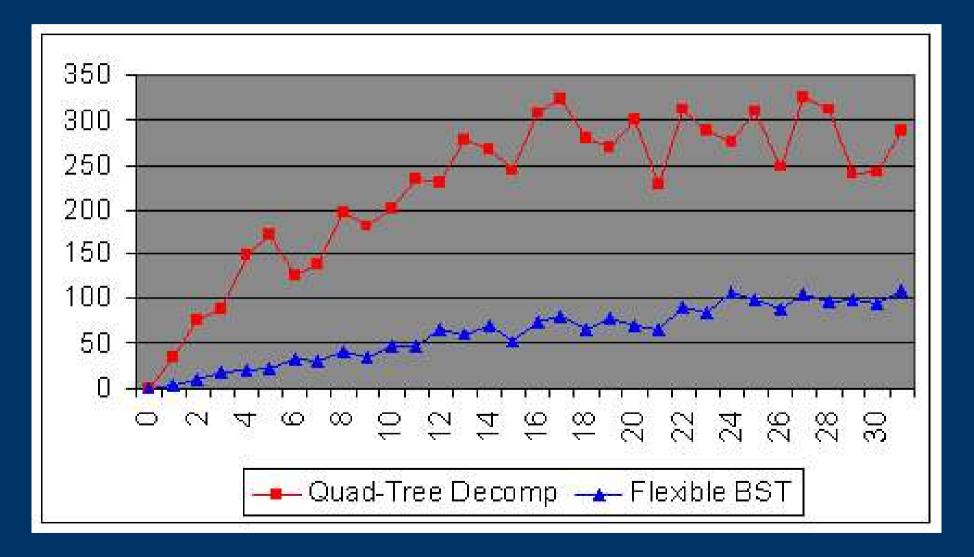
Quadtree

Flexible BSP

## **Empirical Evaluation**

- 2.8m by 2.3m environment
- Number of obstacles 1 32
- Size of obstacles randomized
- Repeated over a number of iterations
- Compared the number of cells generated
- Flexible BPS generated only 27% of the number of cells of standard Quadtree decomposition
- Even better results possible (11 vs. 47 cells)

## **Empirical Evaluation**



## Conclusion

- Flexible BSP produces only 27% of the number of cells in a decomposition
- The entropy heuristic leads naturally to an anytime algorithm
- Probabilistic algorithm suited for highly dynamic, uncertain environments
- Future Work: extend to 3D environments and quadtree decomposition