


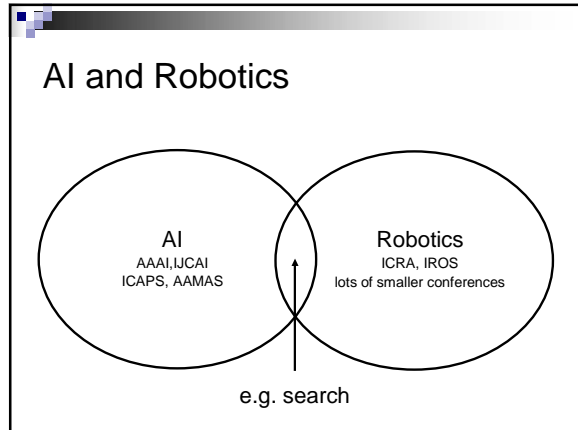
# Search Techniques in AI and Robotics

Sven Koenig  
University of Southern California  
[skoenig@usc.edu](mailto:skoenig@usc.edu)



The symposium is supported by NSF!


Note: Some of the pictures in this talk have been taken from the WWW but the source is no longer known.



## AI and Robotics

Planning and search (almost) started with robotics:


- Shakey [1966-1972] - STRIPS



## AI and Robotics

Planning and search (almost) started with robotics:


- Shakey [1966-1972]: Box Pushing
- GPS: [1957]: Towers of Hanoi
- SHRDLU [1968-1970]: Blockworld



## Search in AI

Search Problems in AI


- States are given and discrete
- Off-line search
- One can concentrate on planning (execution follows)
- Real-time constraints do not exist
- Search space does not fit into memory



## Search in Robotics

Search Problems in Robotics


- States are not given, continuous and often hard to characterize
- On-line search
- Planning and execution have to be interleaved
- Real-time constraints exist
- Search space might or might not fit into memory



20(!) megahertz RAD6000 processor


## Speeding Up A\* Search

How to search faster and faster is important:




2d (x, y) planning

- 54,000 states
- Fast planning
- Slow execution



4d (x, y,  $\theta$ , v) planning

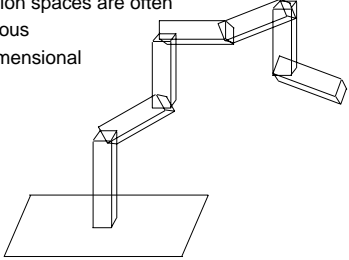
- More than 20,000,000 states
- Slow planning
- Fast execution



[from Maxim Likhachev]

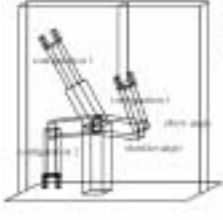
## Work vs Configuration Space

- Configuration spaces are often
  - continuous
  - high-dimensional

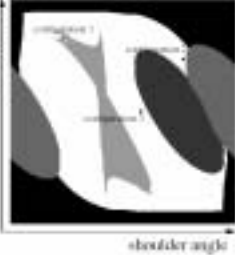


## Work vs Configuration Space

[from Stuart Russell and Peter Norvig]



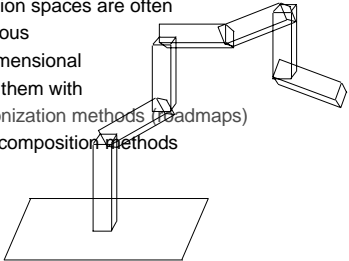
work space



configuration space

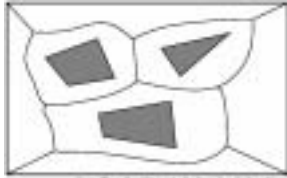
## Work vs Configuration Space

- Configuration spaces are often
  - continuous
  - high-dimensional
- Discretize them with
  - Skeletonization methods (roadmaps)
  - Cell-decomposition methods



## Discretizing Configuration Space


- Skeletonization methods



[from Stuart Russell and Peter Norvig – the figure has slight problems]  
Voronoi graph

## Discretizing Configuration Space

- Skeletonization methods



visibility graph

## Discretizing Configuration Space

- Skeletonization methods:

roadmap using random points [Kavraki et al, 1994]  
(there are also roadmaps using RRTs [LaValle, 1998])

## Work vs Configuration Space

- Configuration spaces are often
  - continuous
  - high-dimensional
- Discretize them with
  - Skeletonization methods (roadmaps)
  - Cell-decomposition methods

## Discretizing Configuration Space

- Cell decomposition methods:

[from Stuart Russell and Peter Norvig]  
vertical strips                      grid

## Discretizing Configuration Space

- Non-uniform cell decomposition

coarse-grained discretization  
might not be able to find a path

fine-grained discretization  
is very inefficient

## Discretizing Configuration Space

- Non-uniform cell decomposition

non-uniform discretization  
avoids these problems


## Discretizing Configuration Space

- Any-angle planning methods

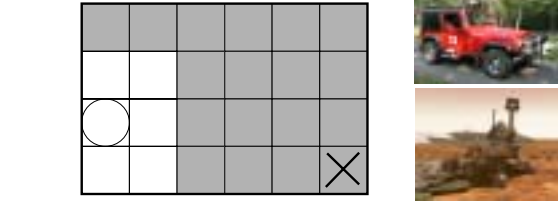
grid path                      any-angle path

## Planning and Execution

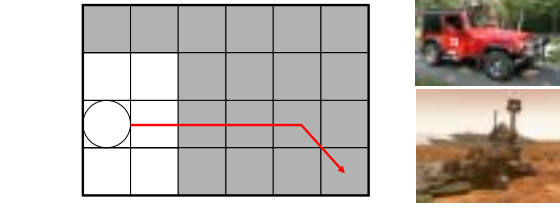
- Incomplete information (knowledge of the robot changes)
  - About the location of the robot (localization)
  - About the configuration space (mapping)
  - About teammates and competitors
- Dynamically changing terrain (terrain changes)
- Uncertainty about actuation and sensing



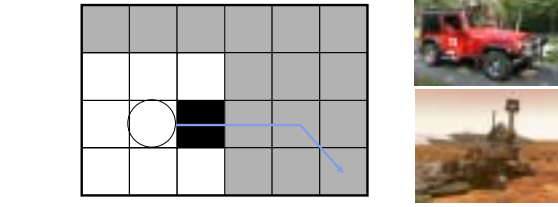
## Planning and Execution



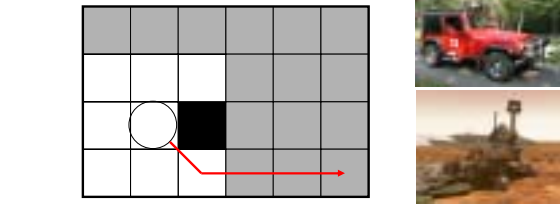
## Planning and Execution



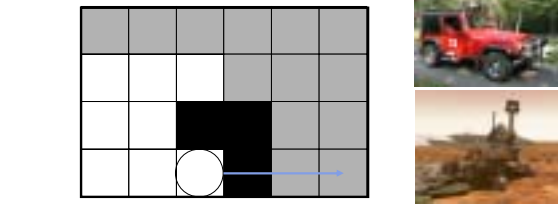
## Planning and Execution



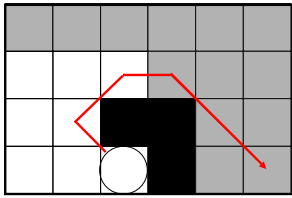


## Planning and Execution



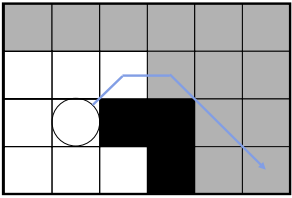


## Planning and Execution



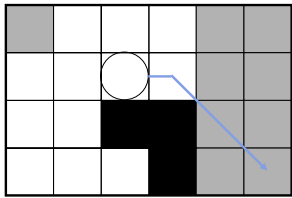


## Planning and Execution

## Planning and Execution








## Planning and Execution

## Planning and Execution

- Incremental heuristic search speeds up A\* searches for a sequence of similar search problems by exploiting experience with earlier search problems in the sequence. It finds shortest paths.


planning task 1 	slightly different planning task 2 	slightly different planning task 3 
---	---	---

100x

planning task 1	slightly different planning task 2	slightly different planning task 3	slightly different planning task 4
-----------------	------------------------------------	------------------------------------	------------------------------------

## Artificial Intelligence

These problems are not specific to robotics.  
They occur whenever one interfaces to the world!



## Artificial Intelligence

These problems are not specific to robotics.  
They occur whenever one interfaces to the world!

icaps International Planning Competition

1998  
2000  
2002  
2004  
2006

