



University of Applied Sciences

HOCHSCHULE  
EMDEN·LEER

# Mobile Robotics

Prof. Dr.-Ing. Gavin Kane

## Lecture Content

- Configuration Space
- Discretized Search Algorithms
- Roadmap Search Algorithms
- Cell Decompositions

# Path Planning

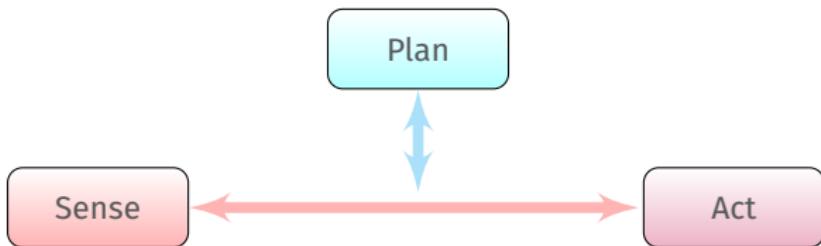
## Motion Planning

- Latombe (1991): "eminently necessary since, by definition, a robot accomplishes tasks by moving in the real world"
- Goals:
  - Collision Free Trajectory:
  - Robot should reach the goal location as quickly as possible

## The challenges..

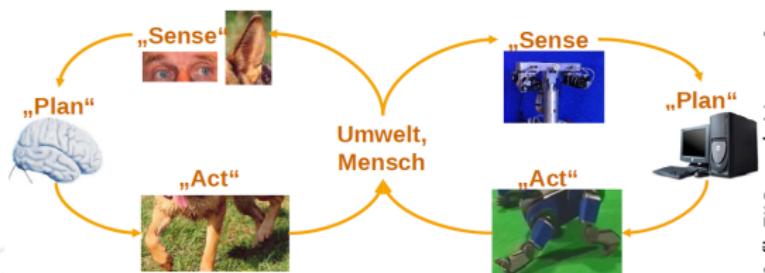
- Calculate the optimal path taking potential uncertainties in the actions into account
- Quickly generate actions in the case of unforeseen objects

# Hybrid Deliberative / Reactive Paradigm



## Hybrid Paradigm

- Low frequency planning / mapping routines
- High frequency collision avoidance in a closed loop reactive motion control



## Configuration Space

- A key concept for motion planning is a configuration:
  - a complete specification of the position of every point in the system
- A simple example: a robot that translates but does not rotate in the plane:
  - what is a sufficient representation of its configuration?
- The space of all possible configurations of the robot (robot arm / etc.) is the configuration space or Cspace.

## Configuration Space

- Let  $q$  denote a point in a configuration space  $Q$
- The path planning problem is to find a mapping  $c : [0, 1] \rightarrow Q$  so that no configuration along the path intersects an obstacle
- We define a Workspace Obstacle as  $WO_i$
- A configuration space obstacle  $QO_i$  is the set of configurations  $q$  at which the robot would intersect  $WO_i$ , that is

$$QO_i = \{q \in Q | R(q) \cap WO_i \neq \emptyset\} \quad (1)$$

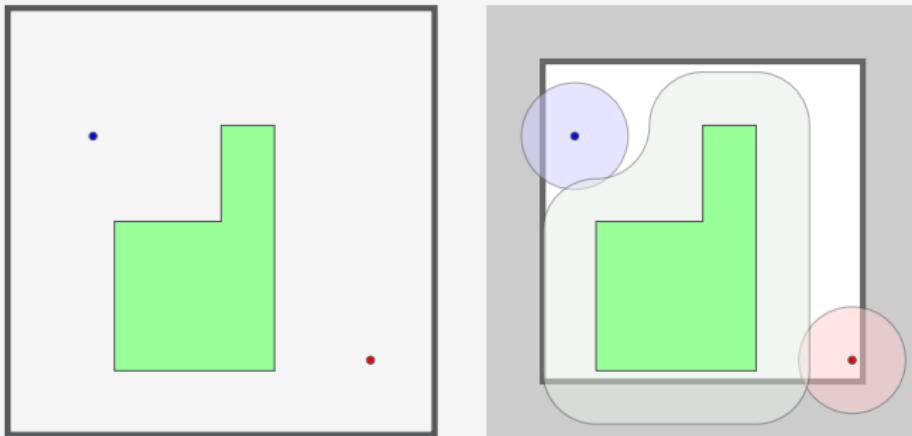
- The free configuration space (or just free space)  $Q_{free}$  is

$$Q_{free} = Q - \sum_i QO_i \quad (2)$$

# Path Planning

## Configuration Space

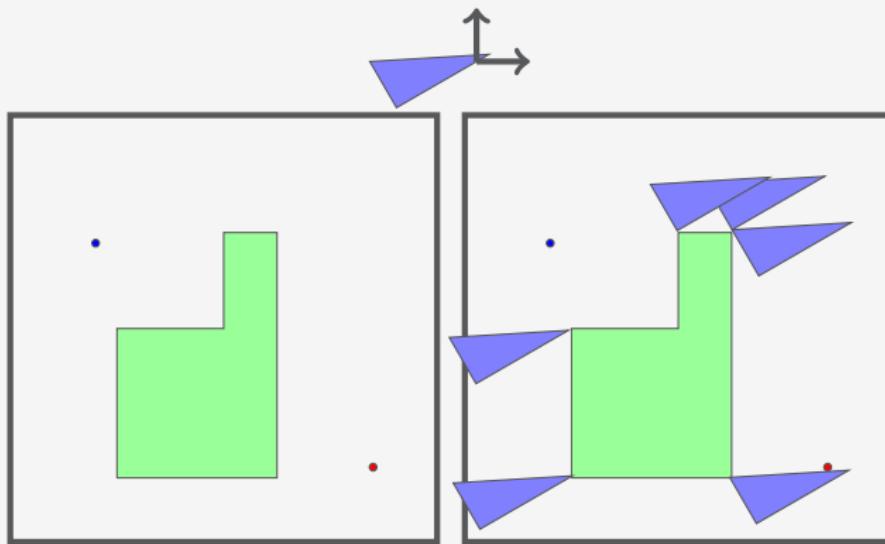
Circular Robot



# Path Planning

## Configuration Space

Non-circular Symmetry, Translation only

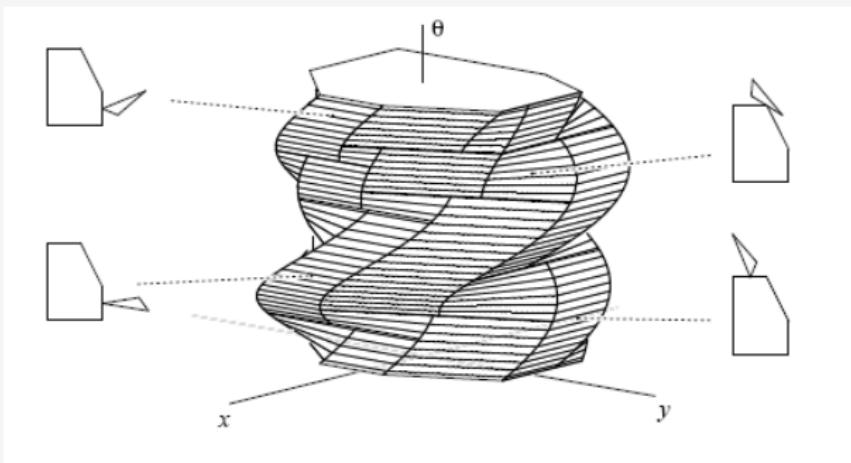


# Path Planning

## Configuration Space

Non-circular Symmetry, including translation

- Robot planning can be performed with the robot being a point in C-Space.

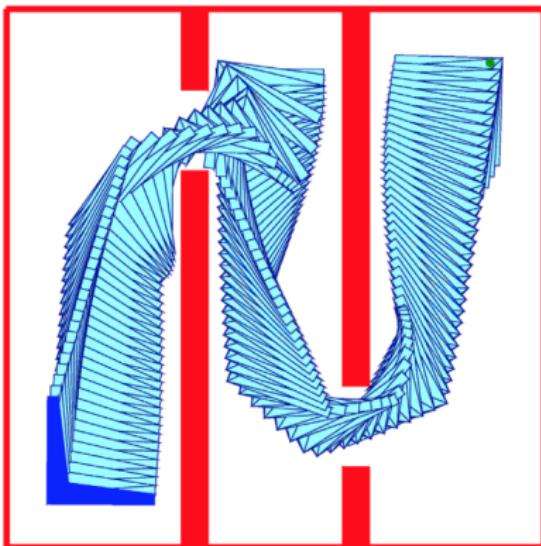


Source: slides from G.D. Hager and Z. Dodds

# Path Planning

## Configuration Space

Importance of Configuration Space to Path Planning



16-735, Howie Choset with slides from G.D. Hager, Z. Dodds, and Dinesh Mocha

## Configuration Space Discretisations

- Continuous Space needs to be discretized for path planning
- There are two general approaches to discretise C-spaces:
  - Combinatorial Planning  
Characterises  $C_{free}$  explicitly by capturing the connectivity of  $C_{free}$  into a graph and finds solutions using search
  - Sampling-based planning  
Uses collision detection to probe and incrementally search the C-space for a solution

## Search

The performance of a search algorithm is measured in four different ways:

- **Completeness:** does the algorithm find a solution when there is one?
- **Optimality:** is the solution the best one of all possible solutions in terms of path cost?
- **Time complexity:** how long does it take to find a solution?
- **Space complexity:** how much memory is needed to perform the search?

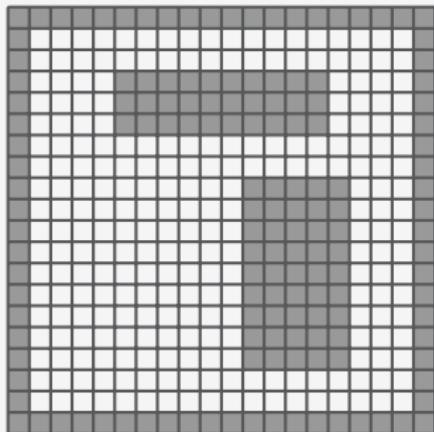
## Search

The problem of search: finding a sequence of actions (a path) that leads to desirable states (a goal).

- Uniformed Search: Besides the problem definition, no further information about the domain ("blind search")
- The only thing one can do is to expand nodes differently
- Example algorithms: breadth first, uniform-cost, depth-first, bidirectional, etc.

# Path Planning

## Discretized Configuration Space



## Search

The problem of search: finding a sequence of actions (a path) that leads to desirable states (a goal)

- Informed Search: further information about the domain through heuristics
- Capability to say that a node is "more promising" than another node
- Example Algorithms: Greedy best-first search, A\*, many variants of A\*, D\* etc.

# Path Planning

## Uninformed Search

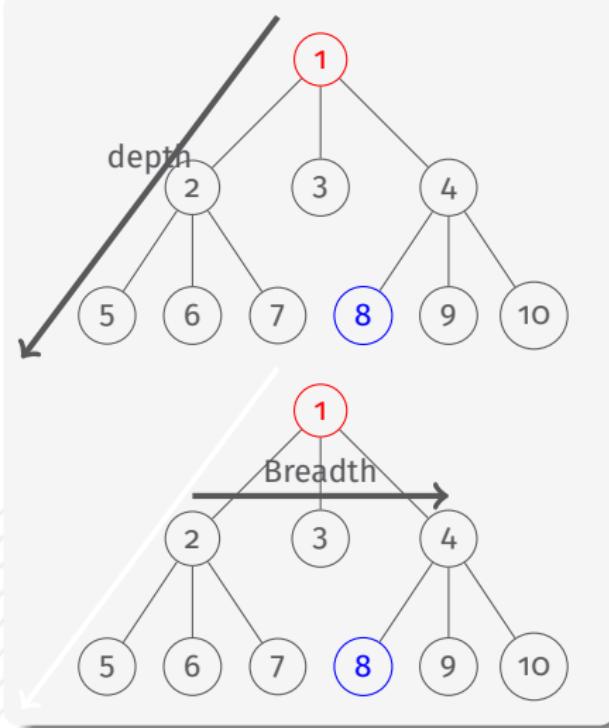
Breadth-first:

- Complete
- Optimal if action costs equal
- Time and Space:  $O(b^d)$

Depth-first:

- Not complete in infinite spaces
- Not optimal
- Time:  $O(b^m)$
- Space:  $O(b \cdot m)$  (can forget explored subtrees)

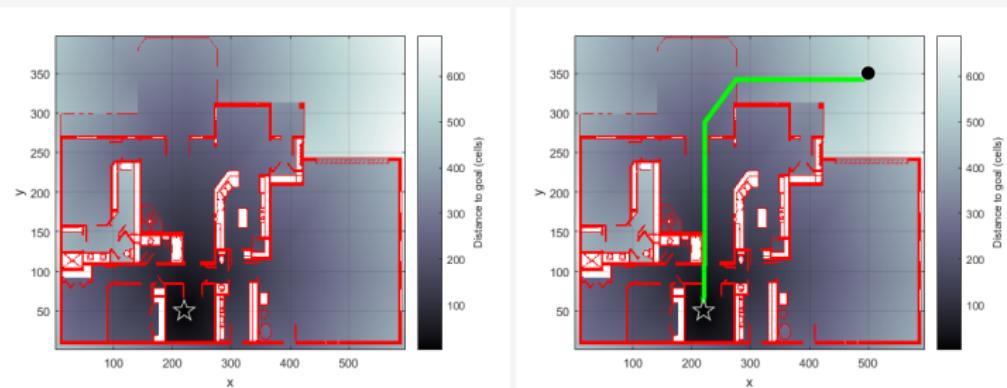
b: Branching factor, d: goal depth, m: max tree depth



# Path Planning

## Distance Transform

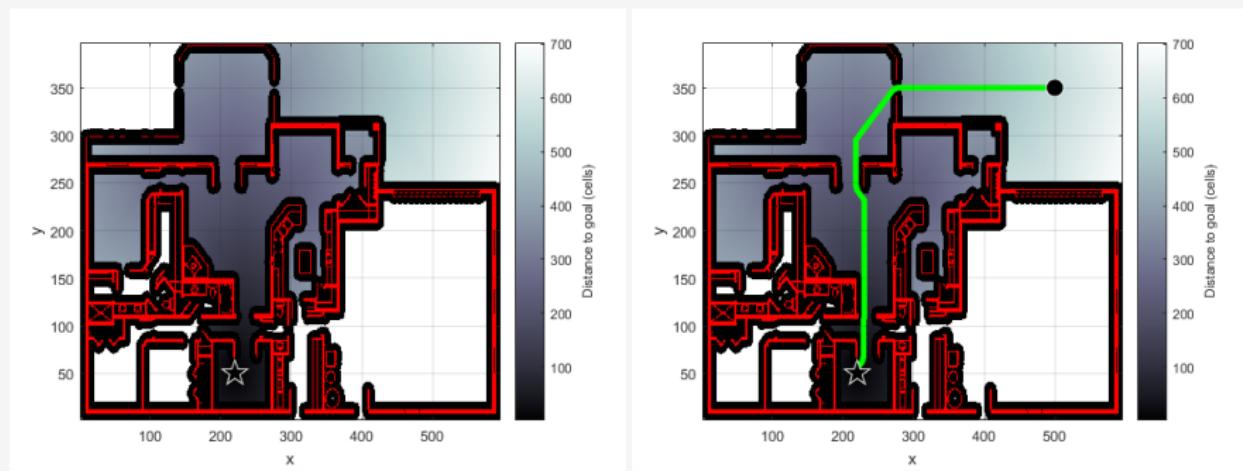
- Starting with a configuration map, each cell is weighted with its shortest route distance.



# Path Planning

## Distance Transform with Configuration Space Considerations

- Discretized Configuration Space used for Path Planning.
- Some possible goals are no longer possible



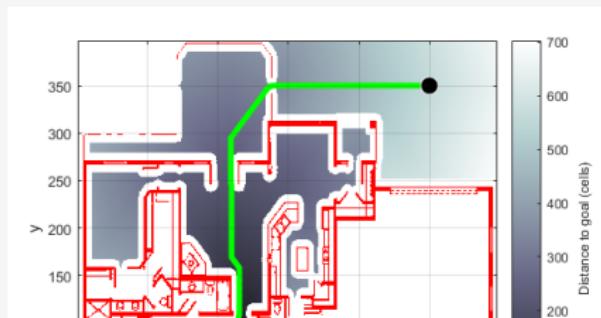
# Path Planning

## A\*

- A\* is an informed search algorithm, or a best-first search
- Searches among possible paths for the solution (goal) that incurs the smallest cost,
- and among these paths it first considers the ones that appear to lead most quickly to the solution.
- Weighting is calculated from:

$$f(n) = g(n) + h(n) \quad (3)$$

- $g(n)$  represents the exact cost of the path from the starting point to any vertex n
- $h(n)$  represents the heuristic estimated cost from vertex n to the goal.



# Path Planning - Dijkstra

## Dijkstra

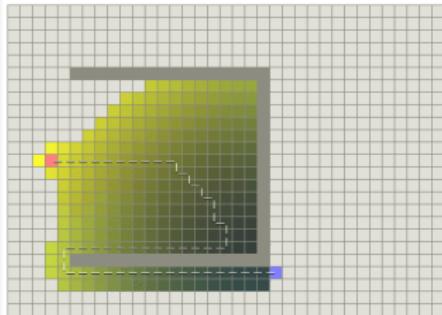
# Path Planning - A\*

A\*

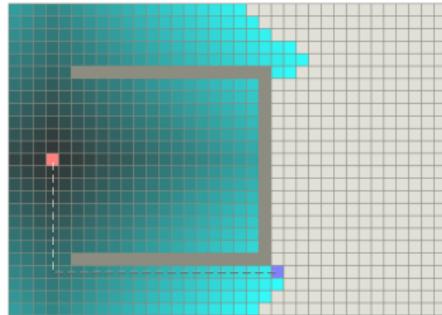
# Path Planning

## Comparison between Algorithms, Computational Efficiency vs Path Optimality

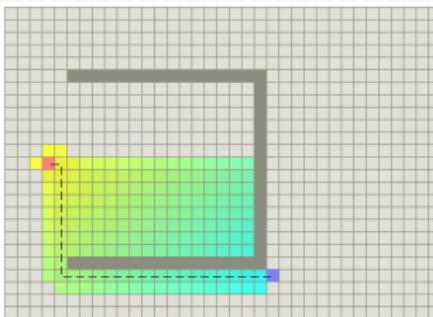
Greedy



Dijkstra



$A^*$



# Path Planning

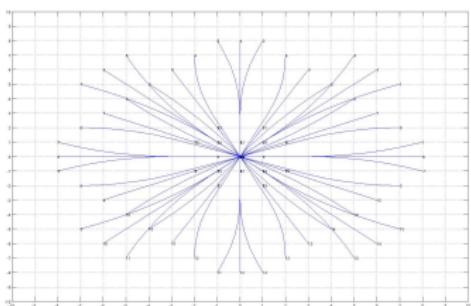
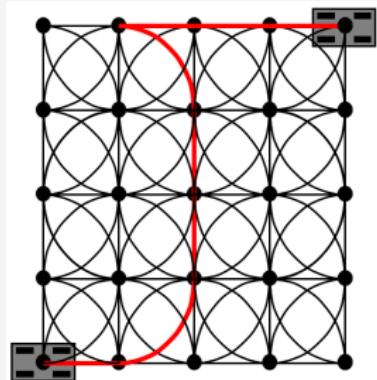
## Implementation

<http://theory.stanford.edu/~amitp/GameProgramming/Implementation-Notes.html>

# Path Planning

## >2D Planning

### ■ Lattice Planner



Source: <http://www.frc.ri.cmu.edu/alonzo/video/Lattice.PNG>  
<http://sbpl.net/shared/Images/MotionPrimitives.jpg>

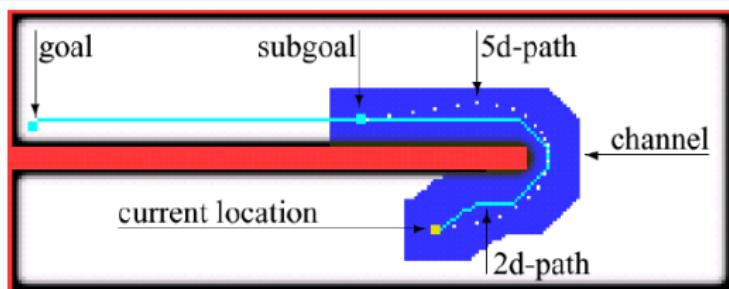
## 5D Planning

- Planning in 2D does imply compliance with kinematic movement
- Planing in the full  $< x, y, \theta, v, \omega >$  configuration space using A\*
- Generates a sequence of steering commands to reach the goal location
- Maximises trade-off between driving time an distance to obstacles
- Possible solutions in discrete space can involve a change between maximum steering angles in consecutive steps.
- The search space is too large to be explored within normal planning time constraints

# Path Planning

## 5D Planning

- Alternate solution, use A\* to search for the optimal path in the 2D-grid map
- With an assumption, the 5D-plan lies close to the 2D plan.
- In areas with sharp corners, establish sub-goals and a channel where the C-Space allows
- Find solution for 5D movement in Channel with smaller search space



Source: Wolfram Burgard, Uni Freiburg

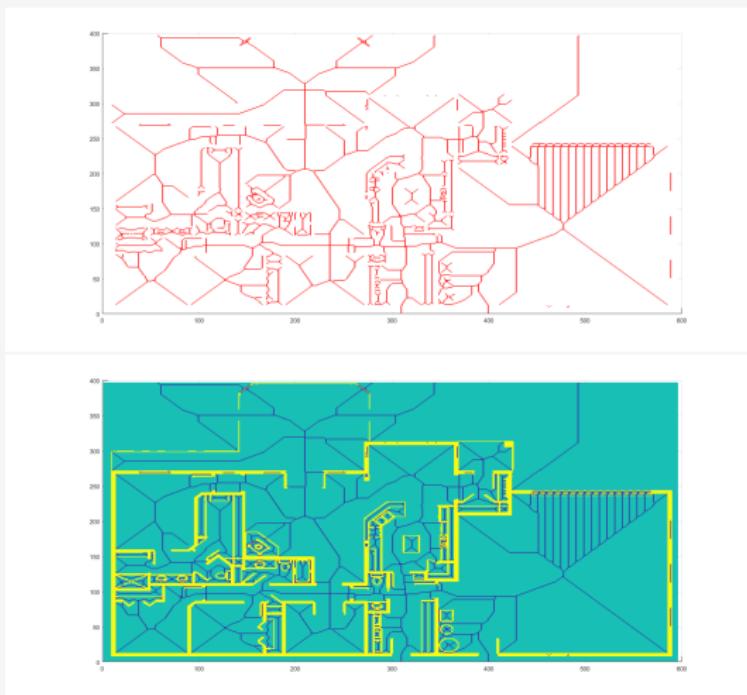
## Roadmap Methods

- In robotic planning, analysis of the map is referred to as the planning phase
- the Query phase, uses the result of the planning phase to determine the route from A to B
- A\* and other discretised search algorithms require significant amount of computation for the planning phase, but the query phase is cheap.
- The plan depends on the goal, and if the goal changes, the expensive planning phase must be repeated
- With Roadmap planning, similar to a train map, the planning phase is irrelevant of the goal

# Path Planning

## Roadmap Methods

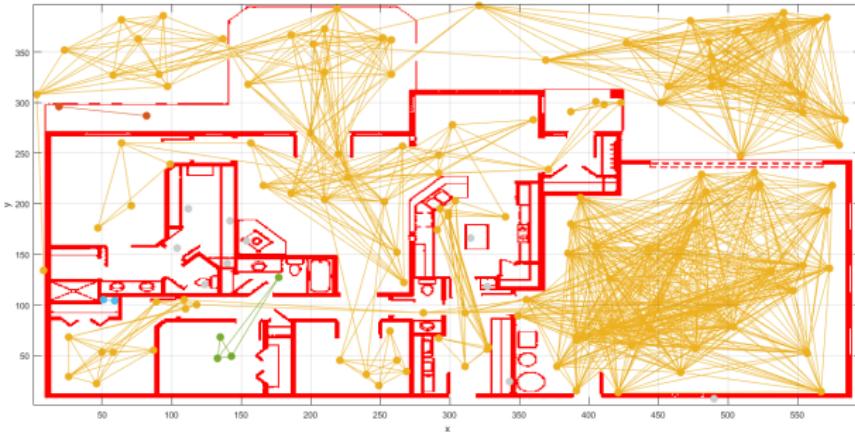
- Voronoi Diagram



# Path Planning

## Roadmap Methods

- Probabilistic Road Map (PRM)



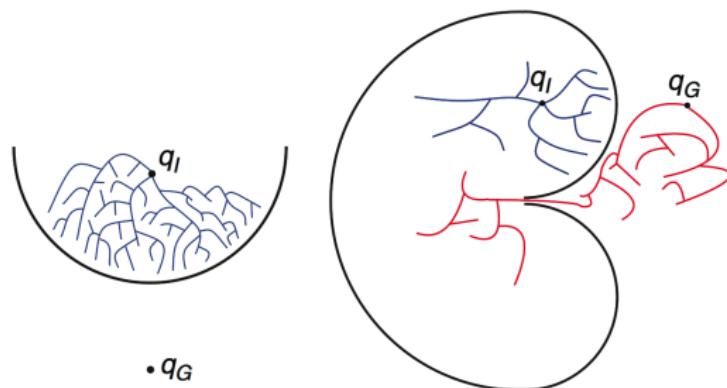
## Probabilistic Road Map

- Pros:
  - Can operate in high dimensional C-Space
  - Efficient calculation in planning and query phase
- Cons:
  - Problems with long corridors
  - Not optimal Solution

# Path Planning

## Roadmap Methods

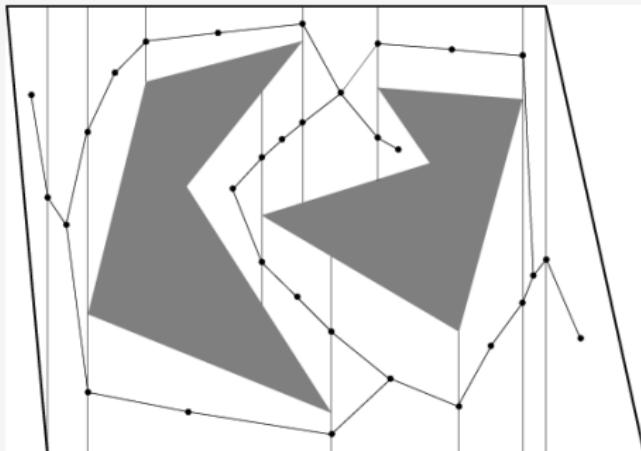
- Rapidly Exploring Random Tree (RRT)



# Path Planning

## Roadmap Methods

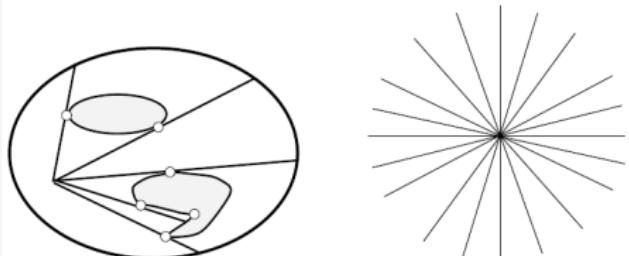
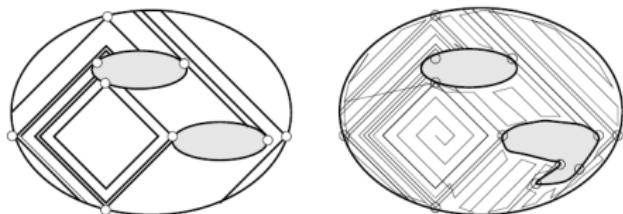
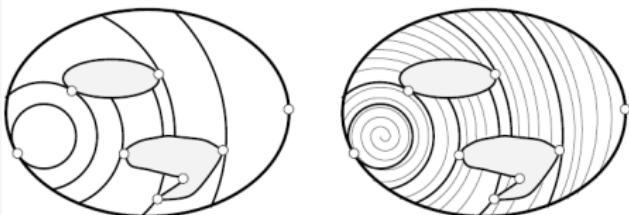
- Cell Decompositions
  - Cell: simple region



- Planning in two steps:
  - Planner determines cells that contain the start and goal
  - Planner searches for a path within adjacency graph

# Path Planning

## Morse Decomposition



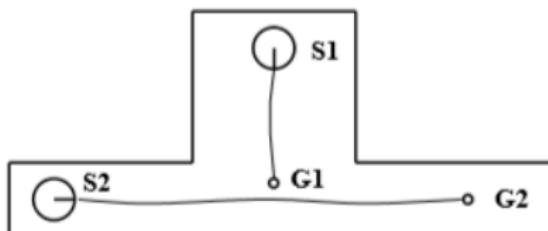
# Path Planning

## Optimisations ...

- Identify in advance concave areas, and remove from planning
- Large areas can be discretized with a larger cell size
- ...

## In a Dynamic Environment ...

- Path Planning with multiple robots requires an additional level of optimisation for the complete solution.



## Summary

- Motion Planning commences with the analysis of configuration space
- Discretised Configuration Space is a first step
- Higher dimensions are required for fulfilling kinematic requirements
- Higher dimensions are computationally intense
- Two phases are the planning and the query
- A\* and other discretised search algorithms require significant amount of computation for the planning phase, but the query phase is cheap.
- The plan depends on the goal, and if the goal changes, the expensive planning phase must be repeated
- With Roadmap planning, similar to a train map, the planning phase is irrelevant of the goal