



Motion Planning

METR 4202: **Robotics** & Automation

Dr Surya Singh -- Lecture # 10

October 5, 2016

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[<http://metr4202.com>]

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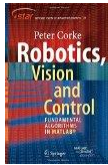
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Schedule of Events

Week	Date	Lecture (W: 12:05-1:50, 50-N202)
1	27-Jul	Introduction
2	3-Aug	Representing Position & Orientation & State (Frames, Transformation Matrices & Affine Transformations)
3	10-Aug	Robot Kinematics Review (& <i>Ekka Day</i>)
4	17-Aug	Robot Inverse Kinematics & Kinetics
5	24-Aug	Robot Dynamics (Jacobians)
6	31-Aug	Robot Sensing: Perception & Linear Observers
7	7-Sep	Robot Sensing: Single View Geometry & Lines
8	14-Sep	Robot Sensing: Feature Detection
9	21-Sep	Robot Sensing: Multiple View Geometry
	28-Sep	<i>Study break</i>
10	5-Oct	Motion Planning
11	12-Oct	Probabilistic Robotics: Localization & SLAM
12	19-Oct	Probabilistic Robotics: Planning & Control
13	26-Oct	State-Space Automation (Shaping the Dynamic Response/LQR) + Course Review



Follow Along Reading:



[Robotics, Vision & Control](#)
by [Peter Corke](#)

Also online: [SpringerLink](#)

[UQ Library eBook:](#)
[364220144X](#)

Today

→ Planning & Control ←

- Planning (**Global** Motion)
 - pp. 91-103
(Yup! That's all Peter Corke has to say! Yet there is a Chapter [15] on Visual Servoing, a **local** motion method that can't handle obstacles).

- SLAM
 - pp. 123-4
(§6.4-6.5)

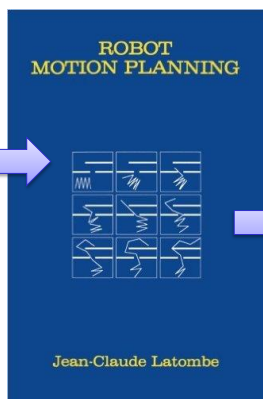
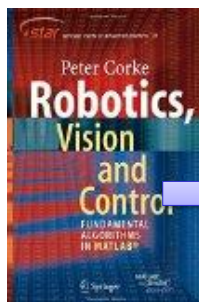
Next Time



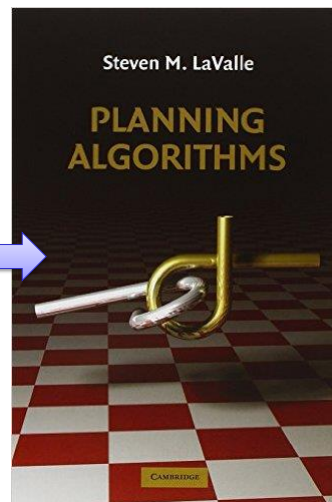
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Reference Material



[UQ Library](#)
(TJ211.4 .L38 1991)



[UQ Library / Online \(PDF\)](#)



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(Kinematic) Motion Planning

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Motion Planning? Let's Get Moving...



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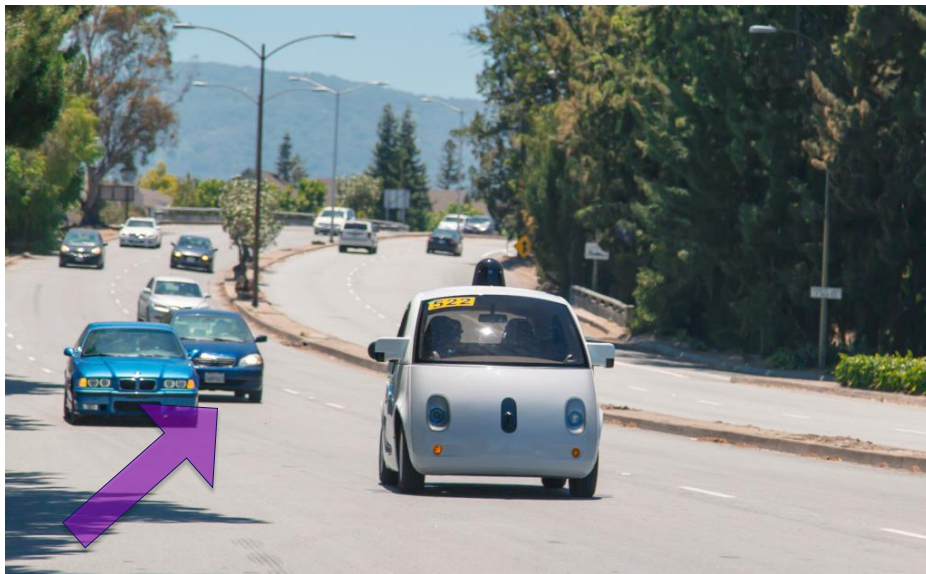
Motion Planning? Let's Get Moving?



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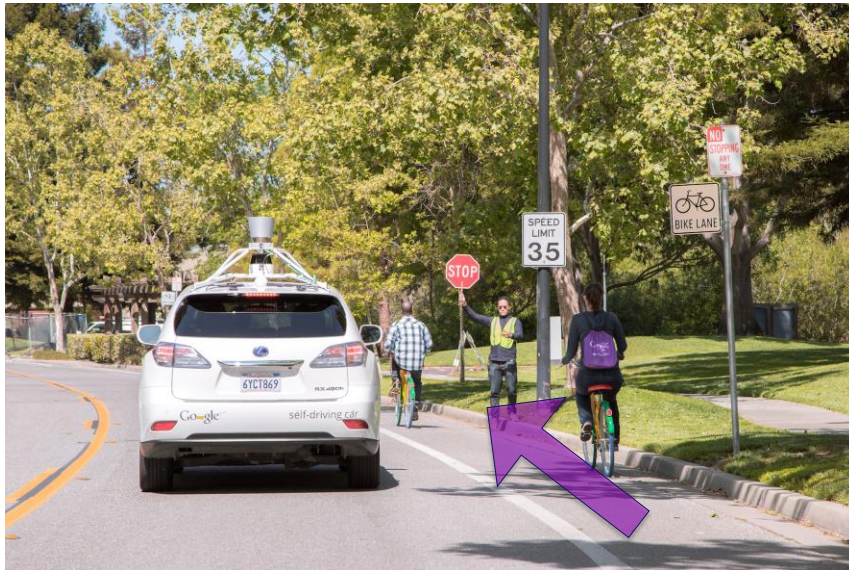
Motion Planning? The clutter can not be “ignored”



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Motion Planning: Processing the Limits



Path-Planning Approaches

- Roadmap
Represent the connectivity of the free space by a network of 1-D curves
- Cell decomposition
Decompose the free space into simple cells and represent the connectivity of the free space by the adjacency graph of these cells
- Potential field
Define a function over the free space that has a global minimum at the goal configuration and follow its steepest descent



See Also: <http://robotics.itee.uq.edu.au/~ai/>

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ARTIFICIAL INTELLIGENCE

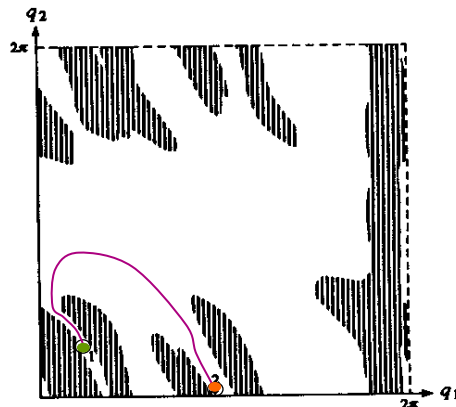
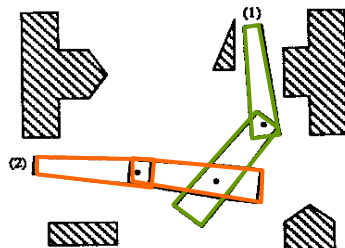
HOME / SCHEDULE / RESOURCES

Tentative Schedule

Date	Topics	Readings	Notes
29/07/16	Class Admin Introduction to Artificial Intelligence (AI) Introduction to the Agent Design Problem Introduction to Search Class admin slides, Introduction to AI slides Tutorial 1 Sample solution	Turning test RAN ch. 1-2.3, 3.1-3.3	A nice note on the solvability of n -puzzle (including 8-puzzle)
05/08/16	Uninformed Search Informed Search Slides Tutorial 2 Sample solution	RAN ch. 3	Assignment 1 out on 08/08/16 Register your group here . Assignment 1 Specs Example of the input format (graph search problem in the lectures) Additional test cases
12/08/16	Informed search (cont.) Search in continuous space with motion planning applications Slides Tutorial 3 Sample solutions	RAN ch. 25.4 C-spaces Sample solution	A nice explanation on Visibility Graph (de Berg, et al., Computational Geometry: Algorithms and Applications)
19/08/16	Motion planning application Slides Tutorial 4 Sample solutions		
02/09/16	Logic Slides Tutorial 5 Sample solutions	RAN ch. 6	RAN ch. 7 Assignment 1 due Assignment 2 out on 26/08/16 Assignment 2 Specs Example of input files Scheduling Code (Week 12 Sep) Additional testcases
02/09/16	Decision making under non-deterministic and adversarial uncertainty Slides Tutorial 6 Sample solutions		
09/09/16	Adversarial search notes	RAN ch. 5, 6, 7, 8	

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External Configuration Is Important ... Configuration Space

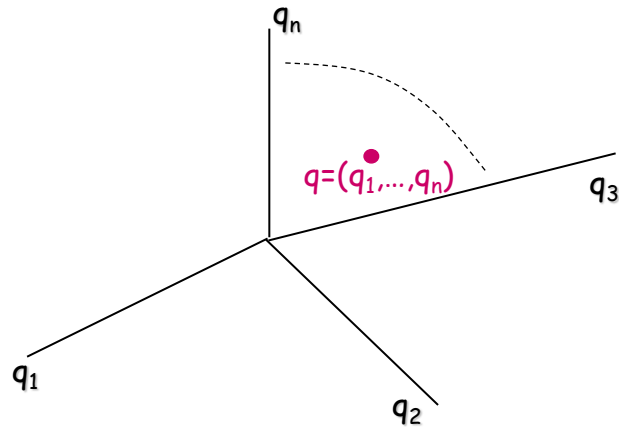


- A robot configuration is a specification of the positions of all robot points relative to a fixed coordinate system
- Usually a configuration is expressed as a “vector” of position/orientation parameters

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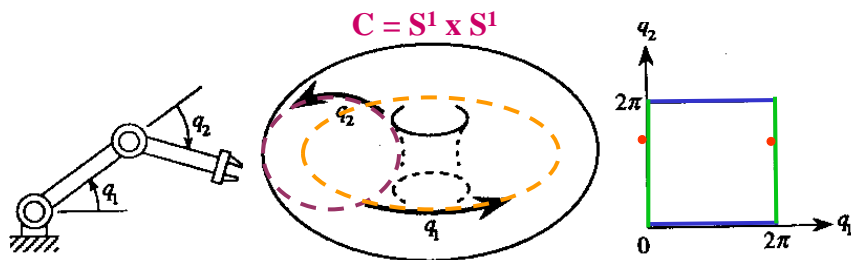
Motion Planning in C-Space



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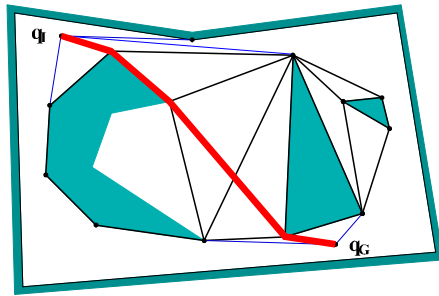
Configuration Space of a Robot

- Space of all its possible configurations
- But the topology of this space is usually not that of a Cartesian space



Slide from Latombe, CS326A

Geometric Planning Methods



- Several Geometric Methods:
 - Vertical (Trapezoidal) Cell Decomposition
 - **Roadmap Methods**
 - Cell (Triangular) Decomposition
 - Visibility Graphs
 - Veroni Graphs

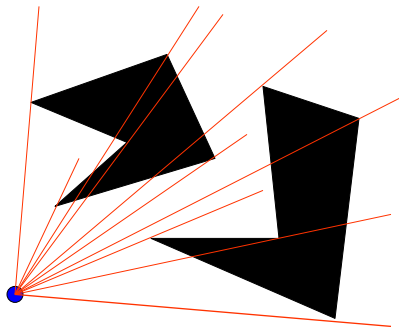
Artwork from LaValle, Ch. 6



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I. Rotational Sweep



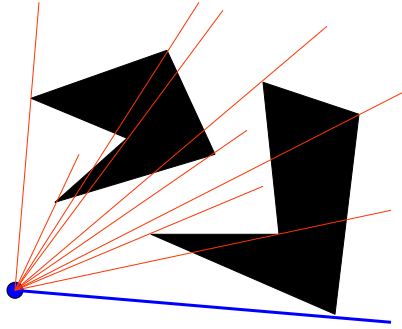
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Rotational Sweep



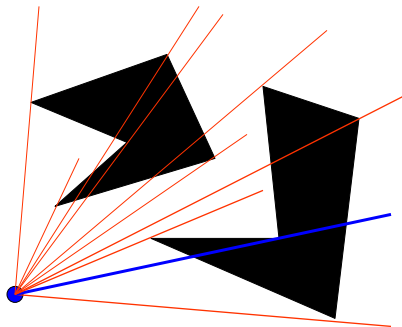
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Rotational Sweep



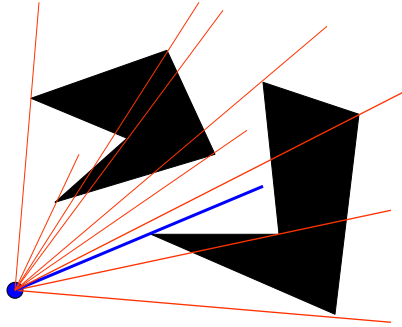
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Rotational Sweep



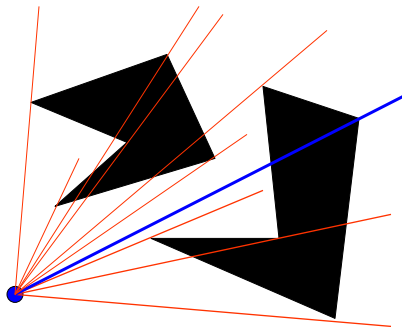
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Rotational Sweep



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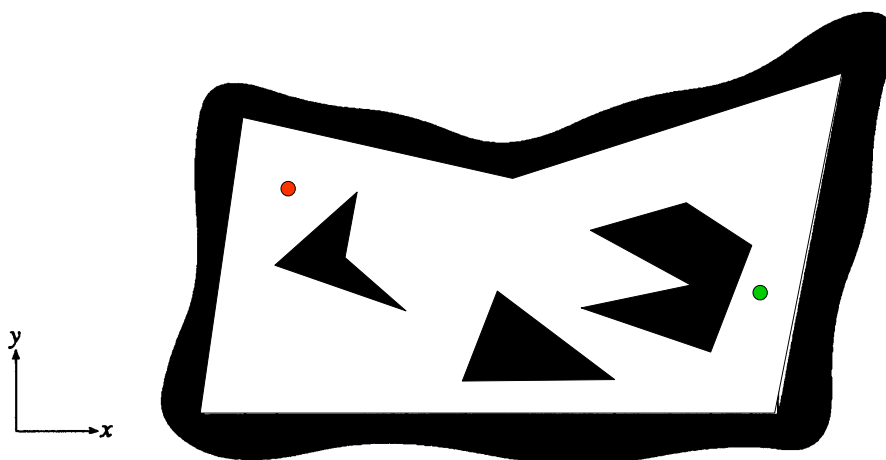
II. Cell-Decomposition Methods

Two classes of methods:

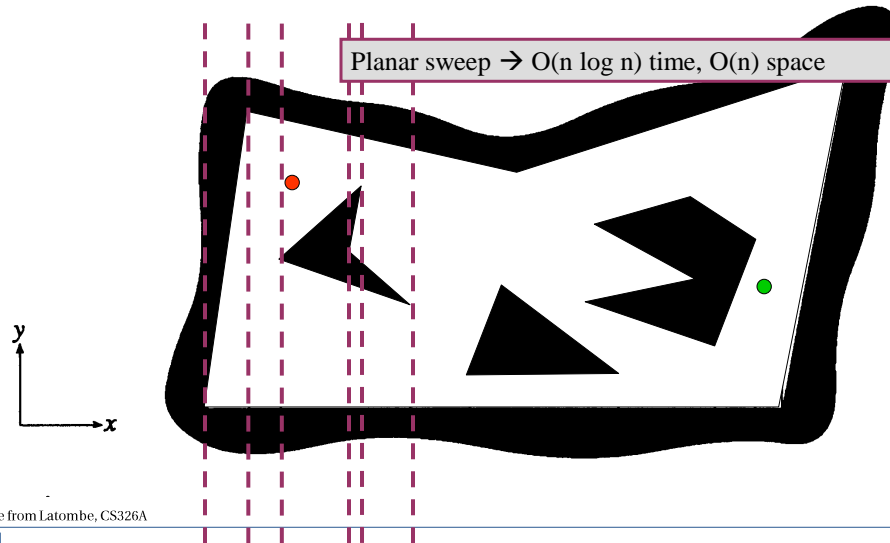
- Exact cell decomposition
 - The free space \mathbf{F} is represented by a collection of non-overlapping cells whose union is exactly \mathbf{F}
 - Example: trapezoidal decomposition
- Approximate cell decomposition
 - \mathbf{F} is represented by a collection of non-overlapping cells whose union is contained in \mathbf{F}
 - Examples: quadtree, octree, 2n-tree



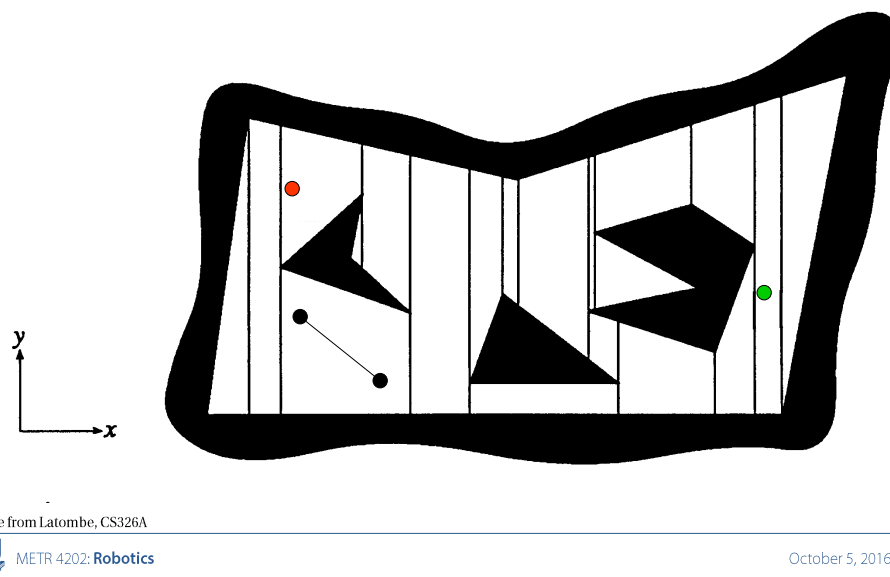
Trapezoidal decomposition



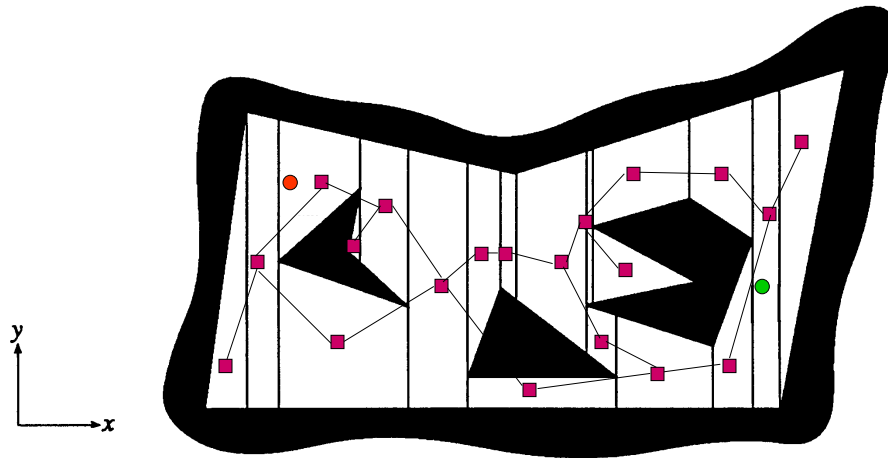
Trapezoidal decomposition



Trapezoidal decomposition

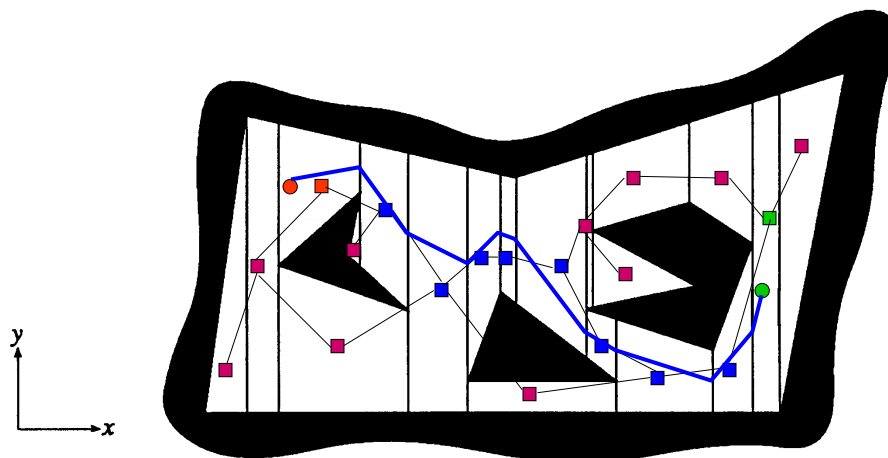


Trapezoidal decomposition



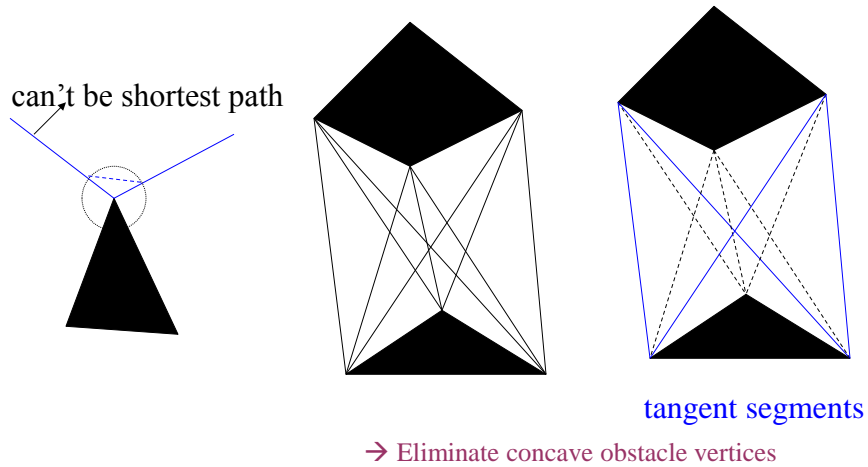
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Trapezoidal decomposition



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II. Visibility Graph



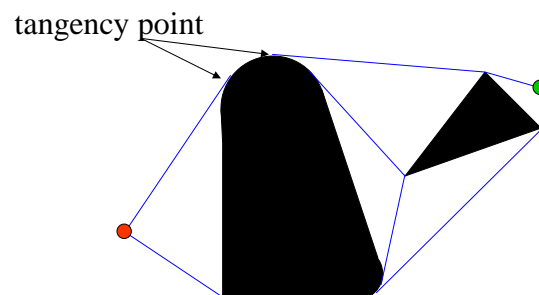
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Generalized (Reduced) -- Visibility Graph



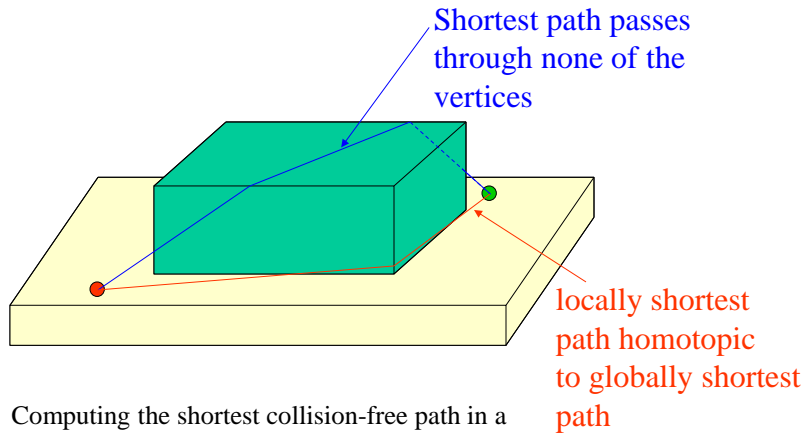
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Three-Dimensional Space

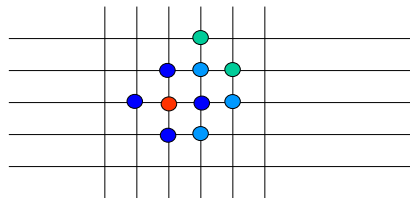


Computing the shortest collision-free path in a polyhedral space is NP-hard

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Sketch of Grid Algorithm (with best-first search)

- Place regular grid G over space
- Search G using best-first search algorithm with potential as heuristic function



Slide from Latombe, CS326A

Simple Algorithm (for Visibility Graphs)

- Install all obstacles vertices in VG, plus the start and goal positions
- For every pair of nodes u, v in VG
 - If segment(u, v) is an obstacle edge then
insert (u, v) into VG
 - else
 - for every obstacle edge e
 - if segment(u, v) intersects e
then go up to segment
 - insert (u, v) into VG
- Search VG using A*

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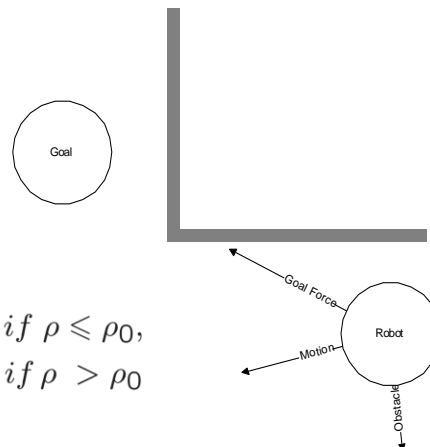
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III. Potential Field Methods

- Approach initially proposed for real-time collision avoidance [Khatib, 86]

$$F_{Goal} = -k_p(x - x_{Goal})$$

$$F_{Obstacle} = \begin{cases} \eta \left(\frac{1}{\rho} - \frac{1}{\rho_0} \right) \frac{1}{\rho^2} \frac{\partial \rho}{\partial x} & \text{if } \rho \leq \rho_0, \\ 0 & \text{if } \rho > \rho_0 \end{cases}$$



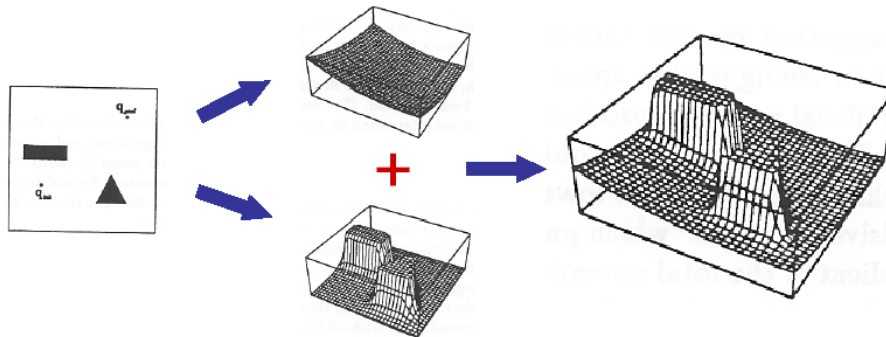
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Attractive and Repulsive fields



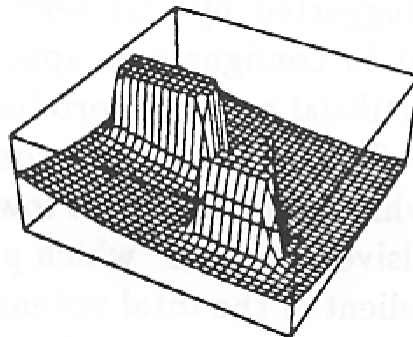
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Local-Minimum Issue



- Perform best-first search (possibility of combining with approximate cell decomposition)
- Alternate descents and random walks
- Use local-minimum-free potential (**navigation function**)

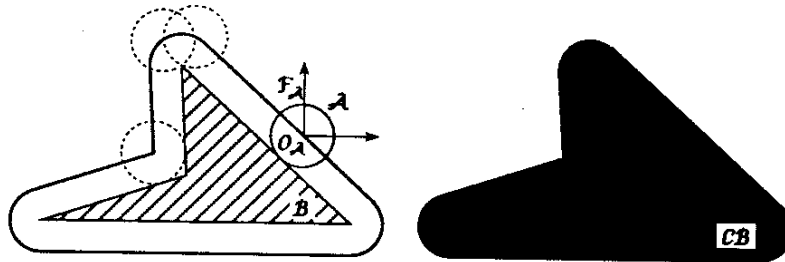
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Disc Robot in 2-D Workspace



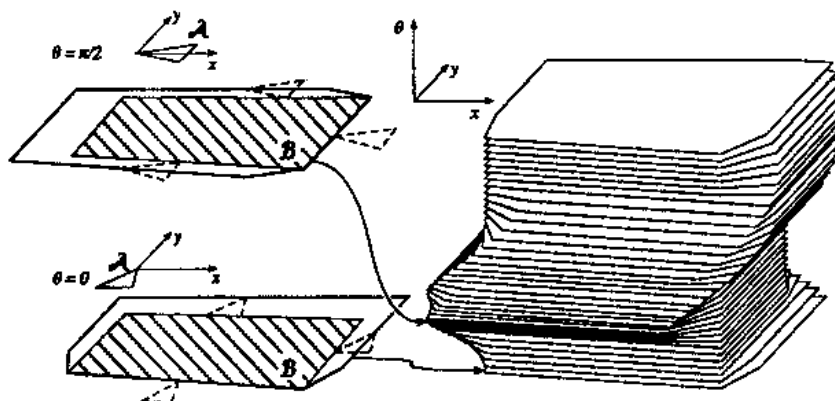
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Rigid Robot Translating and Rotating in 2-D



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IV. Roadmap Methods

- **Visibility graph**
- **Voronoi diagram**
- Silhouette
 - First complete general method that applies to spaces of any dimension and is singly exponential in # of dimensions [Canny, 87]
- **Probabilistic roadmaps (PRMs)**
and Rapidly-exploring Randomized Trees (RRTs)

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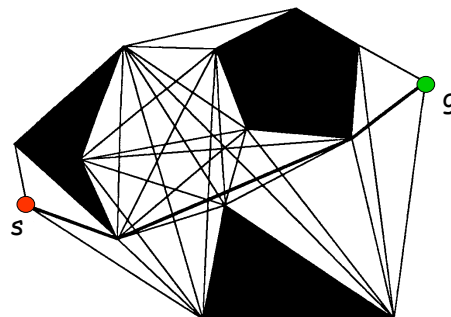


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Roadmap Methods

- **Visibility graph**
 - Introduced in the Shakey project at SRI in the late 60s.
 - Can produce shortest paths in 2-D configuration spaces



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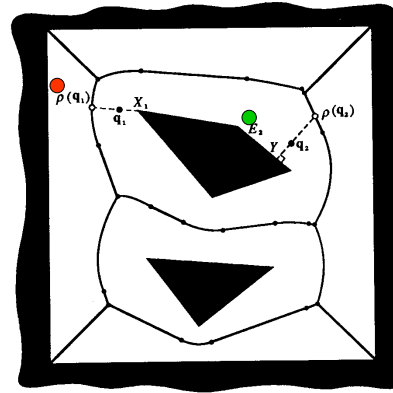
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Roadmap Methods

- Voronoi diagram
Introduced by
Computational
Geometry researchers.
Generate paths that
maximizes clearance.

$O(n \log n)$ time
 $O(n)$ space



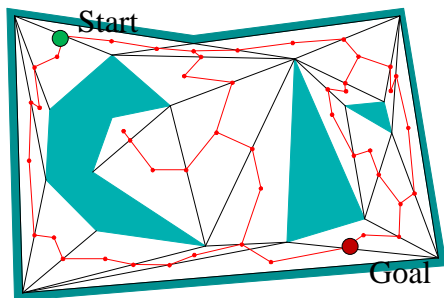
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Limits of Geometric Planning Methods



- How does this scale to high degrees of freedom?
- What about “dynamic constraints”?
- What about optimality?
- How to tie this to learning and optimization

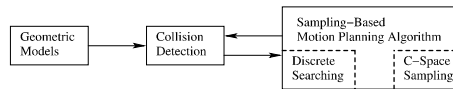
Artwork from LaValle, Ch. 6



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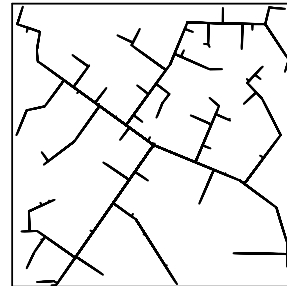
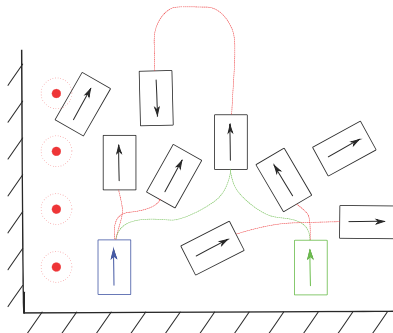
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Sample-Based Motion Planning



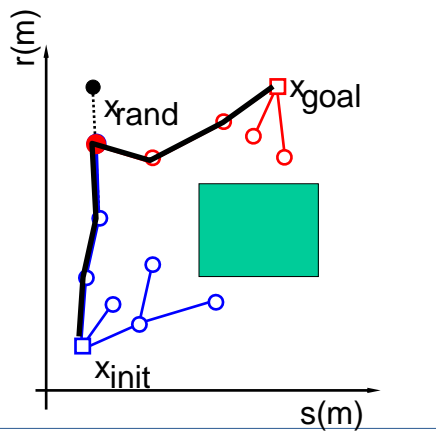
- PRMs

- RRTs

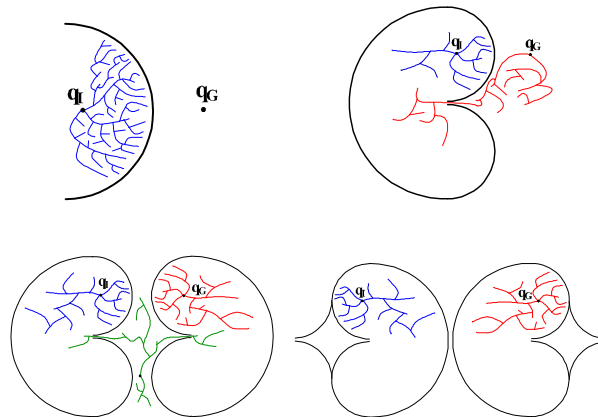


Artwork based on LaValle, Ch. 5

Rapidly Exploring Random Trees (RRT)



Sampling and the “Bug Trap” Problem



Artwork based on LaValle, Ch. 5

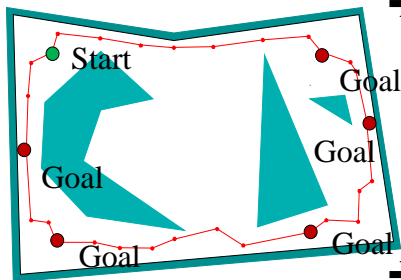


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Multiple Points & Sequencing

- Sequencing
 - Determining the “best” order to go in
- ➔ Travelling Salesman Problem



A salesman has to visit each city on a given list exactly once.

In doing this, he **starts** from his home city and in the **end he has to return to his home** city. It is plausible for him to select the order in which he visits the cities so that the **total of the distances travelled** in his tour is as small as possible.

➔ Multi-Goal Problem

A salesman has to visit each city on a given list exactly once.

In doing this, he **starts** from his home city and in the **end he has to return to his home** city. It is plausible for him to select the order in which he visits the cities so that the **total of the distances travelled** in his tour is as small as possible.

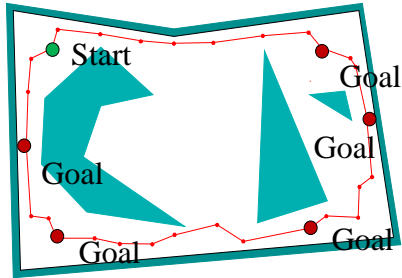
Artwork based on LaValle, Ch. 6



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Travelling Salesman Problem

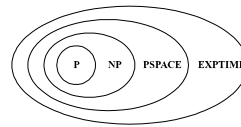


- Given a $n \times n$ distance matrix $\mathbf{C}=(c_{ij})$

- Minimize:

$$c(\pi) = \sum_{i=1}^n c_{i\pi(i)}$$

- Note that this problem is NP-Hard



→ BUT, Special Cases are Well-Solvable!

Artwork based on LaValle, Ch. 6

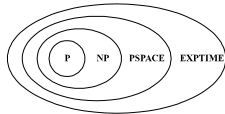


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Travelling Salesman Problem [2]

- This problem is NP-Hard



→ BUT,
Special Cases are
Well-Solvable!

For the Euclidean case

(where the points are on the 2D Euclidean plane) :

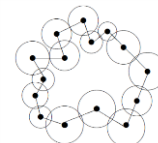
- The shortest TSP tour does not intersect itself, and thus geometry makes the problem somewhat easier.
- If all cities lie on the boundary of a convex polygon, the optimal tour is a cyclic walk along the boundary of the polygon (in clockwise or counterclockwise direction).

The k -line TSP

- The a special case where the cities lie on k parallel (or almost parallel) lines in the Euclidean plane.
- EG: Fabrication of printed circuit boards
- Solvable in $O(n^3)$ time by Dynamic Programming (Rote's algorithm)

The necklace TSP

- The special Euclidean TSP case where there exist n circles around the n cities such that every cycle intersects exactly two adjacent circles



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Cool Robotics Share

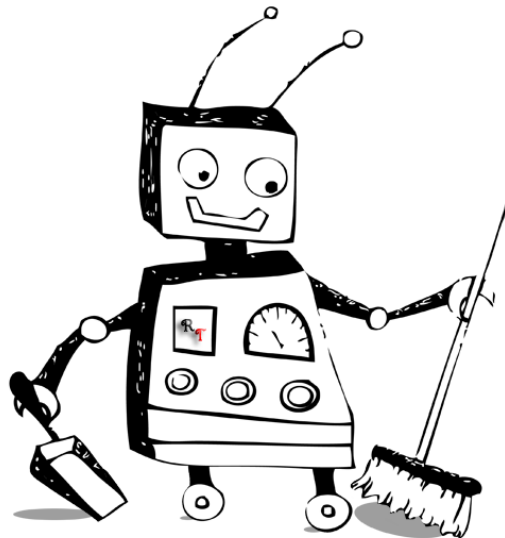
Universal Gripper

U. Chicago, Cornell, iRobot
May 2010



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