# PATH AND MOTION PLANNING (FOR MOBILE ROBOTS)

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## My robotics research

# Gentler robots, ready to work with people

- Robots that sense, plan, and act in real and/or virtual worlds
- Algorithms and systems for representing, capturing, planning, controlling, and rendering motions
  - Motion planning in dynamic environments
  - Human-robot interaction







# Topics

- Applications and basic examples
  - Robotino
  - Segway RMP
- Motion planning context deliberative/reactive robots
- The path and motion planning problem
- Robotino revisited
  - Obstacle avoidance
  - Path planning
- Planning methods overview
- Rapidly-exploring Random Trees (RRT)



# Applications

- Robot-assisted surgery
- Automated assembly plans
- Manufacturing
- Mobile robots
- Computational biology
- Digital actors
- Moving pianos around...





# Examples

Robotino



Segway





## Robotino – an experiment in human robot interaction



(a) Neutral

(b) Happy



(c) Sad



(d) Surprised



(e)

Question mark





# The SantaBot Experiment A Pilot Study of Human-Robot Interaction

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# Segway RPM







# Motion and path planning context

- Both robots have motion control (actuation of wheels)
- Both robots perceives the environment (via sensors)
- Both have localization:
  - Segway has a world model (global map)
  - Robotino is local (human centered)
- Both control orientation AND position (configuration)
- Motion and path planning is very different in the two cases



## Problems

- How do we structure the software/hardware?
- How do we compute motion strategies?
- That help us achieve high-level goals such as
  - go to target without colliding with obstacles
  - build map of the environment



	DELIBERATIVE	REACTIVE	
	/ Symbolic	Reflexive	
	SPEED OF F	RESPONSE	
	PREDICTIVE C	APABILITIES	
	DEPENDENCE ON ACCURATE, COMPLETE WORLD MODELS		
Rep Slov	resentarion-dependet ver response	Representarion-free Real response	
Vari	able latency	Simple computation	

Arkin, 1998 Behaviour Based Robotics



#### Planning based vs. behaviour based decomposition



The traditional decomposition for an intelligent robot control system

The behaviour based decomposition approach

R. A Brooks 1986



#### Example – Robotino – reactive



# Basic problem – path and motion planning

- Compute a collision-free path from A (initial) to B (goal)
- Inputs:
  - Knowledge of robot and obstacles
  - Initial and goal robot configurations (position and orientation)
- Outputs:
  - Sequence of robot configurations connecting the initial and goal configurations





The world consists of ...

- Obstacles
  - Already occupied spaces of the world
  - In other words, robots cannot go there
- Free Space
  - Unoccupied space within the world
  - Robots "might" be able to go here
  - To determine where a robot can go, we need to discuss what a Configuration Space is





#### Litterature

- Good overviews over planning algorithms can be found in the books
  - LaValle, S. (2006). Planning algorithms. Cambridge Univ Press
  - Thrun, S., Burgard, W., and Fox, D. (2005). Probabilistic Robotics (Intelligent Robotics and Autonomous Agents). MIT Press
  - Choset, H., Lynch, K. M., Hutchinson, S., Kantor, G. A., Burgard, W., Kavraki, L. E., and Thrun, S. (2005). Principles of Robot Motion: Theory, Algorithms, and Implementations. MIT Press
  - Siciliano, B. and Khatib, O. (2008). Handbook of Robotics. Springer-Verlag
  - J.C. Latombe, Robot Motion Planning, Kluwer Academic Publishers, 1991.



# Goal of path and motion planning

- Compute motion strategies:
  - geometric paths
  - time-parameterized trajectories
  - sequence of sensor-based motion commands
- To achieve high-level goals:
  - go to B without colliding with obstacles
  - assemble product P
  - build map of environment E
  - find object O



#### Extensions of the basic problem

- More complex problems
  - Multiple robots
  - Higher dimensions
  - Obstacles and goals that move
  - Dynamic constraints (how sharp we can turn)
  - Physical models and deformable objects
  - Uncertainty in control of the robot



# Example - Robotino



Based on: Simon Kracht and Carsten Nielsen (2007) See report on http://www.control.aau.dk/~tb/wiki/





Adaptive Monte Carlo Localization (AMCL), [Thrun et al., 2005].



#### Obstacle avoidance



Vector Field Histogram+ (VFH+) algorithm













(c)

(d)

#### Alternative simple approach – the "bug" algorithm



(a)

- Known direction to goal
- Only local sensing (walls/obstacle encoders)
- "a reasonable world":
  - Finite obstacles in any finite range
  - A line will intersect an obstacle finite times



#### Alternative simple approach – the "bug" algorithm



(a)

- Head towards goal
- Follow obstacle until you can head towards goal again
- Continue







## **Planning methods**

- Optimisation based approaches
- Grid based algorithms (WAVEFRONT\*)
- Graph based algorithms (Visibility graph, Voronoi diagramme)
- Sampling based algorithms
  - Rapidly-exploring Random Trees (RRT)

Converts the problem into a graph search. Dijkstra's algorithm O(N^2). N number of vertices in C-space

- Planning algorithms are often combined with local obstacle avoidance
  - Potential field methods
  - Vector Field Histogram (VFH\*)
  - Nearness Diagram (ND)
  - Dynamic Window Approach (DWA)
  - Velocity Obstacles (VO).



# The Visibility Graph in Action (Part 1) First, draw lines of sight from the start and goal to all "visible" vertices and corners of the world. goal start





AALBORG UNIVERSITY DENMARK The Visibility Graph in Action (Part 3)





The Visibility Graph in Action (Part 4)





# The Visibility Graph (Done)



Since the map was in C-space, each line potentially represents part of a path from the start to the goal.



#### Roadmap: Voronoi diagrams



"official" Voronoi diagram

(line segments make up the **Voronoi diagram** isolates a set of points)

**Property:** maximizing the clearance between the points and obstacles.



**Generalized Voronoi Graph (GVG):** locus of points equidistant from the closest two or more obstacle boundaries, including the workspace boundary.



#### Roadmap: Voronoi diagrams

- GVG is formed by paths equidistant from the two closest objects
- maximizing the clearance between the obstacles.
- This generates a very safe roadmap





#### Voronoi Diagram: Metrics

- Many ways to measure distance; two are:
  - L1 metric
    - (x,y) : |x| + |y| = const
  - L2 metric



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# Voronoi Diagram (L1)



# Voronoi Diagram (L2)



# Rapidly-exploring Random Trees (RRT)

- Exploits the increasing computational power to test a lot of possible trajectories or configurations, instead of searching for the one optimal solution
- Not optimal, but probabilistic complete the probability of finding a solution, (if one exists) goes to 1 as the number of samples goes towards infinity.
- A survey over sampling based motion planning and current issues can be found in [Lindemann and LaValle, 2005].
- RRT originally described in [LaValle and Kuffner Jr, 2001].

Mikael Svenstrup (2011), Mobile Robots in Human Environments; towards safe, comfortable and natural navigation









## Trajectory Planning in Dynamic Human Environments





# Thank you - http://www.control.aau.dk/~tb/wiki/

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