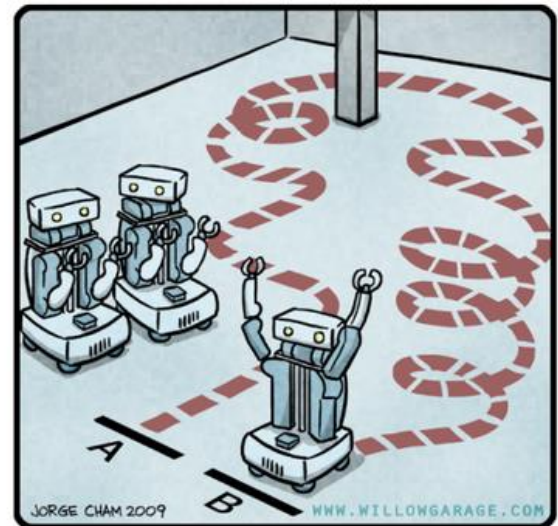


## Robot Motion Control

Matteo Matteucci – [matteo.matteucci@polimi.it](mailto:matteo.matteucci@polimi.it)



"HIS PATH-PLANNING MAY BE SUB-OPTIMAL, BUT IT'S GOT FLAIR."



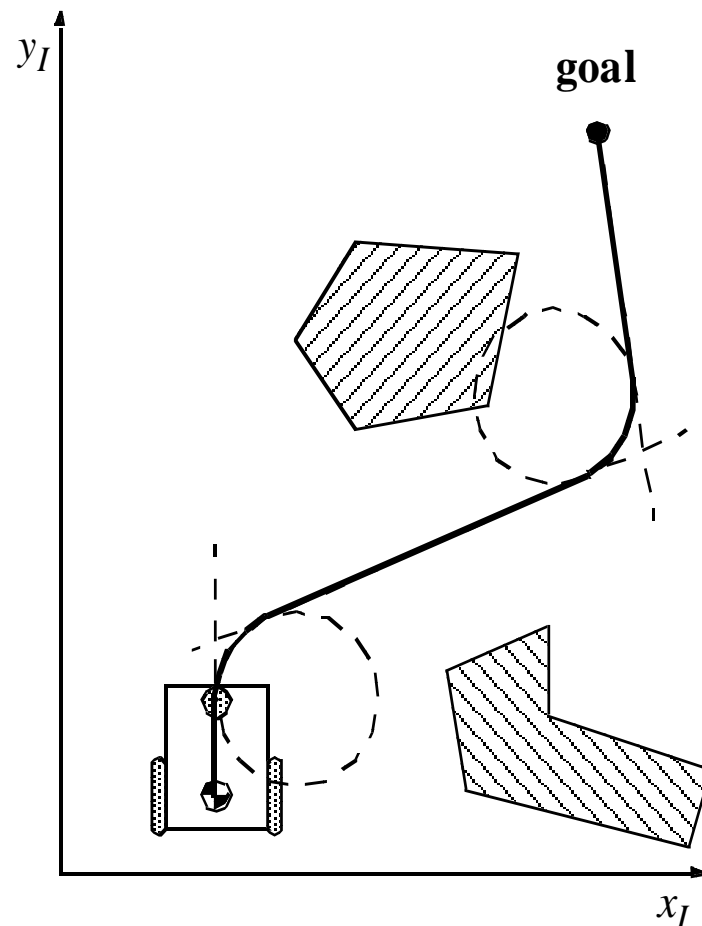
## Open loop control

A mobile robot is meant to move from one place to another

- Pre-compute a smooth trajectory based on motion segments (e.g., line and circle segments) from start to goal
- Execute the planned trajectory along the way till the goal

Disadvantages:

- Not an easy task to pre-compute a feasible trajectory
- Limitations and constraints of the robots velocities and accelerations
- Does not handle dynamical changes in the environment
- Resulting trajectories are usually not smooth



# Feedback control (diff drive example)

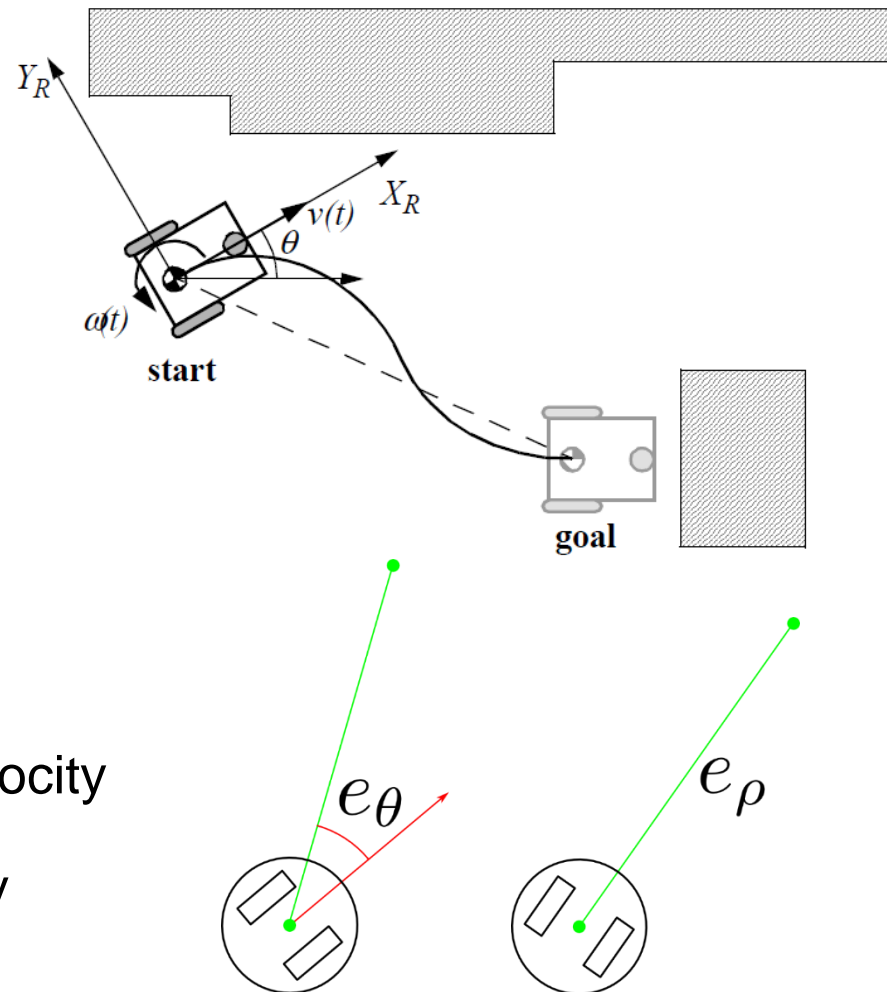
With feedback control the trajectory is recomputed and adapted online

We can design a simple control schema for path following:

- First we close a speed control loop on the wheels
- Then divide the problem in:
  - Control of the orientation
  - Control of the distance

Control orientation acting on angular velocity

Control distance acting on linear velocity



## Feedback control (diff drive example)

With feedback control the trajectory is recomputed and adapted online

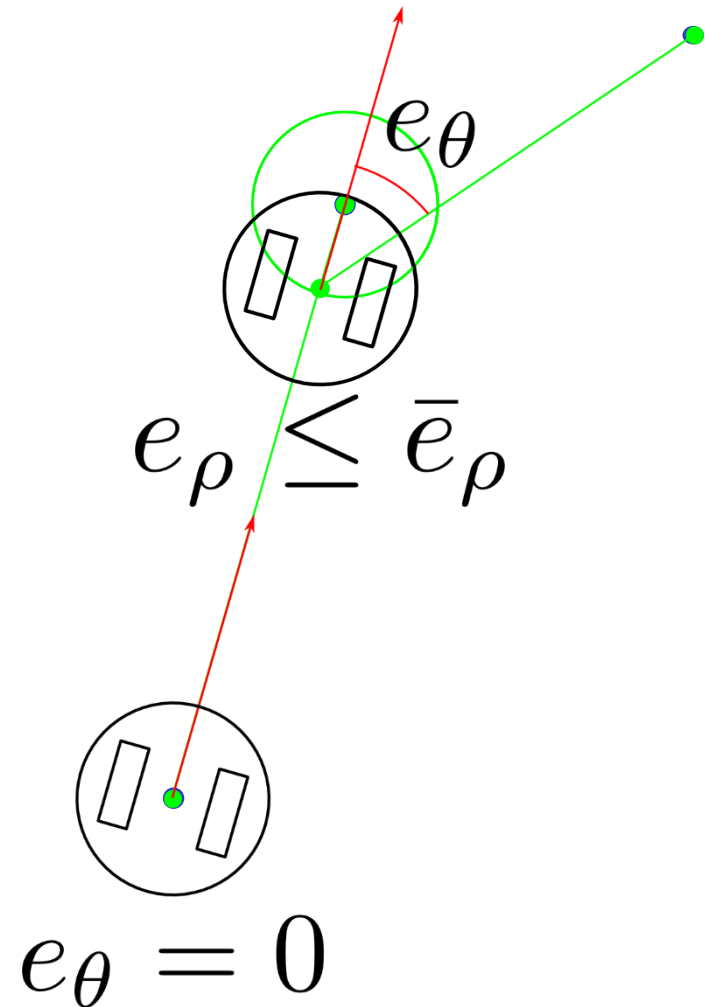
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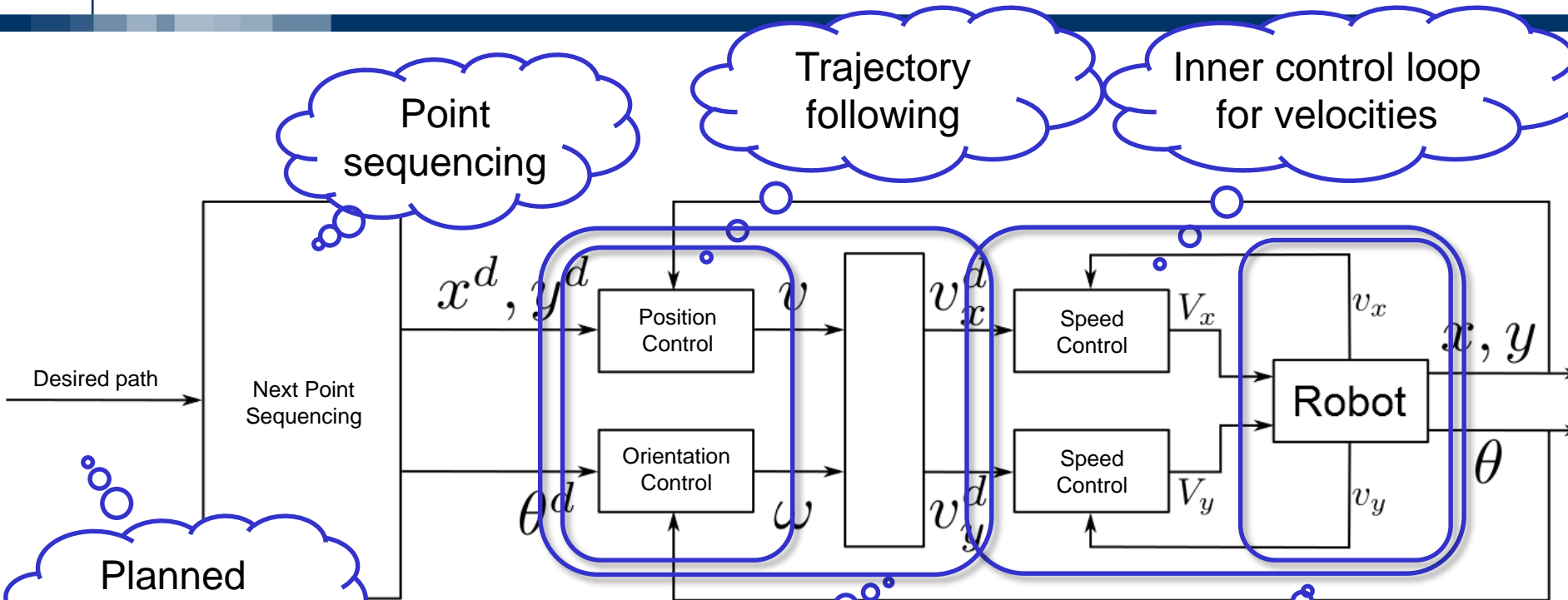
Control distance acting on linear velocity

A simple logic handles the next point





# Feedback control (diff drive example)



Point sequencing

Trajectory following

Inner control loop for velocities

Planned Trajectory

Inverse kinematics

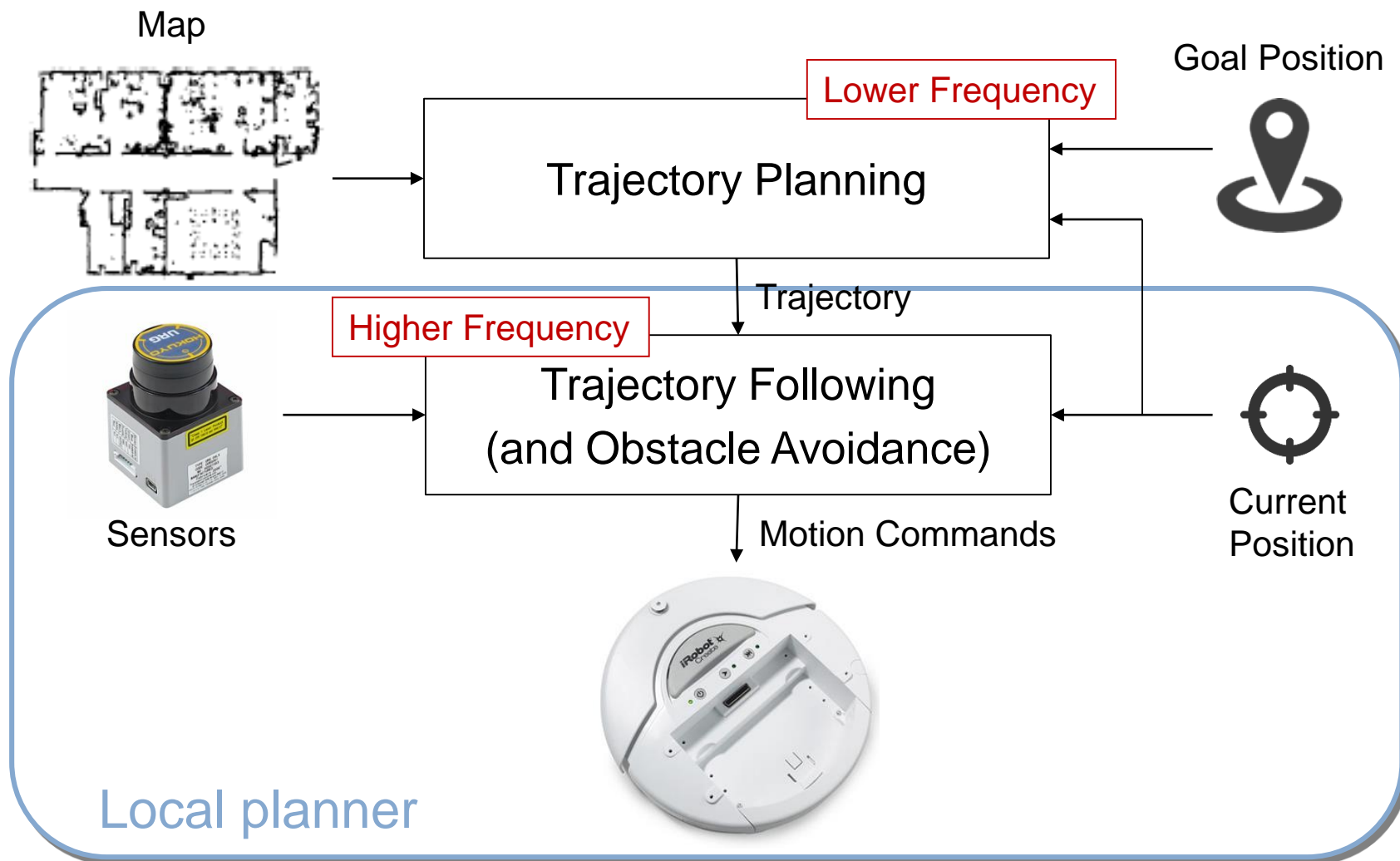
Direct kinematics (Odometry)



What about obstacles?  
 Who does provide the trajectory?  
 Do you trust direct kinematics?



# A Two Layered Approach





## Obstacle Avoidance (Local Path Planning)

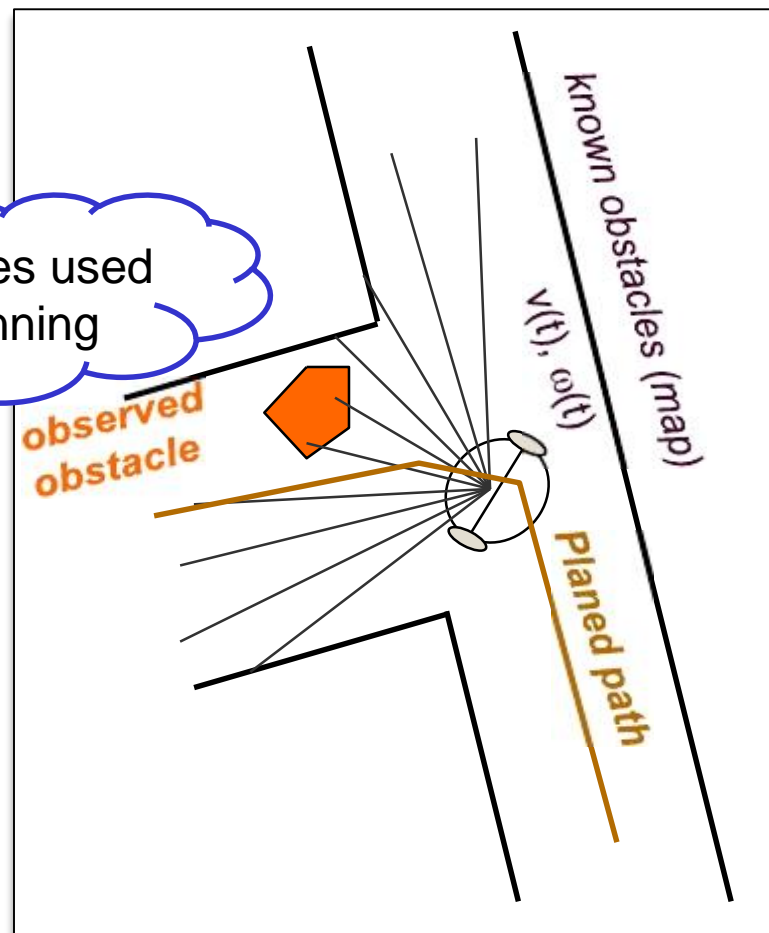
Obstacle avoidance should:

- Follow the planned path
- Avoid unexpected obstacle, i.e., those that were not in the map

Several proposed methods in the literature:

- Potential field methods [Borenstein, 1989]
- Vector field histogram [Borenstein, 1991, 1998, 2000]
- Nearness diagram [Minguez & Montano, 2000]
- Curvature-Velocity [Simmons, 1996]
- Dynamic Window Approach [Fox, Burgard, Thrun, 1997]
- ...

Sometimes used for planning





## The Simplest One ...

“Bugs” have little if any knowledge ...

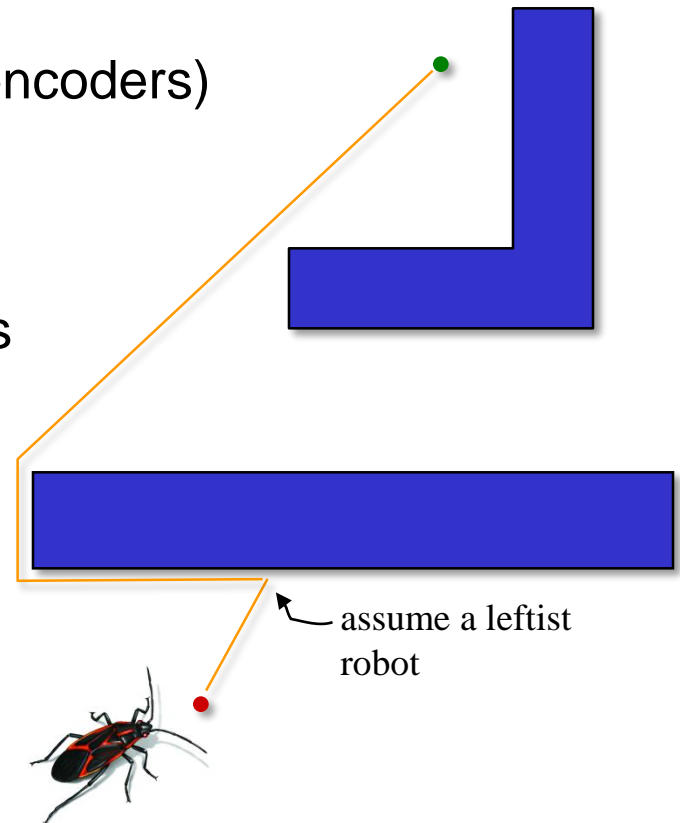
- known direction to the goal
- only local sensing (walls/obstacles + encoders)

... and their world is reasonable!

- finite obstacles in any finite range
- a line intersects an obstacle finite times

Switch between two basic behaviors

1. head toward goal
2. follow obstacles until you can head toward the goal again



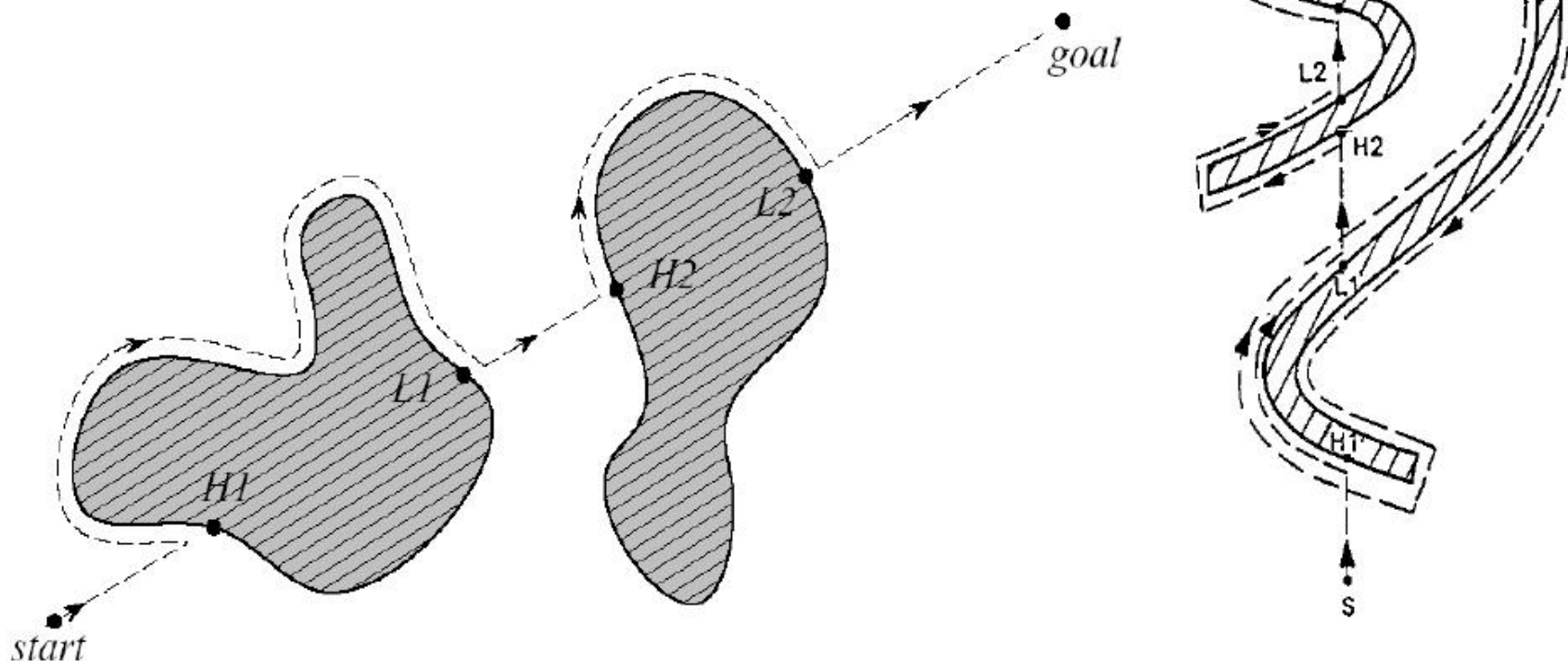




## Bugs and Features ...

Each obstacle is fully circled before it is left at the point closest to the goals

- Advantages
  - No global map required
  - Completeness guaranteed
- Disadvantages
  - Solution are often highly suboptimal





# Vector Field Histograms (VHF) [Borenstein et al. 1991]

Use a local map of the environment and evaluate the angle to drive towards

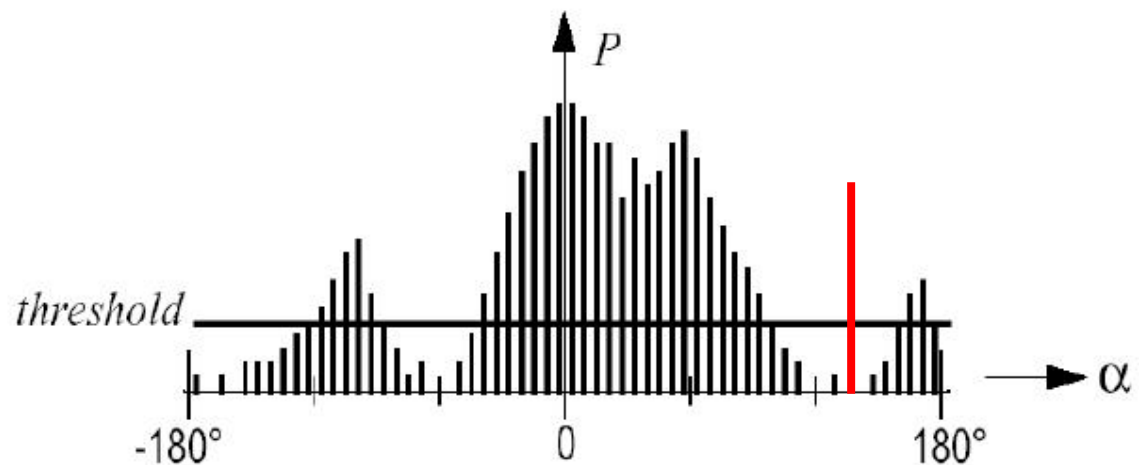
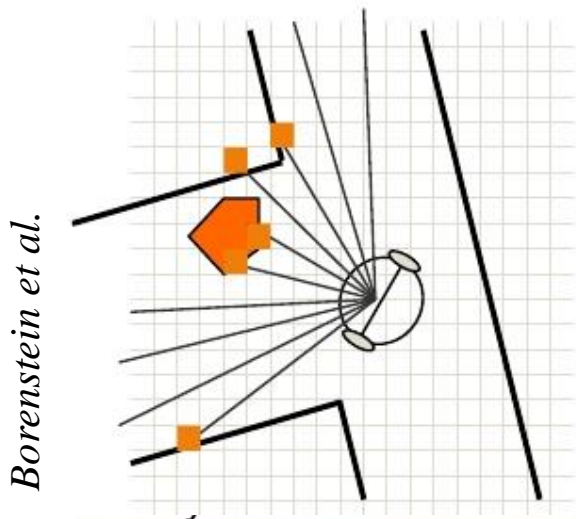
- Environment represented in a grid (2 DOF) with
- The steering direction is computed in two steps:
  - all openings for the robot to pass are found
  - the one with lowest cost function  $G$  is selected

$$G = a \cdot \text{target\_direction} + b \cdot \text{wheel\_orientation} + c \cdot \text{previous\_direction}$$

target\_direction = alignment of the robot path with the goal

wheel\_orientation = difference between the new direction and the current wheel orientation

previous\_direction = difference between the previously selected direction and the new direction

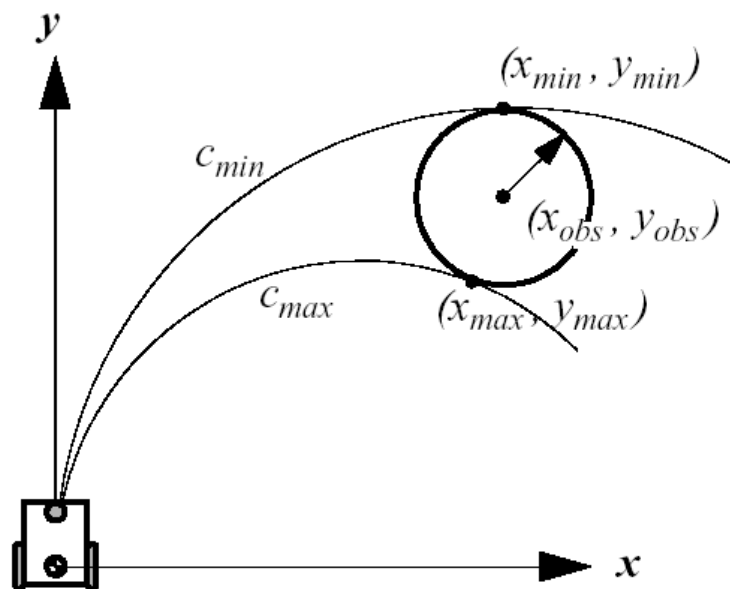
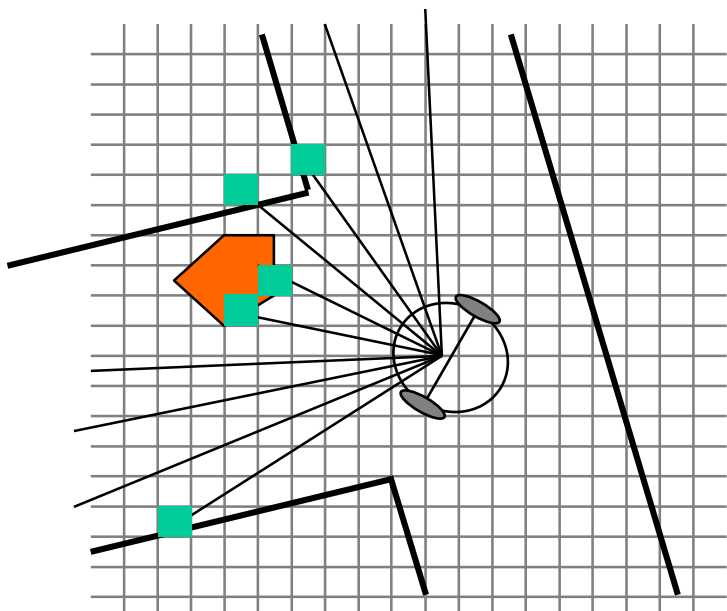




## Curvature Velocity Methods (CVM) [Simmons et al. 1996]

CVMs add physical constraints from the robot and the environment on  $(v, w)$

- Assumption that robot is traveling on arcs ( $c = w / v$ ) with acceleration constraints
- Obstacles are transformed in velocity space
- An objective function to select the optimal speed



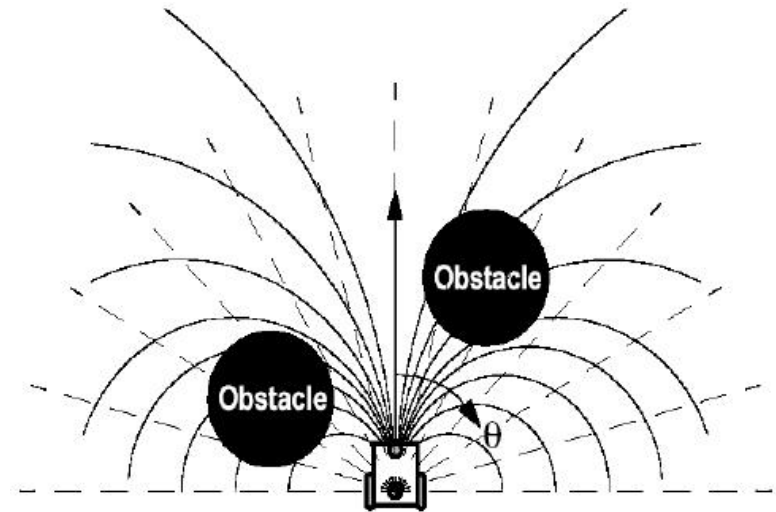
*Simmons et al.*



## Vector Field Histogram+ (VFH+) [Borenstein et al. 1998]

VFH+ accounts also in a very simplified way for vehicle kinematics

- robot moving on arcs or straight lines
- obstacles blocking a given direction also blocks all the trajectories (arcs) going through this direction like in an Ackerman vehicle
- obstacles are enlarged so that all kinematically blocked trajectories are properly taken into account



*Borenstein et al.*

However VFH+ as VHF suffers

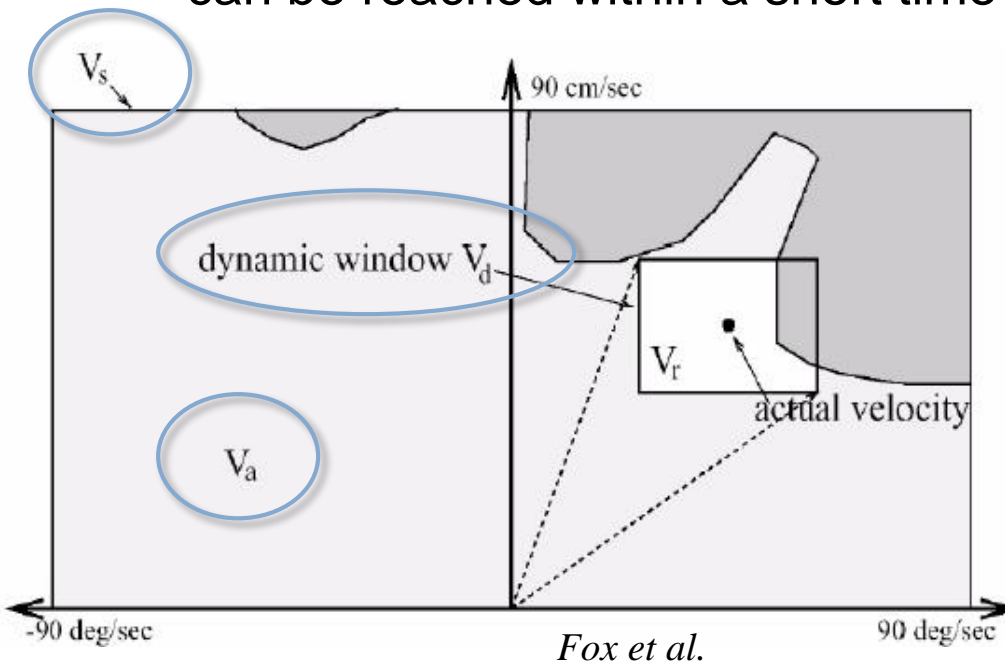
- Limitation if narrow areas (e.g. doors) have to be passed
- Local minima might not be avoided
- Reaching of the goal can not be guaranteed
- Dynamics of the robot not really considered



## Dynamic Window Approach (DWA) [Fox et al. 1997]

The kinematics of the robot are considered via local search in velocity space:

- Consider only circular trajectories determined by pairs  $V_s=(v,\omega)$  of translational and rotational speeds
- A pair  $V_a=(v, \omega)$  is considered admissible, if the robot is able to stop before it reaches the closest obstacle on the corresponding curvature.
- A dynamic window restricts the reachable velocities  $V_d$  to those that can be reached within a short time given limited robot accelerations



$$V_d = \begin{cases} v \in [v - a_{tr} \cdot t, v + a_{tr} \cdot t] \\ \omega \in [\omega - a_{rot} \cdot t, \omega + a_{rot} \cdot t] \end{cases}$$

DWA Search Space

$$V_r = V_s \cap V_a \cap V_d$$



## How to choose $(v, \omega)$ ?

Steering commands are chosen maximizing a heuristic navigation function:

- Minimize the travel time by “driving fast in the right direction”
- Planning restricted to  $V_r$  space [Fox, Burgard, Thrun '97]

$$G(v, \omega) = \sigma(\alpha \cdot \text{heading}(v, \omega) + \beta \cdot \text{dist}(v, \omega) + \gamma \cdot \text{velocity}(v, \omega))$$

Alignment with target direction

Distance to closest obstacle intersecting with curvature

Forward velocity of the robot

- Global approach [Brock & Khatib 99] in  $\langle x, y \rangle$ -space uses

Forward robot velocity

Follows global path

$$NF = \alpha \cdot vel + \beta \cdot nf + \gamma \Delta nf + \delta goal$$

Cost to reach the goal

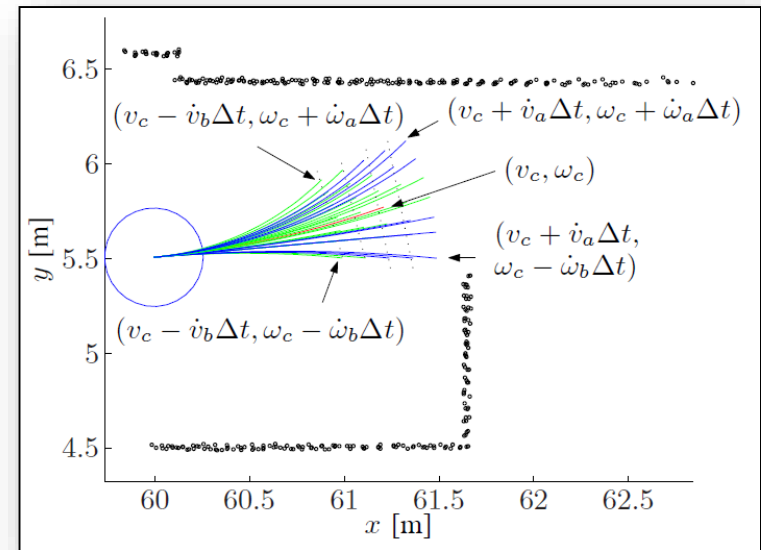
Goal nearness



# DWA Algorithm (as implemented in ROS movebase)

The basic idea of the Dynamic Window Approach (DWA) algorithm follows ...

1. Discretely sample robot control space
2. For each sampled velocity, perform forward simulation from current state to predict what would happen if applied for some (short) time.
3. Evaluate (score) each trajectory resulting from the forward simulation
4. Discard illegal trajectories, i.e., those that collide with obstacles, and pick the highest-scoring trajectory



What about non circular kinematics?

$$\text{Clothoid: } S(x) = \int_0^x \sin(t^2) dt, \quad C(x) = \int_0^x \cos(t^2) dt.$$





# A Two Layered Approach

