

# Mobility Assistance and Human Aware Navigation



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# Motivation and Problem

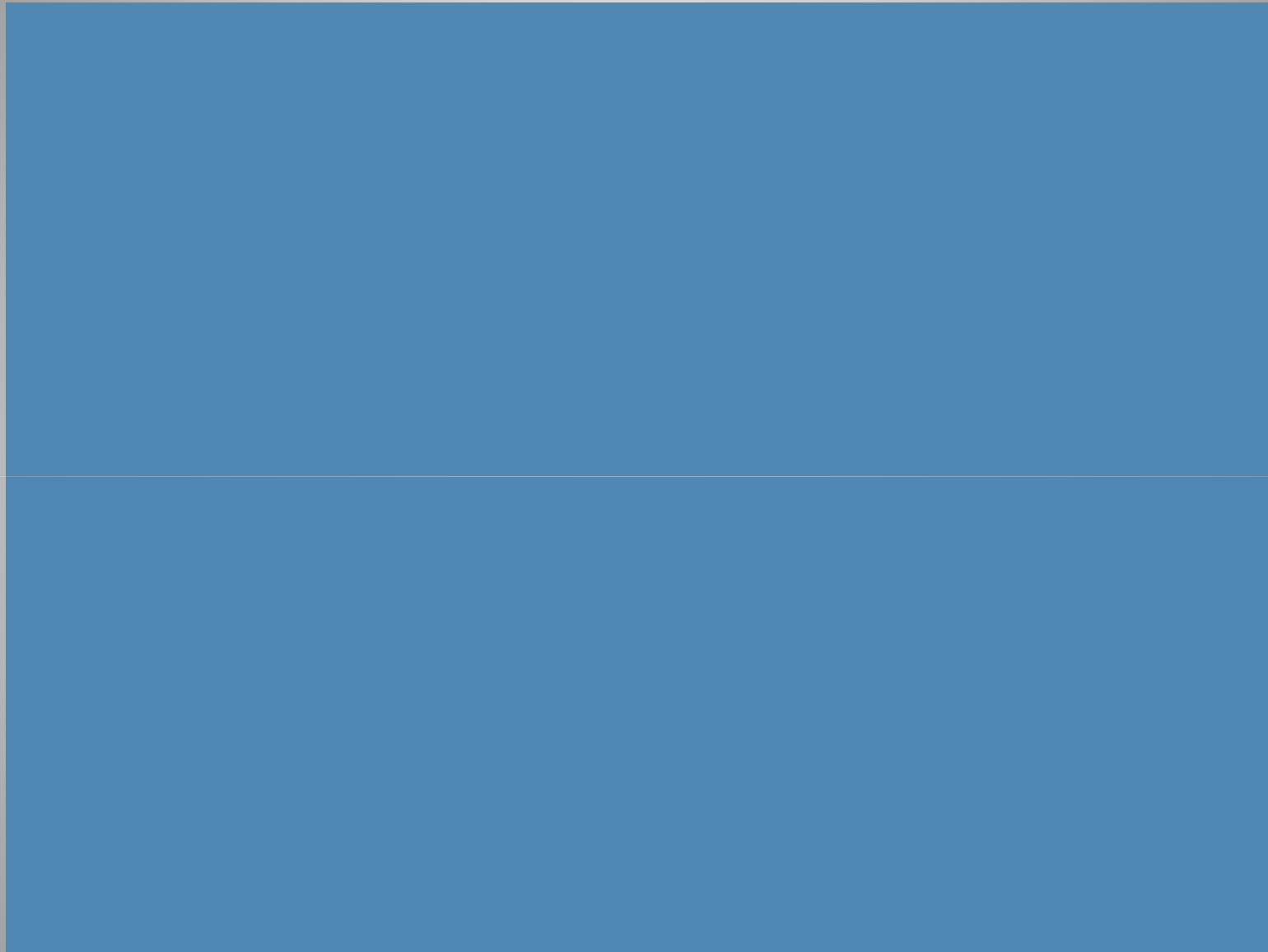
- Transport for people with reduced mobility using a **robotic transportation system** adapted to **dynamic and human** populated environments
- Navigation must take into account :
  - Partial and uncertain knowledge of the environment ;
  - Prediction of agents' behavior ;
  - Comfort and safety ;
  - Social conventions.



# Social Robotics

- How humans and robots can better **live, work and interact** together
- Main issues:
  - Human **perception**
  - Human **behavior modeling**
  - **Task and action planning in the presence of humans**
  - **Design of socially acceptable human-robot interfaces**
- Methods from robotics may be combined with models from **social psychology and cognitive sciences**

# Classical vs Human-aware navigation



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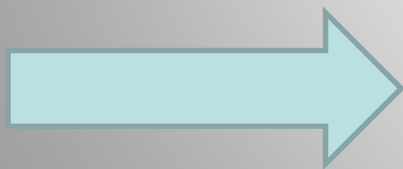


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## Path planning in the presence of humans

- Planning in dynamic environments
  - Partially known environments, uncertainty
  - Need of prediction
- Planning in human populated environments
  - Safety
  - Proxemics
  - Sociality



**Use prediction to anticipate**  
**Use proxemics to do not disturb**

# Outline

- Environment modelling
  - Proxemics: social models and robotic models
  - Prediction of obstacle behaviors
- Human aware navigation
  - Combining social conventions, prediction and planning
  - Leader following.

# 1. Robots must respect social zones

Proxemics: Social and Robotic models

## Proxemics: human management of space

- Concepts taken from the area of social sciences
- Consider the psychological comfort
- Resulting from factors like
  - Distance
  - Orientation
  - Focus of attention



# Proxemics: human management of space

## Personal Space



[Hall, 1966] [Hayduk, 1981]

## Information process Space



[Kitazawa and Fujiyama, 2010]

## Activity Space



[Lindner, 2011]

## Interaction Space



[Kendon, 2010]

## Affordance Space



# Human management of space

## - Personal Space [3]

Zone around the human body that people feel is “their space”. In that zone others cannot intrude without arousing discomfort.

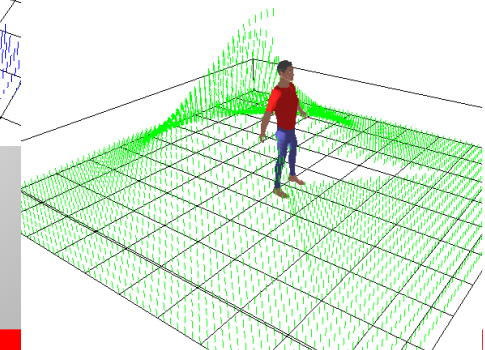
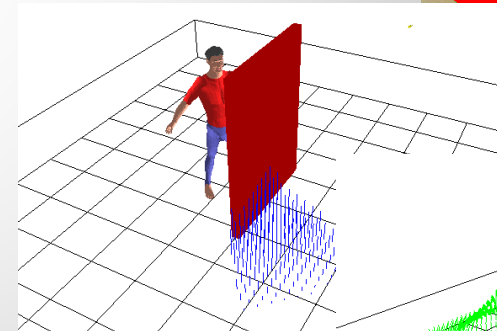
## - O-Space

Group of people  
which is  
to it,  
it.

## - Visibility and hidden zone spaces

Zones around a person that he/she can not see

Entering into these spaces causes discomfort to people

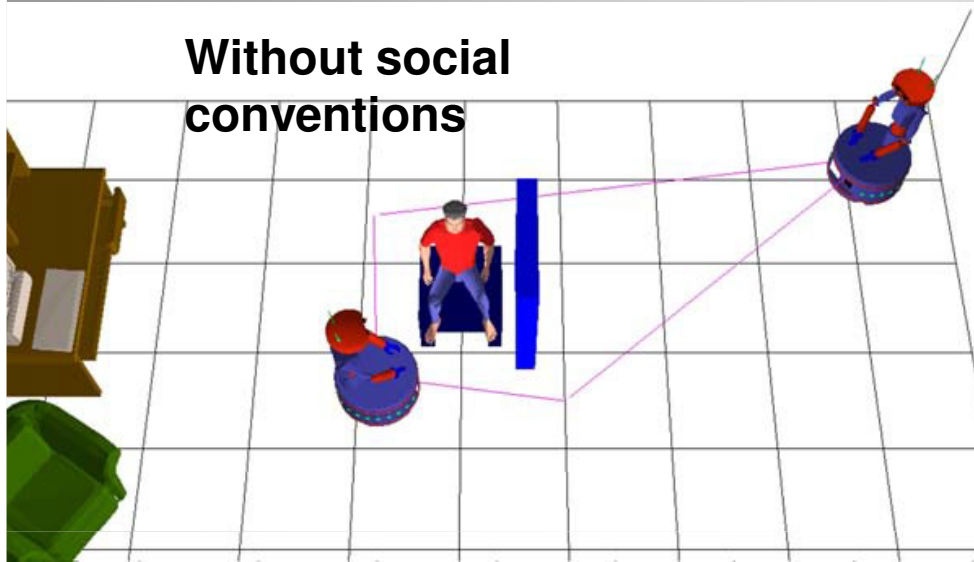


[3] Hayduk, L. A. (1978). Personal space: An evaluative and orienting overview. Psychological Bulletin .

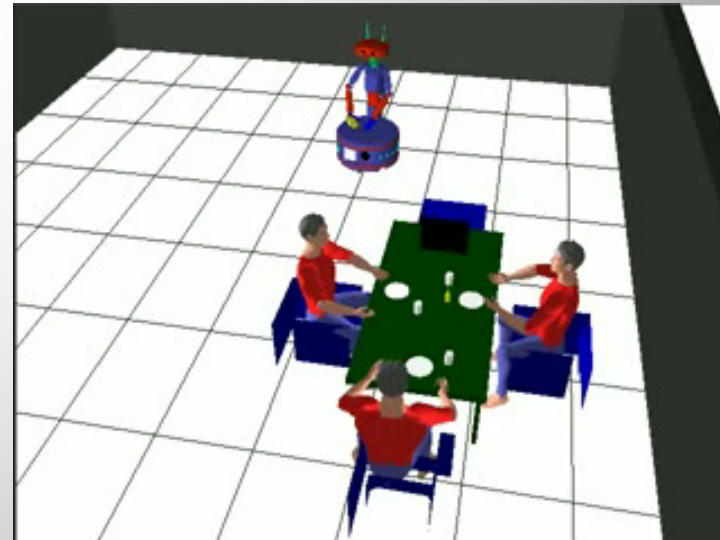
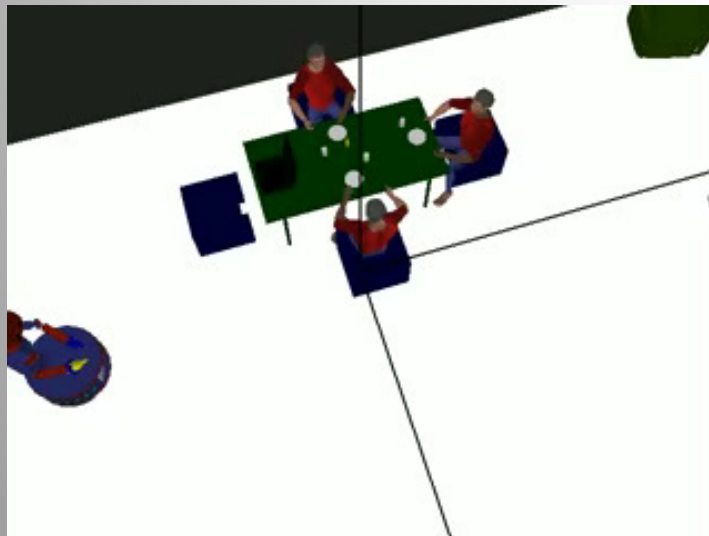
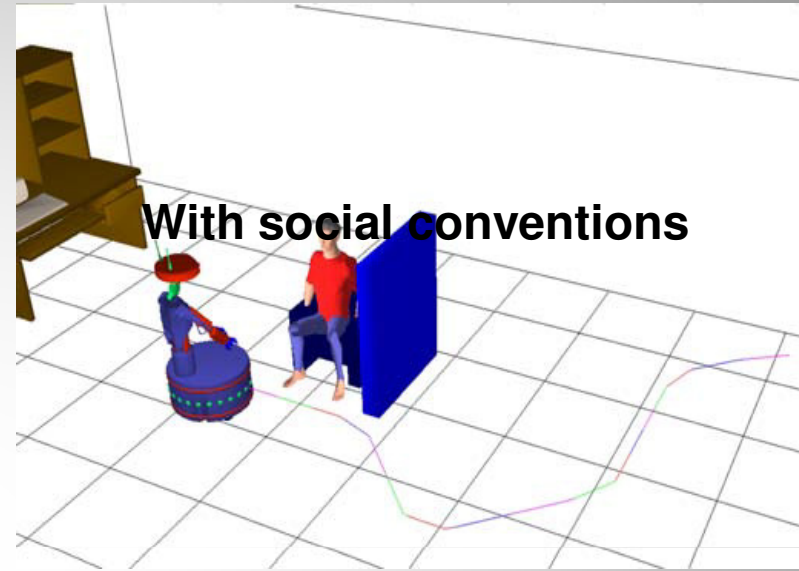
[4] Kendon, A. (2010). Spacing and orientation in co-present interaction. In Development of Multimodal Interfaces: Active Listening and Synchrony, volume 5967 of Lecture Notes in Computer Science .

# Human-aware navigation: respecting visibility [not INRIA but LAAS - Sisbot 2008]

Without social conventions

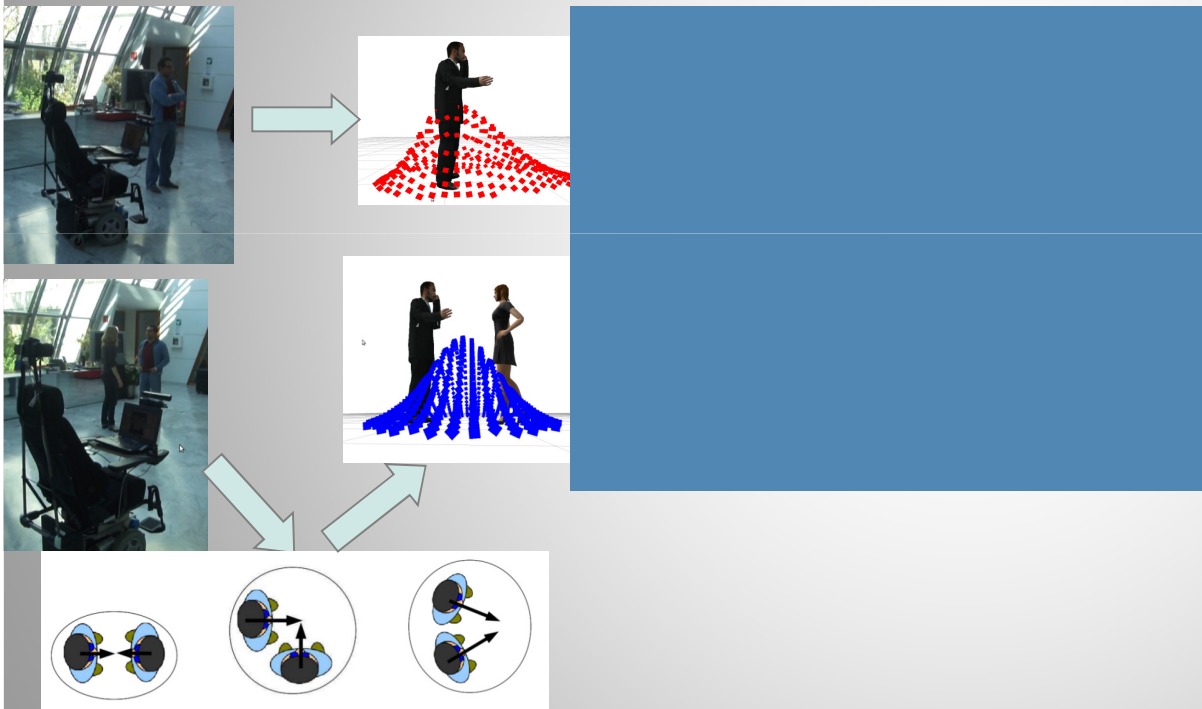


With social conventions

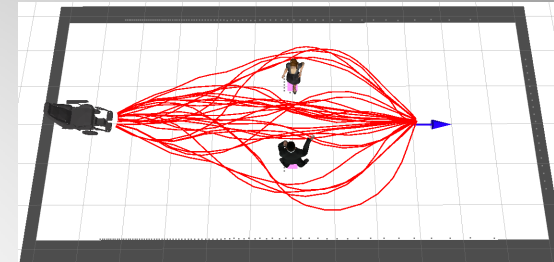


# The Social Filter [Rios-Spalanzani 2011]

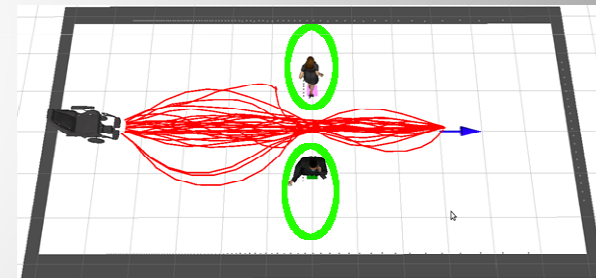
From the models of social conventions, a Risk of disturbance is included as part of the Risk of Collision in the RiskRRT algorithm.



- Planning without Social Filter



Planning with Social Filter  
back to back



viz a viz: interaction zone



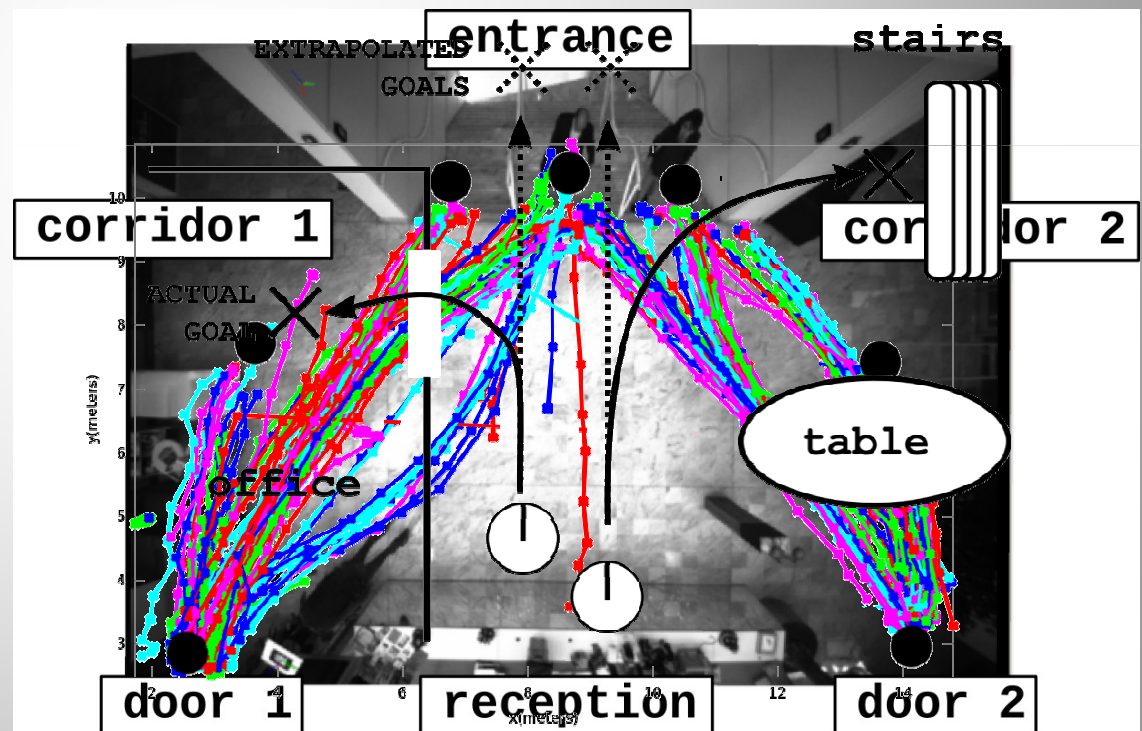
## 2. Robots need to anticipate

Prediction of obstacles' trajectories

# Trajectory prediction

- Humans do not move at random, instead they follow typical paths
- Modeling typical paths:
  - Gaussian Processes [Tay 2007, Ellis 2009, Kim 2011]
  - Growing Hidden Markov Models [Vasquez 2009]

**GHMM  
Training**

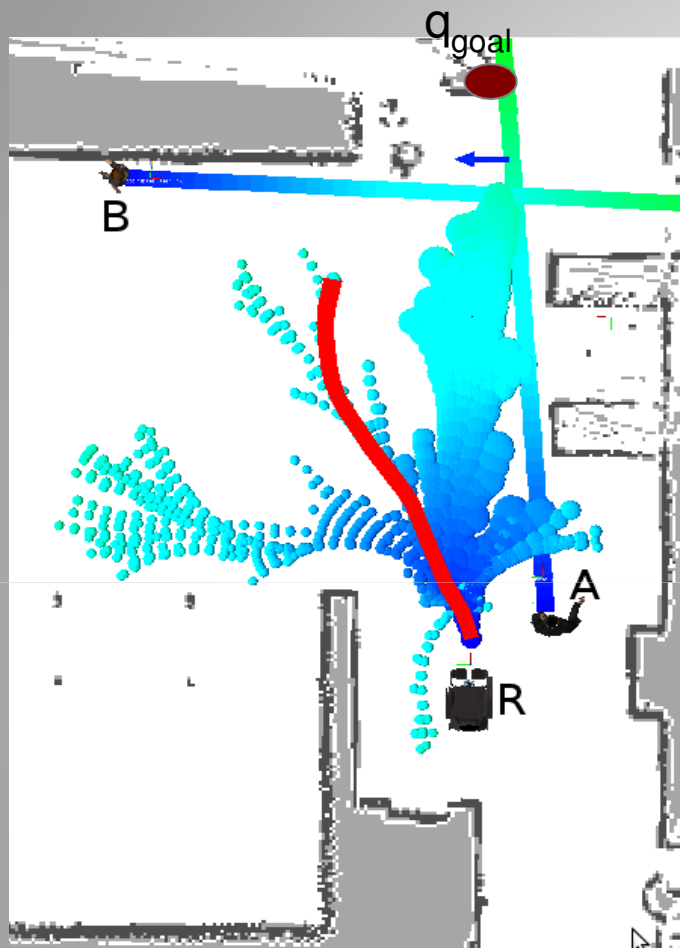


## 3. Human aware Navigation

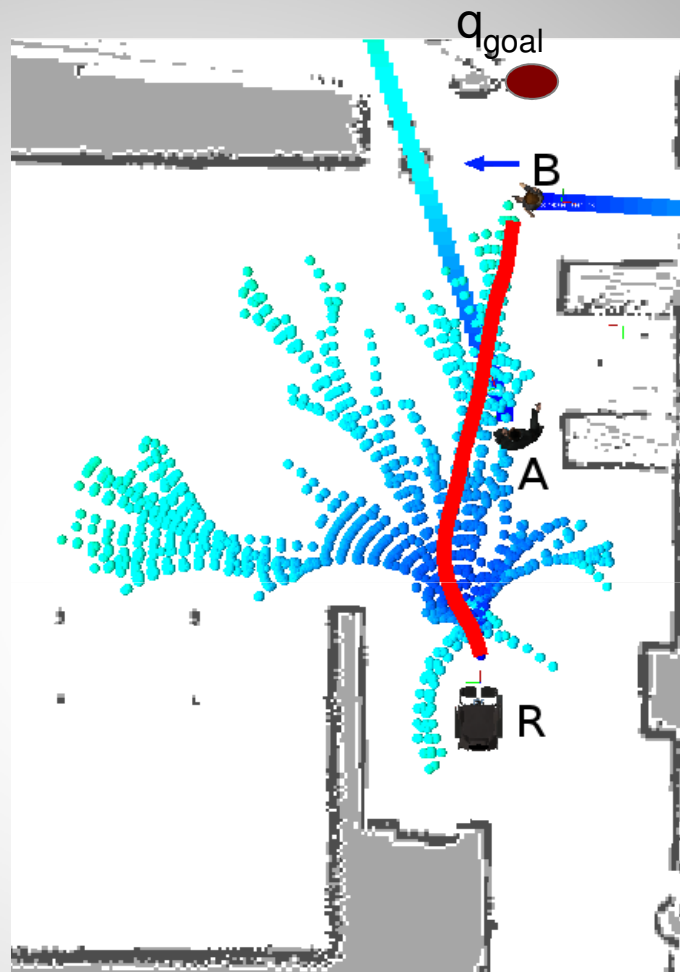
### The RiskRRT algorithm

Fulgenzi C., Spalanzani A., Laugier C., ["Probabilistic motion planning among moving obstacles following typical motion patterns."](#) IEEE/RSJ International Conference on Intelligent RObots and Systems, 2009.

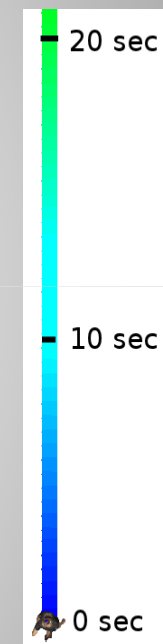
# RiskRRT planner: illustration



$t$



$t + 10$



A, B two pedestrians  
 $q_{goal}$  Goal of Robot R  
 Size of nodes is Risk of collision



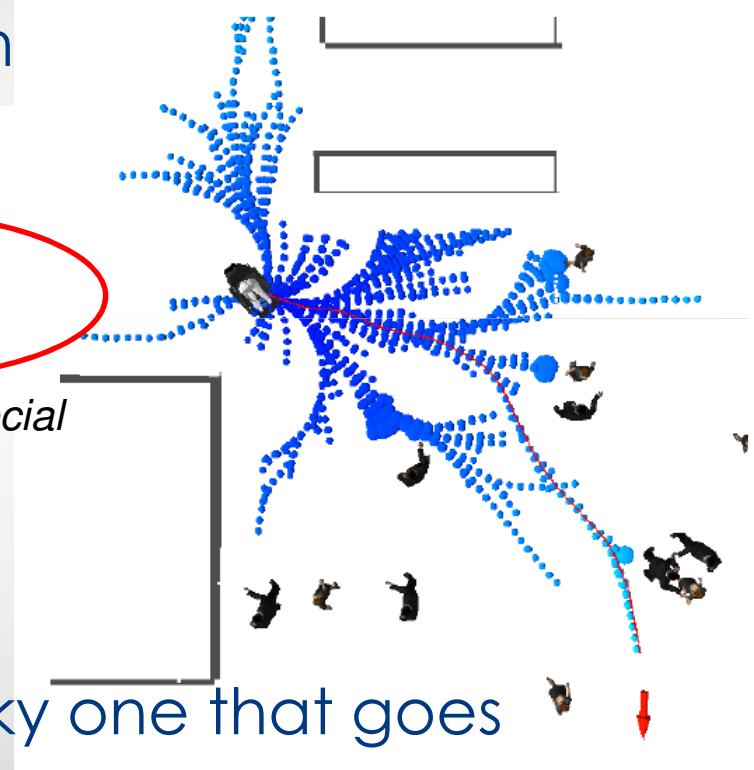
# Principle of the RiskRRT

- Trajectories generated thanks to the RRT algorithm [Lavalle 99]
- On each node of the generated path are calculated probabilities of collision

$$P_c = P_{cs} + (1 - P_{cs}) \cdot P_{cd}$$

$$P_{cd} = 1 - \prod_{m=1}^M [1 - P_{cd}(o_m)] \prod_{i=1}^r [1 - PZ_i]$$

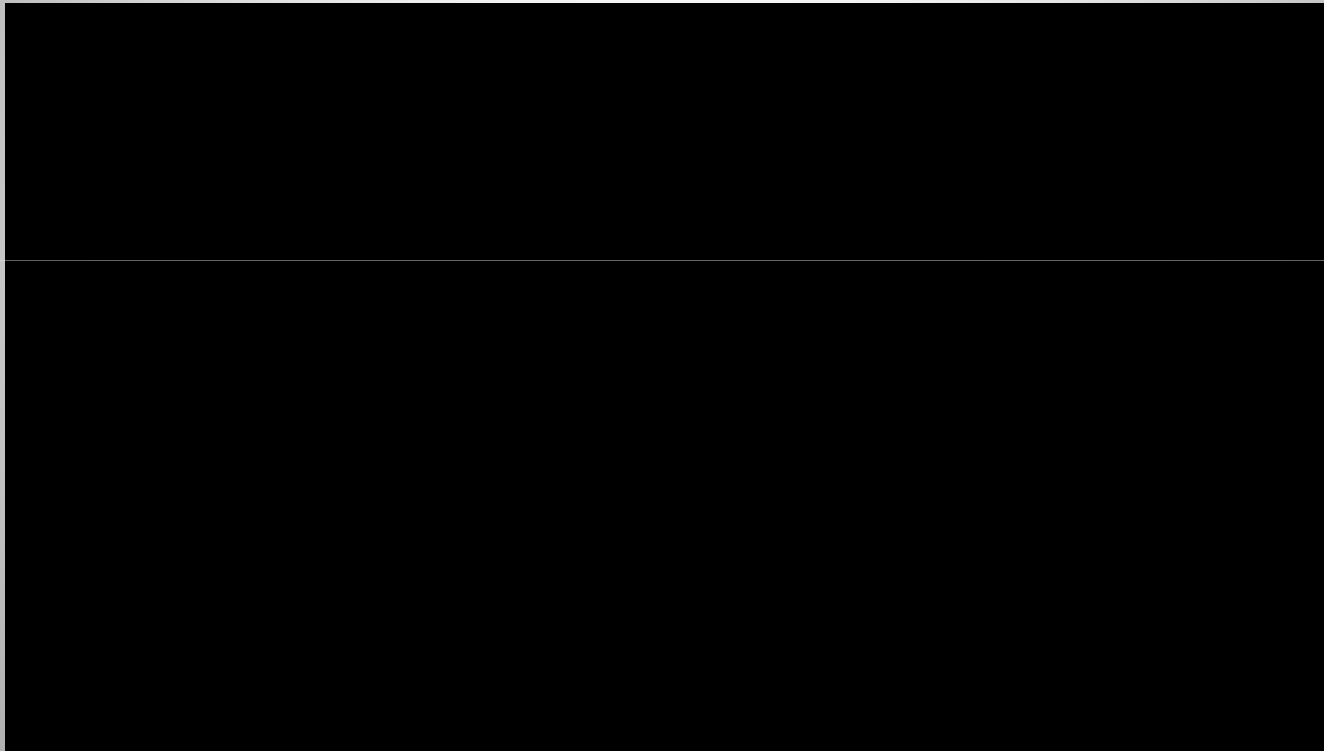
*Collisions with the  $m$  moving obstacles*      *Entering the  $r$  social zones*



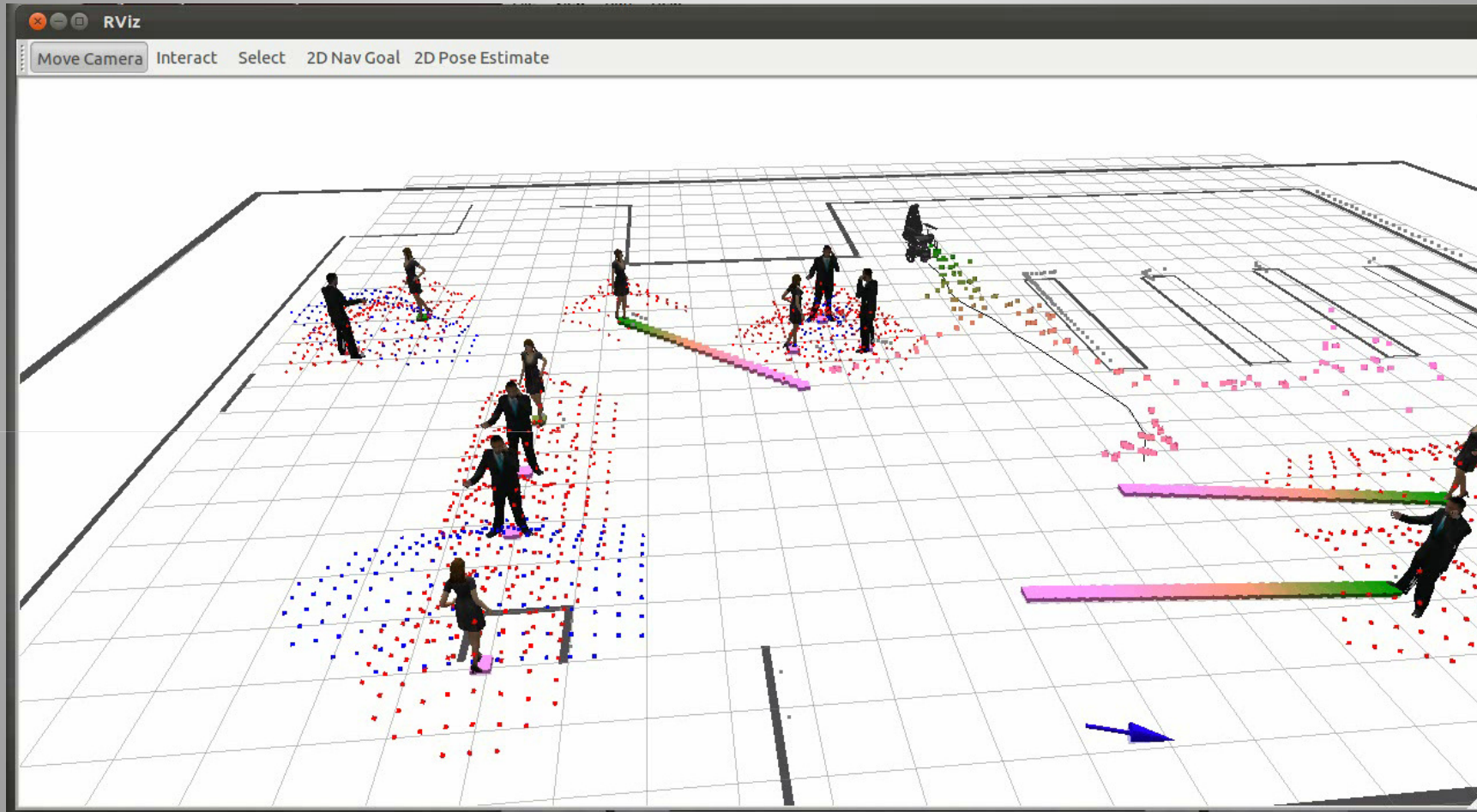
- The chosen trajectory is the less risky one that goes toward the goal

## *Navigation using prediction*

- The future state of the environment is estimated and used to plan safe trajectories
- The chosen trajectory is the less risky one



# Navigation using social conventions and prediction



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# Limitations of this approach



## 4. Navigating in Populated Environments by Following a Leader

Stein P., Santos V., Spalanzani A., Laugier C., "Navigating in Populated Environments by Following a Leader", International symposium on Robot and Human Interactive Communication, Gyeongju, Korea, Aug. 2013.

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# Problems

Social interactions depend on context and may be difficult to detect

Predictive approaches may fall into the Freezing Robot Problem



## Freezing Robot Problem [Trautman 2010]

*In dense environments, due to large future uncertainty, every path generated by the navigation algorithm is expected to result in collision, so the robot stops moving*

# Proposed Solution

Follow persons, to take advantage of their motion in complex and dynamic environments

## Motivation:

- *People motions can provide information about the environment*
- *Humans can easily navigate in crowded environments*
- *Persons are able to deal with very complex social interactions.*

## Advantages:

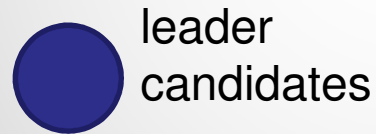
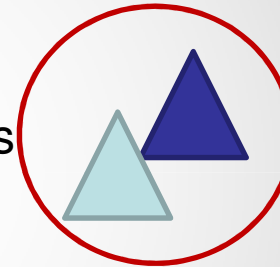
- *Reduce computational cost*
- *Escape Freezing Robot Problem*
- *Better acceptance by humans*
- *Avoid undetected obstacles (e.g. spilled coffee)*

# How to Choose a Leader?

- Goal similarity prediction
- Models of typical paths (ghmm, gp)



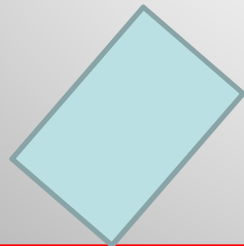
predicted goals



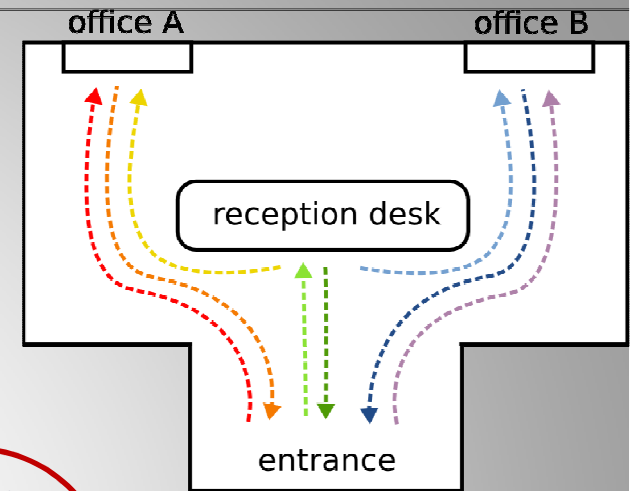
leader candidates



chosen leader



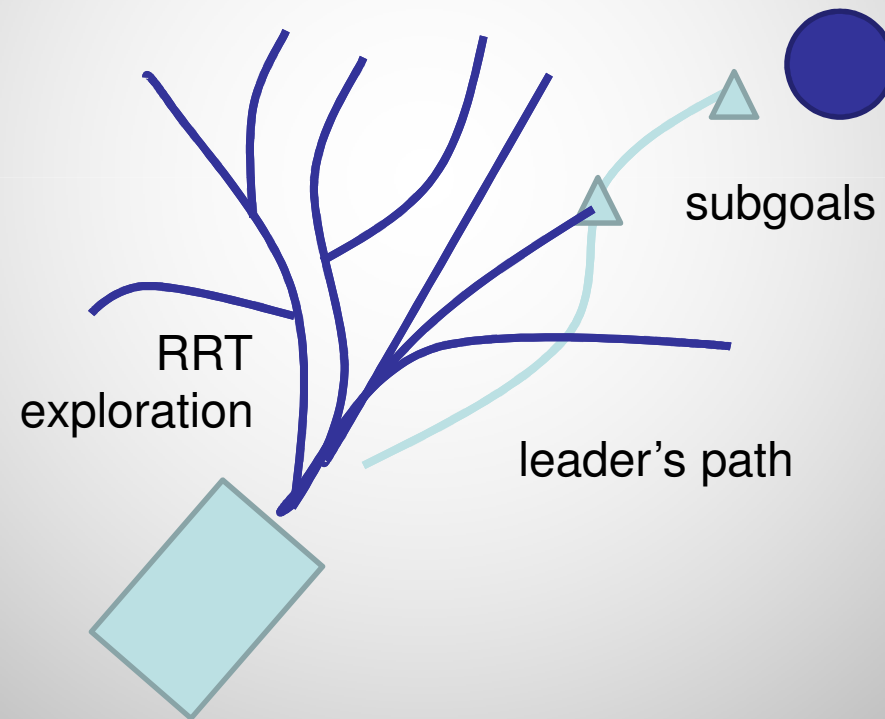
robot





# How to Follow a Leader?

- Leader path tracked
- Samples passed as subgoals
- The RiskRRT plans trajectories



# Experiments

- Simulation Only
- Simulated Robot + Real Data
- GHMM trained with real data
  - Fiducial markers were worn as hats
  - Overhanging camera + wide angle lens
  - People moved among interest points

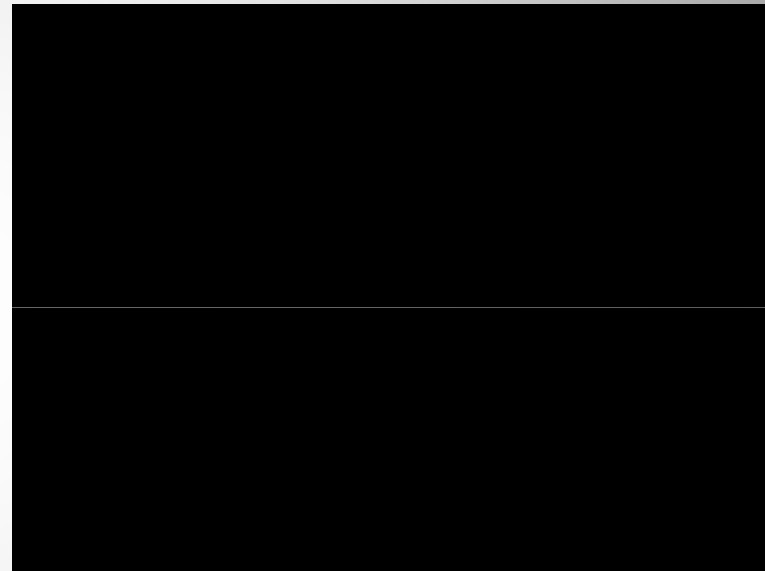


# Experiments: real data + sim

leader **detection** and following



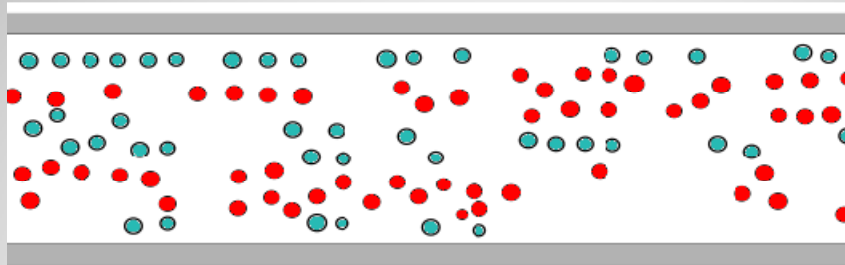
leader **following** among people



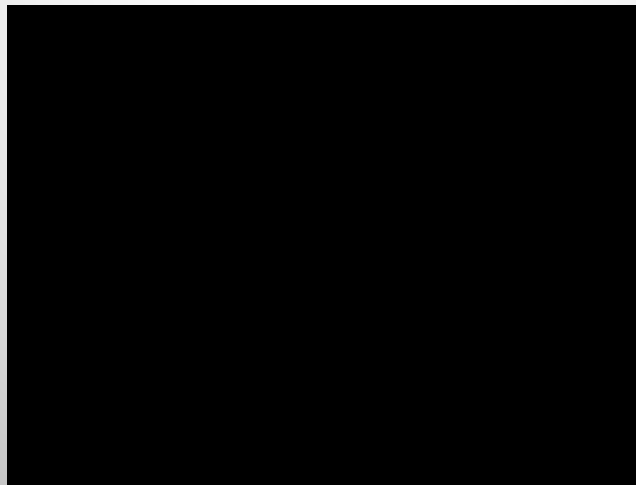
people naturally give room for the leader to pass.  
the robot benefits from this space

# Navigating among crowds

- Pedestrian Simulator Based on the Social Force Model [Helbing 1995]

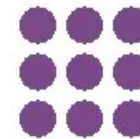
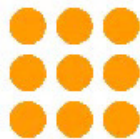


- It incorporates reactions of persons to the presence of the robot and of other persons, replicating some situations of the real world



# Experiments with Pedestrian Simulator

- Goal: **Leader following** to escape **frozen** situations;
- Reduction of time spent to reach goal, when following a leader;
- Robot becomes part of the human group.



Thank you for your attention !

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