

# Welcome to CSE 571 Probabilistic Robotics

Instructor: Dieter Fox

Teaching Assistant:  
Arun Byravan

## Organization

- M/W 1:30 – 2:20
  - Lectures, discussions (EEB 045)
  - Homework, project
- Readings:
  - Papers
  - Chapters from *Probabilistic Robotics*
- Web page:
  - <http://www.cs.washington.edu/571>

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## Goal of this course

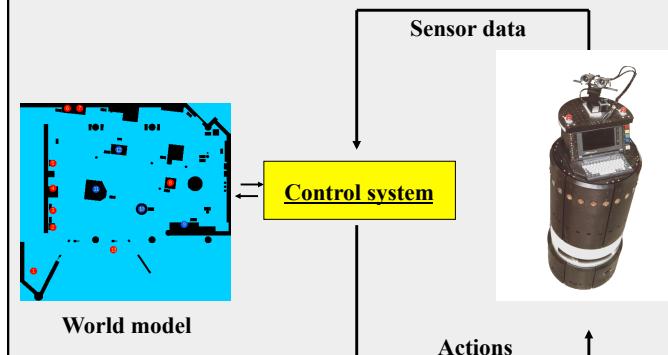
- Provide an overview of problems / techniques in robotics
- Deep understanding of estimation in dynamic systems
  - Probabilistic models
  - Inference, learning
- Hands-on experience

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## High-level View on Robot Systems

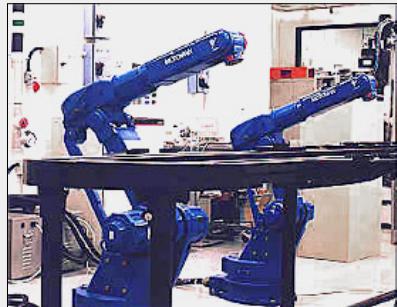


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## Robotics Yesterday



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## Current Trends in Robotics

Robots are moving away from factory floors to

- Entertainment, toys
- Homes, hotels (personal robotics)
- Medical, surgery
- Industrial automation  
(mining, harvesting, warehouses, ...)
- Hazardous environments  
(space, underwater, battlefields, ...)
- Roads

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## Minerva (CMU + Univ. Bonn, 1998)

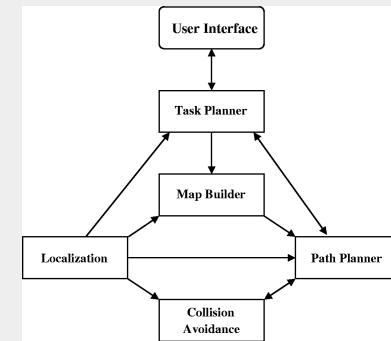


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## Architecture of the Control System



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## RoboCup: Integrated System Research

- Focus on addressing all problems at once
  - Hardware development
  - Perception
  - Low level control
  - High level planning and decision making
  - Multi robot systems

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## RoboCup-99, Stockholm, Sweden



Panasonic MPEG1 Encoder

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## RoboCup Small Humanoid League



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## RoboCup: Midsize League

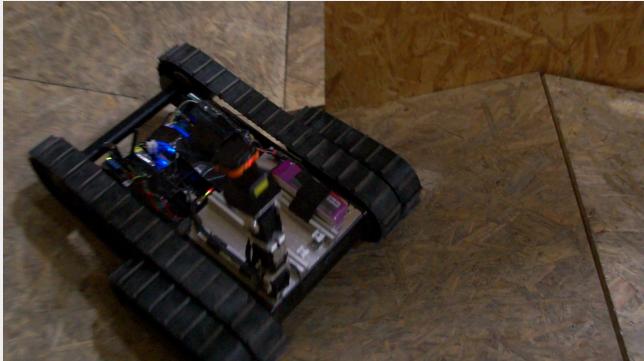


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## RoboCup Rescue



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## DARPA Urban Challenge 2007



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## Google Self-Driving Car



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## Control: BigDog



Boston Dynamics

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## Cheetah



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Massachusetts Institute of Technology

## Autonomous Running Jumps Over Obstacles in the MIT Cheetah 2

Hae-Won Park, Patrick Wensing, and Sangbae Kim



MIT MECH BIOIMMIMETIC ROBOTICS LAB

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## Boston Dynamics Cheetah



Boston Dynamics

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## DARPA Robotics Challenge 2015

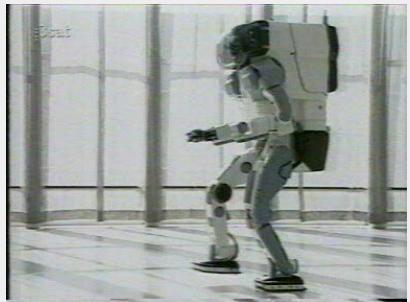


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## Humanoids: Honda P2



Honda P2 '97

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## Getting out of Car

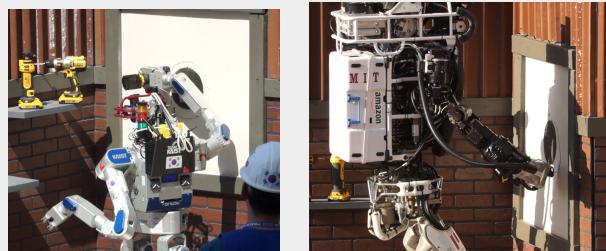


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## Drilling Hole



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## Current Research Trends / Topics

- Manipulation of everyday objects
- Complex household tasks (cooking, cleaning, ...)
- Kinect for object detection, 3D mapping, tracking, interaction
- Human robot interaction
- Machine learning for control, imitation learning, recognition
- Deep learning

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## Course Outline

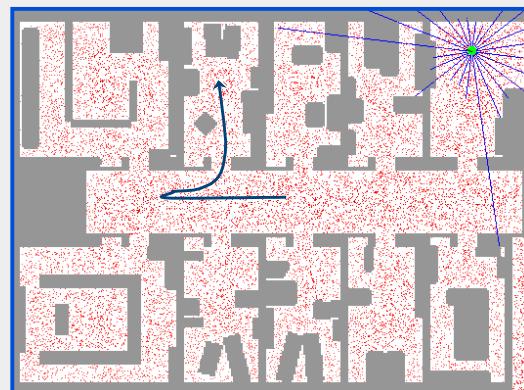
Week	Content	HW / Project
#1	Introduction	
<b>Probabilistic Models / State Estimation</b>		
#2	Bayesian state estimation / filtering	
#2	Motion and sensor models, Gaussian processes	HW 1: GP modeling
<b>Filtering (localization, mapping)</b>		
#3 / 4	Robot localization: grid, particle filters, EKF, UKF	HW2: Filtering
#5 / 6	Map building: EKF-SLAM, Fast-SLAM, RGBD	
<b>Planning / Control</b>		
#6 / 7 / 8	Path planning, exploration, MDPs, POMDPs	Project
#9	Reinforcement learning, inverse RL	
<b>Other Topics</b>		
#10	Object detection and tracking	

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## Sample-based Localization (sonar)

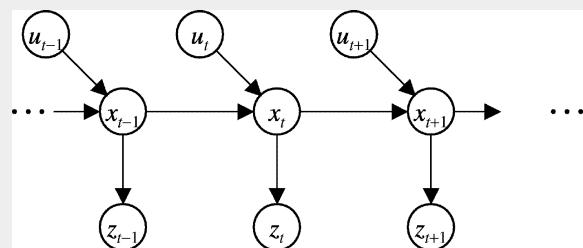


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## Graphical Model Representation of Localization Problem

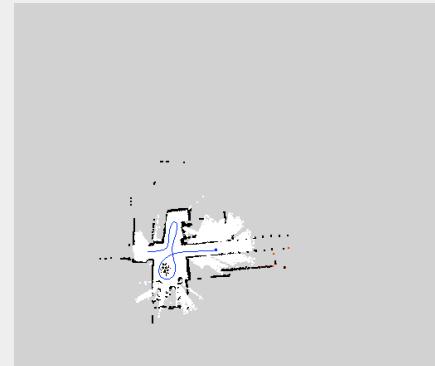


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## Mapping with Laser Scanners



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## Mapping with Kinect

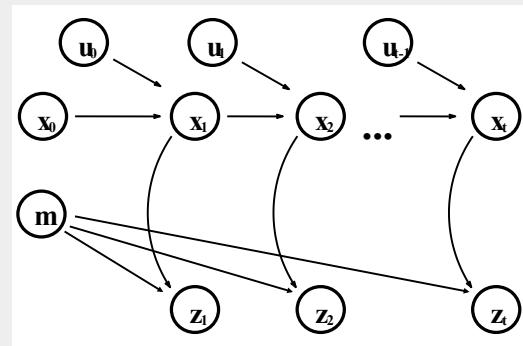


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## SLAM: Simultaneous Localization and Mapping

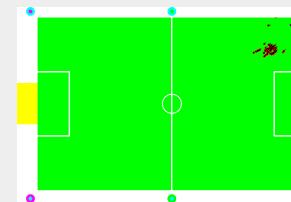


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## Structured Estimation

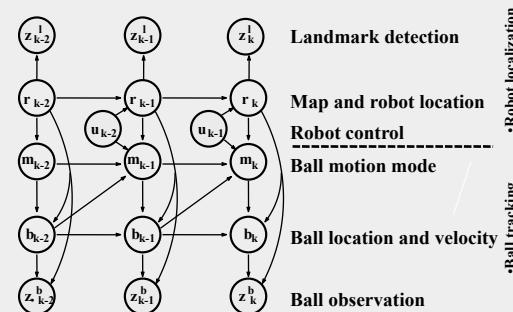


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## Localization and Ball Tracking



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## Articulated Tracking (42 DOF)

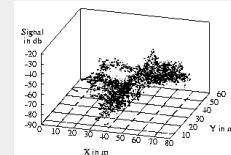


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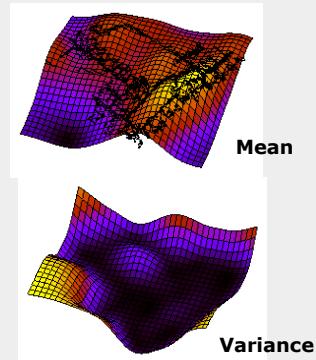
## Gaussian Process Sensor Model for WiFi Signal Strength



- Non-parametric regression
- GP regression
  - continuous locations
  - smooth interpolation
  - uncertainty estimates

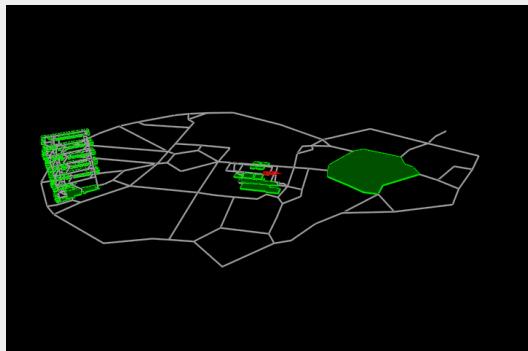
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## Tracking Example



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## RL with GP Dynamics Models: PILCO (Probabilistic Inference for Learning Control)



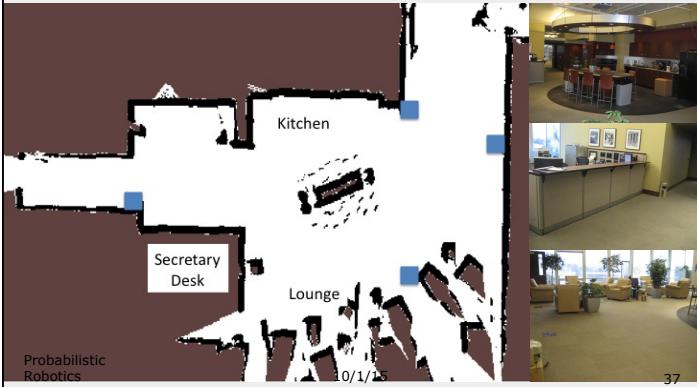
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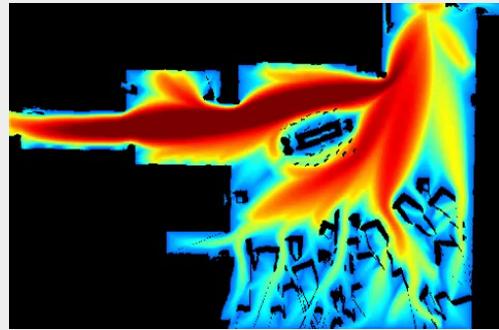
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[Ziebart-Bagnell-etal]

## Pedestrian Trajectory Prediction



## Pedestrian Trajectory Prediction



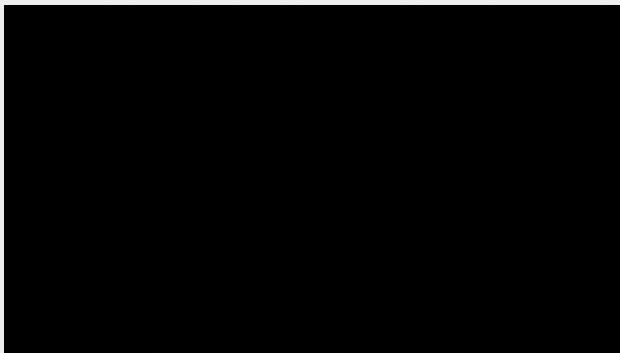
- Inverse optimal control: Learn cost function that explains human behavior; use that to estimate goal

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## Planning for Manipulation



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