# Introduction and Research Background

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### **Overview**

- 1. Osnabrück, its University, and DFKI
- 2. Research in Plan-Based Robot Control \*\*\*\*\*\* Lunch Break \*\*\*\*\*
- 3. Application-Oriented Research: Agricultural Robotics
- 4. Plan of (my part of) the SAI seminar





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### **Osnabrück**



- Population: 160,000 (larger area ≈ 500,000)
- Founded: ≈ 800
- Economy (area):
  - Trade
  - Logistics
  - Food Industry
  - Healthcare
  - Metal Processing
  - Cars (VW)
  - Agricultural Machines

### **Osnabrück University**



#### Size

- ≤ 12,000 students
- 1680 staff (≥ 200 profs)
- ≈ 118 Mio € budget (2013)
- no medicine, no engineering



#### **UOS Profile**

- operational since 1974
- original profile: humanities & teacher education
- recent profile (some elements):
  - interdisciplinary institutes (Cognitive Science, Environmental Syst. Rsch., International Studies, ...)
  - teacher education
- Research foci
  - 1 rsch. cluster (DFG), Biology
  - 4 grad. coll. (e.g., Cog. Sci.)

### **Institute of Computer Science**





### **DFKI in Osnabrück**

- Osnabrück Branch (of DFKI Robotics Innovation Center) founded in 2011
- Research topic: Plan-based robot control
- Chief application domain: Agricultural robotics
- More about that after lunch!



### My Long-Term Research Agenda

How does long-term purposeful behavior work?



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1. Osnabrück, its University, and DFKI

#### 2. Research in Plan-Based Robot Control

\*\*\*\*\* Lunch Break \*\*\*\*\*
3. Application-Oriented Agricultural Robotic
\*\*\*\*\*
2.1 Issues & Challenges
2.2 Interpreting 3D Point Clouds
2.3 Plan-Based Control

4. Plan of (my part of) the SAI seminar





#### 2.1 Issues & Challenges

2.2 Interpreting 3D Point Clouds

2.3 Plan-Based Control



### **Really Closing the Loop**



#### **Examples**

- "If you see a sink and a tiled floor, then this is no conference room!"
- "If you are in the kitchen, you should see an oven!"





### **Plan Execution Monitoring**



#### Issue

- Plan execution monitoring: Tell *success* case from *nominal* case from *failure* case from *retry* case from ...
- ...see next slide



2.1 Issues & Challenges

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### **Sensor Data Interpretation**

#### **Example: How many chairs?**



[AG Bülthoff, MPI Biol. Kybernetik]

#### Sensor data interpretation includes top-down reasoning!





#### 2.1 Issues & Challenges

2.2 Interpreting 3D Point Clouds

2.3 Plan-Based Control

### ... and overall:

- Handle temporal, changing, partially obsolete and/or wrong KBs/Belief Bases
- Handle huge KBs, of which only a small part is relevant for given planning/perception problem
  - Tell (potentially) relevant from (apparently) irrelevant KB parts
- Solve "object anchoring" problem (not to mention symbol grounding)





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### **The Problem**

- Given: 3D sensor environment point cloud model
  - ... as by 3D laser scanner, ToF camera, Kinect, ... ... typically registered from several scans (automatic)



- Given: CAD model of some object/type ... as by provider, Google 3D Warehouse, ...
- Given: model of geometric constituents of object
   ... as handcrafted (now) or gained from CAD model (future)
- Find: object occurrences in data





### Why Care?

- Semantic mapping (mapping with objects + ontology)
- Data reduction (point sub-clouds → geometric primitives)
- Fill up occlusions (perceive true 3D in "2.5D" sensor data)
- Applications! (map sensed reality to nominal CAD)
  - Robotic mapping
  - Facility management
  - → Plant engineering







# (Own) References

- M. Günther, T. Wiemann, S. Albrecht, J. Hertzberg. Building Semantic Object Maps from Sparse and Noisy 3D Data. Proc. IROS-2013
- T. Wiemann, K. Lingemann, J.Hertzberg. Automatic Map Creation for Environment Modelling in Robotic Simulators. Proc. 27th Eur. Conf. Modelling and Simulation (ECMS-2013)
- T. Wiemann, K. Lingemann, A. Nüchter, J. Hertzberg. A Toolkit for Automatic Generation of Polygonal Maps – Las Vegas Reconstruction. Proc. 7th German Conf. on Robotics (ROBOTIK-2012)
- M. Günther, T. Wiemann, S. Albrecht, J. Hertzberg. Model-based object recognition from 3D laser data. Proc. 34th Annual German Conference on AI (KI-2011)
- LVR: http://www.las-vegas.uni-osnabrueck.de/
- 3DTK: http://slam6d.sourceforge.net/





### **Architecture Context**







### **Step I: Detect Geometric Primitives**

- Detect primitives (plane, cylinder, sphere) from point normals in dense sub-clouds
- Furniture: restrict to **planar patches** (orientation-independent!)
- Generate triangle mesh by optimized marching cubes implementation
- Region growing along homogeneous triangle normals







### Marching Cubes ...

... is a std. algorithm from CG for turning voxel-oriented representation into polygonal representation







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# **Step II: Generate Object Hypotheses**



Check relations based on sensor data (size, spatial relations), combine SWRL rules with ontology

 $Table(?p) \leftarrow HorizontalPlane(?p) \land hasSize(?p,?s) \land$ 

swrlb: greaterThan(?s,1.0)  $\land$  hasPosY(?p,?h)  $\land$ 

 $swrlb: greaterThan(?h, 0.65) \land swrlb: lessThan(?h, 0.85)$ 

Calculate object pose hypothesis (surface normals, PCA, ...) 





### **Step III: Verify Object Hypotheses**

#### **Basic Idea**

- Sample CAD model into 3D point cloud
- Register model sampling
   with sensed 3D point cloud at hypothetical pose, using ICP
- Accept object hypothesis if matching error below threshold

**Modification** (ignore errors from scanning/sampling difference)

 Determine model/data correspondence according to filled/ empty voxel bins





#### **Example: 3D Point Cloud Data**



**Plan-Based Control** 

2.3

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### **Example: Primitives & Hypotheses**



- Plane patches from triangle mesh (neighboring triangles with like normals)
- Non-planar surfaces in green
- Table(top) hypotheses in grey

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### **Example: Verification**



Verify table object and pose by ICP matching of point sampling at hypothetical pose



Corresponding CAD table top before and after ICP matching





### **Example: Results**



**Plan-Based Control** 

2.3

#### Animation







### **Issues in Sensor Data Interpretation**



- Abduce potential aggregates from detected objects plus DL domain model
- Reinterpret objects
- Substitute sensor data (occlusions) by reasoning
- Generate **expectations**

[Neumann & Möller, 2006]





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### **Robot Planning**

The plan is that part of the robot's program, whose future execution the robot reasons about explicitly. [D. McDermott, 1992]

- Dates back to STRIPS/SHAKEY tradition in AI (1960/70s)
- Various benefits for robot ctrl: Performance optimization (time, robustness), HRI/RRI, software engineering
- Plan just <u>one</u> source of information for robot ctrl (<u>hybrid</u> arch.s)
- Plan format may vary; notion of planning may differ from classical view ("adapting library plan stubs")
- Robot plans are short. Autonomous execution matters!
- Needs hybridization with space, time & resource reasoning
- Needs object anchoring & action grounding!
- Needs to cope with irrelevant, outdated & wrong facts!





# **Running Example: RACE**



- <u>Robustness by Autonomous Competence Enhancement</u>
- Univ.s Aveiro, Hamburg (coord.), Leeds, Örebro, Osnabrück
- EU 7<sup>th</sup> FP, 12/2012–11/2014
- **Research Topic**: Learning from (own) robot experiences
- Osnabrück part: Plan-based robot control
- http://project-race.eu/



#### How to Serve a Coffee







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#### **Control Flow**







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# **HTN Planning**

- ROS node for (J)SHOP2
- World state is extracted from the Blackboard







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### HTN (STN) Task serve\_coffee\_to\_guest







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### HTN (STN) Subtask grasp\_object







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### **Plan Execution with SMACH**

- Plan is transferred to a SMACH state machine and executed
- 1 to 1 to 1 mapping from operators to states to robot capabilities (atomic actions)



 Failed plan can be reinserted into the Blackboard, which invokes re-planning (or "failing upward" in plan hierarchy)

2.1 2.2

2.3

**Issues & Challenges** 

Plan-Based Control

**Interpreting 3D Point Clouds** 

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### "Consistency-Based" Execution Monitoring

- In RACE, Execution Monitoring can leverage rich knowledge
  - spatial (e.g., correct placement of objects w.r.t. each other)
  - temporal (e.g., coffee gets cold after 5 minutes)
  - causal (e.g., gripper is not closed while holding cup)
  - ontological (e.g., functional zones)
  - resource (e.g., do not exceed max weight of tray)
- How to assess consistency of observed behavior w.r.t. rich knowledge?

Issues & Ch Interpreting

Plan-Based

- Towards consistency-based execution monitoring
  - infer courses of actions and changes in the environment based on inconsistencies in different types of knowledge



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# The need for Hybrid Planning

- Space, time, and "causation" (action dependencies) interact in plan-based robot control
  - Clutter on the table influences the best serving position, which influences the best grasp and the arm trajectory and the arm to use – left, right, which influences the arm to pick up an object with on the way, which influences that part of the path and the time, which influences ...
- Separating different planning realms leads to suboptimal and inflexible plans
- Integrating them creates complexity; luckily, robot plans are short
- Current path in RACE: build a hierarchical planner in terms of the Meta-CSP framework (F. Pecora, Örebro)





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3.1 What is DFKI?3.2 Robots Gone Farming





# 3.1 What is DFKI?3.2 Robots Gone Farming





### DFKI

The German Research Center for Artificial Intelligence (German: *Deutsches Forschungszentrum für Künstliche Intelligenz, DFKI*) is one of the world's largest **nonprofit contract research institutes** in the field of innovative software technology **based on AI methods**.



### The Pentagon of Innovation



# **DFKI Figures**

- 414 staff scientists (384 full time equiv.)
- 39,5 Mio. € turnover in 2012
- Turnover per scientist > 100 T€
- average age: 36 (comparison: Fraunhofer Society: 43)
- Additional 285 sc. assistants (171/full t. equiv.), additional freelancers
- 699 staff
- 171 running projects







### **Research Units and Groups**



### **DFKI Osnabrück Branch**



3.1 What is DFKI?

3.2 Robots Gone Farming



### **Example Projects: SmartBot, marion**

Sugar Beet Harvester MAXTRON, Grimme

**Combine Harvester LEXION**, **Tractor XERION, CLAAS** 



Robotic Solutions for Agriculture, Ship Building, and SME Production Funding: EU Interreg

Partners (some): Amazone, DFKI, Grimme, HS OS

Mobile, autonomous, co-operative robots in complex value creation chains Funding: Fed. Min. Economy (BMWI) Partner: CLAAS, DFKI, STILL, ATOS (ended 12/2013)

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### **Corn Harvesting Scenario**



### **Route Planning**



### **Motion Planning, Structure**





#### **Determine Machine Parameters**





3.1 What is DFKI?3.2 Robots Gone Farming

### **Motion Primitives**







3.1 What is DFKI?

3.2 Robots Gone Farming

### **Motion Planning**



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# The Big Story

- Machine Throughput keeps increasing
- Logistics becomes a limiting factor
- Planning needed for complete process chain
- "marion" was about developing a prototype for a dynamical planning system for corn harvesting
- Process agents get coordinated better
- Unlock hidden productivity potential

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 "marion" results are now being developed towards products as financed by CLAAS











What is DFKI?

**Robots Gone Farming** 

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### **Seminar Sessions**

#### All sessions:

- (1) Presentation by myself; lunch break;
- (2) discuss paper from literature (which all(!) have read)
- For (2): 2 students lead through the paper discussion
- All papers online on the Seminar Web page (plus http://www.inf.uos.de/hertzberg/sai14-jh.html)
- March 14<sup>th</sup>: Semantic Mapping
- March 21<sup>st</sup>: Object Anchoring and Symbol Grounding
- April 4<sup>th</sup>: Approaches to Plan-Based Robot Control
- April 14<sup>th</sup>(!!): "Service Robotics"



### Exams

- Three options for passing:
  - Lead the discussion in a session (pair of 2 students)
  - Oral discussion (30') about the seminar topics with me (pair of 2)
  - Hand in an essay (ca. 10 pages) summarizing one of the seminar papers (1 student)
  - Deadlines:
    - Oral discussions: By May 25th
    - Essays: Hand in by May 16<sup>th</sup>
    - After that: Grading is "fail"
- Volunteers for next Friday's paper?

N. Blodow & al.: Autonomous Semantic Mapping for Robots Performing Everyday Manipulation Tasks in Kitchen Environments. Proc IROS-2011



### Thanks ...

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# ... for your time!