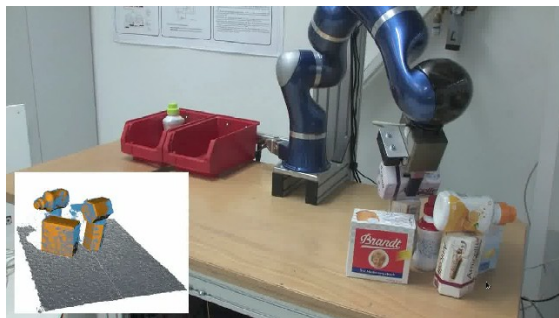


Machine Vision and Perception Group Department of Informatics

Darius Burschka
Technische Universität München

Research of the MVP Group <http://www6.in.tum.de/burschka/mvp>

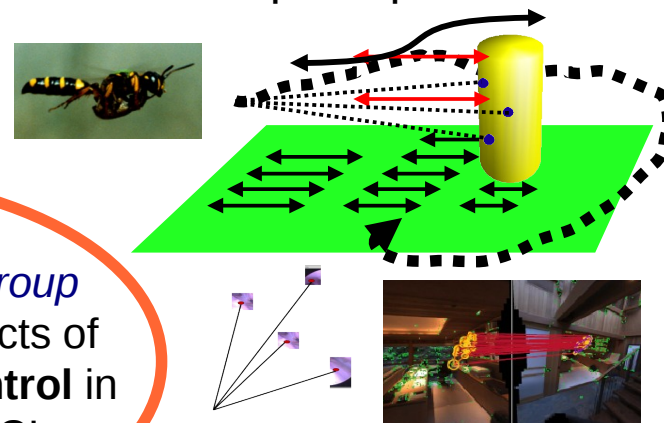
Perception for manipulation



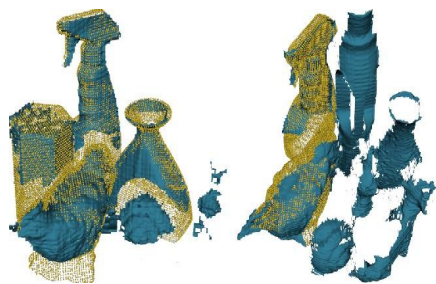
Visual navigation



Biologically motivated perception

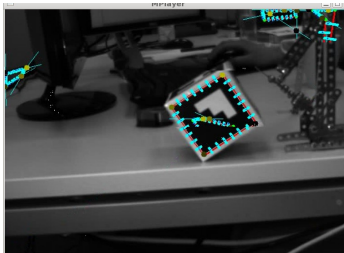


Rigid and Deformable Registration



The *Machine Vision and Perception Group* @TUM works on the aspects of **visual perception** and **control** in medical, mobile, and HCI applications

Exploration of physical object properties



Photogrammetric monocular reconstruction



Visual Action Analysis

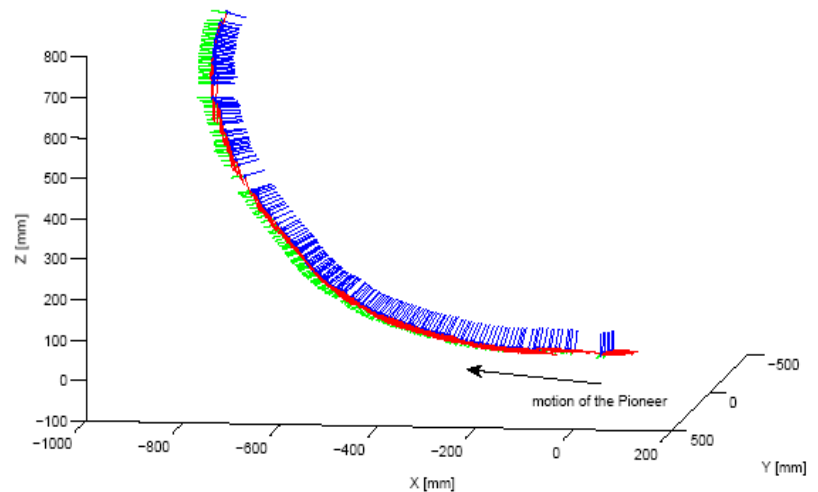
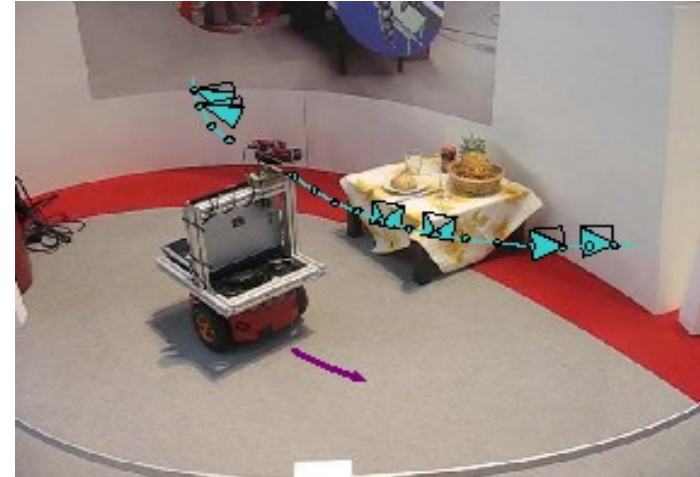


Visual Localization for hybrid Environmental Modeling

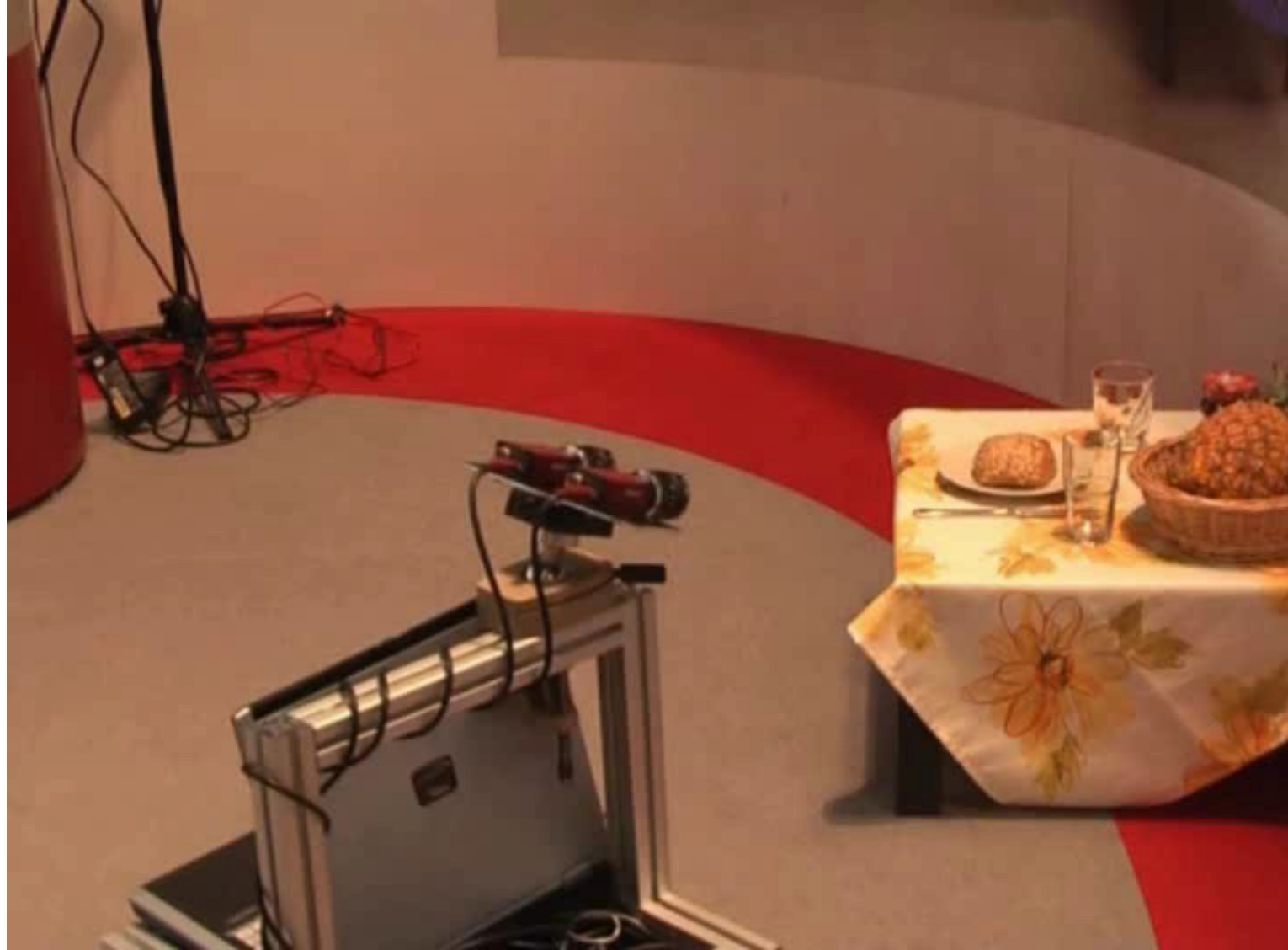
Real-Time Localization

The high accuracy allows direct stitching of images along the trajectory without bundle adjustment

Resulting hybrid (appearance and geometry) model allows path planning and prediction of sensor views for e.g. attention research

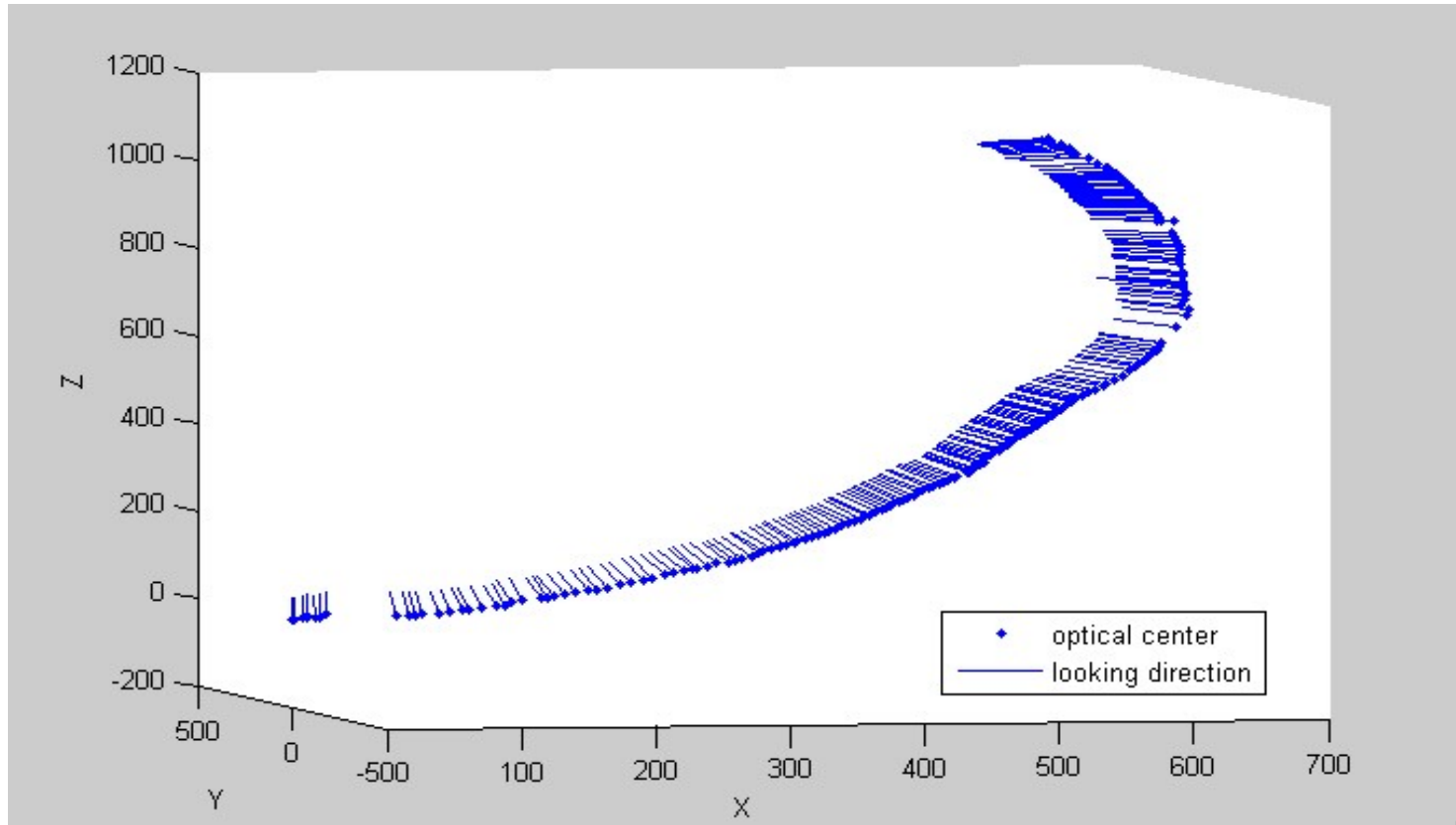


Example of a hybrid model reconstruction

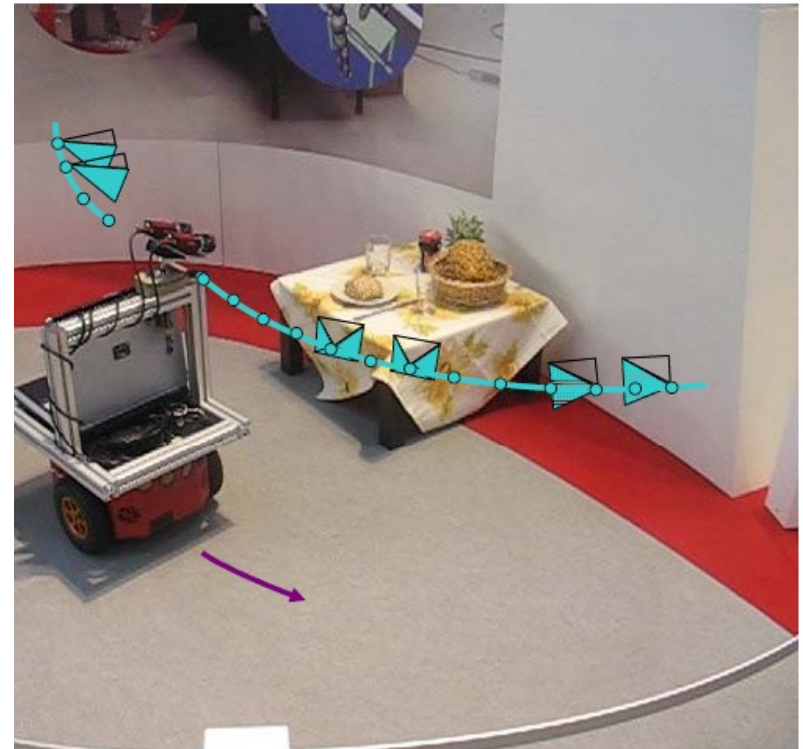
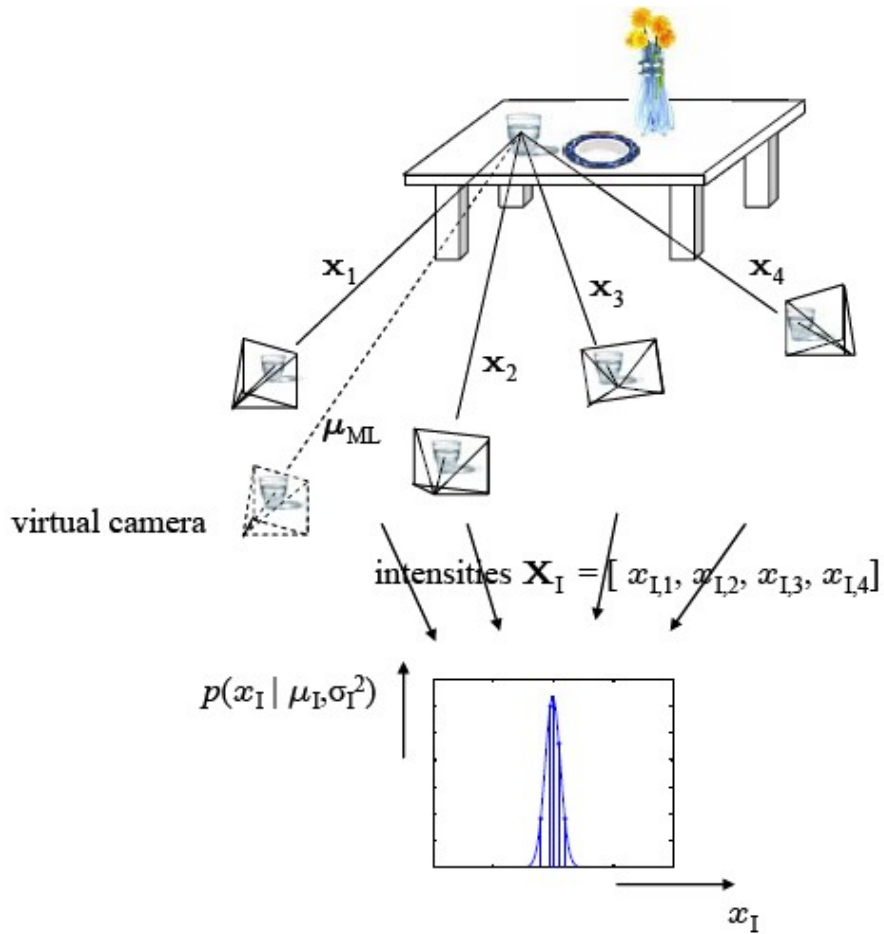


Result of a visual localization

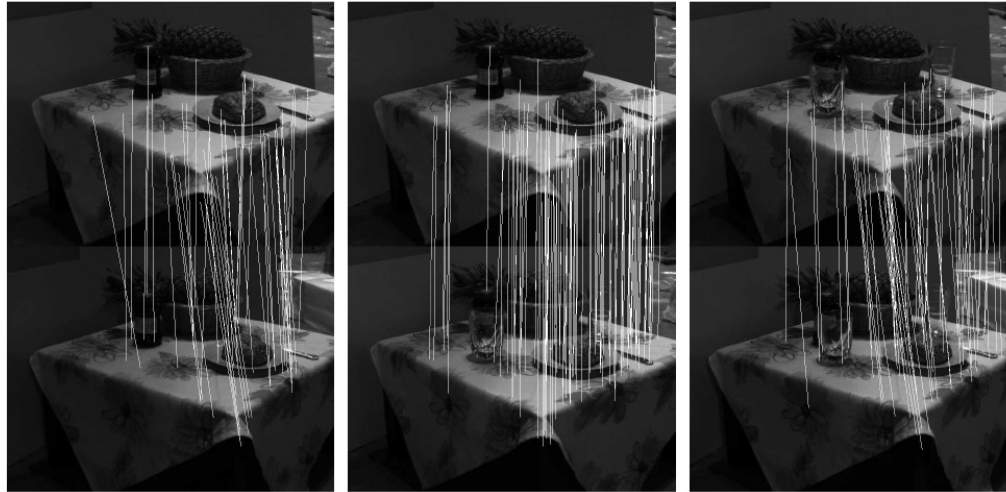
6DoF pose of the robot is calculated from single camera view



Reconstruction of a hybrid (appearance/geometry) model



Visual Homing

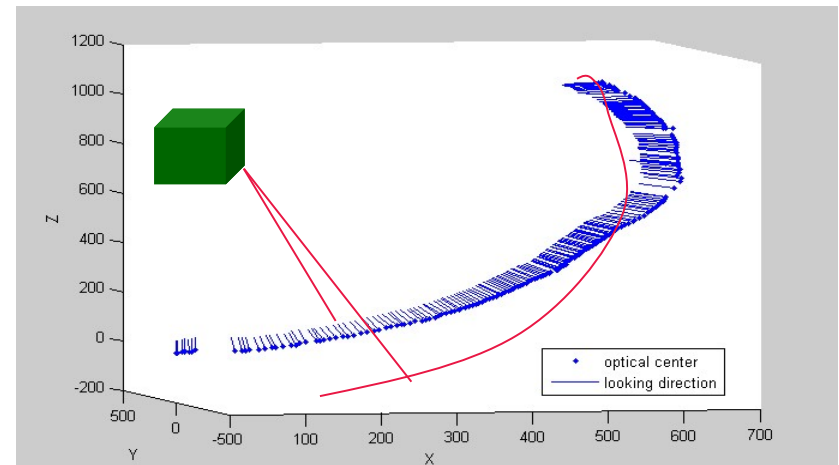


(a) $I_{1.1}$ and $I_{1.2}$

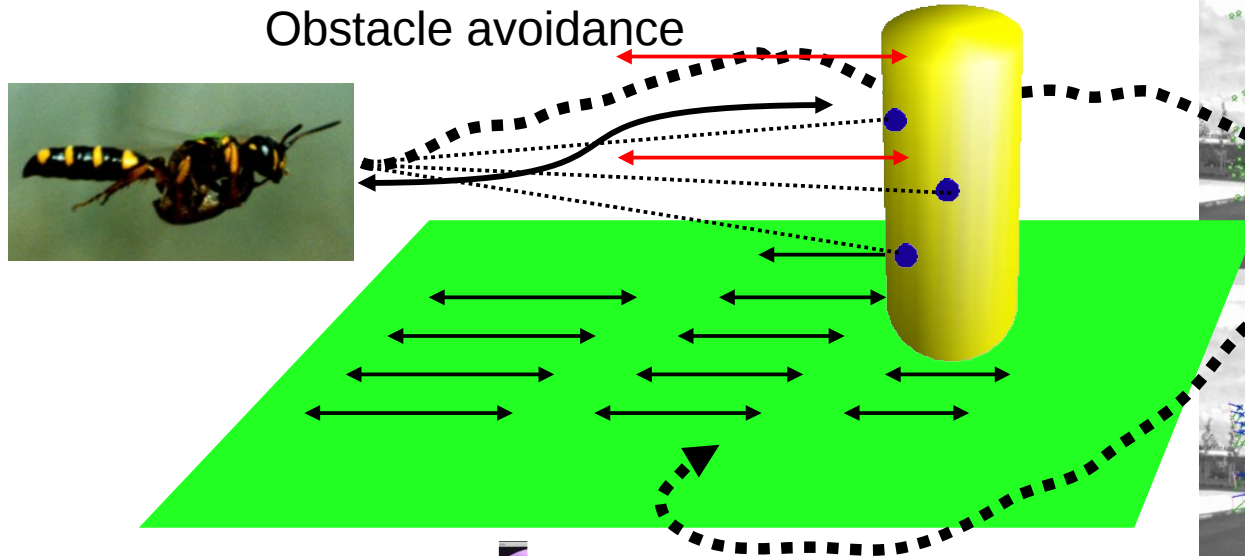
(b) $I_{1.1}$ and $I_{2.1}$

(c) $I_{2.1}$ and $I_{2.2}$

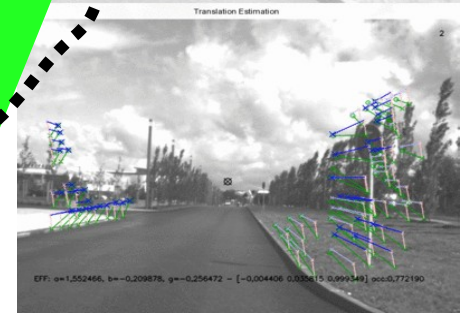
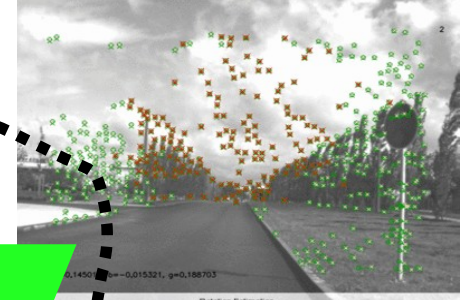
The system is capable of registration to previously observed trajectories



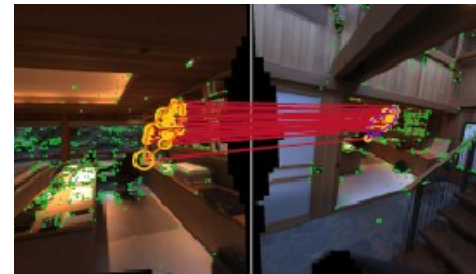
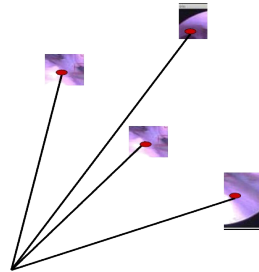
Biologically Motivated Navigation



Obstacle avoidance



Decoupling of Rotation and Translation



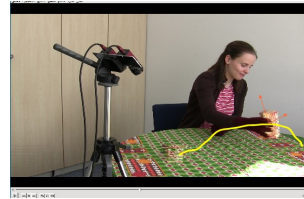
Perception-based loop closure

Work on Optimal Sensor Models

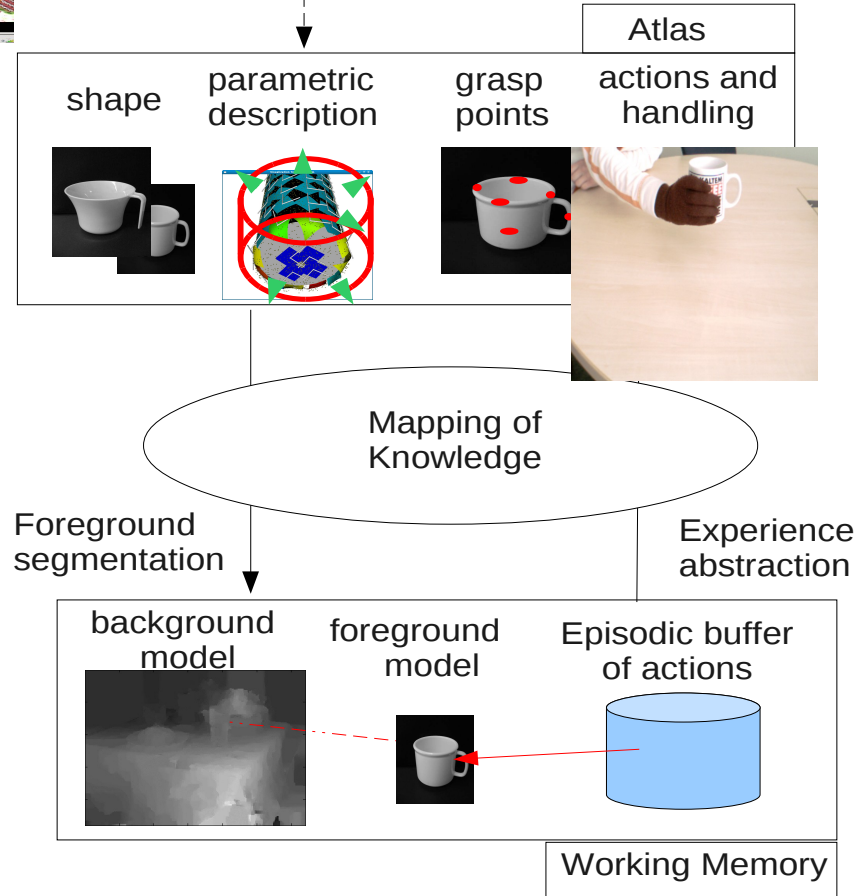


Knowledge Representation

- Atlas:
 - Long-term memory
 - Experience of the system
- Working memory:
 - Short-term memory
 - Experience grounded in a given environment
- Temporal handling information



Human demonstration



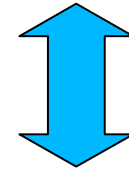
Indexing of the Atlas information from 3D perception

Real-world scenario

scene setup

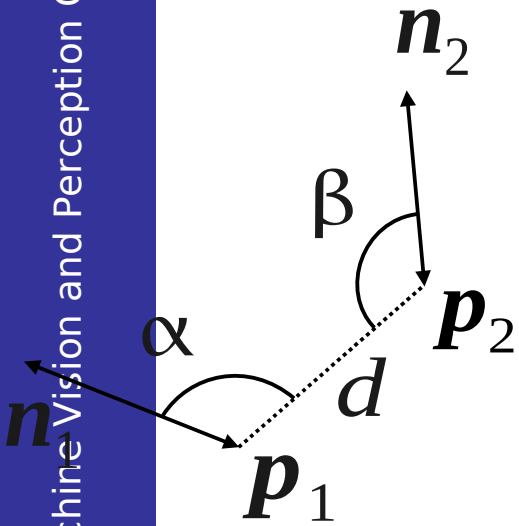
input point cloud

recognized models



Algorithm Description

(Model Preprocessing Phase)



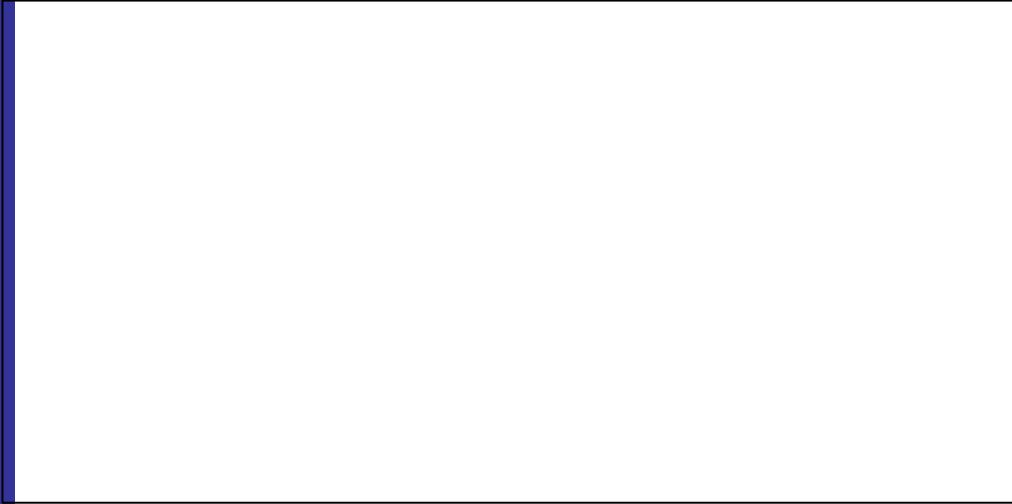
- For all pairs of surflets at distance d insert the triple $(\alpha, \beta, \nrightarrow(\mathbf{n}_1, \mathbf{n}_2))$

plus a pointer to its model in a hash-table.

- Do this for all models using the same hash-table.

3D Object Recognition

- Challenges
 - Incomplete Data
 - Noise and outliers

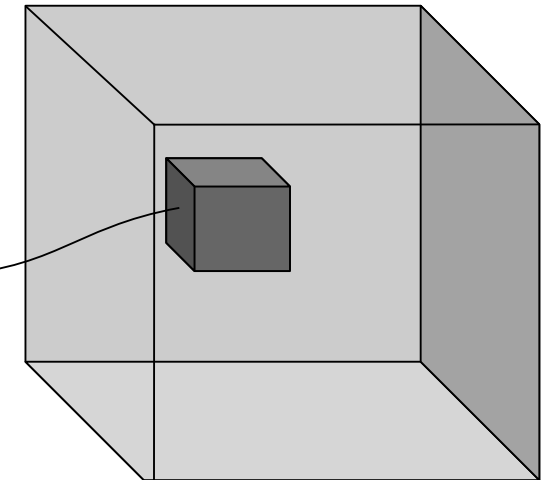


Online Recognition Phase

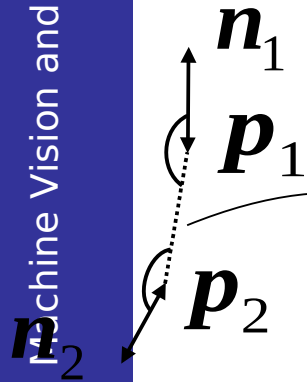
- For each model surflet pair $((\tilde{\mathbf{p}}_1, \tilde{\mathbf{n}}_1), (\tilde{\mathbf{p}}_2, \tilde{\mathbf{n}}_2))$ in the hash-table cell:

Compute the rigid transform T that best aligns $((\tilde{\mathbf{p}}_1, \tilde{\mathbf{n}}_1), (\tilde{\mathbf{p}}_2, \tilde{\mathbf{n}}_2))$

to $((\mathbf{p}_1, \mathbf{n}_1), (\mathbf{p}_2, \mathbf{n}_2))$



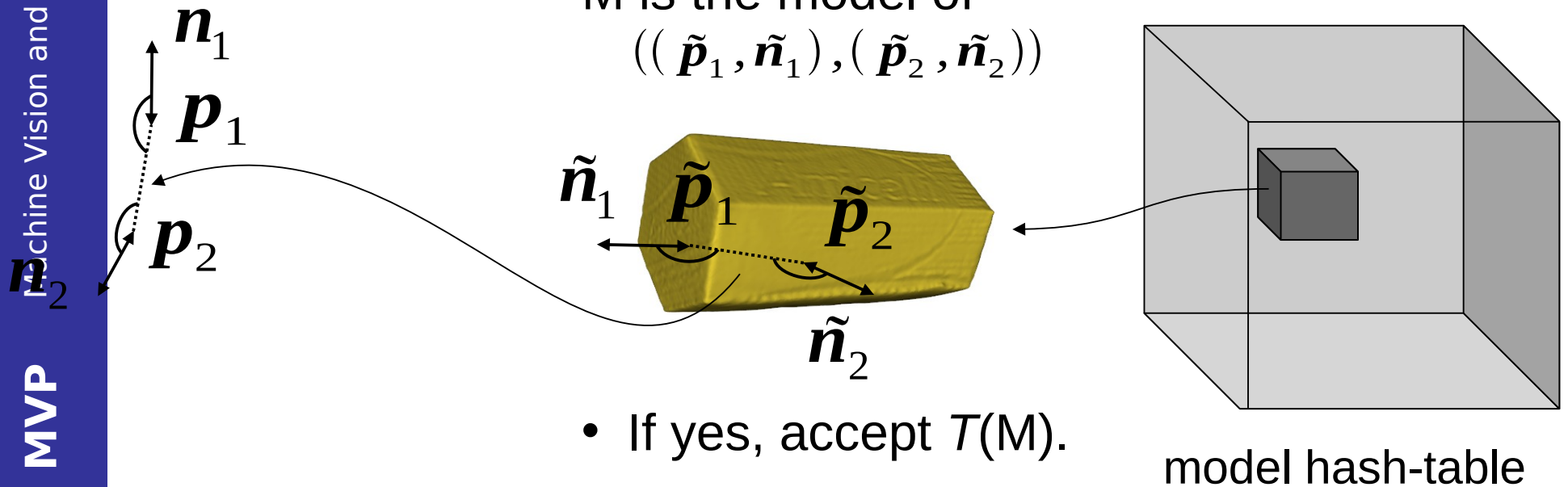
model hash-table



Online Recognition Phase

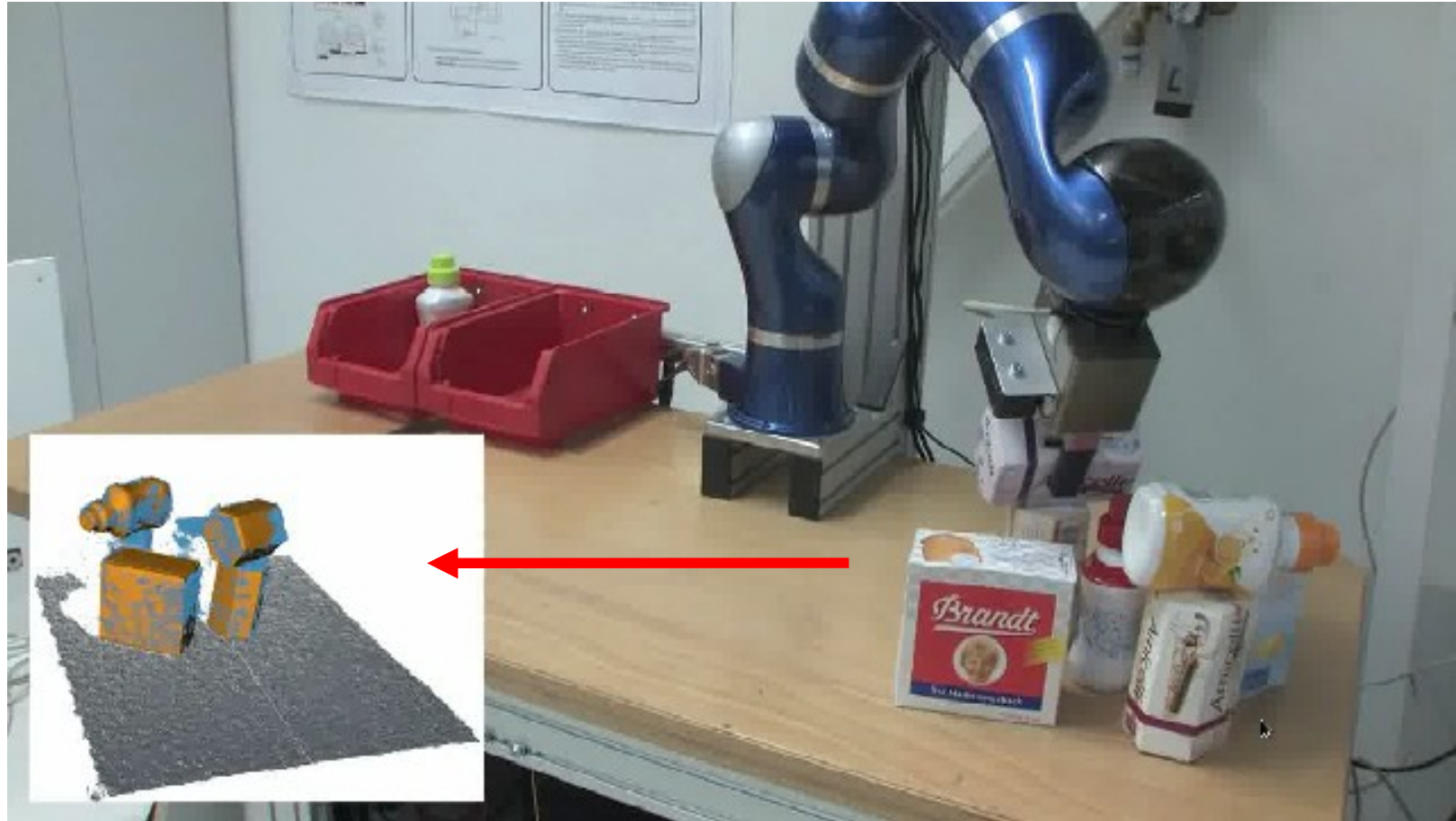
- Check if $T(M)$ matches the scene.

M is the model of
 $((\tilde{\mathbf{p}}_1, \tilde{\mathbf{n}}_1), (\tilde{\mathbf{p}}_2, \tilde{\mathbf{n}}_2))$



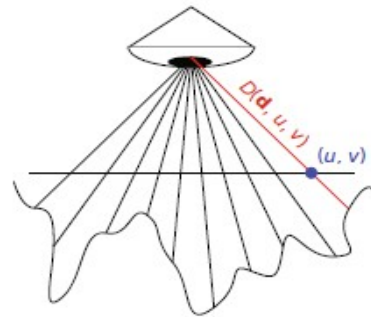
- If yes, accept $T(M)$.

Example of the System in Action

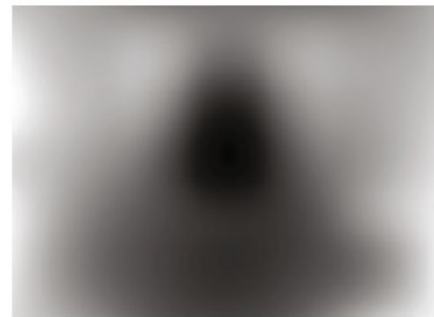


How to reconstruct 3D under poor texture condition?

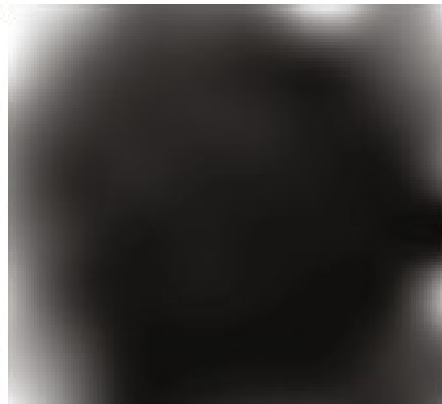
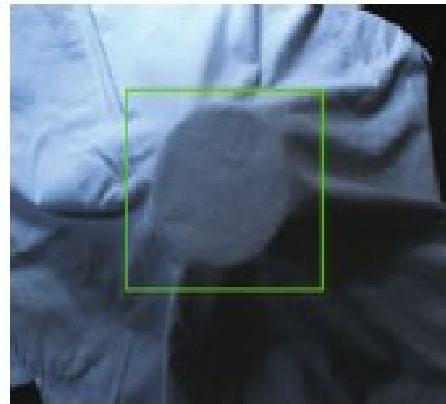
Problem: texture information is more sparse



(a) Schematic 2D view of a depth

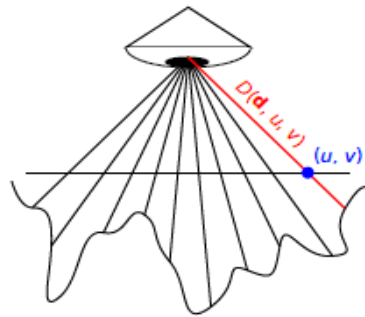


(b) Depth map for reconstructed face

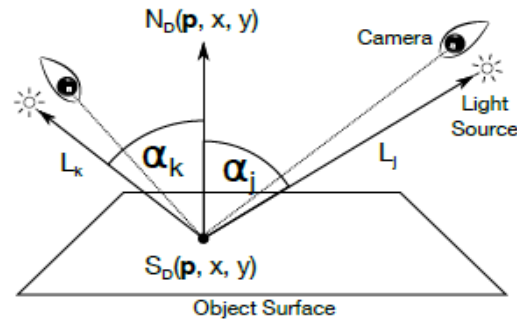


What can we do if the texture information is almost non-existent?

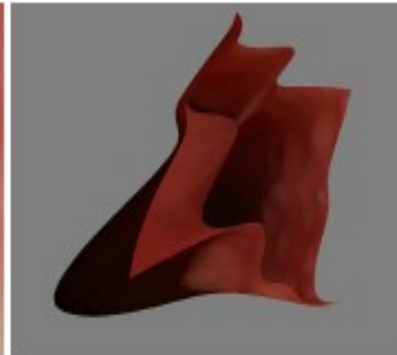
→ photogrammetric approach



(a) Concept of a depth map.



(b) Surface illumination.



Intensity-Based Methods

- **Established 3D reconstruction methods:**
 - Rely on presence of many reliable features
 - May perform very poor if this prerequisite is not met
 - Medical images are typically problematic
- **Solution approach: Intensity based methods**
 - Do not exclusively rely on salient image regions
 - Shaded regions, e.g., also contain information
 - Use all information that is there

Intensity-Based Bundle Adjustment

- Regular Bundle Adjustment equation:

$$\min_{\mathbf{a}, \mathbf{b}} \sum_{i=1}^n \sum_{j=1}^m d(\mathbf{Q}(\mathbf{a}_j, \mathbf{b}_i), x_{i,j})$$

- Finds camera parameters \mathbf{a} and point coordinates \mathbf{b}

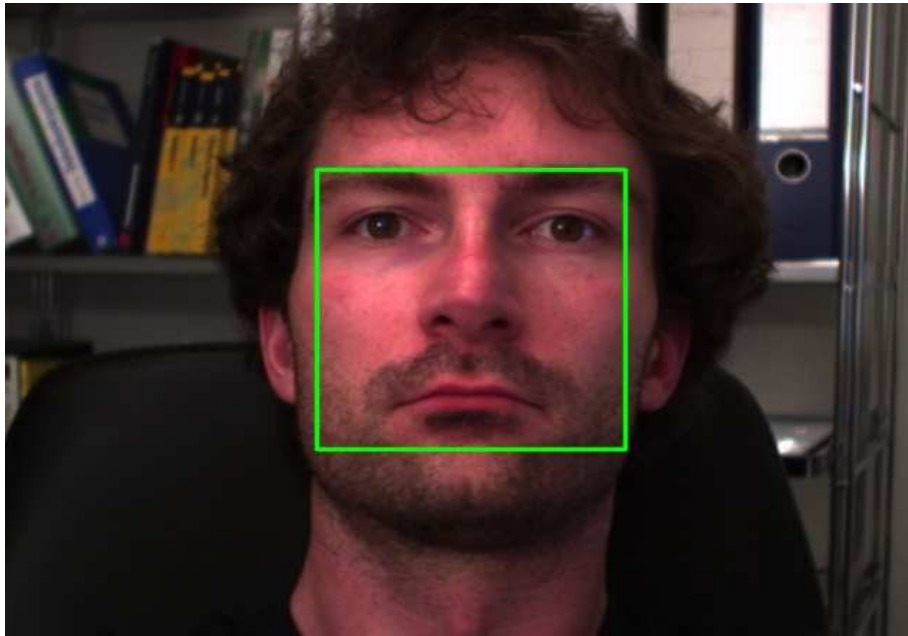
- Minimizes feature reprojection error

$$\min_{\mathbf{a}, \mathbf{b}} \sum_{i=1}^n \sum_{j=1}^m d(I_j(\mathbf{Q}(\mathbf{a}_j, \mathbf{b}_i)), I_0(\mathbf{p}_i))$$

- Intensity-Based Bundle Adjustment:
- Uses a regularizer: \mathbf{b} now describes a smooth surface
- Apart from that: Same, but minimizes intensity error

Reconstruction Example

- Works well under static lighting conditions and roughly Lambertian surfaces



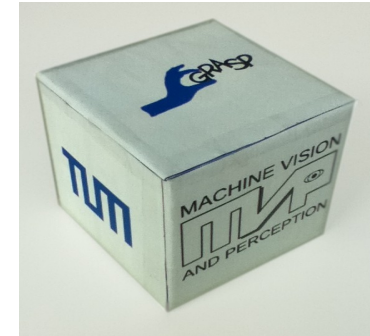
Ruepp and Burschka. Fast recovery of weakly textured surfaces from monocular image sequences. ACCV 2010

Estimation of Physical Properties in Predict-Act-Perceive loop

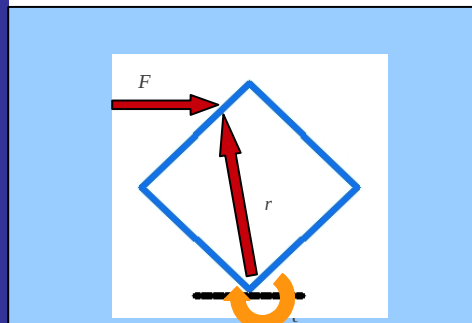
Estimation of the Center of mass

Estimation of Mass and Friction Force

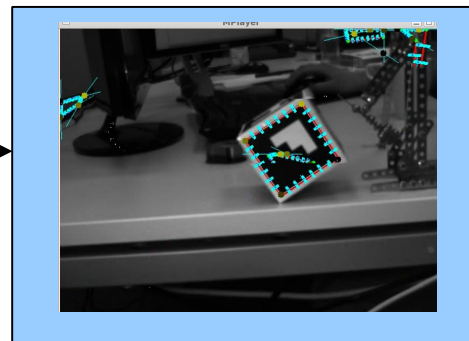
Estimation of Mass Distribution



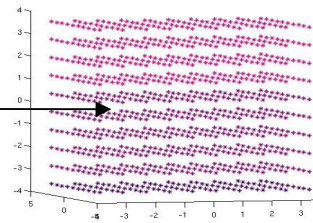
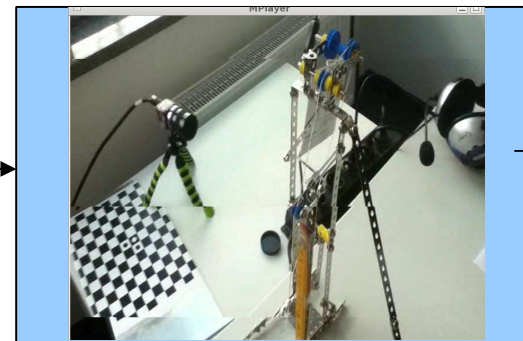
predict



act

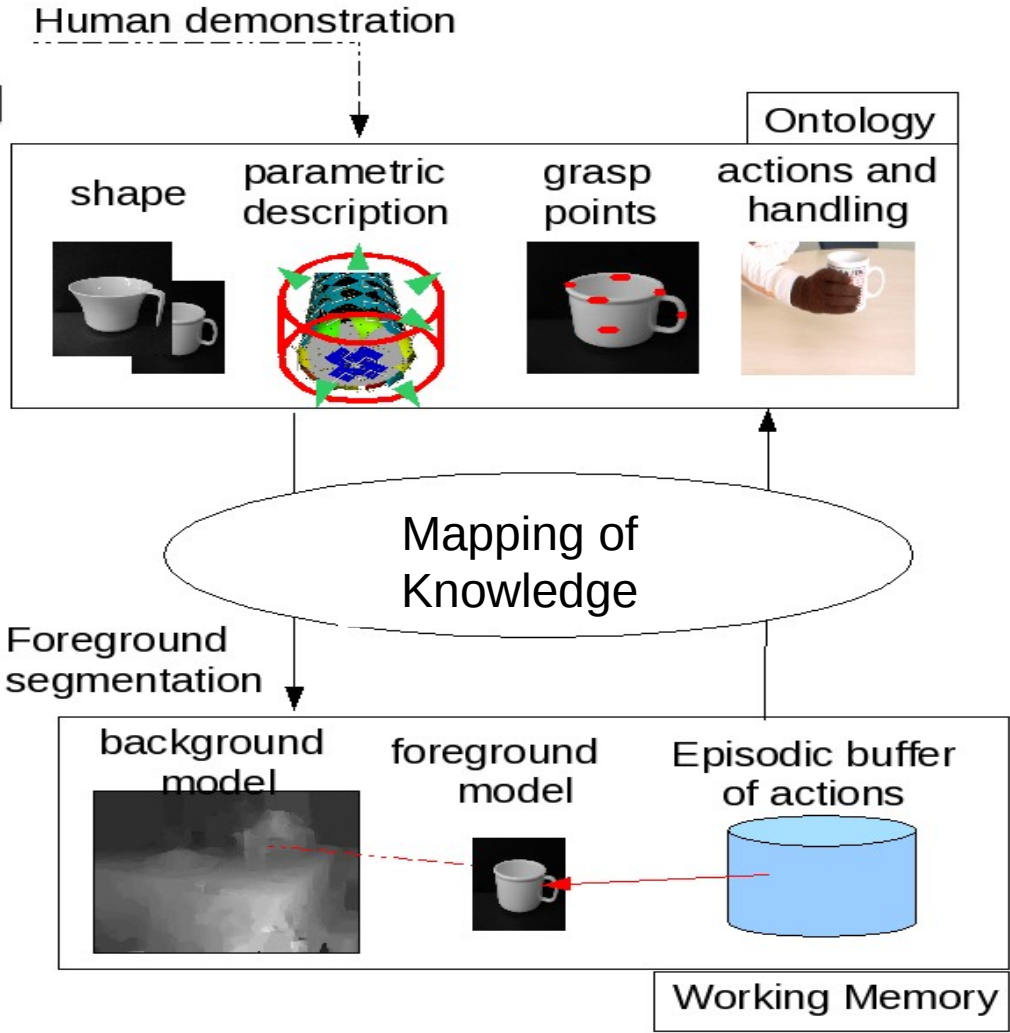


perceive

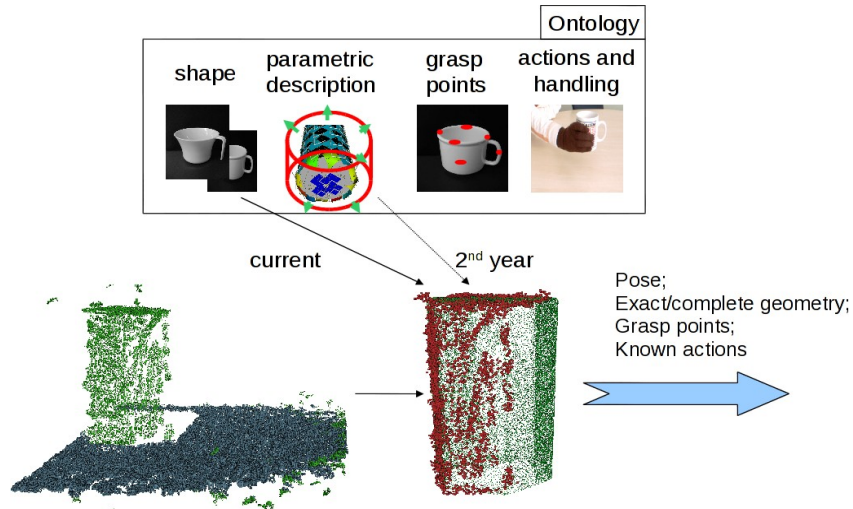


simulator

Knowledge Representation in WP5



Defining Foreground: Shape Matching



Indexing to the Atlas database needs to be extended to object classes

-> deformable shape registration needed (ACCV2010 - oral)

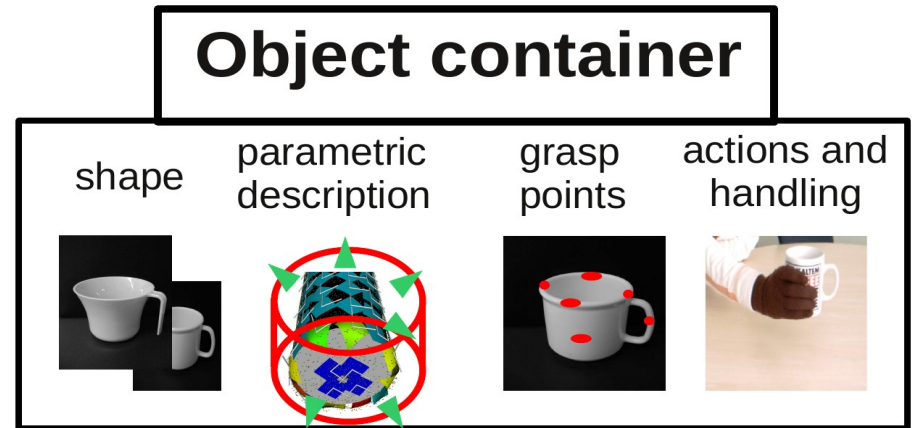
Object Container

Orientation

Max. allowed acceleration

Mass

Center of gravity



Functionality Map

Location Areas

Connection Properties

Pushed vs. lifted object

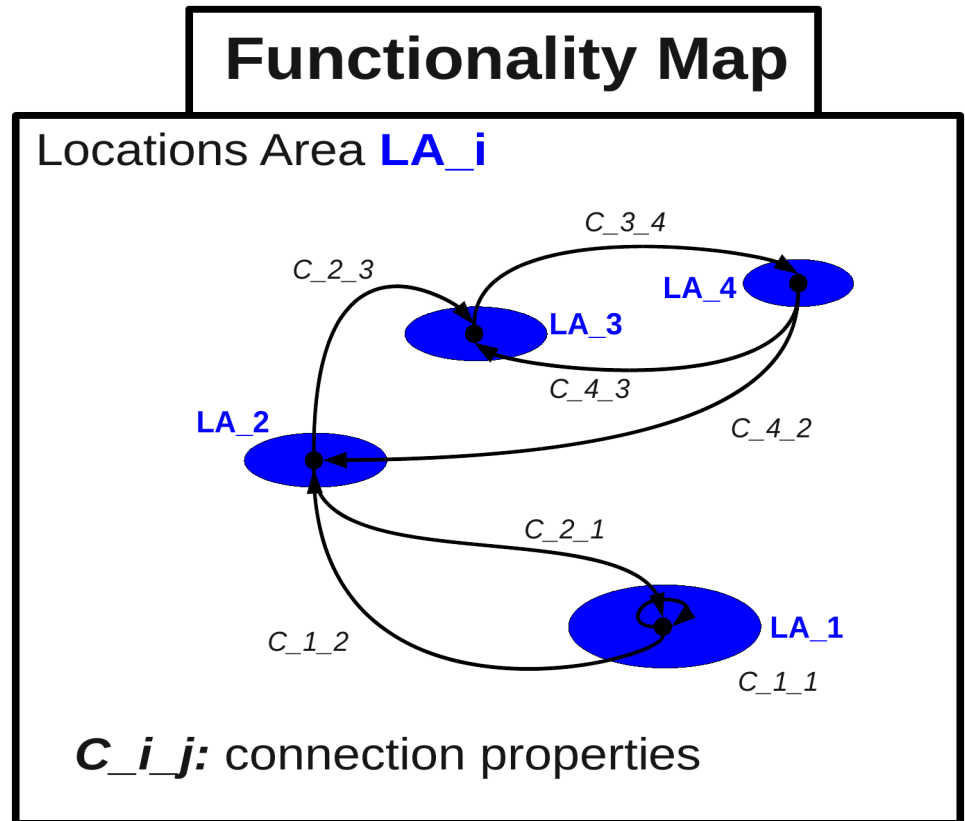
Arbitrary movement vs
movement with a
goal

Connection relevance

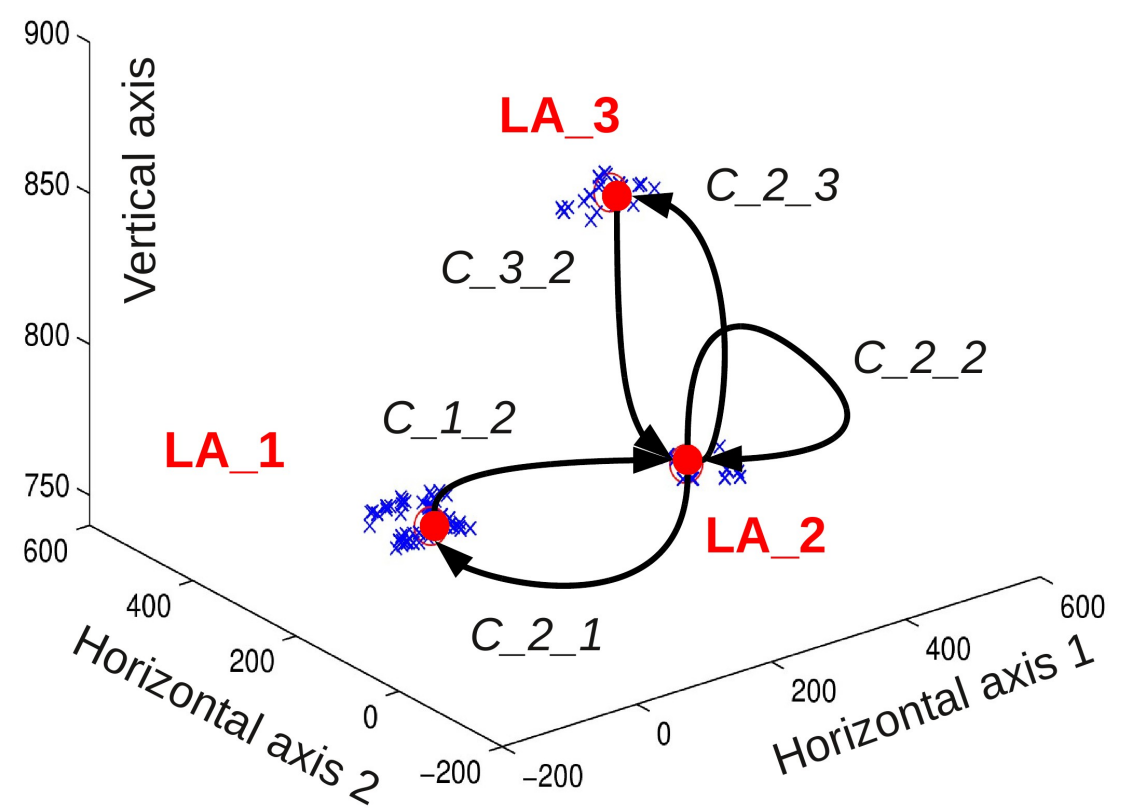
Velocity constraint
during pick-up

Grasp taxonomy

Approach vector



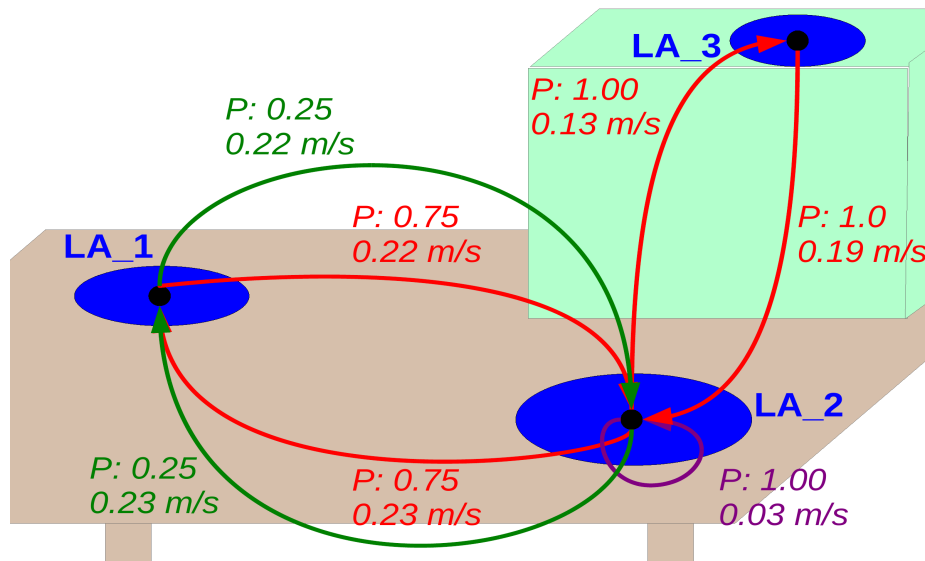
Basic Experiments: Location Areas (Tracking Data)



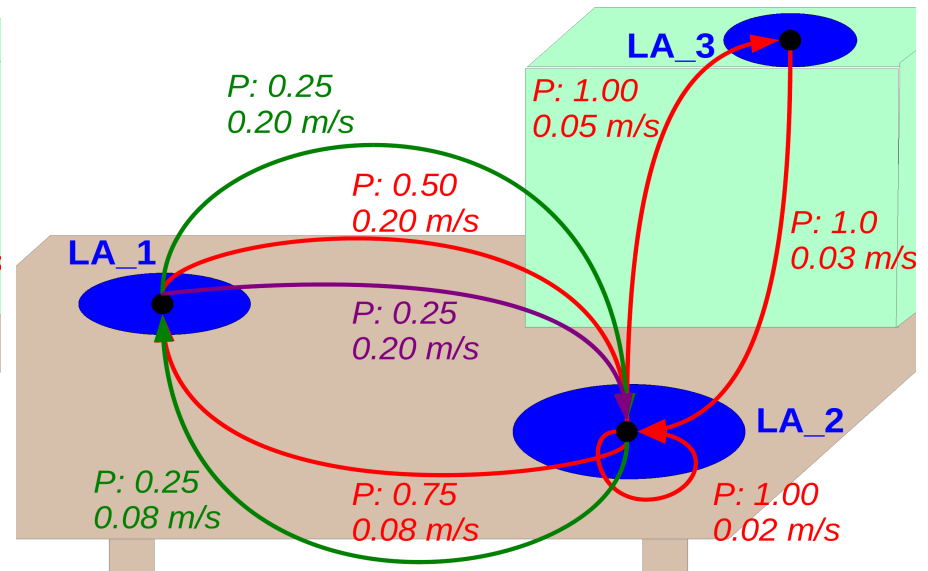
Legend:

- Location Area i with
- its corresponding center
- C_{i_j} Connecting edge from Location Area i to j

Basic Experiments: Functionality Maps (Tracking Data)



Milk carton



Cup - Handle

Red = goal, green = push, magenta = arbitrary

Entire System: Exemplary Trajectories

