## Towards Autonomous Visual-tactile Exploration and Manipulation

## Qiang Li, Robert Haschke and Helge Ritter

The sense of touch allows humans and higher animals to perform coordinated and efficient interactions within their environment. In last years, the resolution and sensitivity of tactile sensors only sufficed for basic force feedback during blind grasping [1]. However, tactile sensor arrays providing high spatial and temporal resolution as well as high sensitivity [2], [5] emerged recently.

We argue, that successful dexterous manipulation strongly depends on tight feedback loops integrating visual and tactile feedback. Due to the lack of appropriate tactile sensor devices, research so far focused mainly on planning-based approaches using few or no feedback at all. However, the advent of new tactile sensor devices asks for new control strategies to exploit this important and valuable sensory channel for grasping and manipulation tasks.

In our work, we implemented a control framework to realize a whole set of tactile and visual servoing tasks. This includes such simple tasks like tracking a touched object, maintaining both contact location and contact force, as well as more elaborate tasks like tracking an object's pose, tactile object exploration, or in-hand manipulation.

Aiming to handle unknown objects, all control primitives make as parsimonious assumptions about available prior knowledge as possible: Neither the object properties (shape, weight) nor contact properties (friction coefficients, softness) are assumed to be available. As an example application we consider in-hand manipulation of an unknown object, emphasizing coordinated manipulation motions of all fingers and surface exploration of a single finger for regrasping.

In previous work [3] we have shown in-hand manipulation in physics simulation only. The present paper extends this work to real-world experiments using  $16 \times 16$  tactile sensor arrays as large fingertips mounted on two KUKA LWR arms (see Fig. 1). In the first group of experiments, we demonstrate the following tasks: 1) contact point tracking, 2) tracking of object edge orientation, 3) following of an unknown object edge, and 4) exploring an unknown object surface. The second experiment is a direct transfer of our in-hand manipulation results from simulation to real-world: Visually tracking the object's pose employing a fiducial marker, we show how the tactile feedback can be exploited to realize robust "dual-finger" object manipulation. All experiments are documented in the accompanying video.

Our framework builds on a few basic control primitives: Exploiting robust feature extraction methods to estimate the



Fig. 1: Experimental setup consisting of two KUKA LWR arms with tactile sensors mounted as large fingertips.

2D contact position, the contact force, and the orientation of an object edge. We devised PID-type primitives to deliberatively control these variables. In all cases, a translating or rolling motion of the tactile sensor array is calculated in Cartesian space to reduce an observed error. Subsequently, a corresponding joint space motion is computed using inverse kinematics and executed on the robot using position control. Extending ideas of [4], a composite controller assures simultaneous control of position and force along the very same axes, e.g. when moving an object along the contact normals of an antipodal grasp.

To realize in-hand object manipulation, we follow ideas of [6], [7], assuming, that there is no sliding or rolling of contacts during manipulation. Rather, assuming that all contacts are moving coherently with the object, we can compute desired Cartesian contact motions to realize a given object motion. Combining this with tight control loops incorporating tactile force feedback, we can maintain stable contact forces and thus a stable grasp even in the presence of unmodelled rolling or sliding. In contrast to [6] visual feedback allows for accuracte pose control.

## REFERENCES

- [1] H. Dang, J. Weisz, and P. Allen. Blind grasping: Stable robotic grasping using tactile feedback and hand kinematics. In *Proc. ICRA*, 2011.
- [2] V.A. Ho, T. Nagatani, A. Noda, and S. Hirai. What can be inferred from a tactile arrayed sensor in autonomous in-hand manipulation? In *Proc. CASE*, pages 461–468, 2012.
- [3] Q. Li, Haschke, Bolder, and Ritter. Grasp point optimization by online exploration of unknown object surface. In *Proc. Humanoids*, 2012.
- [4] M.H. Raibert and J.J. Craig. Hybrid position/force control of manipulators. In Am. Soc. of Mechanical Engineers, Winter Meeting, 1980.
- [5] Carsten Schürmann, Risto Kõiva, and Robert Haschke. A modular highspeed tactile sensor for human manipulation research. In *IEEE World Haptics Conference*, Istanbul, 2011.
- [6] K. Tahara, S. Arimoto, and M. Yoshida. Dynamic object manipulation using a virtual frame by a triple soft-fingered robotic hand. In *Proc. ICRA*, pages 4322–4327, 2010.
- [7] Th. Wimboeck, Ch. Ott, and G. Hirzinger. Passivity-based object-level impedance control for a multifingered hand. In *Proc. IROS*, 2006.

Q. Li, R. Haschke and H. Ritter are with the Neuroinformatics Group, Cognitive Interaction Technology-Center of Excellence (CITEC), Bielefeld University, Germany. {qli,rhaschke,helge}@techfak.uni-bielefeld.de