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REAL-TIME HUMAN HAND POSE ESTIMATION AND TRACKING USING DEPTH SENSORS

Abstract

The human hand has become an important interaction tool in computer systems. Using the articulated hand skeleton for interaction was a challenge until the development of input devices and fast computers. In this thesis, we develop model-based super real-time methods for articulated human hand pose estimation using depth sensors. We use Randomized Decision Forest (RDF) based methods for feature extraction and inference from single depth image. We start by implementing shape recognition using RDFs. We extend the shape recognition by considering a multitude of shapes in a single image representing different hand regions centered around different joints of the hand. The regions are utilized for joint position estimation by running mean shift mode finding algorithm (RDF-C). We combine shape recognition and joint estimation methods in a hybrid structure for boosting the quality. RDFs, when used for pixel classification are not resistant to self-occlusion. We overcome this by skipping the classification, and directly inferring the joint positions using regression forests. These methods assume joints are independent, which is not realistic. Therefore, we conclude our single image based framework by considering the geometry constraints of the model (RDF-R+). The accuracies at 10 mm acceptance threshold are acquired for synthetic and real datasets. Comparing RDF-C and RDF-R+ methods respectively, we report significant accuracy increase. We finally extend single image methods to tracking dynamic gestures. We learn the grasping motion from synthetic data by extracting a manifold, and fix RDF estimations by projecting them onto the manifold. We then track the projections by using a Kalman Filter.

PUBLICATIONS

Book Chapters:

- 1 C. Keskin, **F. Kırac**, Y. E. Kara, L. Akarun, "Real-time Hand Pose Estimation Using Depth Sensors", Consumer Depth Cameras for Computer Vision: Research Topics and Applications, 2012.

International Journal Publications:

- 1 **F. Kırac**, Y. E. Kara, L. Akarun, "Hierarchically Constrained 3D Hand Pose Estimation using Regression Forests from Single Frame Depth Data", Pattern Recognition Letters - Special Issue on Depth Image Analysis, 2013.

International Conference / Workshop Publications:

- 1 C. Keskin, **F. Kırac**, Y. E. Kara, L. Akarun, "Hand Pose Estimation and Hand Shape Classification using Multi-layered Randomized Decision Forests", In Proceedings of ECCV, 2012.
- 2 C. Keskin, **F. Kırac**, Y. E. Kara, L. Akarun, "Randomized decision forests for static and dynamic hand shape classification", In Proceedings of CVPR, Gesture Recognition Workshop, 2012.
- 3 A. A. Kındıroğlu, R. Yorgancı, **F. Kırac**, M. Aydın, M. Hruz, H. Köse, L. Akarun, "Multimodal Sign Language Game Interface", In Proceedings of eINTERFACE, The Summer Workshop on Multimodal Interfaces, 2011.

- 4 C. Keskin, **F. Kır a **, Y. E. Kara, L. Akarun, "Real Time Hand Pose Estimation using Depth Sensors", In Proceedings of IEEE ICCV Workshop on Consumer Depth Cameras, 2011.
- 5 C. Keskin, İ. Arı, T. Eren, **F. Kır a **, L. Rybok, H. Ekenel, R. Stiefelhagen, L. Akarun, "Vision Based Hand Puppet", In Proceedings of eNTERFACE 2010, The Summer Workshop on Multimodal Interfaces, 2010, p. 10-17.
- 6 **F. Kır a **, Ü. Bilge, M. Kurtulan, "Genetic Algorithm Approach to Parallel Machine Total Tardiness Problem", In Proceedings of EUROINFORMS, İstanbul, 2003. [\[PPT\]](#)

National Conference Publications:

- 1 **F. Kır a **, Y. E. Kara, C. Keskin, L. Akarun, "Depth Image Based 3D Hand Pose Estimation Framework", In Proceedings of SİU 2012.
- 2 C. Keskin, **F. Kır a **, Y. E. Kara, L. Akarun, "3D Hand Pose Estimation and Classification Using Depth Sensors", In Proceedings of SİU 2012.
- 3 **F. Kır a **, L. Akarun, "Real-time Pose Tracking Based on a 3D Skeletal Model Using Multiple Cameras", In Proceedings of SİU 2011.
- 4 **F. Kır a **, L. Akarun, "Human Hand Tracking in Image Sequence using Particle Filters", In Proceedings of SİU 2005.

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