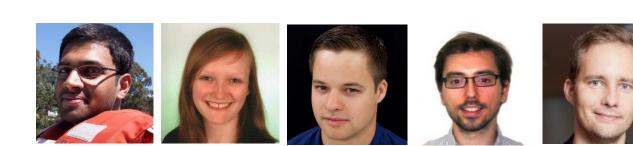
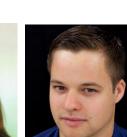


Real-time Joint Tracking of a Hand Manipulating an Object from RGB-D Input









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Michael Zollhöfer¹ Christian Theobalt¹





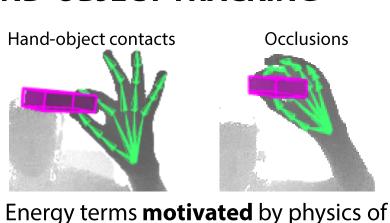
We need to increase the expressiveness of interaction beyond controllers and simple gestures.

Joint Hand-Object Tracking ADVANTAGES Dexterous (26+ DOFs) • Extreme occlusions by objects Haptic feedback

- **CHALLENGES**
- Complex and fast motions Segmentation of hand from object
- **High dimensional** problem
- Run time constraint

NOVEL FRAMEWORK FOR REAL-TIME HAND-OBJECT TRACKING





grasps

Multi-layered random forests for handobject **segmentation**

Contributions

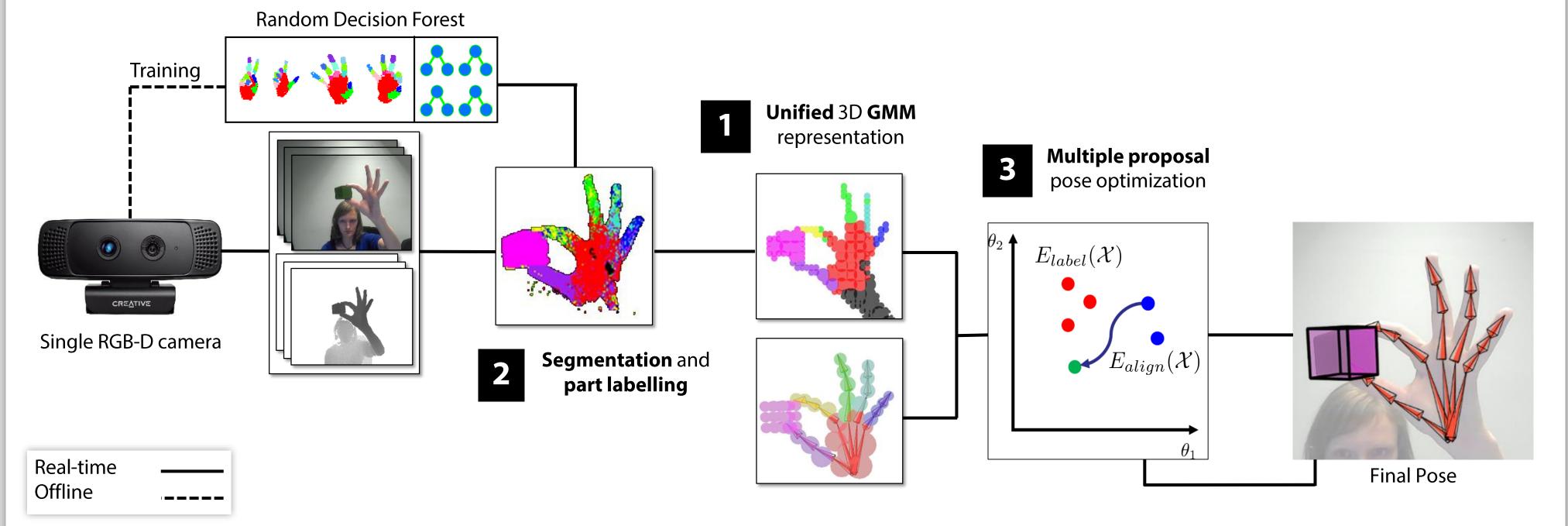
PRACTICAL







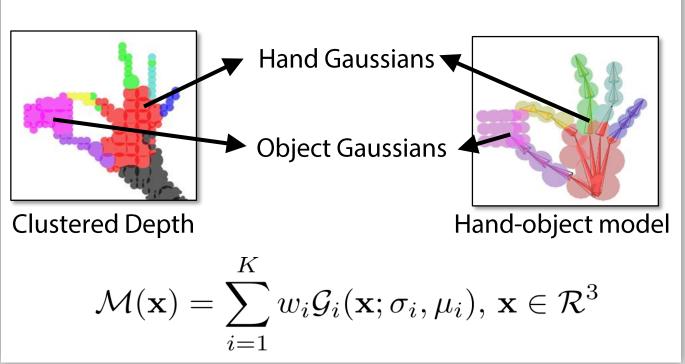
Supports objects of different shapes, sizes, and colors.



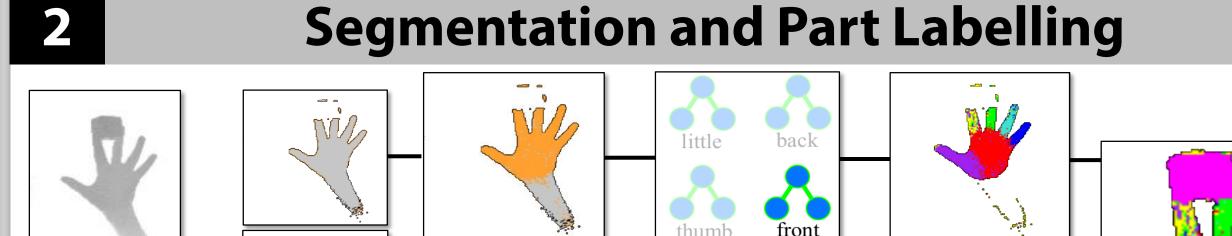
Skilled

movements

GMM Representation



RESULTS ON DATA FROM TZIONAS ET AL. (IJCV 2016)



Layer 1: Hand-arm

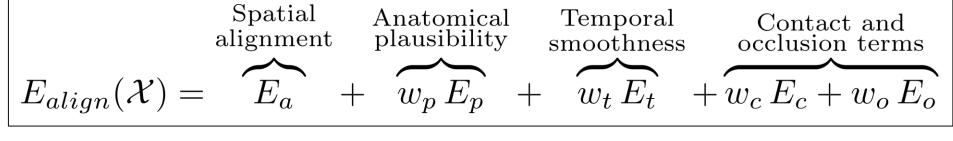
labelling segmentation (from previous frame) Color-based hand-object Final segmentation segmentation

Viewpoint classification

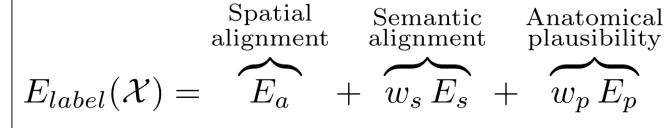
Layer 2: Hand part

Multiple Proposal Pose Optimization

OBJECTIVE 1:



OBJECTIVE 2:



SPATIAL ALIGNMENT

 $E_a(\mathcal{X}) = \int_{\Omega} \left[\left(\mathcal{M}_{d_h}(\mathbf{x}) - \mathcal{M}_h(\mathbf{x}) \right)^2 \right]$ $+ \left(\mathcal{M}_{d_o}(\mathbf{x}) - \mathcal{M}_o(\mathbf{x}) \right)^2 d\mathbf{x}$

Aligns model and input 3D Gaussian mixtures

ALIGNMENT

SEMANTIC

 $E_s(\mathcal{X}) = \sum_{i=1}^{N_s} \sum_{j=1}^{N_d} \alpha_{i,j} \cdot ||\boldsymbol{\mu}_i - \boldsymbol{\mu}_j||_2^2$

Aligns GMMs with semantic label information

CONTACT **POINTS**

 $E_c(\mathcal{X}) = \sum_{(k,l,t_d)\in\mathcal{T}} \left(||\boldsymbol{\mu}_k - \boldsymbol{\mu}_l||^2 - t_d^2 \right)^2$

Enforces contact between fingertip and object Gaussians that are close

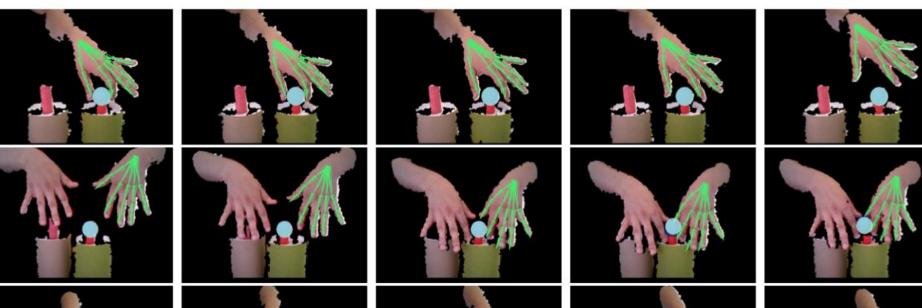
OCCLUSION HANDLING

 $E_o(\mathcal{X}) = \sum_{i=0}^{N_n} \sum_{j \in \mathcal{H}_i} (1 - \hat{f}_i) \cdot ||x_j - x_j^{old}||_2^2$

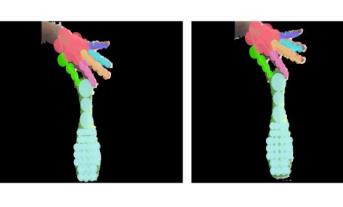
Forces occluded parts of the hand to move consistently with other parts

LIVE CAPTURE SETUP

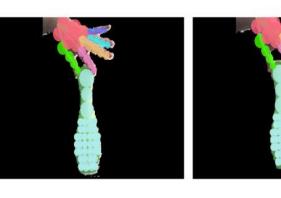
Results

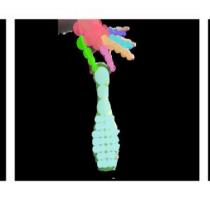


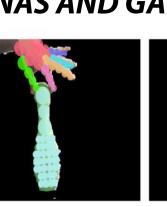
RESULTS ON DATA FROM TZIONAS AND GALL (ICCV 2015)

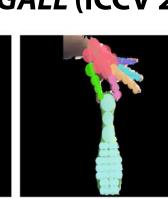


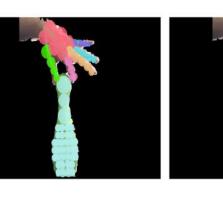
REAL-TIME TRACKING

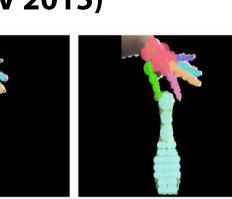


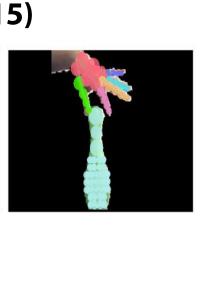


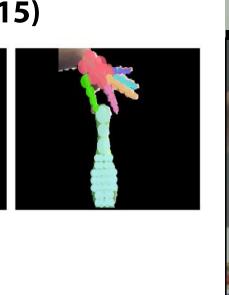


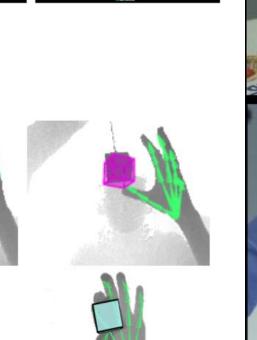




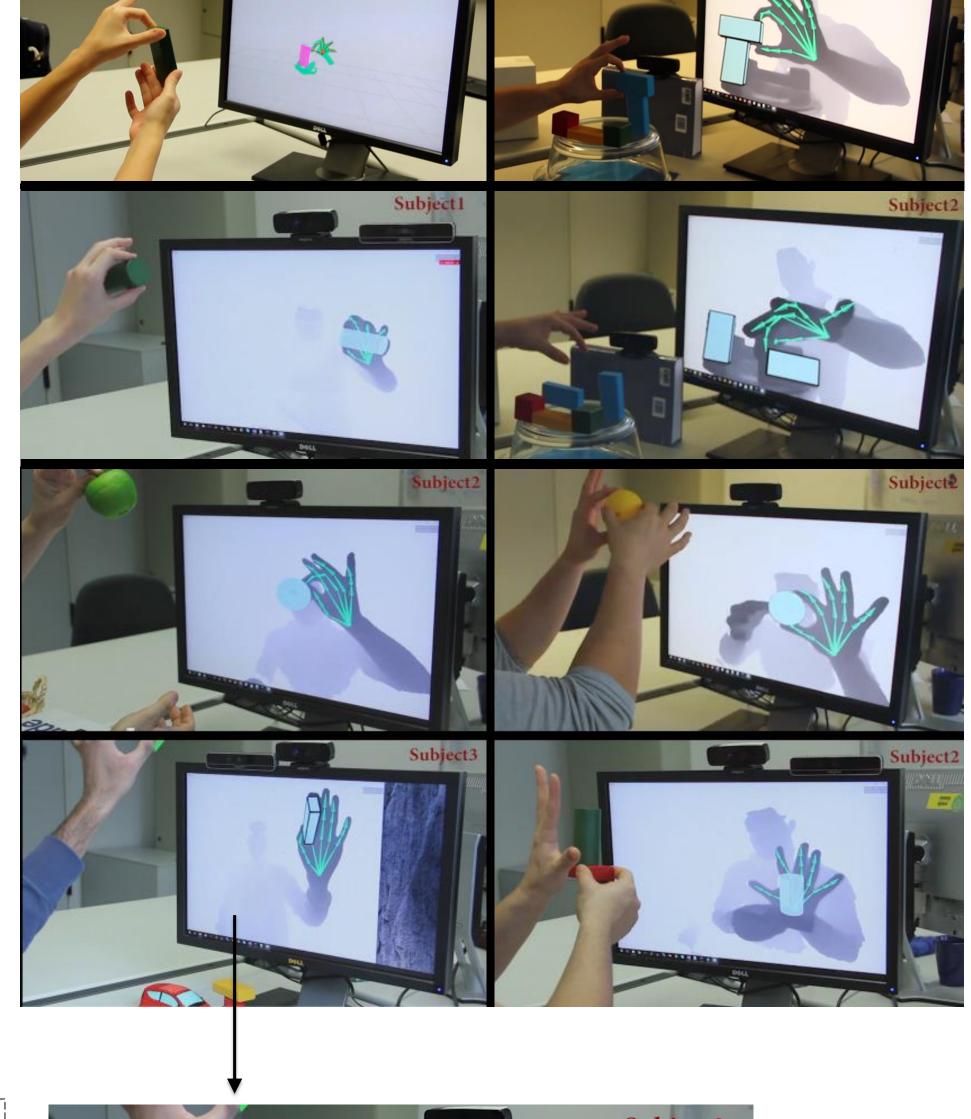




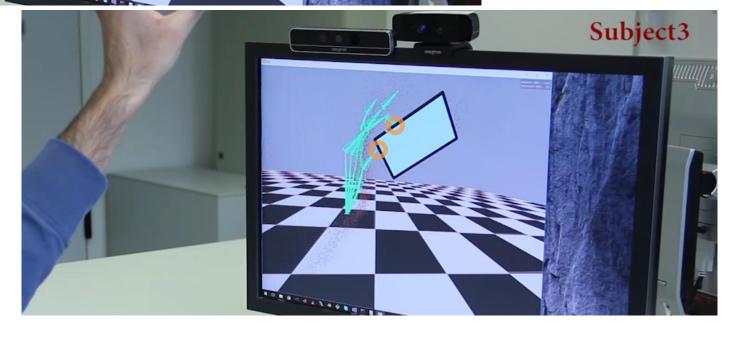


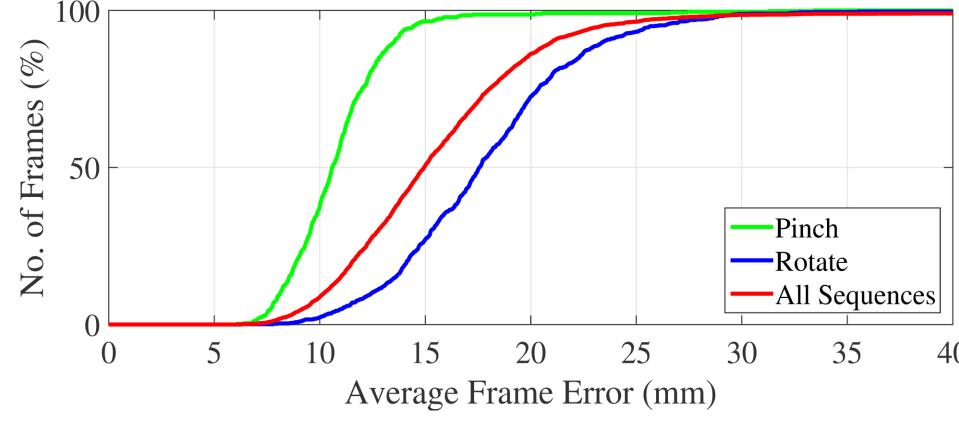


Tablet with video goes here

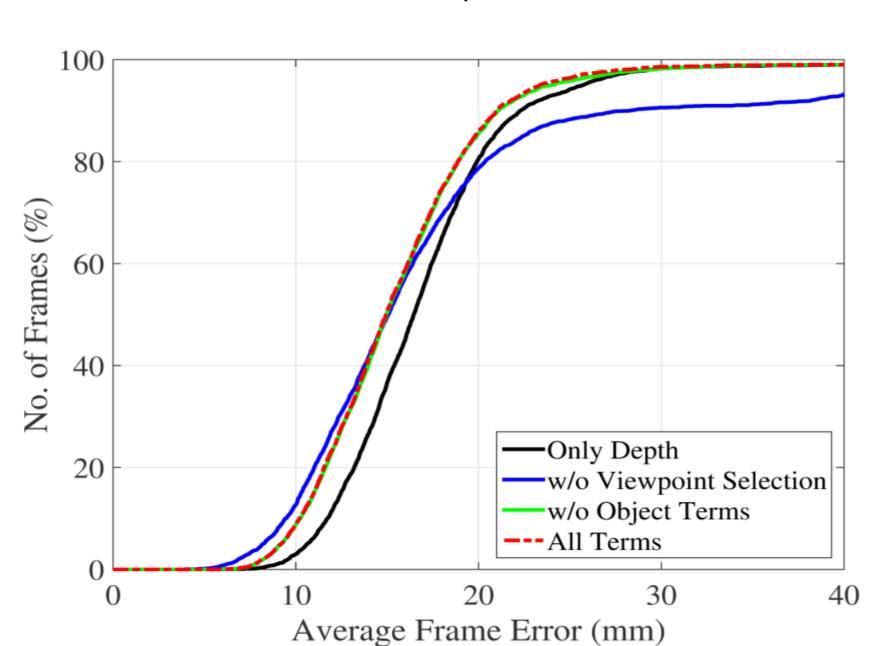


Subject3 **HAND-OBJECT CONTACT CONSTRAINTS**





Tracking consistency for the best, worst and average case in Dexter+Object. We are consistently below 30 mm.



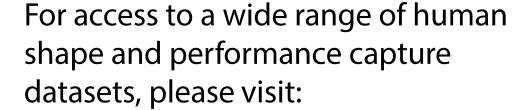
Ablative analysis with different terms disabled shows robustness of our method.

- Runs at 30 FPS
- Objects of various shapes and sizes
- Works with different users
- Average joint position error of **15.7 mm** on Dexter+Object
- 3D Gaussian mixture alignment improves hand-only tracking results on Dexter by 2 mm













handtracker.mpi-inf.mpg.de