

CVFH

Clustered **V**iewpoint **F**eature **H**istogram

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1. Introduction

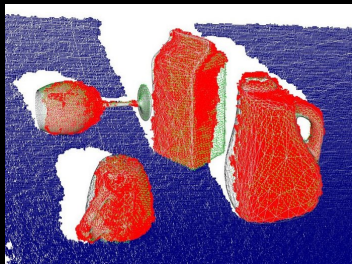
2. VFH

3. CVFH

4. Roll histogram

5. Results

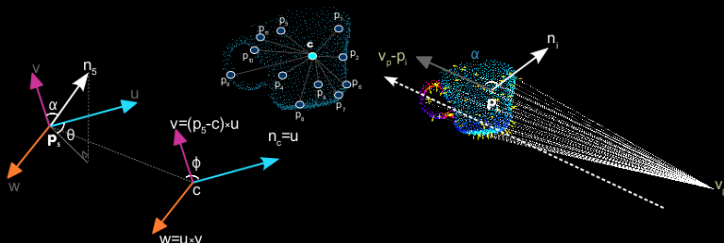
- ▶ **Goal:** Object recognition + 6D pose



- ▶ **Context:**
 - ▶ object manipulation (0.5m - 1.5m)
 - ▶ efficient
 - ▶ robust to noise and missing parts/partial occlusions
 - ▶ training on synthetic data (CAD models)
 - ▶ recognition using Kinect sensor

Viewpoint Feature Histogram

- ▶ Based our work on VFH
- ▶ Encodes the surface of the object and the viewpoint
 - ▶ Relative to the centroid and the average of the normals
- ▶ Efficient to compute



Problems with VFH

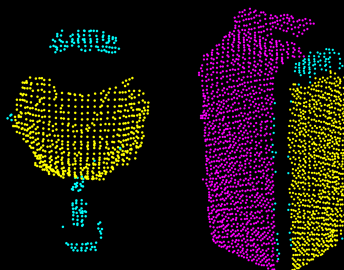
- ▶ Invariant to size of the object
- ▶ Invariant to rotation about the roll axis of the camera.
- ▶ Very sensitive to missing parts
 - ▶ Segmentation / Partial occlusions / Noisy parts



- ▶ Our synthetic training data is perfect!

Clustering

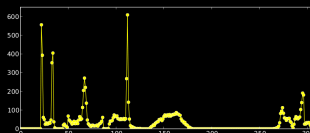
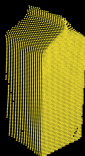
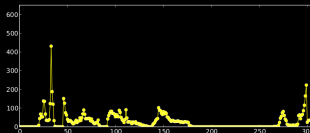
- ▶ Parts based model
- ▶ Smooth region growing using position + normal information



$$\exists p_j \in C_k : ||p_i - p_j|| < t_d \wedge n_i \cdot n_j > t_n$$

- ▶ Use each region's average normal and centroid
- ▶ ... to compute a CVFH descriptor

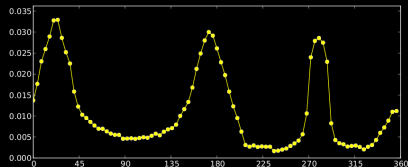
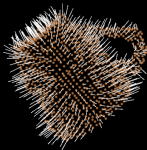
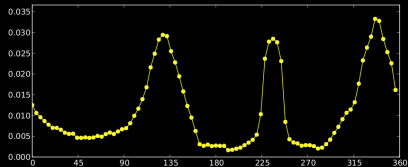
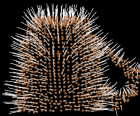
- ▶ Histograms are not normalized (variant to objects' size)
- ▶ Each bin represents number of points



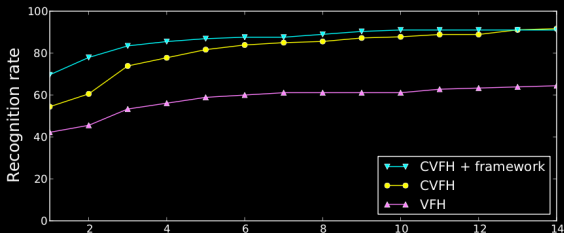
- ▶ Histogram metric robust to outliers:

$$d(A, B) = 1 - \frac{1 + \sum_{i=1}^{308} \min(A_i, B_i)}{1 + \sum_{i=1}^{308} \max(A_i, B_i)}$$

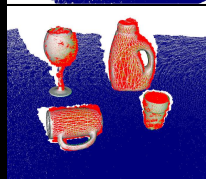
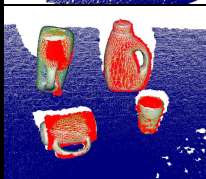
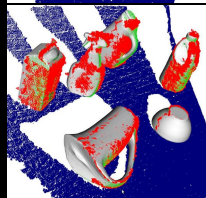
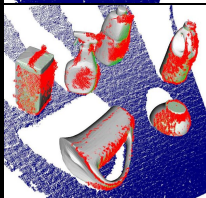
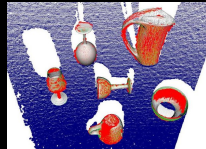
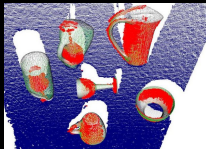
- ▶ Use normal information projected on the view plane
- ▶ Cross correlation maximization problem (FFT)



- ▶ Recognition results for 18 out of 44 objects in our training set.
- ▶ Improvement over VFH (first - 28.9%, top10 - 43.6%).
- ▶ Reduce from 1704 to top-10 views in 2ms using FLANN.



- ▶ Framework involves ICP (10 iter.) for N models.
- ▶ Inliers count and reordering.



Integration with the manipulation pipeline

- ▶ Replace current object detection with CVFH.
- ▶ Object recognition in any pose given segmentation.
- ▶ Good segmentation improves CVFH. Other way around?

