



*Computational Vision and
Geometry Lab*



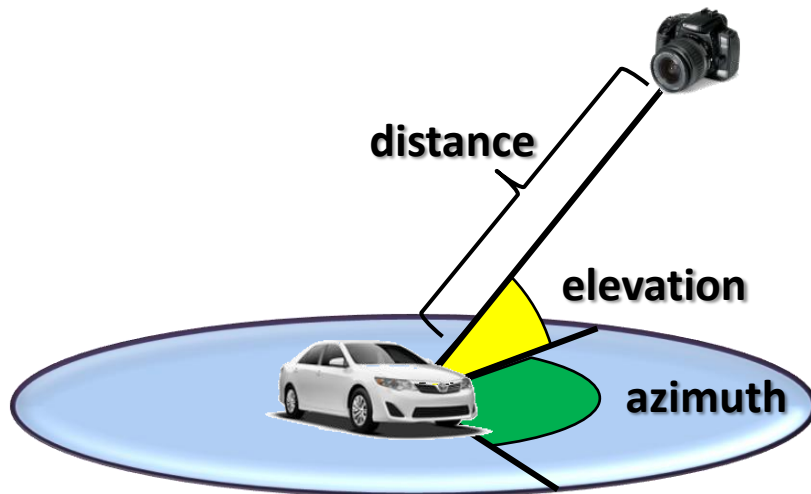
Beyond PASCAL: A Benchmark for 3D Object Detection in the Wild

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Goal

- Build a large scale dataset for 3D object detection and pose estimation



3D Object Dataset

	#category	#instance	Non-centered objects	Dense viewpoint	3D Shape
3D Object [1]	10	100	✗	✗	✗



[1] S. Savarese and L. Fei-Fei. 3d generic object categorization, localization and pose estimation. In ICCV, 2007.

EPFL Car Dataset

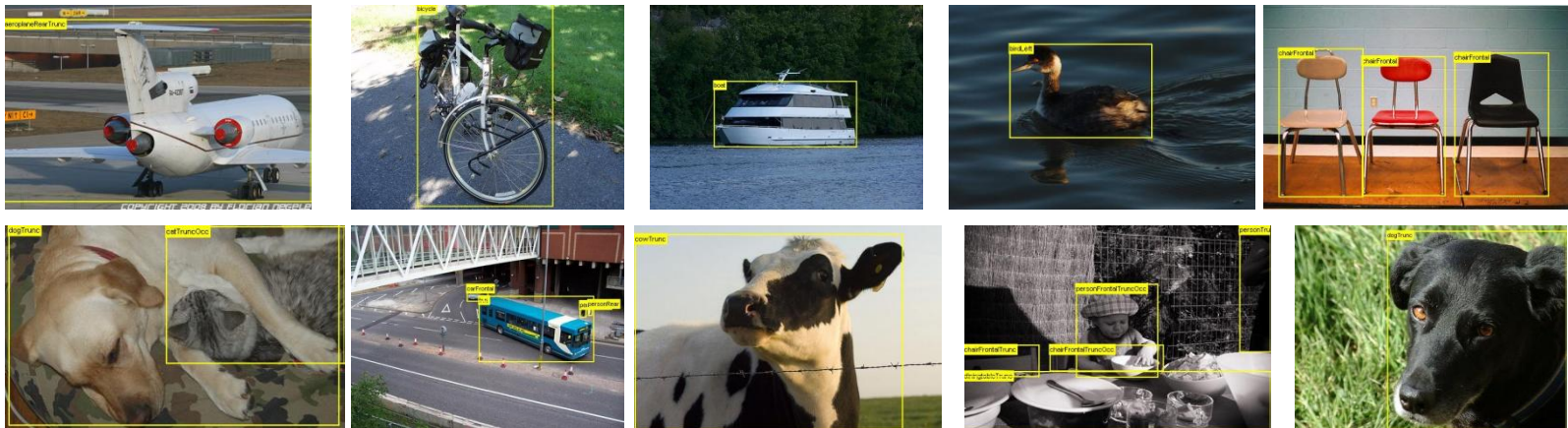
	#category	#instance	Non-centered objects	Dense viewpoint	3D Shape
3D Object [1]	10	100	✗	✗	✗
EPFL Car [2]	1	20	✗	✓	✗



[2] M. Ozuysal, V. Lepetit, and P. Fua. Pose estimation for category specific multiview object localization. In CVPR, 2009.

PASCAL VOC Dataset

	#category	#instance	Non-centered objects	Dense viewpoint	3D Shape
3D Object [1]	10	100	✗	✗	✗
EPFL Car [2]	1	20	✗	✓	✗
PASCAL VOC [3]	20	27,450	✓	✗	✗



[3] M. Everingham, L. Van Gool, C. K. I. Williams, J. Winn, and A. Zisserman. The pascal visual object classes (voc) challenge. IJCV, 2010.

KITTI Dataset

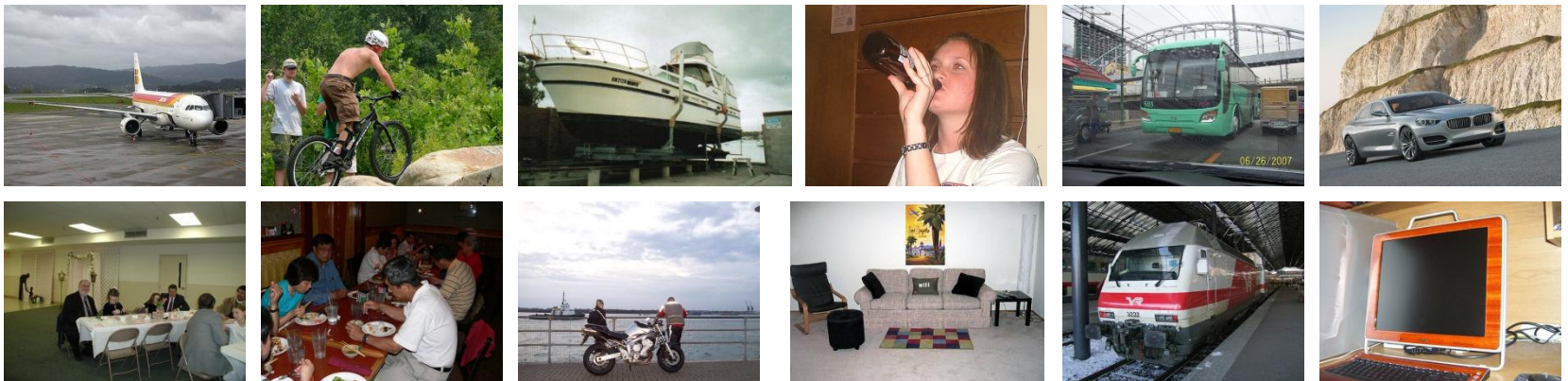
	#category	#instance	Non-centered objects	Dense viewpoint	3D Shape
3D Object [1]	10	100	✗	✗	✗
EPFL Car [2]	1	20	✗	✓	✗
PASCAL VOC [3]	20	27,450	✓	✗	✗
KITTI [4]	3	80,256	✓	✓	✗



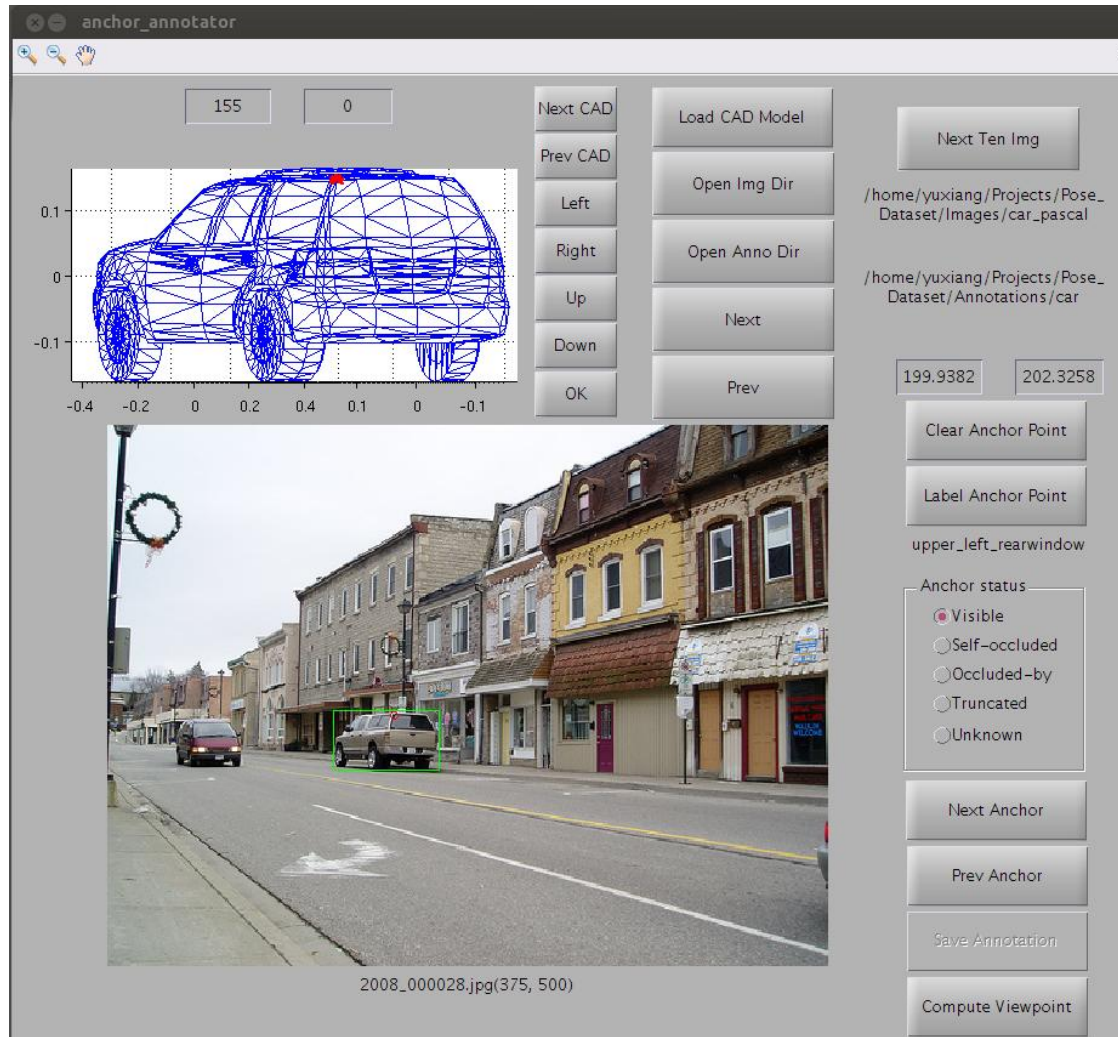
[4] A. Geiger, P. Lenz, and R. Urtasun. Are we ready for autonomous driving? the kitti vision benchmark suite. In CVPR, 2012.

Our Contribution: PASCAL3D+

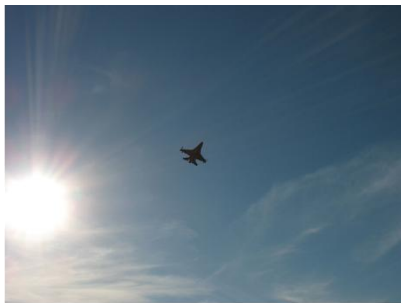
	#category	#instance	Non-centered objects	Dense viewpoint	3D Shape
3D Object [1]	10	100	✗	✗	✗
EPFL Car [2]	1	20	✗	✓	✗
PASCAL VOC [3]	20	27,450	✓	✗	✗
KITTI [4]	3	80,256	✓	✓	✗
PASCAL3D+ (Ours)	12	30,899	✓	✓	✓



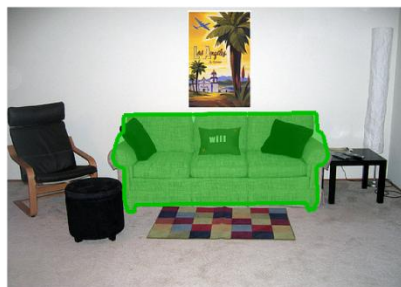
Annotation Tool



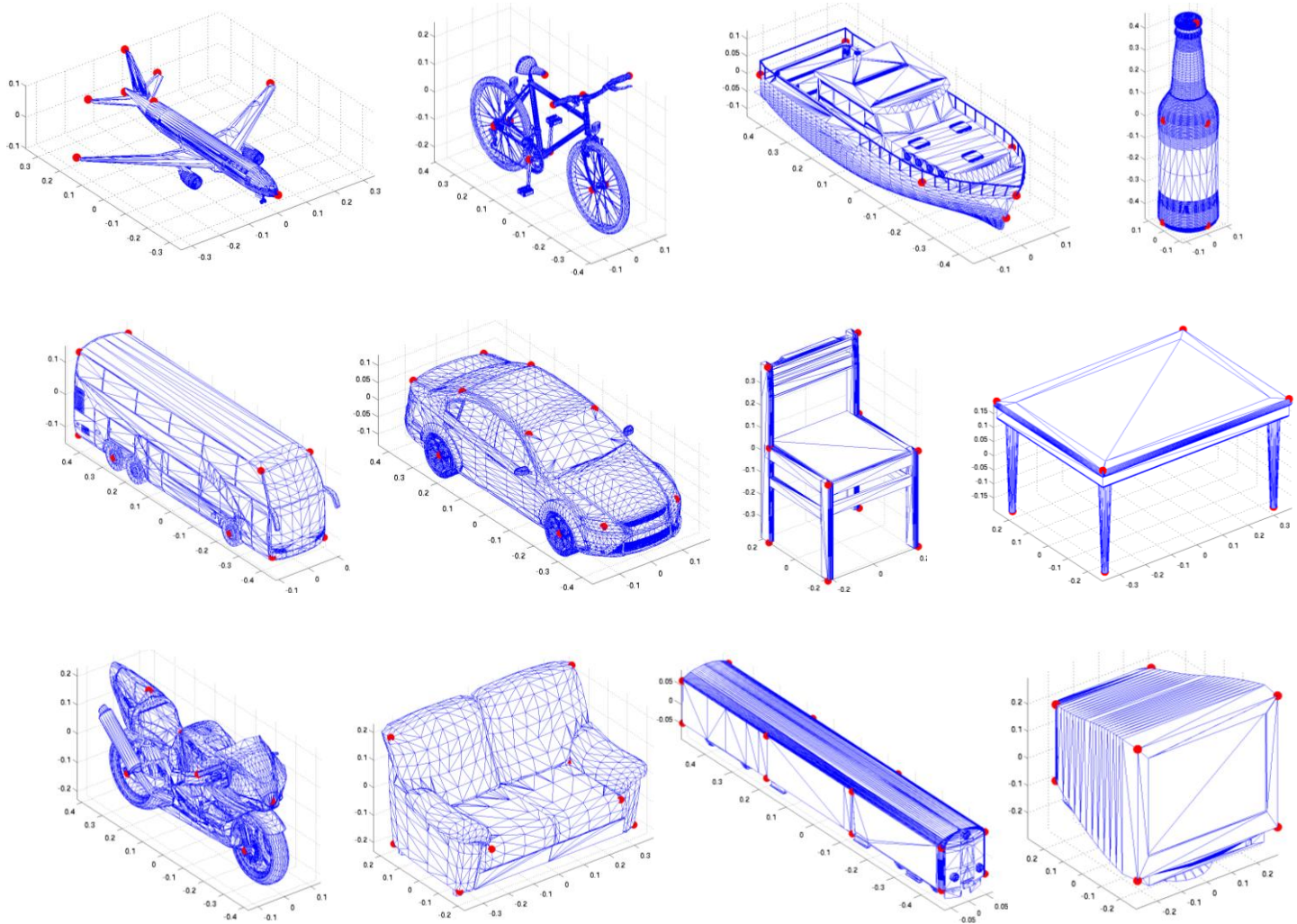
CAD alignment



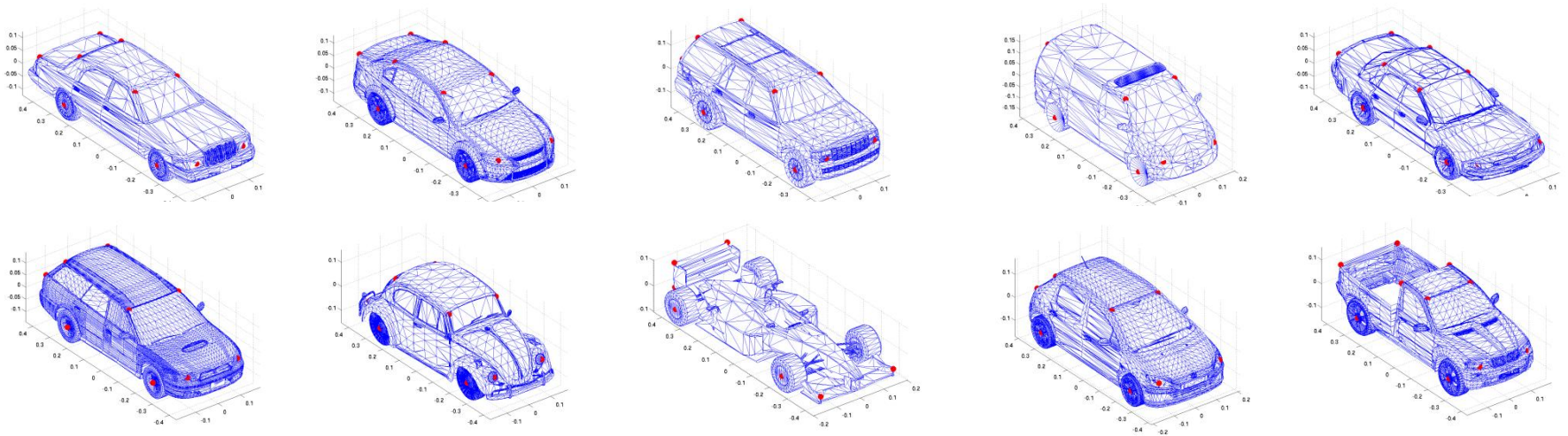
CAD alignment



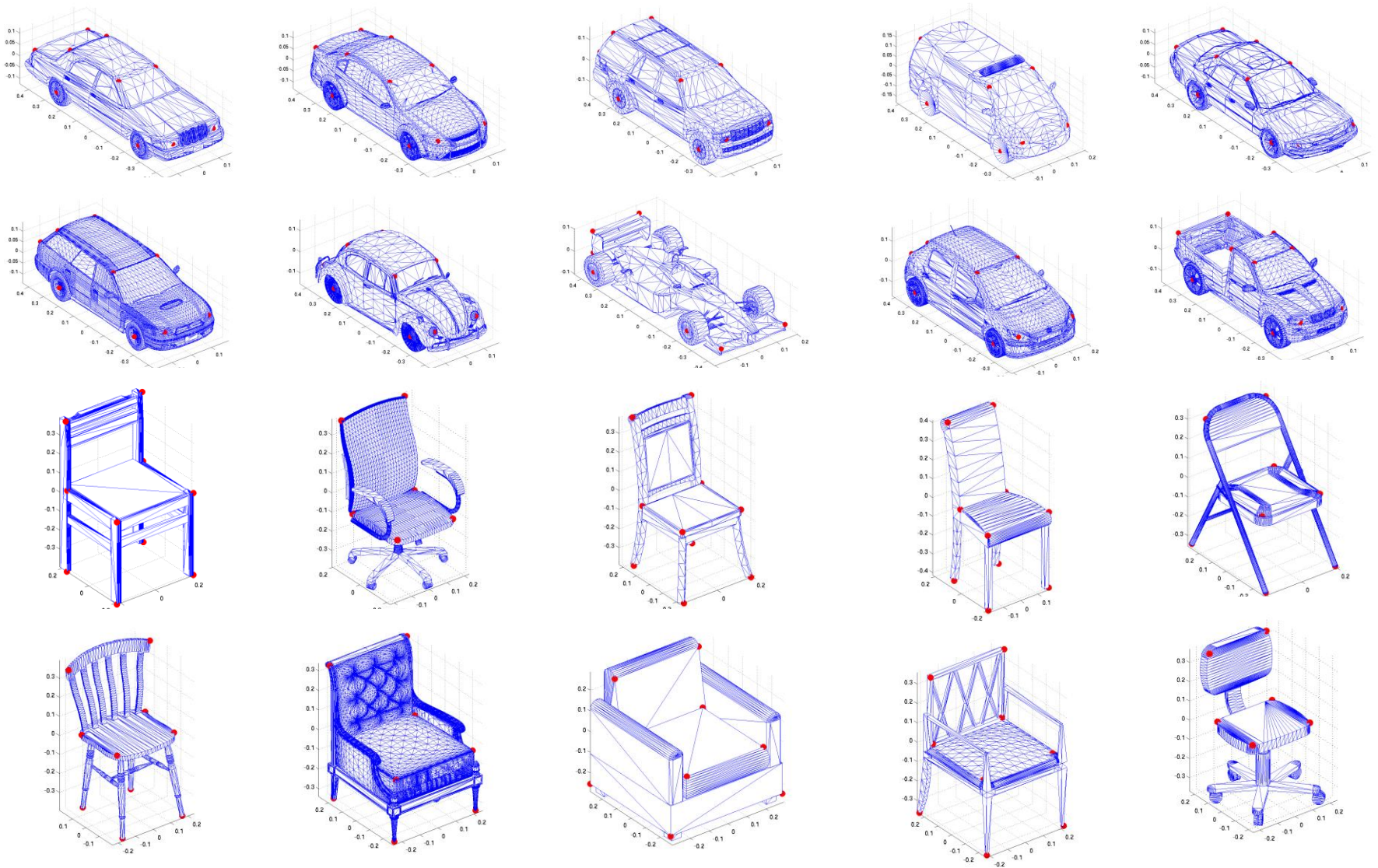
CAD Models



CAD Models

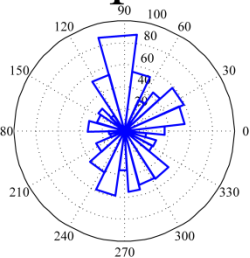


CAD Models

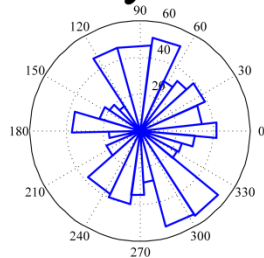


Statistics

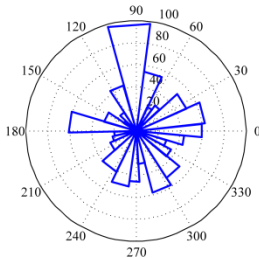
aeroplane



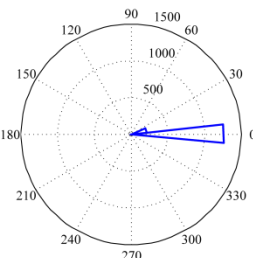
bicycle



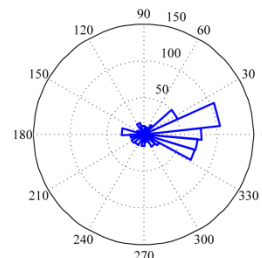
boat



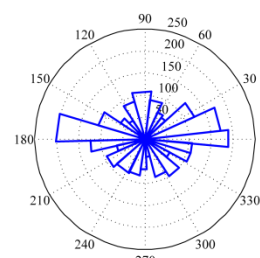
bottle



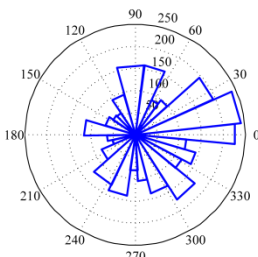
bus



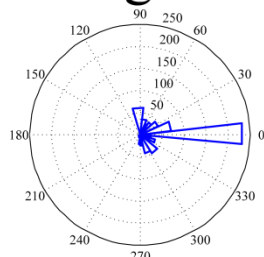
car



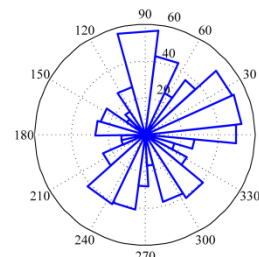
chair



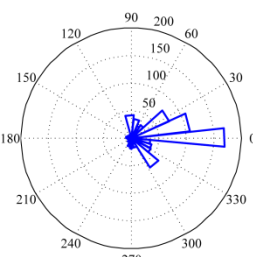
diningtable



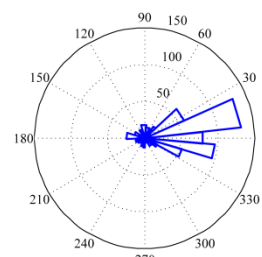
motorbike



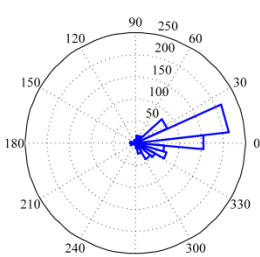
sofa



train

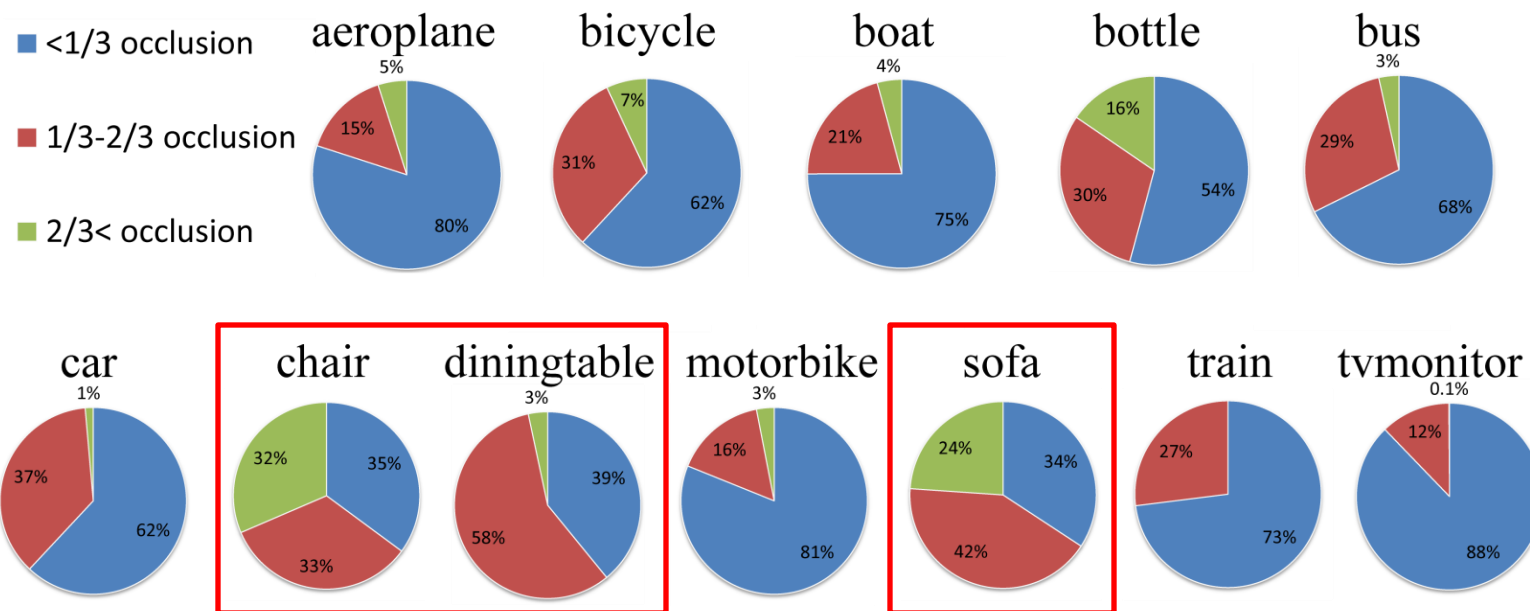


tvmonitor



Viewpoint Distribution

Statistics



Occlusion Percentage

Object Detection and Viewpoint Estimation

	DPM with 24 Views
Detection	29.5
Viewpoint	12.1

- DPM: P. F. Felzenszwalb, R. B. Girshick, D. McAllester, and D. Ramanan. Object detection with discriminatively trained part based models. PAMI, 2010.

PASCAL3D+ website: <http://cvgl.stanford.edu/projects/pascal3d.html>

Welcome to submit your results!

Conclusion

- PASCAL3D+: a large scale 3D object detection dataset in the wild
- Benchmark both 2D and 3D object detection methods
- Benefit research in 3D object detection and pose estimation

Our Future Work

- More categories ≈ 100
- More CAD models per category
- Improve alignment with CAD models

