



# NeurVPS: Neural Vanishing Point Scanning via Conic Convolution

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## Vanishing Point Detection

- After perspective projection, parallel lines intersect at the same point, i.e., the vanishing point;
- Vanishing points bridge 2D and 3D by giving the 3D **line direction** in camera space from a single 2D image.

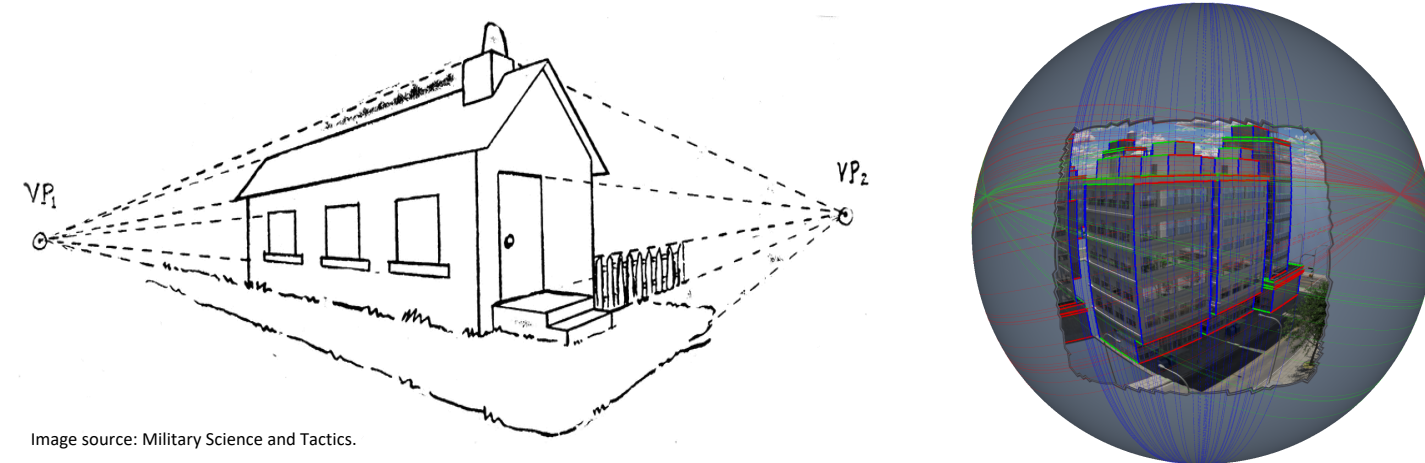
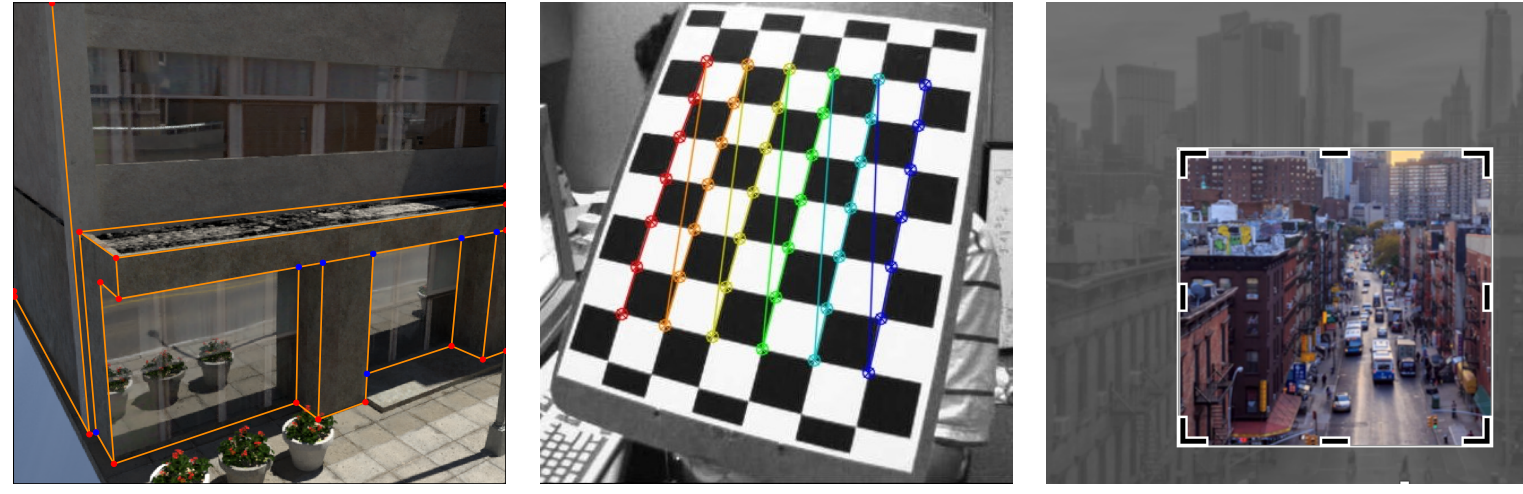


Image source: Military Science and Tactics.

## Applications



(a) 3D Wireframe Lifting (b) Camera Calibration (c) Photo Forensics

## Related Work

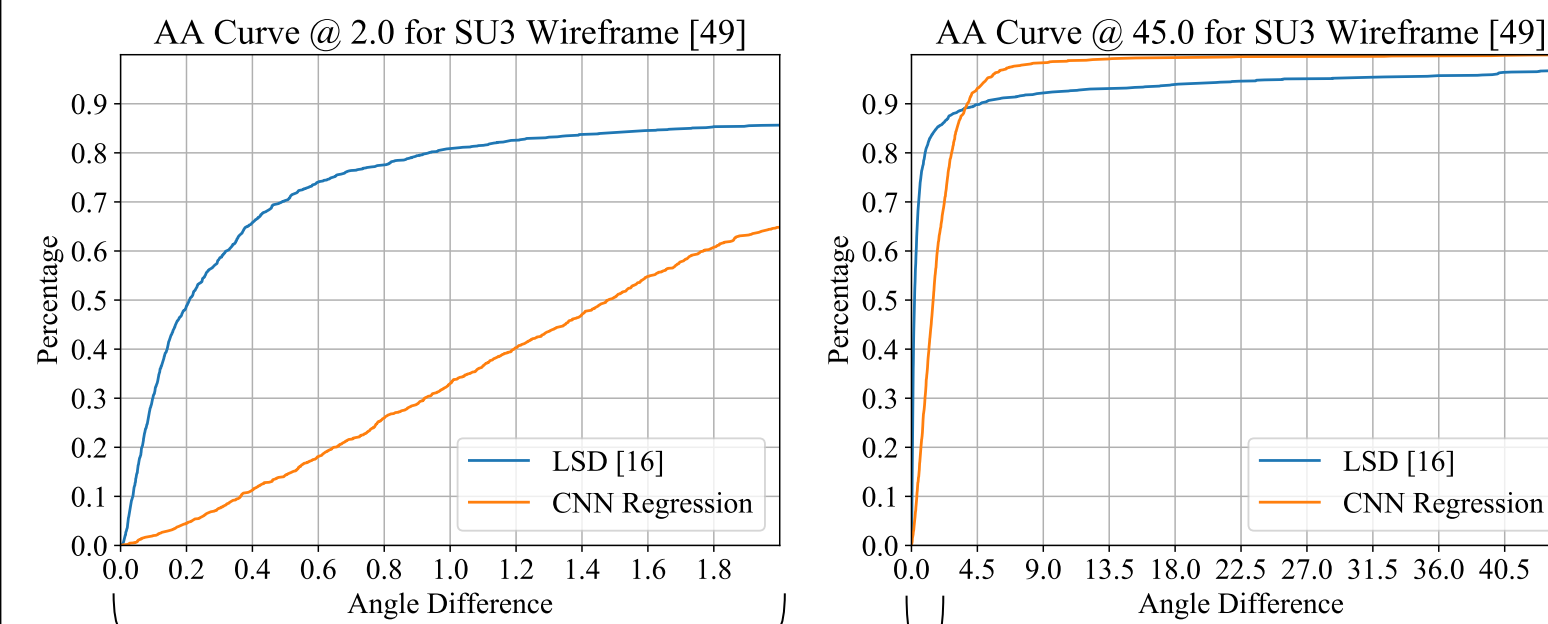
### Traditional Methods

- Two-stage algorithms
- First, extract line segments from images
- Next, cluster lines based on their intersections
- Not end-to-end trainable
- Accurate**, but outliers may result in total failure

### CNN-Based Methods

- [1]: Divide images into patches and classify them
- [2]: Use neural networks to filter outliers
- Hard to utilize geometric properties of VPs
- Robust**, but CNN only gives a coarse estimation

## Accuracy of VPs with Naive CNNs

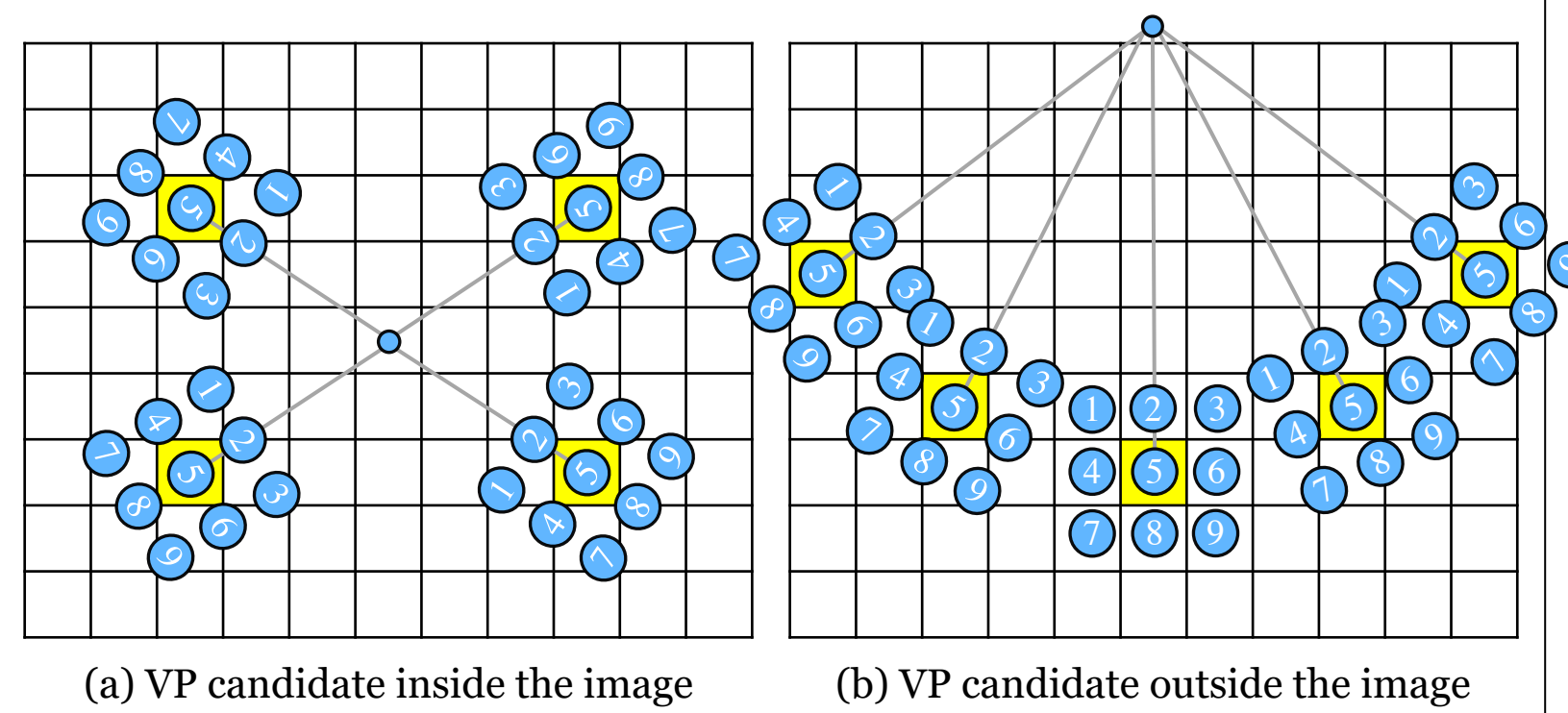


## Motivation

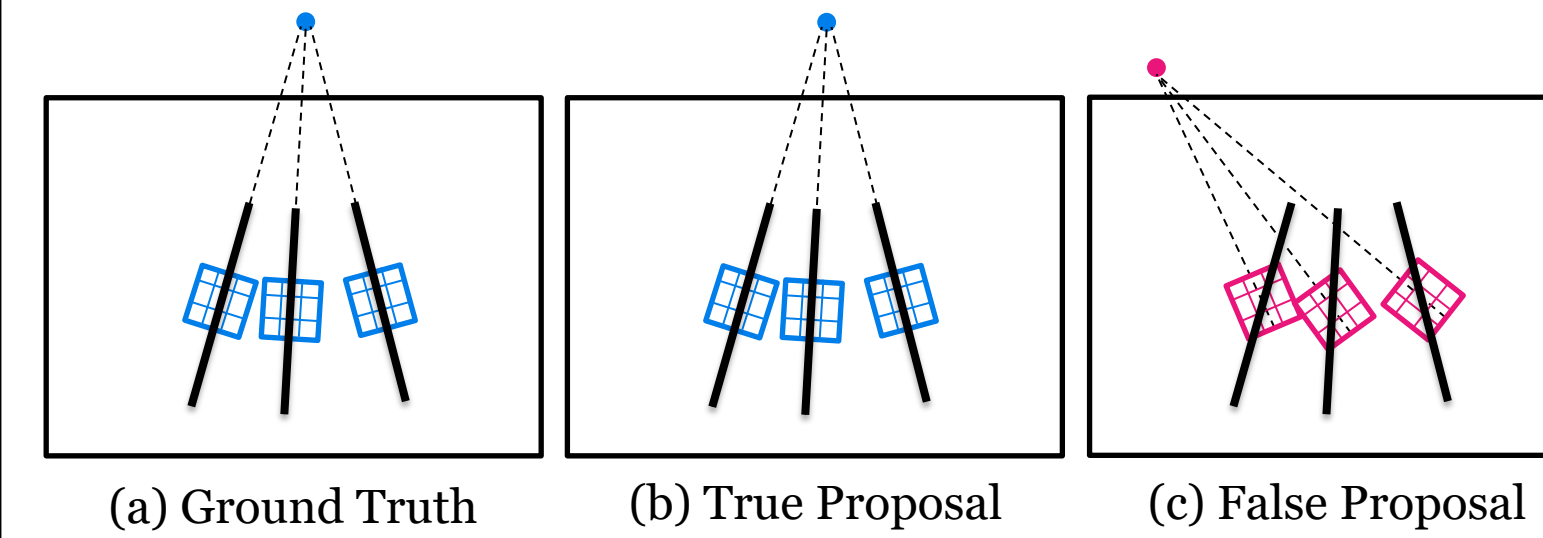
- Accurate** as traditional line clustering algorithms;
- Robust** as (convolutional) neural network-based algorithms;
- End-to-end trainable without using existing line detectors;
- Able to capture geometric cues of vanishing points.



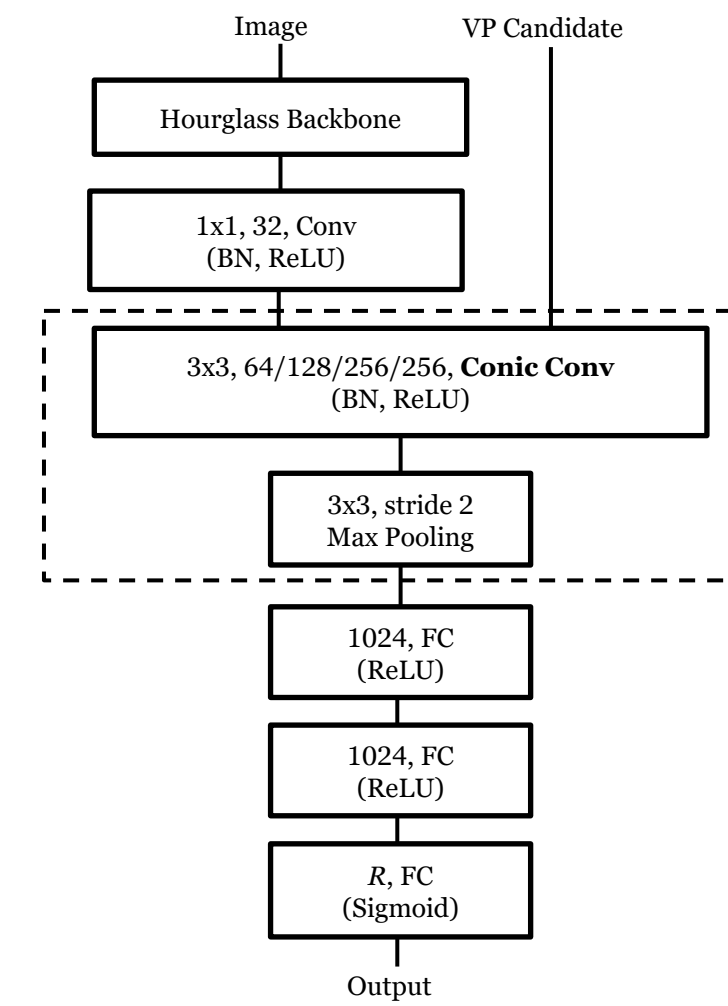
## Conic Convolution



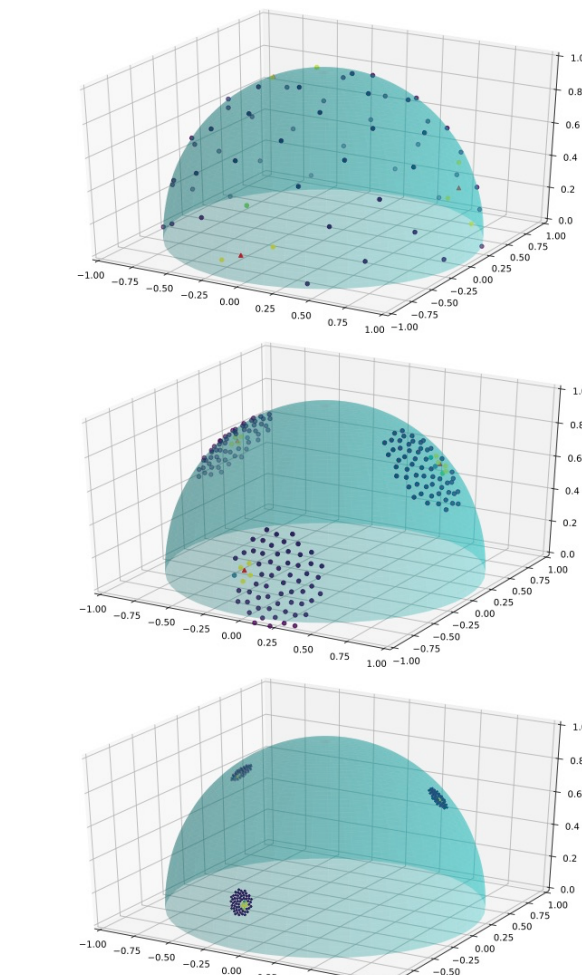
## Geometric Intuition of Conic Convolution



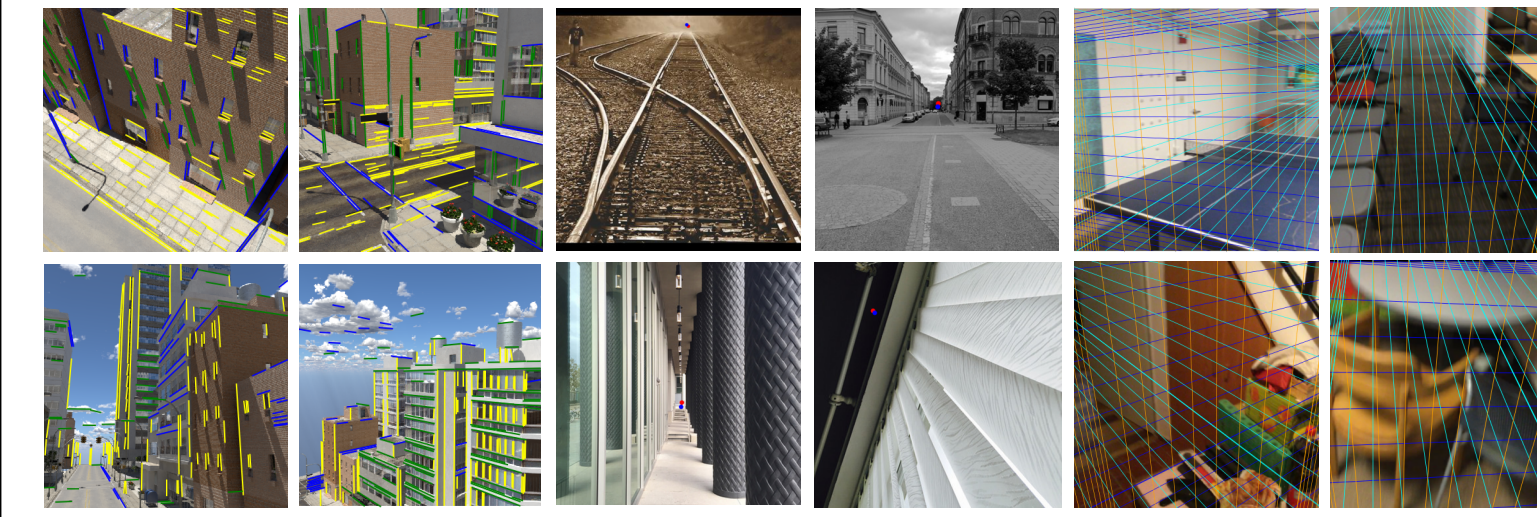
## Network Structure



## Hierarchical Inference

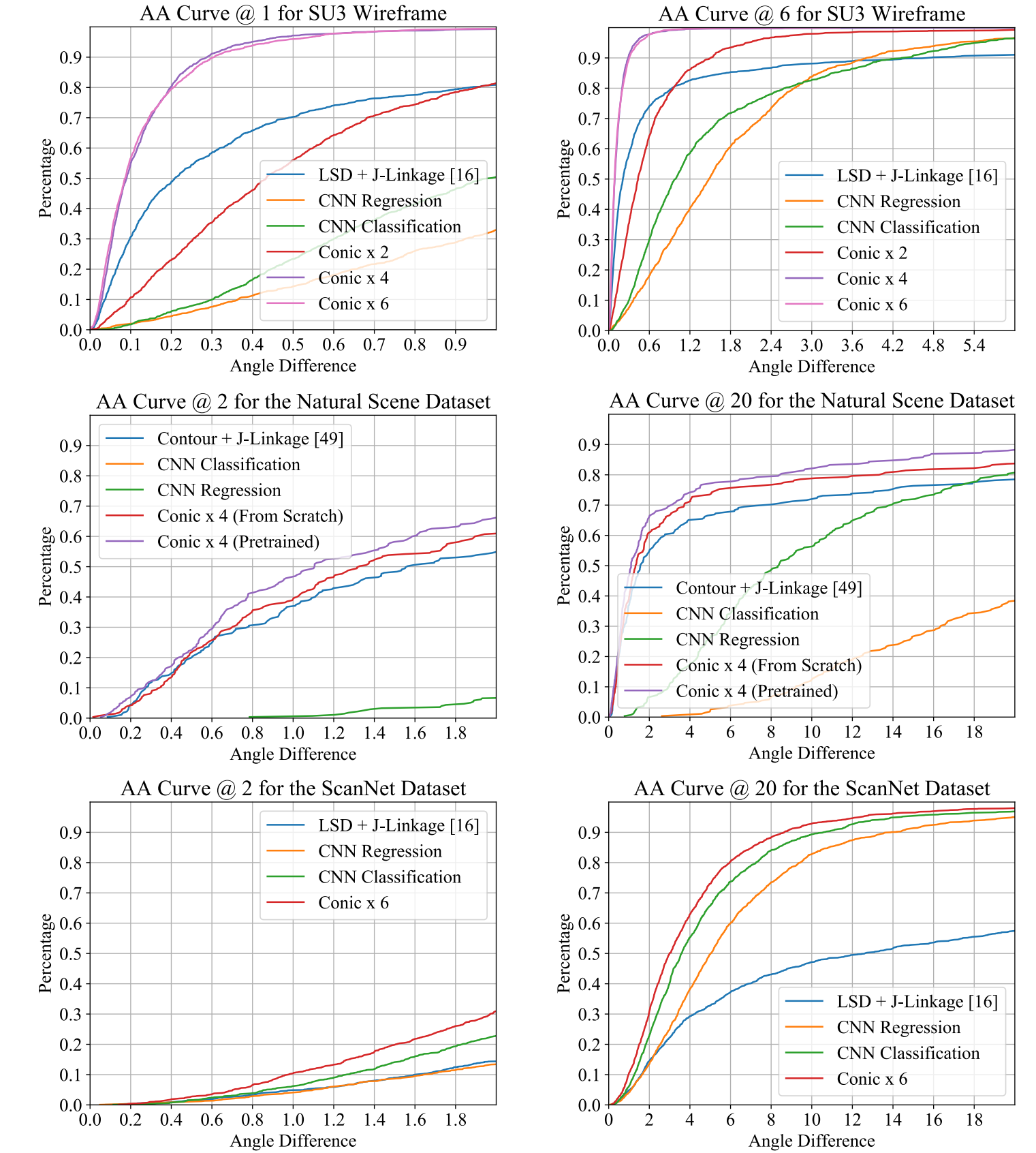


## Datasets and Visualization



(a) LSD/J-Linkage on SU3 [3] (b) NeurVPS on [4] with GT (c) Ground Truth of ScanNet

## Results



## Acknowledgement

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## Reference

- [1] "DeepVP: Deep learning for vanishing point detection on 1 million street view images", Chin-Kai Chang, Jiaping Zhao, and Laurent Itti. ICRA 2018.
- [2] "Detecting Vanishing Points using Global Image Context in a Non-Manhattan World" Menghua Zhai, Scott Workman, Nathan Jacobs. CVPR 2016.
- [3] "Learning to Reconstruct 3D Manhattan Wireframes from a Single Image." Zhou, Yichao, Haozhi Qi, Yuexiang Zhai, Qi Sun, Zhili Chen, Li-Yi Wei, and Yi Ma. ICCV 2019.
- [4] "Detecting Dominant Vanishing Points in Natural Scenes with Application to Composition-Sensitive Image Retrieval" Zihan Zhou, Farshid Farhat, and James Z. Wang. TMM 2017.