Sparse PointPillars: Exploiting Sparsity in Birds-Eye-View Object Detection Kyle Vedder and Eric Eaton



General Robotics, Automation, Sensing & Perception Lab

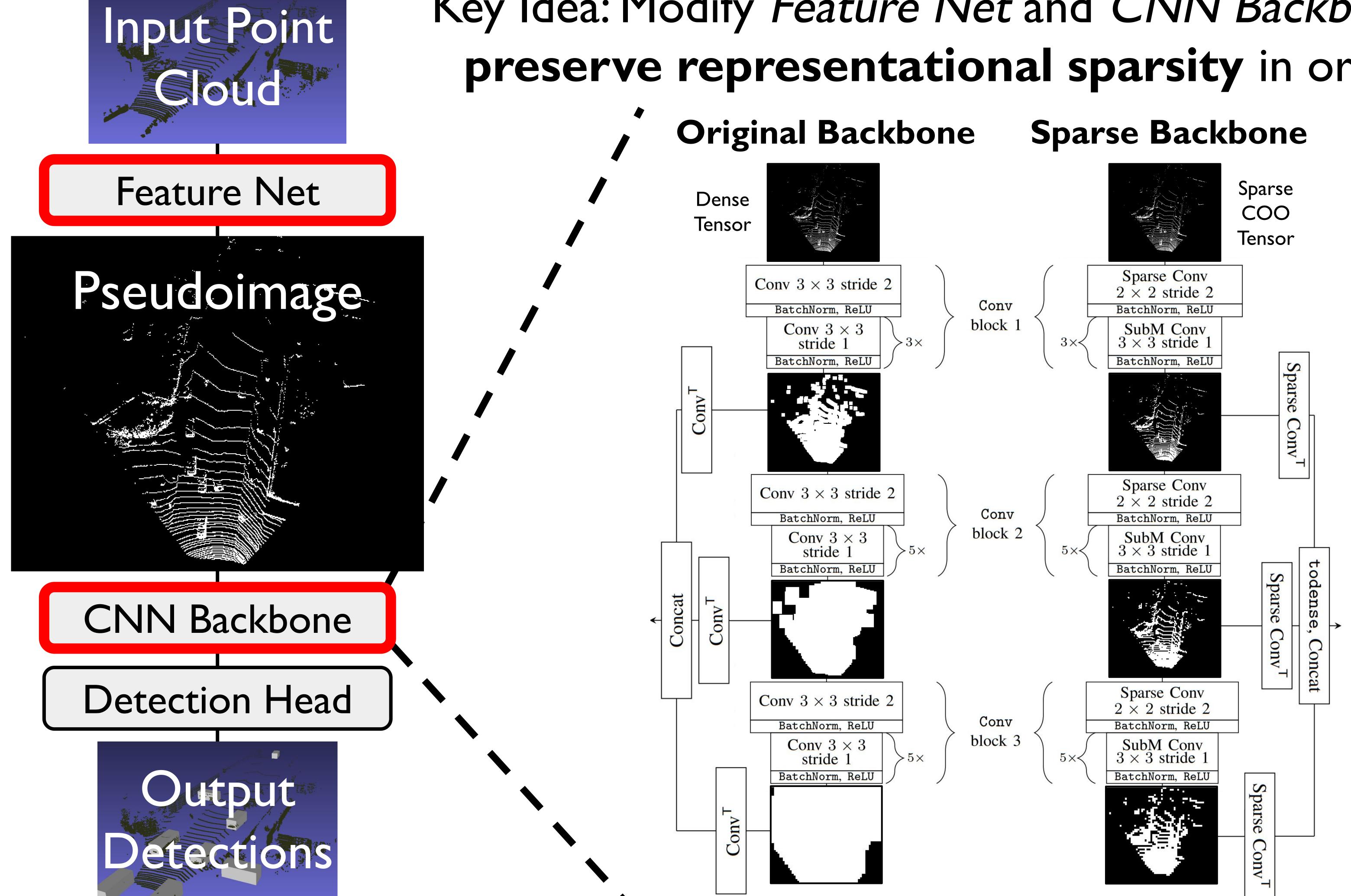
Full Workshop Paper:



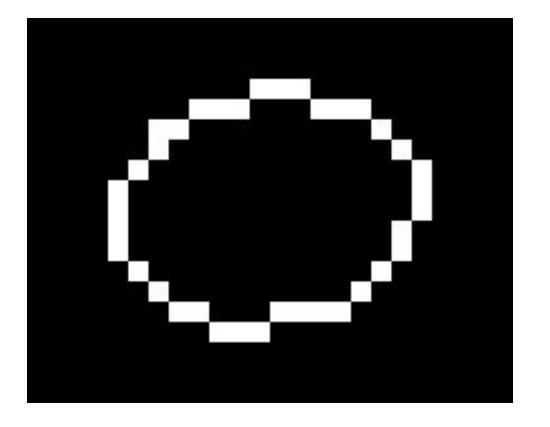
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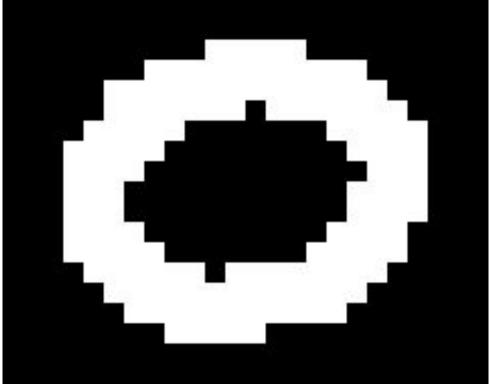


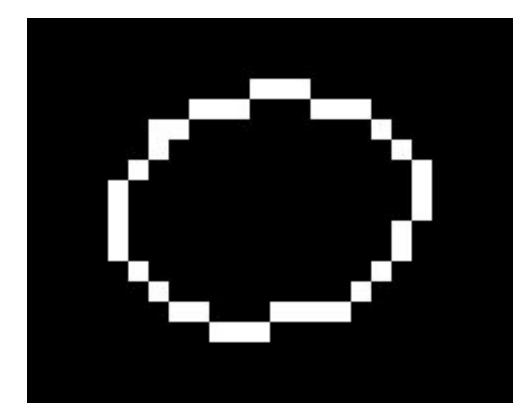
Key Idea: Modify Feature Net and CNN Backbone to use sparse convolutions and preserve representational sparsity in order to reduce evaluation latency



SubM vs Standard Conv







Input

3x3 Standard Result

3x3 SubM Result

Runtimes

Table 1: Model runtime in milliseconds for each network component, averaged over ten trials, run on the KITTI datset with 16cm×16cm pillars. All models have the same Feature Extractor and Head (runtimes included for completeness), and all non-Original models have the same sparse Feature Net.

	Feat. Extr.	Feat. Net	Backbone	Head	Total vs Original
Original PointPillars	6.904 ± 0.018	1.344 ± 0.043	16.185 ± 0.053	3.638 ± 0.022	_
Sparse PointPillars	6.879 ± 0.016	0.508 ±0.030	14.090 ± 0.057	3.778 ± 0.018	-2.817
Sparse1+Dense23	6.898 ± 0.017	0.517 ± 0.022	17.321 ± 0.050	3.646 ± 0.021	0.223
Sparse12+Dense3	6.973 ± 0.089	0.498 ± 0.021	22.091 ± 0.245	3.578 ± 0.063	5.069
Sparse+WideConv	6.858 ± 0.015	0.480 ± 0.022	17.483 ± 0.071	3.684 ± 0.030	0.434

Detection Quality

Table 2: Performance of the original PointPillars as % AP and of our sparse model as the relative % AP difference (\triangle) from Original on KITTI with 16cm×16cm pillars. Higher is better.

	Origi	inal PointP	illars	Sparse PointPillars			
	Easy Medium		Hard	Easy	Medium	Hard	
BBox AP	90.51	88.67	87.06	0.11	-2.68△	-4.78△	
BEV AP	89.93	87.03	84.09	0.25△	-5.30△	-4.35∆	
3D AP	86.46	76.29	69.73	-1.85△	-5.31△	-1.39△	

Table 3: Ablative model % AP difference (△) from Original on KITTI with 16cm×16cm pillars.

	Sparse1+Dense23			Sparse12+Dense3			Sparse+WideConv		
	Easy	Med.	Hard	Easy	Med.	Hard	Easy	Med.	Hard
BBox AP	-0.17△	-0.35△	-0.68△	-0.23△	-0.79△	-0.99△	0.00	-2.38△	<i>-</i> 4.84∆
BEV AP	-0.03△	-0.85△	-3.58△	-0.24△	-1.42∆	-2.24△	-0.06△	-5.56△	-2.90△
3D AP	-5.50△	-1.31△	-0.75△	-2.13∆	-1.91△	-1.32△	-5.94△	-6.38△	-2.18△