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



General Robotics, Automation, Sensing & Perception Lab

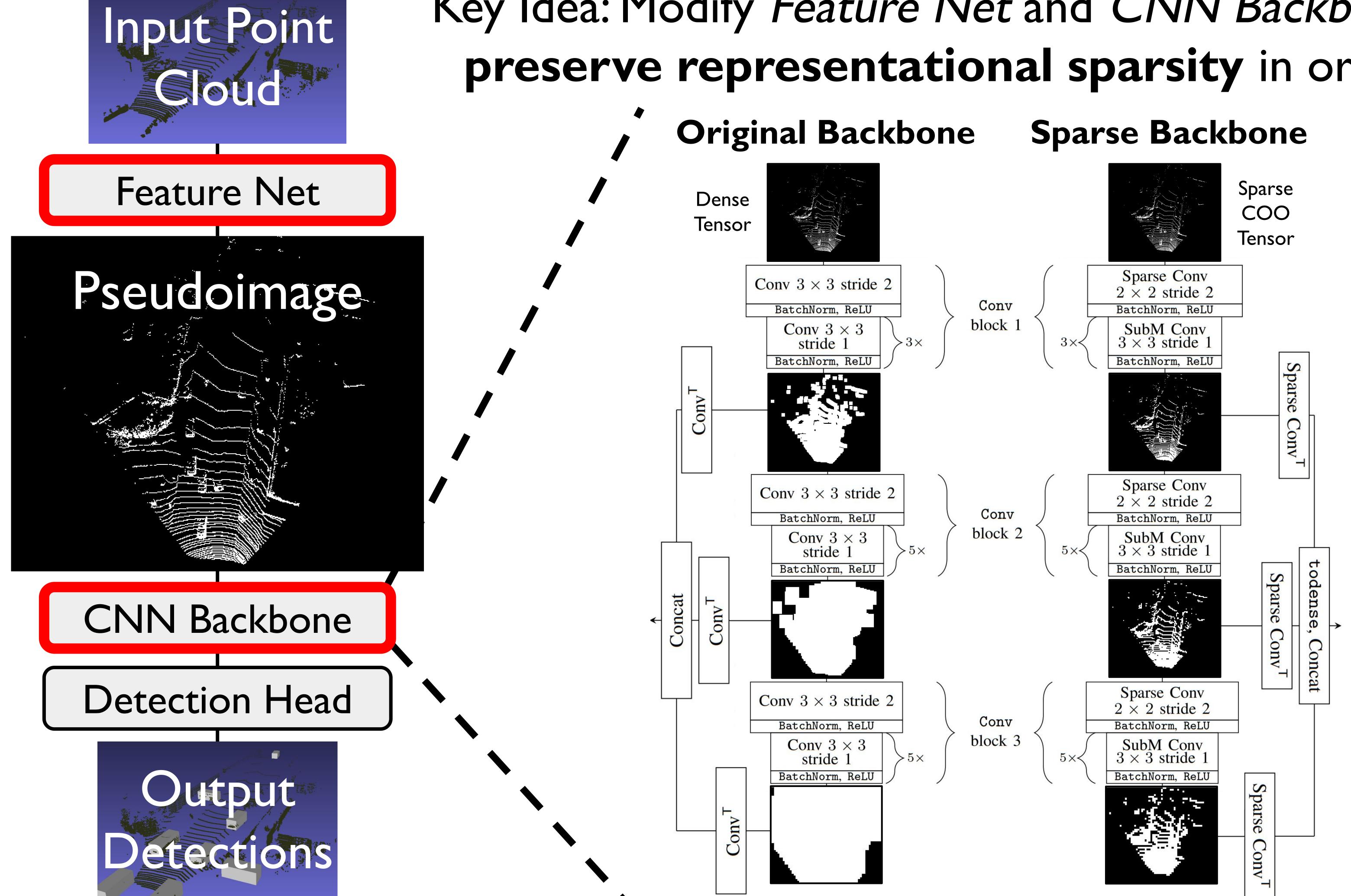
Full Workshop Paper:



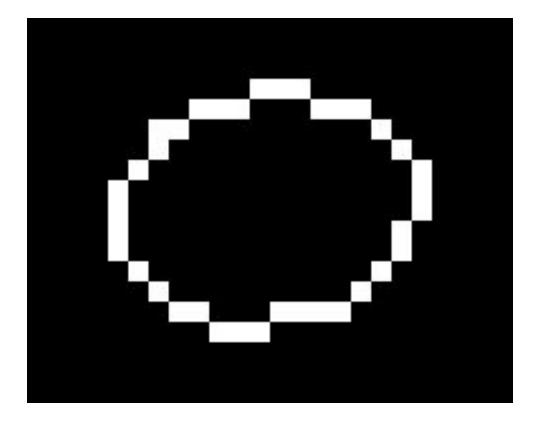
Code:

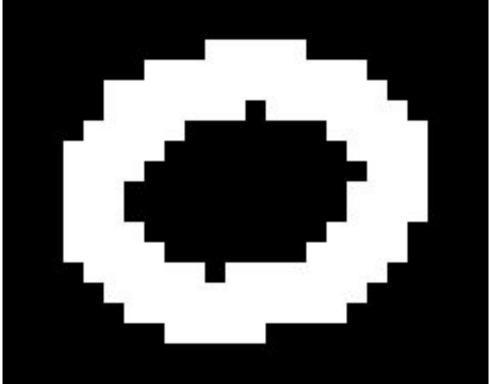


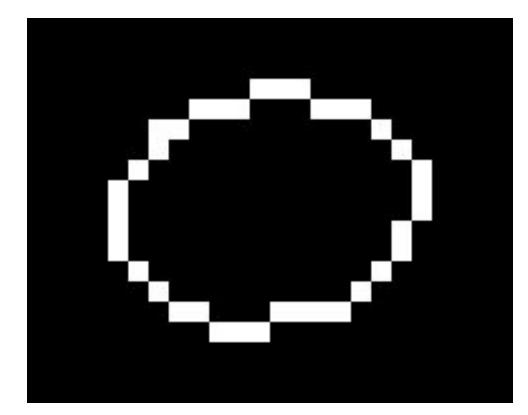
Key Idea: Modify Feature Net and CNN Backbone to use sparse convolutions and preserve representational sparsity in order to reduce evaluation latency



## 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	$6.904 \pm 0.018$	$1.344 \pm 0.043$	$16.185 \pm 0.053$	$3.638 \pm 0.022$	_
Sparse PointPillars	$6.879 \pm 0.016$	<b>0.508</b> ±0.030	$14.090 \pm 0.057$	$3.778 \pm 0.018$	-2.817
Sparse1+Dense23	$6.898 \pm 0.017$	$0.517 \pm 0.022$	$17.321 \pm 0.050$	$3.646 \pm 0.021$	0.223
Sparse12+Dense3	$6.973 \pm 0.089$	$0.498 \pm 0.021$	$22.091 \pm 0.245$	$3.578 \pm 0.063$	5.069
Sparse+WideConv	$6.858 \pm 0.015$	$0.480 \pm 0.022$	$17.483 \pm 0.071$	$3.684 \pm 0.030$	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.

	Original PointPillars			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 <sub>\Delta</sub>	-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△