

# Exploring Spatial Context for 3D Semantic Segmentation of Point Clouds



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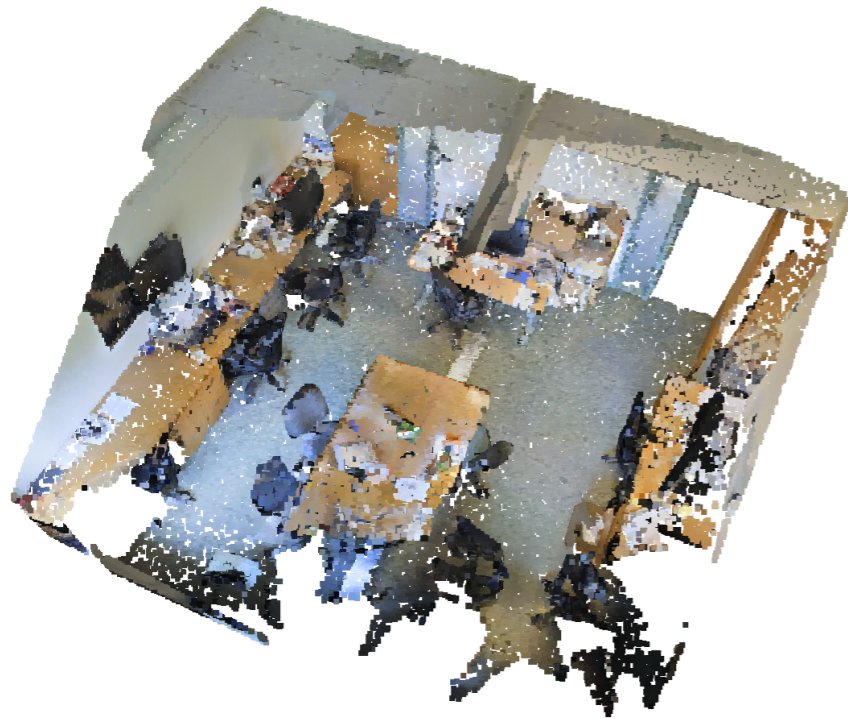
Bastian Leibe



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UNIVERSITY

# Problem Statement

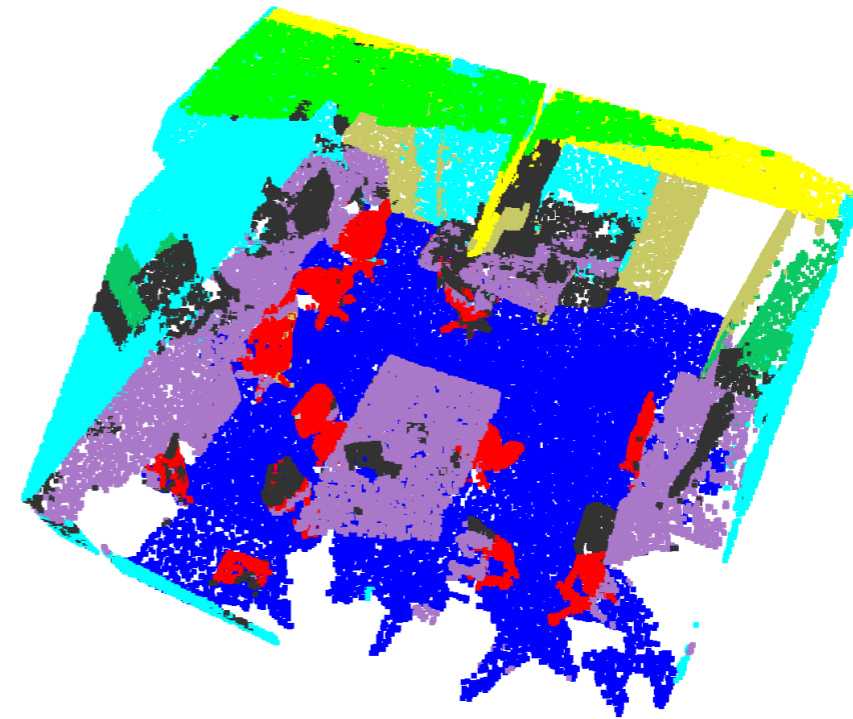
## Input



3D Point Cloud



## Output



Chair

Table

Wall

Ground

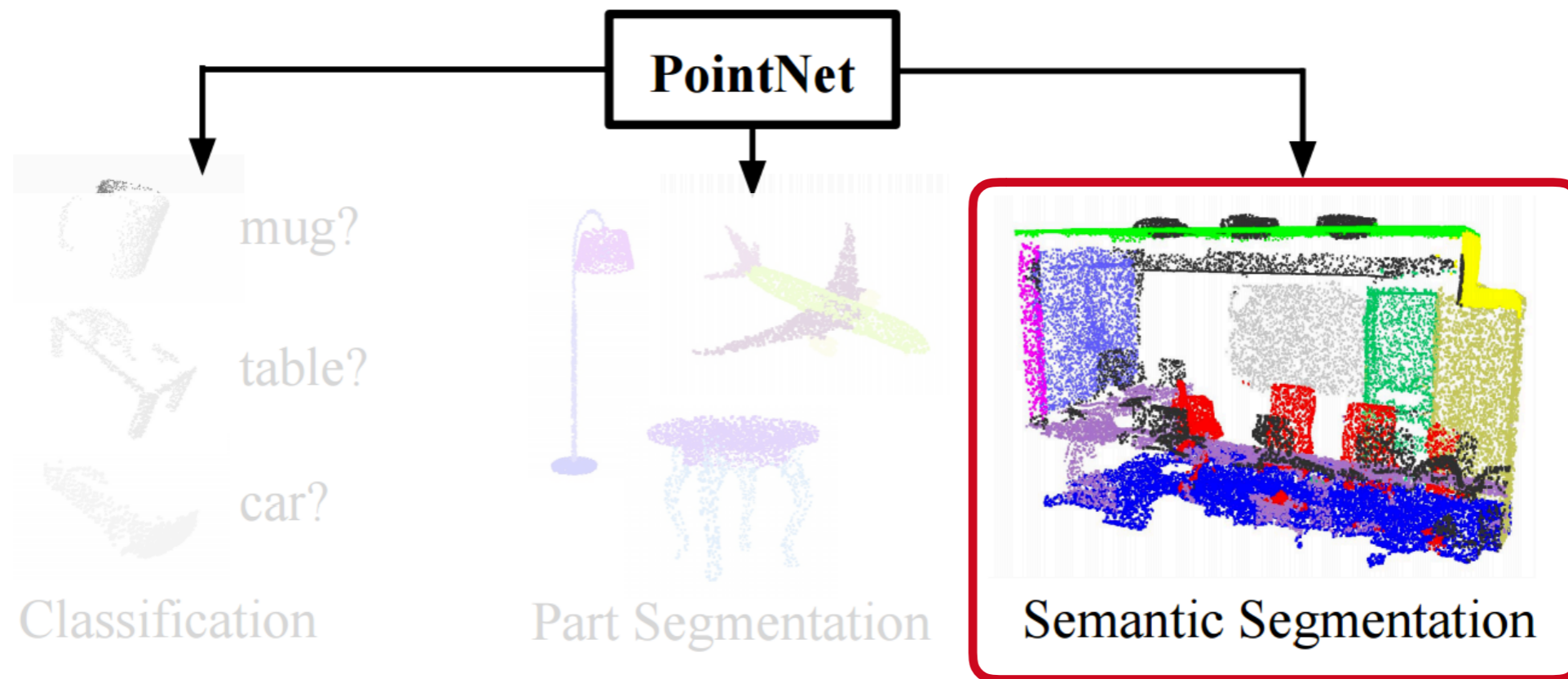
Ceiling

Semantic Segmentation



# Previous Work

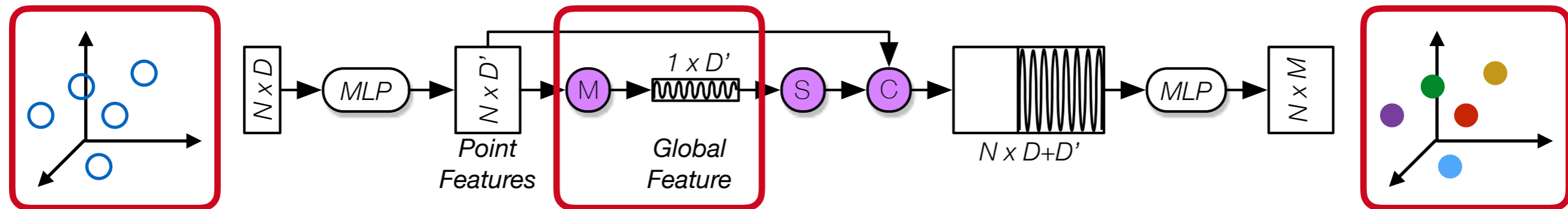
- Most existing approaches: first convert into another representation
  - Voxel-grid (3D CNN), Projection (2D CNN), ...
- Pioneering work: **PointNet** operates directly on point clouds [CVPR'17]



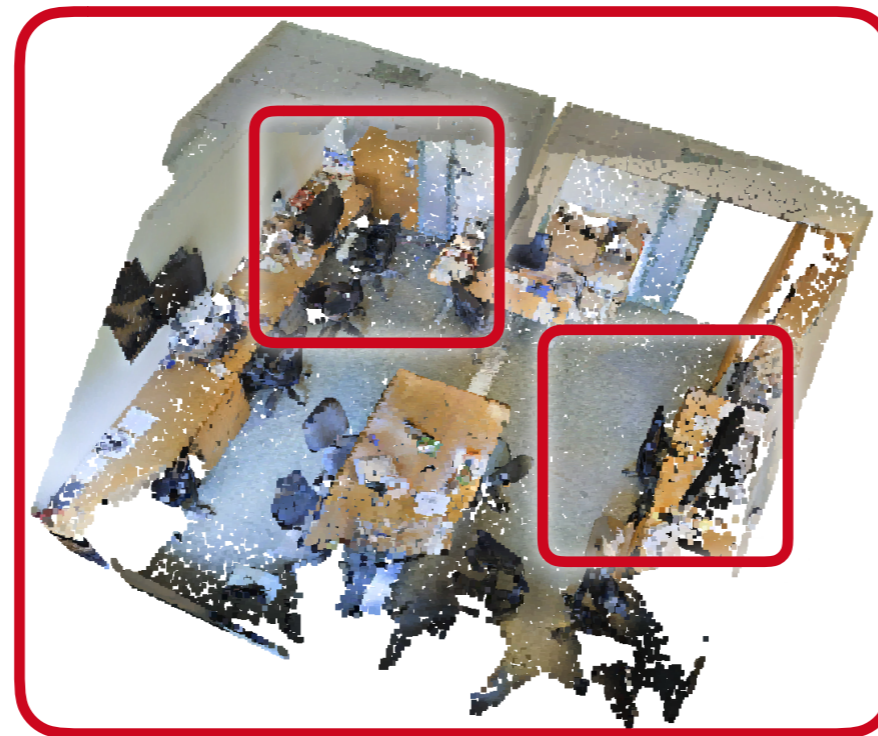
[Charles R. Qi et al. PointNet: Deep Learning on Point Sets for 3D Classification and Segmentation, CVPR 2017]

# Previous Work: PointNet

**Idea:** Given a point cloud, learn feature descriptor using max-pooling.



(simplified PointNet model)

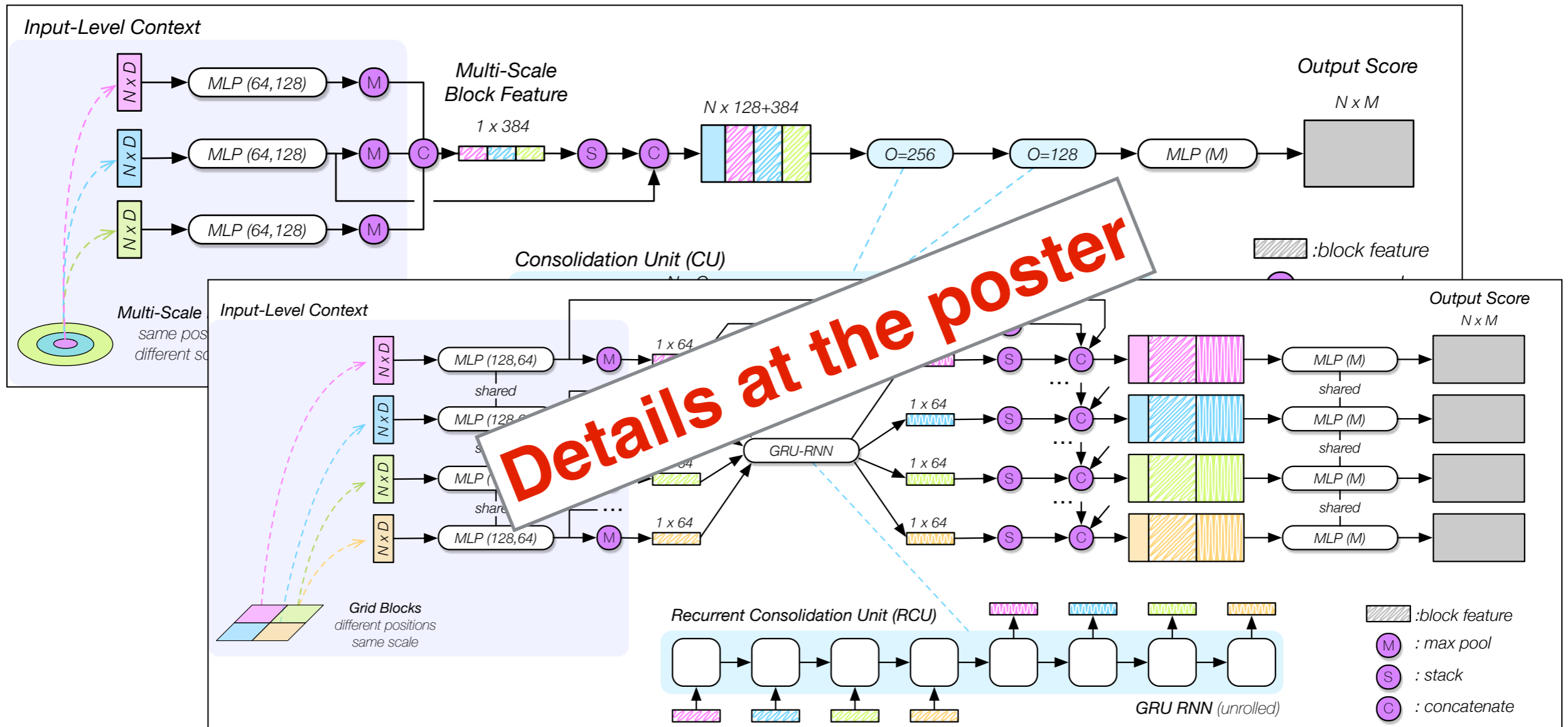


Local Context  
  
 Global Context



# Our method

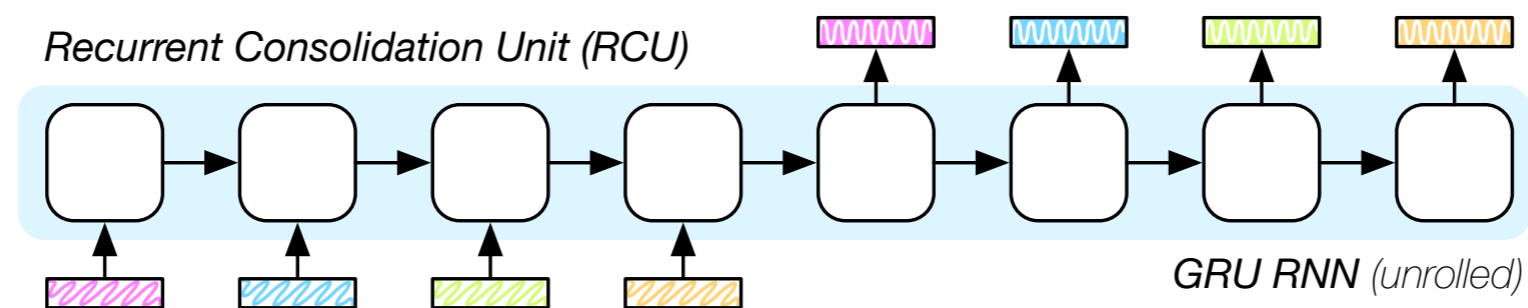
Two explorative models ...



# Our method: Consolidation Units

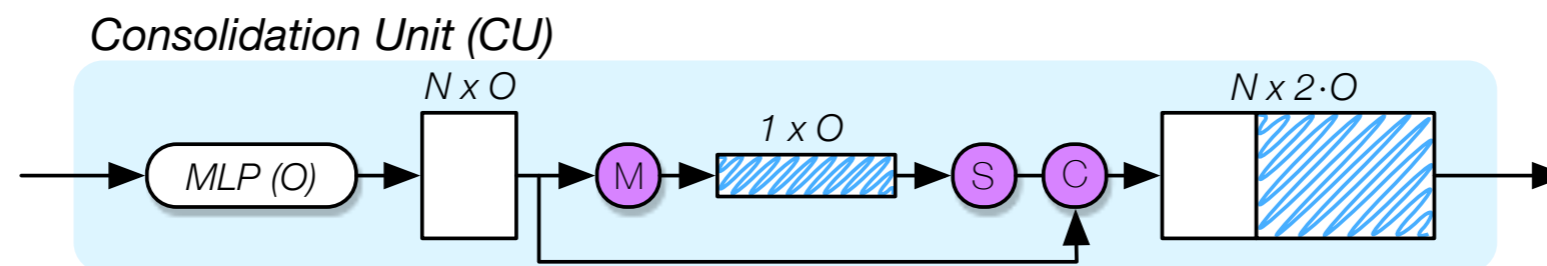
## Recurrent Consolidation Units:

*Share context between neighboring subsets of points.*



## Consolidation Units:

*Share and reinforce context between points within the same subset.*



# Qualitative Results [S3DIS dataset, Armeni et al. CVPR'16]

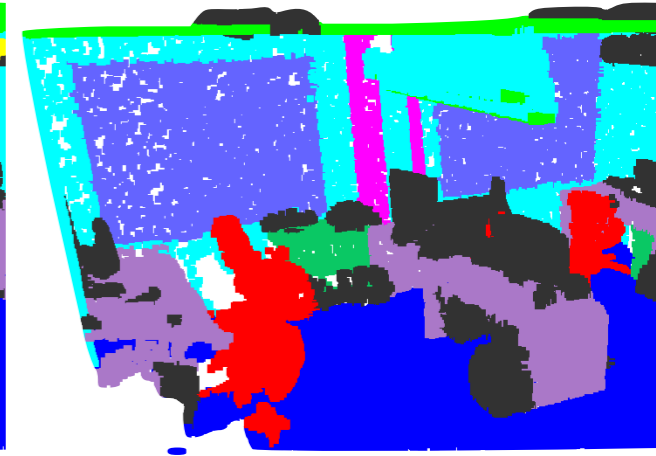
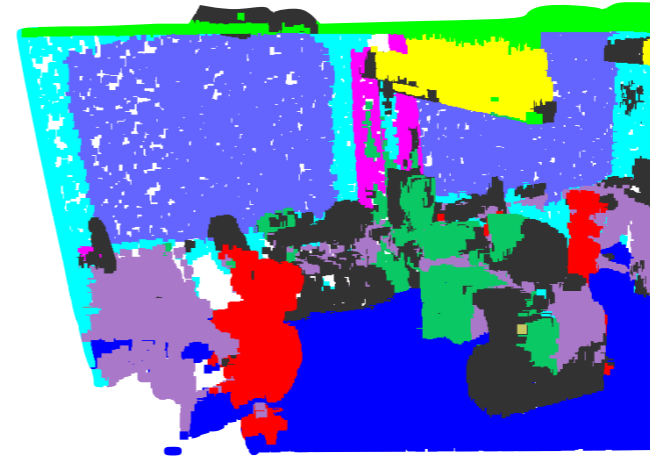
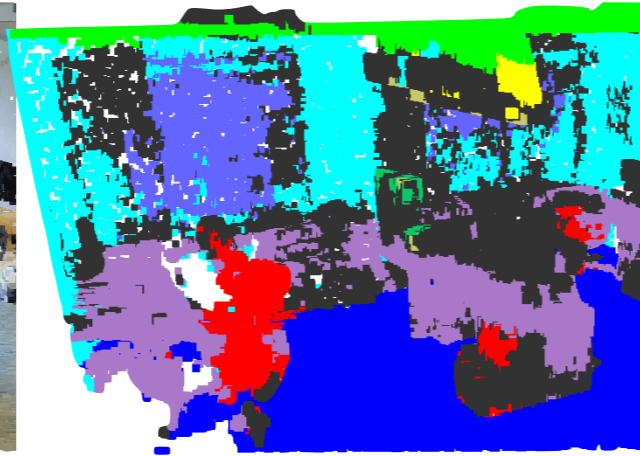
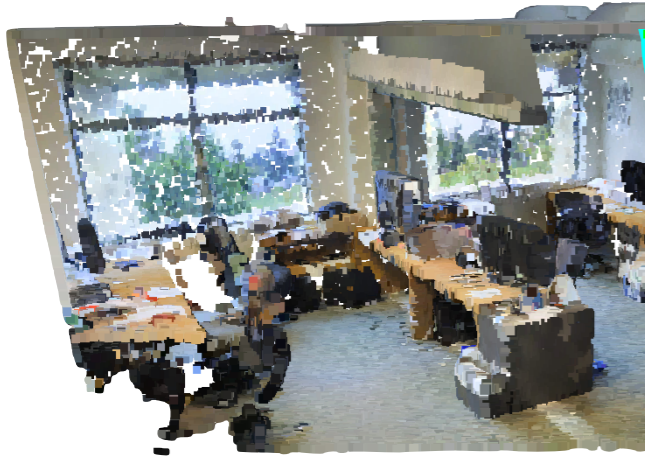
Input

PointNet

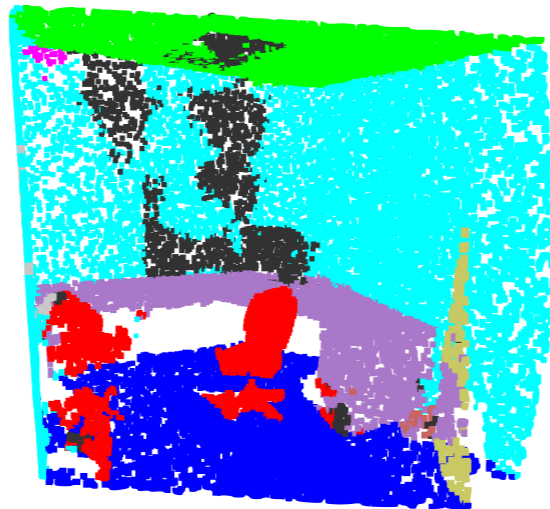
Ours

Ground Truth

Example 1



Example 2



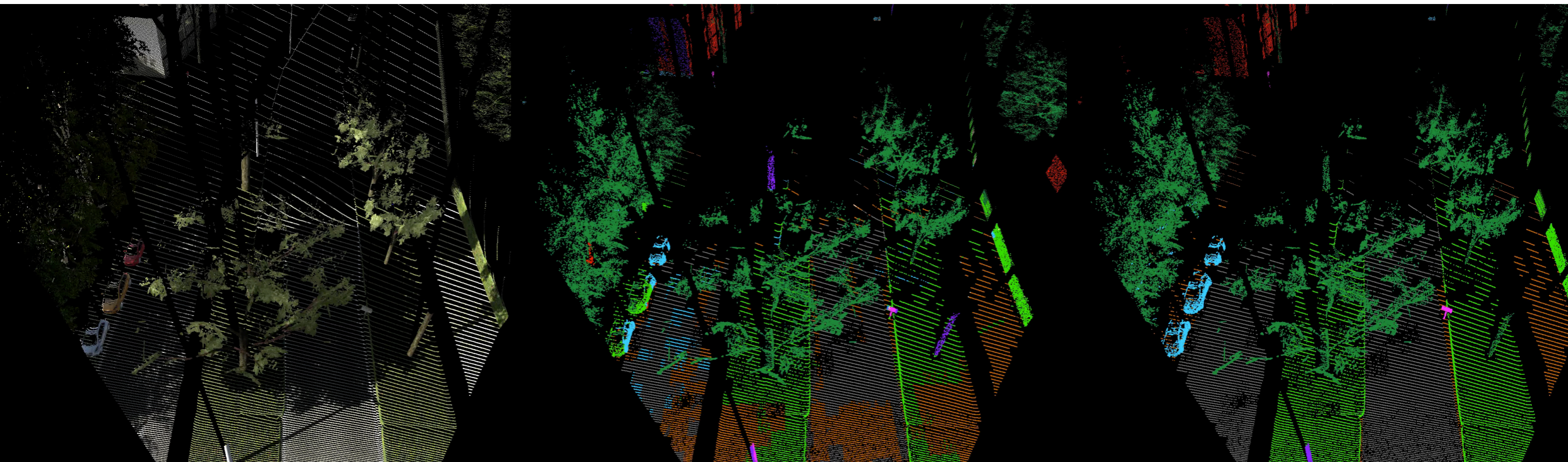


# Qualitative Results [virtual KITTI dataset, Gaidon et al. CVPR16]

**Input XYZ-RGB**

**Our prediction**

**Ground Truth**





# Quantitative Results

## Geometry & Appearance

XYZ-RGB input features

S3DIS Dataset [1] XYZ-RGB	mean IoU	overall accuracy	avg. class accuracy
*PointNet [26]	43.5	75.0	55.5
*MS	44.4	75.5	57.6
*MS + RCU	45.5	77.2	57.2
*SS + CU(1)	45.9	77.8	57.7
*MS + CU(2)	<b>47.8</b>	<b>79.2</b>	<b>59.7</b>
PointNet [26]	47.6	78.5	66.2
G + RCU	<b>49.7</b>	<b>81.1</b>	<b>66.4</b>

## Geometry Only

XYZ input features

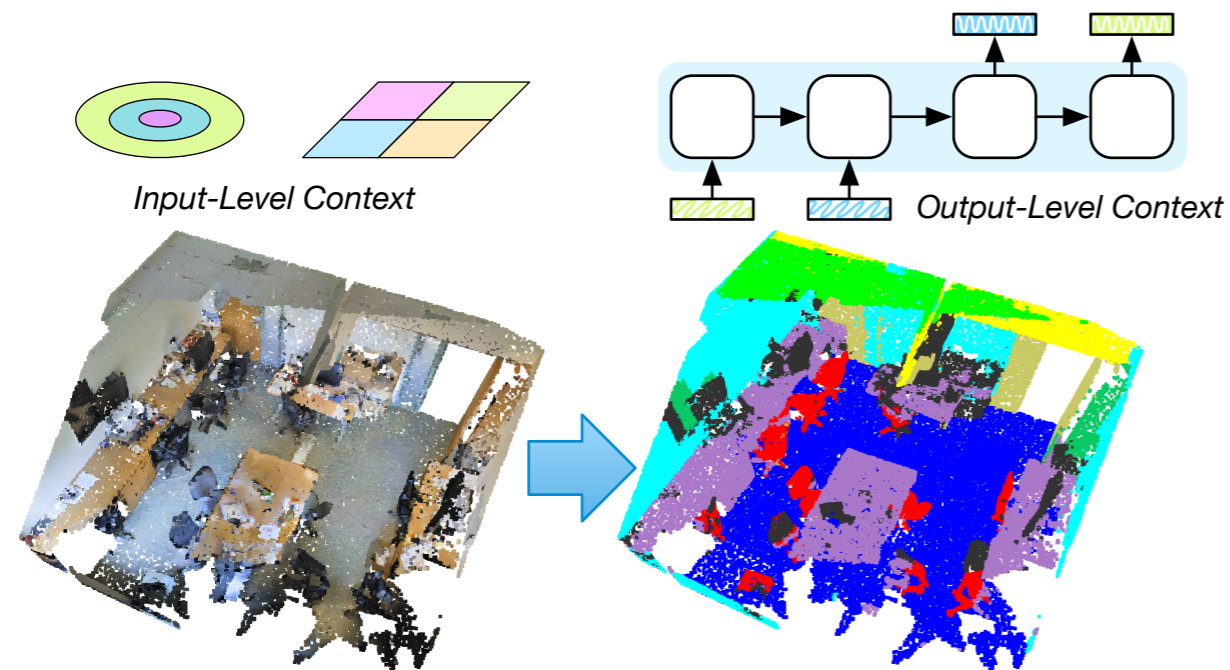
	mean IoU	overall accuracy	avg. class accuracy
S3DIS Dataset [1] – no RGB			
*PointNet [26]	40.0	72.1	52.9
*MS + CU(2)	<b>43.0</b>	<b>75.4</b>	<b>55.2</b>
vKITTI Dataset [8] – no RGB			
*PointNet [26]	17.9	63.3	29.9
*MS + CU(2)	<b>26.4</b>	<b>73.2</b>	<b>40.9</b>



# Conclusion

We present novel mechanisms (**Consolidation Units**) to:

- share local context globally across the scene
- reinforce/consolidate local context



See you at our poster!

**Project page:** <https://www.vision.rwth-aachen.de/page/3dsemseg>