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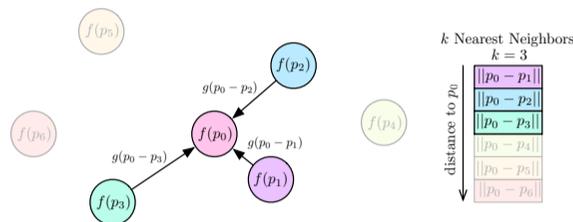
Project Page: [www.vision.rwth-aachen.de/page/dpc](http://www.vision.rwth-aachen.de/page/dpc)

In this work, we propose *Dilated Point Convolutions (DPC)* to drastically increase the receptive field of convolutions on 3D point clouds. In particular, we highlight the importance of the receptive field size and propose multiple strategies to increase the receptive field of point convolutions. We compare different network architectures and propose a straightforward network architecture of stacked DPCs.

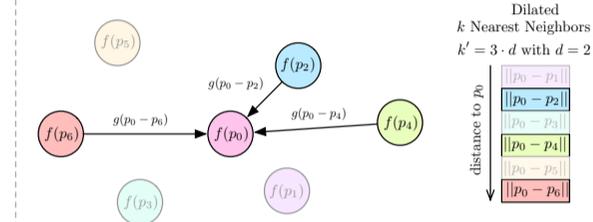
## Contributions

- Dilated Point Convolution (DPC)
- Simple network architecture based on DPCs
- Competitive scores on S3DIS and ScanNet
- Easy to add DPCs to your own point network!

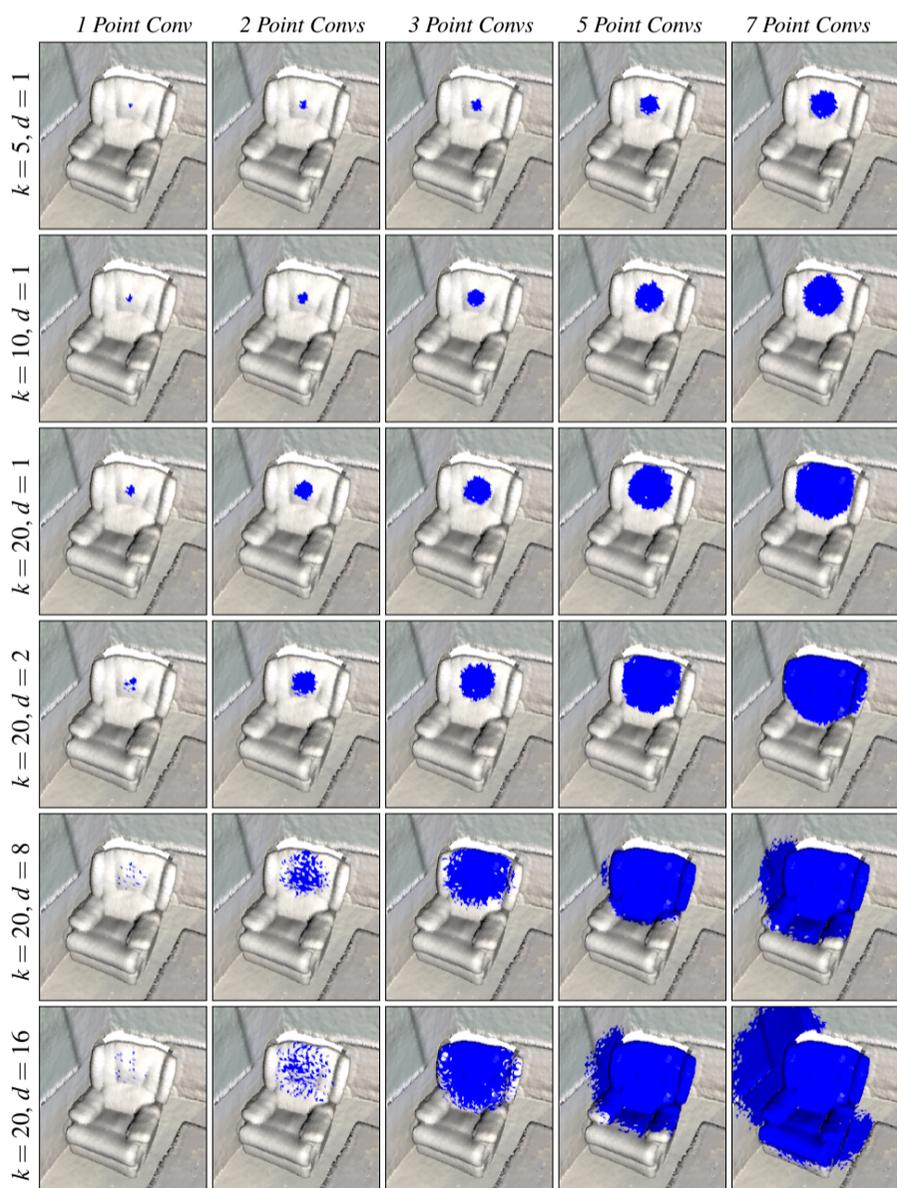
## Point Convolutions



## Dilated Point Convolutions



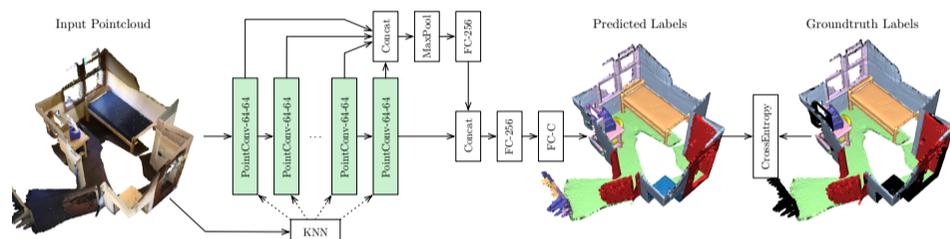
## Receptive Field



## S3DIS A5 Results

Method	mIoU	mAcc	oAcc
PointNet [17]	41.1	49.0	-
Engelmann et al. [6]	52.2	59.1	84.2
PointCNN [12]	57.3	63.9	85.9
SPG [13]	58.0	66.5	86.4
PCNN [21]	58.3	67.0	-
<b>DPC (Ours)</b>	<b>61.28</b>	<b>68.38</b>	<b>86.78</b>

## Architecture



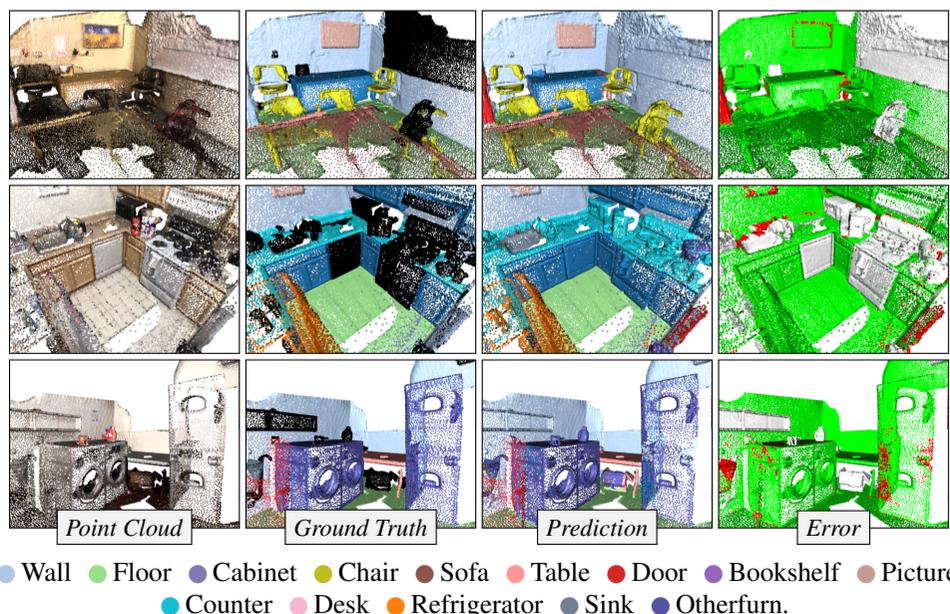
## Ablation Study

Number of Point Convs	Number of Neighbors $k$	Time per Forward-Pass	Number of Parameters	Dilation			
				$d$	mIoU	mAcc	oAcc
7	20	29.38 ms	$880 \cdot 10^3$	1	53.93	61.73	85.58
7	20	31.57 ms	$880 \cdot 10^3$	2	55.83	61.76	85.68
7	20	35.36 ms	$880 \cdot 10^3$	8	<b>61.28</b>	<b>68.38</b>	<b>86.78</b>
7	20	51.65 ms	$880 \cdot 10^3$	16	58.79	65.84	86.41

Number of Point Convs	Number of Neighbors $k$	Time per Forward-Pass	Number of Parameters	mIoU	mAcc	oAcc
				50.04	57.42	<b>85.01</b>
3	10	13.64 ms	$402 \cdot 10^3$	50.98	58.16	84.74
3	20	17.65 ms	$402 \cdot 10^3$	<b>52.25</b>	<b>60.83</b>	84.69
5	5	14.53 ms	$625 \cdot 10^3$	52.69	58.87	<b>85.33</b>
5	10	17.12 ms	$625 \cdot 10^3$	52.91	59.57	85.27
5	20	23.35 ms	$625 \cdot 10^3$	<b>53.27</b>	<b>60.15</b>	85.15
7	5	16.99 ms	$880 \cdot 10^3$	52.93	59.87	<b>85.62</b>
7	10	20.68 ms	$880 \cdot 10^3$	53.57	60.92	85.59
7	20	29.38 ms	$880 \cdot 10^3$	<b>53.93</b>	<b>61.73</b>	85.58

## ScanNet Benchmark Results **DPC 59.2 % mIoU**



[6] Engelmann et al. Know What Your Neighbors Do: 3D Semantic Segmentation, ECCV'18.  
 [12] Li et al. PointCNN: Convolution On X-Transformed Points, NIPS'18.  
 [13] Landrieu and Simonovsky: Large-scale Point Cloud Semantic Segmentation with Superpoint Graphs, CVPR'18.  
 [17] Qi et al. PointNet: Deep Learning on Point Sets for 3D Classification and Segmentation, CVPR'17.  
 [21] Wang et al. Deep Parametric Continuous Convolutional Neural Networks, CVPR'18.