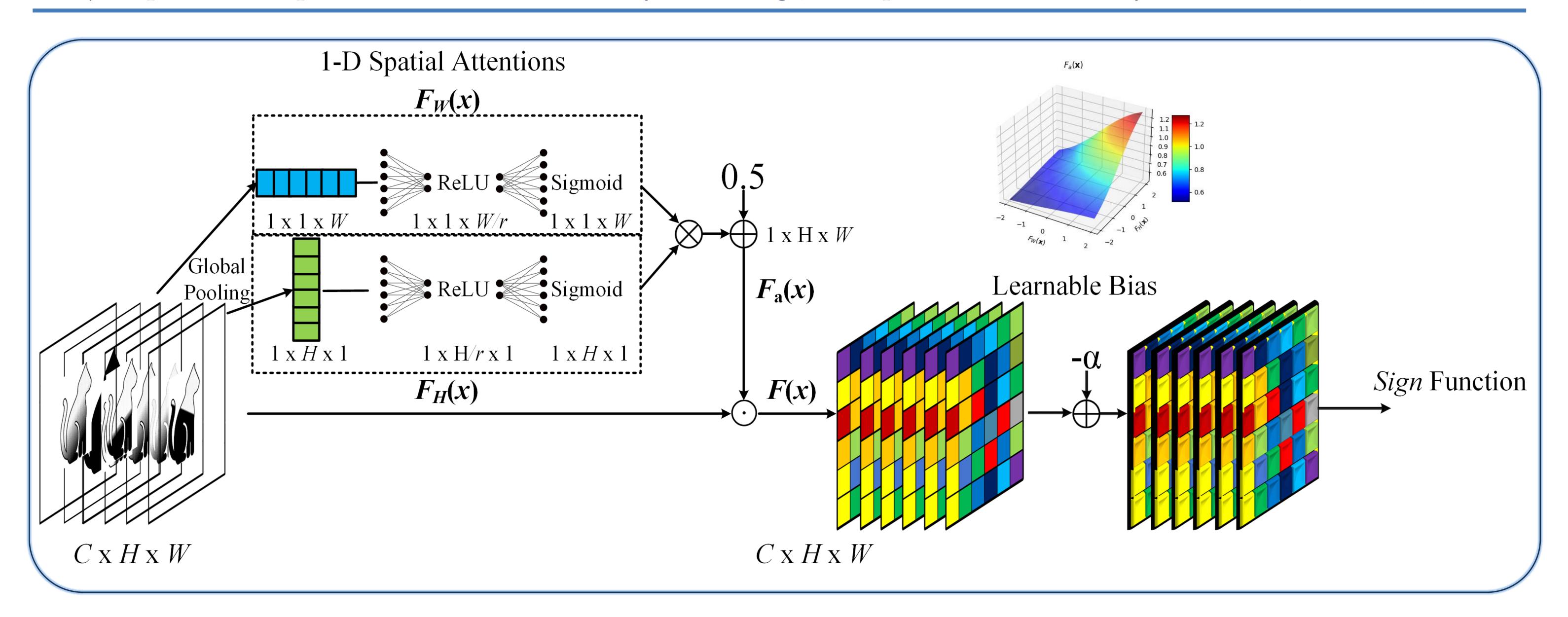
1-D SPATIAL ATTENTION IN BINARIZED CONVOLUTIONAL NEURAL NETWORKS

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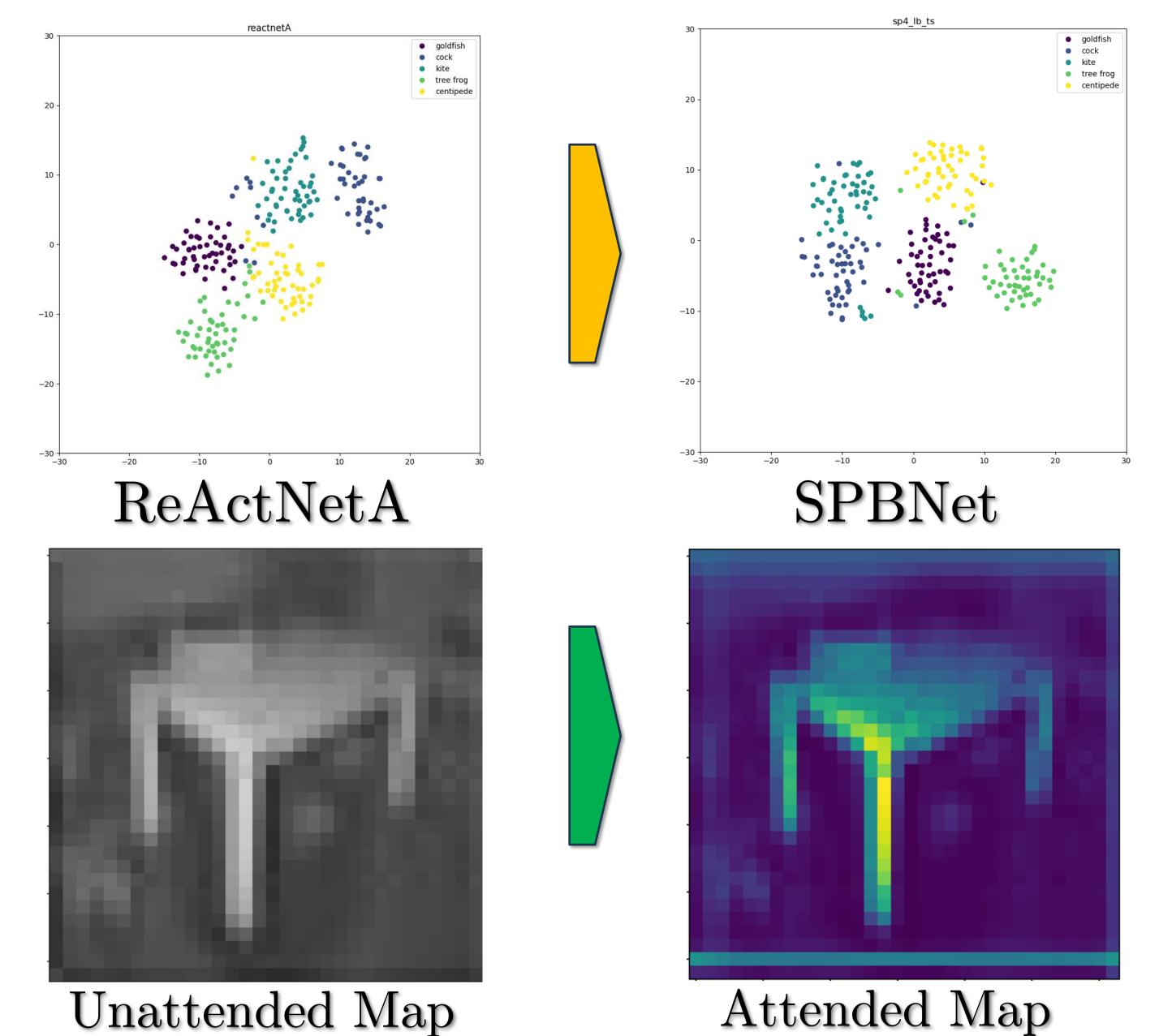
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Contributions

- We propose SPBNet: 1-D spatial attention blocks for BCNNs.
- The proposed attention block has low-cost 1-D height-wise and 1-D width-wise convolutions, It has the attention bias to adjust the effects of attended features in $\times 0.5 \times 1.5$.
- SPBNet shows that the biased 1-D spatial attention blocks can produce enhanced performance on both CIFAR-100 and ImageNet datasets by 2.7%@Top-1 and 1.5%@Top-1,respectively.



| STRUCTURE | FLOPs $(\times 10^7)$ | BOPs (×10 ⁹) | MEM (MBITS) | $OPs \\ (\times 10^7)$ | TOP-1 (%) | | | | | |
|---|-----------------------|-----------------------------|----------------|------------------------|--------------|--|--|--|--|--|
| RESNET18 | 57.5 | - | 359 | 57.5 | 75.6 | | | | | |
| XNOR-NET | 1.94 | 1.09 | 18.6 | 3.65 | 71.5 | | | | | |
| REACTNET18 | 2.02 | 1.09 | 19.3 | 3.73 | 70.8 | | | | | |
| OUR EVALUATIONS | | | | | | | | | | |
| $\overline{ch_{16}\text{-}lb}$ | 2.17 | 1.09 | 23.8 | 3.88 | 72.6 | | | | | |
| lb | 2.03 | 1.09 | 19.2 | 3.74 | 72.5 | | | | | |
| $sp_{2,nobias}$ - lb | 2.20 | 1.09 | 19.6 | 3.91 | 71.2 | | | | | |
| $sp_{4,nobias}$ - $ch_{16,nobias}$ - lb | 2.34 | 1.09 | 23.9 | 4.05 | 70.2 | | | | | |
| sp_4 - ch_{16} , $residual$ - lb | 2.34 | 1.09 | 23.9 | 4.05 | 70.2 | | | | | |
| sp_2 - ch_{16} - lb | 2.34 | 1.09 | 24.0 | 4.05 | 73.0 | | | | | |
| sp_4 - ch_{16} - lb | 2.34 | 1.09 | 23.9 | 4.05 | 73.2 | | | | | |
| ch_{16} - sp_2 - lb | 2.34 | 1.09 | 24.0 | 4.05 | 72.4 | | | | | |
| ch_{16} - sp_4 - lb | 2.34 | 1.09 | 23.9 | 4.05 | 72.7 | | | | | |
| sp_2 - lb | 2.20 | 1.09 | 19.6 | 3.91 | 73.4 | | | | | |
| sp_4 - lb | 2.20 | 1.09 | 19.4 | 3.91 | 73.5 | | | | | |
| _ | | | 19.4 | 3.91 | | | | | | |

| CTRUCTURE | FLOPs | BOPs | $\mathbf{M}\mathbf{E}\mathbf{M}$ | OPs | TOP-1 | |
|---------------------------|-----------------|------------------|----------------------------------|-----------------|-------------|--|
| STRUCTURE | $(\times 10^8)$ | $(\times 10^9)$ | (MBITS) | $(\times 10^8)$ | (%) | |
| RESNET18 | 37.5 | - | 374 | 37.5 | 69.8 | |
| XNOR-NET | 2.88 | 3.35 | 33.6 | 3.40 | 51.2 | |
| REACTNETA | 0.58 | 9.63 | 31.0 | 2.08 | 69.4 | |
| | OUR E | VALUATI | IONS | | | |
| sp_4 - ch_{16} - lb | 0.84 | 9.63 | 54.2 | 2.35 | 70.9 | |
| ch_{16} - sp_4 - lb | 0.84 | 9.63 | 54.2 | 2.35 | 70.8 | |
| sp_2 - lb (SCRATCH) | 0.73 | 9.63 | 32.8 | 2.23 | 69.3 | |
| sp_4 - lb (SCRATCH) | 0.73 | 9.63 | 32.8 | 2.23 | 69.4 | |
| sp_4 - lb | 0.73 | 9.63 | 32.8 | 2.23 | 70.7 | |
| 3.5 | | ~ \ \ \ . | | | 1(0) | |
| MODEL | TOP-1(9 | %) MOI | DEL | Тог | P-1(%) | |
| XNOR-NET | 51.2 | BI-R | BI-REALNET | | 56.4 | |
| CI-BCNN | 56.7 | XNO | XNOR-NET++ | | 57.1 | |
| MELIUSNETA | 64.4 | REA | REAL-TO-BIN | | 65.4 | |
| REACTNET18 | 65.9 | REA | REACTNETA | | 69.4 | |
| HIGH-CAPACITY | 70.0 SA-BN | | BNN | 6 | 51.7 | |
| RB-NETX2 | 70.1 POKEBNN- | | EBNN-1. | .0x 73.4 | | |
| sp_4 - ch_{16} - lb | 70.9 | $ sp_4$ - | $ sp_4$ - lb | | 70.7 | |
| | | | | | | |

CIFAR-100

ImageNet

Results

- $sp_{r_{sp}}$: biased spatial attention with reduction ratio r_{sp} . ch_{r_c} : biased channel attention with reduction ratio r_c . lb: learnable bias for each channel.
- Without teacher-student training, the proposed structure shows comparable performance to the baseline model using teacher-student training.
- The cases only using the proposed 1-D spatial attention have good performance.