



Find Tiny Instance Segmentation

for Autonomous Driving

Megvii (Face++) Team

I. WAD Competition





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Peking University



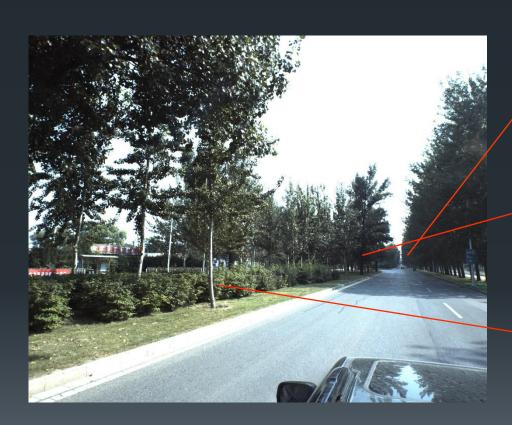
Zeming LI*
Tsinghua University

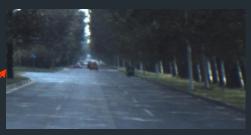


Gang YU Megvii Inc

I. Challenge in WAD











Car !!!!!



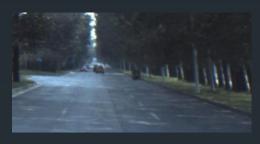
Bus !!!!!

9 Objects !!!!!

small objects dominants on this challenge

I. Challenge in WAD





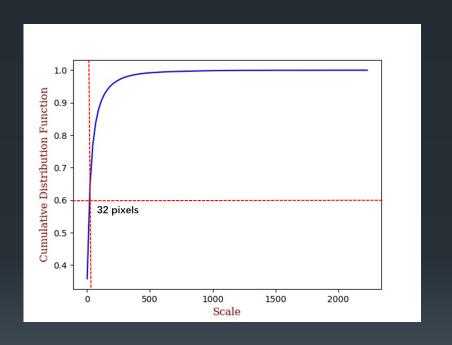
Car !!!!!



Car !!!!!



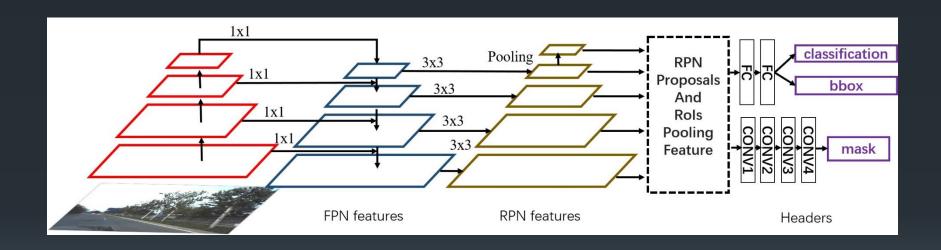
Bus !!!!!



small objects dominants on this challenge

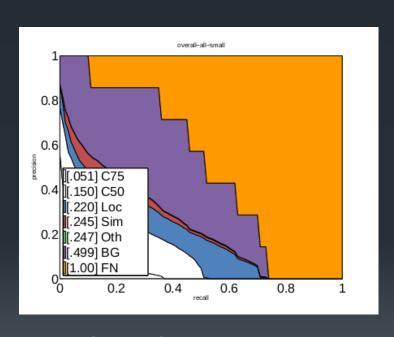
2. Our solution



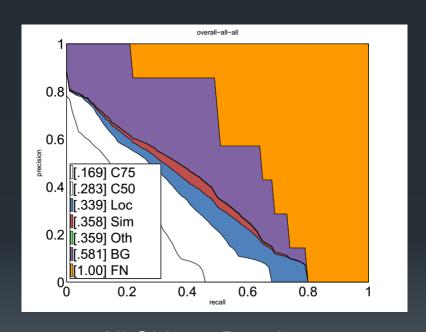


Mask R-CNN Result





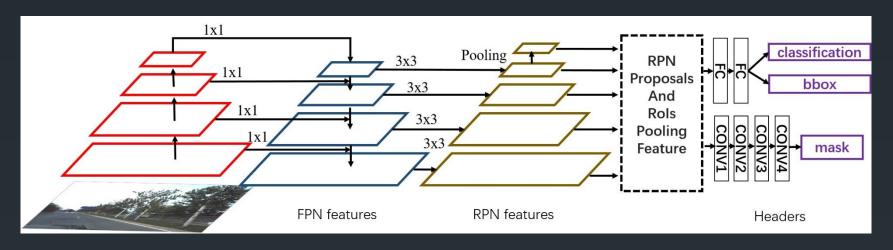
Small Objects Result



All Objects Result

2.1 Our solution

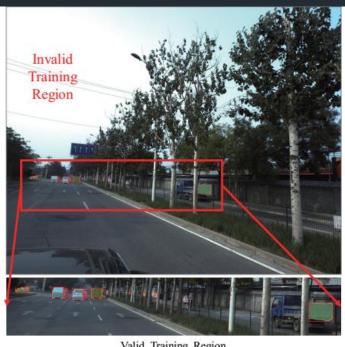




| Network | mAP_{50} | mAP_{75} | mAP_s | mAP_m | mAP_l | mAP |
|------------|------------|------------|---------|---------|---------|------|
| Mask R-CNN | 25.4 | 15.1 | 7.1 | 23.1 | 35.9 | 15.2 |
| + [COCO] | 28.1 | 16.8 | 7.5 | 26.9 | 36.8 | 16.9 |
| + CA | 28.6 | 17.0 | 7.4 | 28.0 | 40.0 | 17.2 |
| + PA | 29.4 | 17.8 | 8.2 | 27.9 | 40.2 | 17.7 |

2.2 Our solution



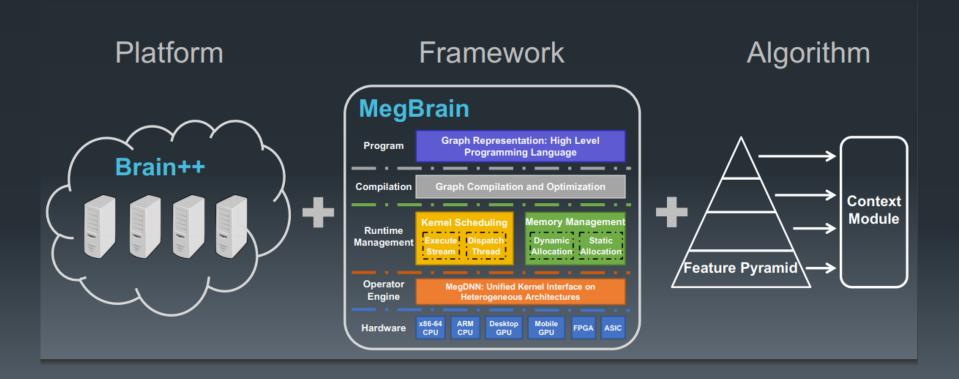


Valid Training Region

| Network | Scale | mAP_{50} | mAP_{75} | mAP_s | mAP_m | mAP_l | \overline{mAP} |
|-------------------|--------------|------------|------------|---------|---------|---------|------------------|
| Mask R-CNN [COCO] | [1500, 1800] | 28.1 | 16.8 | 7.5 | 26.9 | 36.8 | 16.9 |
| Mask R-CNN [COCO] | [1800, 2400] | 29.9 | 18.3 | 9.2 | 27.5 | 40.0 | 18.3 |
| Mask R-CNN [COCO] | VTR | 30.3 | 19.5 | 9.1 | 30.5 | 42.8 | 18.9 |

2.3.1 Our solution

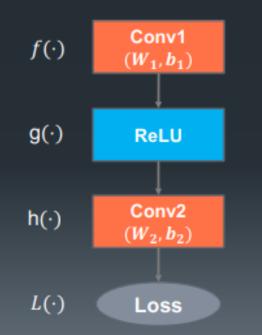




2.3.2 Our solution



Sublinear Memory



$$h(\cdot) = g(f(x)) \quad \frac{\partial L}{\partial W_2} = \frac{\partial L}{\partial h} \frac{\partial h}{\partial W_2}$$

$$\frac{\partial L}{\partial W_2} = \frac{\partial L}{\partial g(f(x))} \frac{\partial g(f(x))}{\partial W_2}$$

We can compute the $h(\cdot)$ in BP and thus don't need to store the Conv2! [T. Chen et al, Arxiv'16]

Some Results on Local Val Face 旷视

| Network | COCO | PA | VTR | FI | mAP_{50} | mAP_{75} | mAP_s | mAP_m | mAP_l | mAP |
|------------|--------------|--------------|--------------|--------------|------------|------------|---------|---------|---------|------|
| Mask R-CNN | | | | | 25.4 | 15.1 | 7.1 | 23.1 | 35.9 | 15.2 |
| Mask R-CNN | \checkmark | | | | 28.1 | 16.8 | 7.5 | 26.9 | 36.8 | 16.9 |
| Mask R-CNN | ✓ | \checkmark | | | 29.9 | 18.3 | 9.2 | 27.5 | 40.0 | 18.3 |
| Mask R-CNN | ✓ | \checkmark | ✓ | | 30.3 | 19.5 | 9.1 | 30.5 | 42.8 | 18.9 |
| Mask R-CNN | ✓ | \checkmark | \checkmark | \checkmark | 34.3 | 21.5 | 10.6 | 33.1 | 44.0 | 21.2 |

Some Results on Test



| Network | Backbone | mAP |
|-----------------------|---------------------|------|
| Mask R-CNN | ResNet-50 | 26.7 |
| Our TIS | ResNet-50 | 29.0 |
| Our TIS | SENet-152 | 31.9 |
| Our $TIS + MS$ | ResNet-PSPNet-152 | 32.4 |
| Our $TIS + MS$ | 2*ResNet-PSPNet-152 | 32.8 |
| Our TIS $+$ MS | +SENet 152 | 33.9 |
| Second in leaderboard | unknown | 30.2 |
| Third in leaderboard | unknown | 26.7 |

Some Visual Results







1) Remote Small Objects



2) Riders and Pedestrian Riders are not included in this challenge

Some Visual Results







Thanks ~ Welcome to Join Megvii