



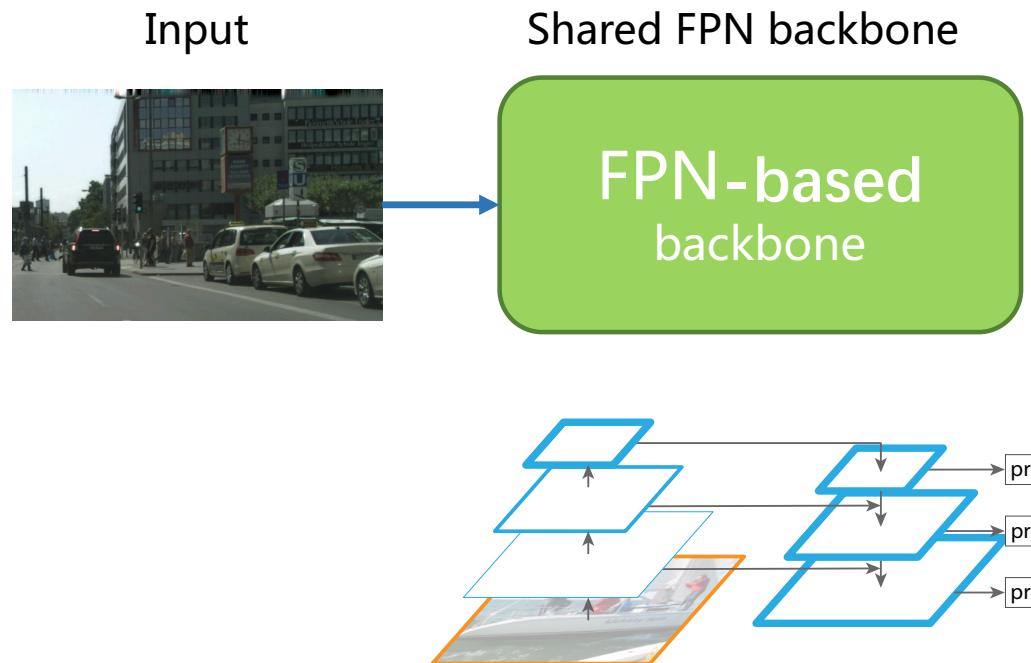
FPN-based Network for Panoptic Segmentation

Caribbean Team

Yanwei Li^{* 1, 2}, Naiyu Gao^{* 1, 2}, Chaoxu Guo^{1, 2}, Xinze Chen¹, Qian Zhang¹,
Guan Huang¹, Xin Zhao², Kaiqi Huang², Dalong Du¹, Chang Huang¹

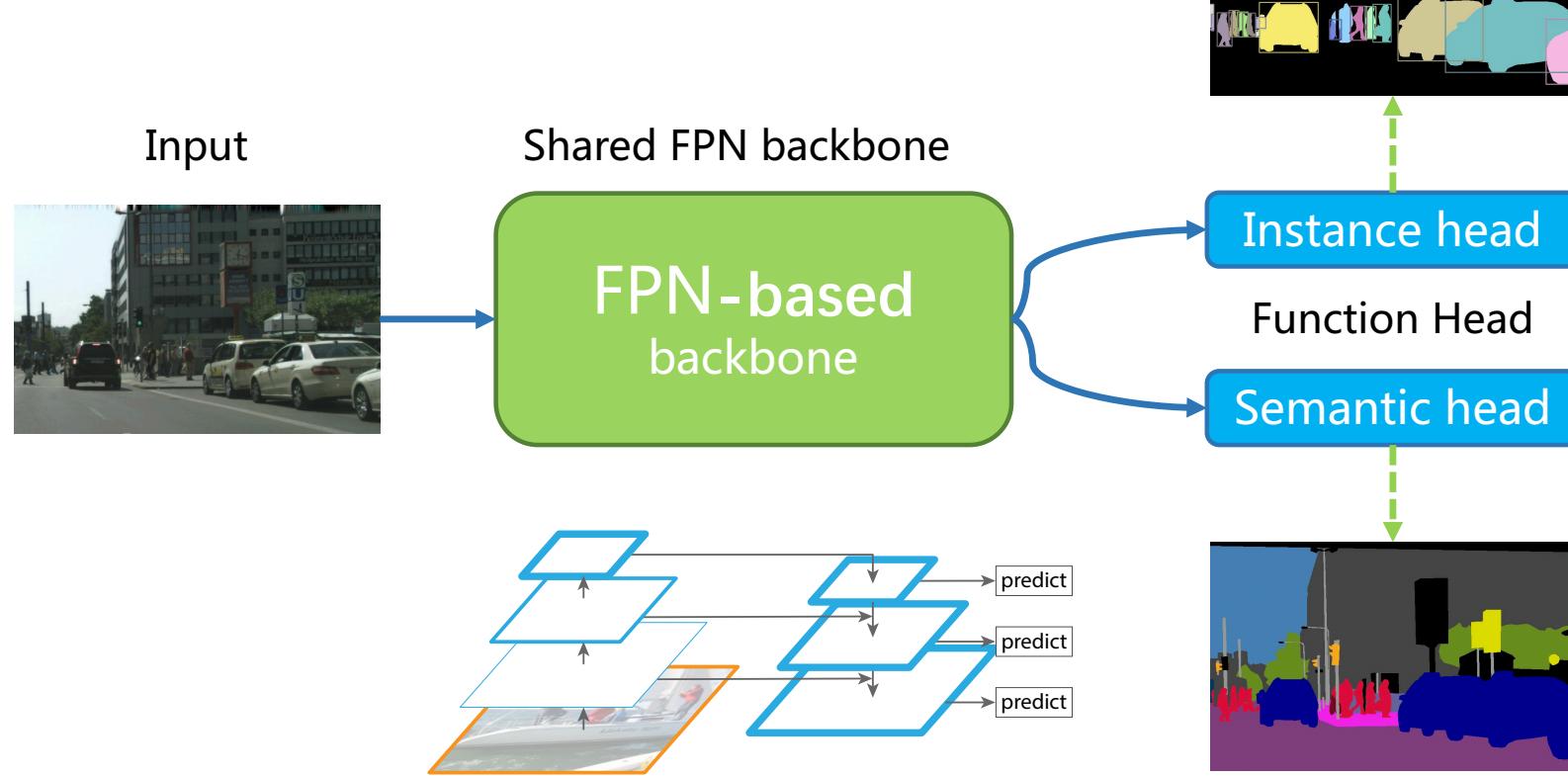
¹ Horizon Robotics,
² Institute of Automation, CAS

FPN-based Network



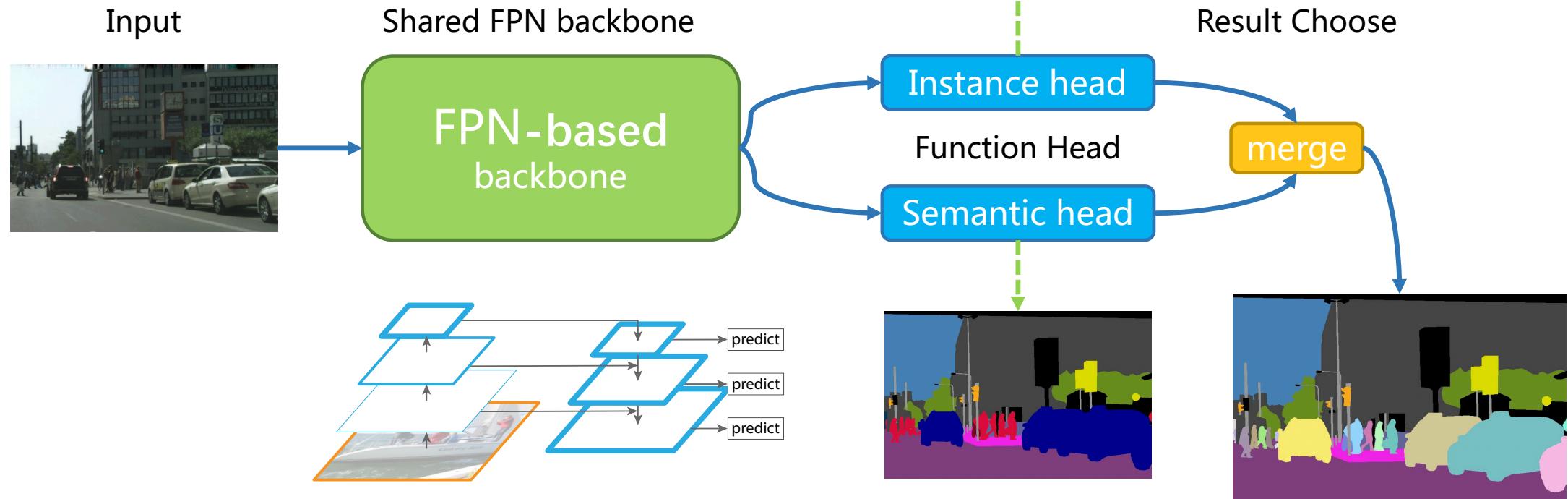
Kirillov A, He K, Girshick R B, et al. Panoptic Segmentation.[J]. arXiv: Computer Vision and Pattern Recognition, 2018.
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FPN-based Network



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FPN-based Network

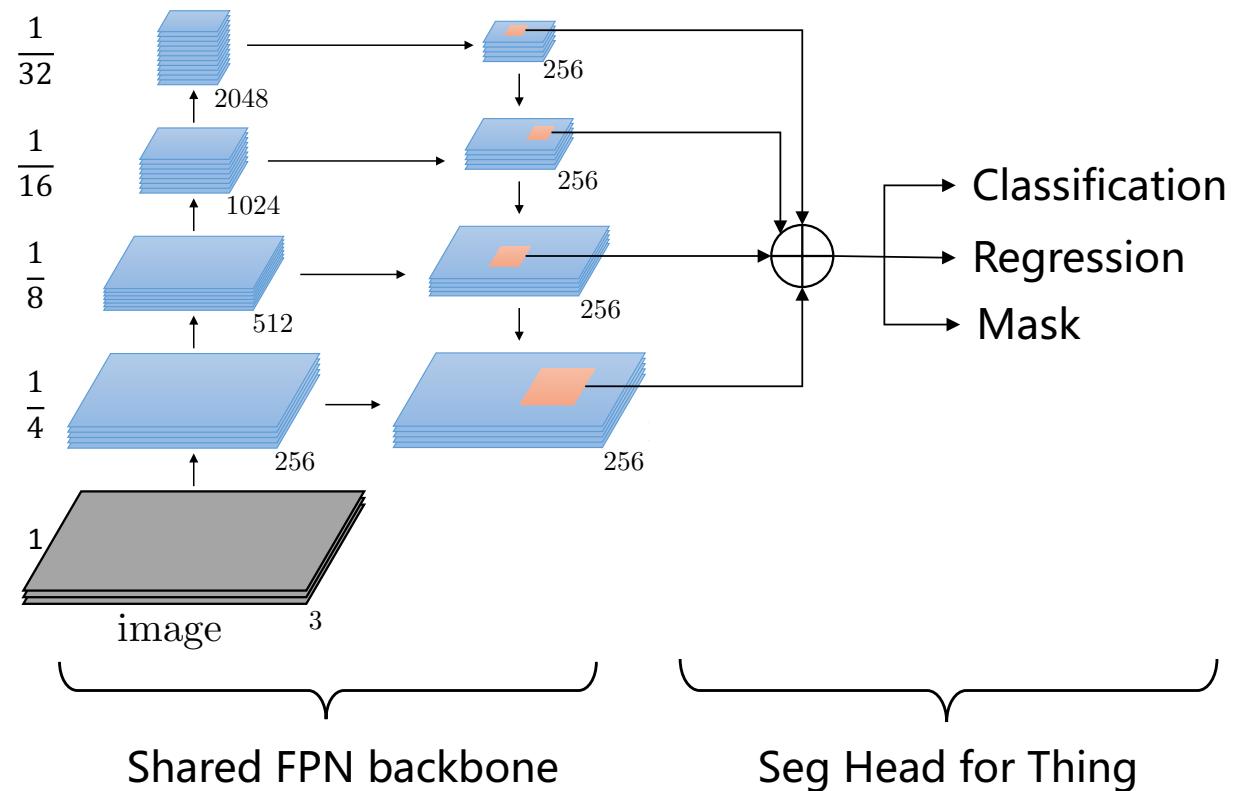


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Panoptic Segmentation (Thing)

Unified Framework

- Mask R-CNN architecture
- Shared FPN backbone



He K, Gkioxari G, Dollar P, et al. Mask R-CNN[J]. ICCV 2017

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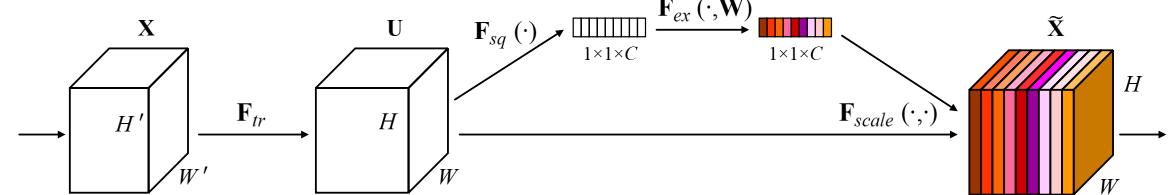
Panoptic Segmentation (Thing)

Unified Framework

- Mask R-CNN architecture
- Shared FPN backbone

Stronger Network

- SENet154
- Deformable Conv.
- Nonlocal Conv.



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Panoptic Segmentation (Thing)

Unified Framework

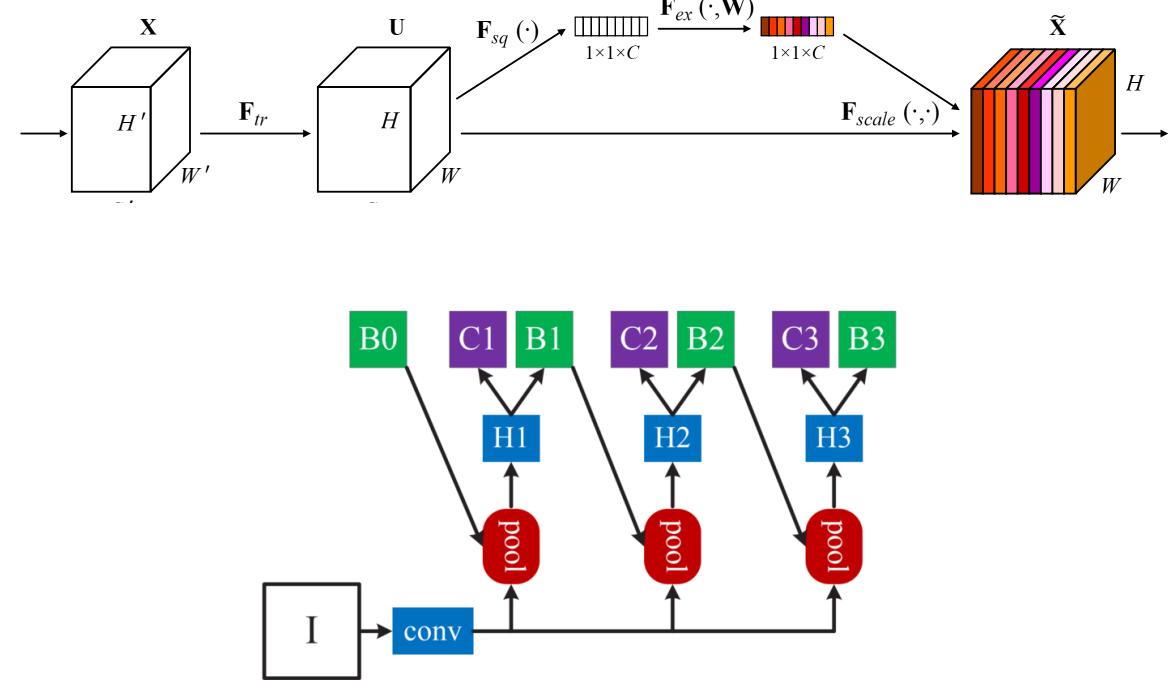
- Mask R-CNN architecture
- Shared FPN backbone

Stronger Network

- SENet154
- Deformable Conv.
- Nonlocal Conv.

Bbox Head

- Cascade R-CNN



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Panoptic Segmentation (Thing)

Unified Framework

- Mask R-CNN architecture
- Shared FPN backbone

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- Nonlocal Conv.

Bbox Head

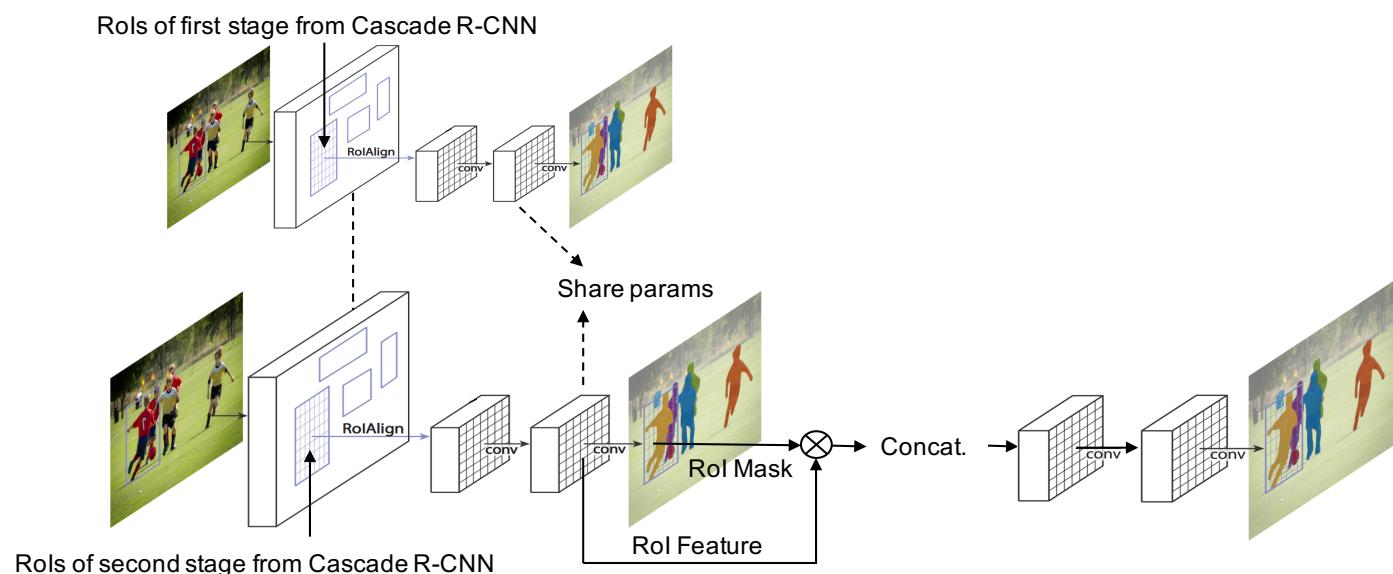
- Cascade R-CNN

Mask Head

- Cascade Mask

Exploits RoIs of from box head
to refine the mask results.

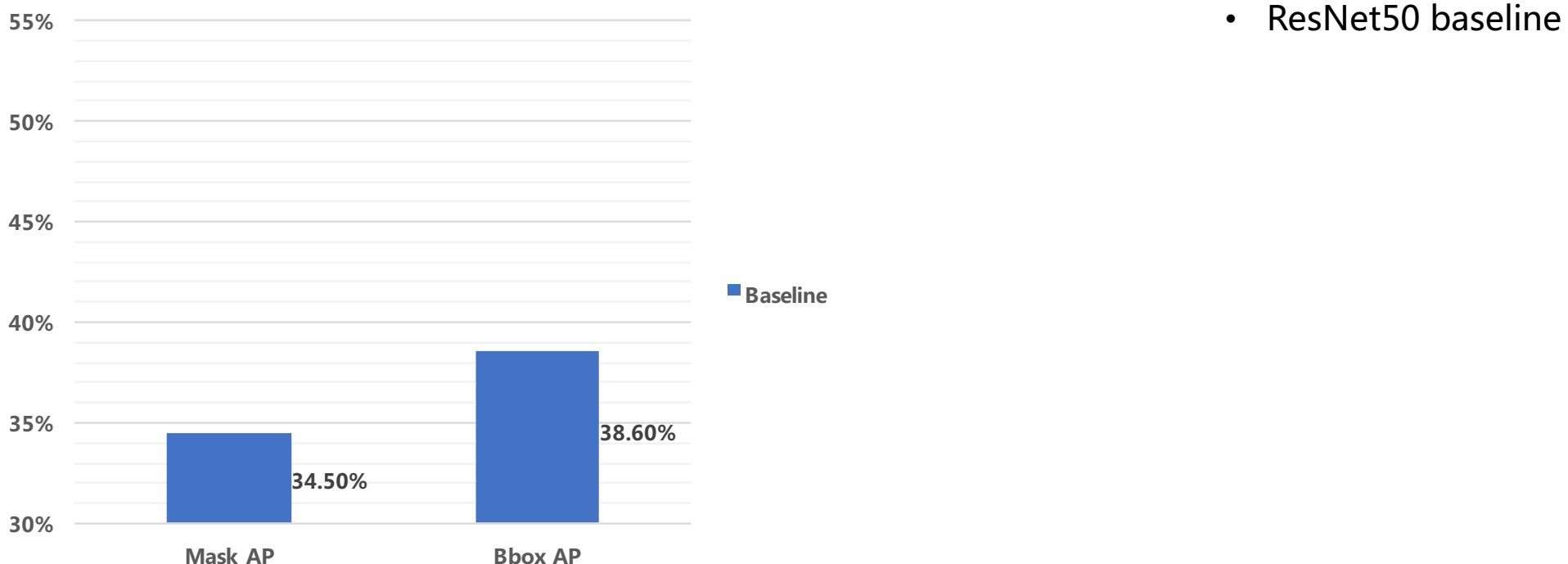
Test-tricks



Shared FPN Inference Thing

Panoptic Segmentation (Thing)

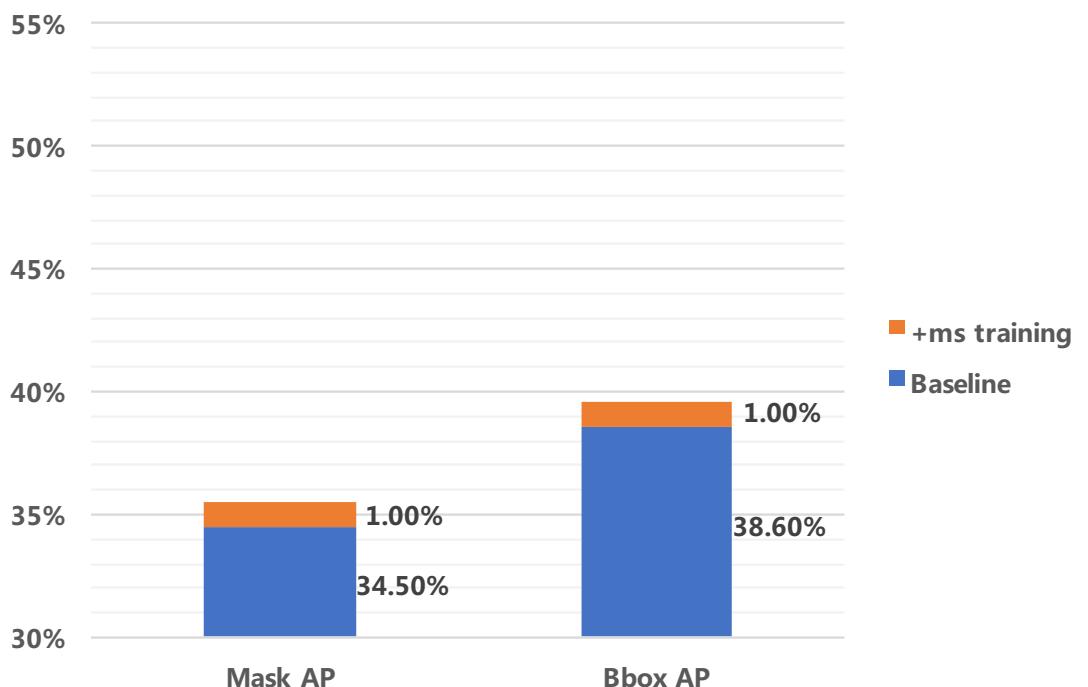
Results on Val5000



Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000

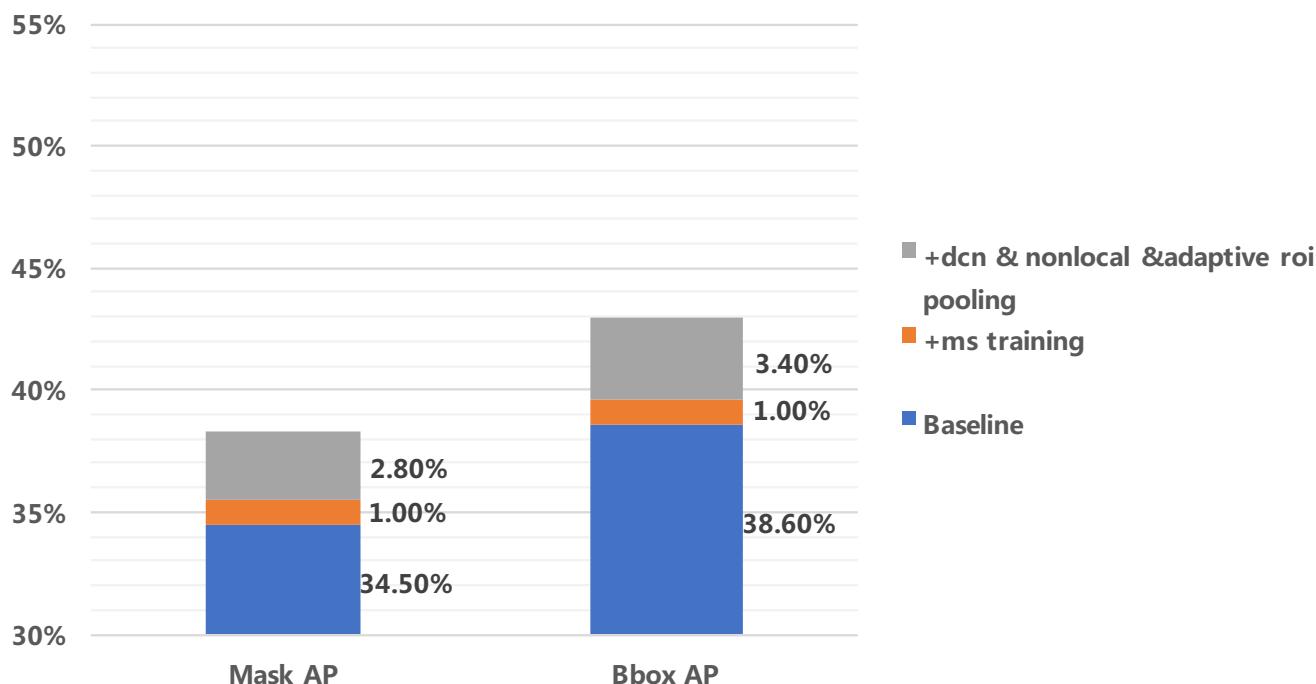


- ResNet50 baseline
- Using multi-scale training

Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000

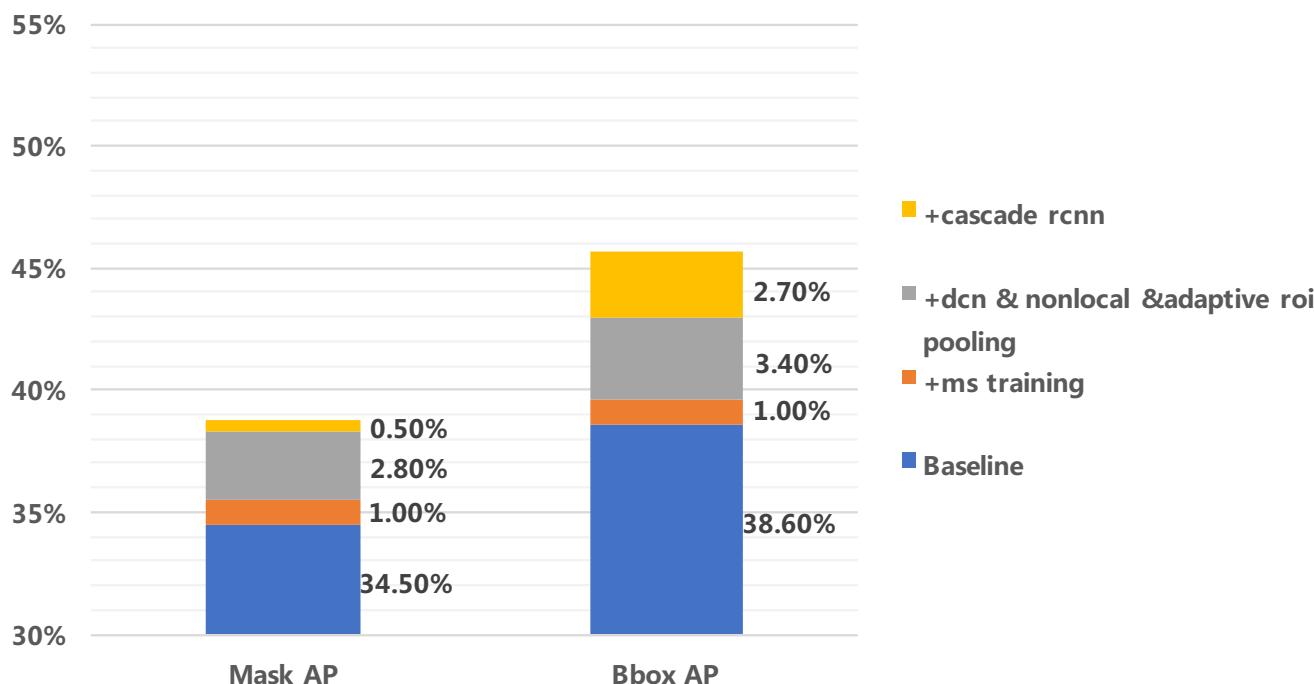


- ResNet50 baseline
- Using multi-scale training
- Adopt DCN & Nonlocal & Adaptive RoI pooling

Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000

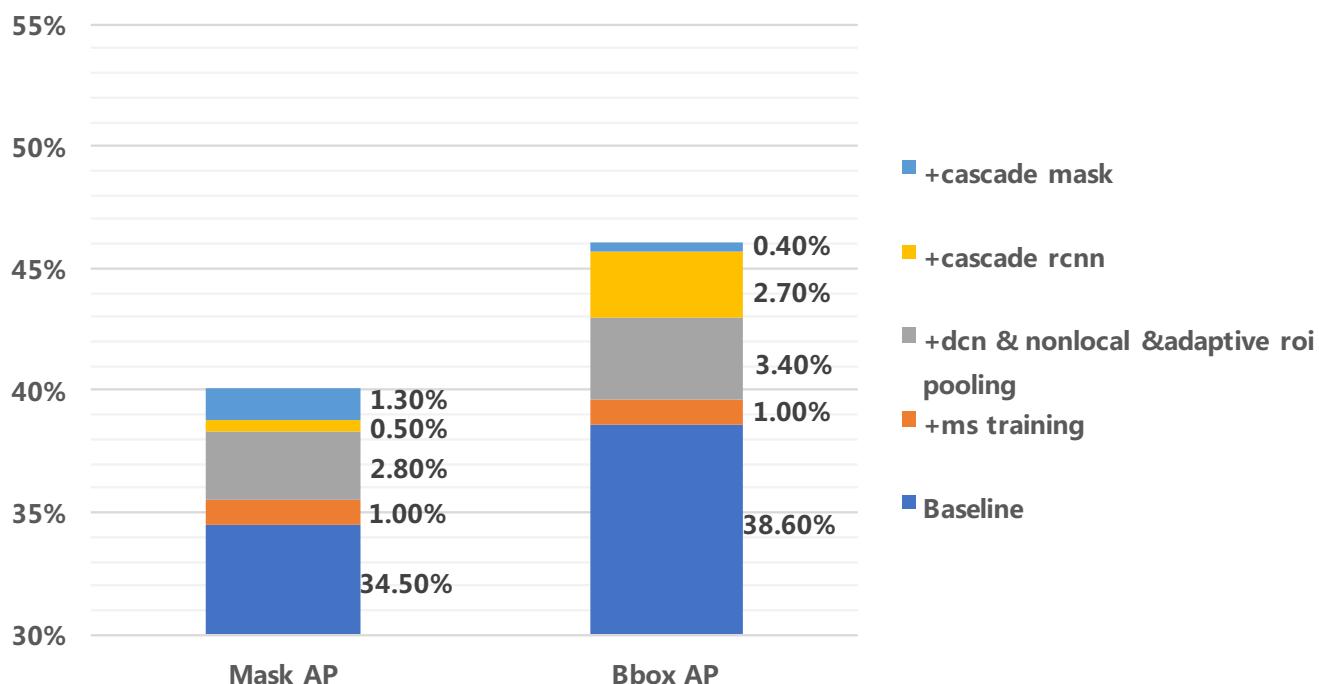


- ResNet50 baseline
- Using multi-scale training
- Adopt DCN & Nonlocal & Adaptive RoI pooling
- Cascade RCNN

Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000

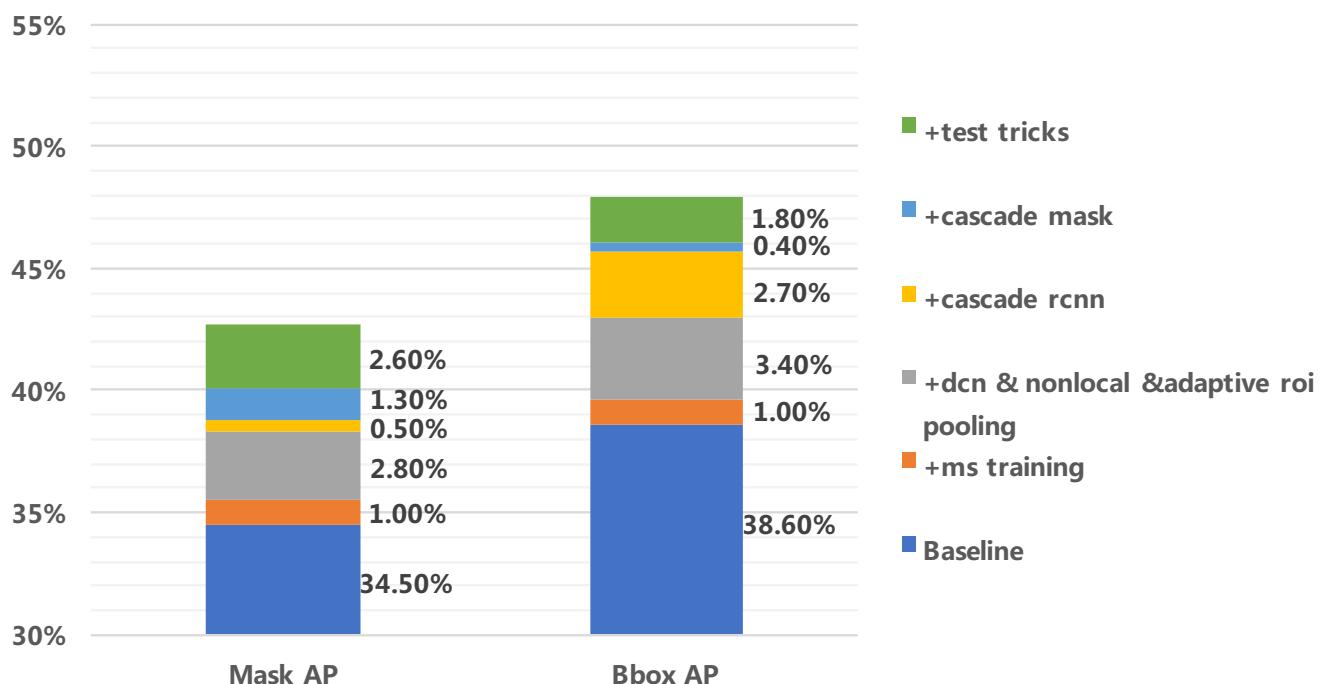


- ResNet50 baseline
- Using multi-scale training
- Adopt DCN & Nonlocal & Adaptive RoI pooling
- Cascade RCNN
- Cascade Mask

Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000

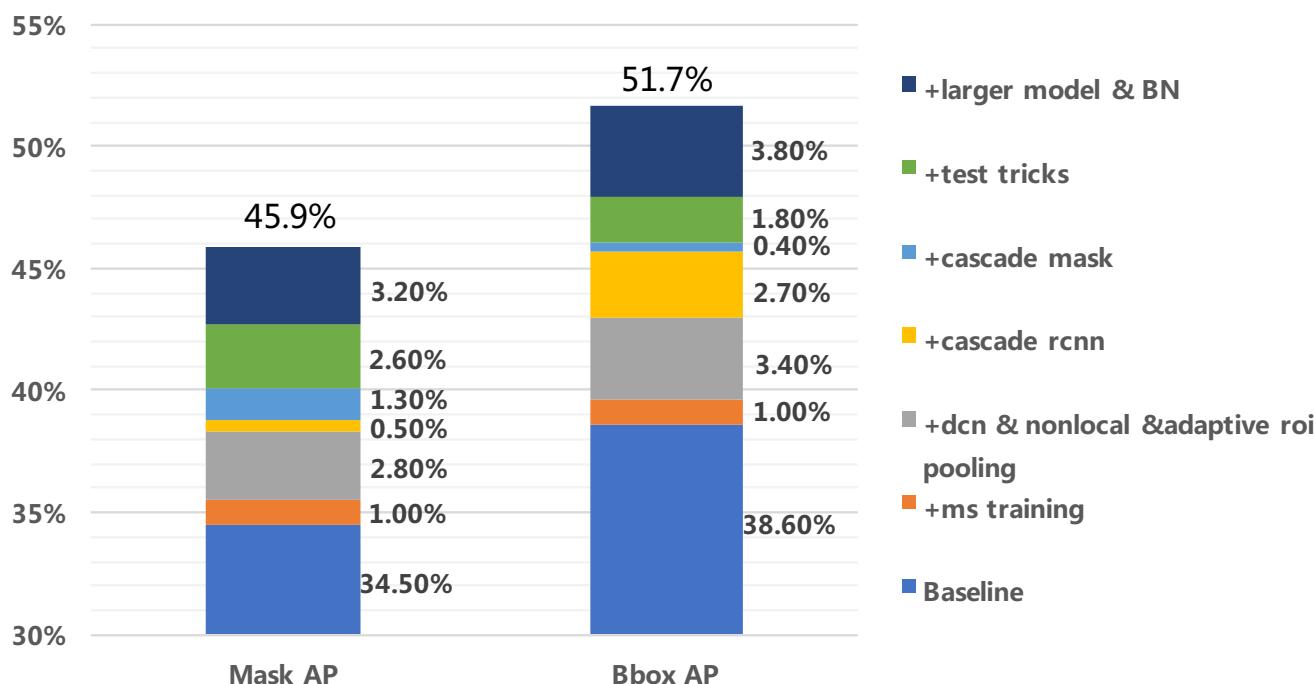


- ResNet50 baseline
- Using multi-scale training
- Adopt DCN & Nonlocal & Adaptive RoI pooling
- Cascade RCNN
- Cascade Mask
- Using test tricks

Shared FPN Inference Thing

Panoptic Segmentation (Thing)

Results on Val5000



- ResNet50 baseline
- Using multi-scale training
- Adopt DCN & Nonlocal & Adaptive RoI pooling
- Cascade RCNN
- Cascade Mask
- Using test tricks
- Using larger model & BN

Panoptic Segmentation (Stuff)

Unified Framework

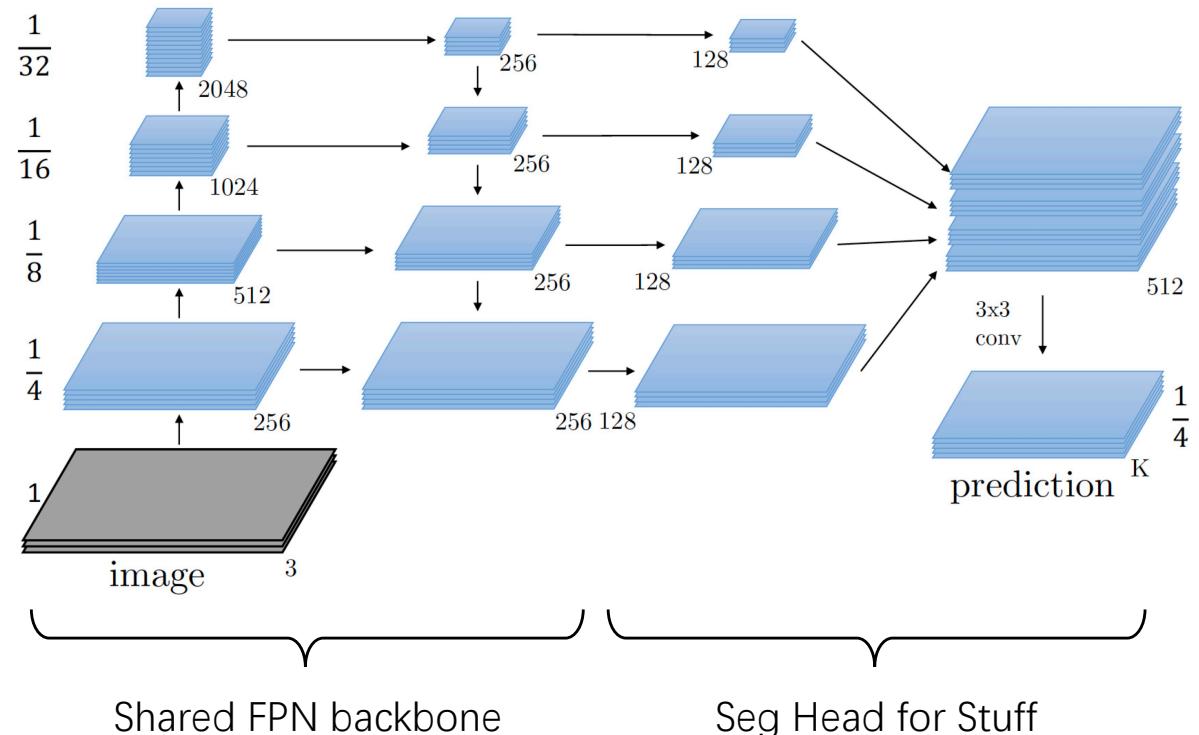
- FCN-based architecture
- Shared FPN backbone

Stronger Network

- SENet154
- Deformable Conv.
- Nonlocal Conv.

Test-tricks

- Flip
- Multi-Scale testing
- Other tricks



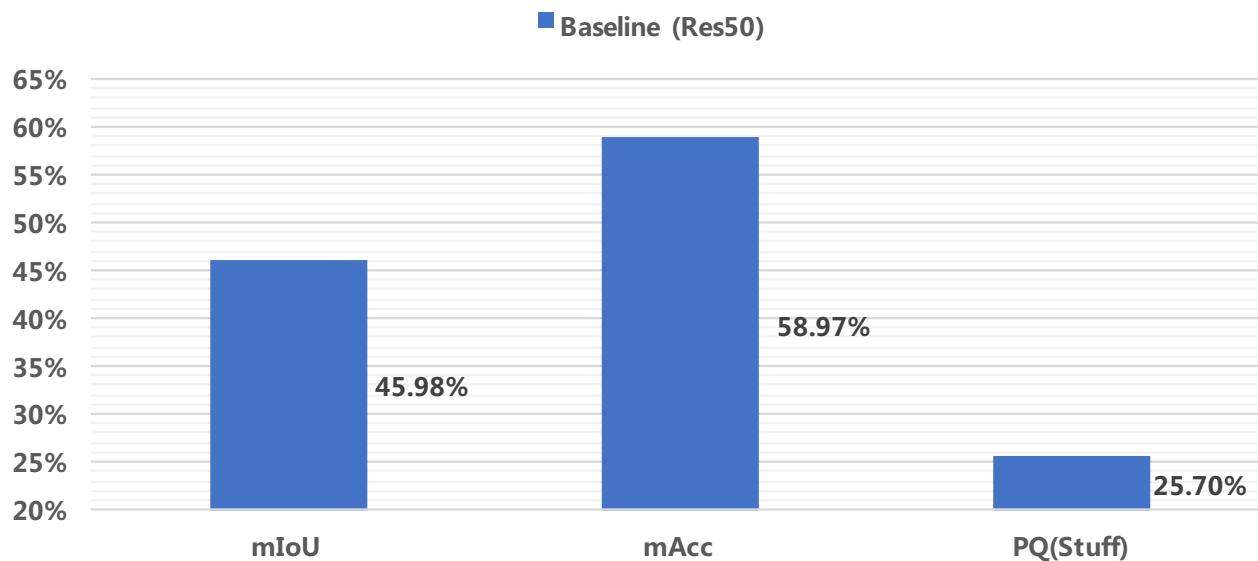
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Shared FPN Inference Stuff

Panoptic Segmentation (Stuff)

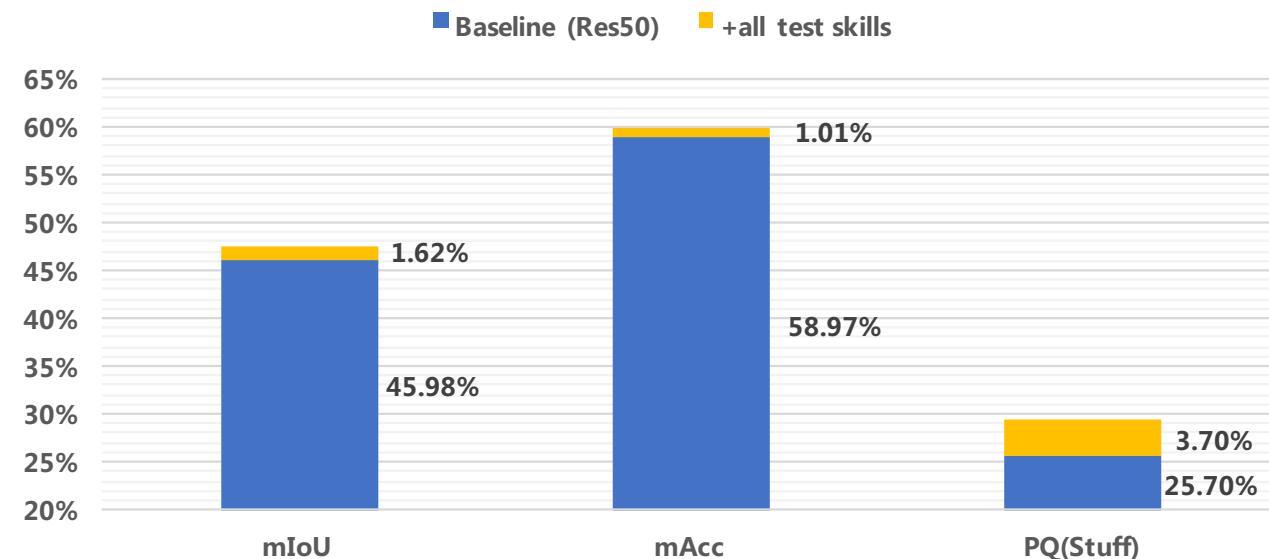
Results on Val5000



- ResNet50 baseline

Shared FPN Inference Stuff

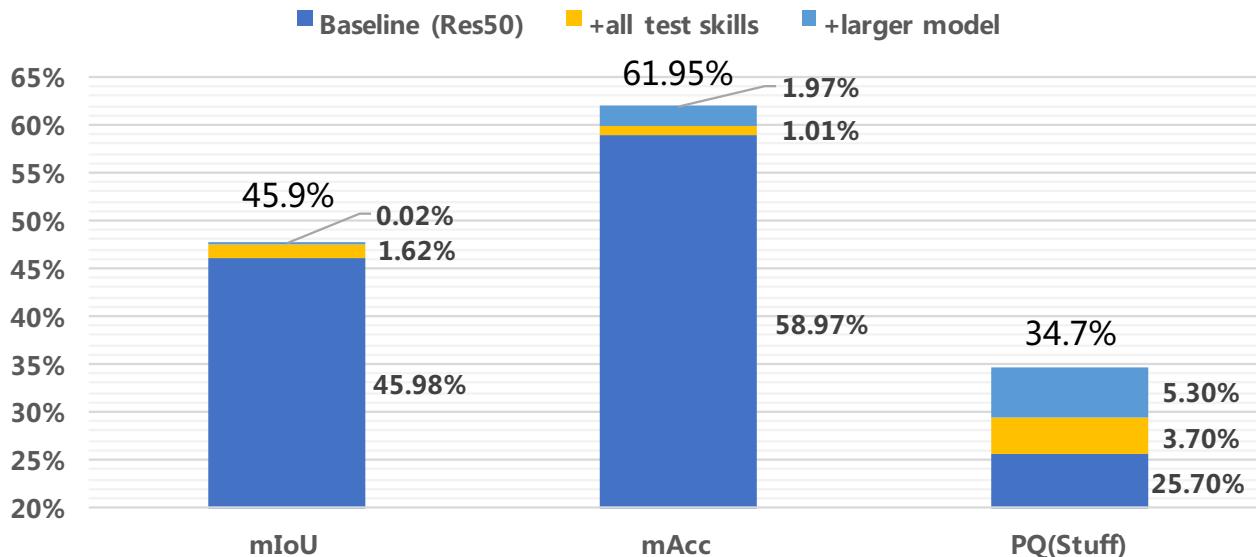
Panoptic Segmentation (Stuff) Results on Val5000



- ResNet50 baseline
- Using all test skills

Shared FPN Inference Stuff

Panoptic Segmentation (Stuff) Results on Val5000

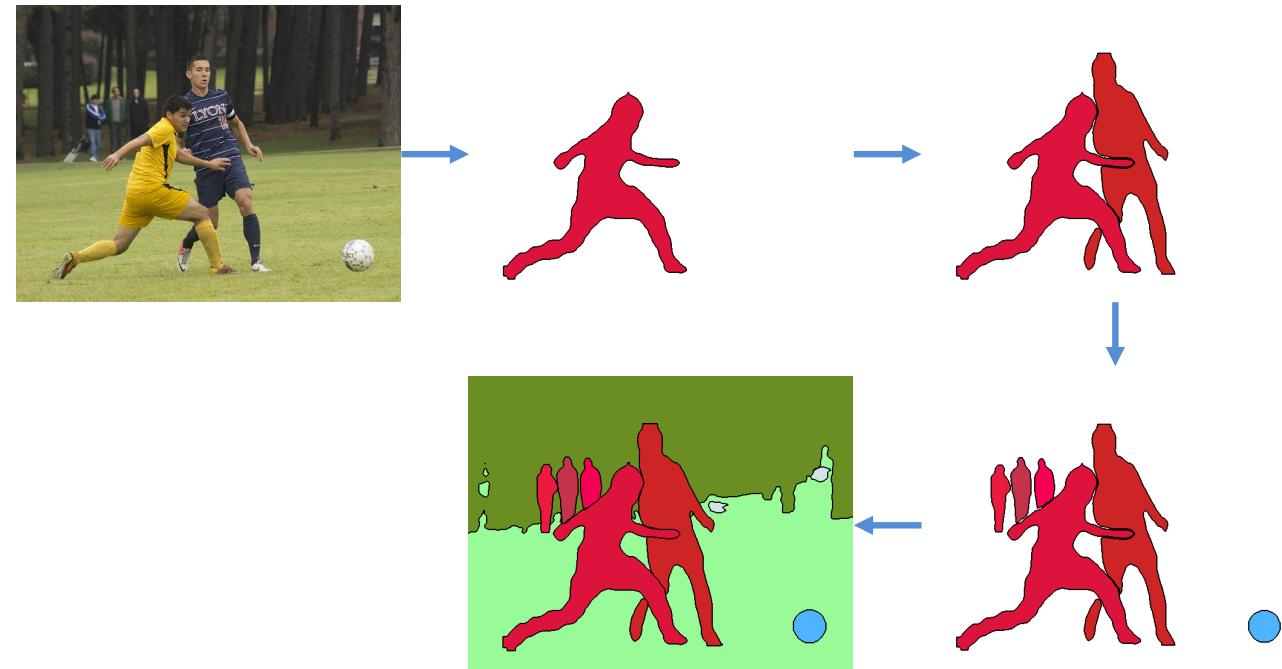


- ResNet50 baseline
- Using all test skills
- Adopt larger model

Panoptic Segmentation Merge

Merge method

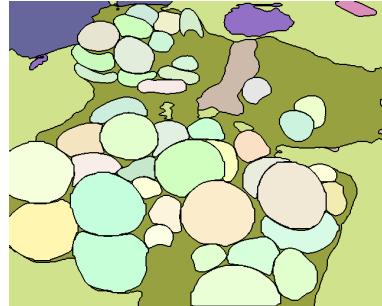
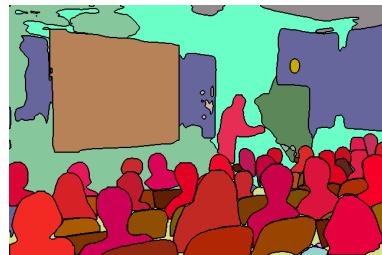
- Sort thing results with scores
- Thing first, stuff second
- Merge tricks



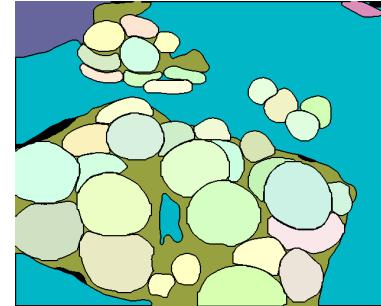
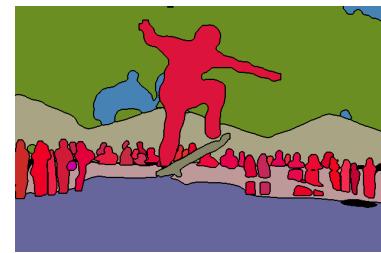
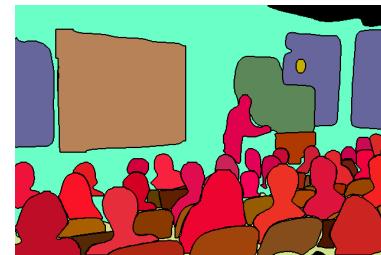
Visualize Results



Input

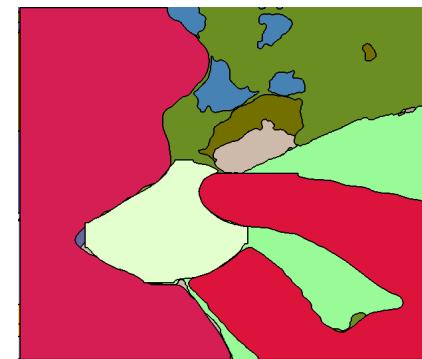
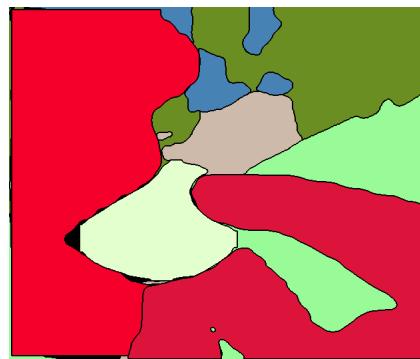
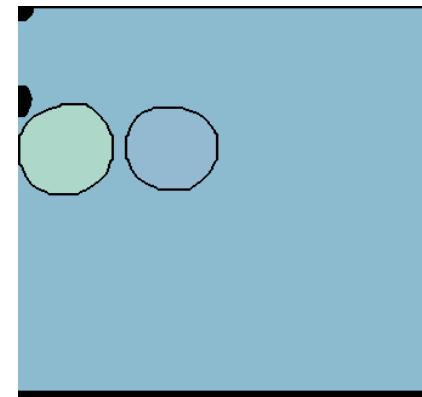


Baseline



Ensemble

Failure Results



Input

Baseline

Ensemble



Thanks & questions

For more questions, please contact:
liyanwei2017@ia.ac.cn