

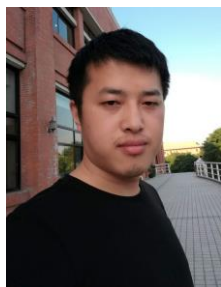


MSCOCO Keypoints Challenge 2018

Megvii (Face++)



Team members:



Zhicheng Wang



Wenbo Li



Binyi Yin



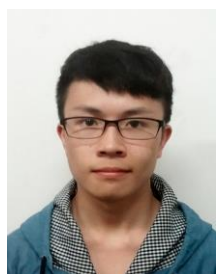
Qixiang Peng



Tianzi Xiao



Yuming Du



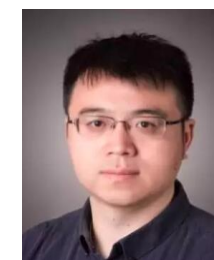
Zeming Li



Xiangyu Zhang



Gang Yu



Jian Sun

Megvii (Face++)

Results on COCO 2018

| Year | 2016 | 2017 | 2018 |
|------|------|------|------------|
| mmAP | 60.5 | 72.1 | 76.4(ours) |

Results on COCO test challenge recent years

Results on COCO 2018

| Year | 2016 | 2017 | 2018 |
|------|------|------|------------|
| mmAP | 60.5 | 72.1 | 76.4(ours) |

Results on COCO test challenge recent years

| | test_challenge | test_dev | mini_validation |
|----------------|------------------------|----------|-----------------|
| Ensemble model | 76.4(final submission) | 78.1 | 80.0 |
| Single model | - | 77.1 | 79.0 |

Results of our method

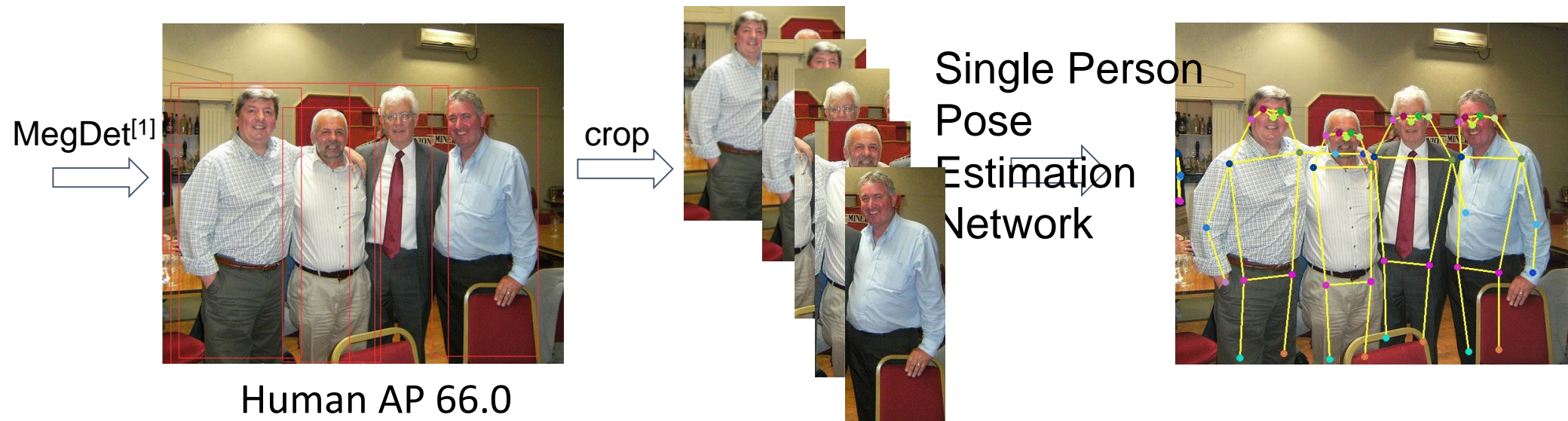
Overview

- Pipeline
- Proposed Method
- Experiments
- Summary

Overview

- Pipeline

Pipeline



[1] Megdet: A large mini-batch object detector: C Peng, et al. (CVPR2018)

Overview

- Pipeline
- Proposed Method

Proposed Methods

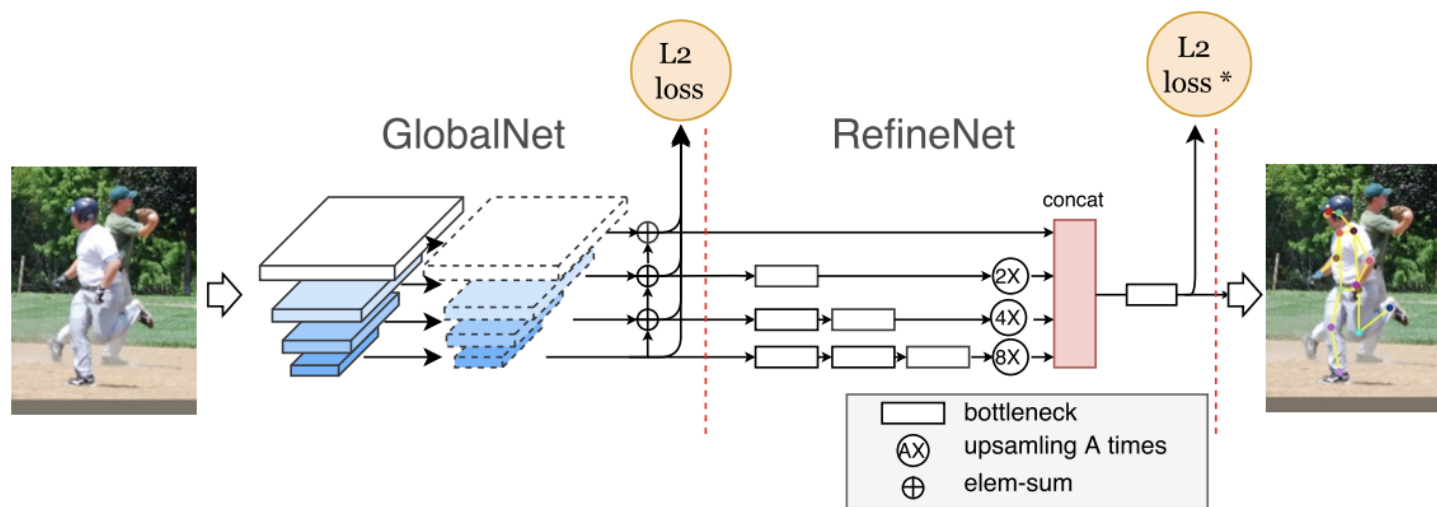


Figure 1. Cascaded Pyramid Network. “L2 loss*” means L2 loss with online hard keypoints mining.

Cascade Pyramid Network^[1]

[1] Cascaded pyramid network for multi-person pose estimation: Y Chen et al. (CVPR2018)

Proposed Methods

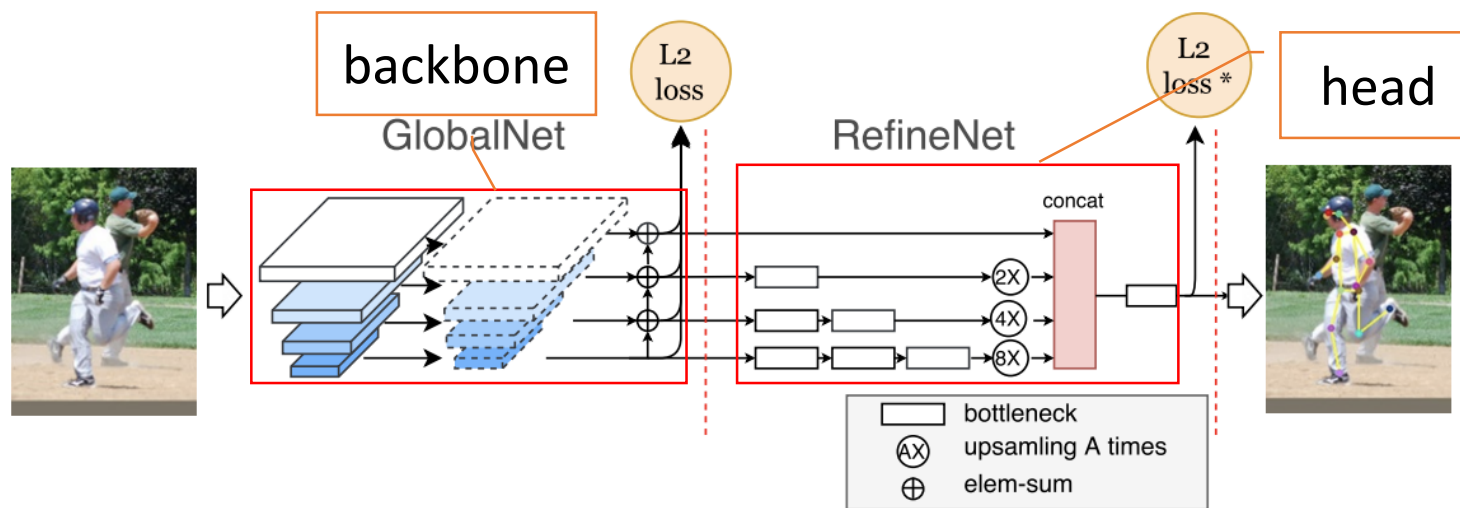


Figure 1. Cascaded Pyramid Network. “L2 loss*” means L2 loss with online hard keypoints mining.

Cascade Pyramid Network^[1]

Proposed Methods

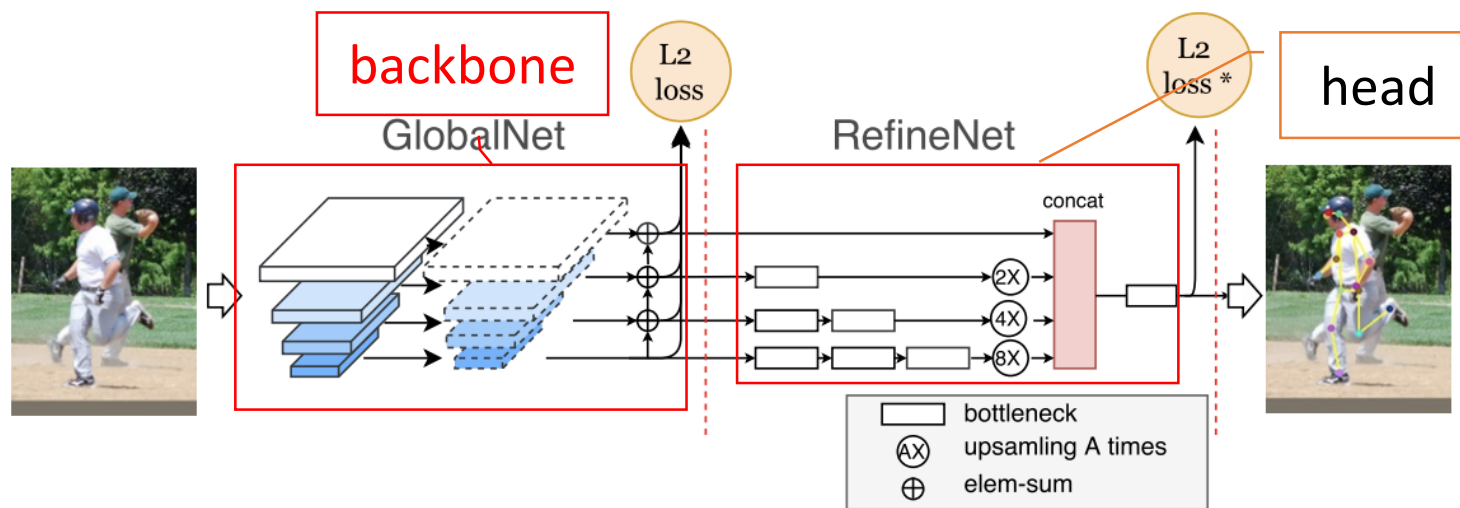
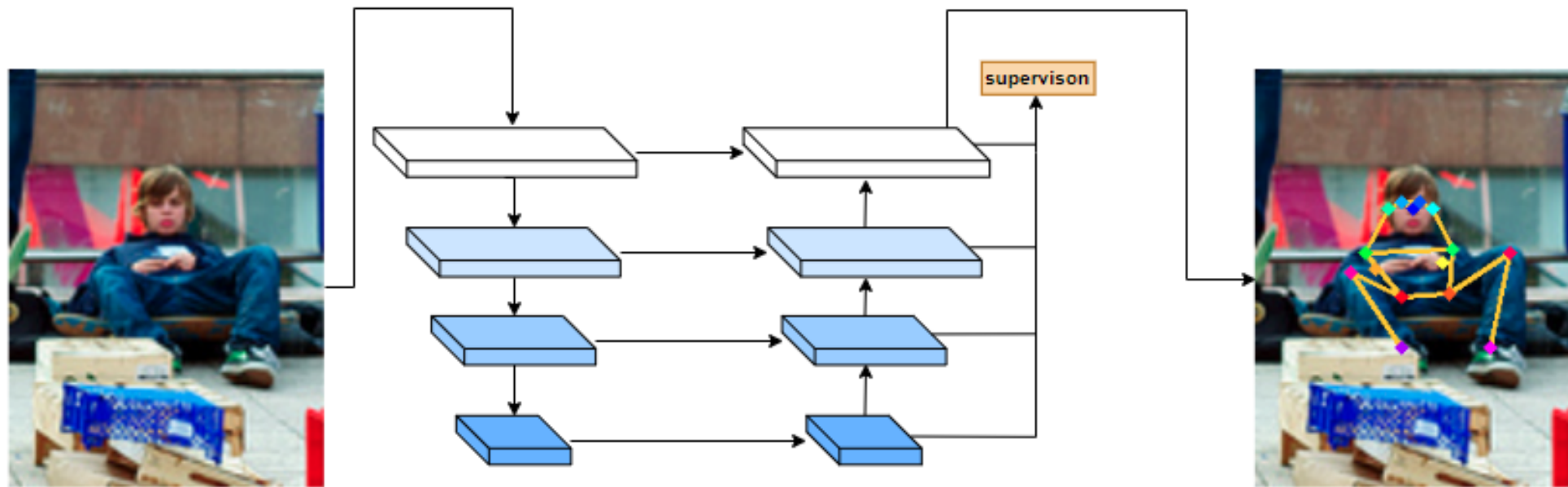


Figure 1. Cascaded Pyramid Network. “L2 loss*” means L2 loss with online hard keypoints mining.

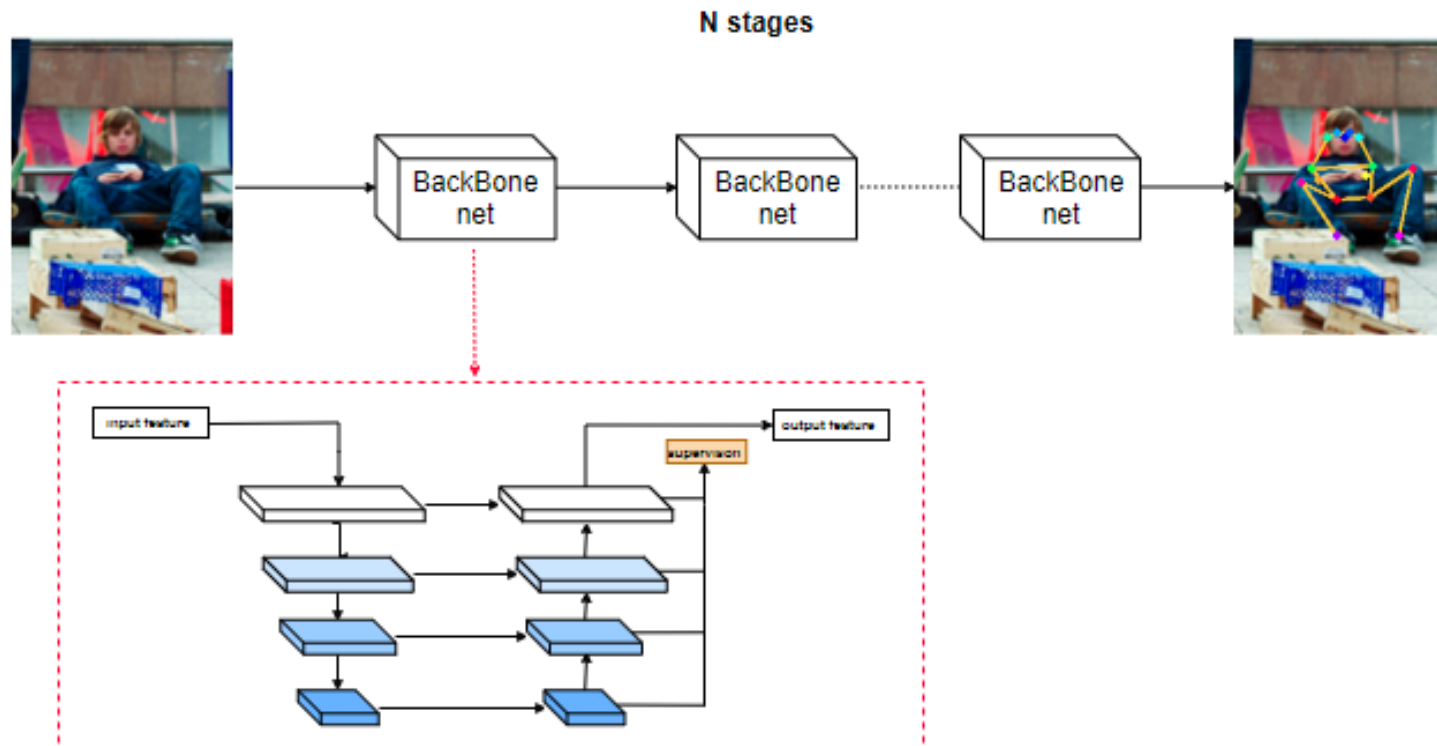
Cascade Pyramid Network^[1]

Proposed Methods



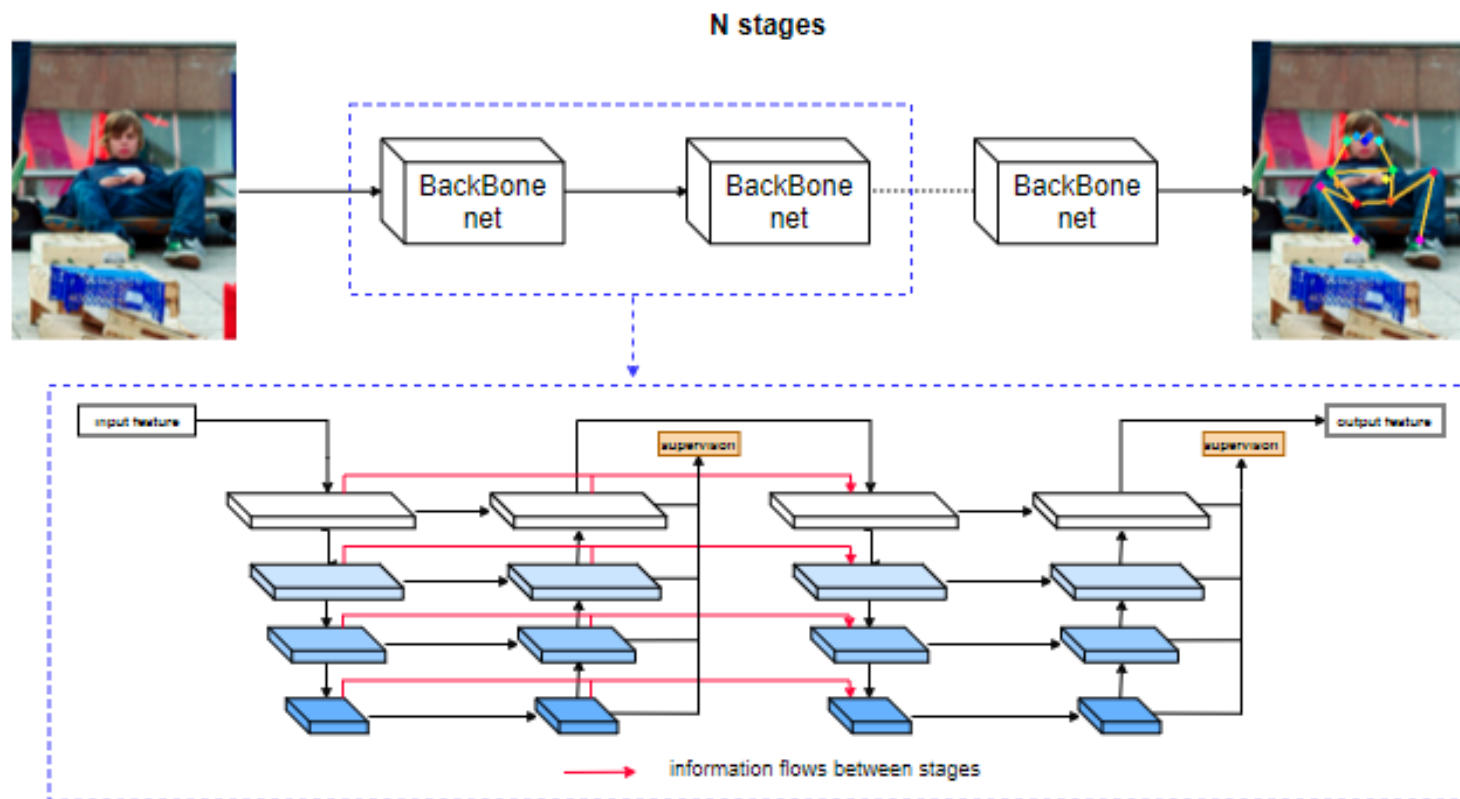
BackBone of CPN

Proposed Methods



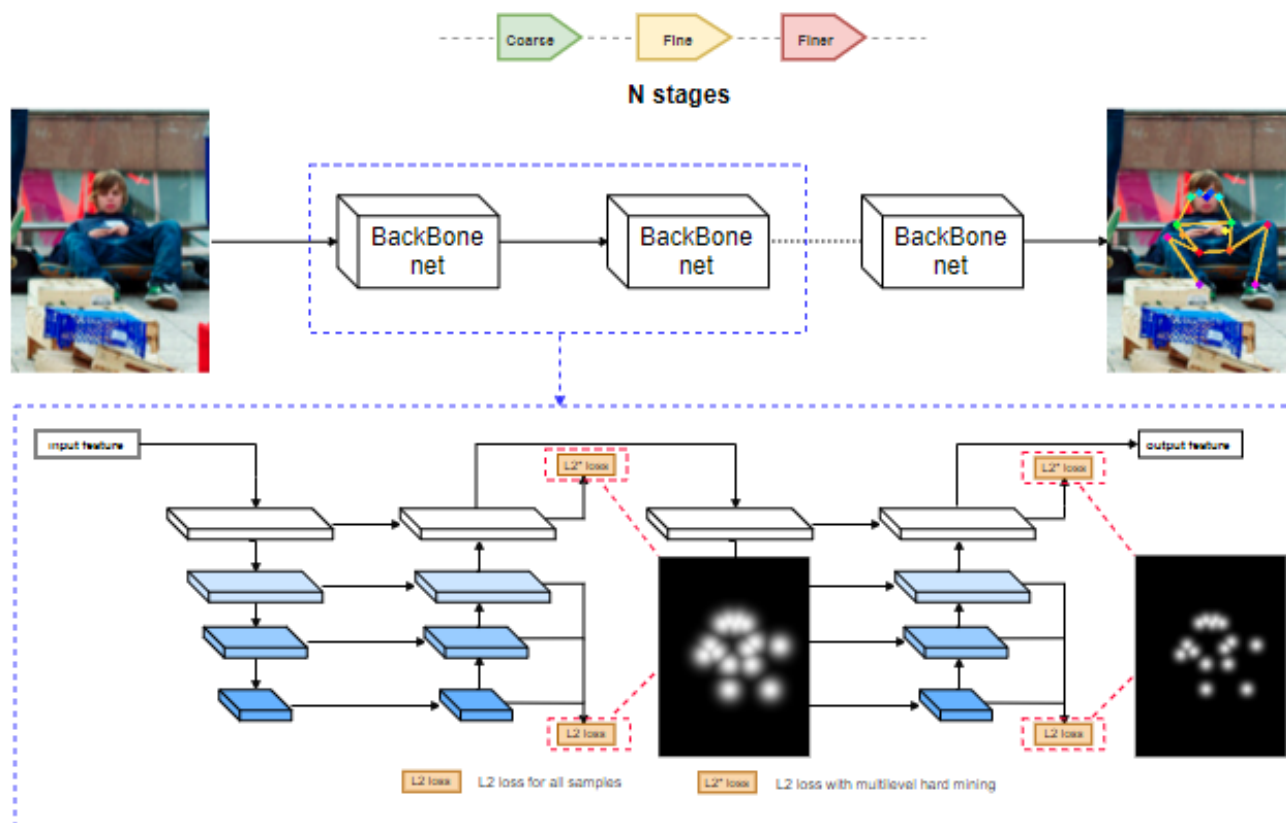
Cascade Backbone Network

Proposed Methods



Cascade Backbone Network with skip connection

Proposed Methods



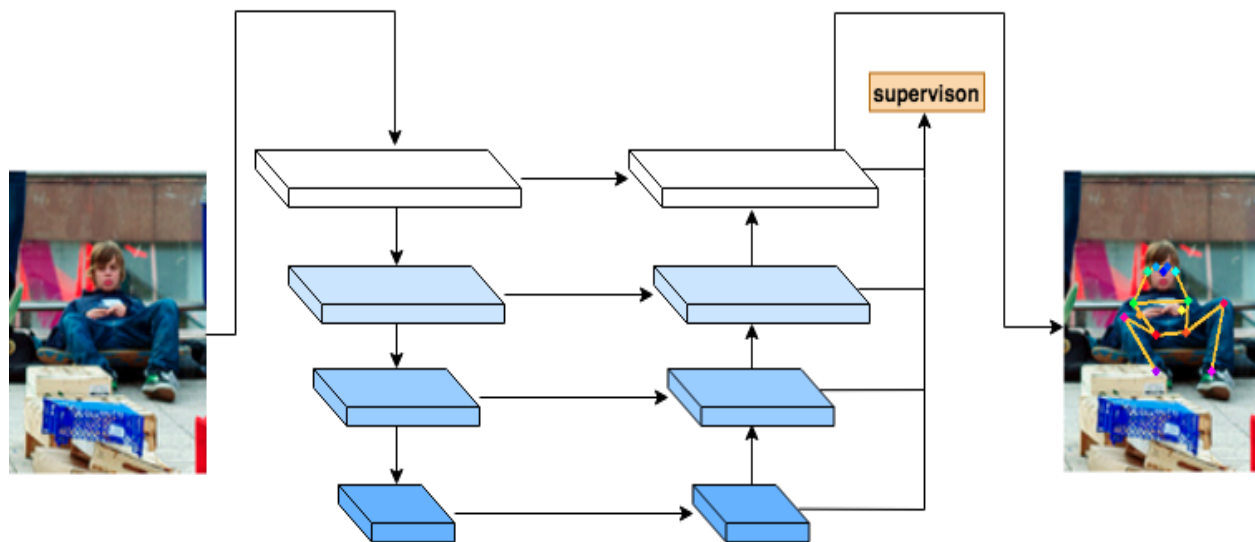
Cascade Backbone Network : Online Hard Keypoints Ming (OHKM) supervision
 : Coarse to fine supervision

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Experiments

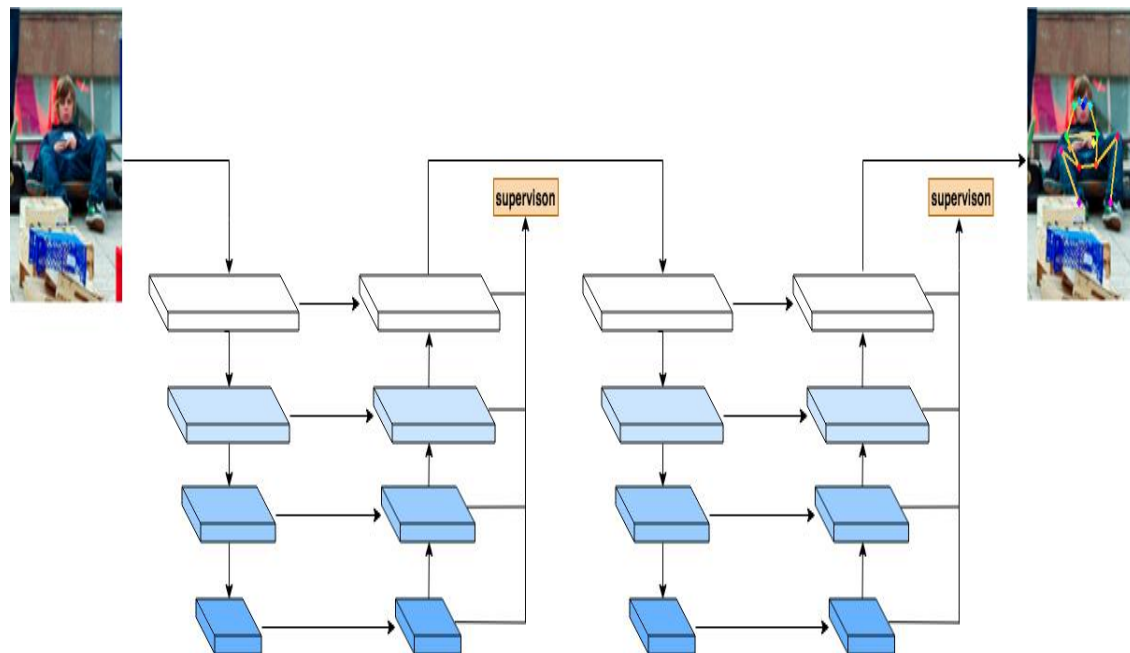
- Ablation experiments



| | | |
|--------------------------|------|---------|
| Baseline(backbone res50) | 72.3 | 256x192 |
|--------------------------|------|---------|

Experiments

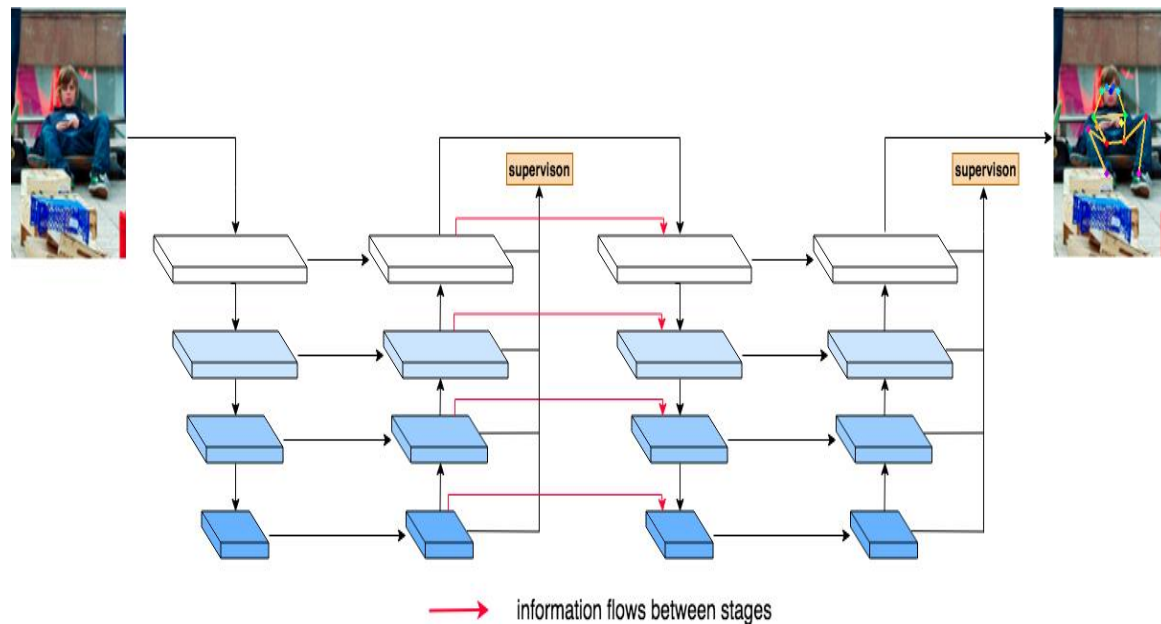
- Ablation experiments



| | | |
|--------------------------|-------------|----------------|
| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |

Experiments

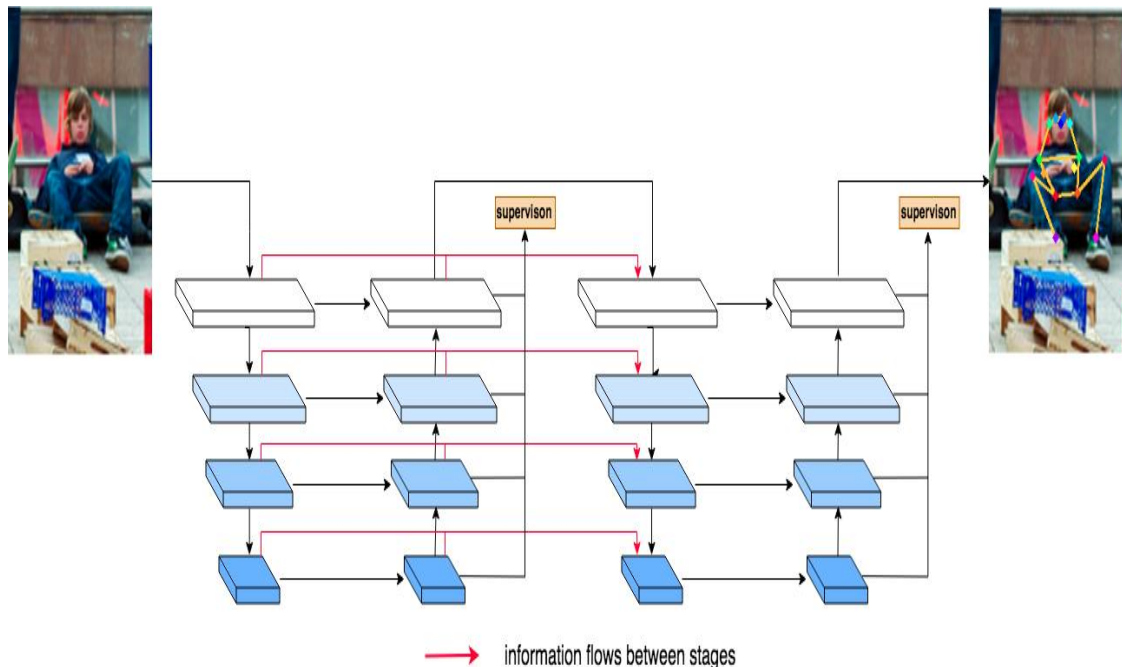
- Ablation experiments



| | | |
|--------------------------|------|---------|
| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |
| 2res50+up-skip | 73.4 | 256x192 |

Experiments

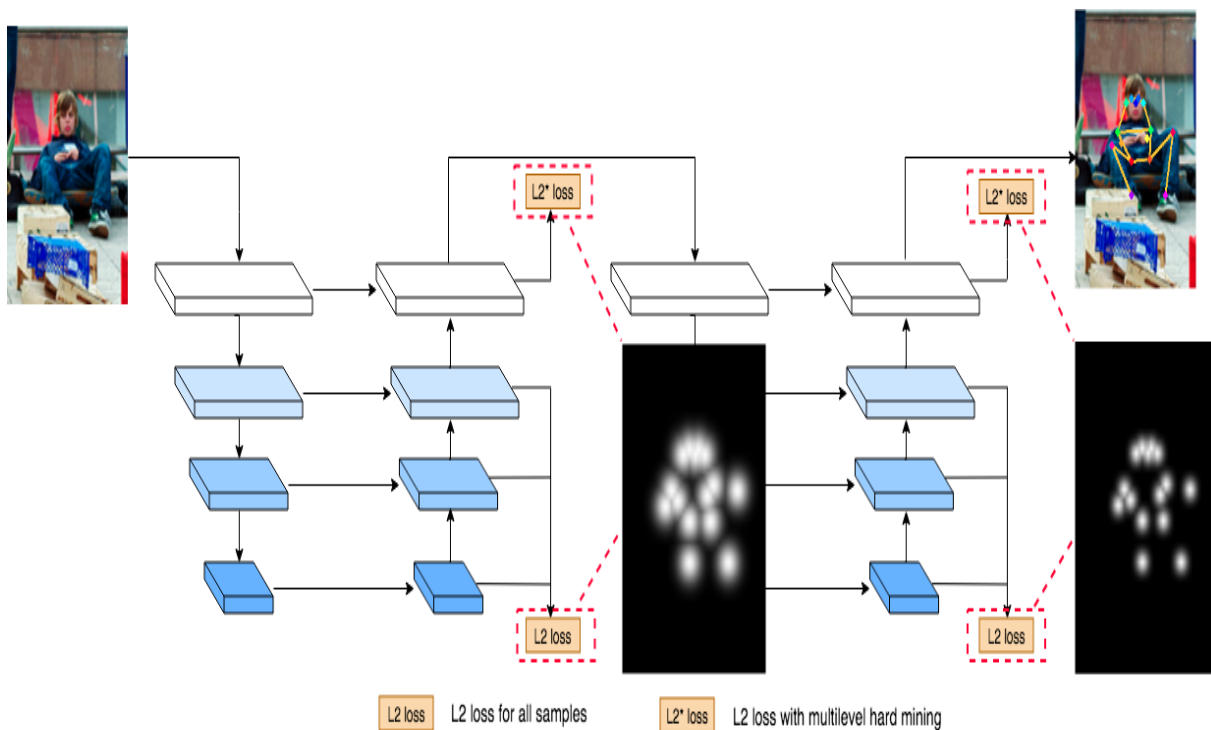
- Ablation experiments



| | | |
|---------------------------------|-------------|----------------|
| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |
| 2res50+up-skip | 73.4 | 256x192 |
| 2res50+up-skip+down-skip | 74.8 | 256x192 |

Experiments

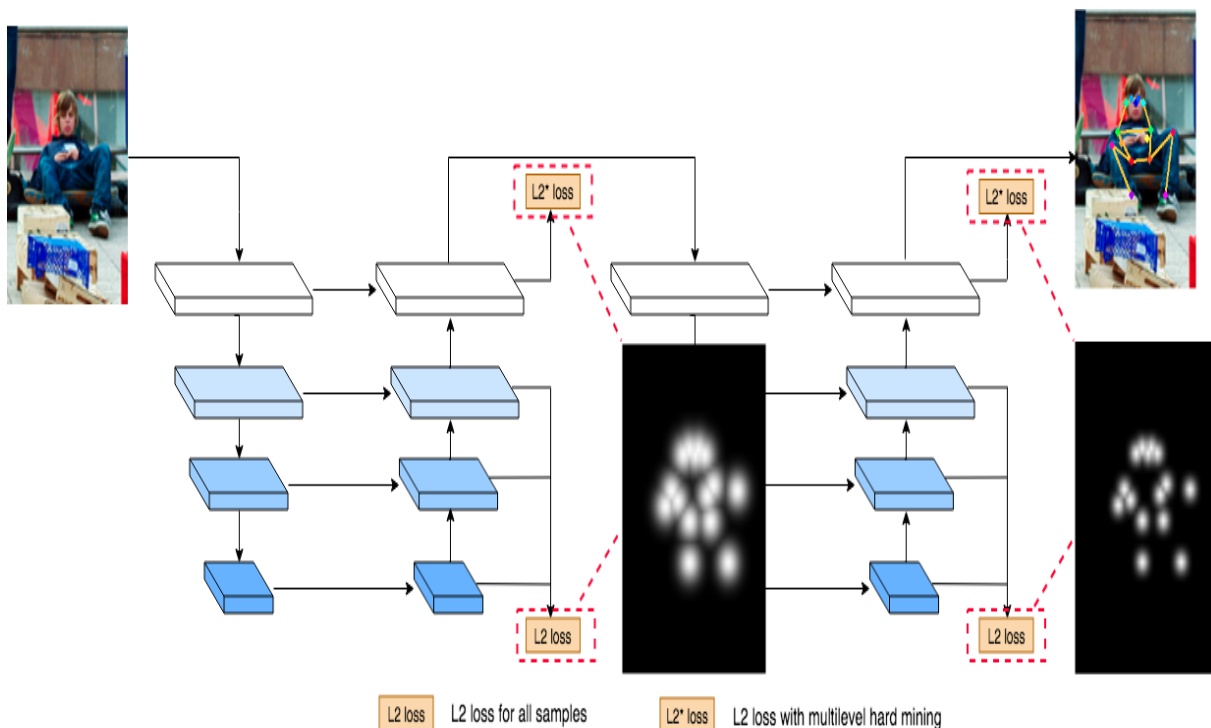
- Ablation experiments



| | | |
|--|-------------|----------------|
| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |
| 2res50+up-skip | 73.4 | 256x192 |
| 2res50+up-skip+down-skip | 74.8 | 256x192 |
| 2res50+skip+coarse to fine loss | 75.0 | 256x192 |

Experiments

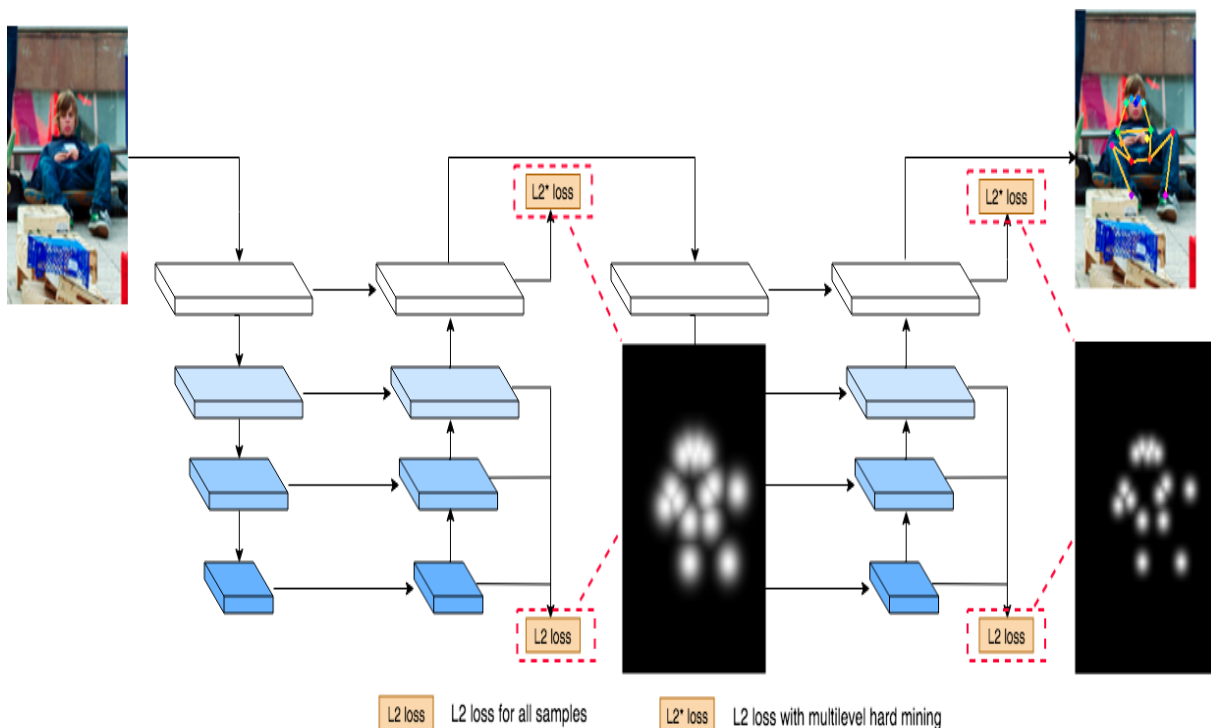
- Ablation experiments



| | | |
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| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |
| 2res50+up-skip | 73.4 | 256x192 |
| 2res50+up-skip+down-skip | 74.8 | 256x192 |
| 2res50+skip+coarse to fine loss | 75.0 | 256x192 |
| 2res50+skip+coarse to fine loss | 75.8 | 384x288 |

Experiments

- Ablation experiments

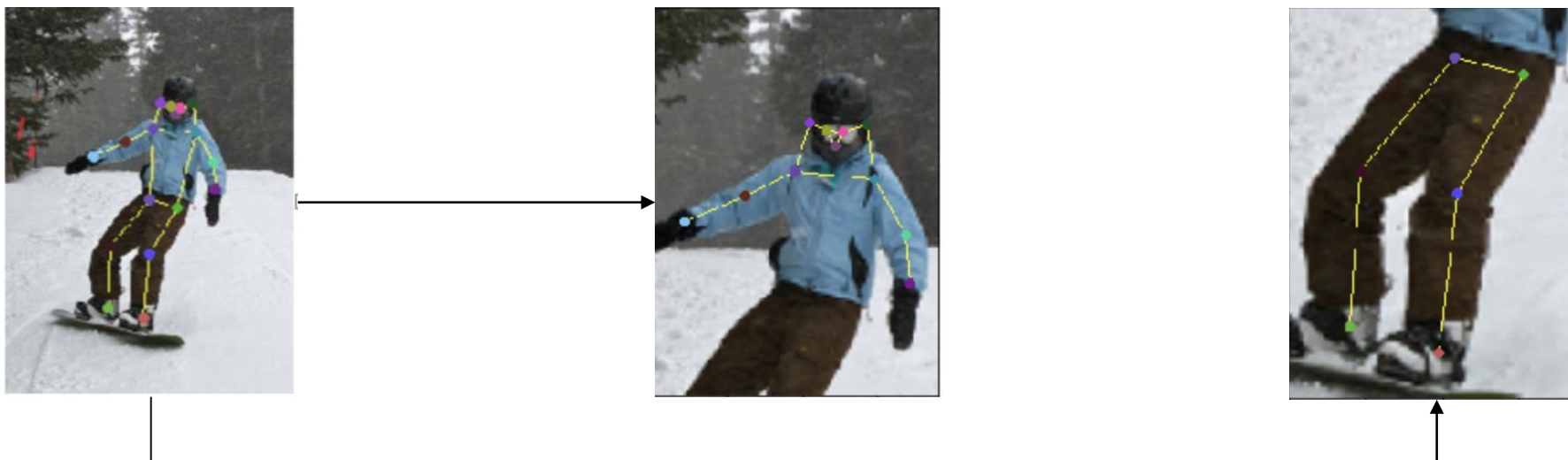


| | | |
|---------------------------------|------|---------|
| Baseline(backbone res50) | 72.3 | 256x192 |
| 2res50 | 72.8 | 256x192 |
| 2res50+up-skip | 73.4 | 256x192 |
| 2res50+up-skip+down-skip | 74.8 | 256x192 |
| 2res50+skip+coarse to fine loss | 75.0 | 256x192 |
| 2res50+skip+coarse to fine loss | 75.8 | 384x288 |
| 3res50+skip+coarse to fine loss | 77.5 | 384x288 |
| 4res50+skip+coarse to fine loss | 79.0 | 384x288 |
| Ensemble | 80.0 | - |

Experiments

- Data augmentation
 - Half body augmentation(+0.4 AP)

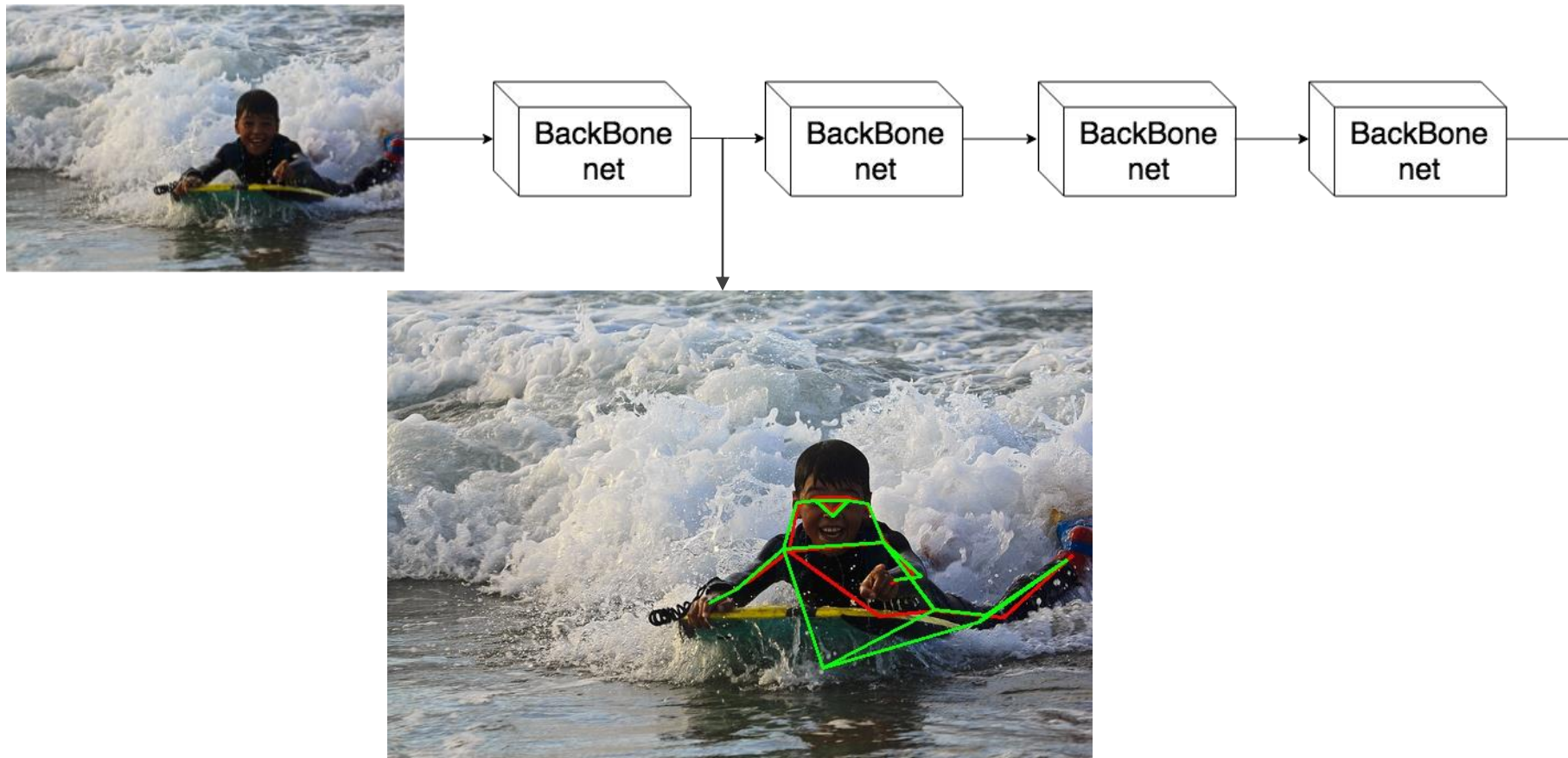
30% probability if more than 8 labeled keypoints



Experiments

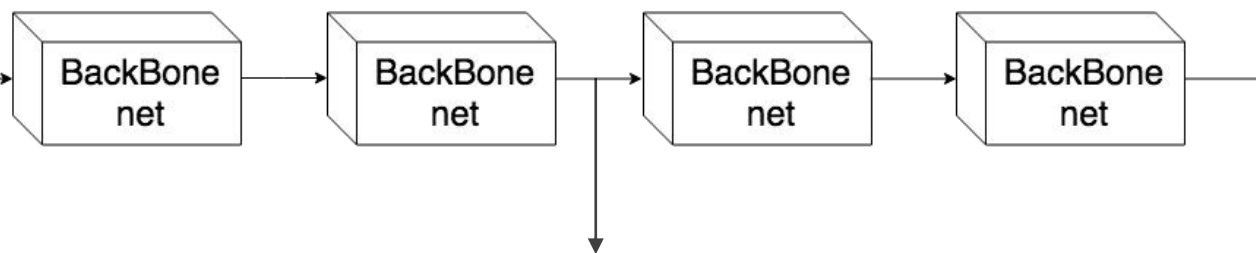
- Data augmentation
 - Half body augmentation(+0.4 AP)
 - Others(+0.4 AP)
 - Random scales(0.7 ~ 1.35)
 - Rotation (-45° ~ 45°)
 - Random flip
- Ensemble(+1.0 AP)
- External data(+0.7 AP)
 - Private data with 10W boxes

Results



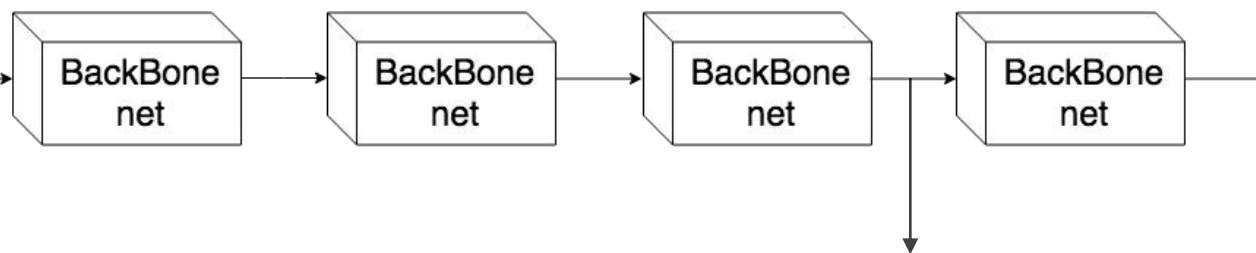
— Prediction
— Ground truth

Results



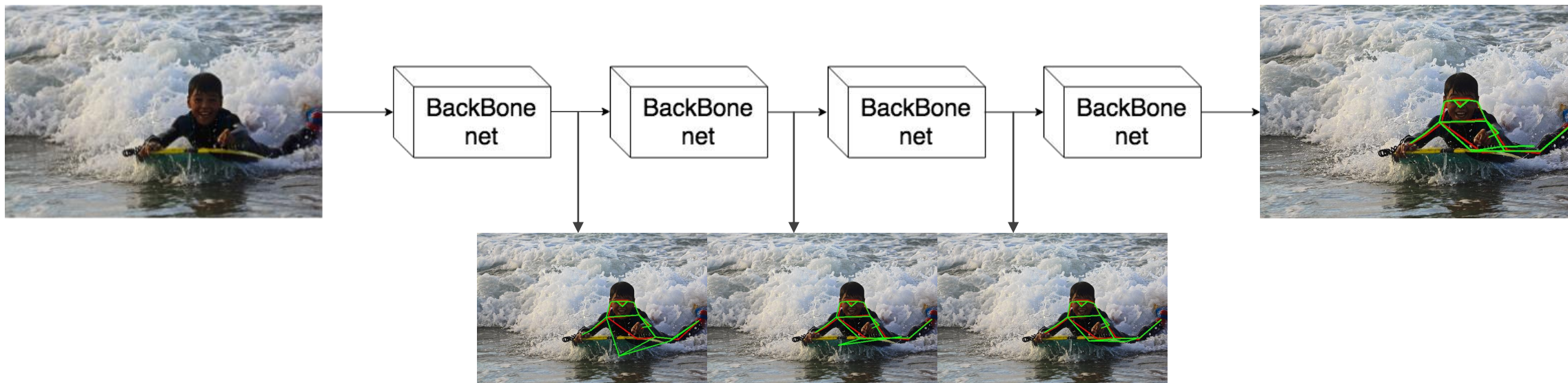
— Prediction
— Ground truth

Results



— Prediction
— Ground truth

Results



— Prediction
— Ground truth

Overview

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Summary

- Cascade backbone
- OHKM and coarse to fine supervision
- Skip connections cross stages.



Looking for Intern, Researcher, Research Engineer

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