

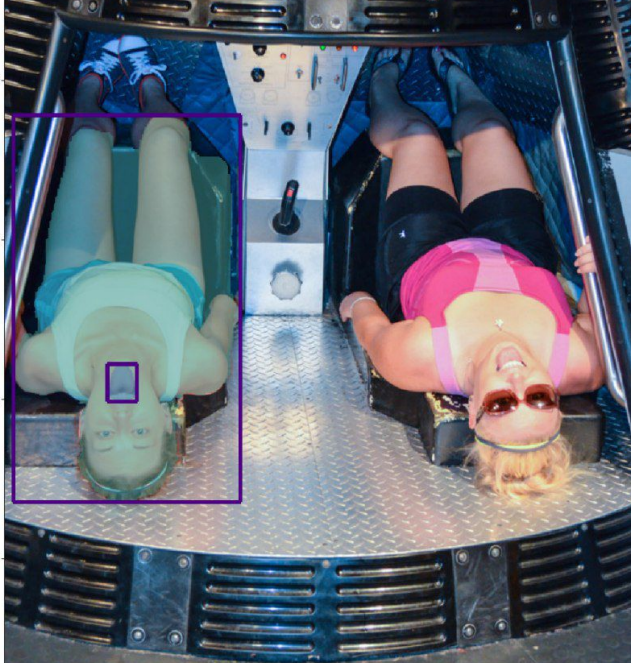
Cook warm, then make it cool
2nd Place Solution to
Instance Segmentation track

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Kaggle Competition Grandmaster, Rank 6

Data filtering



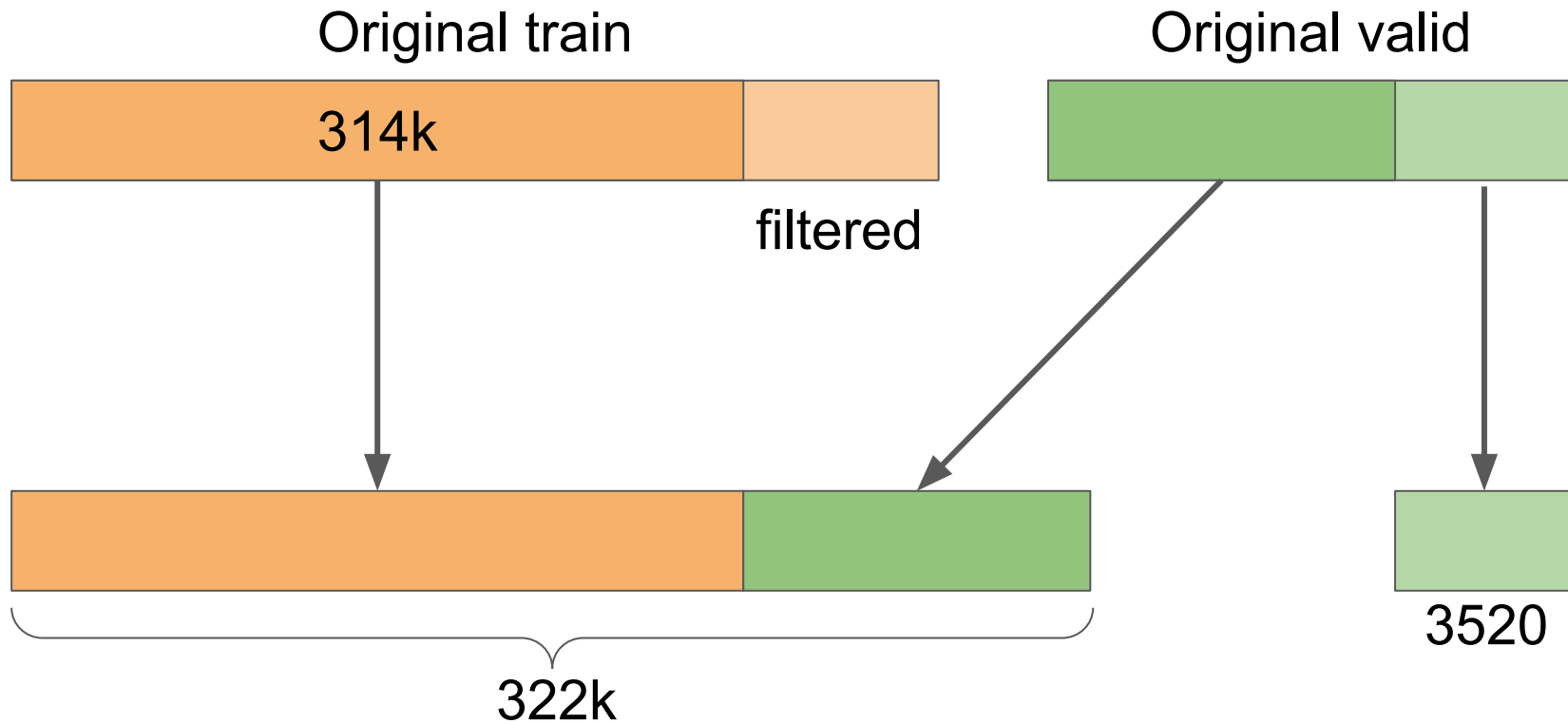
Data filtering

```
if annotated_objects > count_thresh or class in rare_class:  
    take_sample()
```

```
init: count_thresh = 8, appearance-threshold > 500
```

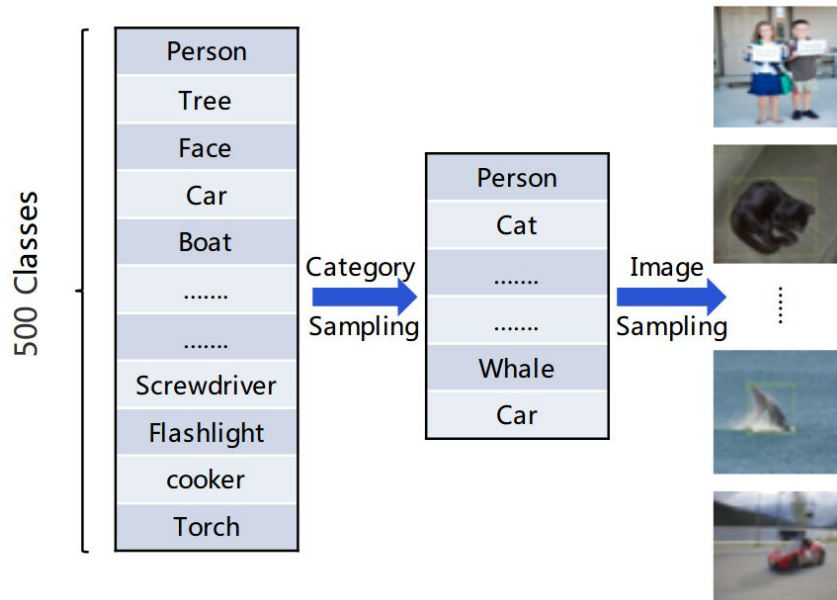
```
final: count_thresh = 2, appearance-threshold > 1000
```

Data split



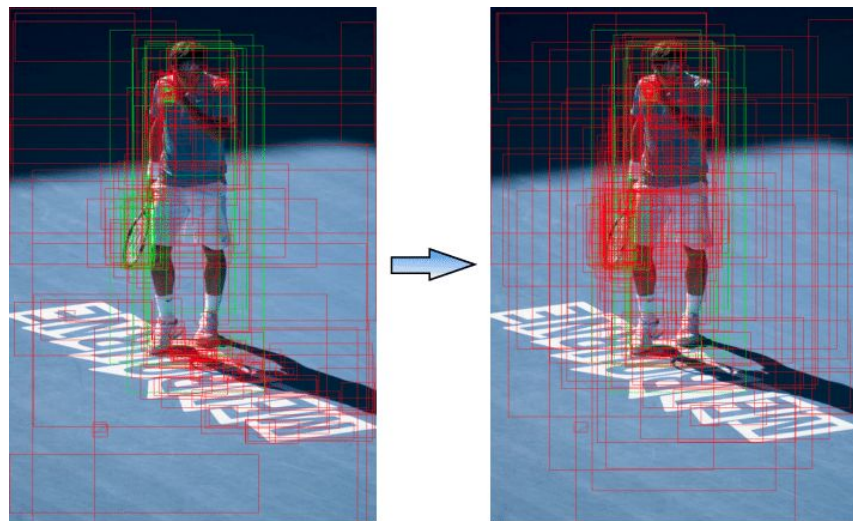
Sampling

Class Aware Sampling



<https://arxiv.org/pdf/1810.06208.pdf>

IoU-Balanced Sampling



Random Sampling

IoU-Balanced Sampling

<https://arxiv.org/pdf/1904.02701.pdf>

Augmentations with **A**lbum augmentations

- RandomBrightnessContrast, $p = 0.5$
- CLAHE, $p = 0.5$
- ToGray, $p = 0.2$
- Cutout, $p = 0.9$
- JpegCompression, $p = 0.4$, quality-lower = 70, quality-upper = 99
- RandomRotate90, $p = 0.1$
- RandomFlip, $p = 0.5$



Model selection from mmdetection

Basic architecture: Hybrid Task Cascade Mask R-CNN

Final ensemble:

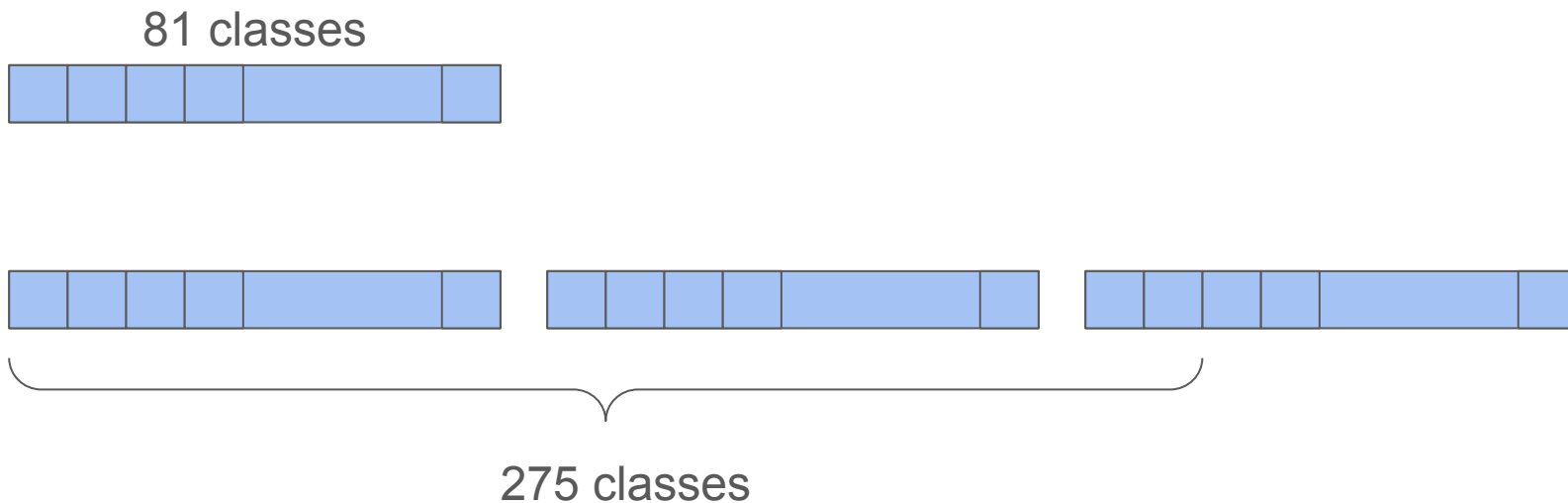
- X-101-64x4d-FPN DCN(c3-c5)
- X-101-32x4d-FPN, with adding DCN during train

Best single model:

- WSL resnext101 + neck-head from X-101-64x4d-FPN DCN(c3-c5)

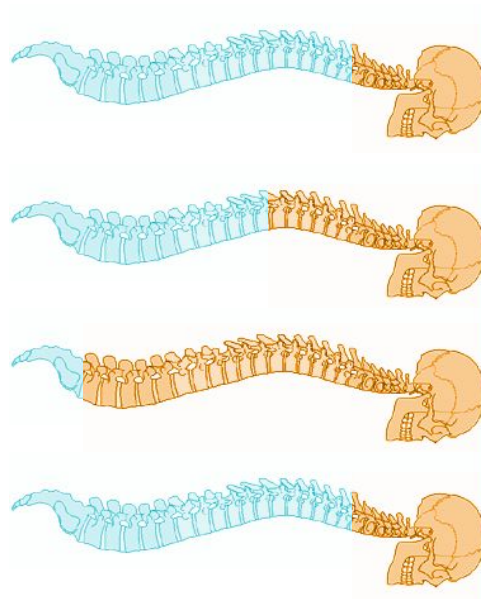
Weights rebuild

Head from COCO: `new_weights = np.vstack([old_weights] * 9000) [:new_amount]`

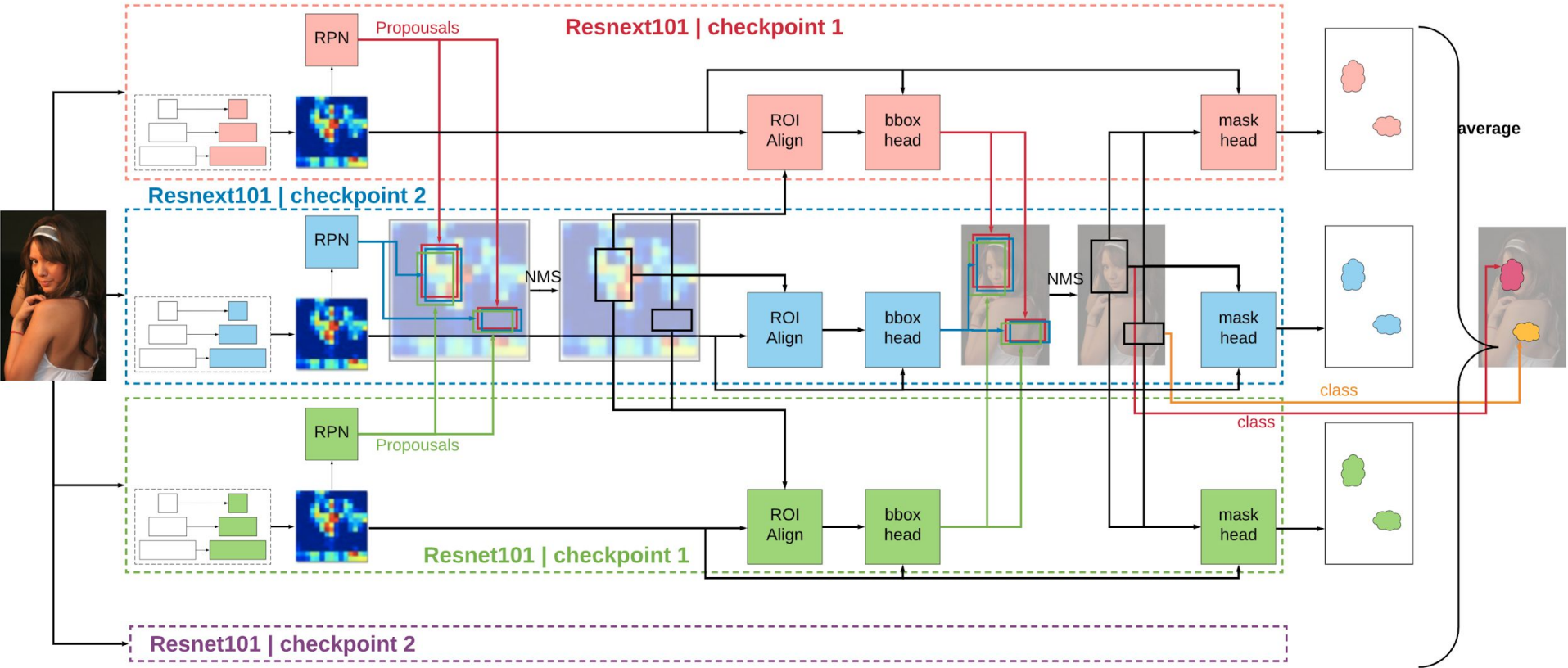


Train procedure

1. Rebuild weights from COCO
2. Freeze backbone, train neck and heads
3. Unfreeze 4th conv group
4. Unfreeze 3rd conv group
5. Full train except stem
6. Freeze backbone, train neck and heads on large batch (on V100 32Gb)



Ensembling



Post processing

```
test_cfg = (  
    rpn=dict(nms_across_levels=False, nms_pre=12000,  
nms_post=2000, max_num=2000, nms_thr=0.75, min_bbox_size=0),  
    rcnn=dict(score_thr=0.0001, nms=dict(type="soft_nms", iou_thr=0.5,  
min_score=0.0001), max_per_img=400, mask_thr_binary=0.5),  
    keep_all_stages=False  
)
```

Grape that didn't work

