# Aero2Astro Panneerselvam N (21/09/2021)

### **Model Summary:**

```
Model - 1: PP-Yolo v1
```

ins = 1000bs = 8lr = 0.0002

epochs = 1983

model: ppyolo\_r50vd\_dcn\_1x\_coco

### **Training Data:**

```
Accumulating evaluation results...
DONE (t=0.85s).
 Average Precision
                          (AP)
                                    IoU=0.50:0.95
                                                                    all
                                                                            maxDets=100 ] = 0.454
                                                          area=
 Average Precision
                          (AP) @[
(AP) @[
                                    IoU=0.50
                                                          area=
                                                                            maxDets=100
 Average Precision
                                    IoU=0.75
                                                                            maxDets=100
                                                                                              = 0.499
                                                                    all
                                                          area=
                          (AP) @[
(AP) @[
 Average Precision
                                    IoU=0.50:0.95
IoU=0.50:0.95
                                                                                            ] = 0.359
] = 0.588
] = 0.579
                                                          area= small
                                                                            maxDets=100
 Average Precision
                                                          area=medium
                                                                            maxDets=100
                                    IoU=0.50:0.95
IoU=0.50:0.95
 Average Precision
                          (AP) @[
                                                          area= large
                                                                            maxDets=100
 Average Recall
                                                                            maxDets= 1
maxDets= 10
                          (AR) @[
                                                          area=
                                                                    all
                                                                                              = 0.173
                                                                                            ] = 0.479
] = 0.580
 Average Recall
                          (AR) @[
                                    IoU=0.50:0.95
                                                          area=
                                                                    all
                                     IoU=0.50:0.95
 Average Recall
                          (AR)
                                                          area=
                                                                            maxDets=100
                                                                                            ] = 0.498
] = 0.699
                          (AR) @[ IoU=0.50:0.95
(AR) @[ IoU=0.50:0.95
(AR) @[ IoU=0.50:0.95
 Average Recall
                                                          area= small
                                                                            maxDets=100
                                                         area= small |
area=medium |
area= large |
 Average Recall
                                                                            maxDets=100
 Average Recall
                                                                           maxDets=100
[08/15 07:11:53] ppdet.metrics.coco_utils INFO: Per-category of bbox AP:
  category | AP
                         | category | AP
                                                  | category | AP
  bird
                 0.451
                           book
                                          0.315
                                                    bottle
                                                                   0.601
                0.173
                                        0.616
                                                                 0.567
  car
                           chair
                                                    person
[08/15 07:11:53] ppdet.metrics.coco_utils INFO: per-category PR curve has output to bbox
[08/15 07:11:53] ppdet.engine INFO: Total sample number: 1093, averge FPS: 18.4354342262
```

#### **Test Data:**

```
ccumulating evaluation results...
DONE (t=0.15s).
Average Precision
                    (AP) @[ IoU=0.50:0.95 | area=
                                                       all | maxDets=100 ] = 0.056
Average Precision
                    (AP) @[ IoU=0.50
                                               area=
                                                       all
                                                              maxDets=100
                                                                           ] = 0.113
                                                                           ] = 0.049
 Average Precision
                     (AP) @[
                             IoU=0.75
                                               area=
                                                              maxDets=100
 Average Precision
                     (AP) @[ IoU=0.50:0.95
                                             | area= small
                                                              maxDets=100
                                                                           ] = 0.044
Average Precision
                     (AP) @[ IoU=0.50:0.95
                                              area=medium
                                                                           1 = 0.066
                                                              maxDets=100
Average Precision
                                              area= large
                     (AP) @[ IoU=0.50:0.95
                                                                           1 = 0.130
                                                              maxDets=100
                                                                           ] = 0.051
 Average Recall
                     (AR) @[ IoU=0.50:0.95
                                               area=
                                                              maxDets= 1
                     (AR) @[ IoU=0.50:0.95
(AR) @[ IoU=0.50:0.95
                                                            maxDets= 10
 Average Recall
                                              area=
                                                                               0.134
Average Recall
                                                                           ] = 0.179
                                                            maxDets=100
                                              area=
                                                       all
                     (AR) @[ IoU=0.50:0.95
(AR) @[ IoU=0.50:0.95
                                                                           ] = 0.144
] = 0.231
 Average Recall
                                              area= small
                                                              maxDets=100
                                             | area=medium | maxDets=100
| area= large | maxDets=100
 Average Recall
                     (AR) @[ IoU=0.50:0.95
 Average Recall
[08/13 14:25:45] ppdet.metrics.coco utils INFO: Per-category of bbox AP:
 category | AP
                    | category | AP
                                         | category | AP
                                  0.007 |
 bird
             0.146 | book
                                          bottle
                                                     0.175
             0.007
                      person
                                  0.000
                                           chair
                                                      0.000
[08/13 14:25:45] ppdet.metrics.coco_utils INFO: per-category PR curve has output to bbox_pr_curve folder.
[08/13 14:25:45] ppdet.engine INFO: Total sample number: 177, averge FPS: 18.61171957113853
```

### Model - 2 : (PP-Yolo v2)

ins = 500 bs = 8 lr = 0.0002 e[ochs = 1711

model: ppyolov2\_r101vd\_dcn\_365e\_coco

**Training Data:** 

#### Test data:

### Model - 3:(Faster Rcnn)

```
Backbone = Faster_rcnn_X_101_32x8d_FPN_3x
```

bs = 4lr = 0.001

ins = 500

itrations: 83500

#### Test:

```
Average Precision
                          (AP) @[ IoU=0.50:0.95
                                                                       alī
                                                                               maxDets=100
                                                                                                  = 0.388
                                                           area=
Average Precision
                          (AP) @[
                                     IoU=0.50
                                                           area=
                                                                       all
                                                                               maxDets=100
                                                                                                1 = 0.563
Average Precision
                         (AP) @[ IoU=0.75
                                                                                                ] = 0.416
                                                           area=
                                                                       all
                                                                               maxDets=100
                         (AP) @[
(AP) @[
Average Precision
                                                           area= small
                                     IoU=0.50:0.95
                                                                              maxDets=100
                                                                                                  = 0.234
Average Precision
                                     IoU=0.50:0.95
                                                           area=medium |
                                                                              maxDets=100
                                                                                               ] = 0.506
                         (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.506 (AP) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.555 (AR) @[ IoU=0.50:0.95 | area= all | maxDets= 1 ] = 0.222 (AR) @[ IoU=0.50:0.95 | area= all | maxDets=10 ] = 0.547 (AR) @[ IoU=0.50:0.95 | area= all | maxDets=100 ] = 0.590 (AR) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.417 (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.698 (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.834
Average Precision (AP) @[ IoU=0.50:0.95
Average Recall
Average Recall
Average Recall
category
                                               | AP
                                                           category
 category
                | 66.686 | car
| 57.283 | person
 aeroplane
                                                 25.895
                                                              chair
                                                                                    31.846
                                               | 20.700 | traffic light
                                                                                    30.234
```

Total inference time: 0:02:15.337548 (0.731554 s / iter per device, on 1 devices) Total inference pure compute time: 0:02:14 (0.728070 s / iter per device, on 1 devices)

```
09/01 11:13:20 d2.evaluation.fast_eval_api]: COCOeval opt.accumulate() finished in 0.05 second

      .evaluation.fast_eval_api]:
      COCOeval_op

      (AP) @[ IoU=0.50:0.95 | area= all

      (AP) @[ IoU=0.50 | area= all

      (AP) @[ IoU=0.75 | area= small

      (AP) @[ IoU=0.50:0.95 | area=medium

      (AP) @[ IoU=0.50:0.95 | area= large

      (AR) @[ IoU=0.50:0.95 | area= all

      (AR) @[ IoU=0.50:0.95 | area= all

      (AR) @[ IoU=0.50:0.95 | area= all

      (AR) @[ IoU=0.50:0.95 | area= small

      (AR) @[ IoU=0.50:0.95 | area=medium

      (AR) @[ IoU=0.50:0.95 | area= large

      .evaluation.coco evaluation]:
      Evaluation

                                                                                                           | maxDets=100 ] = 0.641
Average Precision
Average Precision
                                                                                                                                       ] = 0.845
                                                                                                               maxDets=100
                                                                                                                                      ] = 0.709
Average Precision
                                                                                                              maxDets=100
                                                                                                                                      ] = 0.548
Average Precision
                                                                                                              maxDets=100
Average Precision
                                                                                                              maxDets=100
Average Precision
                                                                                                                                      ] = 0.822
                                                                                                              maxDets=100
                                                                                                             maxDets=10 ] = 0.309
maxDets=10 ] = 0.714
maxDets=100 ] = 0.755
maxDets=100 ] = 0.665
Average Recall
Average Recall
Average Recall
Average Recall
                                                                                                           | maxDets=100 ] = 0.827
| maxDets=100 ] = 0.915
Average Recall
[09/01 11:13:20 d2.evaluation.coco_evaluation]: Evaluation results for bbox:
Average Recall
                    AP50 |
                                     AP75 | APs
 64.101 | 84.488 | 70.862 | 54.822 | 73.704 | 82.153
                                   evaluation.coco_evaluation]: Per-category bbox AP:
                                                                   I AP
  category
                                            category
                                                                                        category
                                                                     55.989 | chair
51.198 | traffic_light
  aeroplane
                           88.188
                                         | car |
| person |
                                                                                                                      67.044
                           73.846
                                                                                                                    | 48.340
```

```
Total inference time: 0:08:20.223715 (0.731321 s / iter per device, on 1 devices)

Total inference pure compute time: 0:08:18 (0.728191 s / iter per device, on 1 devices)

tions: Preparing results for COCO format
```

### Model – 4 (Faster Rcnn – with augmentation)

Augmentation: Resize (1024), Horizontal Flip

iterations - 149500

Test:

Total inference time: 0:02:17.554629 (0.743539 s / iter per device, on 1 devices)
Total inference pure compute time: 0:02:16 (0.740199 s / iter per device, on 1 devices)

```
Total inference time: 0:08:27.085180 (0.741353 s / iter per device, on 1 devices)
Total inference pure compute time: 0:08:24 (0.738200 s / iter per device, on 1 devices)
```

### Model – 5:(Faster Rcnn with Augmentation)

Augmetation: Resize(1024), Hflip, Random brightness, Random Rotation,

Random crop

Iterations: 159500

Test:

```
09/12 02:03:09 d2.evaluation.fast_eval_api]: COCOeval opt.accumulate()
                                                                                                              finished in 0.02 seconds.
 Average Precision (AP) @[ IoU=0.50:0.95 | area=
                                                                               all = 0.180
                                                                                                            ] = 0.509
 Average Precision (AP) @[ IoU=0.50
                                                                                        maxDets=100
                                                                 | area=
 Average Precision (AP) @[ IoU=0.75
Average Precision (AP) @[ IoU=0.50:0.95
                                                                   area=
                                                                                      | maxDets=100
                                                                                                              = 0.062
                                                                 | area= small | maxDets=100
                                                                                                            1 = 0.143
                                                                | area=medium | maxDets=100
| area= large | maxDets=100
| area= all | maxDets= 1
| area= all | maxDets= 10
 Average Precision (AP) @[ IoU=0.50:0.95
                                                                                                            ] = 0.258
 Average Precision (AP) @[ IoU=0.50:0.95
                                                                                                            1 = 0.255
Average Precision (AP) @[ 100=0.50:0.95 | area= targe | maxDets=100 ] = 0.255

Average Recall (AR) @[ 10U=0.50:0.95 | area= all | maxDets= 1 ] = 0.115

Average Recall (AR) @[ 10U=0.50:0.95 | area= all | maxDets=100 ] = 0.312

Average Recall (AR) @[ 10U=0.50:0.95 | area= all | maxDets=100 ] = 0.348

Average Recall (AR) @[ 10U=0.50:0.95 | area= small | maxDets=100 ] = 0.271

Average Recall (AR) @[ 10U=0.50:0.95 | area=medium | maxDets=100 ] = 0.397

Average Recall (AR) @[ 10U=0.50:0.95 | area= large | maxDets=100 ] = 0.475
[09/12 02:03:09 d2.evaluation.coco_evaluation]: Evaluation results for bbox:
 17.967 | 50.904 | 6.185 | 14.321 | 25.769 | 25.460
 09/12 02:03:09 d2.evaluation.coco evaluation]: Per-category bbox AP:
                                                                   l category
                      22.703 | car
21.525 | person
                                                       16.018 | chair
  aeroplane
                                                                                               14.871
                                                      11.191
                                                                     traffic light | 21.497
  COW
OrderedDict([('bbox',
```

```
Total inference time: 0:02:22.004286 (0.767591 s / iter per device, on 1 devices)
Total inference pure compute time: 0:02:21 (0.764274 s / iter per device, on 1 devices)
```

```
eval api]: COCOeval opt.accumulate() finished in 0.07 seconds.
Average Precision (AP) @[ IoU=0.50:0.95
                                                            all | maxDets=100
                                                                                    = 0.282
                     (AP) @[ IoU=0.50
(AP) @[ IoU=0.75
Average Precision
                                                                   maxDets=100
                                                                                    = 0.785
Average Precision
                                                                   maxDets=100
                                                                                  ] = 0.064
                                                 area=
Average Precision (AP) @[ IoU=0.50:0.95
                                                | area= small
                                                                   maxDets=100
                                                                                  ] = 0.278
                                                area=matt | maxDets=100
| area=medium | maxDets=100
| area= large | maxDets=100
| area= all | maxDets= 10
| area= all | maxDets=100
Average Precision (AP) @[ IoU=0.50:0.95
Average Precision (AP) @[ IoU=0.50:0.95
                                                                                    = 0.332
                                                                                    = 0.347
Average Recall
                      (AR) @[ IoU=0.50:0.95
Average Recall
                      (AR) @[ IoU=0.50:0.95
                                                                                  ] = 0.372
Average Recall
                      (AR) @[
                                IoU=0.50:0.95
                                                                                    = 0.408
                                                | area= small
Average Recall
                      (AR) @[ IoU=0.50:0.95
                                                                   maxDets=100
                      (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100
Average Recall
                                                                                    = 0.438
Average Recall
                                                                                    = 0.470
09/12 02:11:59 d2.evaluation.coco evaluation]: Evaluation results for bbox:
   AP
        | AP50 | AP75 | APs
                                         | APm
                                                      APl
28.240 | 78.504 | 6.387 | 27.821 | 33.190 | 34.669
09/12 02:11:59 d2.evaluation.coco_evaluation]: Per-category bbox AP:
              | AP
 category
                                                     category
 aeroplane
                24.856
                                          28.422
                                                     chair
                                                                        32.137
                32.960
                                           20.032
                                                     traffic light
```

```
Total inference time: 0:08:42.158078 (0.763389 s / iter per device, on 1 devices)

Total inference pure compute time: 0:08:39 (0.760207 s / iter per device, on 1 devices)
```

## Model – 6 (Faster Rcnn with augmentation )

Augmentation: Resize(1024), Random brightness, Random Rotation,

Random crop

Iterations: 201499

#### Test:

### **Best model:**

**PP – Yolo v2:** ppyolov2\_r101vd\_dcn\_365e\_coco

Average Precision: 0.307 Average Recall: 0.643

FPS: 11.88

**Faster RcNN**: (Backbone = Faster\_rcnn\_X\_101\_32x8d\_FPN\_3x without any

augmentation)

Average Precision: 0.555 Average Recall: 0.834

Inference Time: 0.731 s / per image

Faster Rcnn gives good accuracy with compared to other models but one disadvantage is , it gives less FPS.

PP-Yolo v2 gives Moderate accuracy and FPS . So, PP-Yolo v2 is the winner of above models.