### **Neural networks:**

The used DCN (Detection Classification Networks) models must not be real-time capable. The emphasis here is on the detection and classification performance of the models of the ground objects in the list of 18 classes

# 1. <u>Deformable DETR: Deformable Transformers for end-to-end Object Detection</u>

- **Papers** with code: <a href="https://paperswithcode.com/paper/deformable-detr-deformable-transformers-for-1">https://paperswithcode.com/paper/deformable-detr-deformable-transformers-for-1</a>
- **Deformable DETR Github:** <a href="https://github.com/fundamentalvision/Deformable-DETR">https://github.com/fundamentalvision/Deformable-DETR</a>
- **Paper:** <a href="https://arxiv.org/pdf/2010.04159.pdf">https://arxiv.org/pdf/2010.04159.pdf</a>
- Results (COCO validation set, 2017):

#### Deformable DETR (single scale):

```
Test: Total time: 0:06:05 (0.1464 s / it)
Averaged stats: class_error: 0.00 loss: 6.2165 (6.9726) loss_ce: 0.3699 (0.4111) loss_bbox:
0.2184 (0.2248) loss giou: 0.4874 (0.4804) loss ce 0: 0.4391 (0.4977) loss bbox 0: 0.2403
(0.2575) loss_giou_0: 0.4890 (0.5311) loss_ce_1: 0.3887 (0.4480) loss_bbox_1: 0.2509 (0.2359)
loss giou 1: 0.4687 (0.4983)
                                loss_ce_2: 0.3979 (0.4262)
                                                               loss bbox 2: 0.2277 (0.2296)
loss_giou_2: 0.4776 (0.4883)
                                loss_ce_3: 0.3749 (0.4165)
                                                               loss_bbox_3: 0.2427 (0.2263)
loss_giou_3: 0.4879 (0.4835)
                                loss_ce_4: 0.3774 (0.4103)
                                                               loss_bbox_4: 0.2177 (0.2259)
loss_giou_4: 0.4834 (0.4813) loss_ce_unscaled: 0.1850 (0.2055)
                                                                 class error unscaled: 4.0000
            loss_bbox_unscaled: 0.0437 (0.0450)
                                                       loss_giou_unscaled:
(9.4654)
                                                                            0.2437
                                                                                     (0.2402)
cardinality error unscaled:
                            293.5000
                                       (291.9334)
                                                       loss ce 0 unscaled:
                                                                            0.2195
                                                                                     (0.2488)
loss bbox 0 unscaled:
                                                  loss giou 0 unscaled:
                         0.0481
                                   (0.0515)
                                                                           0.2445
                                                                                     (0.2656)
cardinality_error_0_unscaled:
                             292.5000 (292.3278)
                                                       loss_ce_1_unscaled:
                                                                            0.1944
                                                                                     (0.2240)
loss_bbox_1_unscaled:
                         0.0502
                                   (0.0472)
                                                  loss_giou_1_unscaled:
                                                                           0.2343
                                                                                     (0.2492)
cardinality_error_1_unscaled:
                             293.5000 (292.1338)
                                                       loss_ce_2_unscaled: 0.1990
                                                                                     (0.2131)
loss bbox 2 unscaled:
                         0.0455
                                   (0.0459)
                                                  loss_giou_2_unscaled:
                                                                           0.2388
                                                                                     (0.2442)
                             293.5000 (292.2482)
                                                       loss_ce_3_unscaled:
cardinality_error_2_unscaled:
                                                                            0.1875
                                                                                     (0.2082)
loss_bbox_3_unscaled:
                         0.0485
                                   (0.0453)
                                                  loss_giou_3_unscaled:
                                                                           0.2440
                                                                                     (0.2417)
                              293.5000 (292.2414)
cardinality error 3 unscaled:
                                                       loss ce 4 unscaled:
                                                                             0.1887
                                                                                     (0.2052)
loss_bbox_4_unscaled:
                         0.0435
                                   (0.0452)
                                                  loss_giou_4_unscaled:
                                                                           0.2417
                                                                                     (0.2406)
cardinality_error_4_unscaled: 293.5000 (292.0508)
Accumulating evaluation results...
DONE (t=9.70s).
IoU metric: bbox
Average Precision (AP) @[ IoU=0.50:0.95 \mid area= all \mid maxDets=100 ] = 0.394
Average Precision (AP) @[ IoU=0.50
                                       | area= all | maxDets=100 ] = 0.597
Average Precision (AP) @[ IoU=0.75
                                       | area= all | maxDets=100 ] = 0.422
Average Precision (AP) @[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.207
Average Precision (AP) @[IoU=0.50:0.95 | area=medium | maxDets=100] = 0.430
Average Precision (AP) @[ IoU=0.50:0.95 | area= large \mid maxDets=100 ] = 0.559
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets= 1] = 0.326
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets= 10] = 0.534
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.571
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.328
Average Recall
```

```
Average Recall (AR) @[ IoU=0.50:0.95 \mid area=medium \mid maxDets=100 ] = 0.624
Average Recall (AR) @[ IoU=0.50:0.95 \mid area=large \mid maxDets=100 ] = 0.800
```

# Deformable DETR (single scale, DC5):

```
Test: Total time: 0:07:14 (0.1738 s / it)
Averaged stats: class_error: 0.00 loss: 6.2433 (6.6677) loss_ce: 0.3569 (0.4032) loss_bbox:
0.2149 (0.2195) loss_giou: 0.4354 (0.4505) loss_ce_0: 0.4772 (0.4924) loss_bbox_0: 0.2385
(0.2409) loss_giou_0: 0.4216 (0.4931) loss_ce_1: 0.4343 (0.4318) loss_bbox_1: 0.2544 (0.2253)
loss_giou_1: 0.4325 (0.4620)
                                loss_ce_2: 0.3789 (0.4119)
                                                               loss_bbox_2: 0.2256 (0.2235)
loss giou 2: 0.4132 (0.4571)
                                loss ce 3: 0.3626 (0.4072)
                                                               loss bbox 3: 0.2110 (0.2206)
loss_giou_3: 0.4484 (0.4533)
                                loss_ce_4: 0.3565 (0.4049)
                                                               loss_bbox_4: 0.2194 (0.2199)
loss giou 4: 0.4374 (0.4508) loss ce unscaled: 0.1785 (0.2016) class error unscaled: 4.0000
            loss_bbox_unscaled: 0.0430 (0.0439)
                                                       loss_giou_unscaled: 0.2177
(9.0135)
                                                                                     (0.2252)
cardinality_error_unscaled:
                            293.5000
                                       (292.0380)
                                                       loss_ce_0_unscaled:
                                                                            0.2386
                                                                                     (0.2462)
loss_bbox_0_unscaled:
                         0.0477
                                   (0.0482)
                                                   loss_giou_0_unscaled:
                                                                           0.2108
                                                                                     (0.2465)
cardinality_error_0_unscaled: 293.5000 (292.2852)
                                                        loss_ce_1_unscaled:
                                                                             0.2171
                                                                                     (0.2159)
                         0.0509
loss bbox 1 unscaled:
                                   (0.0451)
                                                   loss giou 1 unscaled:
                                                                           0.2162
                                                                                     (0.2310)
cardinality_error_1_unscaled:
                              293.5000 (292.0064)
                                                        loss_ce_2_unscaled:
                                                                             0.1894
                                                                                     (0.2059)
loss_bbox_2_unscaled:
                         0.0451
                                   (0.0447)
                                                   loss_giou_2_unscaled:
                                                                           0.2066
                                                                                     (0.2285)
                             293.5000 (291.9220)
cardinality_error_2_unscaled:
                                                        loss_ce_3_unscaled:
                                                                             0.1813
                                                                                     (0.2036)
loss bbox 3 unscaled:
                         0.0422
                                   (0.0441)
                                                   loss_giou_3_unscaled:
                                                                           0.2242
                                                                                     (0.2266)
cardinality error 3 unscaled:
                              293.5000 (291.9970)
                                                        loss ce 4 unscaled:
                                                                                     (0.2024)
                                                                             0.1782
loss_bbox_4_unscaled:
                         0.0439
                                   (0.0440)
                                                   loss_giou_4_unscaled:
                                                                                     (0.2254)
                                                                            0.2187
cardinality error 4_unscaled: 293.5000 (291.9752)
Accumulating evaluation results...
DONE (t=9.27s).
IoU metric: bbox
Average Precision (AP) @[IoU=0.50:0.95| area= all | maxDets=100] = 0.414
                                       | area= all | maxDets=100 ] = 0.618
Average Precision (AP) @[ IoU=0.50
Average Precision (AP) @[ IoU=0.75
                                       | area = all | maxDets = 100 | = 0.449
Average Precision (AP) @[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.237
Average Precision (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.453
Average Precision (AP) @[IoU=0.50:0.95 \mid area= large \mid maxDets=100] = 0.560
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets= 1] = 0.340
                 (AR) @[IoU=0.50:0.95| area= all | maxDets= 10] = 0.556
Average Recall
                 (AR) @[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.595
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.373
Average Recall
                 (AR) @[ IoU=0.50:0.95 \mid area=medium \mid maxDets=100 ] = 0.646
Average Recall
Average Recall
                 (AR) @[ IoU=0.50:0.95 \mid area= large \mid maxDets=100 ] = 0.803
```

#### **Deformable DETR:**

Test: Total time: 0:11:01 (0.2645 s / it)

Averaged stats: class\_error: 0.00 loss: 5.8611 (6.2284) loss\_ce: 0.3304 (0.3914) loss\_bbox: 0.1845 (0.2033) loss\_giou: 0.3440 (0.4123) loss\_ce\_0: 0.4236 (0.4710) loss\_bbox\_0: 0.2006 (0.2192) loss\_giou\_0: 0.3595 (0.4394) loss\_ce\_1: 0.3551 (0.4228) loss\_bbox\_1: 0.1916 (0.2070) loss\_giou\_1: 0.3454 (0.4193) loss\_ce\_2: 0.3260 (0.4026) loss\_bbox\_2: 0.2022 (0.2053) loss\_giou\_2: 0.3509 (0.4147) loss\_ce\_3: 0.3647 (0.3954) loss\_bbox\_3: 0.1839 (0.2037) loss\_giou\_3: 0.3445 (0.4129) loss\_ce\_4: 0.3290 (0.3924) loss\_bbox\_4: 0.1871 (0.2030) loss\_giou\_4: 0.3449 (0.4127) loss\_ce\_unscaled: 0.1652 (0.1957) class\_error\_unscaled: 4.7619

```
(8.7249)
            loss bbox unscaled:
                                  0.0369 (0.0407)
                                                        loss giou unscaled:
                                                                             0.1720
                                                                                       (0.2061)
cardinality error unscaled:
                            293.5000
                                       (292.1010)
                                                       loss ce 0 unscaled:
                                                                             0.2118
                                                                                       (0.2355)
                         0.0401
loss_bbox_0_unscaled:
                                    (0.0438)
                                                   loss_giou_0_unscaled:
                                                                            0.1798
                                                                                       (0.2197)
cardinality error 0 unscaled: 293.5000 (292.3060)
                                                        loss ce 1 unscaled:
                                                                              0.1776
                                                                                       (0.2114)
loss_bbox_1_unscaled:
                         0.0383
                                    (0.0414)
                                                   loss_giou_1_unscaled:
                                                                            0.1727
                                                                                       (0.2096)
cardinality_error_1_unscaled:
                              293.5000 (292.2054)
                                                        loss_ce_2_unscaled:
                                                                              0.1630
                                                                                       (0.2013)
loss_bbox_2_unscaled:
                         0.0404
                                    (0.0411)
                                                   loss_giou_2_unscaled:
                                                                            0.1754
                                                                                       (0.2074)
cardinality_error_2_unscaled:
                              293.5000 (292.1714)
                                                        loss_ce_3_unscaled:
                                                                              0.1823
                                                                                       (0.1977)
loss_bbox_3_unscaled:
                         0.0368
                                    (0.0407)
                                                   loss_giou_3_unscaled:
                                                                            0.1723
                                                                                       (0.2064)
                              293.5000 (292.1456)
cardinality_error_3_unscaled:
                                                        loss_ce_4_unscaled:
                                                                              0.1645
                                                                                       (0.1962)
loss_bbox_4_unscaled:
                                    (0.0406)
                                                   loss_giou_4_unscaled:
                         0.0374
                                                                            0.1724
                                                                                       (0.2064)
cardinality error 4 unscaled: 293.5000 (292.1110)
Accumulating evaluation results...
DONE (t=9.55s).
IoU metric: bbox
Average Precision (AP) @[ IoU=0.50:0.95 \mid area= all \mid maxDets=100 ] = 0.445
Average Precision (AP) @[ IoU=0.50
                                        | area = all | maxDets = 100 | = 0.635
                                        | area= all | maxDets=100 ] = 0.487
Average Precision (AP) @[ IoU=0.75
Average Precision (AP) @[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.268
Average Precision (AP) @[IoU=0.50:0.95 \mid area=medium \mid maxDets=100] = 0.477
Average Precision (AP) @[IoU=0.50:0.95 | area= large | maxDets=100] = 0.595
                  (AR) @[IoU=0.50:0.95 | area= all | maxDets= 1] = 0.353
Average Recall
Average Recall
                  (AR) @[IoU=0.50:0.95 | area= all | maxDets= 10] = 0.587
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.629
                  (AR) @[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.416
Average Recall
Average Recall
                  (AR) @[IoU=0.50:0.95 | area=medium | maxDets=100] = 0.673
Average Recall
                  (AR) @[ IoU=0.50:0.95 \mid area= large \mid maxDets=100 ] = 0.819
```

#### Deformable DETR + iterative bounding box refinement:

Averaged stats: class error: 0.00 loss: 6.2634 (6.3376) loss ce: 0.3980 (0.3963) loss bbox: 0.2170 (0.2078) loss\_giou: 0.3444 (0.4101) loss\_ce\_0: 0.3935 (0.4610) loss\_bbox\_0: 0.2571 (0.2464) loss\_giou\_0: 0.4184 (0.4832) loss\_ce\_1: 0.3858 (0.4316) loss\_bbox\_1: 0.2158 (0.2113) loss\_giou\_1: 0.3547 (0.4210) loss\_ce\_2: 0.3943 (0.4139) loss bbox 2: 0.2185 (0.2072) loss\_giou\_2: 0.3471 (0.4121) loss\_ce\_3: 0.4044 (0.4021) loss\_bbox\_3: 0.2142 (0.2076) loss giou 3: 0.3472 (0.4109) loss ce 4: 0.3956 (0.3962) loss bbox 4: 0.2170 (0.2081) loss\_giou\_4: 0.3443 (0.4105) loss\_ce\_unscaled: 0.1990 (0.1982) class\_error\_unscaled: 0.0000 loss bbox unscaled: 0.0434 (0.0416) loss giou unscaled: (7.5326)0.1722 (0.2051)(292.1730)loss ce 0 unscaled: cardinality error unscaled: 293.5000 0.1967 (0.2305)0.0514loss\_bbox\_0\_unscaled: (0.0493)loss\_giou\_0\_unscaled: 0.2092 (0.2416)cardinality\_error\_0\_unscaled: 293.5000 (292.2916) loss\_ce\_1\_unscaled: 0.1929 (0.2158)loss bbox 1 unscaled: 0.0432 (0.0423)loss\_giou\_1\_unscaled: 0.1773 (0.2105)293.5000 (292.2470) loss\_ce\_2\_unscaled: cardinality\_error\_1\_unscaled: 0.1971 (0.2069)loss\_bbox\_2\_unscaled: 0.0437 (0.0414)loss\_giou\_2\_unscaled: 0.1736 (0.2060)cardinality\_error\_2\_unscaled: 293.5000 (292.2042)loss\_ce\_3\_unscaled: 0.2022 (0.2011)loss bbox 3 unscaled: 0.0428 (0.0415)loss giou 3 unscaled: 0.1736 (0.2055)cardinality\_error\_3\_unscaled: 293.5000 (291.8936)loss\_ce\_4\_unscaled: 0.1978 (0.1981)loss\_bbox\_4\_unscaled: 0.0434loss\_giou\_4\_unscaled: (0.0416)0.1722 (0.2053)cardinality\_error\_4\_unscaled: 293.5000 (292.1126) Accumulating evaluation results...

DONE (t=9.51s). IoU metric: bbox

```
Average Precision (AP) @[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.463
                                        | area= all | maxDets=100 ] = 0.650
Average Precision (AP) @[ IoU=0.50
                                        | area= all | maxDets=100 ] = 0.501
Average Precision (AP) @[ IoU=0.75
Average Precision (AP) @[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.285
Average Precision (AP) @[IoU=0.50:0.95 \mid area=medium \mid maxDets=100] = 0.492
Average Precision (AP) @[ IoU=0.50:0.95 | area= large \mid maxDets=100 ] = 0.615
Average Recall
                 (AR) @[ IoU=0.50:0.95 \mid area = all \mid maxDets = 1 ] = 0.365
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets= 10] = 0.598
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.640
                 (AR) @[ IoU=0.50:0.95 \mid area= small \mid maxDets=100 ] = 0.430
Average Recall
Average Recall
                 (AR) @[ IoU=0.50:0.95 \mid area=medium \mid maxDets=100 ] = 0.685
Average Recall
                 (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.831
```

#### <u>Deformable DETR + iterative bounding box refinement ++ two-stage Deformable DETR:</u>

Test: Total time: 0:12:22 (0.2972 s / it) Averaged stats: class error: 0.00 loss: 6.6696 (7.0185) loss ce: 0.3309 (0.3976) loss bbox: 0.1784 (0.1943) loss\_giou: 0.3366 (0.3688) loss\_ce\_0: 0.5190 (0.5896) loss\_bbox\_0: 0.1826 (0.1827) loss giou 0: 0.3699 (0.3607) loss ce 1: 0.4045 (0.4659) loss bbox 1: 0.1723 (0.1887) loss giou 1: 0.3437 (0.3646) loss\_ce\_2: 0.3578 (0.4218) loss\_bbox\_2: 0.1786 (0.1932) loss\_giou\_2: 0.3422 (0.3686) loss\_ce\_3: 0.3669 (0.4083) loss\_bbox\_3: 0.1822 (0.1949) loss\_giou\_3: 0.3368 (0.3702) loss\_ce\_4: 0.3366 (0.3995) loss\_bbox\_4: 0.1850 (0.1933) loss\_giou\_4: 0.3367 (0.3680) loss\_ce\_enc: 0.3916 (0.4304) loss\_bbox\_enc: 0.1863 (0.1913) loss giou enc: 0.3760 (0.3663) loss ce unscaled: 0.1655 (0.1988) class error unscaled: 0.0000 loss bbox unscaled: loss\_giou\_unscaled: (7.0752)0.0357 (0.0389) 0.1683 (0.1844)cardinality error unscaled: 293.5000 (292.0032)loss ce 0 unscaled: 0.2595 (0.2948)loss bbox 0 unscaled: 0.0365 (0.0365)loss giou 0 unscaled: 0.1849 (0.1803)cardinality\_error\_0\_unscaled: 293.5000 (291.7504) loss\_ce\_1\_unscaled: 0.2023 (0.2330)loss\_bbox\_1\_unscaled: 0.0345 (0.0377)loss\_giou\_1\_unscaled: 0.1719 (0.1823)cardinality\_error\_1\_unscaled: 293.5000 (291.6832) loss\_ce\_2\_unscaled: (0.2109)0.1789 loss bbox 2 unscaled: 0.0357 (0.0386)loss giou 2 unscaled: 0.1711 (0.1843)cardinality\_error\_2\_unscaled: 293.5000 (291.7440)loss\_ce\_3\_unscaled: (0.2041)0.1834 loss\_bbox\_3\_unscaled: 0.0364 (0.0390)loss\_giou\_3\_unscaled: 0.1684 (0.1851)cardinality\_error\_3\_unscaled: 293.5000 (291.7824)loss\_ce\_4\_unscaled: 0.1683 (0.1997)loss\_bbox\_4\_unscaled: (0.0387)0.0370 loss\_giou\_4\_unscaled: 0.1684 (0.1840)cardinality error 4 unscaled: 293.5000 (291.9870) loss ce enc unscaled: 0.1958 (0.2152)loss\_bbox\_enc\_unscaled: 0.0373 (0.0383)loss\_giou\_enc\_unscaled: 0.1880(0.1831)cardinality error enc unscaled: 20091.0000 (22116.8064) Accumulating evaluation results... DONE (t=8.28s). IoU metric: bbox Average Precision (AP) @ $[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.469$ | area = all | maxDets = 100 | = 0.657Average Precision (AP) @[ IoU=0.50 | area= all | maxDets=100 ] = 0.511 Average Precision (AP) @[ IoU=0.75 Average Precision (AP)  $@[IoU=0.50:0.95 \mid area=small \mid maxDets=100] = 0.296$ Average Precision (AP)  $@[IoU=0.50:0.95 \mid area=medium \mid maxDets=100] = 0.503$ Average Precision (AP) @[ IoU=0.50:0.95 | area=  $large \mid maxDets=100$  ] = 0.616 Average Recall (AR) @[IoU=0.50:0.95 | area= all | maxDets= 1] = 0.363Average Recall (AR) @[  $IoU=0.50:0.95 \mid area = all \mid maxDets = 10 ] = 0.610$ Average Recall (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.659Average Recall (AR) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.460

(AR) @[  $IoU=0.50:0.95 \mid area=medium \mid maxDets=100 ] = 0.708$ 

Average Recall

Average Recall (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.832

# 2. InternImage: Exploring Large-Scale Vision Foundation Models with Deformable Convolutions

- **Papers** with code (Object Detection): <a href="https://paperswithcode.com/paper/internimage-exploring-large-scale-vision">https://paperswithcode.com/paper/internimage-exploring-large-scale-vision</a>
- **InternImage github:** <a href="https://github.com/opengylab/internimage">https://github.com/opengylab/internimage</a>
- Paper: https://arxiv.org/pdf/2211.05778v4.pdf
- Results:

Backbone: InternImage-B / Method: Mask R-CNN / schd: 3x

load checkpoint from local path: ./checkpoints/mask\_rcnn\_internimage\_b\_fpn\_3x\_coco.pth [>>>>>>>>>>>> [ 5000/5000, 3.2 task/s, elapsed: 1573s, ETA: 0s

Evaluating bbox...

Loading and preparing results...

DONE (t=0.38s)

creating index...

index created!

Running per image evaluation...

Evaluate annotation type \*bbox\*

DONE (t=18.18s).

Accumulating evaluation results...

DONE (t=2.95s).

```
Average Precision (AP) @[ IoU=0.50:0.95 | area= all | maxDets=100 ] = 0.503
Average Precision (AP) @[ IoU=0.50
                                      | area= all | maxDets=1000 ] = 0.714
Average Precision (AP) @[ IoU=0.75
                                       | area = all | maxDets = 1000 ] = 0.553
Average Precision (AP) @[ IoU=0.50:0.95 \mid area=small \mid maxDets=1000 ] = 0.353
Average Precision (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=1000 ] = 0.535
Average Precision (AP) @[ IoU=0.50:0.95 | area= large | maxDets=1000 ] = 0.646
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.620
Average Recall
                 (AR) @[ IoU=0.50:0.95 \mid area= all \mid maxDets=300 ] = 0.620
Average Recall
                 (AR) @[IoU=0.50:0.95 \mid area= all \mid maxDets=1000] = 0.620
Average Recall
                 (AR) @[IoU=0.50:0.95 \mid area=small \mid maxDets=1000] = 0.463
                 (AR) @[IoU=0.50:0.95 \mid area=medium \mid maxDets=1000] = 0.653
Average Recall
Average Recall
                 (AR) @[IoU=0.50:0.95 | area= large | maxDets=1000 ] = 0.765
```

category	AP	category	AP	category	AP
person	0.6	bicycle	0.4	car	0.51
motorcycle	0.52	airplane	0.71	bus	0.73
train	0.71	truck	0.45	boat	0.35
traffic light	0.32	fire hydrant	0.74	stop sign	0.72
parking meter	0.54	bench	0.34	bird	0.43
cat	0.75	dog	0.71	horse	0.66
sheep	0.61	cow	0.64	elephant	0.72
bear	0.8	zebra	0.69	giraffe	0.73

backpack	0.24	umbrella	0.47	handbag	0.26
tie	0.44	suitcase	0.49	frisbee	0.73
skis	0.33	snowboard	0.5	sports ball	0.49
kite	0.48	baseball bat	0.46	baseball glove	0.45
skateboard	0.61	surfboard	0.49	tennis racket	0.61
bottle	0.48	wine glass	0.45	cup	0.52
fork	0.52	knife	0.34	spoon	0.3
bowl	0.5	banana	0.27	apple	0.29
sandwich	0.44	orange	0.37	broccoli	0.25
carrot	0.27	hot dog	0.45	pizza	0.56
donut	0.56	cake	0.47	chair	0.38
couch	0.5	potted plant	0.36	bed	0.5
dining table	0.34	toilet	0.66	tv	0.64
laptop	0.7	mouse	0.68	remote	0.47
keyboard	0.58	cell phone	0.46	microwave	0.63
oven	0.42	toaster	0.54	sink	0.43
refrigerator	0.66	book	0.21	clock	0.51
vase	0.43	scissors	0.47	teddy bear	0.56
hair drier	0.24	toothbrush	0.4	None	None

#### Backbone: InternImage-L / Method: Cascade / schd: 3x

Evaluating bbox...

Loading and preparing results...

DONE (t=0.49s)

creating index...

index created!

Running per image evaluation...

Evaluate annotation type \*bbox\*

DONE (t=19.77s).

Accumulating evaluation results...

DONE (t=3.17s).

Average Recall	(AR) @[ IoU=0.50:0.95   area= all   maxDets=300 ] = 0.685
Average Recall	(AR) @[ IoU=0.50:0.95   area= all   maxDets=1000 ] = 0.685
Average Recall	(AR) @[ IoU=0.50:0.95   area= small   maxDets=1000 ] = 0.525
Average Recall	(AR) @[ IoU=0.50:0.95   area=medium   maxDets=1000 ] = 0.726
Average Recall	(AR) @[ IoU=0.50:0.95   area= large   maxDets=1000 ] = 0.827

category	AP	category	AP	category	AP
person	0.65	bicycle	0.45	car	0.56
motorcycle		airplane	0.76	bus	0.76
train	0.37	truck	0.70	boat	0.70
	_		0.5		0.75
traffic light parking	0.34	fire hydrant	0.77	stop sign	0.75
meter	0.58	bench	0.39	bird	0.48
cat	0.82		0.39	horse	0.48
		dog			-
sheep	0.65	cow	0.69	elephant	0.78
bear	0.8	zebra	0.76	giraffe	0.78
backpack	0.29	umbrella	0.55	handbag	0.3
tie	0.5	suitcase	0.57	frisbee	0.78
skis	0.39	snowboard	0.54	sports ball	0.53
kite	0.54	baseball bat	0.55	baseball glove	0.51
skateboard	0.66	surfboard	0.56	tennis racket	0.66
bottle	0.53	wine glass	0.49	cup	0.58
fork	0.6	knife	0.41	spoon	0.39
bowl	0.55	banana	0.35	apple	0.34
sandwich	0.51	orange	0.39	broccoli	0.3
carrot	0.33	hot dog	0.53	pizza	0.63
donut	0.64	cake	0.52	chair	0.44
couch	0.53	potted plant	0.4	bed	0.59
dining table	0.39	toilet	0.72	tv	0.69
laptop	0.78	mouse	0.69	remote	0.54
keyboard	0.64	cell phone	0.55	microwave	0.72
oven	0.48	toaster	0.57	sink	0.51
refrigerator	0.77	book	0.25	clock	0.58
vase	0.47	scissors	0.53	teddy bear	0.65
hair drier	0.36	toothbrush	0.49	None	None

# Backbone: InternImage-XL / Method: Cascade / schd: 3x

load checkpoint from local path: ./checkpoints/cascade\_internimage\_xl\_fpn\_3x\_coco.pth [>>>>>>>>>> = 5000/5000, 1.0 task/s, elapsed: 4800s, ETA: 0s

Evaluating bbox...

Loading and preparing results...

DONE (t=0.37s)

creating index...

index created!

Running per image evaluation...

Evaluate annotation type \*bbox\* DONE (t=18.20s). Accumulating evaluation results... DONE (t=2.69s).

Average Precision (AP) @[IoU=0.50:0.95| area= all | maxDets=100] = 0.562 Average Precision (AP) @[ IoU=0.50 | area= all | maxDets=1000 ] = 0.750 | area= all | maxDets=1000 ] = 0.612 Average Precision (AP) @[ IoU=0.75 Average Precision (AP) @[ IoU=0.50:0.95 | area= small | maxDets=1000 ] = 0.401 Average Precision (AP) @[  $IoU=0.50:0.95 \mid area=medium \mid maxDets=1000 ] = 0.605$ Average Precision (AP) @[ IoU=0.50:0.95 | area= large | maxDets=1000 ] = 0.726 (AR) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.677Average Recall Average Recall (AR) @[IoU=0.50:0.95| area= all | maxDets=300] = 0.677 (AR) @[  $IoU=0.50:0.95 \mid area = all \mid maxDets=1000 ] = 0.677$ Average Recall Average Recall (AR) @[ IoU=0.50:0.95 | area= small | maxDets=1000 ] = 0.518 Average Recall (AR) @ $[IoU=0.50:0.95 \mid area=medium \mid maxDets=1000] = 0.718$ (AR) @[ IoU=0.50:0.95 | area= large | maxDets=1000 ] = 0.823 Average Recall

category	AP	category	AP	category	AP
person	0.65	bicycle	0.44	car	0.56
motorcycle	0.56	airplane	0.76	bus	0.77
train	0.78	truck	0.5	boat	0.39
traffic light	0.35	fire hydrant	0.79	stop sign	0.76
parking mete	r 0.6	bench	0.39	bird	0.48
cat	0.82	dog	8.0	horse	0.7
sheep	0.65	cow	0.7	elephant	0.77
bear	0.81	zebra	0.76	giraffe	0.78
backpack	0.29	umbrella	0.54	handbag	0.3
tie	0.5	suitcase	0.57	frisbee	0.78
skis	0.4	snowboard	0.55	sports ball	0.54
kite	0.54	baseball bat	0.55	baseball glove	0.51
skateboard	0.66	surfboard	0.56	tennis racket	0.66
bottle	0.54	wine glass	0.5	cup	0.58
fork	0.61	knife	0.42	spoon	0.41
bowl	0.55	banana	0.35	apple	0.35
sandwich	0.52	orange	0.42	broccoli	0.3
carrot	0.33	hot dog	0.55	pizza	0.62
donut	0.64	cake	0.51	chair	0.44
couch	0.56	potted plant	0.4	bed	0.57
dining table	0.38	toilet	0.74	tv	0.69
laptop	0.77	mouse	0.7	remote	0.54
keyboard	0.65	cell phone	0.54	microwave	0.71
oven	0.48	toaster	0.46	sink	0.52
refrigerator	0.74	book	0.26	clock	0.58
vase	0.46	scissors	0.55	teddy bear	0.66
hair drier	0.36	toothbrush	0.48	None	None

# 3. A Strong and Reproducible Object Detector with Only Public Datasets

- Papers with code (Object Detection): <a href="https://paperswithcode.com/paper/a-strong-and-reproducible-object-detector">https://paperswithcode.com/paper/a-strong-and-reproducible-object-detector</a>
- FocalNet github: <a href="https://github.com/microsoft/FocalNet">https://github.com/microsoft/FocalNet</a>
- **Paper:** https://arxiv.org/pdf/2304.13027v1.pdf
- Results:

#### 4. EVA: Exploring the Limits of Masked Visual Representation Learning at Scale

- Papers with code (Object Detection): <a href="https://paperswithcode.com/paper/eva-exploring-the-limits-of-masked-visual">https://paperswithcode.com/paper/eva-exploring-the-limits-of-masked-visual</a>
- **EVA github:** <a href="https://github.com/baaivision/EVA/tree/master">https://github.com/baaivision/EVA/tree/master</a>
- Paper: <a href="https://arxiv.org/pdf/2211.07636v2.pdf">https://arxiv.org/pdf/2211.07636v2.pdf</a>
- Results:

#### eva02 L coco bsl.pth

[06/01 18:42:19 d2.evaluation.evaluator]: Total inference time: 0:59:19.944545 (0.712702 s / iter per device, on 1 devices)

[06/01 18:42:19 d2.evaluation.evaluator]: Total inference pure compute time: 0:57:37 (0.692171 s / iter per device, on 1 devices)

[06/01 18:42:19 d2.evaluation.coco\_evaluation]: Preparing results for COCO format ...

[06/01 18:42:19 d2.evaluation.coco\_evaluation]: Evaluating predictions with unofficial COCO API...

Loading and preparing results...

DONE (t=0.06s)

creating index...

index created!

[06/01 18:42:19 d2.evaluation.fast\_eval\_api]: Evaluate annotation type \*bbox\*

[06/01 18:42:24 d2.evaluation.fast\_eval\_api]: COCOeval\_opt.evaluate() finished in 4.57 seconds.

[06/01 18:42:24 d2.evaluation.fast\_eval\_api]: Accumulating evaluation results...

[06/01 18:42:24 d2.evaluation.fast\_eval\_api]: COCOeval\_opt.accumulate() finished in 0.39 seconds.

Average Precision (AP) @  $[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.592$ 

Average Precision (AP) @[IoU=0.50 | area= all | maxDets=100] = 0.787

Average Precision (AP) @[ IoU=0.75 | area= all | maxDets=100 ] = 0.641

Average Precision (AP) @[IoU=0.50:0.95 | area= small | maxDets=100] = 0.419

Average Precision (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.645

Average Precision (AP)  $\varpi$ [ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.754

Average Recall (AR) @[IoU=0.50:0.95 | area= all | maxDets= 1] = 0.419

Average Recall (AR) @[IoU=0.50:0.95 | area= all | maxDets= 10] = 0.668

Average Recall (AR)  $@[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.696$ 

Average Recall (AR) @[IoU=0.50:0.95] area= small | maxDets=100 ] = 0.537

Average Recall (AR) @[IoU=0.50:0.95] area=medium | maxDets=100 ] = 0.750

Average Recall (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.847

#### [06/01 18:42:24 d2.evaluation.coco\_evaluation]: Evaluation results for bbox:

AP	AP50	AP75	APs	APm	API
59.165	78.66	64.1	41.92	64.46	75.38

```
| AP | AP50 | AP75 | APs | APm | APl |
|:-----:|:-----:|:-----:|:-----:|
| 59.165 | 78.660 | 64.103 | 41.920 | 64.458 | 75.383 |
```

[06/01 18:42:24 d2.evaluation.coco evaluation]: Per-category bbox AP: |AP|category | AP category category | AP |:-----|:-----|:-----|:-----|:----| person | 65.714 | bicvcle | 48.665 | car | 55.813 | motorcycle | 60.242 | airplane | 78.599 | bus | 78.619 | | 80.043 | truck | 55.784 | boat | 43.413 | train traffic light | 34.975 | fire hydrant | 81.447 | stop sign | 74.934 | parking meter | 57.540 | bench | 45.907 | bird | 49.346 | | 81.536 | dog | 82.393 | horse | 75.051 | cat sheep | 66.680 | cow | 70.742 | elephant | 79.746 | | 85.807 | zebra | 78.713 | giraffe | 79.813 | bear | 34.018 | umbrella | 57.545 | handbag | 34.688 | backpack | 52.759 | suitcase | 60.696 | frisbee tie | 77.919 | skis | 42.007 | snowboard | 54.114 | sports ball | 57.150 | | 59.881 | baseball bat | 59.542 | baseball glove | 51.239 | kite | 69.340 | surfboard | 59.724 | tennis racket | 71.186 | skateboard bottle | 54.362 | wine glass | 50.757 | cup 60.596 fork | 62.290 | knife | 45.251 | spoon | 39.668 | bowl | 58.454 | banana | 36.902 | apple | 34.995 | sandwich | 57.465 | orange | 41.407 | broccoli | 32.191 | | 34.524 | hot dog | 60.339 | pizza | 65.505 | carrot donut | 65.346 | cake | 56.940 | chair | 49.325 | couch | 59.608 | potted plant | 42.383 | bed | 63.225 | dining table | 41.959 | toilet | 73.572 | tv | 71.349 | | 80.525 | mouse | 72.490 | remote laptop | 57.435 | keyboard | 66.265 | cell phone | 57.493 | microwave | 75.826 | oven | 50.109 | toaster | 55.742 | sink | 51.618 | refrigerator | 77.926 | book | 28.466 | clock | 61.042 | | 51.557 | scissors | 61.884 | teddy bear | 71.724 | vase | hair drier | 44.387 | toothbrush | 56.985 | 

category	AP	category	AP	category	AP
person	65.714	bicycle	48.665	car	55.813
motorcycle	60.242	airplane	78.599	bus	78.619
train	80.043	truck	55.784	boat	43.413
traffic light	34.975	fire hydrant	81.447	stop sign	74.934
parking meter	57.540	bench	45.907	bird	49.346
cat	81.536	dog	82.393	horse	75.051
sheep	66.680	cow	70.742	elephant	79.746
bear	85.807	zebra	78.713	giraffe	79.813
backpack	34.018	umbrella	57.545	handbag	34.688
tie	52.759	suitcase	60.696	frisbee	77.919
skis	42.007	snowboard	54.114	sports ball	57.150
kite	59.881	baseball bat	59.542	baseball glove	51.239

skateboard	69.340	surfboard	59.724	tennis racket	71.186
bottle	54.362	wine glass	50.757	cup	60.596
fork	62.290	knife	45.251	spoon	39.668
bowl	58.454	banana	36.902	apple	34.995
sandwich	57.465	orange	41.407	broccoli	32.191
carrot	34.524	hot dog	60.339	pizza	65.505
donut	65.346	cake	56.940	chair	49.325
couch	59.608	potted plant	42.383	bed	63.225
dining table	41.959	toilet	73.572	tv	71.349
laptop	80.525	mouse	72.490	remote	57.435
keyboard	66.265	cell phone	57.493	microwave	75.826
oven	50.109	toaster	55.742	sink	51.618
refrigerator	77.926	book	28.466	clock	61.042
vase	51.557	scissors	61.884	teddy bear	71.724
hair drier	44.387	toothbrush	56.985		

#### eva02 L coco sys:

 $[06/02\ 12:07:13\ d2.evaluation.evaluator]$ : Total inference time:  $2:46:07.088074\ (1.995413\ s\ /\ iter$  per device, on 1 devices)

[06/02 12:07:13 d2.evaluation.evaluator]: Total inference pure compute time: 2:38:53 (1.908665 s / iter per device, on 1 devices)

[06/02 12:07:13 d2.evaluation.coco evaluation]: Preparing results for COCO format ...

[06/02 12:07:13 d2.evaluation.coco\_evaluation]: Evaluating predictions with unofficial COCO API...

Loading and preparing results...

DONE (t=0.43s)

creating index...

index created!

[06/02 12:07:14 d2.evaluation.fast\_eval\_api]: Evaluate annotation type \*bbox\*

[06/02 12:07:22 d2.evaluation.fast\_eval\_api]: COCOeval\_opt.evaluate() finished in 7.98 seconds.

[06/02 12:07:22 d2.evaluation.fast\_eval\_api]: Accumulating evaluation results...

[06/02 12:07:23 d2.evaluation.fast\_eval\_api]: COCOeval\_opt.accumulate() finished in 1.11 seconds.

Average Precision (AP) @[IoU=0.50:0.95 | area= all | maxDets=100] = 0.623

Average Precision (AP) @ [IoU=0.50] | area = all | maxDets=100 ] = 0.808

Average Precision (AP) @[ IoU=0.75 | area= all | maxDets=100 ] = 0.681

Average Precision (AP) @[  $IoU=0.50:0.95 \mid area=small \mid maxDets=100$ ] = 0.459

Average Precision (AP) @[IoU=0.50:0.95 | area=medium | maxDets=100] = 0.667

Average Precision (AP) @[IoU=0.50:0.95| area= large | maxDets=100] = 0.780

Average Recall (AR) @[ $IoU=0.50:0.95 \mid area= all \mid maxDets= 1$ ] = 0.430

Average Recall (AR)  $@[IoU=0.50:0.95 \mid area= all \mid maxDets=10] = 0.722$ 

Average Recall (AR)  $@[IoU=0.50:0.95 \mid area= all \mid maxDets=100] = 0.783$ 

Average Recall (AR) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.668

Average Recall (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.822 Average Recall (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.903 [06/02 12:07:23 d2.evaluation.coco\_evaluation]: Evaluation results for bbox:

AP	AP50	AP75	APs	APm	API
62.286	80.8	68.1	45.86	66.74	78.01

| AP | AP50 | AP75 | APs | APm | APl | |:----:|:----:|:----:|:----:| | 62.286 | 80.801 | 68.096 | 45.862 | 66.739 | 78.005 |

[06/02 12:07:23 d2.evaluation.coco\_evaluation]: Per-category bbox AP:

category	AP	category	AP	category	AP
person	68.951	bicycle	52.066	car	59.994
motorcycle	63.230	airplane	82.877	bus	81.049
train	82.718	truck	57.952	boat	48.034
traffic light	39.244	fire hydrant	83.396	stop sign	76.519
parking meter	59.545	bench	47.449	bird	53.605
cat	84.159	dog	83.152	horse	77.768
sheep	69.102	cow	74.783	elephant	80.875
bear	85.708	zebra	81.385	giraffe	82.911
backpack	37.248	umbrella	59.672	handbag	37.829
tie	57.438	suitcase	64.546	frisbee	80.495
skis	45.776	snowboard	56.836	sports ball	61.903
kite	62.345	baseball bat	68.087	baseball glove	55.997
skateboard	73.468	surfboard	63.282	tennis racket	74.084
bottle	56.771	wine glass	55.317	cup	63.423
fork	65.951	knife	50.055	spoon	45.232
bowl	59.871	banana	41.184	apple	36.768
sandwich	62.666	orange	44.128	broccoli	34.325
carrot	37.035	hot dog	66.393	pizza	67.521
donut	68.848	cake	60.778	chair	51.970
couch	62.814	potted plant	42.976	bed	65.272
dining table	44.396	toilet	76.765	tv	74.093
laptop	83.057	mouse	74.747	remote	61.502
keyboard	67.001	cell phone	62.054	microwave	76.657
oven	52.937	toaster	50.565	sink	54.551
refrigerator	79.490	book	32.335	clock	63.126

vase	54.493	scissors	71.137	teddy bear	75.430
hair drier	52.041	toothbrush	61.702		

	: : : : :    68.951   bicycle
_	cle   63.230   airplane   82.877   bus   81.049
	82.718   truck   57.952   boat   48.034
	ght   39.244   fire hydrant   83.396   stop sign   76.519
	meter   59.545   bench   47.449   bird   53.605
	84.159   dog   83.152   horse   77.768
	69.102   cow   74.783   elephant   80.875
	85.708   zebra   81.385   giraffe   82.911
-	k   37.248   umbrella   59.672   handbag   37.829
	57.438   suitcase   64.546   frisbee   80.495
	45.776   snowboard   56.836   sports ball   61.903
kite	62.345   baseball bat   68.087   baseball glove   55.997
	rd   73.468   surfboard   63.282   tennis racket   74.084
bottle	56.771   wine glass   55.317   cup   63.423
fork	65.951   knife   50.055   spoon   45.232
bowl	59.871   banana   41.184   apple   36.768
sandwich	h   62.666   orange   44.128   broccoli   34.325
carrot	37.035   hot dog   66.393   pizza   67.521
donut	68.848   cake   60.778   chair   51.970
couch	62.814   potted plant   42.976   bed   65.272
dining ta	ble   44.396   toilet   76.765   tv   74.093
	83.057   mouse   74.747   remote   61.502
	d   67.001   cell phone   62.054   microwave   76.657
	52.937   toaster   50.565   sink   54.551
	tor   79.490   book   32.335   clock   63.126
Vace	54.493   scissors   71.137   teddy bear   75.430