CV_Intern_Visionlab_IITD_Assignment_Sep_2024

This report outlines the experiments and results of the assignment given by IITD. It involved the evaluation, analysis and fine tuning of the DINO object detection model on a pedestrian dataset containing 200 images.

Ground Truth Visualization









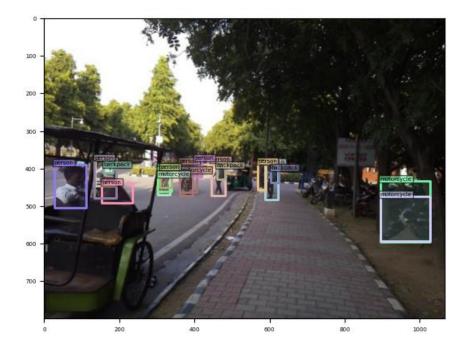
Inference and Evaluation on pre-trained weights

Bounding box AP values with pre-trained model:

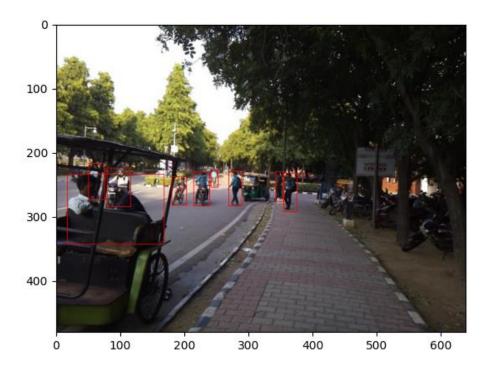
```
IoU metric: bbox
                   (AP) @[ IoU=0.50:0.95 |
Average Precision
                                                   all | maxDets=100 ] = 0.484
                   (AP) @[
                           IoU=0.50
                                                   all
Average Precision
                                           area=
                                                        maxDets=100 ]
                                                                      = 0.845
                           IoU=0.75
                                                   all
Average Precision
                   (AP) @[
                                           area=
                                                        maxDets=100
                                                                       = 0.505
Average Precision
                   (AP) @[
                           IoU=0.50:0.95
                                          area= small
                                                       maxDets=100
                                                                       = 0.406
                   (AP) @[ IoU=0.50:0.95 |
                                          area=medium | maxDets=100
Average Precision
                                                                       = 0.590
Average Precision
                   (AP) @[ IoU=0.50:0.95 |
                                          area= large | maxDets=100
                                                                       = 0.795
Average Recall
                   (AR) @[ IoU=0.50:0.95 |
                                          area=
                                                   all
                                                       maxDets= 1
                                                                       = 0.100
                                                   all
                                                       maxDets= 10
                                                                       = 0.492
Average Recall
                   (AR) @[ IoU=0.50:0.95 | area=
Average Recall
                                                                       = 0.603
                   (AR) @[ IoU=0.50:0.95 | area=
                                                   all
                                                       maxDets=100 ]
Average Recall
                   (AR) @[ IoU=0.50:0.95 | area= small
                                                       maxDets=100
                                                                       = 0.545
Average Recall
                   (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ]
                                                                       = 0.687
Average Recall
                   (AR) @[ IoU=0.50:0.95 |
                                           area= large |
                                                         maxDets=100
                                                                       = 0.836
```

Analysis

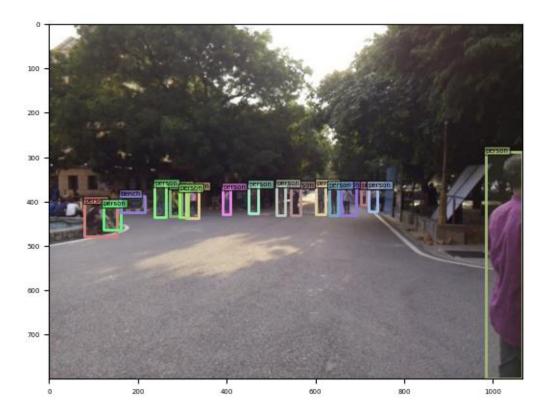
Inference with pre-trained model (checkpoint0033 4scale.pth):



Ground truth:



- Results are fairly consistent with the ground truth. Larger objects are detected with more average precision while smaller objects with lesser AP.
- False negatives for people who are sitting and are farther away (see middle left)

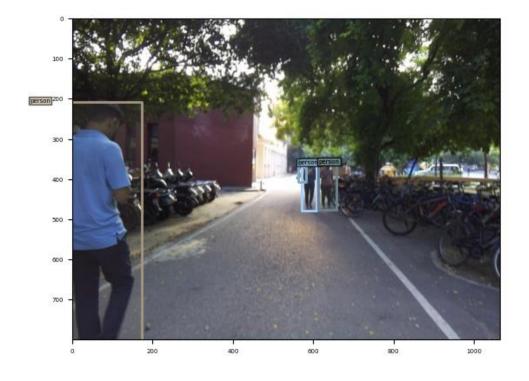


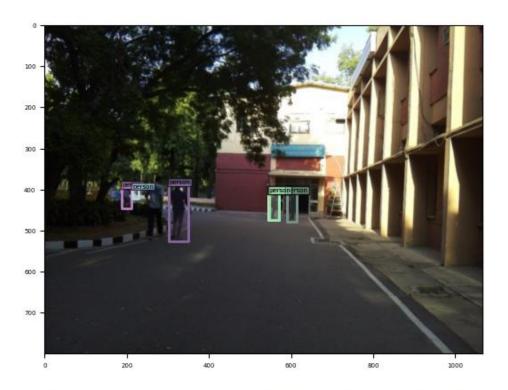
Inference and Evaluation on fine-tuned weights

1. **ATTEMPT 1**

- Pre-trained model: checkpoint0033 4scale.pth
- lr=0.00025
- epochs=30

```
IoU metric: bbox
Average Precision (AP) @[ IoU=0.50:0.95 |
                                                    all |
                                                         maxDets=100 ] = 0.305
                                           area=
Average Precision (AP) @[ IoU=0.50
                                                    all |
                                                         maxDets=100 ] = 0.628
                                            area=
Average Precision (AP) @[ IoU=0.75
                                                    all |
                                                         maxDets=100 ] = 0.248
 Average Precision (AP) @[ IoU=0.50:0.95
                                           area= small
                                                         maxDets=100 ]
                                                                       = 0.247
 Average Precision (AP) @[ IoU=0.50:0.95 | area=medium |
                                                         maxDets=100 ]
                                                                       = 0.447
 Average Precision (AP) @[ IoU=0.50:0.95 |
                                           area= large |
                                                         maxDets=100 ] = 0.252
 Average Recall
                   (AR) @[ IoU=0.50:0.95
                                                    all
                                                         maxDets= 1
                                                                       = 0.076
 Average Recall
                   (AR) @[ IoU=0.50:0.95
                                                    all
                                                         maxDets= 10 ]
                                                                       = 0.368
 Average Recall
                   (AR) @[ IoU=0.50:0.95
                                                    all
                                                         maxDets=100 ]
                                                                       = 0.548
                                                                       = 0.480
 Average Recall
                   (AR) @[ IoU=0.50:0.95 | area= small
                                                         maxDets=100 ]
 Average Recall
                    (AR) @[ IoU=0.50:0.95 | area=medium |
                                                         maxDets=100
                                                                       = 0.680
 Average Recall
                    (AR) @[ IoU=0.50:0.95 | area= large |
                                                         maxDets=100 ]
```



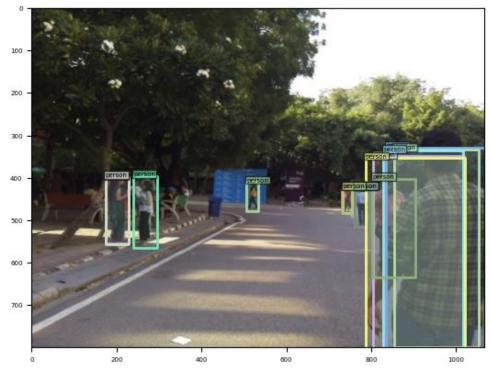




Observations:

• Lots of false positives (overlapping bounding boxes) for small and large objects. Possibly, due to IOU threshold value.

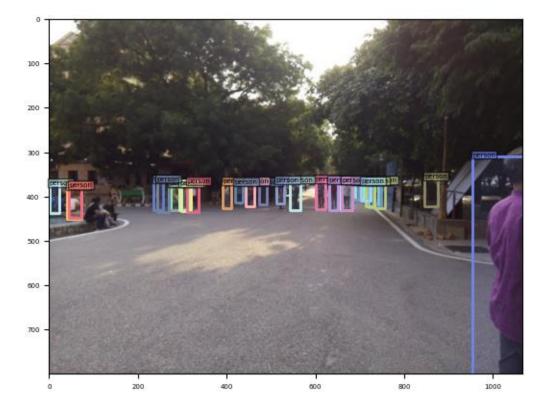




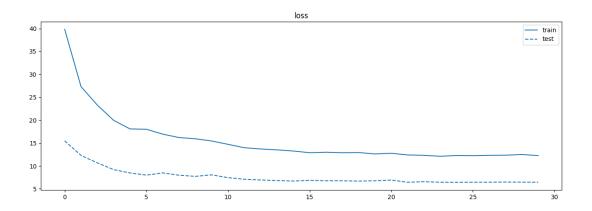
• Low sample size but occlusion handled well in this case:



• False negative for sitting people



Loss plot:



2. <u>ATTEMPT 2</u>

- Pre-trained model: checkpoint0011_4scale.pth
- lr=0.0001
- epochs=12

```
IoU metric: bbox
Average Precision
                    (AP) @[ IoU=0.50:0.95
                                            area=
                                                     all
                                                           maxDets=100 ] = 0.874
Average Precision
                    (AP) @[ IoU=0.50
                                                     all
                                                           maxDets=100
                                            area=
                                                                         = 0.891
Average Precision
                    (AP) @[ IoU=0.75
                                                     all
                                                           maxDets=100
                                            area=
                                                                         = 0.717
Average Precision
                    (AP) @[
                            IoU=0.50:0.95
                                            area= small
                                                           maxDets=100
                                                                         = 0.621
Average Precision
                    (AP) @[
                            IoU=0.50:0.95
                                            area=medium
                                                           maxDets=100
                                                                         = 0.919
Average Precision
                    (AP) @[
                            IoU=0.50:0.95
                                                           maxDets=100
                                            area= large
                                                                         = 0.825
Average Recall
                    (AR) @[
                            IoU=0.50:0.95
                                                     all
                                                           maxDets= 1
                                                                         = 0.806
                                            area=
Average Recall
                    (AR) @[
                            IoU=0.50:0.95
                                                     all
                                                           maxDets= 10
                                                                       ] = 0.755
                                            area=
Average Recall
                    (AR) @[
                            IoU=0.50:0.95
                                                     all
                                            area=
                                                           maxDets=100
                                                                       ] = 0.747
Average Recall
                    (AR) @[ IoU=0.50:0.95
                                            area= small
                                                           maxDets=100
                                                                       ] = 0.669
Average Recall
                    (AR) @[ IoU=0.50:0.95
                                            area=medium
                                                           maxDets=100
                                                                       ] = 0.794
Average Recall
                    (AR) @[ IoU=0.50:0.95 |
                                            area= large |
                                                           maxDets=100 ] = 0.629
Training time 0:12:54
```

Due to time constraints (practical exam on 23rd Sept), I wasn't able to experiment more. If I could, I would've experimented by doing the following:

- If I had access to more GPU memory, I would have increased batch size (I used batch size of 2)
- Since the dataset is smaller, I would have run it for more epochs (I ran it for 30 epochs)
- In DETR based models, num_queries generally refers to the number of object queries used in the model. It correlates to the number of objects the model can detect in a single image. Default value is 900. I would've tried with a smaller value (200-500)
- Since it's a small dataset which I'm running for more epochs, I would slightly increase weight decay to prevent overfitting. Weight decay adds a penalty term to the loss function that is proportional to the sum of the squared weights in the model.