

Assignment 3

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Kaggle Name: LargeHead Goose

Late day: 1 late day used

Part 1

List of configs

```
# Set the configs for the detection part in here.
# TODO: approx 15 lines
'''
cfg = get_cfg()
cfg.OUTPUT_DIR = "{} /output/".format(BASE_DIR)

#cfg.merge_from_file(model_zoo.get_config_file("COCO-Detection/faster_rcnn_R_101_FPN_3x.yaml"))
cfg.merge_from_file(model_zoo.get_config_file("COCO-Detection/faster_rcnn_X_101_32x8d_FPN_3x.yaml"))
cfg.DATASETS.TRAIN = ('plane_train',)
cfg.DATASETS.TEST = ('plane_test',)

cfg.DATALOADER.NUM_WORKERS = 4
#cfg.MODEL.WEIGHTS = model_zoo.get_checkpoint_url("COCO-Detection/faster_rcnn_R_101_FPN_3x.yaml") # Let training initialize from model zoo
cfg.MODEL.WEIGHTS = model_zoo.get_checkpoint_url("COCO-Detection/faster_rcnn_X_101_32x8d_FPN_3x.yaml") # Let training initialize from model zoo
cfg.SOLVER.IMS_PER_BATCH = 2
cfg.SOLVER.BASE_LR = 0.00025
cfg.SOLVER.MAX_ITER = 7000
cfg.MODEL.ROI_HEADS.BATCH_SIZE_PER_IMAGE = 512
cfg.MODEL.ROI_HEADS.NUM_CLASSES = 1
```

List of modifications and Improving factors

- Increase maximum iterations
 - The original iteration was set to 500, but the loss is still decreasing rapidly. Therefore, higher iterations were tested until total_loss become stable
- Switch the original pretrained model to “faster_rcnn_X_101_32x8d_FPN_3x.yaml”
 - On the Model_ZOO website, it introduces the model has a slightly higher box AP of 43% compared to the original “faster_rcnn_R_101_FPN_3x.yaml” model’s 42%
- Employing data augmentations and custom trainer
 - The list of transformations for data augmentation includes random horizontal/vertical flip, random lighting, random contrast, random saturation, and random brightness.
 - To use custom trainer, all image is resized to a fixed size of 512 x 512 so that there would be enough memory to finish the transformation.
 - The data augmentation will be performed 3 times which augmentation happens every 1000 iterations. Applying transformation multiple times can be thought of as increasing training data in some way.

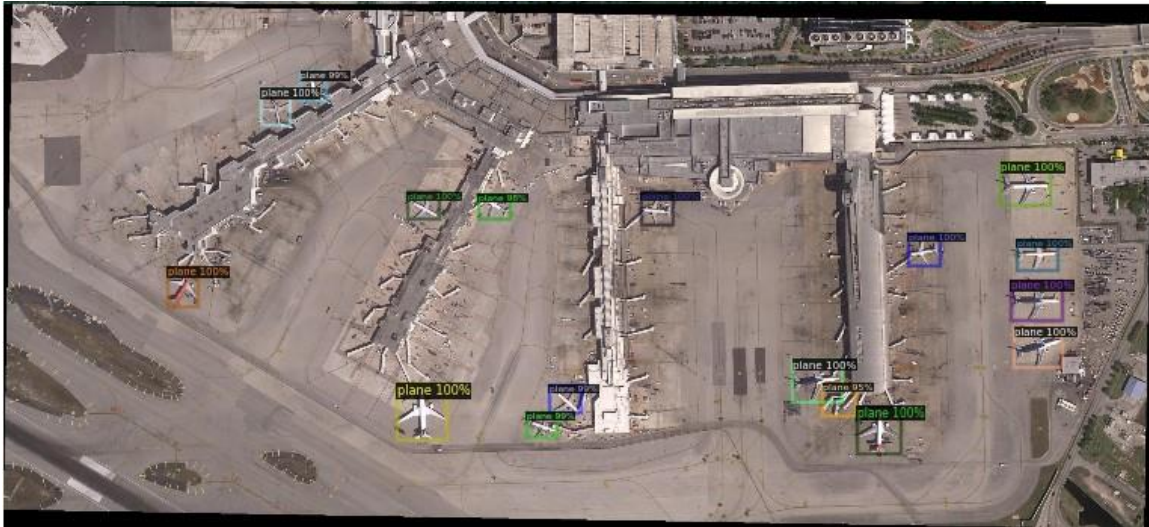
[11/02 10:18:24 u2_train.events]	eta: 0:03:55	iter: 7190	total_loss: 0.588	loss_cls: 0.091	loss_bkg_reg: 0.503	loss_bkg_cls: 0.018	loss_rpn_cls: 0.119	time: 0.8966	data_time: 0.4817	lr: 0.00050	max_mem: 7174M
[11/02 10:18:24 u2_train.events]	iter: 7190	total_loss: 0.593	loss_cls: 0.047	loss_bkg_reg: 0.132	loss_rpn_cls: 0.096	loss_rpn_cls: 0.064	time: 0.8926	data_time: 0.2618	lr: 0.00050	max_mem: 7174M	
[11/02 10:18:56 u2_train.events]	eta: 0:03:18	iter: 7199	total_loss: 0.457	loss_cls: 0.088	loss_bkg_reg: 0.228	loss_rpn_cls: 0.010	loss_rpn_cls: 0.137	time: 0.8243	data_time: 0.3184	lr: 0.00050	max_mem: 7452M
[11/02 10:19:12 u2_train.events]	eta: 0:03:10	iter: 7199	total_loss: 0.356	loss_cls: 0.076	loss_bkg_reg: 0.188	loss_rpn_cls: 0.012	loss_rpn_cls: 0.100	time: 0.8121	data_time: 0.2362	lr: 0.00050	max_mem: 7047M
[11/02 10:19:49 u2_train.events]	eta: 0:02:59	iter: 7199	total_loss: 0.402	loss_cls: 0.077	loss_bkg_reg: 0.212	loss_rpn_cls: 0.010	loss_rpn_cls: 0.110	time: 0.8269	data_time: 0.3520	lr: 0.00050	max_mem: 7047M
[11/02 10:20:03 u2_train.events]	eta: 0:02:50	iter: 7199	total_loss: 0.359	loss_cls: 0.055	loss_bkg_reg: 0.169	loss_rpn_cls: 0.015	loss_rpn_cls: 0.096	time: 0.8325	data_time: 0.2794	lr: 0.00050	max_mem: 7047M
[11/02 10:20:22 u2_train.events]	eta: 0:02:22	iter: 7299	total_loss: 0.351	loss_cls: 0.062	loss_bkg_reg: 0.171	loss_rpn_cls: 0.017	loss_rpn_cls: 0.110	time: 0.8479	data_time: 0.4430	lr: 0.00050	max_mem: 7047M
[11/02 10:20:37 u2_train.events]	eta: 0:02:11	iter: 7299	total_loss: 0.373	loss_cls: 0.065	loss_bkg_reg: 0.188	loss_rpn_cls: 0.011	loss_rpn_cls: 0.090	time: 0.8374	data_time: 0.2259	lr: 0.00050	max_mem: 7047M
[11/02 10:20:51 u2_train.events]	eta: 0:01:58	iter: 7399	total_loss: 0.307	loss_cls: 0.059	loss_bkg_reg: 0.171	loss_rpn_cls: 0.003	loss_rpn_cls: 0.065	time: 0.8205	data_time: 0.1732	lr: 0.00050	max_mem: 7047M
[11/02 10:21:05 u2_train.events]	eta: 0:01:47	iter: 7399	total_loss: 0.340	loss_cls: 0.078	loss_bkg_reg: 0.184	loss_rpn_cls: 0.010	loss_rpn_cls: 0.102	time: 0.8217	data_time: 0.3248	lr: 0.00050	max_mem: 7047M
[11/02 10:21:40 u2_train.events]	eta: 0:01:23	iter: 7399	total_loss: 0.357	loss_cls: 0.076	loss_bkg_reg: 0.186	loss_rpn_cls: 0.012	loss_rpn_cls: 0.093	time: 0.8202	data_time: 0.2745	lr: 0.00050	max_mem: 7047M
[11/02 10:21:57 u2_train.events]	eta: 0:01:11	iter: 7399	total_loss: 0.382	loss_cls: 0.077	loss_bkg_reg: 0.189	loss_rpn_cls: 0.010	loss_rpn_cls: 0.108	time: 0.8229	data_time: 0.3338	lr: 0.00050	max_mem: 10839M
[11/02 10:22:15 u2_train.events]	eta: 0:00:59	iter: 7399	total_loss: 0.337	loss_cls: 0.069	loss_bkg_reg: 0.188	loss_rpn_cls: 0.013	loss_rpn_cls: 0.122	time: 0.8286	data_time: 0.3638	lr: 0.00050	max_mem: 10839M
[11/02 10:22:45 u2_train.events]	eta: 0:00:35	iter: 7499	total_loss: 0.386	loss_cls: 0.069	loss_bkg_reg: 0.195	loss_rpn_cls: 0.008	loss_rpn_cls: 0.095	time: 0.8174	data_time: 0.1468	lr: 0.00050	max_mem: 10839M
[11/02 10:23:04 u2_train.events]	eta: 0:00:24	iter: 7499	total_loss: 0.416	loss_cls: 0.078	loss_bkg_reg: 0.200	loss_rpn_cls: 0.010	loss_rpn_cls: 0.106	time: 0.8261	data_time: 0.4484	lr: 0.00050	max_mem: 10839M
[11/02 10:23:21 u2_train.events]	eta: 0:00:12	iter: 7499	total_loss: 0.442	loss_cls: 0.094	loss_bkg_reg: 0.216	loss_rpn_cls: 0.013	loss_rpn_cls: 0.104	time: 0.8273	data_time: 0.3280	lr: 0.00050	max_mem: 10839M

AP	AP50	AP75	APs	APm	AP1
47.833	69.303	55.719	38.138	54.952	80.068

Test sample 1



Test sample 2



Test sample 3



Ablation study

- Effect of increasing maximum iterations from 500 to 1500
 - AP50 increase from 0.33 to 0.56

- Visualization on 500 max iterations



- Visualization on 1500 max iterations



- Effect of using different pretrain model with 1500 max iterations
 - AP50 increase from original model's 0.56 to newer model's 0.59
 - Visualization on using original pretrain model



- Visualization on using different pretrain model



- Effect of employing data augmentations on 7000 max iterations
 - AP50 increase from 0.68 to 0.69
 - Visualization on no data augmentations training with 7000 max iterations



- Visualization on training with augmentations with 7000 max iterations



Part 2

Hyperparameter setting

- Batch size:4
- Learning rate: 0.001
- Number of epochs: 100
- Optimizer: Adam optimizer

Net architecture

For net architecture, I expand the original architecture by adding 3 more down and upsampling layers. For each downsampling layers, the output channel will have a doubled size of the input channel, also, I added one more conv layer in the downsampling layer. The general idea is to increase feature channels so that detailed features can be detected. I used Adam optimizer instead of the original SGD optimizer because many pieces of research state that it converges faster than SGD. The number of epochs is optimal at 100 as the loss becomes stable at around 90 epochs.

Loss function and training loss

- The loss function is the default loss function, nn.BCEWithLogitsLoss()
- The loss decreases from 0.243 at epoch 1 to 0.099 at epoch 250. Below are the two images displaying the training loss of the first 5 and last 5 epochs.

Training loss of first 5 epochs

```
> 100% ██████████ 1995/1995 [07:44:00.00, 4.300s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 0, Loss: 0.243241754770279
100% ██████████ 1995/1995 [00:35:00.00, 55.450s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 1, Loss: 0.20786724984645844
100% ██████████ 1995/1995 [06:32:00.00, 5.080s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 2, Loss: 0.19805952906680582
100% ██████████ 1995/1995 [05:57:00.00, 5.590s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 3, Loss: 0.1900254786014557
100% ██████████ 1995/1995 [00:30:00.00, 52.030s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 4, Loss: 0.18318534954071845
100% ██████████ 1995/1995 [04:45:00.00, 6.990s]
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:39: UserWarning: To copy construct from a tensor, it is recommended to use sourceTensor.clone().detach() or sourceTensor.clone().detach().requires_grad_(True), rather than torch.tensor(sourceTensor).
Epoch: 5, Loss: 0.17618149085521698
```

Training loss of last 5 epochs

Final mean IoU of Model: 0.866

Test plane image and predicted masks



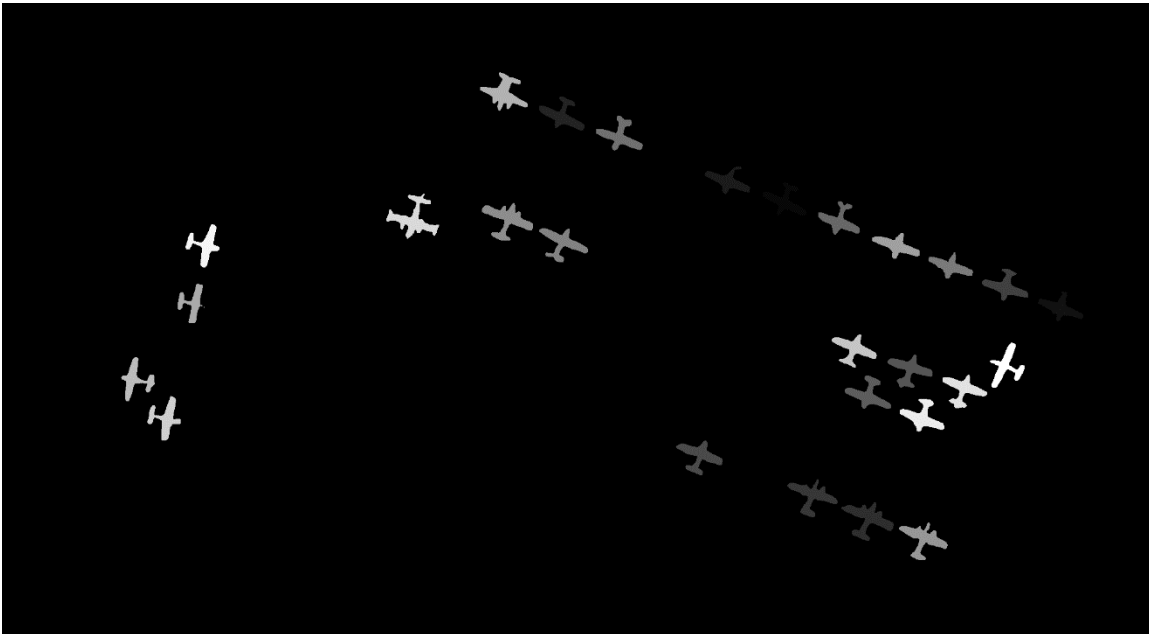
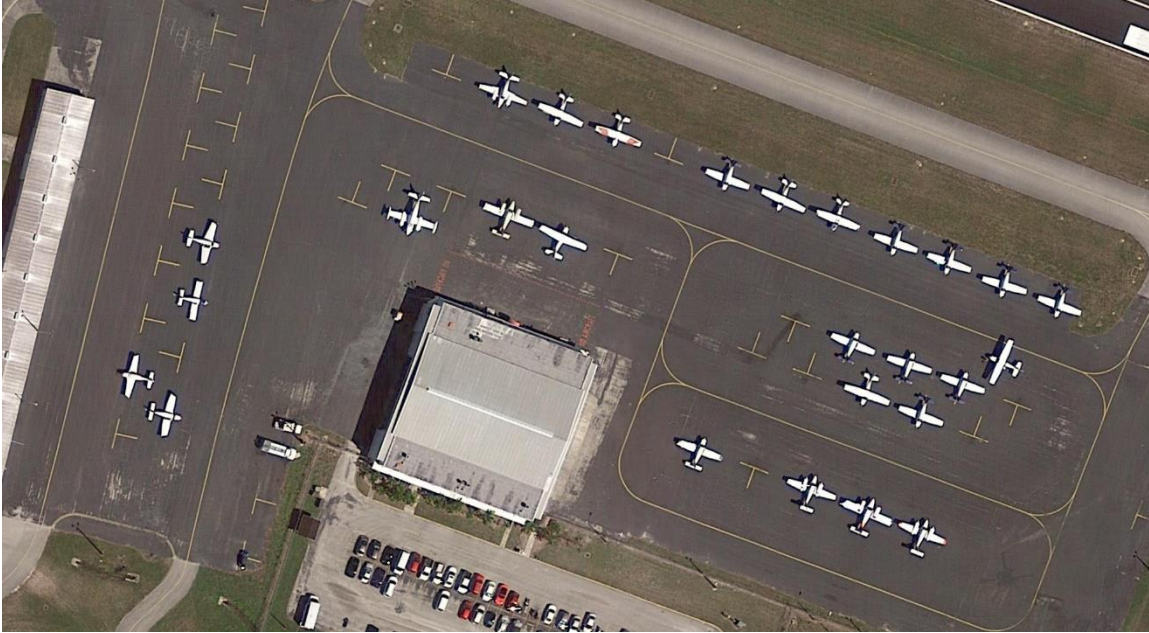
This figure shows a small airplane on a runway. To its right is a binary mask where the airplane is represented as a white shape on a black background.

Part 3

Kaggle ID: LargeHead Goose

Best score: 0.78351

1.



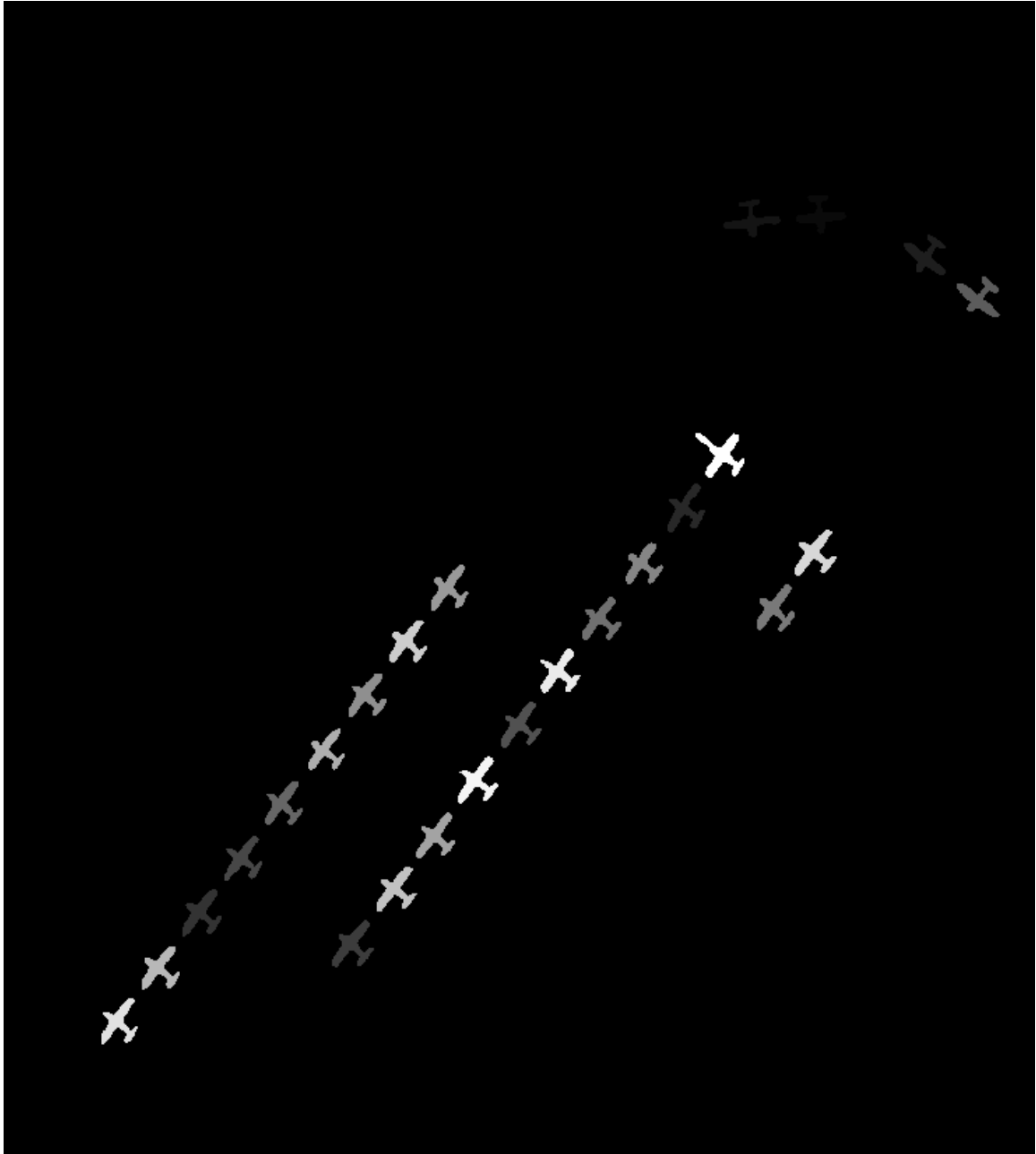
2.





3.





Part 4

Evaluation:

```
[11/02 22:50:31 d2.evaluation.coco_evaluation]: Evaluation results for bbox:
|  AP   | AP50 | AP75 | APs  | APm  | AP1  |
|:-----:|:-----:|:-----:|:-----:|:-----:|:-----:|
| 32.413 | 54.795 | 35.281 | 22.247 | 41.597 | 61.102 |
Loading and preparing results...
DONE (t=0.15s)
creating index...
index created!
Running per image evaluation...
Evaluate annotation type *segm*
COCOeval_opt.evaluate() finished in 1.15 seconds.
Accumulating evaluation results...
COCOeval_opt.accumulate() finished in 0.02 seconds.
Average Precision  (AP) @[ IoU=0.50:0.95 | area=   all | maxDets=100 ] = 0.099
Average Precision  (AP) @[ IoU=0.50      | area=   all | maxDets=100 ] = 0.333
Average Precision  (AP) @[ IoU=0.75      | area=   all | maxDets=100 ] = 0.022
Average Precision  (AP) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.053
Average Precision  (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.114
Average Precision  (AP) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.351
Average Recall     (AR) @[ IoU=0.50:0.95 | area=   all | maxDets=  1 ] = 0.008
Average Recall     (AR) @[ IoU=0.50:0.95 | area=   all | maxDets= 10 ] = 0.060
Average Recall     (AR) @[ IoU=0.50:0.95 | area=   all | maxDets=100 ] = 0.131
Average Recall     (AR) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = 0.069
Average Recall     (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = 0.159
Average Recall     (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.407
[11/02 22:50:32 d2.evaluation.coco_evaluation]: Evaluation results for segm:
|  AP   | AP50 | AP75 | APs  | APm  | AP1  |
|:-----:|:-----:|:-----:|:-----:|:-----:|:-----:|
| 9.918 | 33.327 | 2.176 | 5.337 | 11.391 | 35.120 |
OrderedDict([('bbox', {'AP': 32.41296940155823, 'AP50': 54.794504093292616, 'AP75':
```

Visualization





Difference from part 3

From the evaluation output, the AP50 of this model for the bounding box is 54.8, which has roughly the same accuracy for the bounding box as part 1 using the same configuration. However, in part 3, the mean IoU for semantic segmentation is 86, but this model only has AP50 at 33, which indicates that the result obtained is far less accurate than the result from part 3. Nevertheless, the advantage of using this model is that it saves time to train the net, and it also doesn't need images to be cached in memory which saves computing resources.