## **Object Detection Project**

mercoledì 1 febbraio 2023 10:16

- 1) In this project it was created a CNN to detect and classify objects using data from Waymo dataset and a SSD Resnet 50 640x640 model. At first some exploratory data analysis has been performed on the image batch (Exploratory Data Analysis notebook), then the model has been trained and evaluated
- 2) Proposed project structure ins't changed; I've tried different augmentation solution (as described in the following lines) using a new config file called "pipeline\_new\_augm.config"
- 3) After the train process I've generated tensorboard output:



- 4) Augmentation solutions:
  - a. Tried to random to RGB but total loss got worse data\_augmentation\_options {
     random\_rgb\_to\_gray {
     probability: 0.2
     }
     }

```
nstructions for updating:
se fn output signature instead
3203 88:36:24.087379 139812484196096 deprecation.py:506] From /data/virtual env
/sdc-cl-gpu-augment/lib/python3.7/site-packages/tensorflow/python/util/deprecat
on.py:574: calling map_fn_v2 (from tensorflow.python.ops.map_fn) with dtype is
sprecated and will be removed in a future version.
structions for updating:
se fn_output_signature instead
VFO:tensorflow:Step 100 per-step time 0.742s loss=34.557
3203 08:37:55.216678 139819689174848 model_lib_v2.py:682] Step 100 per-step tim
0.742s loss=34.557
VFO:tensorflow:Step 200 per-step time 0.735s loss=3458.960
1203 08:39:10.726550 139819689174848 model_lib_v2.py:682] Step 200 per-step tim
0.735s loss=3458.960
                       0.735s loss=3458.960
F0:tensorflow:Step 300 per-step time 0.767s loss=633283.250
P03 08:40:26.047991 139819689174848 model_lib_v2.py:682] Step 300 per-step tim
               0.203 08:40:26.047991 139919689174848 model_lib_v2.py:682] Step 300 per-step time 0.767s loss=633283.250 [NFO:tensorflow:Step 400 per-step time 0.751s loss=746740.875 [O.203 08:41:41.073862 139819689174848 model_lib_v2.py:682] Step 400 per-step time 0.751s loss=746740.875 [O.703 loss=746740.875 [O.705 loss=179844808704.000 [O.705 loss=746740.875 [O.705 loss=179844808704.000 [O.705 loss=207451766784.000 [O.705 loss=2074
c. Tried to adjust brightness but got worse
            data_augmentation_options {
                   random_adjust_brightness {
                    max_delta: 0.2
                 .
NFO:tensorflow:Step 100 per-step time 0.748s loss=108.949
9203 07:40:51.998161 139968419444544 model_lib_v2.py:682] Step 100 per-step tim
                0.748s loss=108.949
NFO:tensorflow:Step 200 per-step time 0.781s loss=25.424
0203 07:42:07.785071 139968419444544 model_lib_v2.py:682] Step 200 per-step tim
                0.781s loss=25.424
NFO:tensorflow:Step 300 per-step time 0.752s loss=24.902
0203 07:43:23.660087 139968419444544 model_lib_v2.py:682] Step 300 per-step tim
              0.7315 loss=49.430

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INFO:tensorflow:Step 1000 per-step time 0.734s loss=47.918

10203 07:52:11.211351 139968419444544 model_lib_v2.py:682] Step 1000 per-step time 0.734s loss=47.918

INFO:tensorflow:Step 1100 per-step time 0.758s loss=46.765

10203 07:53:27.430363 139968419444544 model_lib_v2.py:682] Step 1100 per-step time 0.758s loss=46.765
              le 0.758s loss=46.765
NFO:tensorflow:Step 1200 per-step time 0.750s loss=46.264
[0203 07:54:42.756016 139968419444544 model_lib_v2.py:682] Step 1200 per-step ti
le 0.750s loss=46.264
                e 0.730s 1<del>03s-40.204</del>
NFO:tensorflow:Step 1300 per-step time 0.739s loss=45.368
0203 07:55:57.838390 139968419444544 model_lib_v2.py:682] Step 1300 per-step ti
               e 0.7395 loss=45.368
NFO:tensorflow:Step 1400 per-step time 0.789s loss=44.358
0203 07:57:12.945989 139968419444544 model_lib_v2.py:682] Step 1400 per-step ti
e 0.789s loss=44.358
              0.769s l059-44.336

0.769:tensorflow:Step 1500 per-step time 0.761s loss=43.762

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0.761s loss=43.762

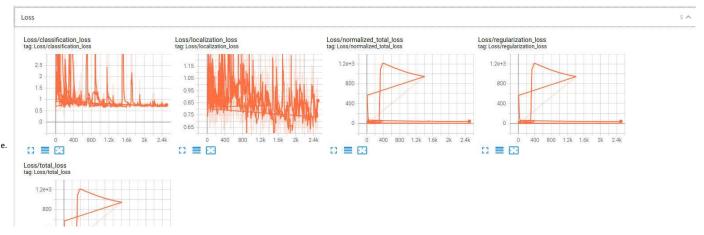
0.761s loss=43.762

0.761s loss=43.762

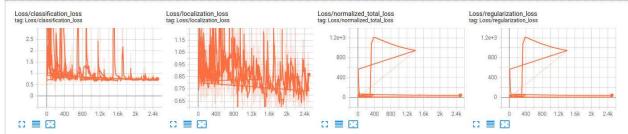
0.761s loss=43.83

0.761s loss=43.83

0.761s loss=43.83
```



Loss 5 A



Loss/total\_loss
tag:Loss/total\_loss

1.2e+3

400

0 400 800 1.2k 1.6k 2k 2.4k

f. Tried to adjust random saturation but got worse

```
data_augmentation_options {
  random_adjust_saturation {
  min_delta: 0.8
  max_delta: 1.2
  }
```

```
INFO:tensorflow:Step 200 per-step time 0.774s loss=10.574
10203 08:55:39.570151 140078879766336 model_lib_v2.py:682] Step 200 per-step time 0.774s loss=10.574
INFO:tensorflow:Step 300 per-step time 0.746s loss=10.971
10203 08:56:55.028082 140078879766336 model_lib_v2.py:682] Step 300 per-step time 0.746s loss=10.971
INFO:tensorflow:Step 400 per-step time 0.744s loss=9.812
10203 08:58:10.772804 140078879766336 model_lib_v2.py:682] Step 400 per-step time 0.744s loss=0.812
INFO:tensorflow:Step 500 per-step time 0.744s loss=10.438
10203 08:59:26.252357 140078879766336 model_lib_v2.py:682] Step 500 per-step time 0.744s loss=10.438
10203 08:59:26.252357 140078879766336 model_lib_v2.py:682] Step 500 per-step time 0.755s loss=9.585
10203 09:09:43.129761 140078879766336 model_lib_v2.py:682] Step 600 per-step time 0.755s loss=9.585
10203 09:09:43.129761 140078879766336 model_lib_v2.py:682] Step 600 per-step time 0.755s loss=9.585
10203 09:09:158.887022 140078879766336 model_lib_v2.py:682] Step 700 per-step time 0.743s loss=8.985
10203 09:09:33.14.490610 140078879766336 model_lib_v2.py:682] Step 800 per-step time 0.765s loss=8.812
10203 09:09:31.44.490610 140078879766336 model_lib_v2.py:682] Step 800 per-step time 0.765s loss=8.812
10703 09:09:33.176244 140078879766336 model_lib_v2.py:682] Step 900 per-step time 0.770s loss=8.459
10203 09:09:34.14.490610 140078879766336 model_lib_v2.py:682] Step 1000 per-step time 0.770s loss=8.311
1070:tensorflow:Step 1000 per-step time 0.770s loss=8.329
1070:tensorflow:Step 1000 per-step time 0.770s loss=8.329
1070:tensorflow:Step 1000 per-step time 0.770s loss=8.329
1070:09:09:34:74.71248 140078879766336 model_lib_v2.py:682] Step 1000 per-step time 0.797s loss=8.329
1070:09:09:34:74.701248 140078879766336 model_lib_v2.py:682] Step 1000 per-step time 0.787s loss=8.199
10703 09:09:34:701248 140078879766336 model_lib_v2.py:682] Step 1000 per-step time 0.788 loss=8.062
10703 09:10:50.214036 140078879766336 model_lib_v2.py:682] Step 1000 per-step time 0.7518 loss=8.062
10703 09:10:50.214036
```

h. Tried to adjust random contrast but got worse

```
data_augmentation_options {
    random_adjust_contrast {
    min_delta: 0.8
    max_delta: 1.25
    }
}
```

```
Use fn output signature instead
INFO:tensorflow:Step 100 per-step time 0.758s loss=6.793
IO203 09:29:08.051635 140710147364672 model_lib_v2.py:682] Step 100 per-step tim
e 0.758s loss=6.793
INFO:tensorflow:Step 200 per-step time 0.783s loss=7.361
IO203 09:33:24.149159 140710147364672 model_lib_v2.py:682] Step 200 per-step tim
e 0.783s loss=7.361
INFO:tensorflow:Step 300 per-step time 0.791s loss=890.721
IO203 09:31:40.224653 140710147364672 model_lib_v2.py:682] Step 300 per-step tim
e 0.791s loss=890.721
INFO:tensorflow:Step 400 per-step time 0.759s loss=45585.809
IO203 09:32:55.861202 140710147364672 model_lib_v2.py:682] Step 400 per-step tim
e 0.759s loss=45585.809
INFO:tensorflow:Step 500 per-step time 0.744s loss=122399936.000
IO203 09:34:11.263839 140710147364672 model_lib_v2.py:682] Step 500 per-step tim
e 0.744s loss=122399936.000
INFO:tensorflow:Step 600 per-step time 0.779s loss=143126608.000
INFO:tensorflow:Step 600 per-step time 0.779s loss=143126608.000
INFO:tensorflow:Step 600 per-step time 0.779s loss=14312608.000
INFO:tensorflow:Step 700 per-step time 0.738s loss=139004176.000
```

5) Summary: since tensorboard was showing "disturbed behavior" at early steps in the graphics (please, see picture below; for all the different trainings, even if checkpoint were erased), making it useless for the evaluation, I've based the analysis on the loss showed in the terminal; all the augmentations added to training dataset didn't decrease the loss (as shown in the screenshoots), on the contrary; so the final version of the model doesn't include further augmentation except for the ones already present (random crop and random horizontal flip). Unfortunately I wasn't able to create the video due to lack of space on the disk (many tfevents files that shouldn't be erased, as per instructions "You should however keep the tf.events files located in the train and eval folder of your experiments"). Evaluation Juptyter notebooks continuos crashes prevented to perform visual evaluation of the augmented images.

