



Road Sign Detection

(Object Detection)

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Introduction



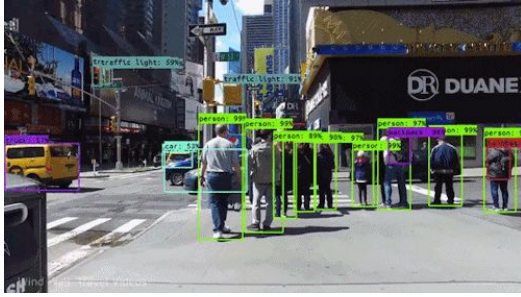
Object Detection : Road Signs Detection

Underlying :

- **Single Shot Multiple Detector (SSMD)**
- **TensorFlow Object Detection API**

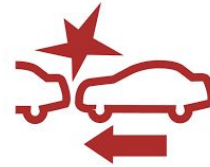
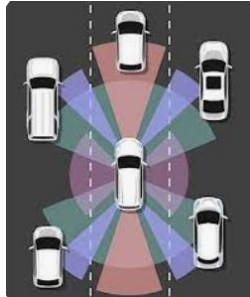


Background & Motivation



Motivation :

- **Advanced Peripherals** : high resolution cameras, sensors
- **Autonomous Driving**
- **Enhance Safety**



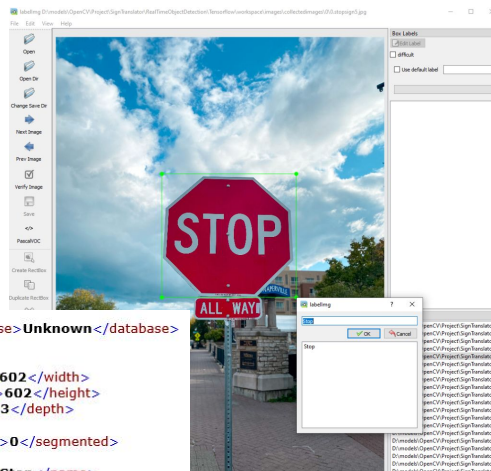
Data Collection and Annotation

Collect Images



collectedimages

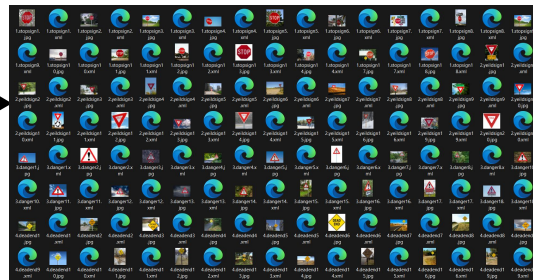
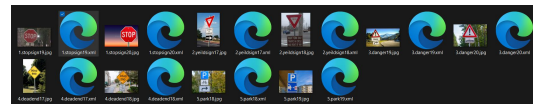
Labeling



```
- <source>  
  <database>Unknown</database>  
</source>  
- <size>  
  <width>602</width>  
  <height>602</height>  
  <depth>3</depth>  
</size>  
- <segmented>0</segmented>  
- <object>  
  <name>Stop</name>  
  <pose>Unspecified</pose>  
  <truncated>0</truncated>  
  <difficult>0</difficult>  
  <bndbox>  
    <xmin>94</xmin>  
    <ymin>101</ymin>  
    <xmax>490</xmax>  
    <ymax>501</ymax>  
  </bndbox>  
</object>  
</annotation>
```

```
{1: {'id': 1, 'name': 'Stop'},  
 2: {'id': 2, 'name': 'Yield'},  
 3: {'id': 3, 'name': 'Danger'},  
 4: {'id': 4, 'name': 'Deadend'},  
 5: {'id': 5, 'name': 'Parking'}}
```

Train/Test Split 18 for training, 2 for testing



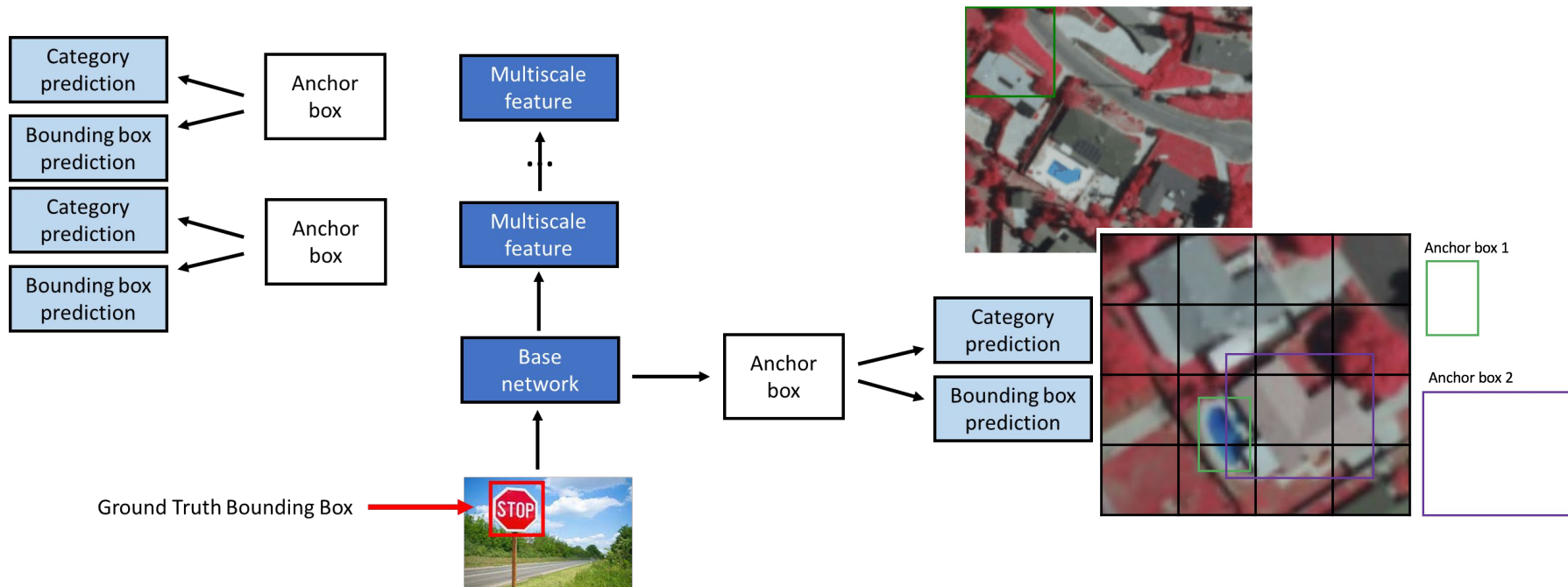
test



train

Model - Single Shot Multibox Detector (SSD) model

- SSD use multiscale features and default boxes



Model Training

- Momentum optimizer to minimize the loss function.
 - Learning_rate_base: 0.079999
 - Total step: 10000
 - Warmup_learning_rate: 0.026666
 - Warmup_step: 1000
 - Momentum_optimizer_value: 0.89999

```
INFO:tensorflow:Step 10000 per-step time 0.119s
I0408 14:27:03.899535 17736 model_lib_v2.py:700] Step 10000 per-step time 0.119s
INFO:tensorflow:{'Loss/classification_loss': 0.036346905,
'Loss/localization_loss': 0.0067884824,
'Loss/regularization_loss': 0.10248132,
'Loss/total_loss': 0.14561671,
'learning_rate': 0.07352352}
```


Model Evaluation

- $\text{IoU} = \text{Area of Overlap} / \text{Area of Union}$
- Threshold: 0.5 IoU
- Average Precision: 0.89
- Average Recall: 0.90



```
Average Precision (AP) @[ IoU=0.50:0.95 | area= all | maxDets=100 ] = 0.890
Average Precision (AP) @[ IoU=0.50 | area= all | maxDets=100 ] = 1.000
Average Precision (AP) @[ IoU=0.75 | area= all | maxDets=100 ] = 1.000
Average Precision (AP) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = -1.000
Average Precision (AP) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = -1.000
Average Precision (AP) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.890
Average Recall (AR) @[ IoU=0.50:0.95 | area= all | maxDets= 1 ] = 0.900
Average Recall (AR) @[ IoU=0.50:0.95 | area= all | maxDets= 10 ] = 0.900
Average Recall (AR) @[ IoU=0.50:0.95 | area= all | maxDets=100 ] = 0.900
Average Recall (AR) @[ IoU=0.50:0.95 | area= small | maxDets=100 ] = -1.000
Average Recall (AR) @[ IoU=0.50:0.95 | area=medium | maxDets=100 ] = -1.000
Average Recall (AR) @[ IoU=0.50:0.95 | area= large | maxDets=100 ] = 0.900
INFO:tensorflow:Eval metrics at step 10000
```

Testing on Unseen Data (still images)

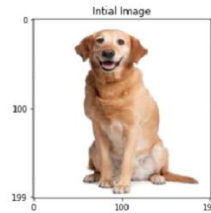


Testing in Real Time (Live)

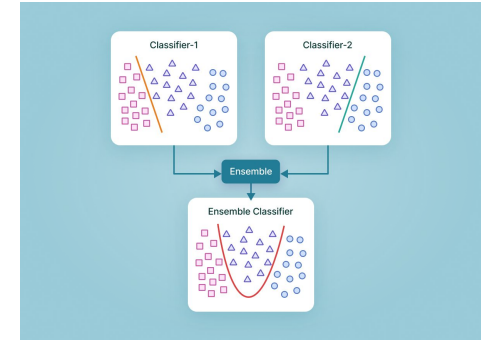
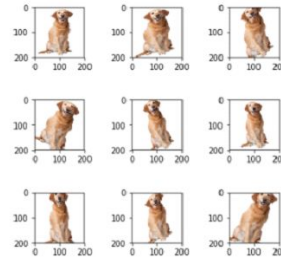


Future Plan

- Increase Train and Testing Image size (currently we have 18 for training, 2 for testing)
- Try Image Augmentation (since we have limited data and can avoid overfitting)
- Try Ensembling (combine 2 or more learning algorithms to obtain better predictions)



Augmented images



Thanks