Install Dependencies

(Remember to choose GPU in Runtime if not already selected. Runtime --> Change Runtime Type --> Hardware accelerator --> GPU)

```
# clone YOLOv5 repository
!git clone https://github.com/ultralytics/yolov5 # clone repo
%cd yolov5
     Cloning into 'yolov5'...
     remote: Enumerating objects: 16575, done.
     remote: Counting objects: 100% (53/53), done.
     remote: Compressing objects: 100% (35/35), done.
     remote: Total 16575 (delta 28), reused 37 (delta 18), pack-reused 16522
     Receiving objects: 100% (16575/16575), 15.03 MiB | 25.96 MiB/s, done.
     Resolving deltas: 100% (11387/11387), done.
     /content/yolov5
# install dependencies as necessary
!pip install -qr requirements.txt # install dependencies (ignore errors)
import torch
from IPython.display import Image, clear_output # to display images
from utils.downloads import attempt_download # to download models/datasets
# clear_output()
print('Setup complete. Using torch %s %s' % (torch.__version__, torch.cuda.get_device_properties(0) if torch.cuda.is_available() else 'CPU')
                                                  - 207.3/207.3 kB 2.1 MB/s eta 0:00:00
                                                  - 4.5/4.5 MB 23.9 MB/s eta 0:00:00
                                                  - 755.2/755.2 kB <mark>50.6 MB/s</mark> eta 0:00:00
                                                  - 62.7/62.7 kB 7.7 MB/s eta 0:00:00
     ERROR: pip's dependency resolver does not currently take into account all the packages that are installed. This behaviour is the source
     imageio 2.31.6 requires pillow<10.1.0,>=8.3.2, but you have pillow 10.3.0 which is incompatible.
     Setup complete. Using torch 2.2.1+cu121 _CudaDeviceProperties(name='Tesla T4', major=7, minor=5, total_memory=15102MB, multi_processor_c
```

Step 6: Download a Dataset

Add your Roboflow API key below to download the default money counting dataset. Alternatively, use the code provided by the Roboflow dashboard in the above step to load a custom dataset.

```
!pip install -q roboflow
                                                   74.6/74.6 kB 1.2 MB/s eta 0:00:00
                                                  158.3/158.3 kB 3.8 MB/s eta 0:00:00
                                                  - 178.7/178.7 kB 12.8 MB/s eta 0:00:00
                                                   58.8/58.8 kB 6.7 MB/s eta 0:00:00
                                                  - 49.1/49.1 MB 13.1 MB/s eta 0:00:00
                                                  - 54.5/54.5 kB 6.5 MB/s eta 0:00:00
!pip install roboflow
from roboflow import Roboflow
rf = Roboflow(api key="nzRKDl9IvGTHb70vn9f4")
project = rf.workspace("logic-gate-dlan3").project("logic-gates-2")
version = project.version(1)
dataset = version.download("volov5")
     Requirement already satisfied: roboflow in /usr/local/lib/python3.10/dist-packages (1.1.28)
     Requirement already satisfied: certifi==2023.7.22 in /usr/local/lib/python3.10/dist-packages (from roboflow) (2023.7.22)
     Requirement already satisfied: chardet==4.0.0 in /usr/local/lib/python3.10/dist-packages (from roboflow) (4.0.0)
     Requirement already satisfied: cycler==0.10.0 in /usr/local/lib/python3.10/dist-packages (from roboflow) (0.10.0)
     Requirement already satisfied: idna==2.10 in /usr/local/lib/python3.10/dist-packages (from roboflow) (2.10)
     Requirement already satisfied: kiwisolver>=1.3.1 in /usr/local/lib/python3.10/dist-packages (from roboflow) (1.4.5)
     Requirement already satisfied: matplotlib in /usr/local/lib/python3.10/dist-packages (from roboflow) (3.7.1)
     Requirement already satisfied: numpy>=1.18.5 in /usr/local/lib/python3.10/dist-packages (from roboflow) (1.25.2)
     Requirement already satisfied: opencv-python-headless==4.8.0.74 in /usr/local/lib/python3.10/dist-packages (from roboflow) (4.8.0.74)
     Requirement already satisfied: Pillow>=7.1.2 in /usr/local/lib/python3.10/dist-packages (from roboflow) (10.3.0)
     Requirement already satisfied: python-dateutil in /usr/local/lib/python3.10/dist-packages (from roboflow) (2.8.2)
     Requirement already satisfied: python-dotenv in /usr/local/lib/python3.10/dist-packages (from roboflow) (1.0.1)
     Requirement already satisfied: requests in /usr/local/lib/python3.10/dist-packages (from roboflow) (2.31.0)
```

```
Requirement already satisfied: six in /usr/local/lib/python3.10/dist-packages (from roboflow) (1.16.0)
     Requirement already satisfied: urllib3>=1.26.6 in /usr/local/lib/python3.10/dist-packages (from roboflow) (2.0.7)
     Requirement already satisfied: tqdm>=4.41.0 in /usr/local/lib/python3.10/dist-packages (from roboflow) (4.66.2)
     Requirement already satisfied: PyYAML>=5.3.1 in /usr/local/lib/python3.10/dist-packages (from roboflow) (6.0.1)
     Requirement already satisfied: requests-toolbelt in /usr/local/lib/python3.10/dist-packages (from roboflow) (1.0.0)
     Requirement already satisfied: python-magic in /usr/local/lib/python3.10/dist-packages (from roboflow) (0.4.27)
     Requirement already satisfied: contourpy>=1.0.1 in /usr/local/lib/python3.10/dist-packages (from matplotlib->roboflow) (1.2.1)
     Requirement already satisfied: fonttools>=4.22.0 in /usr/local/lib/python3.10/dist-packages (from matplotlib->roboflow) (4.51.0)
     Requirement already satisfied: packaging>=20.0 in /usr/local/lib/python3.10/dist-packages (from matplotlib->roboflow) (24.0)
     Requirement already satisfied: pyparsing>=2.3.1 in /usr/local/lib/python3.10/dist-packages (from matplotlib->roboflow) (3.1.2)
     Requirement already satisfied: charset-normalizer<4,>=2 in /usr/local/lib/python3.10/dist-packages (from requests->roboflow) (3.3.2)
     loading Roboflow workspace...
     loading Roboflow project...
     Downloading Dataset Version Zip in logic-gates-2-1 to yolov5pytorch:: 100% 29932/29932 [00:00<00:00, 67456.50it/s]
     Extracting Dataset Version Zip to logic-gates-2-1 in yolov5pytorch:: 100% 2436/2436 [00:00<00:00, 8782.34it/s]
%pwd
     '/content/yolov5'
dataset.location
     "/content/yolov5/logic-gates-2-1"
%cd /content/yolov5
     /content/yolov5
dataset.location
     '/content/yolov5/logic-gates-2-1'
# this is the YAML file Roboflow wrote for us that we're loading into this notebook with our data
%cat {dataset.location}/data.yaml
     names:
     - '0'
     - '1'
     - '2'
     - '3'
     - '4'
     - '5'
     - '6'
     nc: 7
     roboflow:
      license: CC BY 4.0
       project: logic-gates-2
       url: https://universe.roboflow.com/logic-gate-dlan3/logic-gates-2/dataset/1
       version: 1
      workspace: logic-gate-dlan3
     test: ../test/images
     train: logic-gates-2-1/train/images
     val: logic-gates-2-1/valid/images
```

Define Model Configuration and Architecture

We will write a yaml script that defines the parameters for our model like the number of classes, anchors, and each layer.

You do not need to edit these cells, but you may.

```
# define number of classes based on YAML
import yaml
with open(dataset.location + "/data.yaml", 'r') as stream:
    num_classes = str(yaml.safe_load(stream)['nc'])

num_classes
    '7'

#this is the model configuration we will use for our tutorial
%cat /content/yolov5/models/yolov5s.yaml
```

```
# YOLOv5 Ø by Ultralytics, AGPL-3.0 license
     # Parameters
     nc: 80 # number of classes
     depth_multiple: 0.33 # model depth multiple
     width_multiple: 0.50 # layer channel multiple
     anchors:
       - [10, 13, 16, 30, 33, 23] # P3/8
       - [30, 61, 62, 45, 59, 119] # P4/16
       - [116, 90, 156, 198, 373, 326] # P5/32
     # YOLOv5 v6.0 backbone
     backbone:
       # [from, number, module, args]
         [-1, 1, Conv, [64, 6, 2, 2]], # 0-P1/2
         [-1, 1, Conv, [128, 3, 2]], # 1-P2/4
[-1, 3, C3, [128]],
         [-1, 1, Conv, [256, 3, 2]], # 3-P3/8
         [-1, 6, C3, [256]],
         [-1, 1, Conv, [512, 3, 2]], # 5-P4/16
         [-1, 9, C3, [512]],
         [-1, 1, Conv, [1024, 3, 2]], # 7-P5/32
         [-1, 3, C3, [1024]],
         [-1, 1, SPPF, [1024, 5]], # 9
     # YOLOv5 v6.0 head
     head: [
         [-1, 1, Conv, [512, 1, 1]],
         [-1, 1, nn.Upsample, [None, 2, "nearest"]],
         [[-1, 6], 1, Concat, [1]], # cat backbone P4
         [-1, 3, C3, [512, False]], # 13
         [-1, 1, Conv, [256, 1, 1]],
         [-1, 1, nn.Upsample, [None, 2, "nearest"]],
         [[-1, 4], 1, Concat, [1]], # cat backbone P3
         [-1, 3, C3, [256, False]], # 17 (P3/8-small)
         [-1, 1, Conv, [256, 3, 2]],
         [[-1, 14], 1, Concat, [1]], # cat head P4
         [-1, 3, C3, [512, False]], # 20 (P4/16-medium)
         [-1, 1, Conv, [512, 3, 2]],
         [[-1, 10], 1, Concat, [1]], # cat head P5
         [-1, 3, C3, [1024, False]], # 23 (P5/32-large)
         [[17, 20, 23], 1, Detect, [nc, anchors]], # Detect(P3, P4, P5)
#customize iPython writefile so we can write variables
from IPython.core.magic import register_line_cell_magic
@register_line_cell_magic
def writetemplate(line, cell):
    with open(line, 'w') as f:
        f.write(cell.format(**globals()))
```

%%writetemplate /content/yolov5/models/custom_yolov5s.yaml

```
# parameters
nc: {num_classes} # number of classes
depth_multiple: 0.33 # model depth multiple
width_multiple: 0.50 # layer channel multiple
# anchors
anchors:
  - [10,13, 16,30, 33,23] # P3/8
  - [30,61, 62,45, 59,119] # P4/16
  - [116,90, 156,198, 373,326] # P5/32
# YOLOv5 backbone
backbone:
  # [from, number, module, args]
  [[-1, 1, Focus, [64, 3]], # 0-P1/2
   [-1, 1, Conv, [128, 3, 2]], # 1-P2/4
   [-1, 3, BottleneckCSP, [128]],
   [-1, 1, Conv, [256, 3, 2]], # 3-P3/8
   [-1, 9, BottleneckCSP, [256]],
   [-1, 1, Conv, [512, 3, 2]], # 5-P4/16
   [-1, 9, BottleneckCSP, [512]],
  [-1, 1, Conv, [1024, 3, 2]], # 7-P5/32
  [-1, 1, SPP, [1024, [5, 9, 13]]],
   [-1, 3, BottleneckCSP, [1024, False]], # 9
# YOLOv5 head
head:
  [[-1, 1, Conv, [512, 1, 1]],
   [-1, 1, nn.Upsample, [None, 2, 'nearest']],
   [[-1, 6], 1, Concat, [1]], # cat backbone P4
   [-1, 3, BottleneckCSP, [512, False]], # 13
   [-1, 1, Conv, [256, 1, 1]],
   [-1, 1, nn.Upsample, [None, 2, 'nearest']],
   [[-1, 4], 1, Concat, [1]], # cat backbone P3
   [-1, 3, BottleneckCSP, [256, False]], # 17 (P3/8-small)
   [-1, 1, Conv, [256, 3, 2]],
   [[-1, 14], 1, Concat, [1]], # cat head P4
   [-1, 3, BottleneckCSP, [512, False]], # 20 (P4/16-medium)
   [-1, 1, Conv, [512, 3, 2]],
   [[-1, 10], 1, Concat, [1]], # cat head P5
   [-1, 3, BottleneckCSP, [1024, False]], # 23 (P5/32-large)
   [[17, 20, 23], 1, Detect, [nc, anchors]], # Detect(P3, P4, P5)
```

Train Custom YOLOv5 Detector

Next, we'll fire off training!

Here, we are able to pass a number of arguments:

- · img: define input image size
- batch: determine batch size
- epochs: define the number of training epochs. (Note: often, 3000+ are common here!)
- data: set the path to our yaml file
- cfg: specify our model configuration
- weights: specify a custom path to weights. (Note: you can download weights from the Ultralytics Google Drive folder)
- name: result names
- · nosave: only save the final checkpoint
- cache: cache images for faster training

time its performance

train yolov5s on custom data for 200 epochs

```
%%time
%cd /content/yolov5/
!python train.py --img 416 --batch 16 --epochs 50 --data {dataset.location}/data.yaml --cfg ./models/custom_yolov5s.yaml --weights 'yolov5s.
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:04<00:00, 1.64it/s]
                       Class
                                 Images
                                         Instances
                                                             Р
                                                                        R
                         a11
                                    243
                                              1082
                                                         0.676
                                                                     0.71
                                                                                0.654
                                                                                           0.471
                    GPU mem
                                          obi loss
                                                      cls loss Instances
           Epoch
                               box loss
                                                                                 Size
                                                                                  416: 100% 53/53 [00:09<00:00, 5.36it/s]
           43/49
                       1.98G
                                0.02622
                                           0.02856
                                                       0.02513
                                                                      126
                                         Instances
                                                             Р
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:04<00:00, 1.81it/s]
                       Class
                                 Images
                                                                        R
                        all
                                    243
                                              1082
                                                         0.709
                                                                    0.673
                                                                                 0.67
                                                                                           0.483
           Epoch
                    GPU\_mem
                               box_loss
                                          obj_loss
                                                      cls_loss Instances
                                                                                 Size
           44/49
                       1.98G
                                 0.0262
                                           0.02771
                                                       0.02472
                                                                      105
                                                                                  416: 100% 53/53 [00:10<00:00, 4.86it/s]
                                                            Р
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:05<00:00, 1.49it/s]
                       Class
                                                                        R
                                 Images
                                         Instances
                         a11
                                    243
                                              1082
                                                         0.714
                                                                    0.646
                                                                                0.674
                                                                                           0.483
           Epoch
                    GPU_mem
                               box_loss
                                          obj_loss
                                                      cls_loss Instances
                                                                                 Size
                                                                                 416: 100% 53/53 [00:10<00:00, 5.23it/s]
           45/49
                      1.986
                                0.02608
                                           0.02818
                                                       0.02457
                                                                      120
                       Class
                                 Images
                                         Instances
                                                             Р
                                                                        R
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:05<00:00, 1.59it/s]
                                              1082
                                                         0.707
                                                                    0.695
                                                                                 0.66
           Epoch
                    GPU_mem
                               box_loss
                                          obj_loss
                                                      cls_loss
                                                                Instances
                                                                                 Size
           46/49
                      1.98G
                                0.02543
                                            0.0284
                                                       0.02396
                                                                                  416: 100% 53/53 [00:09<00:00, 5.63it/s]
                                                                      122
                                                             Р
                                                                                mAP50
                       Class
                                                                        R
                                                                                        mAP50-95: 100% 8/8 [00:05<00:00, 1.60it/s]
                                 Images
                                         Instances
                                                                    0.705
                         all
                                    243
                                              1082
                                                         0.729
                                                                                9.672
                                                                                           0.478
           Epoch
                    GPU_mem
                               box loss
                                          obj loss
                                                      cls loss
                                                                Instances
                                                                                 Size
                                                                                 416: 100% 53/53 [00:09<00:00, 5.66it/s]
           47/49
                      1.98G
                                0.02546
                                           0.02842
                                                       0.02315
                                                                      114
                       Class
                                         Instances
                                                             Р
                                                                        R
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:04<00:00, 1.62it/s]
                                 Images
                         a11
                                    243
                                              1082
                                                         0.711
                                                                     0.69
                                                                                0.672
                                                                                           0.488
           Epoch
                    GPU_mem
                               box_loss
                                          obj_loss
                                                      cls_loss Instances
                                                                                 Size
           48/49
                       1.98G
                                0.02586
                                           0.02739
                                                       0.02456
                                                                                       100% 53/53 [00:10<00:00, 5.29it/s]
                                                                       90
                                                                                  416:
                      Class
                                         Instances
                                                                        R
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:04<00:00, 1.90it/s]
                                 Images
                        a11
                                    243
                                              1082
                                                         0.742
                                                                    0.694
                                                                                0.673
                                                                                           0.491
                                          obj_loss
           Epoch
                    GPU mem
                               box loss
                                                      cls loss Instances
                                                                                 Size
           49/49
                      1.98G
                                0.02524
                                            0.0282
                                                       0.02347
                                                                       91
                                                                                 416: 100% 53/53 [00:10<00:00, 5.26it/s]
                       Class
                                 Images
                                         Instances
                                                             Р
                                                                        R
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:04<00:00, 1.76it/s]
                                                                                           0.491
                                    243
                                              1082
                                                         0.713
                                                                    0.706
                                                                                0.674
                         all
     50 epochs completed in 0.216 hours.
     Optimizer stripped from runs/train/yolov5s_results/weights/last.pt, 14.8MB
     Optimizer stripped from runs/train/yolov5s_results/weights/best.pt, 14.8MB
     Validating runs/train/yolov5s_results/weights/best.pt...
     custom_YOLOv5s summary: 182 layers, 7262700 parameters, 0 gradients
                       Class
                                 Images Instances
                                                             Ρ
                                                                                mAP50
                                                                                        mAP50-95: 100% 8/8 [00:09<00:00, 1.15s/it]
                                    243
                                                                                           0.491
                        all
                                              1082
                                                         0.742
                                                                    0.694
                                                                                0.673
                          0
                                    243
                                               334
                                                         0.897
                                                                    0.961
                                                                                0.955
                                                                                           0.701
                                                                    0.975
                          1
                                    243
                                               163
                                                         0.748
                                                                                0.952
                                                                                            0.73
                          2
                                    243
                                               117
                                                         0.831
                                                                    0.545
                                                                                0.785
                                                                                           0.584
                          3
                                    243
                                               180
                                                         0.914
                                                                    0.961
                                                                                0.974
                                                                                           0.663
                          4
                                    243
                                               166
                                                         0.535
                                                                    0.819
                                                                                0.634
                                                                                           0.466
                          5
                                    243
                                                18
                                                             1
                                                                        a
                                                                                0.115
                                                                                          0.0824
                                    243
                                                104
                                                          0.27
                                                                    0.596
                                                                                0.293
                                                                                           0.212
     Results saved to runs/train/yolov5s_results
     CPU times: user 9.83 s, sys: 1.18 s, total: 11 s
     Wall time: 13min 46s
```

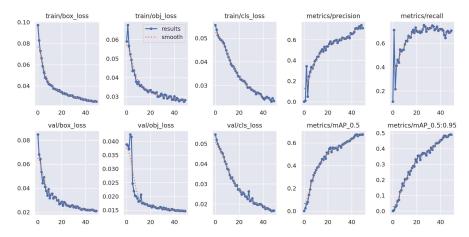
Evaluate Custom YOLOv5 Detector Performance

You can view the training graphs associated with a training job in the content/yolov5s_results/results.png folder.

Training losses and performance metrics are also saved to Tensorboard and also to a logfile defined above with the **--name** flag when we train. In our case, we named this yolov5s_results.

Note from Glenn: Partially completed results.txt files can be plotted with from utils.utils import plot_results; plot_results().

```
from utils.plots import plot_results # plot results.txt as results.png
Image(filename='/content/yolov5/runs/train/yolov5s_results/results.png', width=1000) # view results.png
```

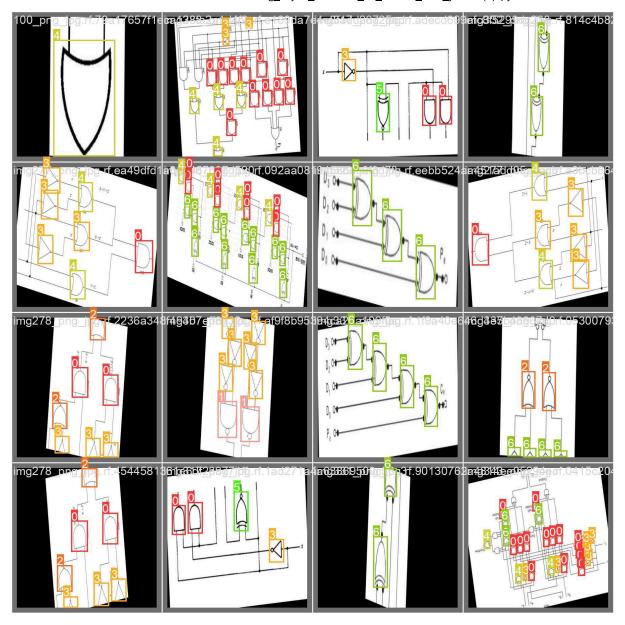


Curious? Visualize Our Training Data with Labels

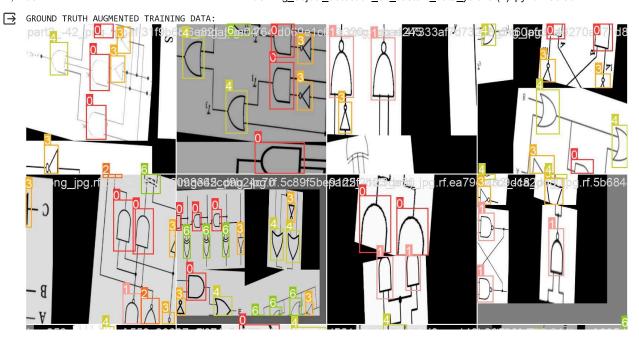
After training starts, view train*.jpg images to see training images, labels and augmentation effects.

Note a mosaic dataloader is used for training (shown below), a new dataloading concept developed by Glenn Jocher and first featured in <u>YOLOv4</u>.

 $Image (filename='/content/yolov5/runs/train/yolov5s_results/val_batch0_labels.jpg', width=900)$



print out an augmented training example
print("GROUND TRUTH AUGMENTED TRAINING DATA:")
Image(filename='/content/yolov5/runs/train/yolov5s_results/train_batch0.jpg', width=900)



Run Inference With Trained Weights

Next, we can run inference with a pretrained checkpoint on all images in the test/images folder to understand how our model performs on our test set.

