



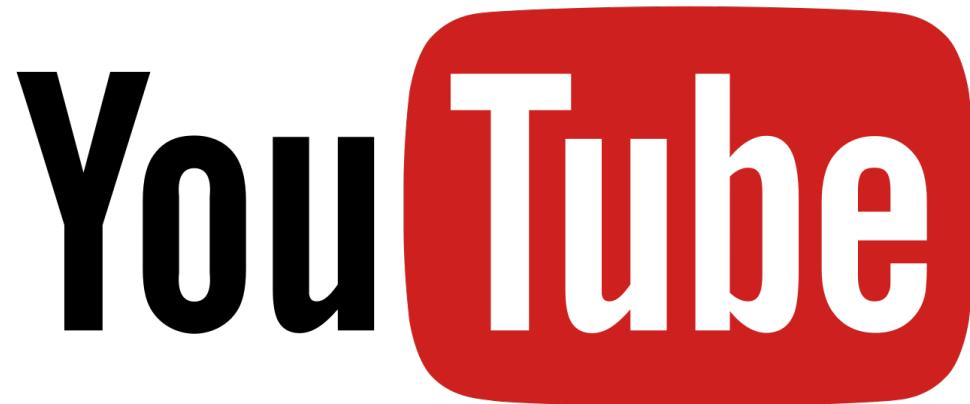
Workshop 8– Advanced Deep Learning

Advanced Analytics and Applications [AAA]

Calculation

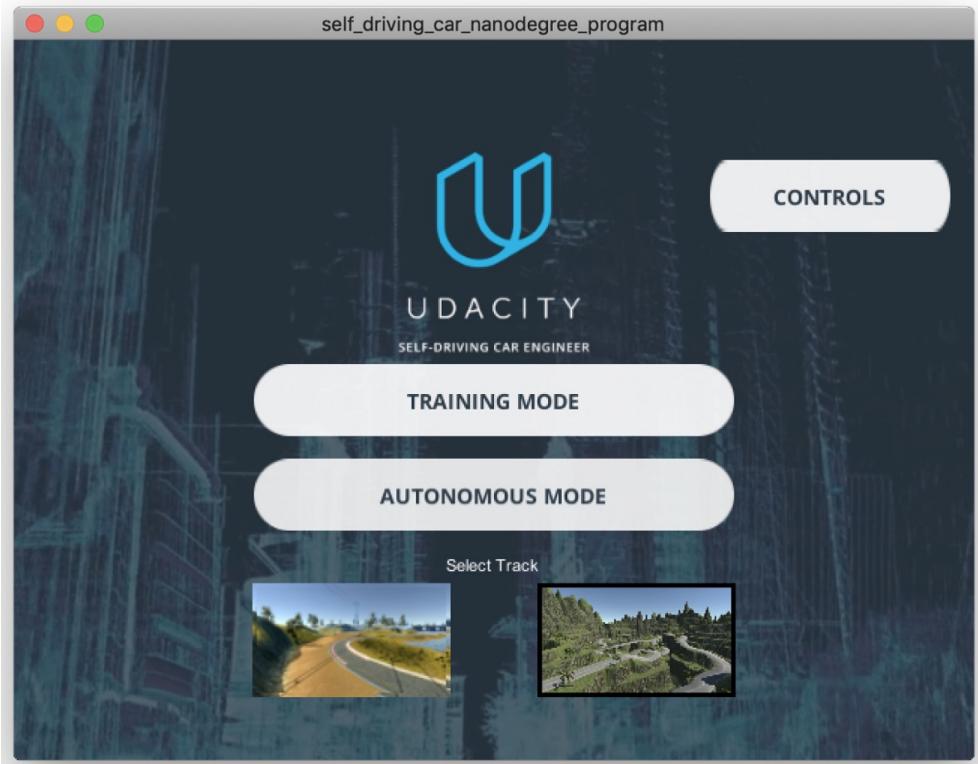
Programming

Today's objective: We want to train a deep learning model to drive a car in a simulated environment



<https://www.youtube.com/watch?v=xtbwPz7Api8>

Step 1: Udacity Simulation Environment



Download Simulator

<https://github.com/udacity/self-driving-car-sim>

Step 2: Install TensorFlow, Keras, and relevant libraries

Create a dedicated virtual environment, if necessary



```
pip install flask=0.11  
pip install python-engineio==2.0.0  
pip install python-socketio==1.8.0
```

```
pip install eventlet  
pip install numpy
```

....

Step 3: Create a CoLab Account

To speed up training, we use CoLab



<https://colab.research.google.com>

Step 4: Generating Data



Start Simulator



Run Training Mode



Start Recording (Folder /data)

Step 5: Analyze Generated Data



Left, Center and Right Camera Images Respectively from the Simulator Vehicle on Track 1

center	left	right	steering angle
/Users/demir	/Users/demir	/Users/demir	0
/Users/demir	/Users/demir	/Users/demir	0
/Users/demir	/Users/demir	/Users/demir	-0.3471122
/Users/demir	/Users/demir	/Users/demir	-0.7194571

Normalized between -1 and 1

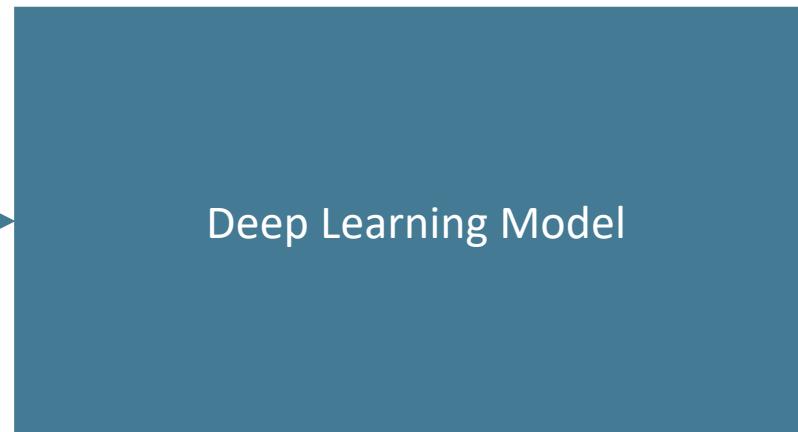
driving_log.csv

Assumption: Velocity is not important for us.

Step 6: Designing a DL Architecture



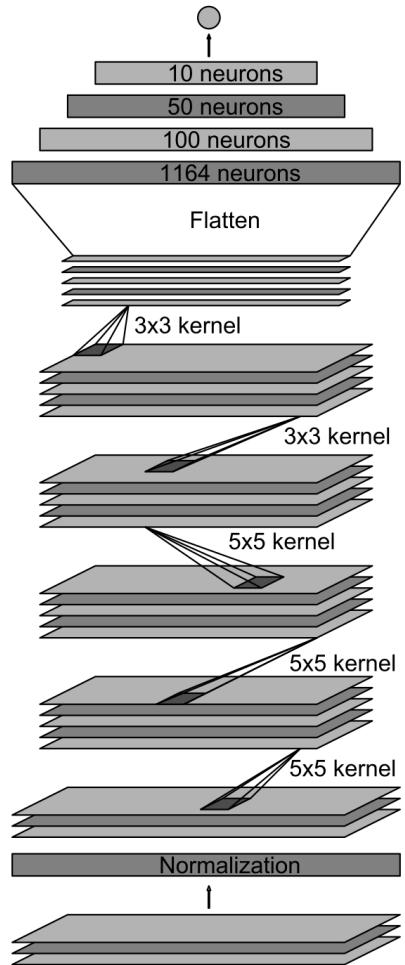
Input: 160px x 320px x 3 color channels



Deep Learning Model

Value between -1 and 1 (steering angle)

Step 6b: Potential Architecture



Activation Function: ELU (Exponential Linear Unit)

Stride: Typically (2,2)

Optimizer: Adam

Epochs: 5

Save File as: model.h5

Based on:

<https://arxiv.org/pdf/1604.07316v1.pdf>

Step 7: Write A Generator to Read the Data

```
samples = []
with open('data/driving_log.csv') as csvfile:
    reader = csv.reader(csvfile)
    next(reader, None)
    for line in reader:
        samples.append(line)
```

```
def generator(samples, batch_size=32):
    num_samples = len(samples)
    while 1: # Loop forever so the generator never terminates
        shuffle(samples)
        for offset in range(0, num_samples, batch_size):
            batch_samples = samples[offset:offset+batch_size]

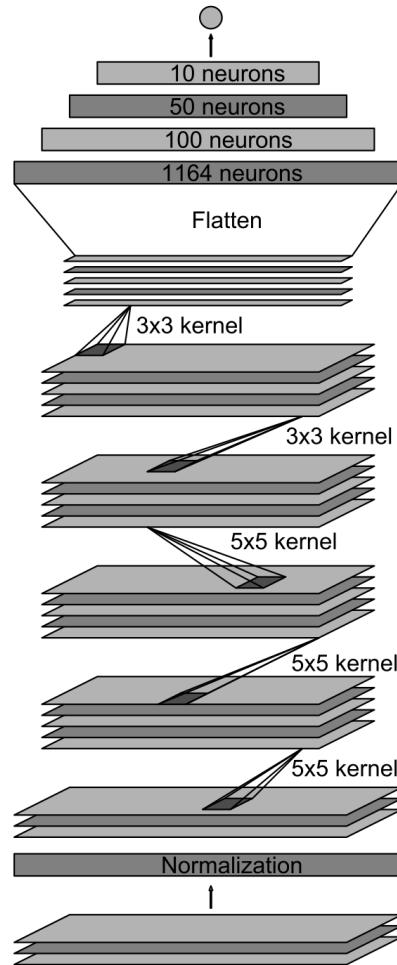
            images = []
            angles = []
            for batch_sample in batch_samples:
                for i in range(3): # center, left and right images
                    name = 'data/IMG/' + batch_sample[i].split('/')[-1]
                    current_image = cv2.cvtColor(cv2.imread(name), cv2.COLOR_BGR2RGB)
                    images.append(current_image)

                    center_angle = float(batch_sample[3])
                    if i == 0:
                        angles.append(center_angle)
                    elif i == 1:
                        angles.append(center_angle + 0.4) # Perspective Transformation for Left Image
                    elif i == 2:
                        angles.append(center_angle - 0.4) # Perspective Transformation for Right Image

            X_train = np.array(images)
            y_train = np.array(angles)
            yield tuple(sklearn.utils.shuffle(X_train, y_train))
```

1. Read the driving_log to manage the samples
2. Write a generator function (stateful function using yield) to read only pictures that are part of the batch to avoid memory problems

Step 8: Implement the Deep Learning Model (own or Nvidia)



Activation Function: ELU (Exponential Linear Unit)

Stride: Typically (2,2)

Optimizer: Adam

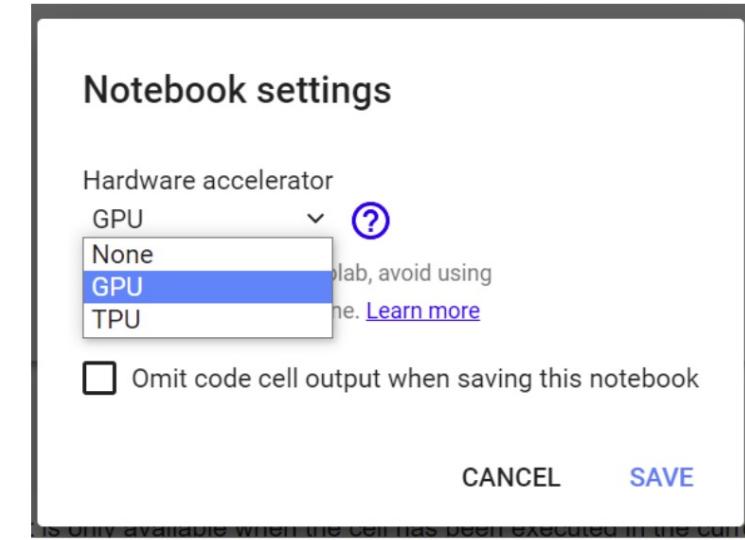
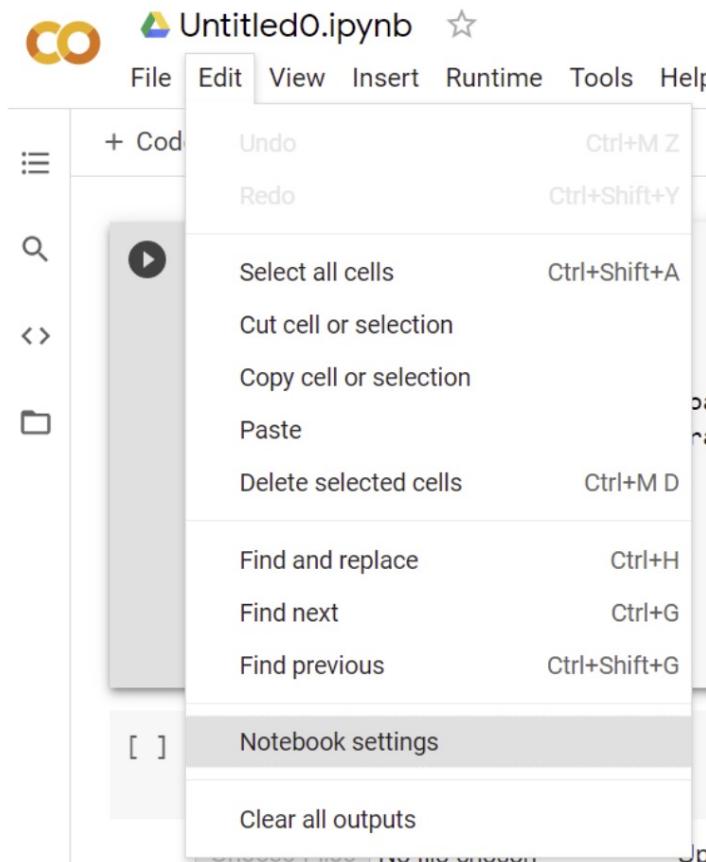
Epochs: 5

Save File as: model.h5

Based on:

<https://arxiv.org/pdf/1604.07316v1.pdf>

Step 9: Use GPU



Step 10: Train Model using fit_generator (instead of fit) function

```
model.fit_generator(...)
```

Step 11: Save results to model.5h and download it

```
model.save('model.h5')
```

Step 12: Now, we come to the fun part. Start the autonomous mode.



Step 13: Open Terminal and CD to drive.py, and copy model.h5 to the same folder.

Run: python drive.py model.h5

Contact



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