

## CarND-Behavioral-Cloning-P3

### Data Collection:

#### Track 1

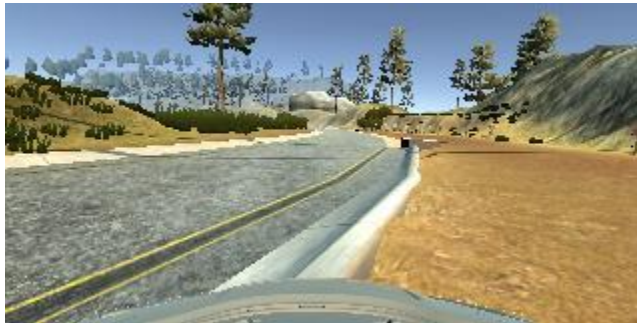
- 2 Laps around the track counterclockwise



- 
- 1 lap around the track clockwise



- 
- 2 areas where recovery from going off road:



#### Track 2:

- Did some segments clockwise



- Did some segments counterclockwise

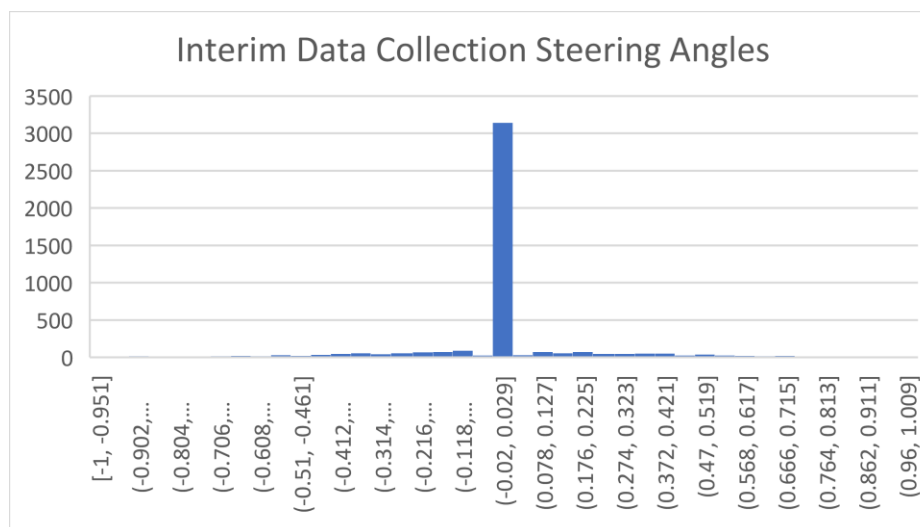
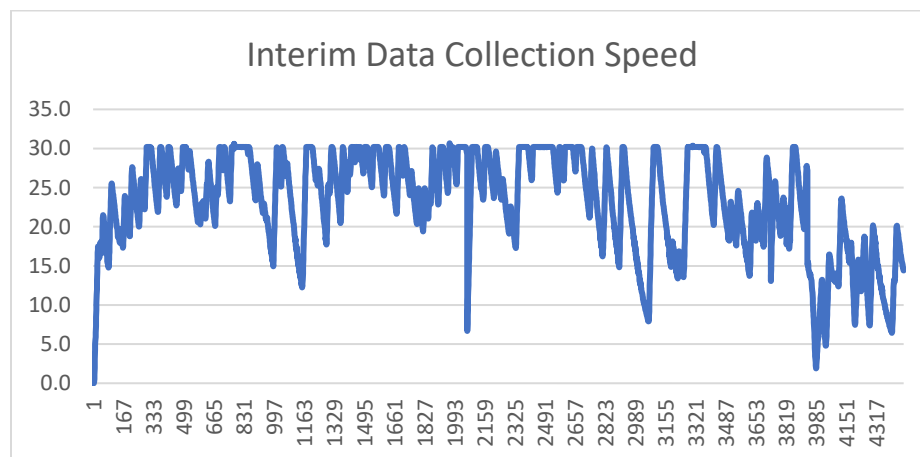


Driving in the simulator was quite different to a video game. Took some time to get used to.

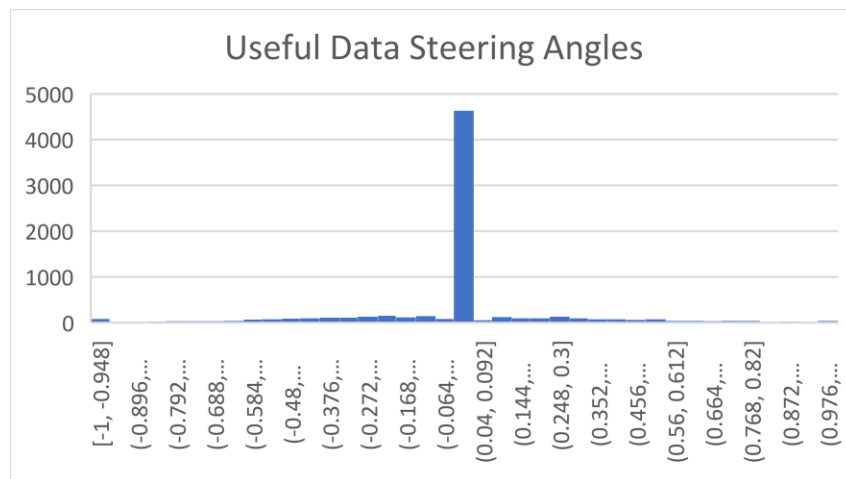
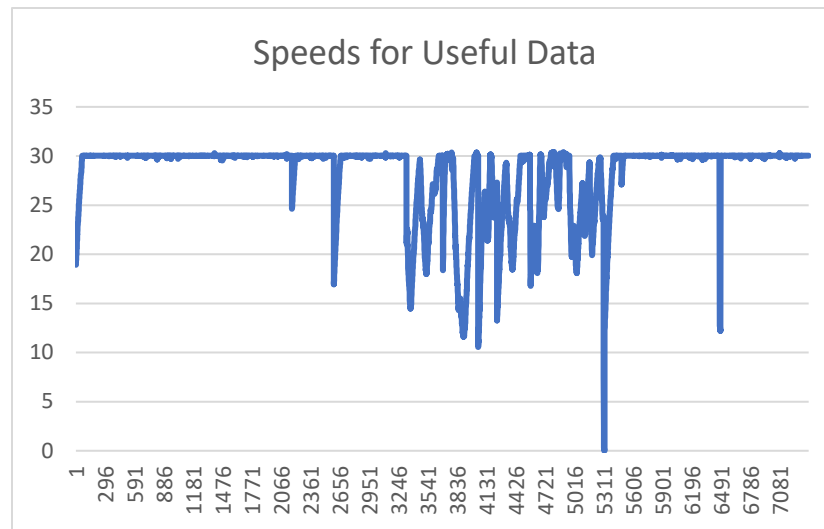
Did multiple data collection rounds to get data somewhat at the center:

- Determined that cruise control offered the best way to collect data since we are not optimizing the steering angle along with speed.

**Run with Data that was not useful too much variation in speed and a little erratic on steering:**



Run with Data that was useful with mostly constant speed and more controlled steering: 7370 total



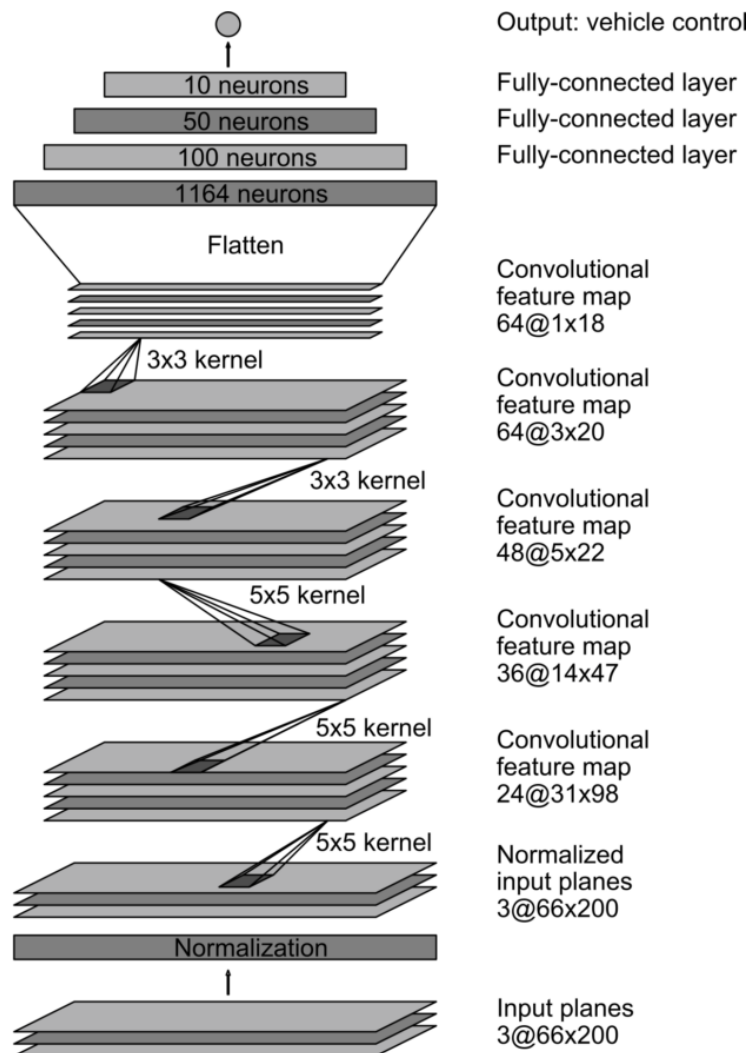
### Processing the input images:

- Read the driving log.csv file that is in the workspace under Constant\_Data folder
- Extract the image names from the first 3 columns:
  - Center, left and right images
- Extract steering angles from column 4
- Add/ subtract correction factors to the steering angles
  - Tried 0.2, 0.1 and 0.05: ended up selecting 0.05
- Flip images and generate a new set of augmented images:
  - np.fliplr
- Split the image set to training and validation images: 20% validation and 80% training using the test\_train\_split function
- Read in the images, steering angles and store them as shuffled batched numpy arrays using the generator function:

- Values tried 128,64,32
- Selected 32 for batch size since it gave best results within a few epochs and did not affect the time to train adversely

### Model architecture

- Started off with a sample flatten layer to see if the model can execute
- Model could execute and drive on autonomous mode but could not complete the track
- Tried Lenet-5 with Batch size 128 and 25 epochs and batch size 64 with 10 epochs: could not complete track 1
- Tried NVIDIA model with dropouts added for each of the fully connected layers: Car did not drive around the track 1
- Tried nvidia model: <https://developer.nvidia.com/blog/deep-learning-self-driving-cars/>
  - The validation loss stabilized within 5 epochs and the car could drive around the track 1 with few places where it goes towards the edge



- Tuning Parameters and running the model:
  - Batch size: 32 for best results within a few epochs

- Epochs 5: validation loss for the model stabilized within 5 epochs, past that it was pretty much constant
- Used the workspace to run the model training `python model.py`

### Capturing Video:

- Run the following command on the workspace:
  - `python drive.py model.h5 run3`
- Open the simulator and run in autonomous mode and allow the car to drive around the track once: track 1
- Come back to the terminal, stop the script using CTRL + C
- Install ffmpeg:
  - `Sudo apt -get update`
  - `sudo apt-get install ffmpeg`
- Run the command to create video:
  - `python video.py run1`



### Improvements:

- Get more data with the CAR in the center
- Do more switchbacks: left turns followed by immediate right turns
- Try to optimize both speed and steering to adapt better to driving styles
- Improve `drive.py` to have a second-degree polynomial fit and improve turns and path prediction
- Do additional color transforms for shadows and slopes: most of the first track was uniformly lit