

# Capstone Project

This is the Third and final project in third term of Self Driving Car Nano Degree program.

## **Team:**

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The goal of this project is to develop system integration using ROS Kinetic, the [Udacity System Integration Simulator](#), and code written in C++ and Python . The code developed will be tested on Udacity's real-world test vehicle (a Lincoln MKZ that the company has named "Carla") .

## **ROS Node Description:**

### **Waypoint Updater Node:**

This node publishes next 200 waypoints that are closest to the vehicle's current position and ahead of the vehicle. This node also considers the traffic lights to set the velocity of each waypoint.

#### **This node subscribes to the following topics:**

/base\_waypoints: Waypoints for the entire track are published to this topic, this is one time operation. Waypoint updater node receives these waypoints stores them to publish next 200 waypoints based on the current car's position.

/traffic\_waypoint: Index of the waypoint in the base waypoints list which is closest to the red traffic light. The waypoint updater node calculates the distance to this waypoint and sets the velocity of the waypoints to stop the car at the red light.

/current\_pose: To receive current position of the vehicle.

/Current\_velocity: To receive current velocity of the car which will be used in the acceleration and deceleration decision in the waypoint updater node.

#### **This node publishes to following topics:**

/final\_waypoints: Publishes 200 waypoints closest and ahead of the car including velocity of each waypoint.

### **DBW Node:**

This node is responsible for vehicle control (Acceleration, brake and steering)

#### **This node subscribes to the following:**

/current\_velocity: To receive current velocity of the car.

/twist\_cmd: Target vehicle linear and angular velocities are published to this /vehicle/dbw\_enabled: Indicate Manual or DBW control.

#### **This node publishes to following topics:**

/vehicle/steering\_cmd: Steering commands are published to this topic.

/vehicle/brake\_cmd: Brake commands are published to this topic.

/vehicle/throttle\_cmd: Throttle commands are published to this topic.

To calculate vehicle commands for steering, throttle and brake used the PID control and a low pass filter.

Hyper Parameters used:

Velocity  $K_P=0.6$ ,  $k_i=0.0$  and  $k_d=0.0$

Steering and Acceleration Tau and  $T_s$  is 0.5

## Traffic light detection node:

This node is responsible for detecting and classifying traffic lights.

### This node subscribes to the following:

/base\_waypoints: Waypoints for the entire track published to this topic

/current\_pose: the current position of the car

/image\_color: Camera image to identify the light color.

/vehicle/traffic\_lights: This topic provides the location of the traffic light in 3D map space and helps acquiring an accurate ground truth data source for the traffic light classifier by sending the current color state of all traffic lights in the simulator. When testing on the vehicle, the color state will not be available. You'll need to rely on the position of the light and the camera image to predict it.

### This node publishes to following topics:

/traffic\_waypoint: Publishes the index of closes waypoint to the red traffic lights stop line.

To Classify used the Squeezenet model .Adam Optimizer is used.

The summary of the model as follows:

Layer (type)	Output Shape	Param #	Connected to
=====			
input_1 (InputLayer)	(None, 227, 227, 3)	0	
conv1 (Conv2D)	(None, 113, 113, 64)	1792	input_1[0][0]
relu_conv1 (Activation)	(None, 113, 113, 64)	0	conv1[0][0]
pool1 (MaxPooling2D)	(None, 56, 56, 64)	0	relu_conv1[0][0]
fire2/squeeze1x1 (Conv2D)	(None, 56, 56, 16)	1040	pool1[0][0]
fire2/relu_squeeze1x1 (Activation)	(None, 56, 56, 16)	0	fire2/squeeze1x1[0][0]
fire2/expand1x1 (Conv2D)	(None, 56, 56, 64)	1088	fire2/relu_squeeze1x1[0][0]
fire2/expand3x3 (Conv2D)	(None, 56, 56, 64)	9280	fire2/relu_squeeze1x1[0][0]
fire2/relu_expand1x1 (Activation)	(None, 56, 56, 64)	0	fire2/expand1x1[0][0]
fire2/relu_expand3x3 (Activation)	(None, 56, 56, 64)	0	fire2/expand3x3[0][0]
fire2/concat (Concatenate)	(None, 56, 56, 128)	0	fire2/relu_expand1x1[0][0] fire2/relu_expand3x3[0][0]
fire3/squeeze1x1 (Conv2D)	(None, 56, 56, 16)	2064	fire2/concat[0][0]
fire3/relu_squeeze1x1 (Activation)	(None, 56, 56, 16)	0	fire3/squeeze1x1[0][0]
fire3/expand1x1 (Conv2D)	(None, 56, 56, 64)	1088	fire3/relu_squeeze1x1[0][0]
fire3/expand3x3 (Conv2D)	(None, 56, 56, 64)	9280	fire3/relu_squeeze1x1[0][0]
fire3/relu_expand1x1 (Activation)	(None, 56, 56, 64)	0	fire3/expand1x1[0][0]
fire3/relu_expand3x3 (Activation)	(None, 56, 56, 64)	0	fire3/expand3x3[0][0]
fire3/concat (Concatenate)	(None, 56, 56, 128)	0	fire3/relu_expand1x1[0][0] fire3/relu_expand3x3[0][0]

pool3 (MaxPooling2D)	(None, 27, 27, 128) 0	fire3/concat[0][0]
fire4/squeeze1x1 (Conv2D)	(None, 27, 27, 32) 4128	pool3[0][0]
fire4/relu_squeeze1x1 (Activati	(None, 27, 27, 32) 0	fire4/squeeze1x1[0][0]
fire4/expand1x1 (Conv2D)	(None, 27, 27, 128) 4224	fire4/relu_squeeze1x1[0][0]
fire4/expand3x3 (Conv2D)	(None, 27, 27, 128) 36992	fire4/relu_squeeze1x1[0][0]
fire4/relu_expand1x1 (Activatio	(None, 27, 27, 128) 0	fire4/expand1x1[0][0]
fire4/relu_expand3x3 (Activatio	(None, 27, 27, 128) 0	fire4/expand3x3[0][0]
fire4/concat (Concatenate)	(None, 27, 27, 256) 0 fire4/relu_expand3x3[0][0]	fire4/relu_expand1x1[0][0]
fire5/squeeze1x1 (Conv2D)	(None, 27, 27, 32) 8224	fire4/concat[0][0]
fire5/relu_squeeze1x1 (Activati	(None, 27, 27, 32) 0	fire5/squeeze1x1[0][0]
fire5/expand1x1 (Conv2D)	(None, 27, 27, 128) 4224	fire5/relu_squeeze1x1[0][0]
fire5/expand3x3 (Conv2D)	(None, 27, 27, 128) 36992	fire5/relu_squeeze1x1[0][0]
fire5/relu_expand1x1 (Activatio	(None, 27, 27, 128) 0	fire5/expand1x1[0][0]
fire5/relu_expand3x3 (Activatio	(None, 27, 27, 128) 0	fire5/expand3x3[0][0]
fire5/concat (Concatenate)	(None, 27, 27, 256) 0 fire5/relu_expand3x3[0][0]	fire5/relu_expand1x1[0][0]
pool5 (MaxPooling2D)	(None, 13, 13, 256) 0	fire5/concat[0][0]
fire6/squeeze1x1 (Conv2D)	(None, 13, 13, 48) 12336	pool5[0][0]
fire6/relu_squeeze1x1 (Activati	(None, 13, 13, 48) 0	fire6/squeeze1x1[0][0]
fire6/expand1x1 (Conv2D)	(None, 13, 13, 192) 9408	fire6/relu_squeeze1x1[0][0]
fire6/expand3x3 (Conv2D)	(None, 13, 13, 192) 83136	fire6/relu_squeeze1x1[0][0]
fire6/relu_expand1x1 (Activatio	(None, 13, 13, 192) 0	fire6/expand1x1[0][0]
fire6/relu_expand3x3 (Activatio	(None, 13, 13, 192) 0	fire6/expand3x3[0][0]
fire6/concat (Concatenate)	(None, 13, 13, 384) 0 fire6/relu_expand3x3[0][0]	fire6/relu_expand1x1[0][0]
fire7/squeeze1x1 (Conv2D)	(None, 13, 13, 48) 18480	fire6/concat[0][0]
fire7/relu_squeeze1x1 (Activati	(None, 13, 13, 48) 0	fire7/squeeze1x1[0][0]
fire7/expand1x1 (Conv2D)	(None, 13, 13, 192) 9408	fire7/relu_squeeze1x1[0][0]

fire7/expand3x3 (Conv2D)	(None, 13, 13, 192)	83136	fire7/relu_squeeze1x1[0][0]
fire7/relu_expand1x1 (Activation)	(None, 13, 13, 192)	0	fire7/expand1x1[0][0]
fire7/relu_expand3x3 (Activation)	(None, 13, 13, 192)	0	fire7/expand3x3[0][0]
fire7/concat (Concatenate)	(None, 13, 13, 384)	0	fire7/relu_expand1x1[0][0] fire7/relu_expand3x3[0][0]
fire8/squeeze1x1 (Conv2D)	(None, 13, 13, 64)	24640	fire7/concat[0][0]
fire8/relu_squeeze1x1 (Activation)	(None, 13, 13, 64)	0	fire8/squeeze1x1[0][0]
fire8/expand1x1 (Conv2D)	(None, 13, 13, 256)	16640	fire8/relu_squeeze1x1[0][0]
fire8/expand3x3 (Conv2D)	(None, 13, 13, 256)	147712	fire8/relu_squeeze1x1[0][0]
fire8/relu_expand1x1 (Activation)	(None, 13, 13, 256)	0	fire8/expand1x1[0][0]
fire8/relu_expand3x3 (Activation)	(None, 13, 13, 256)	0	fire8/expand3x3[0][0]
fire8/concat (Concatenate)	(None, 13, 13, 512)	0	fire8/relu_expand1x1[0][0] fire8/relu_expand3x3[0][0]
fire9/squeeze1x1 (Conv2D)	(None, 13, 13, 64)	32832	fire8/concat[0][0]
fire9/relu_squeeze1x1 (Activation)	(None, 13, 13, 64)	0	fire9/squeeze1x1[0][0]
fire9/expand1x1 (Conv2D)	(None, 13, 13, 256)	16640	fire9/relu_squeeze1x1[0][0]
fire9/expand3x3 (Conv2D)	(None, 13, 13, 256)	147712	fire9/relu_squeeze1x1[0][0]
fire9/relu_expand1x1 (Activation)	(None, 13, 13, 256)	0	fire9/expand1x1[0][0]
fire9/relu_expand3x3 (Activation)	(None, 13, 13, 256)	0	fire9/expand3x3[0][0]
fire9/concat (Concatenate)	(None, 13, 13, 512)	0	fire9/relu_expand1x1[0][0] fire9/relu_expand3x3[0][0]
drop9 (Dropout)	(None, 13, 13, 512)	0	fire9/concat[0][0]
conv10 (Conv2D)	(None, 6, 6, 400)	1843600	drop9[0][0]
relu_conv10 (Activation)	(None, 6, 6, 400)	0	conv10[0][0]
flatten_1 (Flatten)	(None, 14400)	0	relu_conv10[0][0]
dense_1 (Dense)	(None, 1024)	14746624	flatten_1[0][0]
dropout_1 (Dropout)	(None, 1024)	0	dense_1[0][0]
dense_2 (Dense)	(None, 512)	524800	dropout_1[0][0]
dense_3 (Dense)	(None, 4)	2052	dense_2[0][0]
=====			

Total params: 17,839,572  
Trainable params: 17,117,076  
Non-trainable params: 722,496

**Results:**

Programs are compiled and executed without any errors.

Car is running fine on the simulator track with no Camera turned on.

When Camera is turned on it is having lots of latency issues and could not test it properly with the traffic light detection and classification.

**Files Attached:**

CarND-Capstone - This has the code in the ros/src directory.

Readme.pdf - This file