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CarND Capstone

Introduction

This document provides the introduction, details and results of the final project for the Udacity Self-Driving Car Engineer Nanodegree. As part of this project completion, a solo effort was performed that resulted in updating existing nodes from Udacity and also creation of new nodes to implement core functionality of an autonomous vehicle. More information about this project can be obtained from the project introduction [here](#).

Car Start

Team

This project was completed individually by Prasanna Kolar - email: prasanna.utsa@gmail.com

Setup Instructions

The system comprises of usage of any of the 3 systems Udacity provided workspace, Native(local) installation, Docker Installation

Workspace

The system is provided by Udacity with an online simulation environment. This system was developed using unity and is used in initial tests. However due to the situation created by the Covid-19 health crisis this is the only system used.

Native Installation

- Follow these instructions to install ROS
 - ROS Kinetic if you have Ubuntu 16.04.
 - ROS Indigo if you have Ubuntu 14.04.
- Dataspeed DBW
 - Use this option to install the SDK on a workstation that already has ROS installed: One Line SDK Install (binary)
- Download the Udacity Simulator. The computer was a dual hexcore processor system with 128 GB of RAM and ample disk space and a GPU- 1070ti. This is a beefy system used in previous ML projects/ However, there were technical issues installing the development environment on this computer ### Docker Installation The same computer was tried for Docker usage. This is a beefy system used in previous ML projects/ However, there were technical issues installing Docker and configuring it accurately. Install Docker

Build the docker container

```
docker build . -t capstone
```

Run the docker file

```
docker run -p 4567:4567 -v $PWD:/capstone -v /tmp/log:/root/.ros/ --rm -it capstone
```

Port Forwarding To set up port forwarding, please refer to the instructions from term 2

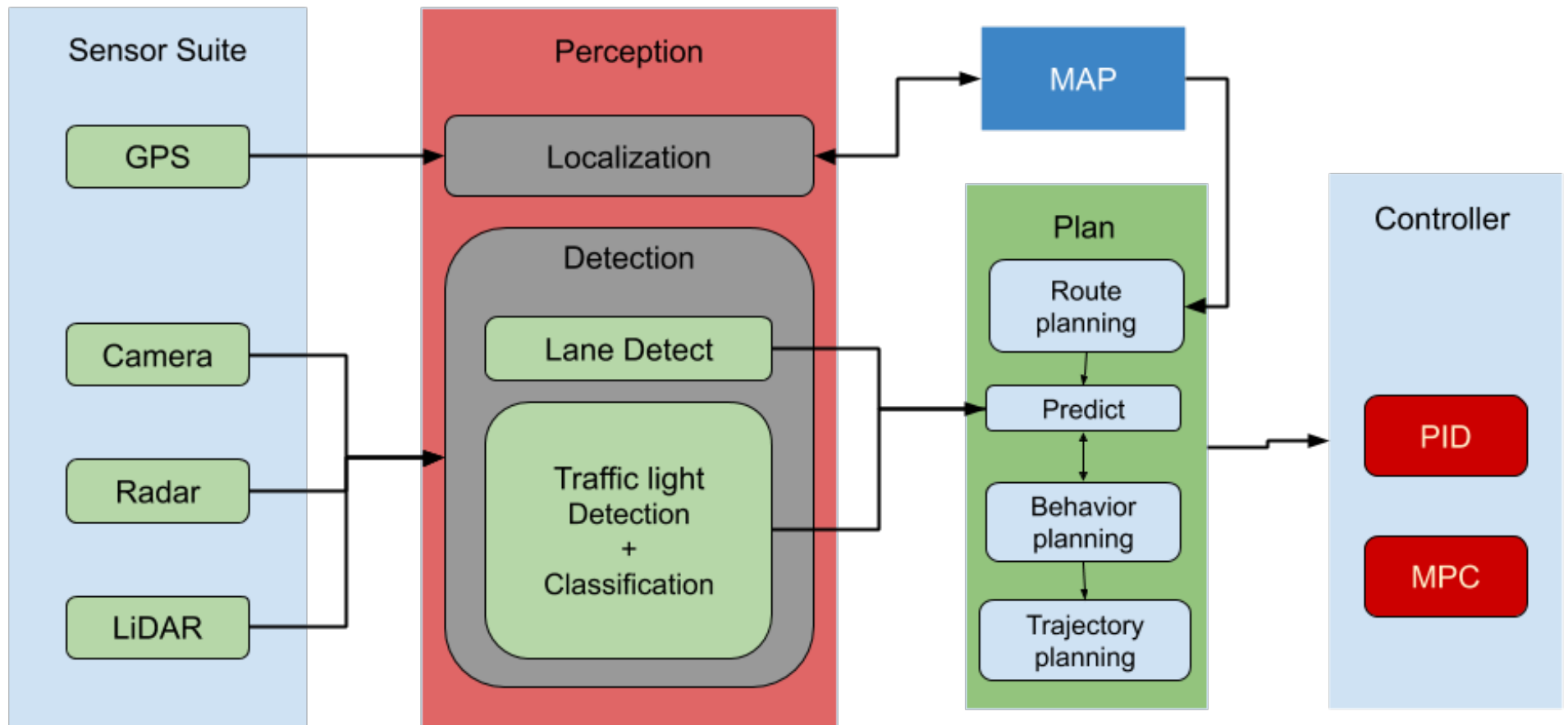
Project Overview

This project can be implemented in a simulator or on the smart vehicle. Due to Covid restrictions, we implement it in the simulator.

Architecture

CARLA Architecture

Carla is a custom Lincoln MKZ that Udacity modified into a self-driving car.



The self-driving system can be broken down into four major sub-systems: Sensor suite, Perception, Planning and finally the Control sub system.

ROS Architecture

The ROS framework comprises of Packages, nodes, topics, messages, launch files and services to name a few. This Capstone system comprises of C++ and Python predom-

The screenshot displays the ROS Runtime Manager interface. The top bar includes tabs for Quick Start, Setup, Map, Sensing, Computing, Interface, Database, Simulation, Status, and Topics. The main area shows a tree view of packages and their status. The left pane lists packages under Localization, Detection, and Viewers. The right pane lists packages under Mission Planning, Motion Planning, and State. Each package has a status bar with 'sys' and 'app' indicators. At the bottom, there is a Synchronization section with four CPU bars showing usage: CPU0 (33.3%), CPU1 (54.5%), CPU2 (45.5%), and CPU3 (36.4%). On the right, there are buttons for ROSBAG, RViz, and RQT, and a memory usage indicator showing 4427MB/7806MB (56%).

Localization

- gnss_localizer
 - fix2tfpose [sys]
 - nmea2tfpose [sys]
- ndt_localizer
 - ndt_mapping [sys] [app]
 - lazy_ndt_mapping [sys] [app]
 - ndt_matching [sys] [app]
- icp_localizer
 - icp_matching [sys] [app]
- autoware_connector
 - can2odom [sys]
 - vel_pose_connect [sys] [app]

Detection

- cv_detector
 - dpm_ocv [sys] [app]
 - dpm_ttic [sys] [app]
 - rcnn_msr [sys] [app]
 - ssd_unc [sys] [app]
 - yolo2_wa [sys] [app]
 - range_fusion [sys] [app]
 - klt_track [sys] [app]
 - kf_track [sys] [app]
 - dummy_track [sys]
 - obj_reproj [sys]
- lidar_detector
 - euclidean_cluster [sys] [app]
 - svm_lidar_detect [sys] [app]
 - kf_lidar_track [sys] [app]
 - pf_lidar_track [sys] [app]
 - euclidean_lidar_track [sys] [app]
 - obj_fusion [sys]
- road_wizard
 - feat_proj [sys] [app]
 - region_tlr [sys] [app]
- viewers
 - image_viewer [sys] [app]
 - image_d_viewer [sys] [app]
 - points_image_viewer [sys] [app]

Mission Planning

- lane_planner
 - lane_navi [sys] [app]
 - lane_rule [sys] [app]
 - lane_stop [sys] [app]
 - lane_select [sys] [app]
- freespace_planner
 - astar_navi [sys] [app]
- way_planner (OpenPlanner)
 - way_planner [sys] [app]

Motion Planning

- dp_planner (OpenPlanner)
 - dp_planner [sys] [app]
 - ff_waypoint_follower [sys] [app]
- astar_planner
 - velocity_set [sys] [app]
 - obstacle_avoid [sys]
- lattice_planner
 - lattice_velocity_set [sys] [app]
 - path_select [sys]
 - lattice_trajectory_gen [sys] [app]
 - lattice_twist_convert [sys]
- waypoint_maker
 - waypoint_loader [sys] [app]
 - waypoint_saver [sys] [app]
 - waypoint_clicker [sys] [app]
- waypoint_follower
 - pure_pursuit [sys] [app]
 - twist_filter [sys] [app]
 - wf_simulator [sys] [app]

State

- state_machine
 - state_machine [sys]

Synchronization

CPU	Usage
CPU0	33.3%
CPU1	54.5%
CPU2	45.5%
CPU3	36.4%

Memory

4427MB/7806MB (56%)

ROSBAG **RViz** **RQT**

AutoWare

Simulation

Sensing and Perception

The sensors ‘read’ or ‘measure’ the world or the environment that the autonomous vehicle works in and provides the data to the perception module. The system in this project has multiple sensors, which may also be termed as a sensor suite. The sensors are camera, lidar, sonar, GPS and other related odometric sensors. For the sake of the completion of this project, camera and localization sensors will be used. The Perception sub-module accepts the data from the sensing sub-module and processes it. The output is provided to the localization submodule and detection submodules. Further to this, the processed data is sent to the machine learning modules such as traffic light detection module, the identification and classification modules. The output of the localization and the perception submodules are also input the controls sub-module. As part of this project, a Proportional(P) Integral(I) and Differential(D) - PID controller is implemented, which takes in input from the perception module and sends commands to the Drive By Wire(DBW) unit. The DBW also signals or controls the drive system on the car CARLA either simulated or the real car. We can term that that the perception sub-module is capable of abstracting the raw data coming from the sensors into localization and traffic light detection functionalities.

Path planning

The Path Planning component can be broken into Route, Localization and Trajectory planning sub-components.

Route The route planner decides at a higher level, the paths that the vehicle needs to take. This path is decided amongst multiple paths between 2 points on a map.

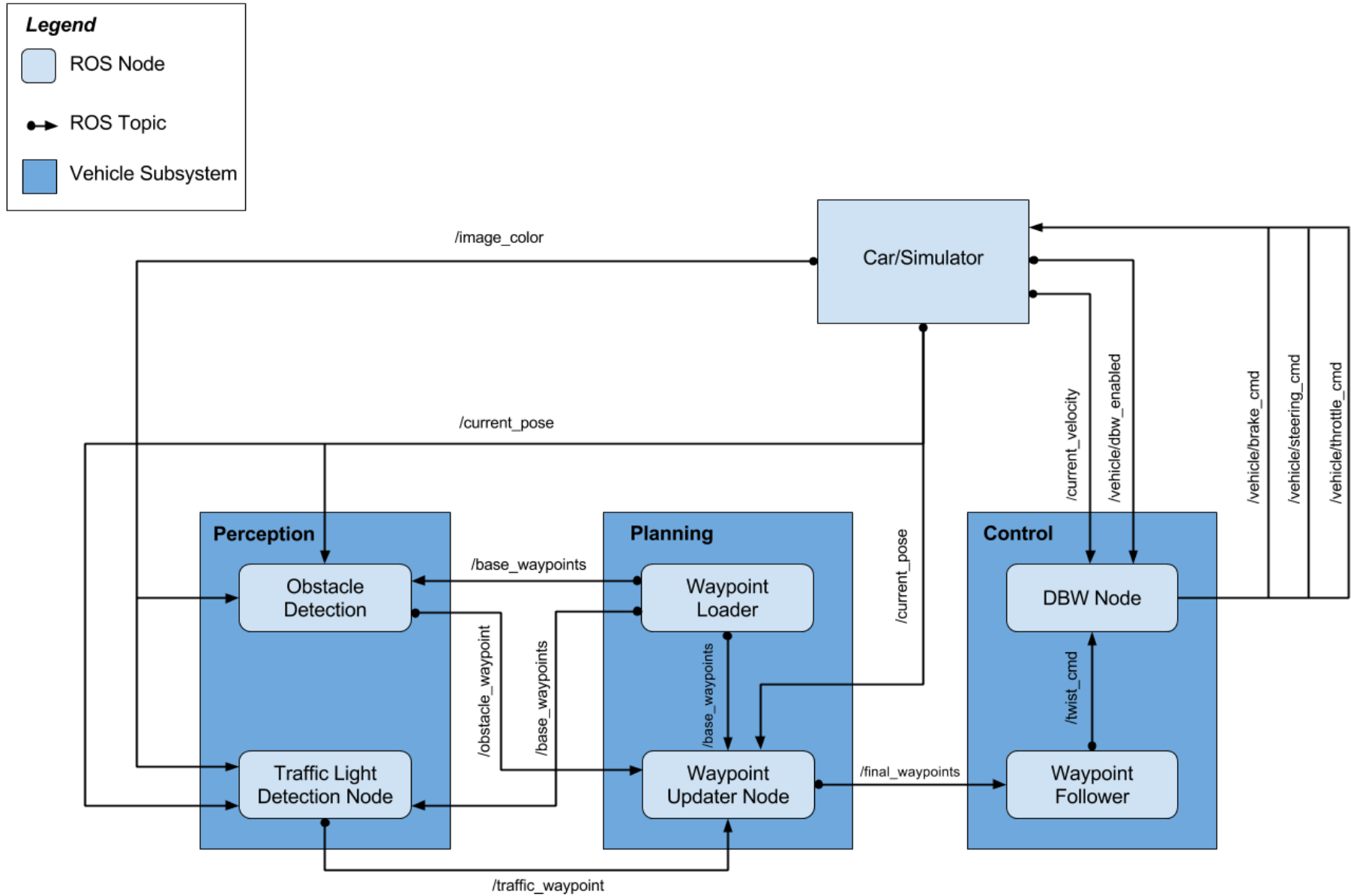
Behavior planning Route planner doesn't count the uncertainties during operation. This is handled in the behavior planner. Using sensory input, the behavior planner lets the system know which behavior to choose for the immediate need to handle the uncertainty noted in the sensor systems. In the project, we restrict this functionality to traffic management; Red is stop, yellow is caution and green is go. ##### Trajectory Based on the input, the trajectory planner decides which trajectory is the best to execute the required behavior as given in the behavior planner.

Localization This component tells the car where it is, in the given map. The odometric and localization sensors feed into the system which then estimates the transformation between each required measurement and the map.

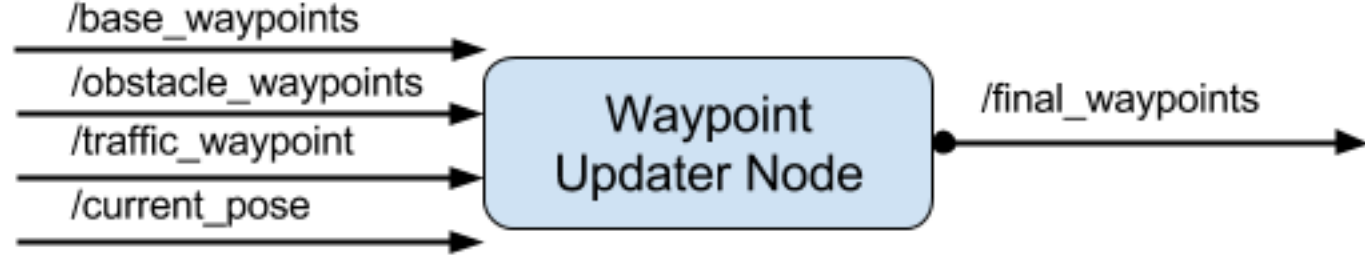
Traffic ML system

The machine learning system handles input from the camera(s) in order to feed into a behavior planner. The planner then gives input to the trajectory planner to choose the best ‘sub-route’ to mitigate the uncertainty seen at the moment. ##### Traffic light Detector The traffic light detection system is capable of detecting traffic lights and feed them into the classifier. ##### Traffic light image classifier The traffic light classifier is able to detect the type of traffic light and then feed into the trajectory planner to temporarily handle the current situation that the car is handling. ##### System and Controls The system and controls unit is the final module which commands the simulated car or the real car. This component accepts the trajectory and processes it through the PID controller. This enables a smooth vehicle operation especially when a new behavior is observed.

Node Development

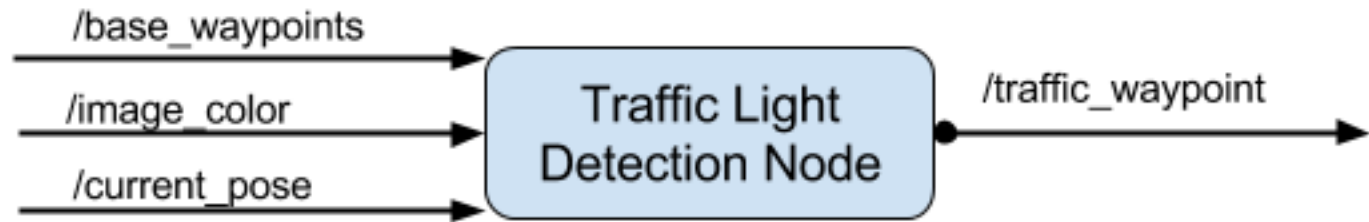


Waypoint Loader The wayopint loader module loads the base or the initial waypoints into the system and The node *waypoint_loader.py* handles the functionality.



Waypoint Updater

The waypoint updater module updates the previously accepted waypoints in the system based on the path planning input and also the behavioral planning input. The node *waypoint_updater.py* handles the functionality. ### Traffic light system A neural network has been trained to detect traffic lights in the simulator. This system first detects traffic lights and then calls the classification module. The trafficlight sub-component deals with detecting the traffic light in the image and then classifying the traffic lights in the image.



Traffic light Detector

This is the first module that accepts the image from the camera and starts processing it.

Traffic light image classifier As part of this project a traffic light classifier was developed. This sub-component accepts the image input and detects the presence of the traffic light(s) and then classifies and identifies whether its a RED, YELLOW or GREEN light. Based the type of light, an appropriate control decision is taken whether to decelerate, continue or stop

Other library/driver information

In addition to the `requirements.txt` file, here is information on other driver/library versions used in the simulator and Carla:

Specific to these libraries, the simulator grader and Carla use the following:

	Simulator	Carla
Nvidia driver	384.130	384.130
CUDA	8.0.61	8.0.61
cuDNN	6.0.21	6.0.21
TensorRT	N/A	N/A
OpenCV	3.2.0-dev	2.4.8
OpenMP	N/A	N/A

Tests

Simulation system

The Simulation environment was tested with the car successfully completing a full lap of the course. The car remained in lane most of the time, except during correctional lane changes. The car did not move to left of the left most lane or to the right of the right most lane. i.e., at all times, the car was within the lanes driving on the right side of the road.

While the lap was being driven, whenever the car encountered a RED traffic light, the car stopped and started only after a GREEN light was displayed.

Below are some images wherein the car successfully detected traffic lights and also classified them accurately.

Simulation Videos

Car starts

Car drives through Green and Yellow light

Car Stops at Red light

Full Lap

Lessons Learnt

- Plan more time for project.
- Discuss with mentors and ensure that a working local system is available.
- Discuss issues with mentors and ensure response back on time.

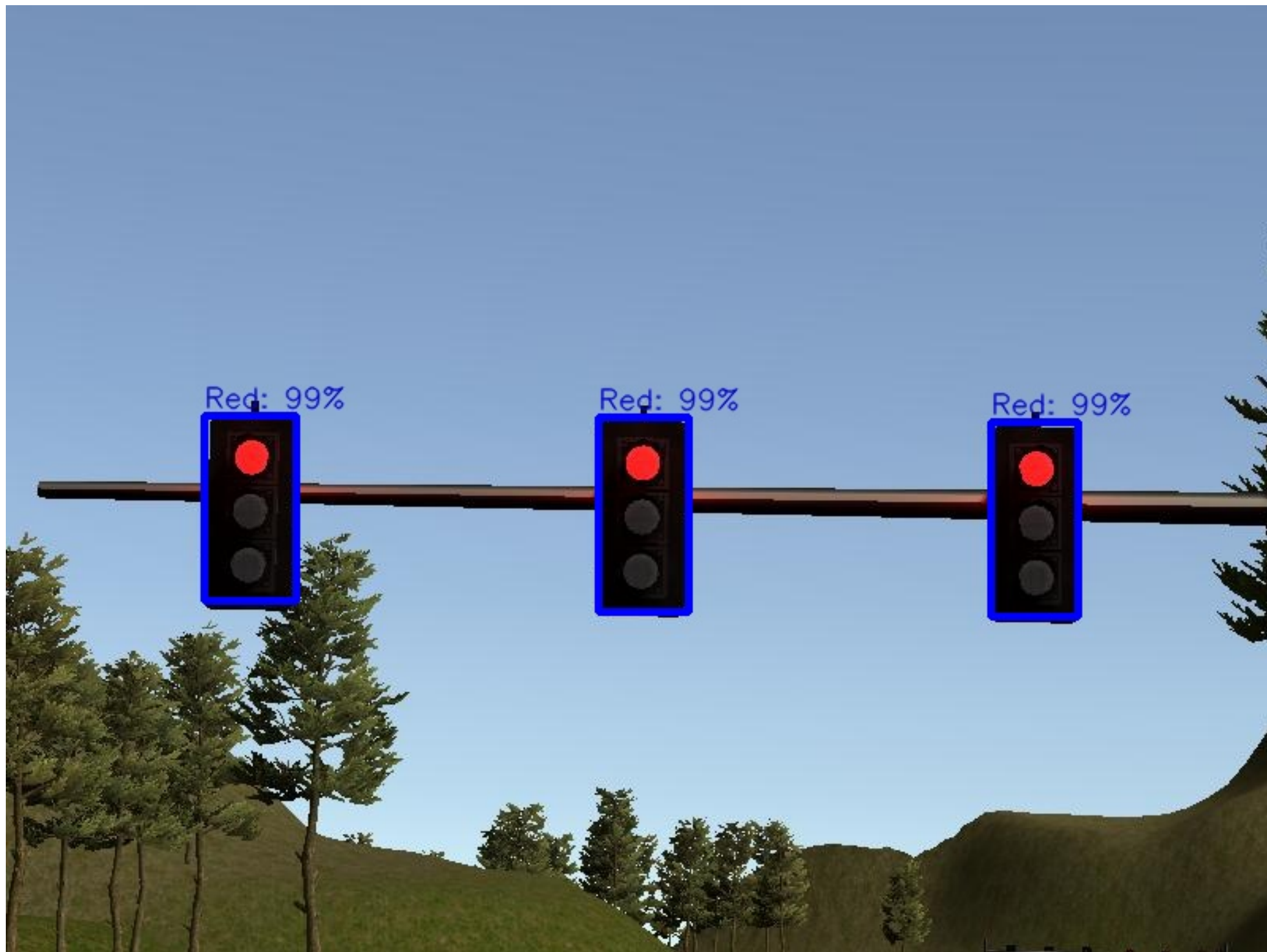


Figure 1: RED Light

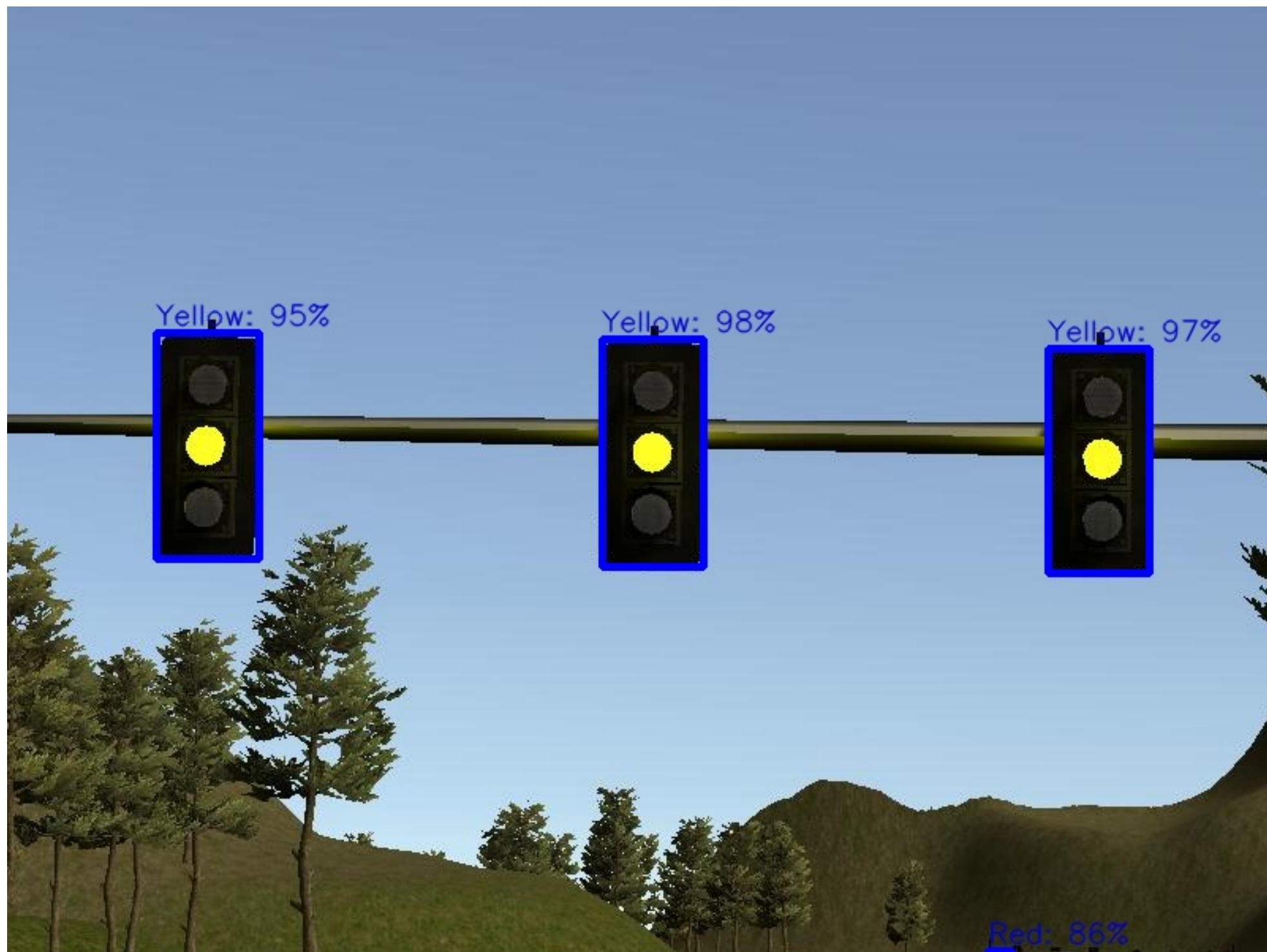


Figure 2: YELLOW Light

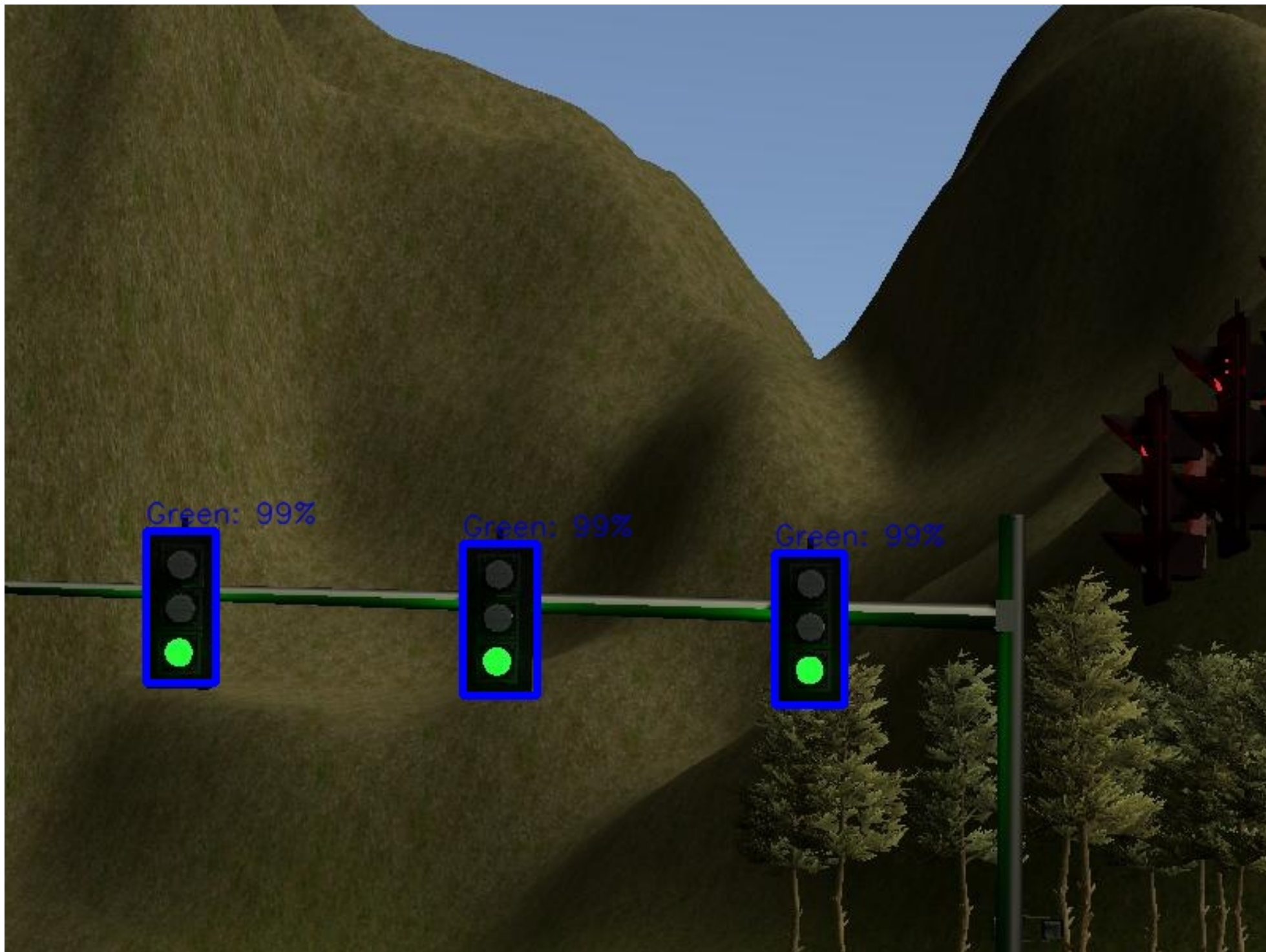


Figure 3: GREEN Light