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Summary

Medical emergencies and trauma situations are stressful events. Training and repetition in controlled environment is used for health professionals to gain experience and retain the learning for longer. Laerdal Medical creates medical equipment and training equipment meant for health personnel.

SimMan is a high-fidelity patient simulator created by Laerdal Medical to train teams in treating medical emergencies and trauma. To make the simulations more realistic to increase the training effect work has been done to make prototypes that can replicate realistic behaviour.

The project in this thesis builds on a head prototype with LCD monitors as eyes and with a joystick and switch controller attached for changing eye modes. One of those modes were used in this thesis for receiving target angles the eyes should be rotated to look at a detected object. The detected object was found using a neural network trained on detecting faces.

Edge devices like Raspberry Pi with lower computing capability are cheap and flexible for many use cases. The effectiveness object detection network can achieve on these edge devices makes this eye prototype system flexible for further implementation and more advanced functionality.

The modified eye prototype and object detection pipeline developed for this thesis performs well and appear realistic when there is a single target person in the depth camera's field of view. Multiple people visible will make the eyes change who it looks at in a way that does not seem realistic. There are also some angles relative to the prototype where the eye contact looks unfocused.

Chapter 1

Introduction

1.1 Motivation of Thesis

SimMan is a high-fidelity patient simulator used to train teams in treating medical emergencies and trauma. The training done on this product help save the lives of trauma victims, COVID-19 patients, and many others every day. The installed base of SimMan is over 10 000 simulators. The simulator already contains microphones, speakers, an on-board computer and network connection.

To improve the quality and realism of the training Laerdal Medical aim at making the simulators more realistic both in appearance and responses. A key element in assessing a patient's consciousness is the eye movement. An alert and conscious patient will naturally follow people and their movements in the environment. In addition, Laerdal Medical wants the simulator to respond realistically to clinical procedures involving eye movement, e.g. "follow my finger with your eyes".

1.2 Topic of Thesis

1.2 Topic of Thesis

Goal of Thesis

The goal of this thesis was to use object detection together with an eye focus system to provide inputs that guide where the SimMan Patient Simulator eyes should focus.

A neural network that uses input from a depth camera to find the position of objects and send that to the prototype for visualisation was the target of this thesis. The objects to train the object detection network on was identified to be faces and fingers/pens for the clinical procedure "follow my finger test". This use of object detection networks for the eye prototype was targeted as a proof of concept prototype for potential further development for more advanced uses or implementation into the commercial SimMan patient simulator

Work Completed in this Thesis

A complete prototype system with depth camera, a face detection neural network and direction of the LCD monitor eyes to the faces was implemented. The face detection neural network used was a network trained by Github user: "*yeephycho*" on the "*WIDERFACE*" dataset. [20] [21]

The object detection network used and the surrounding pipeline in this thesis was only trained on faces and logic for changing objects to track with the eyes when multiple different objects are detected was not implemented.

A training pipeline using the Tensorflow object detection API to train a neural network on custom objects was set up and run on a very small custom dataset for testing the training setup. Collecting and labeling a large and diverse enough dataset for training on a relevant object was not completed.

The eye prototype using object detection on faces was tested with basic experiments to check the realism of the eye prototype system.

1.3 Thesis Report Overview

1.3 Thesis Report Overview

This thesis report contains these main parts:

- Background and Method
- Implementation
- Experiments, Results and Discussion

The "*Background and Method*" chapter contains brief explanation and references to the technologies used in the implementation of the project in this thesis.

The "*Implementation*" chapter has code examples of the novel and modified code created for this project. There are illustrations and explanations on how the different parts are set up to create a complete data sampling and interpretation pipeline from camera inputs to the eye visualisation outputs.

The "*Experiments, Results and Discussion*" part has three experiments performed to test and document the realism of the object tracking prototype.

Chapter 2

Background and Methods

This Chapter explains the technologies and theories of the methods used in this project

2.1 Method Overview

The method of the project in this thesis uses a combination of technologies. A face detection neural network is used on the inputs from the depth camera and sent for positioning of the eyes of the premade LCD monitor eye prototype from Laerdal Medical.

2.2 Artificial Neural Network for Object Detection

Artificial neural network design is influenced by the way neurons in brains communicate and function. [8] A large variations of designs and structures are used for different learning tasks and applications. The type of neural nets and their use in this thesis is explained briefly in the following sub chapters.

2.2 Artificial Neural Network for Object Detection

2.2.1 Convolutional Neural Networks

Many variations of convolution neural networks has been developed that build on the ideas from the network "Neocognition" proposed by Dr. Kunihiko Fukushima in 1980. [7] Convolutional neural networks has a layer structure that is different than a classic neural network with fully connected layers. It filters in regions of an input and has a final fully connected layer that learns to recognize the complete objects and position of it. Earlier layers are sensitive to basic features and shapes and later layers detect combinations of features that make up part of the final object. [13] [16]

2.2.2 Transfer Learning

Transfer learning is where a pretrained model is used as the starting point in training a model to perform a new learning task. In this project a pretrained multiple object detection network was used to set up the training pipeline for custom images and classes. The pretrained model was trained on custom images of faces to only detect faces. Convolutional neural networks are suitable for transfer learning since the first layers recognize basic shapes and features. In transfer learning locking the first layers and only train the later ones that detect the complete objects achieves the transfer learning. [4]

2.2.3 SSDMobileNet

High performing neural networks for object detection are often large and require large computing resources to work fast enough for useful real time applications. For edge devices like Raspberry Pi smaller detection networks optimized for speed are needed. A Single Shot Detector was presented by Liu et al. on 2016. [14] The detector only processes the input once and returns multiple boxes of detections and their accuracy. Combining this detector with a MobileNet results in an efficient network that has good accuracy on edge devices. [9] Pretrained versions of SSDMobileNet trained using transfer learning on faces was used in this thesis.

2.3 Laerdal Medical's Patient Simulator SimMan

2.2.4 Tensorflow Object Detection API

Tensorflow is a platform for machine learning and has an API set up for object detection and custom training. [1] A comprehensive tutorial is made by Lyudmil Vladimirov and was followed to test custom training in this project. Priorities led to implementation of a custom trained object detection network to not be completed. [19]

Using Tensorflow on a computers GPU(graphical processing unit) requires care in selecting compatible versions and following tested procedures like the one from Lyudmil Vladimirov is recommend. [19]

2.3 Laerdal Medical's Patient Simulator SimMan

Laerdal Medical's Patient Simulator SimMan is an advanced full body patient simulator. [15] To make the patient simulator feel more realistic a prototype for eyes that look realistic and can move around naturally was made prior to this thesis's project. The prototype is explained more in detail in the subsection below.

2.3.1 Eye Prototype

The eye prototype that was made by Laerdal Medical is a head mounted on a platform. The head has two LCD monitors as eyes connected to a Raspberry Pi that runs the eye simulation.[2][6] The eye simulator has curved lenses on top of the monitors to make the eyes look spherical. A 3D printed socket and mount for the spherical lenses makes if fit realistically inside the head platform. To avoid the challenges the spherical lenses creates on optics the prototype in this thesis project was developed an tested with only the flat LCD monitors without lenses on top. See figure 2.1 and the eye without the lens inserted. That was how both the eyes were used in this project.

2.3 Laerdal Medical's Patient Simulator SimMan



Figure 2.1: Overview of all equipment setup in this prototype. One eye lens is removed to demonstrate the LCD monitor behind it. Depth camera can be seen below, to the side of the head prototype. Raspberry Pi 3 running the eyes can be seen in the background.

Adafruit Animated Eyes Bonnet for Raspberry Pi

The LCD monitors the eyes uses are two 1.54" monitors with 240x240 resolution with full angle viewing. [2]. This is designed to connect to the GPIO pins and hardware of the Raspberry Pi 3 Model B. [2] [6]

2.3 Laerdal Medical's Patient Simulator SimMan

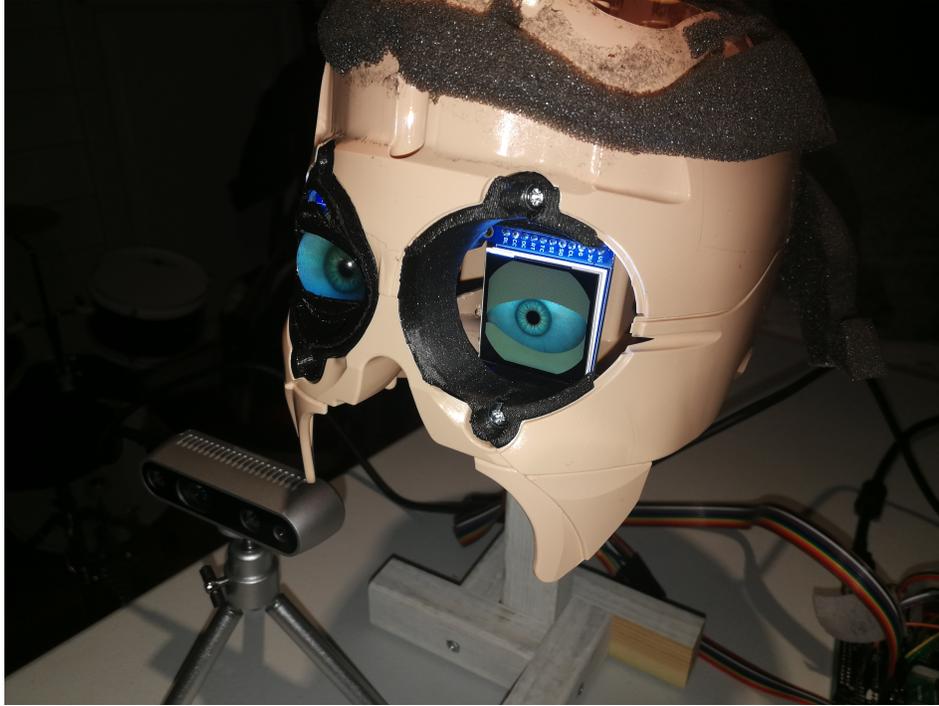


Figure 2.2: Closeup of eyes. One lens is removed for demonstration. Depth camera can be seen below and to the side of the head prototype

2.3.2 Intel Realsense D435 [10] Depth Camera

Depth camera was identified to help in the positioning of the eyes so the focus would not be cross-eyed. When eyes look at an object closer to itself the individual positioning of the eyes become crucial to appear realistic. This camera is a stereo camera that has depth sensing capability. It comes with a development kit and python library that is compatible with the other parts used in this project. Using the python *"pyrealsense2"* library there are two arrays of data that can be used from the camera.[11] One array from the normal RGB (Red, Green, Blue) camera and a depth array of same frame. [10]

Chapter 3

Implementation

This chapter explains the novel work and the modifications of existing solution that was done in this project. Code snippets are included and explained in this chapter. The full code can be found in the Appendix or the projects Github repository. [12]

3.1 Flowchart of Object Detection Eye Prototype

The flowchart in figure 3.1 below show the files used in the eye prototype system made in this project and where they are used and the device running them. Details on the individual scripts and the novel and modified code inside is explained below in this chapter. This flowchart shows an overview for context on where they are run.

3.2 Object Detection

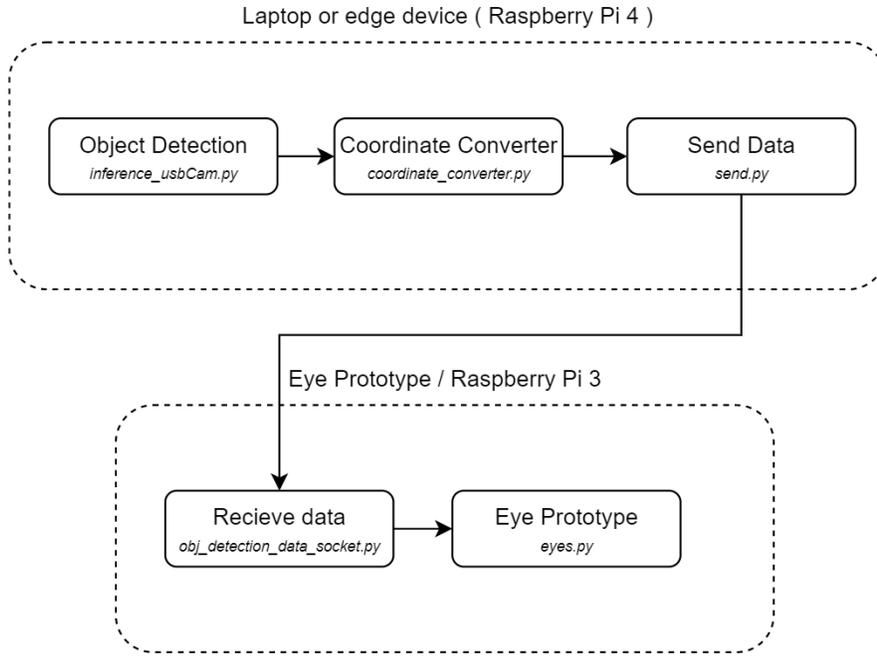


Figure 3.1: Flowchart of Files and Devices using them

3.2 Object Detection

Two object detection neural networks were tested in this project. One trained on a custom dataset captured and labeled manually and one pre-trained on faces.[21] Due to time constraints it was not prioritised to complete preparing a good dataset and running training on it. The pipeline for training on custom data and using the network in the prototype pipeline was implemented and explained below in this chapter.

3.2.1 Dataset for Custom Transfer Learning

The data i.e. images collected in this project was only of the author and was not of sufficient variability for good results. The dataset contained only 10 images where 8 was used for training and 2 for testing.

3.2 Object Detection

Prioritisation of tasks led to this dataset not being expanded and used for a self trained custom network to be used in the prototype pipeline.

To properly train a new custom model to detect faces or potentially other object of interest in patient simulation scenarios, larger datasets with more variations are needed so the models are not overfitted to very specific data.

3.2.2 Transfer Learning Parameters on Custom Dataset

The transfer learning was set up with a low learning rate of 0.08 and 50000 steps. These are inputs in the pipeline.config file that is set up using the Tensorflow object detection API. [19] The files and model trained can be found in this thesis's Github repository under "*person_event-detection-recognition/custom_from_scratch/tensorflow_face_model_jk*". [12]

3.2.3 Pretrained Face Detection Network

Using a pretrained face network was prioritised in this project so that a complete pipeline and prototype could be completed and tested. The network used was a "*SSDmobileNet*" trained on the "*WIDER FACE*" benchmark dataset. [21] [20] The pretrained model has a python script for detection and visualisation that was modified in this project. Details of this is in subsection 3.2.4 below.

3.2.4 Object Detection Inference Script

This subsection will show code snippets of modified code of the original inference script in the repository by Github user "yeephycho" ("*inference_usbCam_face.py*"). [21].

This inference script is used to collect the input data from the camera, run object detection on them, convert the inputs using the "*ConvertCoordinates*" class and then send it over the network to the eye prototype using

3.2 Object Detection

the *"SendData"* class.

Modified dependency imports are the pyrealsense2 package (line 15), classes made for this thesis; *"SendData"* and *"ConvertCoordinates"* and native package *"copy"* for holding the last valid depth measurement in memory. See line 1 to 20 below for the packages included in the python script *"inference_usbCam_face.py"*

```
1 #!/usr/bin/python
2 # -*- coding: utf-8 -*-
3 # pylint: disable=C0103
4 # pylint: disable=E1101
5
6 from os import X_OK
7 import sys
8 import time
9 import numpy as np
10 import tensorflow as tf
11 import cv2
12 import collections
13 import six
14 import PIL.Image as Image
15 import pyrealsense2 as rs
16 from utils import label_map_util
17 from utils import visualization_utils_color as vis_util
18 from send import SendData
19 from coordinate_converter import ConvertCoordinates
20 import copy
```

The Tensorflow Object Detection API [19] has a function (*visualize_boxes_and_labels_on_image_array()*) in the *"utils"* module that takes the detection outputs and create bounding boxes and prints the class label and detection accuracy. A modified version of this function that takes in the detection outputs and returns the coordinates for the corners of the bounding box is shown below (lines 38 to 108). This function is used to determine the pixel location on the detection camera the prototype eyes will be directed at. Please see appendix or Github repository for the complete function. [12]

```
38 def get_eye_focus_coordinate(
39     image,
40     boxes,
```

3.2 Object Detection

```
41     classes,
42     scores,
43     category_index,
44     instance_masks=None,
45     instance_boundaries=None,
46     keypoints=None,
47     keypoint_scores=None,
48     keypoint_edges=None,
49     track_ids=None,
50     use_normalized_coordinates=False,
51     max_boxes_to_draw=20,
52     min_score_thresh=.5,
53     agnostic_mode=False,
54     line_thickness=4,
55     mask_alpha=.4,
56     groundtruth_box_visualization_color='black',
57     skip_boxes=False,
58     skip_scores=False,
59     skip_labels=False,
60     skip_track_ids=False):
61     """
```

Lines 177 to 213 of *"inference_usbCam_face.py"* sets up the camera for capturing images and depths(line 178-196), sets up the network class for sending data(line 202-204) and sets up the converter class for calculating the correct angles for the eyes(line 206-212). Details on the converter class can be seen in subsection 3.2.5.

```
178     # Configure depth and color streams
179     pipeline = rs.pipeline()
180     config = rs.config()
181
182     # Get device product line for setting a supporting ...
183     resolution
184     pipeline_wrapper = rs.pipeline_wrapper(pipeline)
185     pipeline_profile = config.resolve(pipeline_wrapper)
186     device = pipeline_profile.get_device()
187     device_product_line = ...
188     str(device.get_info(rs.camera_info.product_line))
189
190     config.enable_stream(rs.stream.depth, 640, 480, ...
191     rs.format.z16, 30)
192
193     if device_product_line == 'L500':
194         config.enable_stream(rs.stream.color, 960, 540, ...
195         rs.format.bgr8, 30)
```

3.2 Object Detection

```
192     else:
193         config.enable_stream(rs.stream.color, 640, 480, ...
194         rs.format.bgr8, 30)
195
196         # Start streaming
197         pipeline.start(config)
198         tDetector = TensorflowFaceDector(PATH_TO_CKPT)
199
200         cap = cv2.VideoCapture(camID)
201         windowNotSet = True
202
203         #socket sending
204         send_data_to_socket = SendData()
205         send_data_to_socket.setup_server_sending()
206
207         #Converterclass
208         coordinate_converter = ConvertCoordinates()
209         coordinate_converter.set_camera_resolution((640,480)) ...
210         #camera resolution
211         ...
212         coordinate_converter.set_eye_center_offset_from_screen(-10) ...
213         # distance to fictive eye center behind monitor
214         coordinate_converter.set_mode('3D')
215         # coordinate_converter.set_xyz(50,50,1000) #default ...
216         point to look at top left looking at head
217         depth_previous = 0.8
```

Below is the start of the while loop that does the detections on the input data from the camera. The camera data is converted to a "numpy" array to be compatible with the Tensorflow detections.

```
214     while True:
215         # Wait for a coherent pair of frames: depth and color
216         frames = pipeline.wait_for_frames()
217         depth_frame = frames.get_depth_frame()
218         color_frame = frames.get_color_frame()
219         if not depth_frame or not color_frame:
220             continue
221
222         # Convert images to numpy arrays
223         depth_image = np.asanyarray(depth_frame.get_data())
224         color_image = np.asanyarray(color_frame.get_data())
```

A list of normalised coordinates 0 to 1 is returned from the function `get_eye_focus_coordinate()` (line 263-273). For visualisation on the live

3.2 Object Detection

video stream with the *"OpenCV"* python package, pixel position as integers was needed. Line 278 to 280 converts the float list to an integer list. A red circle with radius 10pixels was chosen to demonstrate the focus point for the eye prototype. A point 1/3 from the left of the bounding box and 1/3 from the top of the bounding box was chosen as the point where the right eye of faces normally is located and selected as the focus point for the eye prototype.

```
263     box_test = get_eye_focus_coordinate(  
264         image,  
265         np.squeeze(boxes) ,  
266         np.squeeze(classes).astype(np.int32) ,  
267         np.squeeze(scores) ,  
268         category_index ,  
269         use_normalized_coordinates=True ,  
270         max_boxes_to_draw=200 ,  
271         min_score_thresh=.3 ,  
272         agnostic_mode=False)  
273     # print(box_test) #example (0.23469042778015137, ...  
274     0.30845338106155396, 0.7406021952629089, ...  
275     0.5217226147651672)  
  
276     if box_test:  
277         # print(box_test)  
278         box_int_list = [0,0,0,0]  
279         for i in range(4):  
280             box_int_list[i] = int(box_test[i])  
  
281         # 1/3 from the left of the box  
282         x_location = ...  
283         int(((box_int_list[1]-box_int_list[0])*1/3)+box_int_list[0])  
284         #1/3 from the top.  
285         y_location = ...  
286         int(((box_int_list[3]-box_int_list[2])*1/3)+box_int_list[2])
```

The depth sensing capability of the camera is used to derive the location of the detected faces in 3 dimensional space. Line 286 to 295 takes the depth frame from the camera and finds the distance at the X and Y pixel location of the focus point from previous steps in the code. The depth sensor will occasionally return a frame with 0's. Storing the previous distance above 0.01 meter is used so the eyes will not "flicker" between a real focus distance and 0 meter from the camera. If a 0 frame is returned from the depth

3.2 Object Detection

camera the previous depth measurement will be used. This is handled by line 292-295.

```
286         # get depth from realsense camera
287         depth_location = ...
        depth_frame.get_distance(x_location, y_location) # ...
        depth in xx units
288         depth_location_left = ...
        depth_frame.get_distance(x_location, y_location+10)
289         depth_location_right = ...
        depth_frame.get_distance(x_location, y_location-10)
290         depth_location = ...
        np.mean([depth_location,depth_location_right,depth_location_left])
291         # Write some Text
292         if depth_location < 0.01:
293             depth_location = depth_previous
294
295         depth_previous = copy.deepcopy(depth_location)
```

Conversion of the the pixel postion x and y and the depth to the position is sent to the *"coordinate_converter"* class instance in line 316. The converted angle for the eye prototype is then retrieved from the converter class and sent using the *"send_data_to_socket"* class. The sending over network is exception handled with try: except:, so the code does not stop if there is a network problem. There is also a very small sleep delay (line 326 and 330) put in after sending that can be altered to simulate slower detection speed and limit the network usage on detection speeds faster than needed for the eye prototype.

```
316         coordinate_converter.set_xyz (
317             circle_coordinates[0],
318             circle_coordinates[1],
319             depth_location*1000
320         )
321
322         try:
323             str_data_to_send = ...
            coordinate_converter.get_eye_coordinates ()
324             # print(str_data_to_send)
325             ...
            send_data_to_socket.send_data(str_data_to_send)
326             time.sleep(0.05)
327         except Exception:
```

3.2 Object Detection

```
328         # str_data_to_send = ...
        coordinate_converter.get_eye_coordinates()
329         # ...
        send_data_to_socket.send_data(str_data_to_send)
330         time.sleep(0.05)
```

3.2.5 Object Detection Coordinate Conversions

Full code can be viewed in this projects repository [12] and appendix B. Main parts and calculations will be described in this sub chapter.

Eye Prototype Angle Calculations

The eye prototype is explained in more detail in section 3.4. Shortly explained it is visualizing 3D object of eyes that it rotates a camera around to angles given to the prototype's code. These angles are what is calculated from the object detection pixel position and depth.

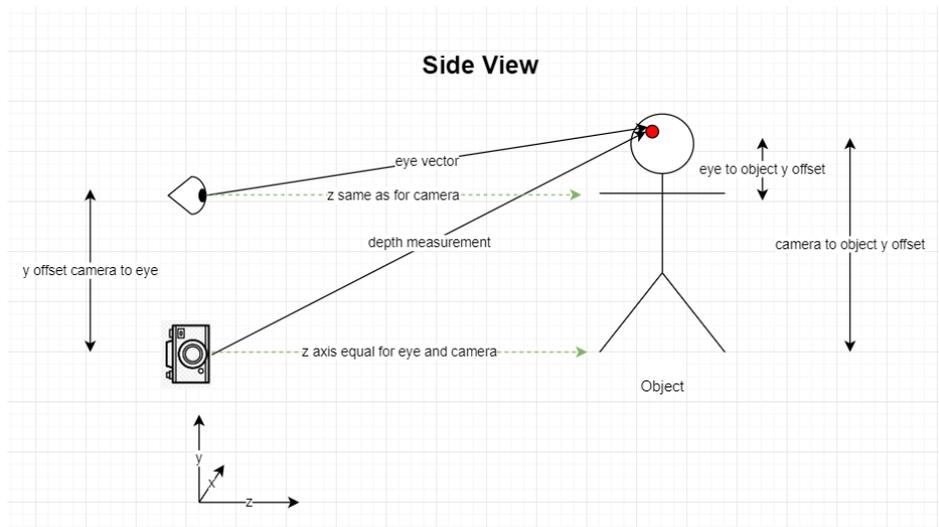


Figure 3.2: Sideview of the measurements and calculated distances used in calculation of eye Y angle

3.2 Object Detection

Since the camera has a specific field of view, the distance and pixel location to the detection there is enough information to calculate a three dimensional position vector (X, Y, Z). First the amount of pixels per degree of field of view is calculated. From that variable the degrees from center or edge of image can be calculated. Since the distance is measured it will be the hypotenuse in this trigonometry. The distance from from the coordinate system centers can then be measured in the side view plane (seen in Figure 3.2) and top down view plane. Lines 74-88 in *"coordinate_converter.py"* calculates the x, y and z displacement of the object from the camera reference.

```
74     pix_per_degree_x = ...
       self.__camera_resolution[0]/self.__fov_x
75     degrees_from_left = x / pix_per_degree_x
76     degrees_from_center = degrees_from_left - ...
       (self.__fov_x/2)
77     x_distance_from_center_mm = \
78     math.sin(math.radians(degrees_from_center)) * ...
depth
79     z_distance_from_center_mm = \
80     math.cos(math.radians(degrees_from_center))* depth
81     z_distance_from_center_mm = \
82     z_distance_from_center_mm - ...
       self.__camera_to_between_eyes_offset_z
83
84     pix_per_degree_y = ...
       self.__camera_resolution[1]/self.__fov_y
85     degrees_from_top = y / pix_per_degree_y
86     degrees_from_center = degrees_from_top - ...
       (self.__fov_y/2)
87     y_distance_from_center_mm = \
88     ...
       math.sin(math.radians(degrees_from_center)) * depth
```

When the x, y and z position relative to the camera is found the eye offsets from the camera can be taken into account and results in two sides of the triangle available and the angle can be found in the two planes mentioned above. The z distance in the coordinate system is the same for camera and eyes. If it is not the same a z offset variable can be set in the code. The *"eye to object y offset"* distance in figure 3.2 is the other length needed to find the angle to object relative to the z axis. The y direction angle is the same for both eyes when camera and prototype head is put in the same

3.3 Transfer of Detection

horizontal orientation. The x (sideways) angles will not be the same and need to be calculated individually. This is done in line 99 to 103.

Individual y angles for left and right eye is calculated in this code. This is done for future applications where camera and head might be positioned in different coordinate systems relative to the camera and the heads straight ahead z axis.

```
91     #x and y coordinates relative to eye positions
92     left_eye_x = x_distance_from_center_mm - ...
    self.__eye_offset_L_x
93     left_eye_y = y_distance_from_center_mm - ...
    self.__eye_offset_L_y
94
95     right_eye_x = x_distance_from_center_mm - ...
    self.__eye_offset_R_x
96     right_eye_y = y_distance_from_center_mm - ...
    self.__eye_offset_R_y
97
98
99     left_eye_x_angle = ...
    math.asin(left_eye_x/z_distance_from_center_mm)
100    left_eye_y_angle = ...
    math.asin(left_eye_y/z_distance_from_center_mm)
101
102    right_eye_x_angle = ...
    math.asin(right_eye_x/z_distance_from_center_mm)
103    right_eye_y_angle = ...
    math.asin(right_eye_y/z_distance_from_center_mm)
```

3.3 Transfer of Detection

The eye prototype uses hardware which is designed for Raspberry Pi 3. This model of Raspberry Pi is not as powerful as the newer version of Raspberry Pi 4 or other computers. A laptop or a Raspberry Pi 4 was used as the computing system to run the object detection. Due to the object detection being run on an external system and the eye prototype not easily ported to another system, code for transferring and receiving data was developed. This section describes the classes for sending and receiving data over cables or wireless network. [6] [12]

3.3 Transfer of Detection

One class for sending data and one class for receiving data was developed.

3.3.1 Send Data

The class `SendData()` in `send.py` sets up a server for sending data. The way of using this class is to initialize it with the built in method `setup_server_sending`. The class has some hardcoded defaults for ip and port that was used, but they can be set with the setters; `set_host_ip('ip address')` and `set_port(port number)`.

```
0 import socket
1 import numpy as np
2 import time
3
4
5 class SendData():
```

```
18     def __init__(self) -> None:
19         self.__host = '192.168.191.125' # loopback ...
20         interface address (localhost)
21         self.__port = 65432 # Port to listen on ...
22         (non-privileged ports are > 1023)
23         self.__socket = socket.socket(socket.AF_INET, ...
24         socket.SOCK_STREAM)
25         self.__connection = None
26         self.__address = None
27
28     def setup_server_sending(self):
29         print("Server Started waiting for client to ...
30         connect ")
31         self.__socket.bind((self.__host, self.__port))
32         self.__socket.listen(5)
33         self.__connection, self.__address = ...
34         self.__socket.accept()
35         print('Connected to', self.__address)
36
37     def send_data(self,my_data):
38         # my_data = f'{self.__eyeX},{self.__eyeY}'
39         # print(my_data)
40         my_data_bytes = bytes(my_data, 'utf-8')
41         # print('length of bytes: ', len(my_data_bytes))
42         self.__connection.send(my_data_bytes)
```

3.3 Transfer of Detection

```
38
39     def set_host_ip(self, ip):
40         #set host ip as string '192.168.1.1'
41         self.__host = ip
42
43     def set_port(self, port):
44         #set port as int
45         self.__port
```

3.3.2 Receive Data

The class *"RecieveData()"* in *"obj_detection_data_socket.py"* connects to a socket server for receiving data. This class is used on the hardware for the eye prototype for receiving data. Details on the use of the external data can be viewed in section 3.4.

This class uses the python standard library *"socket"*. [17] This module provides access to the BSD socket interface.

```
0 import socket
1
2 class RecieveData():
3     """
4     Class that starts a socket connection and recieves eye ...
5     coordinates
6     for eye simulator to use
7     """
8     def __init__(self):
9         self.__host = '192.168.191.125'
10        self.__port = 65432
11        self.__eyeXR = 30
12        self.__eyeYR = 30
13        self.__eyeXL = 30
14        self.__eyeYL = 30
15        self.__socket = socket.socket(socket.AF_INET, ...
16        socket.SOCK_STREAM)
17        self.__connected_to_socket = False
```

"RecieveData()" is used by initializing it with the *"connect_to_server()"* method. The connection is set in an try except clause in case the server

3.3 Transfer of Detection

is not set up. The code and eye simulation would terminate and the code would need restart if this was not exception handled.

```
22
23     def connect_to_server(self):
24         try:
25             self.__socket = socket.socket(socket.AF_INET, ...
socket.SOCK_STREAM)
26             self.__socket.connect((self.__host, self.__port))
27             self.__connected_to_socket = True
28         except:
29             self.__connected_to_socket = False
30
31     def get_data_from_connection(self):
32         data = self.__socket.recv(1024).decode('utf-8')
```

The connection can be closed using the `"close_connection()"` method

```
50     def close_socket(self):
51         self.__socket.shutdown()
52         self.__socket.close()
```

Default class IP address and port number can be overwritten with the setter methods `"set_host_ip('enter ip address as string')"` and `"set_host_port('set host port as integer')"`.

```
60     def set_host_ip(self, host_ip):
61         # Set host ip as string: example: '192.168.2.1'
62         self.__host = host_ip
63
64     def set_host_port(self, host_port):
65         # Set host port as integer: example: 65432
66         self.__port = host_port
```

Static IP set on the host and client on the cabled network interfaces creates little need of editing these settings.

3.4 Eye Simulator

3.4 Eye Simulator

As explained in section 2.3.1 Laerdal Medical has a prototype made of eyes using LCD monitors. This section explains in detail the modifications and some general functions of the prototype that is built on the Adafruit LCD monitors and code.[2]

3.4.1 Edge Device

The edge device the eye prototype uses is a Raspberry Pi 3B. [6] This lacks the processing power to run the object detection. It has a memory card with its operating system on. This card can be inserted in a computer and the "*Pi_eyes*" code can be updated there. [3] It is also possible to set up the Raspberry Pi to be accessed via SSH and edits can be done to the code and eye prototype directly while the Raspberry Pi is running.

3.4.2 Modifications on Premade Eye Prototype Code

The code for the eye simulation was originally developed by the company that makes the LCD monitors and then modified by Laerdal Medical's application with a joystick and selection switch and button. [2] [3] The github repository for the eyes [3] includes a couple of modules and eye texture maps that can be modified for preferred look. For this project only the "*eyes.py*" code was modified. The "*obj_detection_data_socket.py*" containing the "*RecieveData()*" class was added to the prototype for receiving eye angles and used in the "*eyes.py*" script .

Modified dependency imports can be seen in the code snippet below:

```
28 # for object detection use
29 from obj_detection_data_socket import RecieveData
30 import threading
31 import queue
```

Lines 337 to 345 initialize the receiving data class "*RecieveData()*", the

3.4 Eye Simulator

shared queue ("*dnn_queue*") between threads that contain the eye angles from the object detection, initial eye angles for second monitor (prototypes left eye) and the previous eye angles written to the monitors. The previous angles are used to keep the eyes at the same position and allowing for the eye animation winking to continue until a new angle is received from the object detection.

```
337 # initialize socket class, used if option 6 is selected.
338 eye_coordinate_socket = RecieveData()
339 dnn_queue = queue.Queue()
340 curX2 = 20
341 curY2 = 20
342 last_x = 0
343 last_y = 0
344 last_x2 = 0
345 last_y2 = 0
```

The function that does the eye position updates "*frame(p)*" uses global variables defined earlier in the script. New global variables were added; "*curX2, curY2*" in line 349 and lines 372 to 377 in snippet below. "*curX, curY, curX2 and curY2*" are the eye angles for right and left eye respectively.

```
347 # Generate one frame of imagery
348 def frame(p):
349     global startX, startY, destX, destY, curX, curY, ...
        curX2, curY2
350     global startXR, startYR, destXR, destYR, curXR, curYR
351     global moveDuration, holdDuration, startTime, isMoving
352     global moveDurationR, holdDurationR, startTimeR, isMovingR
353     global frames
354     global leftIris, rightIris
355     global pupilMinPts, pupilMaxPts, irisPts, irisZ
356     global leftEye, rightEye
357     global leftUpperEyelid, leftLowerEyelid, ...
        rightUpperEyelid, rightLowerEyelid
358     global upperLidOpenPts, upperLidClosedPts, ...
        lowerLidOpenPts, lowerLidClosedPts
359     global upperLidEdgePts, lowerLidEdgePts
360     global prevLeftUpperLidPts, prevLeftLowerLidPts, ...
        prevRightUpperLidPts, prevRightLowerLidPts
361     global leftUpperEyelid, leftLowerEyelid, ...
        rightUpperEyelid, rightLowerEyelid
```

3.4 Eye Simulator

```
362     global prevLeftUpperLidWeight, prevLeftLowerLidWeight, ...
      prevRightUpperLidWeight, prevRightLowerLidWeight
363     global prevPupilScale
364     global irisRegenThreshold, upperLidRegenThreshold, ...
      lowerLidRegenThreshold
365     global luRegen, llRegen, ruRegen, rlRegen
366     global timeOfLastBlink, timeToNextBlink
367     global blinkStateLeft, blinkStateRight
368     global blinkDurationLeft, blinkDurationRight
369     global blinkStartTimeLeft, blinkStartTimeRight
370     global trackingPos
371     global trackingPosR
372     global eye_coordinate_socket
373     global dnn_queue
374     global last_x
375     global last_y
376     global last_x2
377     global last_y2
```

In line 603 there is an if statement that will activate if the switch is set into position 6. This is the mode that uses the object detection angles. It uses the same rotation functions in the prototype if the the switch position is set to other positions than 6. When position 6 is set it writes the individual independent positions for the calculated eye angles in line 622 to 638

```
603     if GPIO != 6:
604         convergence = 2.0
605
606         rightIris.rotateToX(curY)
607         rightIris.rotateToY(curX - convergence)
608         rightIris.draw()
609         rightEye.rotateToX(curY)
610         rightEye.rotateToY(curX - convergence)
611         rightEye.draw()
612
613         # Left eye (on screen right)
614
615         leftIris.rotateToX(curY)
616         leftIris.rotateToY(curX + convergence)
617         leftIris.draw()
618         leftEye.rotateToX(curY)
619         leftEye.rotateToY(curX + convergence)
620         leftEye.draw()
621     else:
622         convergence = 0
623
```

3.4 Eye Simulator

```
624     rightIris.rotateToX(curY)
625     rightIris.rotateToY(curX - convergence)
626     rightIris.draw()
627     rightEye.rotateToX(curY)
628     rightEye.rotateToY(curX - convergence)
629     rightEye.draw()
630
631     # Left eye (on screen right)
632
633     leftIris.rotateToX(curY2)
634     leftIris.rotateToY(curX2 + convergence)
635     leftIris.draw()
636     leftEye.rotateToX(curY2)
637     leftEye.rotateToY(curX2 + convergence)
638     leftEye.draw()
```

A new function was made for the intent of receiving the data and being applicable for use in another thread. The threading was implemented to let the animation of the eyes continue winking instead of appearing frozen waiting for inputs from the object detection.

A global queue ("*dnn_queue*") is used for holding angles for the eyes. The function "*frame(p)*" uses the same queue for popping out the first(oldest) angles and updating the eye angles. The eye animation is fast enough to pop the angles quickly and no pile ups of data in the queue was experienced in this project.

The function "*fill_queue()*" has a continuous loop running that checks if the switch is set to position 6 (object detection mode). If it is set to that position it will try to setup connection over the network. If it is not successful it will try continuously until it succeeds.

```
652 def fill_queue():
653     global dnn_queue
654     global eye_coordinate_socket
655     global curX, curY, curX2, curY2
656
657     while True:
658         if checkGPIO() == 6:
659             #modified for test of eye tracking
660             # AUTOBLINK = False #disables blinking
661             try:
662                 if not ...
```

3.4 Eye Simulator

```
        eye_coordinate_socket.get_socket_connected_status():
663             eye_coordinate_socket.connect_to_server()
664         except Exception:
665             ...
        eye_coordinate_socket.set_socket_connected_status(False)
666
667         try:
668             ext_curX, ext_curY, ext_curX2, ext_curY2 = ...
        eye_coordinate_socket.get_eye_coordinates_float()
669             dnn_queue.put((ext_curX, ext_curY, ...
        ext_curX2, ext_curY2))
670
671         except Exception as e:
672             ...
        eye_coordinate_socket.set_socket_connected_status(False) ...
673
674             print(f'failed to get datafrom socket and ...
        put to queue: {e}')
674
675         if checkGPIO() != 6 and ...
        eye_coordinate_socket.get_socket_connected_status():
676             ...
        eye_coordinate_socket.set_socket_connected_status(False)
677         try:
678             eye_coordinate_socket.close_socket()
679         except Exception:
680             pass
681         time.sleep(2)
```

Line 709 to 712 sets up the *"fill_queue()"* function for multi-threading. It will run in the background and populate the *"dnn_queue"* queue when it receives new data from over the network from the object detection algorithm.

```
709 #MAKE THREAD FOR EXTERNAL DATA AND START IT.
710 get_data_thread = threading.Thread(target=fill_queue)
711 get_data_thread.daemon = True
712 get_data_thread.start()
```

The main loop of the eye prototype can be seen below on lines 717 to 734. The thread that receives data will run threaded with this loop. The updated drawing of the the eyes on the monitor happens on line 730. When that function is called it checks for the switch position. If it is set to object detection mode 6 it will pop the *"dnn_queue"* for updates to the eye angles

3.5 Object Detection Eye Prototype Files in Project

to use. If there is no data in the queue it keeps updating with the latest received.

The other parts of this main loop is related to the possibility of having a light sensor that corrects the pupil size. In this implementation without that sensor it will only vary it randomly.

```
716 # MAIN LOOP -- runs continuously ...
-----
717 while True:
718
719     if PUPIL_IN ≥ 0: # Pupil scale from sensor
720         v = bonnet.channel[PUPIL_IN].value
721         # If you need to calibrate PUPIL_MIN and MAX,
722         # add a 'print v' here for testing.
723         if v < PUPIL_MIN: v = PUPIL_MIN
724         elif v > PUPIL_MAX: v = PUPIL_MAX
725         # Scale to 0.0 to 1.0:
726         v = (v - PUPIL_MIN) / (PUPIL_MAX - PUPIL_MIN)
727         if PUPIL_SMOOTH > 0:
728             v = ((currentPupilScale * (PUPIL_SMOOTH - 1) + ...
729                 v) /
730                    PUPIL_SMOOTH)
731         else: # Fractal auto pupil scale
732             v = random.random()
733             split(currentPupilScale, v, 4.0, 1.0)
734         currentPupilScale = v
```

3.5 Object Detection Eye Prototype Files in Project

The files in the project can be seen in the figure 3.3 below. There are additional files in the repository, but they are related to custom training of an object detection network. [12]

3.6 Code Tests

```
|   .gitignore
|   README.md
|
+---rasppi3
|   eyes.py
|   obj_detection_data_socket.py
|
\---rasppi4
|   coordinate_converter.py
|   inference_usbCam_face.py
|   send.py
|
+---model
|   frozen_inference_graph_face.pb
|
+---protos
|   |   face_label_map.pbtxt
|   |   string_int_label_map_pb2.py
|
+---utils
|   |   label_map_util.py
|   |   visualization_utils_color.py
```

Figure 3.3: File Tree of The Project

3.6 Code Tests

The individual classes and modified scripts were tested with test functions inside the .py files themselves. Unit tests were not set up for this projects as the modifications implemented small parts of the overall existing code and the individual classes and communication was simple to verify. Good practice would be to implement unit tests should this eye prototype be implemented in a larger system in the SimMan Patient Simulator.[15]

Chapter 4

Experiments, Results and Discussion

4.1 Experiments

This sections explains the experiments done to verify functionality of the object detection eye simulator prototype created in this project.

Three experiments were designed to verify the functionality of the object detection eye prototype in this project.

1. Single Person Tracking
2. Single Person Tracking with Multiple People Visible
3. Single Person Tracking Multiple Camera Position

The target person moved to 9 predefined positions (Figure 4.1), a screen capture of the object detection and a photo towards the prototype from the target person was done to confirm if the target was detected and if the eyes was properly angled at the target.

4.1 Experiments

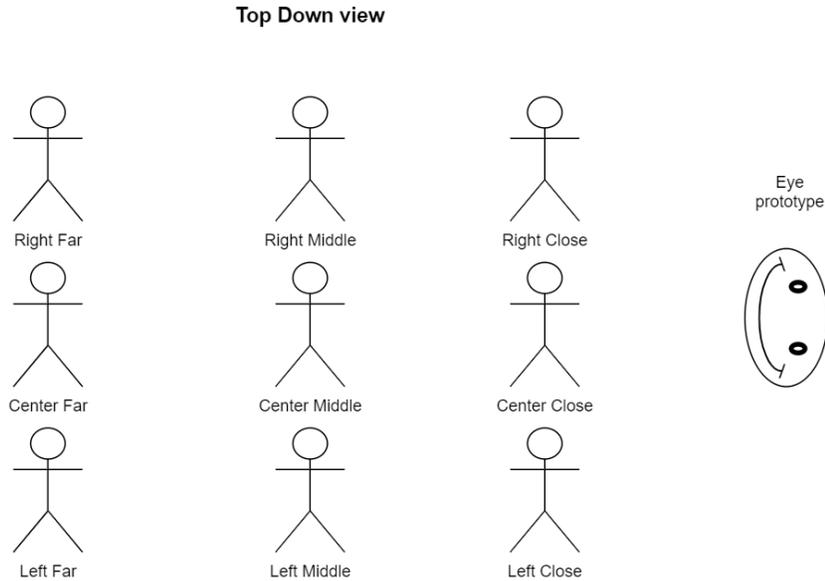


Figure 4.1: Positions For Target Person During All Experiments

Single Person Tracking

In the **Single Person Tracking** experiment the camera was set close under the prototype and a single person was moving around its field of view.

The person moving around held a camera and took pictures from the different positions it moved to for documentation on how the eyes orient. See Figure 4.1

A laptop ran the object detection with screen recording to document the face tracking.

A table for each experiment was filled out for the different positions a target was in and to record if there was a position that the object detection or eye tracking was less accurate at.

4.2 Results and Discussion

The person that was set as the target objective moved to 9 positions relative to the eye prototypes perspective; Left, Middle and Right at distances Close, Middle and Far. The metrics for these experiments was if the object detection detects the face of the target person and if the target person perceive that the eye prototype has eye contact.

Single Person Tracking with Multiple Persons Visible

The **Single Person Tracking with Multiple Persons Visible** experiment was conducted in the same way as the **Single Person Tracking** experiment. The difference was that there was multiple people visible in the field of view for the camera.

Single Person Tracking Multiple Camera Position

In the **Single Person Tracking Multiple Camera Position** experiment the camera was moved to different positions relative to the prototype head and relative position was updated in the *"coordinate_converter.py"*. The single target person moved to the same relative positions to the camera as in the other two experiments

4.2 Results and Discussion

All positions in the "Position" Column is from the Eye Prototype's perspective looking towards the target person.

The grading for the object detection and eye tracking was set to OK or Not OK. Not OK did not mean that it was very wrong, but there was not an impression of good eye contact. For object detection it was set to OK if the object detection detected and selected the right target face to focus on at the positions for the test.

4.2 Results and Discussion

4.2.1 Single Person Tracking

Table 4.1: Results - Single Person Tracking

Position	Object Detection	Eye Tracking
Left Close	OK	OK
Left Middle	OK	OK
Left Far	OK	OK
Center Close	OK	OK
Center Middle	OK	OK
Center Far	OK	OK
Right Close	OK	Not OK
Right Middle	OK	OK
Right Far	OK	OK

Experiment 1

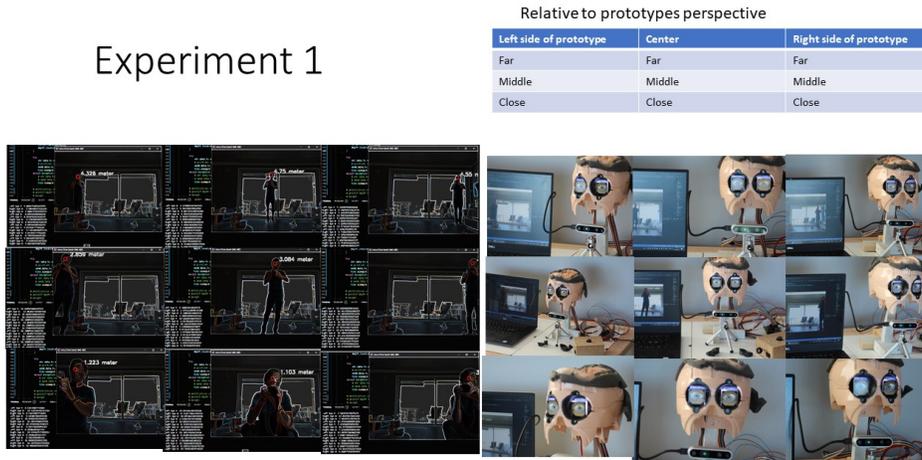


Figure 4.2: Single Person Tracking

Discussion

Tracking a single person in the field of view and directing the eyes towards the person was successful. The object detection had no problem in any

4.2 Results and Discussion

of the positions tested. The eye tracking was following the target person well, but looked to the side of the target when the target was close to the right side of the prototypes perspective. See details on the results in Figure 4.2 above. Reasons for the eye tracking not being perfect can be from misalignment and measurement error of the camera position and rotation relative to the eyes.

4.2.2 Single Person Tracking with Multiple Persons Visible

Table 4.2: Results - Single Person Tracking with Multiple Persons Visible

Position	Object Detection	Eye Tracking
Left Close	Not OK	Not OK
Left Middle	Not OK	Not OK
Left Far	Not OK	Not OK
Center Close	OK	OK
Center Middle	Not OK	OK
Center Far	Not OK	OK
Right Close	OK	OK
Right Middle	OK	OK
Right Far	OK	OK

4.2 Results and Discussion

Experiment 2

Relative to prototypes perspective

Left side of prototype	Center	Right side of prototype
Far	Far	Far
Middle	Middle	Middle
Close	Close	Close



Figure 4.3: Single Person Tracking Multiple Persons Visible

Discussion

Tracking a single target person when there was multiple people in the camera's field of view was not successful. This was as expected as there was not implemented any logic in the code to handle this case. As in the experiment in section 4.1 the object detection works on faces and when the right target face was detected it was able to direct the eyes properly towards the target.

Photos and screen captures from the experiment can be seen in the Figure 4.3 above.

4.2.3 Single Person Tracking Multiple Camera Position

Camera Position 1

First change in camera position was in the same x (lateral sideways) location, but moved further back in the z (lateral backwards) orientation and moved higher in the y (vertical) orientation.

4.2 Results and Discussion

The camera was located directly behind the prototype so no X shift in position. It was 73 cm behind(Z) and 32 cm above(Y) the center of the eyes. See figure 4.4 for an illustration of the position marked by the red arrow.

Table 4.3: Results - Single Person* Tracking Multiple Camera Position 1

Position	Object Detection	Eye Tracking
Left Close	OK	OK
Left Middle	OK	Not OK
Left Far	OK	OK
Center Close	OK	Not OK
Center Middle	OK	Not OK
Center Far	Not OK*	Not OK
Right Close	OK	Not OK
Right Middle	OK	OK
Right Far	OK	OK

Experiment 3_1
1 meter back and up

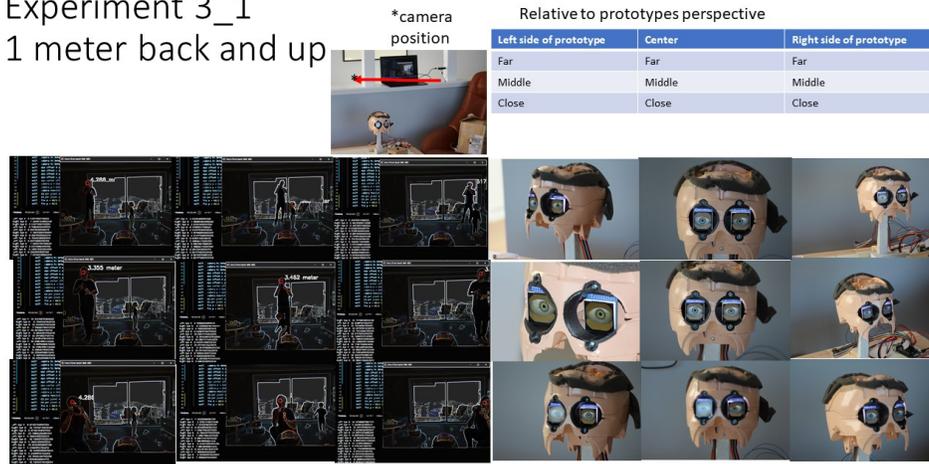


Figure 4.4: Single Person Tracking Multiple Camera Position

* The target person had a small visitor in the field of view that influenced the center far position object detection. Logic for handling multiple faces or objects will be needed in a case like this.

4.2 Results and Discussion

Discussion

The benefit of moving the camera behind the eye prototype is a larger field of vision directly ahead of the eye prototype. For future applications together with the full patient simulator it could be an idea to position the camera higher up and to one end of the room for full overview of people inside it. This will create some challenges in needing good transformations on the detected positions to where the eyes should be angled. If the patient simulator is moved during simulations the transformations will need to be updated. On board sensors for head orientation and potentially using the camera for detecting the patient simulator head position in the room can be sufficient in updating flexible transformations.

Camera Position 2

Second change in camera position was 83 cm to the left of the prototype (lateral sideways) location, 73 cm behind the prototype in z(lateral backwards/forwards) orientation and same y (vertical 32cm above) location as the experiments in section 4.2.3 camera position 1. See figure 4.5 for an image of the position relative to the eye prototype.

Table 4.4: Results - Single Person Tracking Multiple Camera Position 2

Position	Object Detection	Eye Tracking
Left Close	OK	OK
Left Middle	OK	Not OK
Left Far	OK	OK
Center Close	OK	Not OK
Center Middle	OK	Not OK
Center Far	OK	Not OK
Right Close	OK	Not OK
Right Middle	OK	Not OK
Right Far	OK	OK

4.2 Results and Discussion

Experiment 3_2
1 meter back and up
1 meter to eyes left

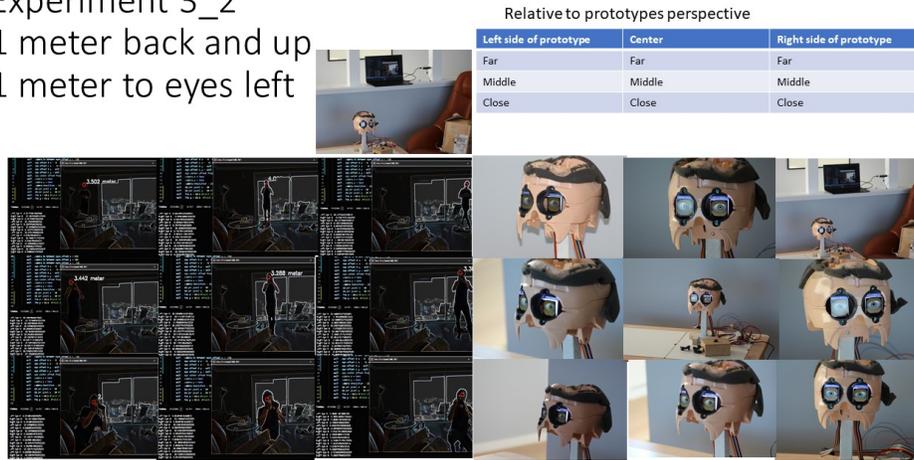


Figure 4.5: Single Person Tracking Multiple Camera Position

Discussion

Object detection worked well in all experiments. It only struggled in some positions when the camera for documenting eye tracking was held up to the face of the target person. Eye tracking on most of the positions in this camera position was not accurate. This can come from angulation and measurement offsets of the camera to between eyes of prototype not being correct. More work and experiments on the camera positions relative to eyes and the calculated angle for the eyes is needed to determine why the tracking failed in most of the predetermined positions for this test.

Chapter 5

Conclusion

This object detection eye prototype worked well on a single person in the field of view. It lacks logic for handling multiple objects. The depth camera and the LCD eyes worked well to make a realistic simulation of eyes keeping eye contact with a target person that moves around to different positions and distances.

The neural networks needed for this application is relatively easy to train and not much novel work needs to be done to train them on different objects. Collecting the datasets and training are the time consuming tasks along with the logic of where the eyes should focus.

Smaller optimised networks can be run with good enough performance for smooth eye tracking on edge devices like Raspberry Pi 4 with the calculation assistance of a USB Accelerator.[18] [5]

5.1 Further Work

5.1 Further Work

To further develop this prototype or for implementation into the SimMan Patient Simulator the list below can be used as a starting point. The items listed are in no particular order.

- Allow for camera positions where camera and head does not point in the same direction
- Object detection networks that detect other items than faces
- Logic to handle multiple different objects detected
- Realistic eye focusing logic
- Optimised network to perform on edge device.
- Upgrade Edge device with TPU device like Coral USB Accelerator. [18]
- Implement eye movement behaviour related to medical symptoms the SimMan Patient Simulator is simulating. [15]
- Work on lenses for the monitor eyes that does not distort the eyes in the monitor they way the current ones do.

Bibliography

- [1] M. Abadi, A. Agarwal, P. Barham, E. Brevdo, Z. Chen, C. Citro, G. S. Corrado, A. Davis, J. Dean, M. Devin, S. Ghemawat, I. Goodfellow, A. Harp, G. Irving, M. Isard, Y. Jia, R. Jozefowicz, L. Kaiser, M. Kudlur, J. Levenberg, D. Mané, R. Monga, S. Moore, D. Murray, C. Olah, M. Schuster, J. Shlens, B. Steiner, I. Sutskever, K. Talwar, P. Tucker, V. Vanhoucke, V. Vasudevan, F. Viégas, O. Vinyals, P. Warden, M. Wattenberg, M. Wicke, Y. Yu, and X. Zheng. TensorFlow: Large-scale machine learning on heterogeneous systems, 2015. Software available from tensorflow.org.
- [2] Adafruit. Adafruit animated snake eyes bonnet for raspberry pi. <https://learn.adafruit.com/animated-snake-eyes-bonnet-for-raspberry-pi>. Accessed: 2021-04-16.
- [3] Adafruit. Pi_eyes (python code for adafruits lcd eye monitors). https://github.com/adafruit/Pi_Eyes/, 2020.
- [4] S. Bozinovski. Reminder of the first paper on transfer learning in neural networks, 1976. *Informatika 44*, 291–302, 2020.
- [5] E. Electronics. Raspberry pi 3 and 4 performance comparrison. <https://www.youtube.com/watch?v=TiOKv0rYNI&t=216s>. Accessed: 2021-04-23.
- [6] R. P. Foundation. Rasperry pi 3 mode b+. <https://www.raspberrypi.org/products/raspberry-pi-3-model-b-plus/>. Accessed: 2021-04-16.

BIBLIOGRAPHY

- [7] K. Fukushima. Neocognitron: A self-organizing neural network model for a mechanism of pattern recognition unaffected by shift in position. *Biological cybernetics*, 36(4):193–202, 1980.
- [8] S. S. Haykin. *Neural networks and learning machines*. Pearson Education, Upper Saddle River, NJ, third edition, 2009.
- [9] A. G. Howard, M. Zhu, B. Chen, D. Kalenichenko, W. Wang, T. Weyand, M. Andreetto, and H. Adam. Mobilenets: Efficient convolutional neural networks for mobile vision applications. *CoRR*, abs/1704.04861, 2017.
- [10] Intel. Intel realsense depth camera d435. <https://www.intelrealsense.com/depth-camera-d435/>. Accessed: 2021-04-16.
- [11] Intel. Python wrapper for intel realsense sdk 2.0. <https://pypi.org/project/pyrealsense2/>. Accessed: 2021-05-06.
- [12] J. Kunnas. person_event-detect-recognition. https://github.com/jkunnas58/person_event-detect-recognition, 2021.
- [13] Y. Lecun, L. Bottou, Y. Bengio, and P. Haffner. Gradient-based learning applied to document recognition. *Proceedings of the IEEE*, 86(11):2278–2324, 1998.
- [14] W. Liu, D. Anguelov, D. Erhan, C. Szegedy, S. Reed, C.-Y. Fu, and A. C. Berg. Ssd: Single shot multibox detector. *Lecture Notes in Computer Science*, page 21–37, 2016.
- [15] L. Medical. Laerdal’s patient simulator simman 3g plus. <https://laerdal.com/products/simulation-training/emergency-care-trauma/simman-3g/>. Accessed: 2021-04-16.
- [16] U. Michelucci. *Applied Deep Learning: A Case-Based Approach to Understanding Deep Neural Networks*. Apress, USA, 1st edition, 2018.
- [17] Python. Socket - python standard library. <https://docs.python.org/3/library/socket.html>. Accessed: 2021-04-22.
- [18] G. Research. Coral tpu usb accelerator. <https://coral.ai/products/accelerator>. Accessed: 2021-04-23.
- [19] L. Vladimirov. Tensorflow object detection api tutorial. <https://tensorflow-object-detection-api-tutorial.readthedocs.io/en/latest/index.html#>. Accessed: 2021-04-18.

BIBLIOGRAPHY

- [20] S. Yang, P. Luo, C. C. Loy, and X. Tang. Wider face: A face detection benchmark. In *IEEE Conference on Computer Vision and Pattern Recognition (CVPR)*, 2016.
- [21] yeephycho. tensorflow-face-detection. <https://github.com/yeephycho/tensorflow-face-detection>, 2020.

Appendix A

Object Detection Code

```
0  #!/usr/bin/python
1  # -*- coding: utf-8 -*-
2  # pylint: disable=C0103
3  # pylint: disable=E1101
4
5  from os import X_OK
6  import sys
7  import time
8  import numpy as np
9  import tensorflow as tf
10 import cv2
11 import collections
12 import six
13 import PIL.Image as Image
14 import pyrealsense2 as rs
15 from utils import label_map_util
16 from utils import visualization_utils_color as vis_util
17 from send import SendData
18 from coordinate_converter import ConvertCoordinates
19 import copy
20
21
22 # Path to frozen detection graph. This is the actual model ...
    that is used for the object detection.
23 PATH_TO_CKPT = './model/frozen_inference_graph_face.pb'
24 PATH_TO_CKPT = ...
    r"C:\dev\tensorflow\workspace\tensorflow-face-detection-master\model\frozen_inferenc
25
```

Object Detection Code

```
26 # List of the strings that is used to add correct label ...
    for each box.
27 PATH_TO_LABELS = './protos/face_label_map.pbtxt'
28 PATH_TO_LABELS = ...
    r"C:\dev\tensorflow\workspace\tensorflow-face-detection-master\protos\face_label_map
29
30 NUM_CLASSES = 2
31
32 label_map = label_map_util.load_labelmap(PATH_TO_LABELS)
33 categories = ...
    label_map_util.convert_label_map_to_categories(label_map, ...
    max_num_classes=NUM_CLASSES, use_display_name=True)
34 category_index = ...
    label_map_util.create_category_index(categories)
35
36
37 def get_eye_focus_coordinate(
38     image,
39     boxes,
40     classes,
41     scores,
42     category_index,
43     instance_masks=None,
44     instance_boundaries=None,
45     keypoints=None,
46     keypoint_scores=None,
47     keypoint_edges=None,
48     track_ids=None,
49     use_normalized_coordinates=False,
50     max_boxes_to_draw=20,
51     min_score_thresh=.5,
52     agnostic_mode=False,
53     line_thickness=4,
54     mask_alpha=.4,
55     groundtruth_box_visualization_color='black',
56     skip_boxes=False,
57     skip_scores=False,
58     skip_labels=False,
59     skip_track_ids=False):
60     """
61
62     """
63     # Create a display string (and color) for every box ...
    location, group any boxes
64 # that correspond to the same location.
65 box_to_display_str_map = collections.defaultdict(list)
66 box_to_color_map = collections.defaultdict(str)
67 box_to_instance_masks_map = {}
68 box_to_keypoints_map = collections.defaultdict(list)
```

Object Detection Code

```
69     if not max_boxes_to_draw:
70         max_boxes_to_draw = boxes.shape[0]
71     for i in range(min(max_boxes_to_draw, boxes.shape[0])):
72         if scores is None or scores[i] > min_score_thresh:
73             box = tuple(boxes[i].tolist())
74             if instance_masks is not None:
75                 box_to_instance_masks_map[box] = ...
76             instance_masks[i]
77             if keypoints is not None:
78                 box_to_keypoints_map[box].extend(keypoints[i])
79             if scores is None:
80                 box_to_color_map[box] = 'black'
81             else:
82                 if not agnostic_mode:
83                     if classes[i] in category_index.keys():
84                         class_name = ...
85                         category_index[classes[i]]['name']
86                     else:
87                         class_name = 'N/A'
88                         display_str = '{}: {}'.format(
89                             class_name,
90                             int(100*scores[i]))
91                     else:
92                         display_str = 'score: ...
93                         {}'.format(int(100 * scores[i]))
94                     ...
95                 box_to_display_str_map[box].append(display_str)
96                 if agnostic_mode:
97                     box_to_color_map[box] = 'DarkOrange'
98                 else:
99                     box_to_color_map[box] = ...
100                 groundtruth_box_visualization_color
101                 #Export location of box in relative or ...
102                 absolute coordinates
103                 image_for_size = ...
104                 Image.fromarray(np.uint8(image)).convert('RGB')
105                 im_width, im_height = image_for_size.size
106                 ymin, xmin, ymax, xmax = box
107                 if use_normalized_coordinates:
108                     (left, right, top, bottom) = (xmin * ...
109                 im_width, xmax * im_width,
110                 ymin * ...
111                 im_height, ymax * im_height)
112                 else:
113                     (left, right, top, bottom) = (xmin, ...
114                 xmax, ymin, ymax)
115                 return (left, right, top, bottom)
116             return False
117
```

Object Detection Code

```
108
109 class TensorflowFaceDetector(object):
110     def __init__(self, PATH_TO_CKPT):
111         """Tensorflow detector
112         """
113
114         self.detection_graph = tf.Graph()
115         with self.detection_graph.as_default():
116             od_graph_def = tf.compat.v1.GraphDef()
117             with tf.io.gfile.GFile(PATH_TO_CKPT, 'rb') as fid:
118                 serialized_graph = fid.read()
119                 od_graph_def.ParseFromString(serialized_graph)
120                 tf.import_graph_def(od_graph_def, name='')
121
122
123         with self.detection_graph.as_default():
124             config = tf.compat.v1.ConfigProto()
125             config.gpu_options.allow_growth = True
126             self.sess = ...
127         tf.compat.v1.Session(graph=self.detection_graph, ...
128         config=config)
129         self.windowNotSet = True
130
131     def run(self, image):
132         """image: bgr image
133         return (boxes, scores, classes, num_detections)
134         """
135
136         image_np = cv2.cvtColor(image, cv2.COLOR_BGR2RGB)
137
138         # the array based representation of the image will ...
139         # be used later in order to prepare the
140         # result image with boxes and labels on it.
141         # Expand dimensions since the model expects images ...
142         # to have shape: [1, None, None, 3]
143         image_np_expanded = np.expand_dims(image_np, axis=0)
144         image_tensor = ...
145         self.detection_graph.get_tensor_by_name('image_tensor:0')
146         # Each box represents a part of the image where a ...
147         # particular object was detected.
148         boxes = ...
149         self.detection_graph.get_tensor_by_name('detection_boxes:0')
150         # Each score represent how level of confidence for ...
151         # each of the objects.
152         # Score is shown on the result image, together ...
153         # with the class label.
154         scores = ...
155         self.detection_graph.get_tensor_by_name('detection_scores:0')
```

Object Detection Code

```
147     classes = ...
148     self.detection_graph.get_tensor_by_name('detection_classes:0')
149     num_detections = ...
150     self.detection_graph.get_tensor_by_name('num_detections:0')
151     # Actual detection.
152     start_time = time.time()
153     (boxes, scores, classes, num_detections) = ...
154     self.sess.run(
155         [boxes, scores, classes, num_detections],
156         feed_dict={image_tensor: image_np_expanded})
157     elapsed_time = time.time() - start_time
158     # print('inference time cost: ...
159     '{}'.format(elapsed_time))
160
161     return (boxes, scores, classes, num_detections)
162
163 if __name__ == "__main__":
164     # import sys
165     # if len(sys.argv) != 2:
166     #     print ("usage:%s (cameraID | filename) Detect faces\
167     # in the video example:%s 0"%(sys.argv[0], sys.argv[0]))
168     #     exit(1)
169
170     # try:
171     #     camID = int(sys.argv[1])
172     # except:
173     #     camID = sys.argv[1]
174
175     camID = 0
176     # Configure depth and color streams
177     pipeline = rs.pipeline()
178     config = rs.config()
179
180     # Get device product line for setting a supporting ...
181     resolution
182     pipeline_wrapper = rs.pipeline_wrapper(pipeline)
183     pipeline_profile = config.resolve(pipeline_wrapper)
184     device = pipeline_profile.get_device()
185     device_product_line = ...
186     str(device.get_info(rs.camera_info.product_line))
187
188     config.enable_stream(rs.stream.depth, 640, 480, ...
189     rs.format.z16, 30)
```

Object Detection Code

```
189     if device_product_line == 'L500':
190         config.enable_stream(rs.stream.color, 960, 540, ...
rs.format.bgr8, 30)
191     else:
192         config.enable_stream(rs.stream.color, 640, 480, ...
rs.format.bgr8, 30)
193
194     # Start streaming
195     pipeline.start(config)
196     tDetector = TensoflowFaceDector(PATH_TO_CKPT)
197
198     cap = cv2.VideoCapture(camID)
199     windowNotSet = True
200
201     #socket sending
202     send_data_to_socket = SendData()
203     send_data_to_socket.setup_server_sending()
204
205     #Converterclass
206     coordinate_converter = ConvertCoordinates()
207     coordinate_converter.set_camera_resolution((640,480)) ...
#camera resolution
208     ...
coordinate_converter.set_eye_center_offset_from_screen(-10) ...
# distance to fictive eye center behind monitor
209     coordinate_converter.set_mode('3D')
210     # coordinate_converter.set_xyz(50,50,1000) #default ...
point to look at top left looking at head
211     depth_previous = 0.8
212
213     while True:
214         # Wait for a coherent pair of frames: depth and color
215         frames = pipeline.wait_for_frames()
216         depth_frame = frames.get_depth_frame()
217         color_frame = frames.get_color_frame()
218         if not depth_frame or not color_frame:
219             continue
220
221         # Convert images to numpy arrays
222         depth_image = np.asanyarray(depth_frame.get_data())
223         color_image = np.asanyarray(color_frame.get_data())
224
225         # Apply colormap on depth image (image must be ...
converted to 8-bit per pixel first)
226         # depth_colormap = ...
cv2.applyColorMap(cv2.convertScaleAbs(depth_image, ...
alpha=0.03), cv2.COLORMAP_JET)
227
228         # depth_colormap_dim = depth_colormap.shape
```

Object Detection Code

```
229         # color_colormap_dim = color_image.shape
230
231         # # If depth and color resolutions are different, ...
232         # resize color image to match depth image for display
233         # if depth_colormap_dim != color_colormap_dim:
234         #     resized_color_image = ...
235         cv2.resize(color_image, dsize=(depth_colormap_dim[1], ...
236         depth_colormap_dim[0]), interpolation=cv2.INTER_AREA)
237         #     images = np.hstack((resized_color_image, ...
238         depth_colormap))
239         # else:
240         #     images = np.hstack((color_image, ...
241         depth_colormap))
242
243         image = color_image
244         image_depth = depth_image
245
246         # ret, image = cap.read()
247         # if ret == 0:
248         #     break
249
250         [h, w] = image.shape[:2]
251         # print (h, w)
252         # image = cv2.flip(image, 1)
253         # print(image.shape)
254         (boxes, scores, classes, num_detections) = ...
255         tDetector.run(image)
256
257         # vis_util.visualize_boxes_and_labels_on_image_array(
258         #     image,
259         #     np.squeeze(boxes),
260         #     np.squeeze(classes).astype(np.int32),
261         #     np.squeeze(scores),
262         #     category_index,
263         #     use_normalized_coordinates=True,
264         #     line_thickness=4)
265
266         box_test = get_eye_focus_coordinate(
267             image,
268             np.squeeze(boxes),
269             np.squeeze(classes).astype(np.int32),
270             np.squeeze(scores),
271             category_index,
272             use_normalized_coordinates=True,
273             max_boxes_to_draw=200,
274             min_score_thresh=.3,
275             agnostic_mode=False)
```

Object Detection Code

```
272     # print(box_test) #example (0.23469042778015137, ...
    0.30845338106155396, 0.7406021952629089, ...
    0.5217226147651672)
273
274
275     if box_test:
276         # print(box_test)
277         box_int_list = [0,0,0,0]
278         for i in range(4):
279             box_int_list[i] = int(box_test[i])
280
281         # 1/3 from the left of the box
282         x_location = ...
    int(((box_int_list[1]-box_int_list[0])*1/3)+box_int_list[0])
283         #1/3 from the top.
284         y_location = ...
    int(((box_int_list[3]-box_int_list[2])*1/3)+box_int_list[2])
285         # get depth from realsense camera
286         depth_location = ...
    depth_frame.get_distance(x_location, y_location) # ...
    depth in xx units
287         depth_location_left = ...
    depth_frame.get_distance(x_location, y_location+10)
288         depth_location_right = ...
    depth_frame.get_distance(x_location, y_location-10)
289         depth_location = ...
    np.mean([depth_location,depth_location_right,depth_location_left])
290         # Write some Text
291         if depth_location < 0.01:
292             depth_location = depth_previous
293
294         depth_previous = copy.deepcopy(depth_location)
295
296         font = cv2.FONT_HERSHEY_SIMPLEX
297         bottomLeftCornerOfText = ...
    (box_int_list[1],box_int_list[2])
298         fontScale = 1
299         fontColor = (255,255,255)
300         lineType = 2
301
302         cv2.putText(image,f'{round(depth_location,3)} ...
    meter',
303                     bottomLeftCornerOfText,
304                     font,
305                     fontScale,
306                     fontColor,
307                     lineType)
308
309
```

Object Detection Code

```
310         circle_radius = 10
311         circle_color = (0,0,255)
312         circle_coordinates = (x_location,y_location)
313         ...
cv2.circle(image,circle_coordinates,circle_radius, ...
circle_color, thickness=-1 )
314
315         coordinate_converter.set_xyz(
316             circle_coordinates[0],
317             circle_coordinates[1],
318             depth_location*1000
319         )
320
321         try:
322             str_data_to_send = ...
coordinate_converter.get_eye_coordinates()
323             # print(str_data_to_send)
324             ...
send_data_to_socket.send_data(str_data_to_send)
325             time.sleep(0.05)
326         except Exception:
327             # str_data_to_send = ...
coordinate_converter.get_eye_coordinates()
328             # ...
send_data_to_socket.send_data(str_data_to_send)
329             time.sleep(0.05)
330
331             # print(circle_coordinates[0], ...
circle_coordinates[1])
332             # print(f'depth to focus point {depth_location}')
333             # except:
334             #     print('passed')
335         else:
336             # print('no output')
337             pass
338
339
340         if windowNotSet is True:
341             cv2.namedWindow("tensorflow based (%d, %d)" % ...
(w, h), cv2.WINDOW_NORMAL)
342             windowNotSet = False
343
344             cv2.imshow("tensorflow based (%d, %d)" % (w, h), ...
image)
345             k = cv2.waitKey(1) & 0xff
346             if k == ord('q') or k == 27:
347                 break
348
349         cap.release()
```

Object Detection Code

Appendix B

Coordinate Converter Code

```
0 import math
1 import numpy as np
2
3
4 class ConvertCoordinates():
5     """
6     Class that recieves pixel X Y and depth from camera, ...
7     Camera to eye offsets.
8     Converts detected focus point to eye simulator eye X ...
9     and Y position
10    for left and right eye individually in 3D mode.
11
12    Different options of complexity of data conversion ...
13    available:
14
15    2D_simple: uses pixel location as fraction of ...
16    resolution and puts that
17    fraction between -30 and 30 degree eye rotation for x ...
18    and y
19
20    2D: uses pixel location as fraction of resolution and ...
21    puts that
22    fraction between -30 and 30 degree eye rotation for x ...
23    and y PLUS takes
24    into account depth for prominence calculation
25
26    3D: calculate individual eye rotation to be properly ...
27    oriented to detected
```

Coordinate Converter Code

```
20     object
21
22
23     coordinate system has xyz 0 at camera.
24     positive directions references from doll heads perspective
25     x+ right, y+up. z+ away from head in eye direction
26
27     Distances in mm millimeter
28
29     center of "fake eye ball" is set at 10mm behind screen.
30     can be changed with __eye_center_offset_from_screen ...
31     variable
32     """
33     def __init__(self) -> None:
34         self.__eyeXR = None
35         self.__eyeYR = None
36         self.__eyeXL = None
37         self.__eyeYL = None
38         self.__mode = ''
39         self.__camera_to_between_eyes_offset_x = 180
40         self.__camera_to_between_eyes_offset_y = -100
41         self.__camera_to_between_eyes_offset_z = -70
42         self.__eye_offset_R_x = 31 + ...
43         self.__camera_to_between_eyes_offset_x
44         self.__eye_offset_L_x = -31 + ...
45         self.__camera_to_between_eyes_offset_x
46         self.__eye_offset_R_y = ...
47         self.__camera_to_between_eyes_offset_y
48         self.__eye_offset_L_y = ...
49         self.__camera_to_between_eyes_offset_y
50         self.__eye_center_offset_from_screen = -10
51         self.__camera_resolution = (640,480)
52         #field of view[degree] horisontal axis ( x) 64 ...
53         from datasheet
54         #field of view[degree] of view vertical axis ( y) ...
55         41 from datasheet
56         self.__fov_x = 64/2
57         self.__fov_y = 41/2
58
59
60     def __calc_eye_coordinates(self,x,y,z):
61         if self.__mode == '3D':
62             self.__calc_3D(x,y,z)
63         elif self.__mode == '2D':
64             self.__calc_2D(x,y,z)
65         else:
66             self.__calc_2D_simple(x,y,z)
```

Coordinate Converter Code

```
62     def __calc_3D(self, x, y, depth):
63         """
64         X pixel for detection object to focus on
65         Y pixel for detection object to focus on
66         depth mm to detected object to focus on
67
68         takes in pixel coordinates and depth and sets eye X,Y
69         rotation (degrees from 0,0 straight ahead)
70         """
71
72         #Calculate X,Y angle relative to eye references
73         pix_per_degree_x = ...
74         self.__camera_resolution[0]/self.__fov_x
75         degrees_from_left = x / pix_per_degree_x
76         degrees_from_center = degrees_from_left - ...
77         (self.__fov_x/2)
78         x_distance_from_center_mm = \
79             math.sin(math.radians(degrees_from_center)) * ...
80         depth
81         z_distance_from_center_mm = \
82             math.cos(math.radians(degrees_from_center))* depth
83         z_distance_from_center_mm = \
84             z_distance_from_center_mm - ...
85         self.__camera_to_between_eyes_offset_z
86
87         pix_per_degree_y = ...
88         self.__camera_resolution[1]/self.__fov_y
89         degrees_from_top = y / pix_per_degree_y
90         degrees_from_center = degrees_from_top - ...
91         (self.__fov_y/2)
92         y_distance_from_center_mm = \
93             ...
94         math.sin(math.radians(degrees_from_center)) * depth
95
96         #x and y coordinates relative to eye positions
97         left_eye_x = x_distance_from_center_mm - ...
98         self.__eye_offset_L_x
99         left_eye_y = y_distance_from_center_mm - ...
100        self.__eye_offset_L_y
101
102        right_eye_x = x_distance_from_center_mm - ...
103        self.__eye_offset_R_x
104        right_eye_y = y_distance_from_center_mm - ...
105        self.__eye_offset_R_y
106
107        left_eye_x_angle = ...
108        math.asin(left_eye_x/z_distance_from_center_mm)
```

Coordinate Converter Code

```
99     left_eye_y_angle = ...
    math.asin(left_eye_y/z_distance_from_center_mm)
100
101     right_eye_x_angle = ...
    math.asin(right_eye_x/z_distance_from_center_mm)
102     right_eye_y_angle = ...
    math.asin(right_eye_y/z_distance_from_center_mm)
103
104
105     self.__eyeXL = math.degrees(left_eye_x_angle)
106     self.__eyeYL = -math.degrees(left_eye_y_angle)
107     self.__eyeXR = math.degrees(right_eye_x_angle)
108     self.__eyeYR = -math.degrees(right_eye_y_angle)
109
110     def print_current_eye_angles(self):
111         print(f'Left Eye X: {self.__eyeXL}')
112         print(f'Left Eye Y: {self.__eyeYL}')
113         print(f'Right Eye X: {self.__eyeXR}')
114         print(f'Right Eye Y: {self.__eyeYR}')
115
116
117     def __calc_2D(self, x,y,z):
118         self.__eyeXR = round(-30 + (x / ...
self.__camera_resolution[0]) * 60, 2)
119         self.__eyeYR = round(-30 + (1-(y / ...
self.__camera_resolution[1])) * 60, 2)
120         self.__eyeXL = self.__eyeXR
121         self.__eyeYL = self.__eyeYR
122
123         # adjust eyes X location when close to head
124         # prominence is the amount of degree you
125         # rotate the eyes towards each other
126         prominence = 10 - ((z/1000)*10)
127         if prominence < 0:
128             prominence = 0
129         if prominence > 10:
130             prominence = 10
131         self.__eyeXR -= prominence
132         self.__eyeXL += prominence
133
134     def __calc_2D_simple(self,x,y,z):
135         self.__eyeXR = round(-30 + (x / ...
self.__camera_resolution[0]) * 60, 2)
136         self.__eyeYR = round(-30 + (1-(y / ...
self.__camera_resolution[1])) * 60, 2)
137         self.__eyeXL = self.__eyeXR
138         self.__eyeYL = self.__eyeYR
139
140     def get_eye_coordinates(self):
```

Coordinate Converter Code

```
141     # returns a ...
142     string:'eye_right_x,eye_right_y,e_left_x,e_left_y'
143     # with coordinates for eyes
144     return ...
145     f'{self.__eyeXR},{self.__eyeYR},{self.__eyeXL},{self.__eyeYL}'
146
147 def set_xyz(self, x , y , z = 1000):
148     self.__calc_eye_coordinates(x,y,z)
149
150 def set_mode(self,mode_str):
151     self.__mode = mode_str
152
153 def set_eye_center_offset_from_screen(self, distance_z):
154     self.__eye_center_offset_from_screen = distance_z
155
156 def set_camera_resolution(self,resolution_tuple):
157     # takes in a tuple in this format (x,y) , (640,480)
158     self.__camera_resolution = resolution_tuple
159
160 def main():
161     print('test')
162
163 if __name__ == '__main__':
164     main()
```

Appendix C

Send Data Code

```
0 import socket
1 import numpy as np
2 import time
3
4
5 class SendData():
6     """
7     Send data class. This class sets up a sending server ...
8     waiting for clients to
9     connect.
10
11     class has a class method that sets up the server in ...
12     setup_server_sending()
13
14     The function send_data(data_to_send) sends the data as ...
15     string in utf-8
16     encoding
17
18     """
19
20     def __init__(self) -> None:
21         self.__host = '192.168.191.125' # loopback ...
22         interface address (localhost)
23         self.__port = 65432 # Port to listen on ...
24         (non-privileged ports are > 1023)
25         self.__socket = socket.socket(socket.AF_INET, ...
26         socket.SOCK_STREAM)
27         self.__connection = None
```

Send Data Code

```
22     self.__address = None
23
24     def setup_server_sending(self):
25         print("Server Started waiting for client to ...
connect ")
26         self.__socket.bind((self.__host, self.__port))
27         self.__socket.listen(5)
28         self.__connection, self.__address = ...
self.__socket.accept()
29         print('Connected to', self.__address)
30
31     def send_data(self, my_data):
32         # my_data = f'{self.__eyeX},{self.__eyeY}'
33         # print(my_data)
34         my_data_bytes = bytes(my_data, 'utf-8')
35         # print('length of bytes: ', len(my_data_bytes))
36         self.__connection.send(my_data_bytes)
37
38     def set_host_ip(self, ip):
39         #set host ip as string '192.168.1.1'
40         self.__host = ip
41
42     def set_port(self, port):
43         #set port as int
44         self.__port
45
46
47 class RandomData():
48
49     def __init__(self) -> None:
50         self.oldtime = time.time()
51         self.x1 = np.random.randint(-30, 30, None)
52         self.y1 = np.random.randint(-30, 30, None)
53
54     def random_data(self):
55         if time.time() - self.oldtime > 2:
56             x1 = np.random.randint(-30, 30, None)         ...
# Dummy eye x
57             y1 = np.random.randint(-30, 30, None)         # ...
Dummy dummy eye y
58         else:
59             x1 = self.x1
60             y1 = self.y1
61
62         return x1, y1
63
64 def main():
65     random_data = RandomData()
66     send_data = SendData()
```

Send Data Code

```
67     send_data.setup_server_sending()
68
69     while True:
70         # eye_x = 0 # 30 left to -30 right looking at ...
the dool
71         # eye_y = 0 # -30 looking down 30 looking up
72         eye_x, eye_y = random_data.random_data()
73         ...
74         send_data.send_data(f'{eye_x},{eye_y},{eye_x},{eye_y}')
75         time.sleep(0.5)
76
77 if __name__ == '__main__':
78     main()
```

Appendix D

Receive Data Code

```
0 import socket
1
2 class RecieveData():
3     """
4     Class that starts a socket connection and recieves eye ...
5     coordinates
6     for eye simulator to use
7     """
8     def __init__(self):
9         self.__host = '192.168.191.125'
10        self.__port = 65432
11        self.__eyeXR = 30
12        self.__eyeYR = 30
13        self.__eyeXL = 30
14        self.__eyeYL = 30
15        self.__socket = socket.socket(socket.AF_INET, ...
16        socket.SOCK_STREAM)
17        self.__connected_to_socket = False
18
19    def process_data_from_server(self,x):
20        self.__eyeXR , self.__eyeYR , self.__eyeXL , ...
21        self.__eyeYL = x.split(",")
22
23    def connect_to_server(self):
24        try:
```

Receive Data Code

```
24         self.__socket = socket.socket(socket.AF_INET, ...
socket.SOCK_STREAM)
25         self.__socket.connect((self.__host, self.__port))
26         self.__connected_to_socket = True
27     except:
28         self.__connected_to_socket = False
29
30     def get_data_from_connection(self):
31         data = self.__socket.recv(1024).decode('utf-8')
32         self.process_data_from_server(data)
33
34
35     def get_eye_coordinates_str(self):
36         self.get_data_from_connection()
37         return self.__eyeXR, \
38                self.__eyeYR, \
39                self.__eyeXL, \
40                self.__eyeYL
41
42     def get_eye_coordinates_float(self):
43         self.get_data_from_connection()
44         return float(self.__eyeXR), \
45                float(self.__eyeYR), \
46                float(self.__eyeXL), \
47                float(self.__eyeYL)
48
49     def close_socket(self):
50         self.__socket.shutdown()
51         self.__socket.close()
52
53     def get_socket_connected_status(self):
54         return self.__connected_to_socket
55
56     def set_socket_connected_status(self, bool):
57         self.__connected_to_socket = bool
58
59     def set_host_ip(self, host_ip):
60         # Set host ip as string: example: '192.168.2.1'
61         self.__host = host_ip
62
63     def set_host_port(self, host_port):
64         # Set host port as integer: example: 65432
65         self.__port = host_port
66
67     def main():
68         eye_coordinates = RecieveData()
69         eye_coordinates.connect_to_server()
70         while True:
```

Receive Data Code

```
71     eyex, eyey, eyex2, eyey2 = ...
    eye_coordinates.get_eye_coordinates_str()
72     print(f'EyeX: {eyex} , EyeY: {eyey}, EyeX2: ...
    {eyex2} , EyeY2: {eyey2}')
73
74 if __name__ == "__main__":
75     while True:
76         main()
```

Appendix E

Eye Prototype Code

```
0 #!/usr/bin/python
1
2 # Code originates from
3 # ...
4     https://learn.adafruit.com/animated-snake-eyes-bonnet-for-raspberry-pi/ ...
5     ...
6 # ... software-installation
7 # https://github.com/adafruit/Pi_Eyes/
8 # Expanded to be controled by joystick and switch
9 # Start with python eyes.py --radius 200 or any other ...
10 # number to change eye size
11 # Set AUTOBLINK to False to disable eyelids
12 # The joystick and selection switch are connected to the ...
13 # bonnet extention card
14 # On pin 0-1 (joystick) and 22,23,24 & 27 (selection switch)
15 # The configuration below (INPUT CONFIG and INIT GLOBALS) ...
16 # can be changed to
17 # enable and disable inputs/switches, add buttons, and ...
18 # configure the
19 # movement speed, duration of movement and movement of eye lid
20 #-----
21 import argparse
22 import math
23 import pi3d
24 import random
25 import threading
26 import time
27 import RPi.GPIO as GPIO
```

Eye Prototype Code

```
22 from svg.path import Path, parse_path
23 from xml.dom.minidom import parse
24 from gfxutil import *
25 from snake_eyes_bonnet import SnakeEyesBonnet
26
27 # for object detection use
28 from obj_detection_data_socket import RecieveData
29 import threading
30 import queue
31
32
33 # INPUT CONFIG for eye motion ...
34 -----
35 # Configuration of the inputs
36 JOYSTICK_X_IN = 0 # Analog input for eye horiz pos ...
37                (-1 = auto)
38 JOYSTICK_Y_IN = 1 # Analog input for eye vert ...
39                position (")
40 PUPIL_IN = -1 # Analog input for pupil control ...
41            (-1 = auto)
42 JOYSTICK_X_FLIP = False # If True, reverse stick X axis
43 JOYSTICK_Y_FLIP = False # If True, reverse stick Y axis
44 PUPIL_IN_FLIP = False # If True, reverse reading from ...
45                PUPIL_IN
46 TRACKING = True # If True, eyelid tracks pupil
47 PUPIL_SMOOTH = 16 # If > 0, filter input from PUPIL_IN
48 PUPIL_MIN = 0.0 # Lower analog range from PUPIL_IN
49 PUPIL_MAX = 1.0 # Upper --"--
50 SW_PIN1 = 22 # 22 Inputs from the switch
51 SW_PIN2 = 23 # 23 on pin 22,23,24,27
52 SW_PIN3 = 24 # 24 set to -1 to disable
53 SW_PIN4 = 27 # 27
54 AUTOBLINK = True # If True, eyes blink autonomously
55
56 # GPIO initialization ...
57 -----
58 # Only initialize if they are defined.
59 GPIO.setmode(GPIO.BCM)
60 if SW_PIN1 >= 0:
61     GPIO.setup(SW_PIN1, GPIO.IN, pull_up_down=GPIO.PUD_UP)
62 if SW_PIN2 >= 0:
63     GPIO.setup(SW_PIN2 , GPIO.IN, pull_up_down=GPIO.PUD_UP)
64 if SW_PIN3 >= 0:
65     GPIO.setup(SW_PIN3, GPIO.IN, pull_up_down=GPIO.PUD_UP)
66 if SW_PIN4 >= 0:
67     GPIO.setup(SW_PIN4, GPIO.IN, pull_up_down=GPIO.PUD_UP)
68
69
```

Eye Prototype Code

```
65
66
67
68
69
70 def checkGPIO():
71     """
72     Used to check the status of the input switch.
73     Returns (int) 1-6 depending on the program selected.
74     Program 1: Random movement, normal speed
75     Program 2: Random movement, slow speed
76     Program 3: Random movement, fast speed
77     Program 4: Joystick Control, manual control
78     Program 5: Random movement, x-axis (horizontal random ...
79     movement)
80     Program 6: Eyelids closed
81     """
82     program = 1
83     if GPIO.input(SW_PIN1) == GPIO.LOW:
84         program = 1
85         if GPIO.input(SW_PIN4) == GPIO.LOW:
86             program = 4
87     elif GPIO.input(SW_PIN2) == GPIO.LOW:
88         program = 2
89         if GPIO.input(SW_PIN4) == GPIO.LOW:
90             program = 5
91     elif GPIO.input(SW_PIN3) == GPIO.LOW:
92         program = 3
93         if GPIO.input(SW_PIN4) == GPIO.LOW:
94             program = 6
95     return program
96
97 # ADC stuff ...
98 -----
99 # The ADC is used to read the joystick position
100 # ADC channels are read and stored in a separate thread to ...
101 # avoid slowdown
102 # from blocking operations. The animation loop can read at ...
103 # its leisure.
104
105 if JOYSTICK_X_IN >= 0 or JOYSTICK_Y_IN >= 0 or PUPIL_IN >= 0:
106     bonnet = SnakeEyesBonnet(daemon=True)
107     bonnet.setup_channel(JOYSTICK_X_IN, ...
108                         reverse=JOYSTICK_X_FLIP)
109     bonnet.setup_channel(JOYSTICK_Y_IN, ...
110                         reverse=JOYSTICK_Y_FLIP)
111     bonnet.setup_channel(PUPIL_IN, reverse=PUPIL_IN_FLIP)
112     bonnet.start()
```

Eye Prototype Code

```
108 # Load SVG file, extract paths & convert to point lists ...
    -----
109 dom          = parse("graphics/eye.svg")
110 vb          = get_view_box(dom)
111 pupilMinPts  = get_points(dom, "pupilMin"      , 32, ...
    True , True )
112 pupilMaxPts  = get_points(dom, "pupilMax"      , 32, ...
    True , True )
113 irisPts      = get_points(dom, "iris"          , 32, ...
    True , True )
114 scleraFrontPts = get_points(dom, "scleraFront"  , 0, ...
    False, False)
115 scleraBackPts  = get_points(dom, "scleraBack"   , 0, ...
    False, False)
116 upperLidClosedPts = get_points(dom, "upperLidClosed", 33, ...
    False, True )
117 upperLidOpenPts  = get_points(dom, "upperLidOpen" , 33, ...
    False, True )
118 upperLidEdgePts  = get_points(dom, "upperLidEdge" , 33, ...
    False, False)
119 lowerLidClosedPts = get_points(dom, "lowerLidClosed", 33, ...
    False, False)
120 lowerLidOpenPts  = get_points(dom, "lowerLidOpen" , 33, ...
    False, False)
121 lowerLidEdgePts  = get_points(dom, "lowerLidEdge" , 33, ...
    False, False)
122
123
124 # Set up display and initialize pi3d ...
    -----
125 DISPLAY = pi3d.Display.create(samples=4)
126 DISPLAY.set_background(0, 0, 0, 1) # r,g,b,alpha
127 # eyeRadius is the size, in pixels, at which the whole eye ...
    will be rendered
128 # onscreen. eyePosition, also pixels, is the offset (left ...
    or right) from
129 # the center point of the screen to the center of each ...
    eye. This geometry
130 # is explained more in-depth in fbx2.c.
131 eyePosition = DISPLAY.width / 4
132 eyeRadius   = 100 # 128 # Default; use 240 for IPS screens
133
134
135 # Argument to change the size of the entire eye on startup
136 parser = argparse.ArgumentParser()
137 parser.add_argument("--radius", type=int)
138 args = parser.parse_args()
139 if args.radius:
140     eyeRadius = args.radius
```

Eye Prototype Code

```
141 eyeRadius = 240
142
143 # A 2D camera is used, mostly to allow for pixel-accurate ...
    eye placement,
144 # but also because perspective isn't really helpful or ...
    needed here, and
145 # also this allows eyelids to be handled somewhat easily ...
    as 2D planes.
146 # Line of sight is down Z axis, allowing conventional X/Y ...
    cartesian
147 # coords for 2D positions.
148 cam      = pi3d.Camera(is_3d=False, at=(0,0,0), eye=(0,0,-1000))
149 shader = pi3d.Shader("uv_light")
150 light   = pi3d.Light(lightpos=(0, -500, -500), ...
    lightamb=(0.2, 0.2, 0.2))
151
152
153 # Load texture maps ...
    -----
154 irisMap   = pi3d.Texture("graphics/iris.jpg" , mipmap=False,
155     filter=pi3d.GL_LINEAR)
156 scleraMap = pi3d.Texture("graphics/sclera.png", mipmap=False,
157     filter=pi3d.GL_LINEAR, blend=True)
158 lidMap    = pi3d.Texture("graphics/lid.png" , mipmap=False,
159     filter=pi3d.GL_LINEAR, blend=True)
160 # U/V map may be useful for debugging texture placement; ...
    not normally used
161 #uvMap     = pi3d.Texture("graphics/uv.png" , mipmap=False,
162 #     filter=pi3d.GL_LINEAR, blend=False, ...
    m_repeat=True)
163
164
165 # Initialize static geometry ...
    -----
166 # Transform point lists to eye dimensions
167 scale_points(pupilMinPts      , vb, eyeRadius)
168 scale_points(pupilMaxPts      , vb, eyeRadius)
169 scale_points(irisPts          , vb, eyeRadius)
170 scale_points(scleraFrontPts   , vb, eyeRadius)
171 scale_points(scleraBackPts    , vb, eyeRadius)
172 scale_points(upperLidClosedPts, vb, eyeRadius)
173 scale_points(upperLidOpenPts  , vb, eyeRadius)
174 scale_points(upperLidEdgePts  , vb, eyeRadius)
175 scale_points(lowerLidClosedPts, vb, eyeRadius)
176 scale_points(lowerLidOpenPts  , vb, eyeRadius)
177 scale_points(lowerLidEdgePts  , vb, eyeRadius)
178
179 # Regenerating flexible object geometry (such as eyelids ...
    during blinks, or
```

Eye Prototype Code

```
180 # iris during pupil dilation) is CPU intensive, can ...
    noticeably slow things
181 # down, especially on single-core boards. To reduce this ...
    load somewhat,
182 # determine a size change threshold below which ...
    regeneration will not occur;
183 # roughly equal to 1/4 pixel, since 4x4 area sampling is used.
184
185 # Determine change in pupil size to trigger iris geometry ...
    regen
186 irisRegenThreshold = 0.0
187 a = points_bounds(pupilMinPts) # Bounds of pupil at min ...
    size (in pixels)
188 b = points_bounds(pupilMaxPts) # " at max size
189 maxDist = max(abs(a[0] - b[0]), abs(a[1] - b[1]), # ...
    Determine distance of max
190             abs(a[2] - b[2]), abs(a[3] - b[3])) # ...
    variance around each edge
191 # maxDist is motion range in pixels as pupil scales ...
    between 0.0 and 1.0.
192 # 1.0 / maxDist is one pixel's worth of scale range. Need ...
    1/4 that...
193 if maxDist > 0: irisRegenThreshold = 0.25 / maxDist
194
195 # Determine change in eyelid values needed to trigger ...
    geometry regen.
196 # This is done a little differently than the ...
    pupils...instead of bounds,
197 # the distance between the middle points of the open and ...
    closed eyelid
198 # paths is evaluated, then similar 1/4 pixel threshold is ...
    determined.
199 upperLidRegenThreshold = 0.0
200 lowerLidRegenThreshold = 0.0
201 p1 = upperLidOpenPts[len(upperLidOpenPts) // 2]
202 p2 = upperLidClosedPts[len(upperLidClosedPts) // 2]
203 dx = p2[0] - p1[0]
204 dy = p2[1] - p1[1]
205 d = dx * dx + dy * dy
206 if d > 0: upperLidRegenThreshold = 0.25 / math.sqrt(d)
207 p1 = lowerLidOpenPts[len(lowerLidOpenPts) // 2]
208 p2 = lowerLidClosedPts[len(lowerLidClosedPts) // 2]
209 dx = p2[0] - p1[0]
210 dy = p2[1] - p1[1]
211 d = dx * dx + dy * dy
212 if d > 0: lowerLidRegenThreshold = 0.25 / math.sqrt(d)
213
214 # Generate initial iris meshes; vertex elements will get ...
    replaced on
```

Eye Prototype Code

```
215 # a per-frame basis in the main loop, this just sets up ...
    textures, etc.
216 rightIris = mesh_init((32, 4), (0, 0.5 / irisMap.iy), ...
    True, False)
217 rightIris.set_textures([irisMap])
218 rightIris.set_shader(shader)
219 # Left iris map U value is offset by 0.5; effectively a ...
    180 degree
220 # rotation, so it's less obvious that the same texture is ...
    in use on both.
221 leftIris = mesh_init((32, 4), (0.5, 0.5 / irisMap.iy), ...
    True, False)
222 leftIris.set_textures([irisMap])
223 leftIris.set_shader(shader)
224 irisZ = zangle(irisPts, eyeRadius)[0] * 0.99 # Get iris Z ...
    depth, for later
225
226 # Eyelid meshes are likewise temporary; texture ...
    coordinates are
227 # assigned here but geometry is dynamically regenerated in ...
    main loop.
228 leftUpperEyelid = mesh_init((33, 5), (0, 0.5 / lidMap.iy), ...
    False, True)
229 leftUpperEyelid.set_textures([lidMap])
230 leftUpperEyelid.set_shader(shader)
231 leftLowerEyelid = mesh_init((33, 5), (0, 0.5 / lidMap.iy), ...
    False, True)
232 leftLowerEyelid.set_textures([lidMap])
233 leftLowerEyelid.set_shader(shader)
234
235 rightUpperEyelid = mesh_init((33, 5), (0, 0.5 / ...
    lidMap.iy), False, True)
236 rightUpperEyelid.set_textures([lidMap])
237 rightUpperEyelid.set_shader(shader)
238 rightLowerEyelid = mesh_init((33, 5), (0, 0.5 / ...
    lidMap.iy), False, True)
239 rightLowerEyelid.set_textures([lidMap])
240 rightLowerEyelid.set_shader(shader)
241
242 # Generate scleras for each eye...start with a 2D shape ...
    for lathing...
243 angle1 = zangle(scleraFrontPts, eyeRadius)[1] # Sclera ...
    front angle
244 angle2 = zangle(scleraBackPts, eyeRadius)[1] # " back angle
245 aRange = 180 - angle1 - angle2
246 pts = []
247 for i in range(24):
248     ca, sa = pi3d.Utility.from_polar((90 - angle1) - ...
        aRange * i / 23)
```

Eye Prototype Code

```
249     pts.append((ca * eyeRadius, sa * eyeRadius))
250
251 # Scleras are generated independently (object isn't ...
    re-used) so each
252 # may have a different image map (heterochromia, corneal ...
    scar, or the
253 # same image map can be offset on one so the repetition ...
    isn't obvious).
254 leftEye = pi3d.Lathe(path=pts, sides=64)
255 leftEye.set_textures([scleraMap])
256 leftEye.set_shader(shader)
257 re_axis(leftEye, 0)
258 rightEye = pi3d.Lathe(path=pts, sides=64)
259 rightEye.set_textures([scleraMap])
260 rightEye.set_shader(shader)
261 re_axis(rightEye, 0.5) # Image map offset = 180 degree ...
    rotation
262
263
264 # INIT GLOBALS ...
    -----
265 mykeys = pi3d.Keyboard() # For capturing key presses
266 startX      = random.uniform(-30.0, 30.0)
267 n           = math.sqrt(900.0 - startX * startX)
268 startY      = random.uniform(-n, n)
269 destX       = startX
270 destY       = startY
271 curX        = startX
272 curY        = startY
273 moveDuration = random.uniform(0.075, 0.175)
274 holdDuration = random.uniform(0.1, 1.1)
275 startTime   = 0.0
276 isMoving    = False
277
278 startXR     = random.uniform(-30.0, 30.0)
279 n           = math.sqrt(900.0 - startX * startX)
280 startYR     = random.uniform(-n, n)
281 destXR      = startXR
282 destYR      = startYR
283 curXR       = startXR
284 curYR       = startYR
285 moveDurationR = random.uniform(0.075, 0.175)
286 holdDurationR = random.uniform(0.1, 1.1)
287 startTimeR  = 0.0
288 isMovingR   = False
289
290 frames      = 0
291 beginningTime = time.time()
292
```

Eye Prototype Code

```
293 rightEye.positionX(-eyePosition)
294 rightIris.positionX(-eyePosition)
295 rightUpperEyelid.positionX(-eyePosition)
296 rightUpperEyelid.positionZ(-eyeRadius - 42)
297 rightLowerEyelid.positionX(-eyePosition)
298 rightLowerEyelid.positionZ(-eyeRadius - 42)
299
300 leftEye.positionX(eyePosition)
301 leftIris.positionX(eyePosition)
302 leftUpperEyelid.positionX(eyePosition)
303 leftUpperEyelid.positionZ(-eyeRadius - 42)
304 leftLowerEyelid.positionX(eyePosition)
305 leftLowerEyelid.positionZ(-eyeRadius - 42)
306
307 currentPupilScale      = 0.5
308 prevPupilScale         = -1.0 # Force regen on first frame
309 prevLeftUpperLidWeight = 0.5
310 prevLeftLowerLidWeight = 0.5
311 prevRightUpperLidWeight = 0.5
312 prevRightLowerLidWeight = 0.5
313 prevLeftUpperLidPts    = points_interp(upperLidOpenPts, ...
    upperLidClosedPts, 0.5)
314 prevLeftLowerLidPts    = points_interp(lowerLidOpenPts, ...
    lowerLidClosedPts, 0.5)
315 prevRightUpperLidPts   = points_interp(upperLidOpenPts, ...
    upperLidClosedPts, 0.5)
316 prevRightLowerLidPts   = points_interp(lowerLidOpenPts, ...
    lowerLidClosedPts, 0.5)
317
318 luRegen = True
319 llRegen = True
320 ruRegen = True
321 rlRegen = True
322
323 timeOfLastBlink = 0.0
324 timeToNextBlink = 1.0
325 # These are per-eye (left, right) to allow winking:
326 blinkStateLeft   = 0 # NOBLINK
327 blinkStateRight  = 0
328 blinkDurationLeft = 0.1
329 blinkDurationRight = 0.1
330 blinkStartTimeLeft = 0
331 blinkStartTimeRight = 0
332
333 trackingPos = 0.3
334 trackingPosR = 0.3
335
336 # initialize socket class, used if option 6 is selected.
337 eye_coordinate_socket = RecieveData()
```

Eye Prototype Code

```
338 dnn_queue = queue.Queue()
339 curX2 = 20
340 curY2 = 20
341 last_x = 0
342 last_y = 0
343 last_x2 = 0
344 last_y2 = 0
345
346 # Generate one frame of imagery
347 def frame(p):
348     global startX, startY, destX, destY, curX, curY, ...
349     curX2, curY2
350     global startXR, startYR, destXR, destYR, curXR, curYR
351     global moveDuration, holdDuration, startTime, isMoving
352     global moveDurationR, holdDurationR, startTimeR, isMovingR
353     global frames
354     global leftIris, rightIris
355     global pupilMinPts, pupilMaxPts, irisPts, irisZ
356     global leftEye, rightEye
357     global leftUpperEyelid, leftLowerEyelid, ...
358     rightUpperEyelid, rightLowerEyelid
359     global upperLidOpenPts, upperLidClosedPts, ...
360     lowerLidOpenPts, lowerLidClosedPts
361     global upperLidEdgePts, lowerLidEdgePts
362     global prevLeftUpperLidPts, prevLeftLowerLidPts, ...
363     prevRightUpperLidPts, prevRightLowerLidPts
364     global leftUpperEyelid, leftLowerEyelid, ...
365     rightUpperEyelid, rightLowerEyelid
366     global prevLeftUpperLidWeight, prevLeftLowerLidWeight, ...
367     prevRightUpperLidWeight, prevRightLowerLidWeight
368     global prevPupilScale
369     global irisRegenThreshold, upperLidRegenThreshold, ...
370     lowerLidRegenThreshold
371     global luRegen, llRegen, ruRegen, rlRegen
372     global timeOfLastBlink, timeToNextBlink
373     global blinkStateLeft, blinkStateRight
374     global blinkDurationLeft, blinkDurationRight
375     global blinkStartTimeLeft, blinkStartTimeRight
376     global trackingPos
377     global trackingPosR
378     global eye_coordinate_socket
379     global dnn_queue
380     global last_x
381     global last_y
382     global last_x2
383     global last_y2
384
385     DISPLAY.loop_running()
```

Eye Prototype Code

```
380     now = time.time()
381     dt  = now - startTime
382     dtR = now - startTimeR
383
384     frames += 1
385     # if(now > beginningTime):
386     #     print(frames/(now-beginningTime))
387
388     if checkGPIO() == 4: # Joystick control / manual movement
389         curX = bonnet.channel[JOYSTICK_X_IN].value
390         curY = bonnet.channel[JOYSTICK_Y_IN].value
391         curX = -30.0 + curX * 60.0
392         curY = -30.0 + curY * 60.0
393     else :
394         # Autonomous eye position
395         if isMoving == True:
396             if dt ≤ moveDuration:
397                 scale = (now - startTime) / ...
398                 moveDuration
399                 # Ease in/out curve: 3*t^2-2*t^3
400                 scale = 3.0 * scale * scale - 2.0 * scale ...
401                 * scale * scale
402                 curX = startX + (destX - startX) * ...
403                 scale
404                 curY = startY + (destY - startY) * ...
405                 scale
406                 else:
407                     startX = destX
408                     startY = destY
409                     curX = destX
410                     curY = destY
411                     if checkGPIO() == 2: # Random movement ...
412                         slow speed (3-8 sec between movement)
413                         holdDuration = random.uniform(3, 8)
414                     elif checkGPIO() == 3: # Random movement ...
415                         fast speed (0.5-1 sec between movement)
416                         holdDuration = random.uniform(0.5, 1)
417                     else:
418                         holdDuration = random.uniform(0.5, 6) ...
419                 # Default movement speed (checkGPIO==1) (0.5-6 sec)
420                 #holdDuration = random.uniform(0.1, 1.1)
421                 startTime = now
422                 isMoving = False
423             else:
424                 if dt ≥ holdDuration:
425                     destX = random.uniform(-30.0, 30.0)
426                     n = math.sqrt(225.0 - (destX/2) ...
427                     * (destX/2))
428                 # MOVE Y AXIS
```

Eye Prototype Code

```
421         if checkGPIO() == 5: # Random movement ...
           only in X-axis (y is set to 0)
422             destY = 0 # random.uniform(0,0)
423         elif checkGPIO() == 3: # Fast speed and ...
           full movement in y-axis
424             destY = random.uniform(-n, n)
425         elif checkGPIO() == 2: # Slow speed, half ...
           movement in y-axis
426             destY = random.uniform(-n/2, n/2)
427         else:
428             destY = random.uniform(-n, n)
429
430             moveDuration = random.uniform(0.075, 0.175)
431             startTime    = now
432             isMoving     = True
433
434         # Regenerate iris geometry only if size changed by ≥ ...
           1/4 pixel
435         if abs(p - prevPupilScale) ≥ irisRegenThreshold:
436             # Interpolate points between min and max pupil sizes
437             interPupil = points_interp(pupilMinPts, ...
           pupilMaxPts, p)
438             # Generate mesh between interpolated pupil and ...
           iris bounds
439             mesh = points_mesh((None, interPupil, irisPts), 4, ...
           -irisZ, True)
440             # Assign to both eyes
441             leftIris.re_init(pts=mesh)
442             rightIris.re_init(pts=mesh)
443             prevPupilScale = p
444
445         # Eyelid WIP
446         if AUTOBLINK and (now - timeOfLastBlink) ≥ ...
           timeToNextBlink:
447             timeOfLastBlink = now
448             duration        = random.uniform(0.035, 0.06)
449             if blinkStateLeft != 1:
450                 blinkStateLeft    = 1 # ENBLINK
451                 blinkStartTimeLeft = now
452                 blinkDurationLeft  = duration
453             if blinkStateRight != 1:
454                 blinkStateRight   = 1 # ENBLINK
455                 blinkStartTimeRight = now
456                 blinkDurationRight = duration
457             timeToNextBlink = duration * 3 + ...
           random.uniform(1.0, 4.0)
458
459         if blinkStateLeft: # Left eye currently winking/blinking?
460             # Check if blink time has elapsed...
```

Eye Prototype Code

```
461     if (now - blinkStartTimeLeft) ≥ blinkDurationLeft:
462         blinkStateLeft += 1
463         if blinkStateLeft > 2:
464             blinkStateLeft = 0 # NOBLINK
465         else:
466             blinkDurationLeft *= 2.0
467             blinkStartTimeLeft = now
468
469     if blinkStateRight: # Right eye currently ...
470     winking/blinking?
471         # Check if blink time has elapsed...
472         if (now - blinkStartTimeRight) ≥ blinkDurationRight:
473             blinkStateRight += 1
474             if blinkStateRight > 2:
475                 blinkStateRight = 0 # NOBLINK
476             else:
477                 blinkDurationRight *= 2.0
478                 blinkStartTimeRight = now
479
480     if checkGPIO() == 6:
481         #hacked for test of eye tracking
482         # AUTOBLINK = False #disables blinking
483         try:
484             if not dnn_queue.empty():
485                 first_out = dnn_queue.get()
486                 curX = first_out[0]
487                 curY = first_out[1]
488                 curX2 = first_out[2]
489                 curY2 = first_out[3]
490                 last_x = curX
491                 last_y = curY
492                 last_x2 = curX2
493                 last_y2 = curY2
494             else:
495                 curX = last_x
496                 curY = last_y
497                 curX2 = last_x2
498                 curY2 = last_y2
499         except Exception as e:
500             print(f'assigning queue items failed: {e}')
501
502
503
504     if TRACKING:
505         n = 0.4 - curY / 60.0
506         if n < 0.0: n = 0.0
507         elif n > 1.0: n = 1.0
508         trackingPos = (trackingPos * 3.0 + n) * 0.25
```

Eye Prototype Code

```
509
510
511     if blinkStateLeft:
512         n = (now - blinkStartTimeLeft) / blinkDurationLeft
513         if n > 1.0: n = 1.0
514         if blinkStateLeft == 2: n = 1.0 - n
515     else:
516         n = 0.0
517     newLeftUpperLidWeight = trackingPos + (n * (1.0 - ...
trackingPos))
518     newLeftLowerLidWeight = (1.0 - trackingPos) + (n * ...
trackingPos)
519
520     if blinkStateRight:
521         n = (now - blinkStartTimeRight) / blinkDurationRight
522         if n > 1.0: n = 1.0
523         if blinkStateRight == 2: n = 1.0 - n
524     else:
525         n = 0.0
526
527     newRightUpperLidWeight = trackingPos + (n * (1.0 - ...
trackingPos))
528     newRightLowerLidWeight = (1.0 - trackingPos) + (n * ...
trackingPos)
529
530     if (luRegen or (abs(newLeftUpperLidWeight - ...
prevLeftUpperLidWeight) ≥
531         upperLidRegenThreshold)):
532         newLeftUpperLidPts = points_interp(upperLidOpenPts,
533         upperLidClosedPts, newLeftUpperLidWeight)
534         if newLeftUpperLidWeight > prevLeftUpperLidWeight:
535             leftUpperEyelid.re_init(pts=points_mesh(
536                 (upperLidEdgePts, prevLeftUpperLidPts,
537                 newLeftUpperLidPts), 5, 0, False))
538         else:
539             leftUpperEyelid.re_init(pts=points_mesh(
540                 (upperLidEdgePts, newLeftUpperLidPts,
541                 prevLeftUpperLidPts), 5, 0, False))
542         prevLeftUpperLidPts = newLeftUpperLidPts
543         prevLeftUpperLidWeight = newLeftUpperLidWeight
544         luRegen = True
545     else:
546         luRegen = False
547
548     if (llRegen or (abs(newLeftLowerLidWeight - ...
prevLeftLowerLidWeight) ≥
549         lowerLidRegenThreshold)):
550         newLeftLowerLidPts = points_interp(lowerLidOpenPts,
551         lowerLidClosedPts, newLeftLowerLidWeight)
```

Eye Prototype Code

```
552     if newLeftLowerLidWeight > prevLeftLowerLidWeight:
553         leftLowerEyelid.re_init(pts=points_mesh(
554             (lowerLidEdgePts, prevLeftLowerLidPts,
555             newLeftLowerLidPts), 5, 0, False))
556     else:
557         leftLowerEyelid.re_init(pts=points_mesh(
558             (lowerLidEdgePts, newLeftLowerLidPts,
559             prevLeftLowerLidPts), 5, 0, False))
560     prevLeftLowerLidWeight = newLeftLowerLidWeight
561     prevLeftLowerLidPts    = newLeftLowerLidPts
562     llRegen = True
563 else:
564     llRegen = False
565
566     if (ruRegen or (abs(newRightUpperLidWeight - ...
567     prevRightUpperLidWeight) >=
568     upperLidRegenThreshold)):
569         newRightUpperLidPts = points_interp(upperLidOpenPts,
570         upperLidClosedPts, newRightUpperLidWeight)
571         if newRightUpperLidWeight > prevRightUpperLidWeight:
572             rightUpperEyelid.re_init(pts=points_mesh(
573                 (upperLidEdgePts, prevRightUpperLidPts,
574                 newRightUpperLidPts), 5, 0, True))
575         else:
576             rightUpperEyelid.re_init(pts=points_mesh(
577                 (upperLidEdgePts, newRightUpperLidPts,
578                 prevRightUpperLidPts), 5, 0, True))
579         prevRightUpperLidWeight = newRightUpperLidWeight
580         prevRightUpperLidPts    = newRightUpperLidPts
581         ruRegen = True
582     else:
583         ruRegen = False
584
585     if (rlRegen or (abs(newRightLowerLidWeight - ...
586     prevRightLowerLidWeight) >=
587     lowerLidRegenThreshold)):
588         newRightLowerLidPts = points_interp(lowerLidOpenPts,
589         lowerLidClosedPts, newRightLowerLidWeight)
590         if newRightLowerLidWeight > prevRightLowerLidWeight:
591             rightLowerEyelid.re_init(pts=points_mesh(
592                 (lowerLidEdgePts, prevRightLowerLidPts,
593                 newRightLowerLidPts), 5, 0, True))
594         else:
595             rightLowerEyelid.re_init(pts=points_mesh(
596                 (lowerLidEdgePts, newRightLowerLidPts,
597                 prevRightLowerLidPts), 5, 0, True))
598         prevRightLowerLidWeight = newRightLowerLidWeight
599         prevRightLowerLidPts    = newRightLowerLidPts
600         rlRegen = True
```

Eye Prototype Code

```
599     else:
600         rlRegen = False
601
602     if GPIO != 6:
603         convergence = 2.0
604
605         rightIris.rotateToX(curY)
606         rightIris.rotateToY(curX - convergence)
607         rightIris.draw()
608         rightEye.rotateToX(curY)
609         rightEye.rotateToY(curX - convergence)
610         rightEye.draw()
611
612         # Left eye (on screen right)
613
614         leftIris.rotateToX(curY)
615         leftIris.rotateToY(curX + convergence)
616         leftIris.draw()
617         leftEye.rotateToX(curY)
618         leftEye.rotateToY(curX + convergence)
619         leftEye.draw()
620     else:
621         convergence = 0
622
623         rightIris.rotateToX(curY)
624         rightIris.rotateToY(curX - convergence)
625         rightIris.draw()
626         rightEye.rotateToX(curY)
627         rightEye.rotateToY(curX - convergence)
628         rightEye.draw()
629
630         # Left eye (on screen right)
631
632         leftIris.rotateToX(curY2)
633         leftIris.rotateToY(curX2 + convergence)
634         leftIris.draw()
635         leftEye.rotateToX(curY2)
636         leftEye.rotateToY(curX2 + convergence)
637         leftEye.draw()
638
639         leftUpperEyelid.draw()
640         leftLowerEyelid.draw()
641         rightUpperEyelid.draw()
642         rightLowerEyelid.draw()
643
644         k = mykeys.read()
645         if k==1:
646             mykeys.close()
647             DISPLAY.stop()
```

Eye Prototype Code

```
648     exit(0)
649
650
651 def fill_queue():
652     global dnn_queue
653     global eye_coordinate_socket
654     global curX, curY, curX2, curY2
655
656     while True:
657         if checkGPIO() == 6:
658             #modified for test of eye tracking
659             # AUTOBLINK = False #disables blinking
660             try:
661                 if not ...
662                 eye_coordinate_socket.get_socket_connected_status():
663                     eye_coordinate_socket.connect_to_server()
664             except Exception:
665                 ...
666                 eye_coordinate_socket.set_socket_connected_status(False)
667
668             try:
669                 ext_curX, ext_curY, ext_curX2, ext_curY2 = ...
670                 eye_coordinate_socket.get_eye_coordinates_float()
671                 dnn_queue.put((ext_curX, ext_curY, ...
672                 ext_curX2, ext_curY2))
673
674             except Exception as e:
675                 ...
676                 eye_coordinate_socket.set_socket_connected_status(False) ...
677
678                 print(f'failed to get datafrom socket and ...
679                 put to queue: {e}')
680
681                 if checkGPIO() != 6 and ...
682                 eye_coordinate_socket.get_socket_connected_status():
683                     ...
684                 eye_coordinate_socket.set_socket_connected_status(False)
685                 try:
686                     eye_coordinate_socket.close_socket()
687                 except Exception:
688                     pass
689                 time.sleep(2)
690
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779
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781
782
783
784 def split( # Recursive simulated pupil response when no ...
785     analog sensor
786     startValue, # Pupil scale starting value (0.0 to 1.0)
787     endValue,   # Pupil scale ending value ("
```

Eye Prototype Code

```
687     duration,      # Start-to-end time, floating-point seconds
688     range):      # +/- random pupil scale at midpoint
689         startTime = time.time()
690         if range ≥ 0.125: # Limit subdivision count, because ...
691             recursion
692             duration *= 0.5 # Split time & range in half for ...
693             subdivision,
694             range     *= 0.5 # then pick random center point ...
695         within range:
696             midValue = ((startValue + endValue - range) * 0.5 +
697                         random.uniform(0.0, range))
698             split(startValue, midValue, duration, range)
699             split(midValue , endValue, duration, range)
700         else: # No more subdivisions, do iris motion...
701             dv = endValue - startValue
702             while True:
703                 dt = time.time() - startTime
704                 if dt ≥ duration: break
705                 v = startValue + dv * dt / duration
706                 if v < PUPIL_MIN: v = PUPIL_MIN
707                 elif v > PUPIL_MAX: v = PUPIL_MAX
708                 frame(v) # Draw frame w/interim pupil scale value
709
710 #MAKE THREAD FOR EXTERNAL DATA AND START IT.
711 get_data_thread = threading.Thread(target=fill_queue)
712 get_data_thread.daemon = True
713 get_data_thread.start()
714
715 # MAIN LOOP -- runs continuously ...
716 -----
717 while True:
718     if PUPIL_IN ≥ 0: # Pupil scale from sensor
719         v = bonnet.channel[PUPIL_IN].value
720         # If you need to calibrate PUPIL_MIN and MAX,
721         # add a 'print v' here for testing.
722         if v < PUPIL_MIN: v = PUPIL_MIN
723         elif v > PUPIL_MAX: v = PUPIL_MAX
724         # Scale to 0.0 to 1.0:
725         v = (v - PUPIL_MIN) / (PUPIL_MAX - PUPIL_MIN)
726         if PUPIL_SMOOTH > 0:
727             v = ((currentPupilScale * (PUPIL_SMOOTH - 1) + ...
728                 v) /
729                 PUPIL_SMOOTH)
730         frame(v)
731     else: # Fractal auto pupil scale
```

Eye Prototype Code

```
731         v = random.random()
732         split(currentPupilScale, v, 4.0, 1.0)
733         currentPupilScale = v
```