

# Predicting Laptop Users Gaze

## Contactless Selection of (Big) Buttons on the Screen

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UGP (CS395) Presentation

- The aim of the project was to build a software tool, based on basic computer vision technologies, which allows for an HCI(Human Computer Interface) to select buttons placed in a coarse grid of  $2 \times 2$  of  $2 \times 3$  on the screen, using just her gaze
- Future directions include making an end-to-end trainable deep network for the task.

# Outline

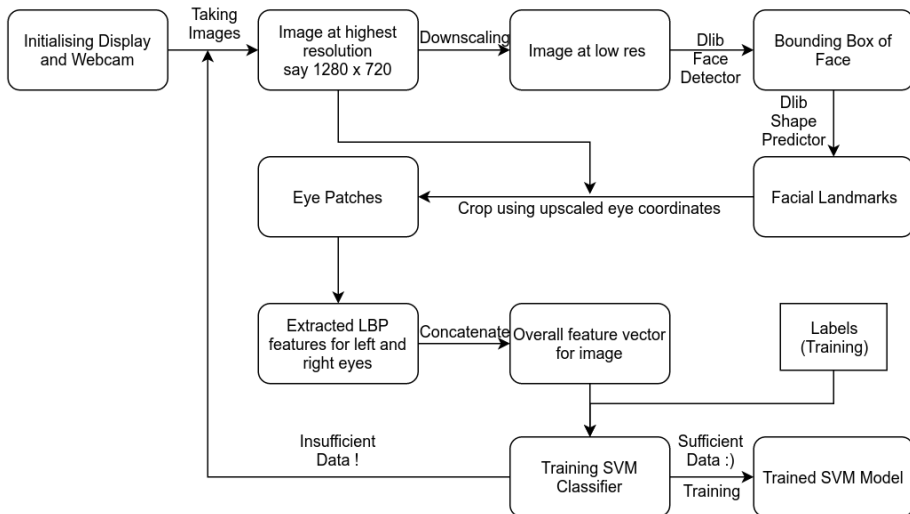
- 1 Overview
  - Training
  - Prediction
- 2 User Interface
  - Using Pygame
  - Design
- 3 Face Detection
  - Dlib: A C++ Library
  - Getting Face Landmarks and Speeding up Face Detection
- 4 The Classifier
  - Local Binary Patterns
  - Training
- 5 Further Developments

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# Overview

## Training

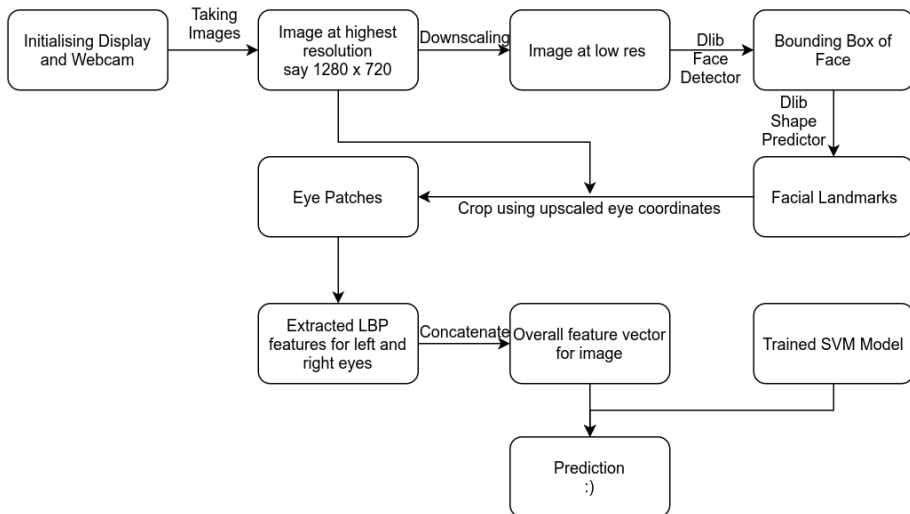


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## Prediction



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# User Interface

## Using Pygame

Pygame is a cross-platform library designed to make it easy to write multimedia software, such as games, in Python. It consists of a camera module, which allows taking images and using them with several controls.

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- Training Data Collection
  - Users are asked to focus on dots appearing at several places on screen.
  - These dots appear sequentially in four quadrants around corners.
  - From webcam, images are taken and region around eyes is cropped to feed the classifier.
  - This process takes about 20 seconds.
- Predicting Users Gaze
  - Users can focus on a quadrant of the screen.
  - A marker appears in the that quadrant . This can be used for selecting options in the future.

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# Face Detection

Dlib: A C++ Library

Dlib is a modern C++ toolkit containing machine learning algorithms and tools for creating complex software in C++ to solve real world problems. It offers a frontal face detector that can be used for getting face landmarks as shown in figure



Figure: Dlib predicted landmarks

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- Face landmark detector is invoked within that bounding box.
- Detected landmark points are upscaled.

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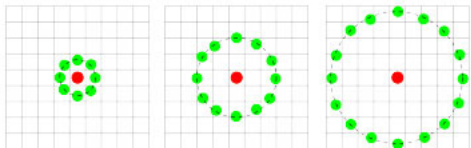
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- LBPs compute a local representation of texture. This local representation is constructed by comparing each pixel with its surrounding neighborhood of pixels.
- The first step in constructing the LBP texture descriptor is to convert the image to grayscale.
- LBP value is then calculated for each pixel and stored in the output 2D array with the same width and height as the input image.

# The Classifier

## Local Binary Patterns

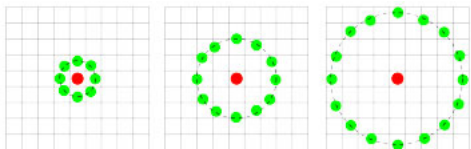
- For calculating a pixel's lbp, we threshold it against its neighborhood of  $n$  pixels ( $n$  can be set) within radius  $r$ .



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- If the intensity of the center pixel is greater-than-or-equal to its neighbor, then we set the value in copied neighbor to 1; otherwise, we set it to 0.

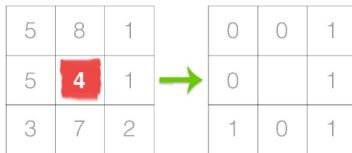


Figure: example for  $r=1$  and  $n=8$

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- The results stored in a binary array treated as a decimal value is the lbp value for that pixel.

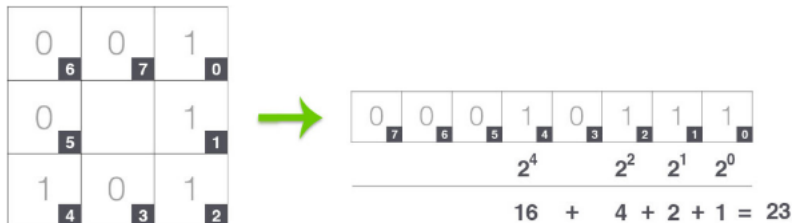


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- We have used Quantized LBP for getting the feature vector. I used the function provided by Prof. Gaurav Sharma for this task.

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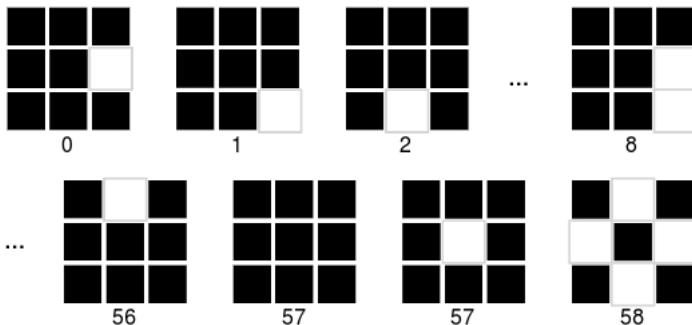
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- It is similar to LBP except that here instead of plotting histogram for all distinct 256 values of lbp, we group some of them.



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***LBP quantized patterns.***

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- A Support Vector Machine is then trained over that data.
- The model is then saved and is used subsequently for making predictions.

# Further Developments

- Making an end-to-end trainable deepnetwork for the task using torch.
- Work done in this direction:
  - Getting the average coordintates of eyes, nose etc from lfw database for face alignment.
  - Affine transformation for aligning the face.
  - Formatting MPII Gaze Dataset to be used for training the cnn.
- Things to be done:
  - Training an optimal neural network that classifies data with satisfactory accuracy.
  - Deploying it to complete the application.



# References I



## PyImageSearch

*<http://www.pyimagesearch.com/2015/12/07/local-binary-patterns-with-python-opencv/>*



## PyGame

*<http://pygame.org>*



## Scikit - SVM

*<http://scikit-learn.org/stable/modules/generated/sklearn.svm.LinearSVC.html>*



## PyImageSearch

*<http://scikit-image.org/docs/dev/api/skimimage.html>*



## Coupled Projection multi-task Metric Learning for Large Scale Face Retrieval

Binod Bhattarai, Gaurav Sharma and Frederic Jurie

*mtml cvpr 2016, CVPR, 2016*