

Capstone Proposal

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1 Machine Learning Engineer Nanodegree

1.1 Domain Background

For a long time work in facial recognition has been done and one of the key points of this work is the face alignment as it poses its own challenge. And the main tool used for the job is OpenCV which is used with DLIB to recognize Facial landmarks.

The automatic recognition of landmarks is essential to be able to classify facial expressions, or face tracking, face animation, and even 3D face modeling.

For example to classify facial expressions it is necessary to classify Facial Action Units also known as FACS [1], which in turn needs a proper face alignment.

As one of my main projects today is to create a model capable to recognize facial expression of pain, this subject comes to be perfect as it covers a personal necessity and brings a good subject to work and learn.

1.2 Problem Statement

The problem of face alignment is among the most popular in the field of computer vision and today we have many different implementations to automatically recognize facial landmarks on images. The most known is the Active Appearance Model (AAM) [2, 3].

But today we also have some good results using Deep learning to achieve the results for example the work done by Adrian Bulat on recognizing 3D facial landmarks [4] that shows remarkable results it is implemented in torch. a framework for **LUA**.

In resume to find an implementation on Tensorflow is not that easy. As most of the works done on the subject is heavily dependent of DLIB to recognize the landmarks. and as of today Tensorflow is a library that is on

the rise and having such a tool would be a plus and a entry point for more detailed facial expressions.

So for that reason I propose for this project to create a Deep Neural Network to tackle such subject and have a model with better of equivalent performance of the DLIB counter part on Tensorflow.

As the DLIB model has difficulty on recognizing points on faces by the side view.

1.3 Dataset and Inputs

When looking for a data set for facial landmarks is possible to find many of them example:

- AFLW [5]
- Cohn-Kanade AU-Coded Expression Database [6]
- Affectiva-mit facial expression dataset (am-fed) [7]

But for this capstone project I propose to use the MUCT Face Database [8], this dataset consists of pictures taken from 276 subjects using 5 cameras in different angles an light conditions like the image below:

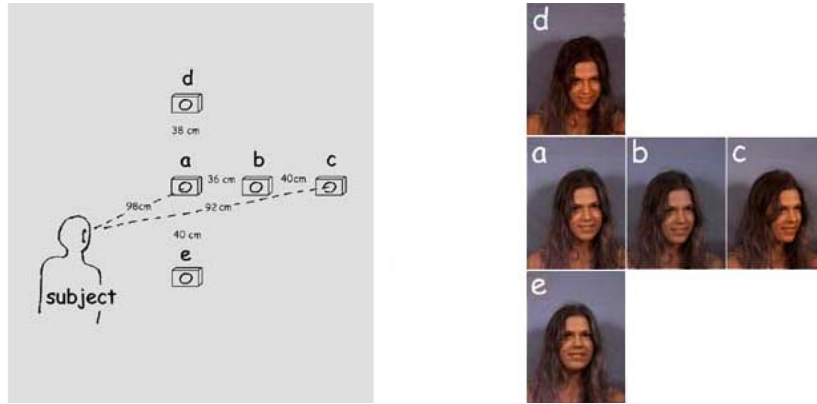
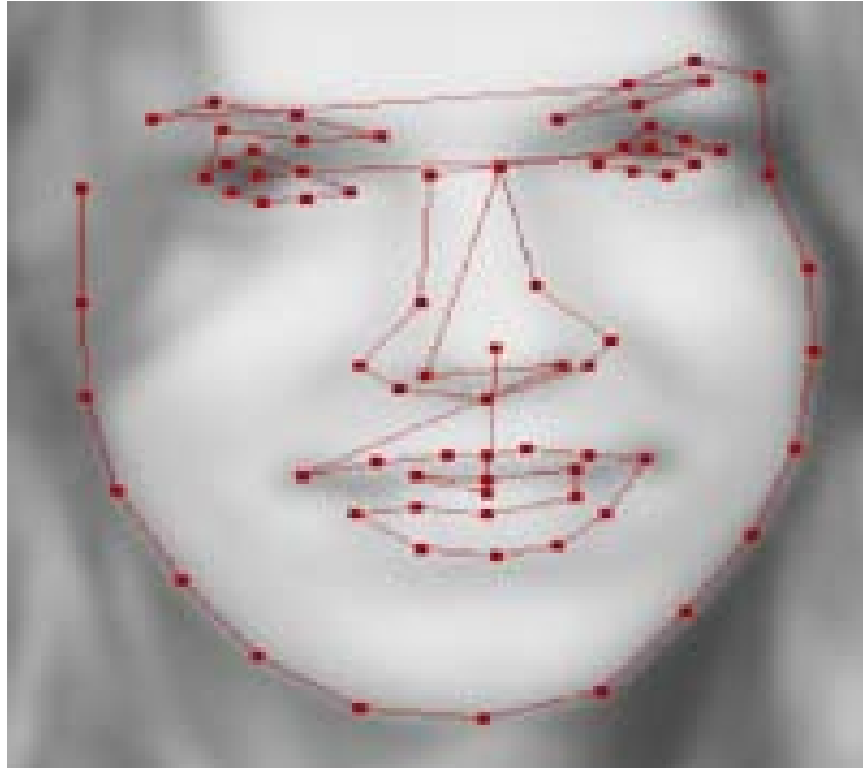


Figure 1: There is no images on the left but they can be reproduced by mirroring the right side

Each picture is coded with 76 facial landmark like:



The choice of this dataset is made because it has a reasonable size to train on personal computers and moreover it has large room for data augmentation if necessary. The focus on using this data set is that it provides data to have a better result when the face is in the side view.

The dataset is public available via github on the following link <https://github.com/StephenMilborrow/muct>

1.4 Solution Statement

What I am hoping to achieve from this project is to have a pre trained model that is capable of marking images properly with landmarks using a Tensorflow backend, obtaining achieve results at least as good as the DLIB model, for that I will be using our own Convolutional Neural Networks and pre-trained networks to find the best result for the task.

1.5 Evaluation and Metrics

As the problem consists on a regression model I believe that for the evaluation of the results I could use the accuracy calculated by using one of the

regression functions R-squared OR mean-squared.

1.6 Project Design

To solve such a problem I will begin from the point of training my own model using Convolutional Neural Networks and use it as the starting point and compare the results with other models using transfer learning like inception v3 , resnet, vgg16.

The main idea here is to create a model with 152 regression outputs giving the respective X and Y of each point.

In case the transfer learning don't give good results another approach would be go up on the pre-trained model and get more fine tuning. By using the option `include_top` from keras and augment the number of layers that will be trained. What would increase the time of training but give better results.

References

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