Data Analysis Project

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Contents

1 Introduction

This document outlines the process of using ChatGPT to generate prompts for results and analysis of the project, extracted from the data.

1.1 Outline of the Document

- Prompts used for data analysis
- Prompts used for Streamlit Dashboard
- Prompts used for project results
- Prompts used for LaTeX writing

2 Data Overview

Primary Prompt: "What types of data were analyzed (emotion, gaze, and transcript data)? Can you explain the key features like emotion categories, gaze measurements, and transcript sentiments?"

Follow-up Prompts:

- "Can you explain the structure of the gaze data, such as blink and eye offset values?"
- "What are the basic statistics for the transcript data?"

3 Data Preprocessing

Prompt: "What preprocessing steps were applied to the data, including handling missing values, encoding categorical features, and scaling or normalization?"

4 Data Preparation and Integration

In this section, I explain how the data was prepared and important features were extracted from the three provided CSV files.

4.1 Extracting Key Features from Emotion Data from each CSV file and making single DATAFRAME

Initial Prompt:

```
movie_id image_seq
                    angry disgust fear happy sad
                                                     surprise neutral
   dominant_emotion
0 93663f94-bf0a-4ce8-a29a-a5236cc7fe6a
                                         0 4.31735 0.000594 2.879790
   1.65035 2.779980 0.600814 87.77110 neutral
1 93663f94-bf0a-4ce8-a29a-a5236cc7fe6a
                                         1 53.22530 2.981640 12.736800
   1.52347 1.051320 27.216800
                               1.26462 angry
this is data of csv file of every emotion data and this is student 1.. there
such students, so 10 such df_emotion, so i want to make
combined df where two most frequent emotion data throughtout
the video of the student reflects All df emotion csv files are emotion data
   folder.
```

Chatpgt gave wrong response to the initial prompt. The response was giving wrong results.

So i further explained what i intended to do

Refined Prompt:

You are doing it incorrectly. I want to first calculate the most frequent of every single emotion CSV and then make one column out of it. Then, finally make 10 columns out of 10 CSV files with column names dominat_top1, dominant_top2 emotions. From every emotion CSV, find 2 max frequency dominant features and then add that.

For this prompt, response from the chatgpt was:

```
import pandas as pd
import os
# Path to the folder containing emotion data
folder_path = 'emotion_data'
# Initialize an empty dictionary to store top 2 dominant emotions for each
dominant_emotions = {'student_top1': [], 'student_top2': []}
# Iterate over all files in the folder (assuming 10 files: emotion-df1.csv to
   emotion-df10.csv)
for i in range(1, 11):
    file_name = f'{i}/emotion.csv'
   file_path = os.path.join(folder_path, file_name)
    # Read the CSV file into a DataFrame
   df = pd.read_csv(file_path)
    # Find the 2 most frequent dominant emotions
    top_emotions =
   df['dominant_emotion'].value_counts().nlargest(2).index.tolist()
    # Append the top 2 emotions for this student (add NaN if there's less than
   2 emotions)
    dominant_emotions['student_top1'].append(top_emotions[0] if
   len(top_emotions) > 0 else None)
    dominant_emotions['student_top2'].append(top_emotions[1] if
   len(top_emotions) > 1 else None)
# Create a DataFrame for top emotions for every student
df_dominantEmotion_for_everystudent = pd.DataFrame(dominant_emotions)
# Rename columns to reflect student numbers correctly (top1 and top2)
df_dominantEmotion_for_everystudent.columns = [
    f'student_{i}_dominant_emotion_top1' if 'top1' in col else
   f'student_{i}_dominant_emotion_top2'
   for i, col in enumerate(df_dominantEmotion_for_everystudent.columns,
   start=1)
]
# Set index to range from 1 to 10
df_dominantEmotion_for_everystudent.index = range(1, 11)
# Print the final DataFrame
print(df_dominantEmotion_for_everystudent)
```

With the help of this code, two most freq dominant emotions were extracted from each emotion CSV file and added to the final dataframe.

Now the final data frame has 10 columns with features top $_1$ dominant, top $_2$ dominant emotion.

| | dominant_emotion_top1 | dominant_emotion_top2 |
|----|-----------------------|-----------------------|
| 1 | neutral | fear |
| 2 | happy | neutral |
| 3 | neutral | fear |
| 4 | neutral | fear |
| 5 | neutral | neutral |
| 6 | neutral | neutral |
| 7 | fear | sad |
| 8 | neutral | fear |
| 9 | neutral | happy |
| 10 | sad | fear |
| | | |

4.2 Integrating transcript data with emotion data

Prompt:

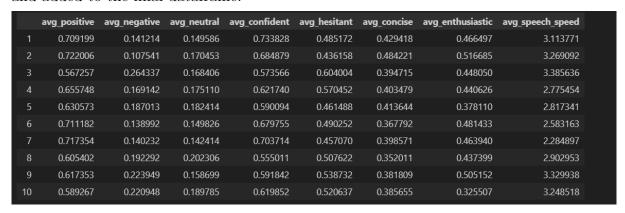
```
id "neutral confident hesitant concise enthusiastic speech_speed
0 0.267454 0.846701 0.845698 0.635805 0.647783 2.517986
1 0.260410 0.679283 0.733701 0.544145 0.417390 3.217822

this is data of csv file of every transcript data and this is student 1.. there are 10
such students, so 10 such df_transcript, so i want to make combined df where two most frequent text data throughtout the video of the student reflects All df_transcript files are transcript_data folder.
```

The response from the chatgpt awesome this time.

```
# Path to the folder containing transcript data
folder_path = 'transcript_data'
# Initialize a list to store average DataFrames for each student
average_dfs = []
for f in os.listdir(folder_path):
    id = f.split('.')[0]
    file_path = os.path.join(folder_path, f)
    features = ['positive', 'negative', 'neutral', 'confident', 'hesitant',
    'concise', 'enthusiastic', 'speech_speed']
    df = pd.read_csv(file_path, usecols=features)
    # Calculate averages
    new_features = ['avg_positive', 'avg_negative', 'avg_neutral',
    'avg_confident', 'avg_hesitant', 'avg_concise', 'avg_enthusiastic',
    'avg_speech_speed']
    avg_values = df[features].mean().values
    # Create a new DataFrame with averages and id
    new_df = pd.DataFrame([avg_values], columns=new_features)
    new_df['id'] = id
    # Append to the list of average DataFrames
    average_dfs.append(new_df)
# Combine all average DataFrames into a single DataFrame
final_df = pd.concat(average_dfs, ignore_index=True)
print(final_df)
```

Using above code, It extracted the above features of transcript data of each student and added to the final dataframe.



Note

Now we have to merge the transcript data with the emotion data. For that we have to merge the dataframes on the basis of student id.

Prompt for merging the emotion_df and transcript_df:

```
df_dominantEmotion_for_everystudent
and final_df add these df on index
```

response from the chatgpt:

Using the above code, the emotion data and transcript data were merged on the basis of student id. The final dataframe after merging the emotion and transcript data is shown below:

| Fin | al Datafra | ame | 9 | | | | | |
|---|----------------|----------|--------------|---------------|-------------|-----------|-----------|---|
| id | d avg_positive | | avg_negative | | avg_neutral | avg_ | confident | |
| 1 | 0.709199 | | 0.141214 | | 0.149586 | 0.733828 | | 1 |
| 2 | 0.722006 | | 0.107541 | | 0.170453 | 0.684879 | | |
| avg_hesitant avg_concise avg_enthus | | | | _enthusiastic | avg_s | speech_sp | eed | |
| 0.485172 0.429418 | | 0.429418 | 0.466497 | | 3.113771 | | | |
| | 0.436158 | | 0.516685 | | | 3.269092 | | |
| dominant_emotion_top1 dominant_emotion_to | | | | _top2 | | | | |
| neutral | | fear | | | | | | |
| happy | | | neutral | | | | | |

5 Prompts for Analysis on the DataFrame made above

5.1 Basic Statistics

Prompt:

How to know whether there are any missing values in the final DataFrame? or just give me description of the dataframe.

Response:

```
print(final_df_with_emotions.describe())
```

The basic statistics of the final DataFrame are as follows:

| | avg_positive | avg_negative | avg_neutral | avg_confident | avg_hesitant | avg_concise | avg_enthusiastic | avg_speech_speed |
|-------|--------------|--------------|-------------|---------------|--------------|-------------|------------------|------------------|
| count | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 | 10.000000 |
| mean | 0.652534 | 0.178566 | 0.168900 | 0.635428 | 0.507159 | 0.401131 | 0.446340 | 2.971076 |
| std | 0.058600 | 0.048346 | 0.019202 | 0.060950 | 0.052672 | 0.036592 | 0.057471 | 0.361271 |
| min | 0.567257 | 0.107541 | 0.142414 | 0.555011 | 0.436158 | 0.352011 | 0.325507 | 2.284897 |
| 25% | 0.608390 | 0.140478 | 0.152044 | 0.590531 | 0.467409 | 0.382770 | 0.438206 | 2.785926 |
| 50% | 0.643161 | 0.178077 | 0.169430 | 0.620796 | 0.498937 | 0.396643 | 0.455995 | 3.008362 |
| 75% | 0.710686 | 0.213784 | 0.180588 | 0.683598 | 0.534208 | 0.411103 | 0.477699 | 3.263949 |
| max | 0.722006 | 0.264337 | 0.202306 | 0.733828 | 0.604004 | 0.484221 | 0.516685 | 3.385636 |

5.2 Correlation Analysis

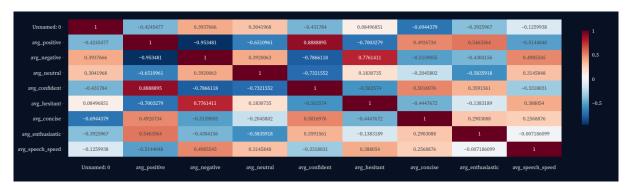
Now i did correlation analysis on the final DataFrame to understand the relationship between different features. **Prompt:**

Now, calculate the correlation matrix of the final DataFrame final_df.

Response:

```
correlation_matrix = final_df_with_emotions.corr()
print(correlation_matrix)
```

Writing and running the code, there was a error in chatgpt response, but I corrected it and ran the code. The correlation matrix is shown below:



5.3 Based on the final_df, I asked for analysis on the data.

Prompt:

now probelm statement is

In this task, you will work with a dataset of 10 candidates containing emotion scores, transcript scores, and the corresponding transcripts extracted from their introduction videos. Your goal is to use the ChatGPT with your prompt engineering skills along with performing Exploratory Data Analysis (EDA) on the data provided, to generate valuable and actionable insights from the data.

Actionable insights include:

- 1. Can we recruit the candidate or not? With suitable reasons from the data.
- Analysis of communication skills and finding areas of expertise based on data.
- 3. Any other insights which help us make decision about the candidate are also welcomed.

This task is designed to assess your ability to preprocess data, create effective prompts, and perform EDA to extract meaningful and actionable information.

Main flow should be like this:

- give plots idea to perform some exploratory data analysis (EDA) on the datasets.
- how to analysis to generate insights about each candidate.
- recommendations based on those insights.
- Finally give a scoring mechanism to rank the students
- Any other insights is welcomed.

Response:

Let's start with the EDA. I'll create a Python script to load and analyze the data. We'll use pandas for data manipulation and matplotlib for visualization.

Candidate Video Analysis ScriptClick to open code
This script performs the following tasks:

Loads the emotion and transcript data
Analyzes the emotion data to calculate average emotion scores, gaze, and blink information
Analyzes the transcript data to calculate average scores and speaking time
Combines the summaries from both datasets
Creates a function to plot emotion distribution over time for a candidate
Generates insights for each candidate based on their data
Prints the insights for all candidates
Plots the emotion distribution for the first candidate as an example

6 Conclusion

This section summarizes the key findings and insights from the data analysis project.