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CSE (Artificial Intelligence & Machine Learning)

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A Machine Learning Project Report on

"Determining sentiment specific to different aspects of product or service within a single review. For example separating opinions about a product's design from its usability."

Submitted in partial fulfillment of the requirements for the V Semester, CSE (AI & ML)

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Certificate

Certified that the mini-project work entitled "Determining sentiment specific to different aspects of product or service within a single review. " has been successfully carried out by "Monica D" bearing USN "1MS23CI404", "Manasavi" bearing USN "1MS22CI038", "Anjali C" bearing USN "1MS22CI010", "Tejaswini" bearing USN "1MS22CI055" and "Pranjal" bearing USN "1MS22CI048", bonafide students of "Ramaiah **Institute of Technology"** in partial fulfillment of the requirements for the 5th semester of "Bachelor of **Engineering in Computer Science and Engineering (AI** & ML)" of Ramaiah Institute of Technology, Bengaluru-54, during the academic year 2024-2025. It is certified that all corrections/suggestions indicated for the internal assessment have been incorporated in the report.

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Acknowledgment

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Abstract

Customer reviews often encompass opinions about multiple aspects of a product or service. While general sentiment analysis captures overall sentiment, it lacks the granularity needed to identify specific feature-level insights, such as design, usability, or performance. This project aims to bridge this gap by implementing an Aspect-Based Sentiment Analysis (ABSA) system. Using advanced Natural Language Processing (NLP) techniques and machine learning models, the system extracts and evaluates sentiments for individual aspects within a single review.

The implementation involves preprocessing data, extracting feature-specific feedback using dependency parsing, and classifying sentiments using logistic regression models trained on vectorized text data. The project extends its utility by incorporating a user-friendly Flask-based web application, enabling end-users to provide feedback and administrators to analyze sentiment-driven insights effectively. The system provides granular feedback on product attributes, empowering businesses to make targeted improvements.

This innovative approach to customer feedback analysis addresses a critical need in data-driven decision-making for businesses.



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> **INTRODUCTION:**

Customer reviews often encompass multiple perspectives, reflecting opinions on various aspects of a product or service. While overall sentiment analysis helps determine general customer satisfaction, it fails to capture nuanced sentiments tied to specific features such as design, usability, performance, or pricing. This limitation restricts businesses from gaining targeted insights necessary for strategic improvements.

Aspect-Based Sentiment Analysis (ABSA) addresses this challenge by breaking down reviews into feature-specific sentiments. This project focuses on identifying and differentiating sentiments related to a product's design and usability within a single review. The implementation combines advanced NLP techniques like dependency parsing and sentiment classification with ML models. The system not only separates opinions but also evaluates their polarity—positive, neutral, or negative—providing a detailed understanding of customer feedback.

The methodology involves preprocessing textual data, extracting relevant aspects using custom-defined rules and ML classifiers, and predicting sentiments using state-of-the-art transformers. The output assists stakeholders in pinpointing strengths and areas for improvement in specific product features.

> PROBLEM STATEMENT:

Determining sentiment specific to different aspects of product or service within a single review. For example separating opinions about a product's design from its usability.

> IMPLEMENTATION:

Google Collab Code for building our ML Model:



≻ CODE:

```
import pandas as pd
# Load the dataset
file path = '/content/Phone_Dataset.csv'
data = pd.read csv(file path)
# Display the first few rows
print("Dataset Preview:")
print(data.head())
import re
# Preprocessing function
df = data
def preprocess text(text):
  # Basic text cleaning (remove special characters, convert to lowercase)
  text = re.sub(r"[^\w\s]", "", text)
  return text.lower()
# Apply preprocessing
df["Cleaned Review"] = df["Review"].apply(preprocess text)
# Split into usability and design text (if needed)
def extract aspect reviews(review):
  parts = review.split("additionally")
  usability_part = parts[0].strip() if len(parts) > 0 else ""
  design part = parts[1].strip() if len(parts) > 1 else ""
  return usability part, design part
df["Usability Feedback"], df["Design Feedback"] =
zip(*df["Review"].apply(extract aspect reviews))
print("Dataset after preprocessing:")
```



```
print(df.head())
!pip install scikit-learn
from sklearn.model selection import train test split
from sklearn.feature extraction.text import CountVectorizer
from sklearn.linear model import LogisticRegression
from sklearn.metrics import classification report
# Generate dummy sentiments for usability and design for training
import random
df["Usability Sentiment"] = [random.choice(["Positive", "Negative"]) for in
range(len(df))]
df["Design Sentiment"] = [random.choice(["Positive", "Negative"]) for in
range(len(df))]
# Prepare data
vectorizer = CountVectorizer()
X = vectorizer.fit transform(df["Cleaned Review"])
y_usability = df["Usability Sentiment"]
y design = df["Design Sentiment"]
# Train-test split
X train u, X test u, y train u, y test u = train test split(X, y usability,
test size=0.2, random state=42)
X train d, X test d, y train d, y test d = train test split(X, y design,
test size=0.2, random state=42)
# Train models
usability model = LogisticRegression()
design model = LogisticRegression()
usability model.fit(X train u, y train u)
design model.fit(X train d, y train d)
# Evaluate
print("Usability Sentiment Analysis Report:")
```



```
print(classification report(y test u, usability model.predict(X test u)))
print("Design Sentiment Analysis Report:")
print(classification report(y test d, design model.predict(X test d)))
def predict sentiment(review):
  # Clean the review
  cleaned review = preprocess text(review)
  # Transform using the vectorizer
  transformed review = vectorizer.transform([cleaned review])
  # Predict usability and design sentiments
  usability pred = usability model.predict(transformed review)[0]
  design pred = design model.predict(transformed review)[0]
  return {"usability_sentiment": usability_pred, "design_sentiment":
design pred}
# Example new review
new review = "The phone is easy to use and very responsive. But the design
isn't that good."
predictions = predict sentiment(new review)
print("Predictions for new review:", predictions)
import joblib
# Save the trained models
joblib.dump(usability model, 'usability model.pkl') # Saves usability model
joblib.dump(design model, 'design model.pkl') # Saves design model
# Save the vectorizer
joblib.dump(vectorizer, 'vectorizer.pkl')
                                             # Saves the vectorizer
print("Models and vectorizer saved successfully!")
from google.colab import files
# Download the usability model
files.download('usability model.pkl')
```



```
# Download the design model
files.download('design model.pkl')
# Download the vectorizer
files.download('vectorizer.pkl')
import pandas as pd
# Load the dataset
file path = '/content/Phone Dataset.csv'
df= pd.read csv(file path)
# Count occurrences of each sentiment
sentiment counts = df['Sentiment'].value counts()
# Calculate percentage distribution
sentiment percentages = (sentiment counts / len(df)) * 100
# Display counts and percentages
print("Counts:")
print(sentiment counts)
print("\nPercentages:")
print(sentiment percentages)
```

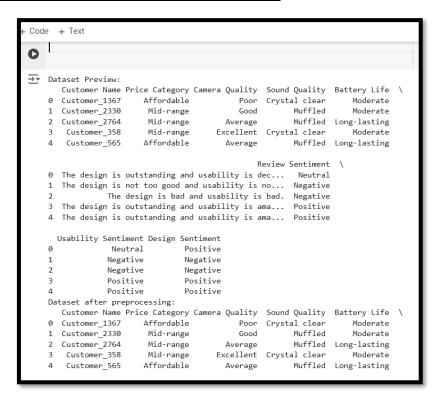
```
import pandas as pd
    # Load the dataset
   file_path = '/content/Phone_Dataset.csv'
   data = pd.read_csv(file_path)
    # Display the first few rows
    print("Dataset Preview:")
   print(data.head())
   import re
   # Preprocessing function
   df = data
   def preprocess_text(text):
        # Basic text cleaning (remove special characters, convert to lowercase)
       text = re.sub(r"[^\w\s]", "", text)
       return text.lower()
    # Apply preprocessing
    df["Cleaned Review"] = df["Review"].apply(preprocess_text)
    # Split into usability and design text (if needed)
   def extract_aspect_reviews(review):
        parts = review.split("additionally")
        usability_part = parts[0].strip() if len(parts) > 0 else ""
        design_part = parts[1].strip() if len(parts) > 1 else ""
        return usability_part, design_part
    df["Usability Feedback"], df["Design Feedback"] = zip(*df["Review"].apply(extract_aspect_reviews))
```

```
print("Dataset after preprocessing:")
print(df.head())
!pip install scikit-learn
from sklearn.model_selection import train_test_split
from sklearn.feature extraction.text import CountVectorizer
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import classification_report
# Generate dummy sentiments for usability and design for training
df["Usability Sentiment"] = [random.choice(["Positive", "Negative"]) for _ in range(len(df))]
df["Design Sentiment"] = [random.choice(["Positive", "Negative"]) for _ in range(len(df))]
# Prepare data
vectorizer = CountVectorizer()
X = vectorizer.fit_transform(df["Cleaned Review"])
y_usability = df["Usability Sentiment"]
y_design = df["Design Sentiment"]
# Train-test split
X_train_u, X_test_u, y_train_u, y_test_u = train_test_split(X, y_usability, test_size=0.2, random_state=42)
X_train_d, X_test_d, y_train_d, y_test_d = train_test_split(X, y_design, test_size=0.2, random_state=42)
usability_model = LogisticRegression()
design_model = LogisticRegression()
usability_model.fit(X_train_u, y_train_u)
design_model.fit(X_train_d, y_train_d)
```

```
+ Code + Text
 # Evaluate
      print("Usability Sentiment Analysis Report:")
      print(classification_report(y_test_u, usability_model.predict(X_test_u)))
      print("Design Sentiment Analysis Report:")
      print(classification_report(y_test_d, design_model.predict(X_test_d)))
      def predict_sentiment(review):
          # Clean the review
          cleaned_review = preprocess_text(review)
          # Transform using the vectorizer
          transformed_review = vectorizer.transform([cleaned_review])
          # Predict usability and design sentiments
          usability_pred = usability_model.predict(transformed_review)[0]
          design_pred = design_model.predict(transformed_review)[0]
          return {"usability_sentiment": usability_pred, "design_sentiment": design_pred}
      # Example new review
      new_review = "The phone is easy to use and very responsive. But the design isn't that good."
      predictions = predict_sentiment(new_review)
      print("Predictions for new review:", predictions)
      import joblib
      # Save the trained models
      joblib.dump(usability_model, 'usability_model.pkl') # Saves usability model
      joblib.dump(design_model, 'design_model.pkl')
                                                          # Saves design model
      # Save the vectorizer
      joblib.dump(vectorizer, 'vectorizer.pkl')
                                                           # Saves the vectorizer
      print("Models and vectorizer saved successfully!")
      from google.colab import files
```

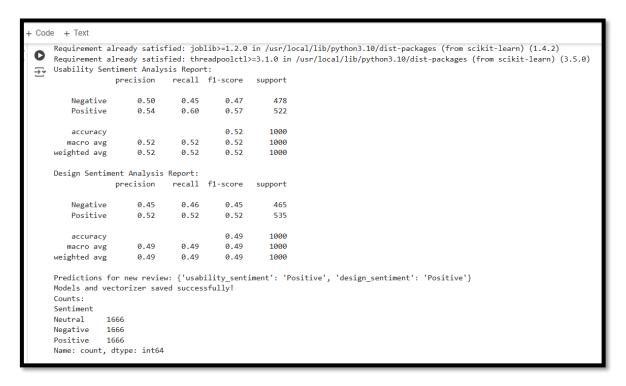
```
RAM
Code + Text
                                                                     Disk
                                                                  J
                                                                      +
                                                                         G
# Download the usability model
    files.download('usability_model.pkl')
    # Download the design model
    files.download('design_model.pkl')
    # Download the vectorizer
    files.download('vectorizer.pkl')
    import pandas as pd
    # Load the dataset
    file_path = '/content/Phone_Dataset.csv' # Update path if needed
    df= pd.read_csv(file_path)
    # Count occurrences of each sentiment
    sentiment_counts = df['Sentiment'].value_counts()
    # Calculate percentage distribution
    sentiment_percentages = (sentiment_counts / len(df)) * 100
    # Display counts and percentages
    print("Counts:")
    print(sentiment_counts)
    print("\nPercentages:")
    print(sentiment_percentages)
```

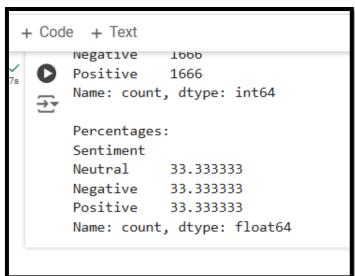
> GOOGLE COLAB OUTPUT:



```
+ Code
        + Text
 0
 ∓*
                                                               Review Sentiment \
          The design is outstanding and usability is dec...
         The design is not too good and usability is no...
                      The design is bad and usability is bad. Negative
          The design is outstanding and usability is ama... Positive
         The design is outstanding and usability is ama... Positive
         Usability Sentiment Design Sentiment
                       Neutral
                                           Positive
                      Negative
                                           Negative
                      Negative
                                           Negative
                      Positive
                                           Positive
                      Positive
                                           Positive
                                                     Cleaned Review \
      \boldsymbol{0} % \boldsymbol{0} the design is outstanding and usability is decent
         the design is not too good and usability is no...
                       the design is bad and usability is bad
      3 the design is outstanding and usability is ama...4 the design is outstanding and usability is ama...
                                                Usability Feedback Design Feedback
         The design is outstanding and usability is dec...
          The design is not too good and usability is no..
                      The design is bad and usability is bad.
          The design is outstanding and usability is ama...
          The design is outstanding and usability is ama..
      Requirement already satisfied: scikit-learn in /usr/local/lib/python3.10/dist-packages (1.6.0)
Requirement already satisfied: numpy>=1.19.5 in /usr/local/lib/python3.10/dist-packages (from scikit-learn) (1.26.4)
       Requirement already satisfied: scipy>=1.6.0 in /usr/local/lib/python3.10/dist-packages (from scikit-learn) (1.13.1)
       Requirement already satisfied: joblib>=1.2.0 in /usr/local/lib/python3.10/dist-packages (from scikit-learn) (1.4.2)
Requirement already satisfied: threadpoolctl>=3.1.0 in /usr/local/lib/python3.10/dist-packages (from scikit-learn) (3.5.0)
```







EXPLANATION:

This code performs sentiment analysis on a dataset of phone reviews using a machine learning approach. Here's a concise explanation:

1. Load and Preview Data: Reads a CSV dataset (Phone_Dataset.csv) and displays the first few rows for inspection.



- 2. Text Preprocessing: Cleans the reviews by removing special characters, converting text to lowercase, and splitting feedback into usability and design aspects.
- 3. Dummy Sentiment Labels: Generates random "Positive" or "Negative" sentiments for usability and design feedback as placeholders.
- 4. Feature Extraction: Converts cleaned reviews into numerical vectors using CountVectorizer for training models.
- 5. Data Splitting: Splits the dataset into training and test sets for usability and design sentiments.
- 6. Model Training: Trains two separate Logistic Regression models, one for usability sentiment and another for design sentiment.
- 7. Evaluation: Evaluates the models using the test set and prints classification reports for both.
- 8. Prediction: Defines a function to predict usability and design sentiments for new reviews using the trained models.
- 9. Save Models: Saves the trained models and vectorizer using joblib for future use.
- 10. File Downloads: Allows downloading of the saved models and vectorizer in a Google Colab environment.
- 11. Sentiment Analysis Summary: Calculates and displays sentiment counts and percentage distribution for the dataset.

This workflow demonstrates preprocessing, training, evaluation, and deployment of sentiment analysis models.

Creating Website using Flask:

Step 1: Open File Explorer

- 1. Navigate to a location where you want to create your project folder (e.g., Documents, Desktop).
- 2. Right-click in the folder and select New > Folder.
- 3. Name the folder as Flask_ML_Project.



Step 2: Create Sub-Folders and Files

- 1. Open the Flask_ML_Project folder.
- 2. Inside it, create the following:
 - o A new folder named templates.
 - o A new file named app.py.

Step 3: Add Files

- 1. Place HTML Files in the templates Folder:
 - o Navigate to the templates folder.
 - o Open Notepad or a code editor (e.g., VS Code or Sublime Text).

The HTML FILES with CODE are as below:

#home page.html:

```
<!DOCTYPE html>
<html>
<head>
<title>Welcome</title>
<style>
/* General Styling */
body {
font-family: 'Arial', sans-serif;
margin: 0;
padding: 0;
background: linear-gradient(135deg, #e0eafc, #cfdef3);
```



```
display: flex;
  justify-content: center;
  align-items: center;
  height: 100vh;
/* Center container styling */
.container {
  text-align: center;
  background: rgba(255, 255, 255, 0.9);
  padding: 30px;
  border-radius: 20px;
  box-shadow: 0px 10px 20px rgba(0, 0, 0, 0.2);
  max-width: 500px;
  width: 90%;
/* Heading styling */
h2 {
  font-size: 2.5rem;
  color: #333;
  margin-bottom: 20px;
  text-shadow: 2px 2px 5px rgba(0, 0, 0, 0.2);
/* Button styling */
button {
  font-size: 1.2rem;
  font-weight: bold;
  color: #fff;
```



```
background: linear-gradient(135deg, #6a11cb, #2575fc);
  padding: 15px 30px;
  margin: 10px;
  border: none;
  border-radius: 50px;
  cursor: pointer;
  transition: all 0.3s ease-in-out;
  box-shadow: 0px 4px 10px rgba(0, 0, 0, 0.1);
  text-transform: uppercase;
/* Button hover effects */
button:hover {
  background: linear-gradient(135deg, #2575fc, #6a11cb);
  box-shadow: 0px 8px 15px rgba(0, 0, 0, 0.3);
  transform: translateY(-5px);
/* Add button animation */
button:active {
  transform: translateY(2px);
  box-shadow: 0px 4px 8px rgba(0, 0, 0, 0.2);
/* Footer text */
.footer {
  margin-top: 20px;
  font-size: 0.9rem;
  color: #555;
  text-shadow: 1px 1px 2px rgba(0, 0, 0, 0.1);
```



```
/* Shape decorations */
.circle {
  position: absolute;
  background: rgba(255, 255, 255, 0.5);
  border-radius: 50%;
  filter: blur(50px);
/* Circle styles */
.circle-1 {
  width: 200px;
  height: 200px;
  top: -50px;
  left: -50px;
.circle-2 {
  width: 300px;
  height: 300px;
  bottom: -100px;
  right: -100px;
.circle-3 {
  width: 150px;
  height: 150px;
  top: 50px;
  right: 20px;
}
```

```
</style>
</head>
<body>
  <!-- Background circles for decoration -->
  <div class="circle circle-1"></div>
  <div class="circle circle-2"></div>
  <div class="circle circle-3"></div>
  <div class="container">
    <h2>Welcome to</h2>
      <h2> One Plus Nord 3 5G Phone's</h2>
      <h2> Feedback Portal</h2>
    <button onclick="window.location.href='/feedback'">Provide
Feedback</button>
    <button onclick="window.location.href='/admin-login'">Admin
Login</button>
    <div class="footer">
       We value your feedback and insights!
    </div>
  </div>
</body>
</html>
```

#feedback_form.html:

```
<!DOCTYPE html>
<html lang="en">
<head>
<meta charset="UTF-8">
```



```
<meta name="viewport" content="width=device-width, initial-scale=1.0">
  <title>Feedback Form</title>
<style>
  /* Global styles */
  body {
    font-family: 'Poppins', sans-serif;
    background: linear-gradient(45deg, #4facfe, #00f2fe);
    margin: 0;
    padding: 0;
    display: flex;
    justify-content: center;
    align-items: center;
    min-height: 100vh;
    overflow: auto;
  /* Decorative background shapes */
  .circle {
    position: absolute;
    border-radius: 50%;
    opacity: 0.1;
  }
  .circle-1 {
    width: 200px;
    height: 200px;
    background-color: #fff;
    top: 10%;
    left: 10%;
```



```
.circle-2 {
  width: 300px;
  height: 300px;
  background-color: #fff;
  top: 60%;
  right: 20%;
}
.circle-3 {
  width: 250px;
  height: 250px;
  background-color: #fff;
  bottom: 15%;
  left: 50%;
/* Form container */
.container {
  background-color: rgba(255, 255, 255, 0.95);
  padding: 30px 40px;
  border-radius: 15px;
  box-shadow: 0 10px 30px rgba(0, 0, 0, 0.2);
  width: 80%;
  max-width: 750px;
  z-index: 10;
}
h2 {
  color: #003f8a;
```



```
text-align: center;
  margin-bottom: 20px;
  font-size: 30px;
  font-weight: bold;
  text-transform: uppercase;
}
/* Form input styles */
label {
  font-size: 18px;
  font-weight: bold;
  color: #007acc;
  text-decoration: underline;
  margin-top: 20px;
  display: block;
}
input[type="text"], input[type="email"], textarea {
  width: 100%;
  padding: 14px;
  margin-top: 6px;
  border-radius: 8px;
  border: 1px solid #ddd;
  font-size: 16px;
  font-family: 'Poppins', sans-serif;
  transition: border-color 0.3s ease;
  margin-bottom: 15px; /* Added space after each field */
input[type="text"]:focus, input[type="email"]:focus, textarea:focus {
```



```
border-color: #007acc;
  outline: none;
  box-shadow: 0 0 6px rgba(0, 122, 204, 0.5);
}
textarea {
  resize: vertical;
  height: 120px;
/* Radio button group */
.radio-group {
  display: grid;
  grid-template-columns: repeat(auto-fill, minmax(100px, 1fr));
  gap: 10px 20px;
  margin: 10px 0 20px;
}
.radio-group div {
  display: flex;
  align-items: center;
}
.radio-group input[type="radio"] {
  margin-right: 8px;
  transform: scale(1.2);
  accent-color: #007acc; /* Stylish checkbox */
.radio-group label {
  font-size: 15px;
  color: #555;
```



```
font-weight: normal;
/* Submit button */
button[type="submit"] {
  background-color: #007acc;
  color: white;
  border: none;
  padding: 14px 20px;
  border-radius: 8px;
  font-size: 18px;
  font-family: 'Poppins', sans-serif;
  cursor: pointer;
  width: 100%;
  margin-top: 20px;
  transition: background-color 0.3s ease, box-shadow 0.3s ease;
button[type="submit"]:hover {
  background-color: #005ea6;
  box-shadow: 0 0 10px rgba(0, 122, 204, 0.6);
}
/* Responsive styles */
@media (max-width: 600px) {
  .container {
    width: 90%;
    padding: 20px;
  h2 {
```



```
font-size: 26px;
</style>
</head>
<body>
  <!-- Decorative background shapes -->
  <div class="circle circle-1"></div>
  <div class="circle circle-2"></div>
  <div class="circle circle-3"></div>
  <!-- Form container -->
  <div class="container">
    <h2>Feedback Form</h2>
    <form method="POST" action="/submit-feedback">
       <label for="name">Name:</label>
       <input type="text" id="name" name="name" required>
       <label for="email">Email:</label>
       <input type="email" id="email" name="email" required>
       <label for="phone">Phone:</label>
       <input type="text" id="phone" name="phone" required>
       <!-- New Design Review -->
       <label for="design review">Design Review:</label>
       <div class="radio-group">
         <div>
           <input type="radio" id="design outstanding"</pre>
name="design review" value="outstanding">
           <label for="design outstanding">Outstanding</label>
         </div>
```



```
<div>
           <input type="radio" id="design best" name="design review"</pre>
value="best">
           <label for="design best">Best</label>
         </div>
         <div>
           <input type="radio" id="design good" name="design review"
value="good">
            <label for="design good">Good</label>
         </div>
         <div>
           <input type="radio" id="design poor" name="design review"</pre>
value="poor">
           <label for="design poor">Poor</label>
         </div>
         <div>
           <input type="radio" id="design worst" name="design review"</pre>
value="worst">
            <label for="design worst">Worst</label>
         </div>
         <div>
           <input type="radio" id="design terrible" name="design review"</pre>
value="terrible">
            <label for="design terrible">Terrible</label>
         </div>
       </div>
       <!-- New Usability Review -->
       <label for="usability review">Usability Review:</label>
       <div class="radio-group">
```



```
<div>
            <input type="radio" id="usability outstanding"</pre>
name="usability review" value="outstanding">
            <label for="usability outstanding">Outstanding</label>
          </div>
          < div>
            <input type="radio" id="usability_best" name="usability_review"</pre>
value="best">
            <label for="usability best">Best</label>
          </div>
          <div>
            <input type="radio" id="usability good" name="usability review"</pre>
value="good">
            <label for="usability good">Good</label>
          </div>
          <div>
            <input type="radio" id="usability poor" name="usability review"</pre>
value="poor">
            <label for="usability poor">Poor</label>
          </div>
          < div>
            <input type="radio" id="usability worst" name="usability review"</pre>
value="worst">
            <label for="usability worst">Worst</label>
          </div>
          < div >
            <input type="radio" id="usability terrible"</pre>
name="usability review" value="terrible">
            <label for="usability terrible">Terrible</label>
```



```
</div>
       </div>
       <!-- New Price Review -->
       <label for="price review">Price Review:</label>
       <div class="radio-group">
         <div>
            <input type="radio" id="price outstanding" name="price review"</pre>
value="outstanding">
            <label for="price outstanding">Outstanding</label>
         </div>
         <div>
            <input type="radio" id="price best" name="price review"</pre>
value="best">
            <label for="price best">Best</label>
         </div>
         <div>
            <input type="radio" id="price good" name="price review"</pre>
value="good">
            <label for="price good">Good</label>
         </div>
         <div>
            <input type="radio" id="price_poor" name="price_review"</pre>
value="poor">
            <label for="price poor">Poor</label>
         </div>
         <div>
            <input type="radio" id="price worst" name="price review"</pre>
value="worst">
            <label for="price worst">Worst</label>
```



```
</div>
         <div>
            <input type="radio" id="price terrible" name="price review"</pre>
value="terrible">
            <label for="price terrible">Terrible</label>
         </div>
       </div>
       <!-- New Sound Quality Review -->
       <label for="sound quality review">Sound Quality Review:</label>
       <div class="radio-group">
         < div>
            <input type="radio" id="sound quality outstanding"</pre>
name="sound_quality_review" value="outstanding">
            <label for="sound quality outstanding">Outstanding</label>
         </div>
         <div>
            <input type="radio" id="sound quality best"</pre>
name="sound quality review" value="best">
            <label for="sound quality best">Best</label>
         </div>
         <div>
            <input type="radio" id="sound quality good"</pre>
name="sound quality review" value="good">
            <label for="sound quality good">Good</label>
         </div>
         <div>
            <input type="radio" id="sound quality poor"</pre>
name="sound quality review" value="poor">
            <label for="sound quality poor">Poor</label>
```



```
</div>
         <div>
            <input type="radio" id="sound quality worst"</pre>
name="sound quality review" value="worst">
            <label for="sound quality worst">Worst</label>
         </div>
         <div>
           <input type="radio" id="sound_quality_terrible"</pre>
name="sound_quality_review" value="terrible">
            <label for="sound quality terrible">Terrible</label>
         </div>
       </div>
       <!-- New Camera Quality Review -->
       <label for="camera quality review">Camera Quality Review:</label>
       <div class="radio-group">
         <div>
            <input type="radio" id="camera quality outstanding"</pre>
name="camera quality review" value="outstanding">
            <label for="camera quality outstanding">Outstanding</label>
         </div>
         <div>
            <input type="radio" id="camera quality best"</pre>
name="camera quality review" value="best">
            <label for="camera quality best">Best</label>
         </div>
         < div>
            <input type="radio" id="camera quality good"</pre>
name="camera quality review" value="good">
            <label for="camera quality good">Good</label>
```



```
</div>
         <div>
            <input type="radio" id="camera quality poor"</pre>
name="camera quality review" value="poor">
            <label for="camera quality poor">Poor</label>
         </div>
         <div>
            <input type="radio" id="camera quality worst"</pre>
name="camera quality review" value="worst">
            <label for="camera quality worst">Worst</label>
         </div>
         <div>
            <input type="radio" id="camera quality terrible"</pre>
name="camera_quality_review" value="terrible">
            <label for="camera quality terrible">Terrible</label>
         </div>
       </div>
       <!-- New Battery Life Review -->
       <label for="battery life review">Battery Life Review:</label>
       <div class="radio-group">
         <div>
            <input type="radio" id="battery life outstanding"</pre>
name="battery life review" value="outstanding">
            <label for="battery life outstanding">Outstanding</label>
         </div>
         < div>
            <input type="radio" id="battery life best"
name="battery life review" value="best">
            <label for="battery life best">Best</label>
```



```
</div>
          <div>
            <input type="radio" id="battery life good"</pre>
name="battery life review" value="good">
            <label for="battery life good">Good</label>
         </div>
          <div>
            <input type="radio" id="battery life poor"</pre>
name="battery_life_review" value="poor">
            <label for="battery life poor">Poor</label>
          </div>
         <div>
            <input type="radio" id="battery life worst"</pre>
name="battery life review" value="worst">
            <label for="battery life worst">Worst</label>
          </div>
         <div>
            <input type="radio" id="battery life terrible"</pre>
name="battery_life_review" value="terrible">
            <label for="battery life terrible">Terrible</label>
         </div>
       </div>
       <!-- Renamed Suggestions Field -->
        <label for="suggestions">Suggestions:</label>
        <textarea id="suggestions" name="suggestions" placeholder="Your
suggestions..." required></textarea>
       <button type="submit">Submit</button>
     </form>
```



```
</div>
</body>
</html>
```

#submission confirmation.html:

```
<!DOCTYPE html>
<html>
<head>
  <title>Feedback Submitted</title>
  <style>
    /* General body styling */
    body {
       font-family: 'Arial', sans-serif;
       margin: 0;
       padding: 0;
       background: linear-gradient(135deg, #ff9a9e, #fad0c4);
       display: flex;
       justify-content: center;
       align-items: center;
       height: 100vh;
       color: #333;
    /* Center container styling */
    .container {
       text-align: center;
       background: rgba(255, 255, 255, 0.9);
```



```
padding: 40px;
  border-radius: 20px;
  box-shadow: 0px 10px 20px rgba(0, 0, 0, 0.2);
  max-width: 600px;
  width: 90%;
/* Heading styling */
h2 {
  font-size: 2.5rem;
  color: #333;
  margin-bottom: 20px;
  text-shadow: 2px 2px 5px rgba(0, 0, 0, 0.2);
/* Paragraph styling */
p {
  font-size: 1.2rem;
  margin-bottom: 20px;
  color: #555;
  line-height: 1.6;
/* Link button styling */
a {
  text-decoration: none;
  color: #fff;
  background: linear-gradient(135deg, #36d1dc, #5b86e5);
  padding: 15px 30px;
  font-size: 1.2rem;
```



```
font-weight: bold;
  border-radius: 50px;
  box-shadow: 0px 4px 10px rgba(0, 0, 0, 0.1);
  transition: all 0.3s ease-in-out;
/* Hover effects for link button */
a:hover {
  background: linear-gradient(135deg, #5b86e5, #36d1dc);
  box-shadow: 0px 8px 15px rgba(0, 0, 0, 0.3);
  transform: translateY(-5px);
/* Add click animation */
a:active {
  transform: translateY(2px);
  box-shadow: 0px 4px 8px rgba(0, 0, 0, 0.2);
/* Decorative circles for aesthetic design */
.circle {
  position: absolute;
  background: rgba(255, 255, 255, 0.3);
  border-radius: 50%;
  filter: blur(50px);
/* Different circle sizes and positions */
.circle-1 {
  width: 200px;
  height: 200px;
```



```
top: -50px;
       left: -50px;
    .circle-2 {
       width: 300px;
       height: 300px;
       bottom: -100px;
       right: -100px;
    .circle-3 {
       width: 150px;
       height: 150px;
       top: 50px;
       right: 20px;
  </style>
</head>
<body>
  <!-- Decorative circles -->
  <div class="circle circle-1"></div>
  <div class="circle circle-2"></div>
  <div class="circle circle-3"></div>
  <!-- Main container -->
  <div class="container">
    <h2>Thank You!</h2>
    Your feedback has been submitted successfully. We appreciate your
effort in helping us improve!
    <a href="/">Go back to Home</a>
```



```
</div>
</body>
</html>
```

#admin login.html:

```
<!DOCTYPE html>
<html>
<head>
  <title>Admin Login</title>
  <style>
    /* General body styling */
    body {
       font-family: 'Arial', sans-serif;
       margin: 0;
       padding: 0;
       background: linear-gradient(135deg, #ff9a9e, #fad0c4);
       height: 100vh;
       display: flex;
       justify-content: center;
       align-items: center;
       color: #333;
    /* Login container styling */
    .login-container {
       background: rgba(255, 255, 255, 0.9);
       border-radius: 15px;
```



```
padding: 40px;
  box-shadow: 0px 10px 20px rgba(0, 0, 0, 0.2);
  width: 300px;
  text-align: center;
/* Heading styling */
h2 {
  font-size: 2rem;
  color: #ff6b6b;
  margin-bottom: 20px;
/* Input field styling */
input[type="text"], input[type="password"] {
  width: 100%;
  padding: 10px;
  margin: 10px 0;
  border: 1px solid #ddd;
  border-radius: 8px;
  font-size: 1rem;
input[type="text"]:focus, input[type="password"]:focus {
  outline: none;
  border: 1px solid #ff6b6b;
  box-shadow: 0px 2px 5px rgba(255, 107, 107, 0.4);
/* Button styling */
button {
```



```
width: 100%;
  padding: 10px;
  background: #ff6b6b;
  color: white;
  font-size: 1rem;
  font-weight: bold;
  border: none;
  border-radius: 8px;
  cursor: pointer;
  transition: all 0.3s ease-in-out;
  margin-top: 10px;
button:hover {
  background: #ff7878;
  box-shadow: 0px 5px 15px rgba(255, 107, 107, 0.3);
button:active {
  transform: translateY(2px);
/* Flash message styling */
p {
  color: red;
  font-size: 0.9rem;
  margin-top: 10px;
/* Decorative shapes */
.circle {
```



```
position: absolute;
       background: rgba(255, 255, 255, 0.3);
       border-radius: 50%;
       filter: blur(50px);
    .circle-1 {
       width: 250px;
       height: 250px;
       top: -50px;
       left: -80px;
    .circle-2 {
       width: 200px;
       height: 200px;
       bottom: -60px;
       right: -60px;
  </style>
</head>
<body>
  <!-- Decorative background shapes -->
  <div class="circle circle-1"></div>
  <div class="circle circle-2"></div>
  <!-- Login container -->
  <div class="login-container">
    <h2>Admin Login</h2>
    <form method="POST" action="/admin-login">
```

#admin dashboard.html:

```
<!DOCTYPE html>
<html>
<head>
<title>Admin Dashboard</title>
<style>

/* General Styling */
body {

font-family: 'Arial', sans-serif;
background-color: #f4f7fc;
margin: 0;
```



```
padding: 0;
  display: flex;
  flex-direction: column;
  align-items: center;
  justify-content: center;
}
h1 {
  font-size: 2.8em;
  font-weight: 600;
  color: #1f78d1;
  text-align: center;
  margin-top: 20px;
.logout-button-container {
  width: 100%;
  display: flex;
  justify-content: flex-end;
  margin: 20px 0;
  padding: 0 10px;
.logout-button {
  background-color: #f56b2a;
  color: white;
  padding: 12px 30px;
  border-radius: 50px;
  font-size: 1.1em;
  text-decoration: none;
```

```
box-shadow: 0 4px 10px rgba(0, 0, 0, 0.15);
  border: none;
  cursor: pointer;
  transition: all 0.3s ease;
.logout-button:hover {
  background-color: #d75a22;
  transform: translateY(-4px);
.table-container {
  width: 100%;
  max-height: 500px; /* Restrict height for vertical scrolling */
  overflow-y: auto;
  padding: 0 10px; /* Add some padding to prevent edge overlap */
}
table {
  width: 100%;
  border-collapse: collapse;
  font-size: 1.1em;
  color: #333;
}
th, td {
  padding: 15px;
  text-align: left;
  border-bottom: 1px solid #ddd;
}
th {
```



```
background-color: #1f78d1;
       color: white;
     tr:nth-child(even) {
       background-color: #f9f9f9;
     }
    tr:hover {
       background-color: #f7f7f7;
    /* Responsive Design */
     @media (max-width: 768px) {
       h1 {
         font-size: 2.2em;
       .logout-button \{
         font-size: 1em;
       table {
         font-size: 1em;
       th, td {
         padding: 10px;
  </style>
</head>
<body>
```



```
<h1>Admin Dashboard</h1>
<div class="logout-button-container">
 <a href="/logout" class="logout-button">Log Out</a>
</div>
<div class="table-container">
 <thead>
     >
       Name
       Email
       Phone
       Price Sentiment
       Sound Quality Sentiment
       Battery Life Sentiment
       Camera Sentiment
       Usability Sentiment
       Design Sentiment
       Customer's Suggestion
       Product Review
     </thead>
   {% for feedback in feedbacks %}
     >
       {{ feedback['name'] }}
       {{ feedback['email'] }}
       <\!td\!\!>\!\!\{\{\ feedback['phone']\ \}\}<\!\!/td\!\!>
```

```
{{ feedback['price_sentiment'] }}
{{ feedback['sound_sentiment'] }}
{{ feedback['battery_life_sentiment'] }}
{{ feedback['battery_life_sentiment'] }}
{{ feedback['camera_sentiment'] }}
{{ feedback['usability_sentiment'] }}
{{ feedback['design_sentiment'] }}
{{ feedback['design_sentiment'] }}
{{ feedback['suggestions'] }}
{{ feedback['product_review'] }}

{% endfor %}

</body>
</html>
```

2. Place Python Code in app.py:

- o Go back to the main Flask_ML_Project folder.
- o Open app.py in your code editor.
- Save the file.

#app.py:

```
from flask import Flask, render_template, request, redirect, url_for, flash, session
import joblib
app = Flask(__name__)
```

```
app.secret key = 'your secret key'
# Load models and vectorizer
usability model = joblib.load('usability model.pkl')
design model = joblib.load('design model.pkl')
vectorizer = joblib.load('vectorizer.pkl')
# Hardcoded admin credentials
ADMIN USERNAME = "admin"
ADMIN PASSWORD = "123"
# List to store feedback data
feedback list = []
# Positive and Negative Sentiment Keywords
POSITIVE KEYWORDS = ["good", "nice", "very good", "best",
"outstanding", "fantastic", "great", "excellent"]
NEGATIVE KEYWORDS = ["bad", "poor", "very bad", "disappointed",
"worst", "terrible"]
# Helper function to extract sentiment
def extract sentiment(review type):
  if review type in POSITIVE KEYWORDS:
    return "Positive"
  elif review type in NEGATIVE KEYWORDS:
    return "Negative"
  return "Neutral"
# Helper function to calculate product review sentiment
def calculate product review(sentiments):
  positive count = sentiments.count("Positive")
  negative count = sentiments.count("Negative")
  if positive count > 3:
    return "Positive"
```



```
elif negative count > 3:
    return "Negative"
  return "Neutral"
# Main home page with options
@app.route('/')
def main home():
  return render template('home page.html')
# Feedback form
@app.route('/feedback')
def feedback():
  return render template('feedback form.html')
# Process feedback
(@app.route('/submit-feedback', methods=['POST'])
def submit feedback():
  if request.method == 'POST':
    name = request.form.get('name')
    email = request.form.get('email')
    phone = request.form.get('phone')
    suggestions = request.form.get('suggestions')
    # Sentiments for different aspects
    usability_review = extract_sentiment(request.form.get('usability_review'))
    design review = extract sentiment(request.form.get('design review'))
    price review = extract sentiment(request.form.get('price review'))
    sound review =
extract sentiment(request.form.get('sound quality review'))
    battery review =
extract sentiment(request.form.get('battery life review'))
```



```
camera review =
extract sentiment(request.form.get('camera quality review'))
    # Calculate overall product review
    sentiments = [usability review, design review, price review,
sound review, battery review, camera review]
    product review = calculate product review(sentiments)
# Store feedback
    feedback list.append({
       'name': name,
       'email': email,
       'phone': phone,
       'usability sentiment': usability review,
       'design sentiment': design review,
       'price sentiment': price review,
       'sound sentiment': sound review,
       'battery life sentiment': battery review,
       'camera sentiment': camera review,
       'suggestions': suggestions,
       'product review': product review
    })
    return render template('submission confirmation.html')
# Admin login
@app.route('/admin-login', methods=['GET', 'POST'])
def admin login():
  if request.method == 'POST':
    username = request.form['username']
    password = request.form['password']
```

```
if username == ADMIN USERNAME and password ==
ADMIN PASSWORD:
       session['logged in'] = True
       return redirect(url for('admin dashboard'))
    else:
       flash("Invalid username or password!")
       return redirect(url for('admin login'))
  return render template('admin login.html')
# Admin dashboard
(a)app.route('/admin-dashboard')
def admin dashboard():
  if not session.get('logged in'):
    return redirect(url for('admin login'))
  return render template('admin dashboard.html', feedbacks=feedback list)
# Admin logout
@app.route('/logout')
def logout():
  session['logged in'] = False
  return redirect(url for('admin login'))
if name == ' main ':
  app.run(debug=True)
```

Step 4: Place .pkl Files

- 1. Download the usability_model.pkl, design_model.pkl, and vectorizer.pkl files from your Colab.
 - Place the downloaded files directly into the Flask_ML_Project folder (not in the templates sub-folder).



Step 5: Verify the Directory Structure

Your folder should now look like this:

Flask ML Project/

---- app.py

templates/

— home_page.html

feedback form.html

submission_confirmation.html

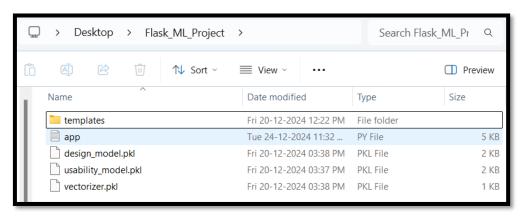
admin login.html

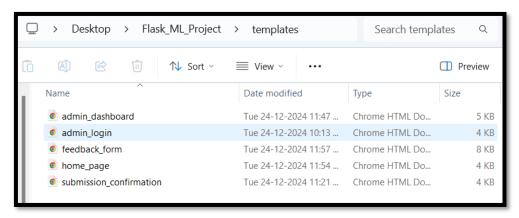
admin dashboard.html

— usability model.pkl

design_model.pkl

wectorizer.pkl







Step 6: Install Required Tools

- 1. Open Command Prompt:
 - Press Win + R, type cmd, and hit Enter.
- 2. Navigate to the Project Folder:
 - Use the cd command to navigate to the folder:
 - o cd path\to\Flask ML Project

For example:

cd C:\Users\YourUsername\Desktop\Flask_ML_Project

- 3. Install Flask: Run the following command:
- 4. pip install flask flask-bootstrap

```
C:\Users\moni2>cd desktop

C:\Users\moni2\Desktop>cd flask_ml_project

C:\Users\moni2\Desktop>cd flask_ml_project

C:\Users\moni2\Desktop\Flask_ml_project

C:\Users\moni2\Depdata\local\programs\python\python313\Lib\Site-packages

(from flask) (3.1.3)

Requirement already satisfied: click>=8.1.3 in c:\users\moni2\Depdata\local\programs\python\python313\Lib\Site-packages

(from flask) (3.1.7)

Requirement already satisfied: blinker>=1.9 in c:\users\moni2\Depdata\local\programs\python\python313\Lib\Site-packages

(from flask) (3.1.9)

Requirement already satisfied: dominate in c:\users\moni2\Depdata\local\programs\python\python313\Lib\Site-packages

(from flask-bootstrap) (2.9.1)

Requirement already satisfied: visitor in c:\users\moni2\Depdata\local\programs\python\python313\Lib\Site-packages (from flask-bootstrap) (3.9.2)

C:\Users\moni2\Desktop\Flask_ml_Project>

C:\Users\moni2\Desktop\Flask_ml_Project>
```

Step 7: Run the Flask App

- 1. In the same command prompt, run:
- 2. python app.py
- 3. If everything is set up correctly, you'll see an output like:
- 4. * Running on http://127.0.0.1:5000/ (Press CTRL+C to quit)
- 5. Open your browser and visit http://127.0.0.1:5000.



```
C:\Users\moni2\Desktop\Flask_ML_Project>python app.py

* Serving Flask app 'app'

* Debug mode: on
WARNING: This is a development server. Do not use it in a production deployment. Use a production WSGI server instead.

* Running on http://127.0.0.1:5000

Press CTRL+C to quit

* Restarting with stat

* Debugger is active!

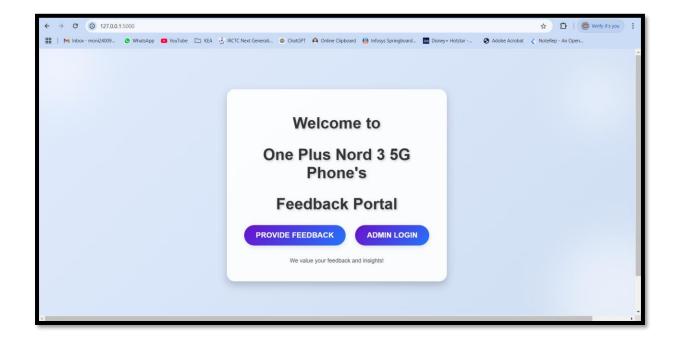
* Debugger PIN: 113-363-681
```

Step 8: Test the App

- 1. Fill in the feedback form on the homepage.
- 2. Submit it and check the admin dashboard for feedback analysis.

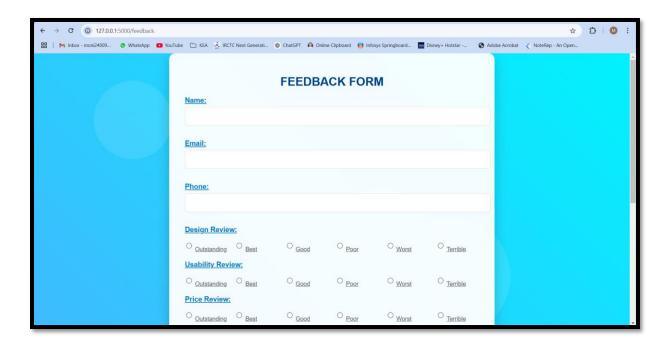
> **OUTPUT**:

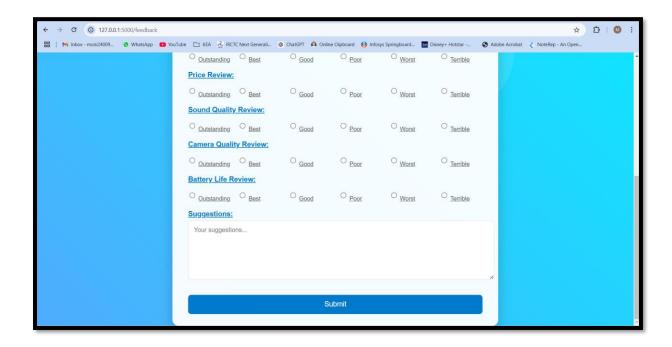
home page.html



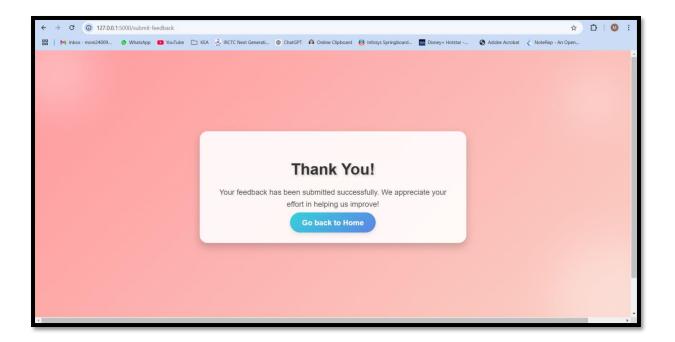


feedback form.html

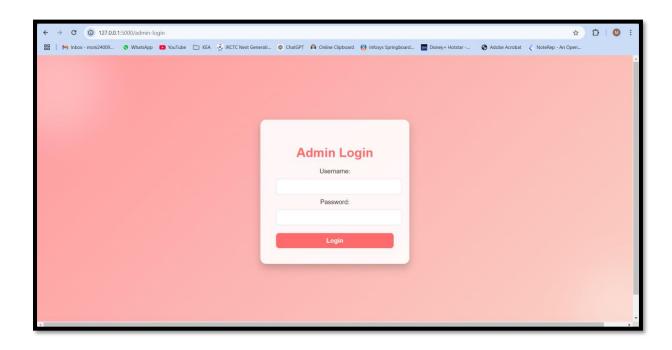




submission confirmation.html

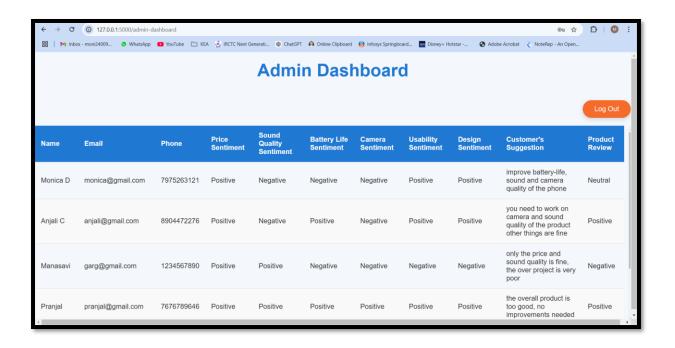


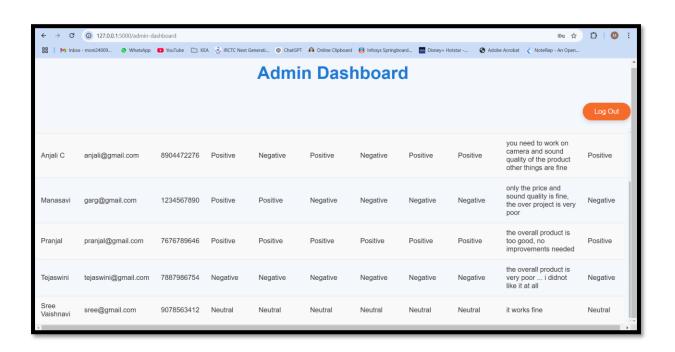
admin login.html





admin dashboard.html





> CONCLUSION:

This project successfully demonstrates the ability to determine aspect-specific sentiment within customer reviews, offering a granular understanding of customer opinions. By isolating sentiments for attributes like design and usability, the system provides actionable insights, enabling businesses to address specific customer concerns and enhance targeted attributes. The application of advanced NLP techniques and ML models ensures robust and accurate sentiment classification.

> FUTURE ENHANCEMENTS:

- 1. **Dynamic Aspect Discovery:** Enhance the system with dynamic aspect discovery capabilities, allowing it to identify and analyze emerging aspects of products or services without requiring predefined categories.
- 2. **Multimodal Sentiment Analysis**: Integrate multimodal analysis by combining textual data with other forms of feedback like images, videos, or audio to provide richer insights.
- 3. **Cross-Domain Adaptability**: Expand the model's adaptability to analyze feedback across multiple domains, such as hospitality, healthcare, and ecommerce, while maintaining high accuracy.
- 4. **Personalized Feedback Analysis**: Introduce customer segmentation to provide personalized insights based on user demographics, preferences, or past interactions.
- 5. **Real-Time Feedback Integration**: Enable the system to process and analyze feedback in real-time, supporting applications in live customer support or product launches.
- 6. **Emotion Recognition**: Enhance sentiment analysis with emotion recognition capabilities to identify underlying feelings like joy, frustration, or excitement.

These enhancements aim to make the system more versatile, accurate, and user-centric while addressing current limitations and preparing for future challenges.



> REFERENCES:

- 1. Sentiment Analysis of Customer Feedback in Online Food Ordering Services
- Authors: Bang Nguyen, Van-Ho Nguyen, Thanh Ho
- Published Date: December 2021
- Link:

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