

Capstone Project-2

Title: Zomato Recommendation System.

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GitHub: https://github.com/RajeshBisht28/ZomatoRecom





The goal is to **create a content-based recommender system** that works as follows:

- 1. Input: Provide a restaurant name.
- 2. Process:
 - The system will analyze the reviews of other restaurants.
 - It will identify restaurants with similar reviews.
- 3. Output: Recommend restaurants with similar reviews, sorted by their ratings (highest-rated first).

This approach focuses on understanding customer preferences through review content and suggesting restaurants that match those preferences!

In []:

Import all required Libraries.

```
## Import Libraries
In [3]:
        import numpy as np
        import pandas as pd
        import seaborn as sb
        import matplotlib.pyplot as plt
        import seaborn as sns
        from sklearn.linear_model import LogisticRegression
        from sklearn.linear_model import LinearRegression
        from sklearn.model_selection import train_test_split
        from sklearn.metrics import classification_report
        from sklearn.metrics import confusion_matrix
        from sklearn.metrics import r2_score
        import re
        import nltk
        from nltk.corpus import stopwords
        from sklearn.metrics.pairwise import linear_kernel
        from sklearn.feature_extraction.text import CountVectorizer
        from sklearn.feature_extraction.text import TfidfVectorizer
        from nltk.corpus import stopwords
        import warnings
```

```
warnings.filterwarnings('always')
warnings.filterwarnings('ignore')
nltk.download('stopwords')

[nltk_data] Downloading package stopwords to
[nltk_data] C:\Users\leaflet_javaVB_delhi\AppData\Roaming\nltk_dat
[nltk_data] a...
[nltk_data] Package stopwords is already up-to-date!
```

Out[3]: True

Dataset is huge, Load Only 3000 ROWS.

```
In [4]: import pandas as pd
# Load your dataset
zomato_real = pd.read_csv('zomato.csv')
# Sample 5000 random rows
zomato_mini3000 = zomato_real.sample(n=3000, random_state=42)
# Reset the index
zomato_mini3000.reset_index(drop=True, inplace=True)
# Save the sample to a new CSV file
zomato_mini3000.to_csv('mini_zomato.csv', index=False)
In [5]: #reading the dataset
zomato_mini = pd.read_csv('mini_zomato.csv')
```

Dropping Unnecessary Columns

To streamline the dataset for building the recommender system, we will drop the following columns:

- dish_liked
- phone
- url

These columns are not required for the recommendation system. The resulting dataset will be saved as **zomato_mini** for further analysis and model development.

```
In [42]: try:
    zomato_mini=zomato_mini.drop(['url','dish_liked','phone'],axis=1)
    except:
    pass
```

Removing the Duplicates & Remove the NaN values from the dataset

```
zomato_mini.duplicated().sum()
In [7]:
        zomato_mini.drop_duplicates(inplace=True)
        #Remove the NaN values from the dataset
        zomato_mini.isnull().sum()
        zomato mini.dropna(how='any',inplace=True)
        #.info() function is used to get a concise summary of the dataframe
        zomato_mini.info()
      <class 'pandas.core.frame.DataFrame'>
      Index: 2515 entries, 0 to 2999
      Data columns (total 14 columns):
           Column
                                       Non-Null Count Dtype
          -----
           address
                                       2515 non-null object
                                       2515 non-null object
           name
                                       2515 non-null object
           online_order
           book_table
                                       2515 non-null object
                                       2515 non-null object
           rate
                                       2515 non-null int64
           votes
                                       2515 non-null object
           location
                                       2515 non-null object
       7 rest_type
                                        2515 non-null object
          cuisines
           approx_cost(for two people) 2515 non-null object
       10 reviews_list
                                       2515 non-null object
       11 menu_item
                                       2515 non-null object
       12 listed_in(type)
                                       2515 non-null object
       13 listed_in(city)
                                       2515 non-null object
      dtypes: int64(1), object(13)
      memory usage: 294.7+ KB
In [ ]:
```

```
In [39]: #Reading Column Names
         zomato_mini.columns
Out[39]: Index(['address', 'name', 'online_order', 'book_table', 'rate', 'votes',
                 'location', 'rest_type', 'cuisines', 'cost', 'reviews_list',
                 'menu_item', 'type', 'city', 'Mean Rating'],
                dtype='object')
         Rename Column name as make it simple.
         zomato_mini = zomato_mini.rename(columns={'approx_cost(for two people)':'cost','listed_in(type)':'type',
 In [9]:
                                           'listed_in(city)':'city'})
         zomato_mini.columns
Out[9]: Index(['address', 'name', 'online_order', 'book_table', 'rate', 'votes',
                 'location', 'rest_type', 'cuisines', 'cost', 'reviews_list',
                 'menu_item', 'type', 'city'],
               dtype='object')
 In [ ]:
In [10]: #Changing the cost to string for removing useless chracters.
         zomato_mini['cost'] = zomato_mini['cost'].astype(str)
         #Using lambda function to replace ',' from cost
         zomato_mini['cost'] = zomato_mini['cost'].apply(lambda x: x.replace(',','.'))
         # Changing the cost to Float
         zomato_mini['cost'] = zomato_mini['cost'].astype(float)
```

zomato mini.info()

```
<class 'pandas.core.frame.DataFrame'>
       Index: 2515 entries, 0 to 2999
       Data columns (total 14 columns):
            Column
                          Non-Null Count Dtvpe
        --- -----
                          -----
            address
                          2515 non-null
                                         object
            name
                          2515 non-null
                                         object
        1
            online order 2515 non-null
                                         object
            book table
                          2515 non-null
                                         object
            rate
                          2515 non-null
                                         object
            votes
                          2515 non-null int64
            location
                          2515 non-null
                                         object
           rest type
                          2515 non-null object
            cuisines
                          2515 non-null
                                         object
        9
            cost
                          2515 non-null float64
        10 reviews list 2515 non-null
                                         object
        11 menu item
                          2515 non-null
                                         object
                          2515 non-null object
        12 type
                          2515 non-null
        13 city
                                         object
       dtypes: float64(1), int64(1), object(12)
       memory usage: 294.7+ KB
In [11]: #Reading Rate of dataset
         zomato mini['rate'].unique()
Out[11]: array(['3.9/5', '2.8/5', '3.5/5', '3.5/5', '3.2/5', '3.7/5', '3.8 /5',
                'NEW', '4.2 /5', '4.2/5', '3.4 /5', '3.9 /5', '2.9/5', '3.6/5',
                '3.0/5', '3.4/5', '4.3 /5', '4.1 /5', '3.3 /5', '3.1 /5', '3.3/5',
                '4.4 /5', '3.7 /5', '3.6 /5', '4.5 /5', '4.0 /5', '3.1/5',
                '3.2 /5', '2.9 /5', '4.1/5', '4.4/5', '4.0/5', '3.8/5', '4.6 /5',
                '2.8 /5', '2.7/5', '4.3/5', '3.0 /5', '2.6/5', '2.7 /5', '4.6/5',
                '2.6 /5', '4.7 /5', '-', '4.5/5', '4.7/5', '4.9/5', '2.5 /5',
                '4.8/5', '2.3 /5', '4.8 /5', '2.4 /5', '2.4/5', '2.3/5', '2.5/5',
                '2.2/5', '2.2 /5'], dtype=object)
In [ ]:
In [12]:
         #Removing '/5' from the 'rate' column and handle NaN values
         zomato mini = zomato mini.loc[zomato mini.rate !='NEW']
         zomato mini = zomato mini.loc[zomato mini.rate !='-'].reset index(drop=True)
         ## remove_slash = lambda x: x.replace('/5', '') if type(x) == str else x
```

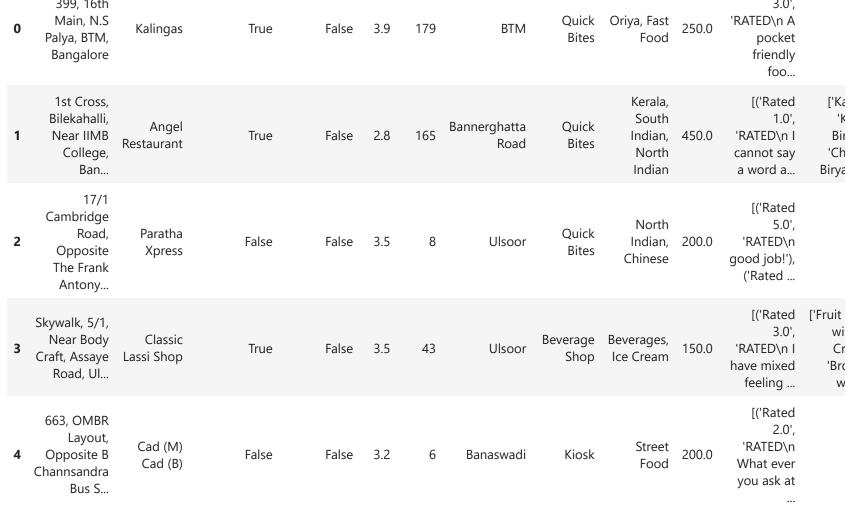
```
remove_slash = lambda x: x.replace('/5', '') if isinstance(x, str) else x
         zomato mini['rate'] = zomato mini['rate'].apply(remove slash) # Apply the function
         zomato_mini['rate'] = zomato_mini['rate'].astype(str).str.strip() # Ensure values are strings and strip whitespace
         zomato_mini['rate'] = zomato_mini['rate'].replace('nan', None).astype(float) # Replace 'nan' string with None and color
         zomato mini['rate'].head()
            3.9
Out[12]: 0
         1
            2.8
         2
            3.5
         3
            3.5
         4
              3.2
         Name: rate, dtype: float64
In [ ]:
In [13]: # Adjust the column names
         zomato mini.name = zomato mini.name.apply(lambda x:x.title())
         zomato mini['online order'] = zomato mini['online order'].replace(('Yes', 'No'), (True, False))
         zomato mini['book table'] = zomato mini['book table'].replace(('Yes', 'No'), (True, False))
         zomato mini.cost.unique()
Out[13]: array([250. , 450. , 200. , 150. , 300. , 750. , 1.4 , 600. ,
                400. , 1. , 800. , 1.5 , 100. , 1.3 , 500. , 700. ,
                900. , 1.6 , 1.2 , 550. , 350. , 650. , 2.6 , 1.1 ,
                 2.5, 1.8, 2., 1.7, 3., 850., 1.9, 3.4,
                 2.2, 1.35, 4.1, 2.8, 4., 230., 2.1, 130.,
                 1.65, 2.3, 950. ])
In [14]: zomato mini['city'].unique()
Out[14]: array(['BTM', 'JP Nagar', 'MG Road', 'Brigade Road', 'Kalyan Nagar',
                'Koramangala 5th Block', 'Koramangala 4th Block', 'Lavelle Road',
                'Bannerghatta Road', 'Basavanagudi', 'Residency Road',
                'Brookefield', 'Frazer Town', 'Koramangala 6th Block',
                'Church Street', 'Koramangala 7th Block', 'HSR', 'Kammanahalli',
                'New BEL Road', 'Banashankari', 'Indiranagar', 'Electronic City',
                'Jayanagar', 'Old Airport Road', 'Whitefield', 'Rajajinagar',
                'Marathahalli', 'Bellandur', 'Malleshwaram', 'Sarjapur Road'],
               dtype=object)
```

```
In [15]: ## Checking Null values
         zomato_mini.isnull().sum()
Out[15]: address
                        0
         name
         online_order
         book_table
         rate
                        0
                        0
         votes
         location
                        0
         rest_type
                        0
                        0
         cuisines
         cost
         reviews_list
         menu_item
                        0
         type
                        0
                        0
         city
         dtype: int64
In [16]: zomato_mini.head(5)
```

Out[16]:		address	name	online_order	book_table	rate	votes	location	rest_type	cuisines	cost	reviews_list	menu_
	0	399, 16th Main, N.S Palya, BTM, Bangalore	Kalingas	True	False	3.9	179	ВТМ	Quick Bites	Oriya, Fast Food	250.0	[('Rated 3.0', 'RATED\n A pocket friendly foo	
	1	1st Cross, Bilekahalli, Near IIMB College, Ban	Angel Restaurant	True	False	2.8	165	Bannerghatta Road	Quick Bites	Kerala, South Indian, North Indian	450.0	[('Rated 1.0', 'RATED\n I cannot say a word a	['Ka 'k Bir 'Ch Birya
	2	17/1 Cambridge Road, Opposite The Frank Antony	Paratha Xpress	False	False	3.5	8	Ulsoor	Quick Bites	North Indian, Chinese	200.0	[('Rated 5.0', 'RATED\n good job!'), ('Rated	
	3	Skywalk, 5/1, Near Body Craft, Assaye Road, Ul	Classic Lassi Shop	True	False	3.5	43	Ulsoor	Beverage Shop	Beverages, Ice Cream	150.0	[('Rated 3.0', 'RATED\n I have mixed feeling	['Fruit wi Cr 'Bro w
	4	663, OMBR Layout, Opposite B Channsandra Bus S	Cad (M) Cad (B)	False	False	3.2	6	Banaswadi	Kiosk	Street Food	200.0	[('Rated 2.0', 'RATED\n What ever you ask at 	
	4												•
In [17]:	zo re	Convert 'Mear mato_mini['Me staurants =] Loop through	ean Rating' list(zomato] = 0.0 o_mini['name'].unique())		it valu	es					

```
for restaurant in restaurants:
    mean_rating = zomato_mini.loc[zomato_mini['name'] == restaurant, 'rate'].mean()
    zomato_mini.loc[zomato_mini['name'] == restaurant, 'Mean Rating'] = mean_rating
In [18]: zomato_mini.head()
```

Out[18]:		address	name	online_order	book_table	rate	votes	location	rest_type	cuisines	cost	reviews_list	menu _.
	0	399, 16th Main, N.S Palya, BTM, Bangalore	Kalingas	True	False	3.9	179	втм	Quick Bites	Oriya, Fast Food	250.0	[('Rated 3.0', 'RATED\n A pocket friendly foo	



In []:

In [19]: from sklearn.preprocessing import MinMaxScaler
 scaler = MinMaxScaler(feature_range = (1,5))

```
zomato_mini[['Mean Rating']] = scaler.fit_transform(zomato_mini[['Mean Rating']]).round(2)
zomato_mini.sample(3)
```

Out[19]:

	address	name	online_order	book_table	rate	votes	location	rest_type	cuisines	cost	reviews_list	m
2282	3rd Cross Road, Venkateshwara Layout, Suddagun	The Biriyani Pedia	True	False	3.9	58	ВТМ	Quick Bites	Biryani, North Indian	300.0	[('Rated 5.0', "RATED\n Quite easy on the poc	
175	1170, 5th Main Road, Sector 7, HSR Layout, HSR	Asha Tiffins	True	False	4.3	286	HSR	Quick Bites	South Indian	150.0	[('Rated 5.0', 'RATED\n Been here a couple of	M
493	1080, 12th Main, HAL 2nd Stage, Indiranagar, B	Hangover	True	True	4.0	1413	Indiranagar	Bar, Casual Dining	Thai, Chinese, North Indian, Continental, Steak	1.5	[('Rated 3.0', "RATED\n Good vibes, acceptabl	
4												•

Check Some Data visualizations...

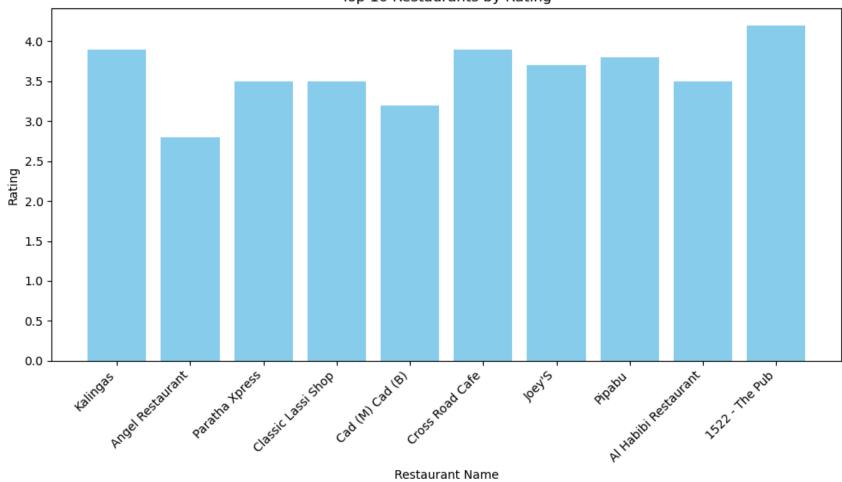
```
import pandas as pd
import matplotlib.pyplot as plt

# Load the Zomato dataset
# Replace 'zomato.csv' with the path to your dataset
data = zomato_mini.copy()
# Sort the data by Review Count in descending order
data_subset = data.sort_values(by='votes', ascending=False)
data_unique = data.drop_duplicates(subset='name', keep='first')
```

```
# Select the top 10 restaurants with the highest review counts for better visualization
top_restaurants = data_unique.head(10)

# Create the bar chart
plt.figure(figsize=(10, 6))
plt.bar(top_restaurants['name'], top_restaurants['rate'], color='skyblue')
plt.xlabel('Restaurant Name')
plt.ylabel('Rating')
plt.ylabel('Rating')
plt.title('Top 10 Restaurants by Rating')
plt.xticks(rotation=45, ha='right')
plt.tight_layout()
plt.show()
```

Top 10 Restaurants by Rating



```
In []:
In []:

In [21]: import pandas as pd
    import matplotlib.pyplot as plt

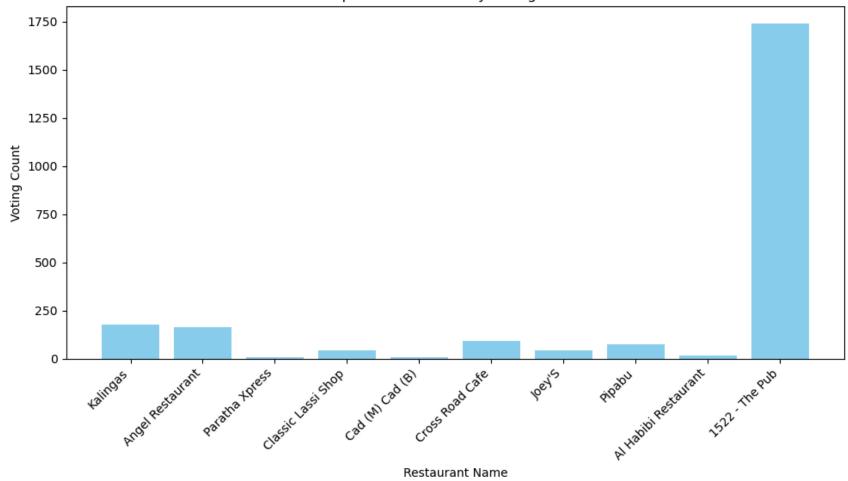
# Load the Zomato dataset
    # Replace 'zomato.csv' with the path to your dataset
data = zomato_mini.copy()
```

```
# Sort the data by Review Count in descending order
data_subset = data.sort_values(by='votes', ascending=False)
data_unique = data.drop_duplicates(subset='name', keep='first')

# Select the top 10 restaurants with the highest review counts for better visualization
top_restaurants = data_unique.head(10)

# Create the bar chart
plt.figure(figsize=(10, 6))
plt.bar(top_restaurants['name'], top_restaurants['votes'], color='skyblue')
plt.xlabel('Restaurant Name')
plt.ylabel('Voting Count')
plt.ylabel('Voting Count')
plt.xticks(rotation=45, ha='right')
plt.tight_layout()
plt.show()
```

Top 10 Restaurants by Voting Count



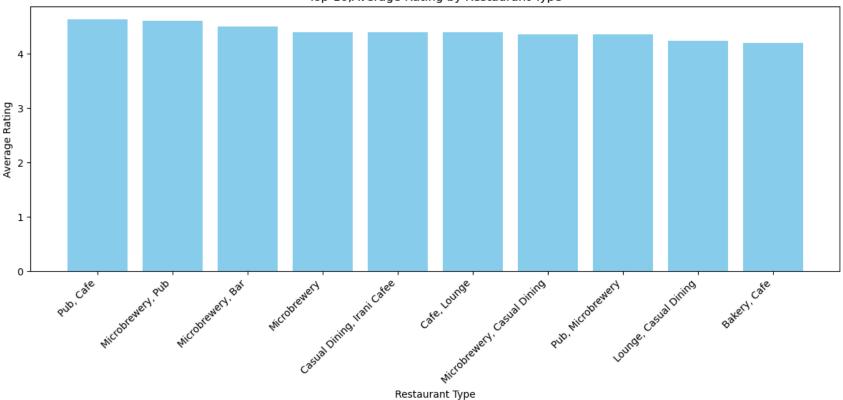
```
In []:
In [22]: import pandas as pd
import matplotlib.pyplot as plt

# Load the Zomato dataset
data = zomato_mini.copy()

# Group by 'rest_type' and calculate the mean rate
avg_rate_by_type = data.groupby('rest_type')['rate'].mean().reset_index()
```

```
# Sort the data for better visualization
avg_rate_by_type = avg_rate_by_type.sort_values(by='rate', ascending=False)
avg_rates = avg_rate_by_type.head(10)
# Plot a bar chart
plt.figure(figsize=(12, 6))
plt.bar(avg_rates['rest_type'], avg_rates['rate'], color='skyblue')
plt.xlabel('Restaurant Type')
plt.ylabel('Average Rating')
plt.title('Top-10,Average Rating by Restaurant Type')
plt.xticks(rotation=45, ha='right')
plt.tight_layout()
plt.show()
```





Common Text Preprocessing / Cleaning Steps

Some of the common text preprocessing or cleaning steps are:

- **Lower casing**: Convert all text to lowercase to maintain uniformity.
- Removal of Punctuations: Remove special characters and punctuation marks.
- Removal of Stopwords: Eliminate commonly used words that do not add significant meaning (e.g., "and", "the", "is").
- Removal of URLs: Strip out any web links from the text.
- **Spelling correction**: Correct misspelled words for better accuracy.

```
# 5 examples of these columns before text processing:
In [23]:
          zomato_mini[['reviews_list', 'cuisines']].sample(5)
Out[23]:
                                                 reviews list
                                                                                                  cuisines
           2046 [('Rated 4.0', "RATED\n Food was very good. G... North Indian, Chinese, South Indian, Street Food
                   [('Rated 4.0', "RATED\n One of the easiest an...
            760
                                                                             North Indian, Biryani, Fast Food
                 [('Rated 5.0', 'RATED\n One of my go to place...
                                                                                       Beverages, Fast Food
           1108
                    [('Rated 4.0', "RATED\n Ice creams are really...
                                                                                                Ice Cream
           1243
                                                                                              South Indian
                                                           In [24]:
          ## Lower Casing
          zomato_mini["reviews_list"] = zomato_mini["reviews_list"].str.lower()
          zomato_mini[['reviews_list', 'cuisines']].sample(5)
```

```
Out[24]:
                                                reviews list
                                                                                    cuisines
                  [('rated 5.0', 'rated\n such a great hangout!...
                                                                         Fast Food, Lebanese
           1343
                     [('rated 4.5', 'rated\n visited this place al... South Indian, Street Food, Juices
            425 [('rated 5.0', 'rated\n please provide some e...
                                                                           Cafe, South Indian
            173
                   [('rated 4.0', 'rated\n good place and staff ... Continental, Mexican, Lebanese
            932
                     [('rated 1.0', "rated\n i tried this place be...
                                                                      Fast Food, North Indian
           zomato_mini.shape
In [25]:
Out[25]: (2371, 15)
           ## Removal of Puctuations
In [26]:
           import string
           PUNCT_TO_REMOVE = string.punctuation
           def remove_punctuation(text):
                """custom function to remove the punctuation"""
               return text.translate(str.maketrans('', '', PUNCT_TO_REMOVE))
           zomato_mini["reviews_list"] = zomato_mini["reviews_list"].apply(lambda text: remove_punctuation(text))
           zomato_mini[['reviews_list', 'cuisines']].sample(5)
Out[26]:
                                                   reviews list
                                                                                          cuisines
                    rated 40 ratedn nice restaurant for south ind...
                                                                                     South Indian
             49
           2333 rated 50 rated finger licking hyderabadi dum...
                                                                       Biryani, Hyderabadi, Chinese
           1437
                   rated 50 ratedn if you are located within 5km...
                                                                 North Indian, Continental, Chinese
           1028
                    rated 40 ratedn if you are looking for pure s...
                                                                                     South Indian
            564 rated 30 rated n went there for team lunch apa... American, Continental, Steak, Salad
```

NLP : Removal of Stopwords.

```
In [43]: ## Removal of Stopwords
          STOPWORDS = set(stopwords.words('english'))
          def remove_stopwords(text):
              """custom function to remove the stopwords"""
              return " ".join([word for word in str(text).split() if word not in STOPWORDS])
          zomato_mini["reviews_list"] = zomato_mini["reviews_list"].apply(lambda text: remove_stopwords(text))
In [44]: ## Removal of URLS
          def remove urls(text):
              url pattern = re.compile(r'https?://\S+|www\.\S+')
              return url_pattern.sub(r'', text)
          zomato_mini["reviews_list"] = zomato_mini["reviews_list"].apply(lambda text: remove_urls(text))
In [45]:
          zomato mini[['reviews list', 'cuisines']].sample(5)
Out[45]:
                                                  reviews list
                                                                                                cuisines
          2199
                  rated 40 ratedn jetlag weird name given restob...
                                                               Finger Food, Continental, North Indian, Italia...
                  rated 40 ratedn place twice like food ambiance...
                                                                                         Bakery, Desserts
          1846
                    rated 30 ratedn first glance nasi mee definite... Malaysian, Thai, Singaporean, Asian, Chinese, ...
          1506
                                                                                       Mithai, Street Food
           312 rated 50 ratedn searching eat jamun seen zomat...
            192
                  rated 45 ratedn closest amazing imli chutney g...
                                                                                    North Indian, Chinese
In [46]: # RESTAURANT NAMES:
          restaurant_names = list(zomato_mini['name'].unique())
          restaurant names[:13]
```

In []:

Term Frequency-Inverse Document Frequency (TF-IDF)

Term Frequency-Inverse Document Frequency (TF-IDF) is a method to create vectors for each document. This results in a matrix where:

- Each **column** represents a word in the overview vocabulary (all the words that appear in at least one document).
- Each **row** represents a document, such as a restaurant description.

TF-IDF is a statistical method for evaluating the significance of a word in a given document.

Key Concepts:

• TF (Term Frequency):

Refers to how many times a given term appears in a document.

• IDF (Inverse Document Frequency):

Measures the weight of the word in the document, i.e., whether the word is common or rare across the entire corpus.

The intuition behind TF-IDF is that terms appearing frequently in a document are less important than terms that appear rarely.

Implementation Tip:

Scikit-learn provides a built-in TfidfVectorizer class to generate the

```
In [56]:
In [ ]:
In [32]:
         #!pip install wordcloud
In [53]: from sklearn.feature extraction.text import TfidfVectorizer
         from wordcloud import WordCloud
         import matplotlib.pyplot as plt
         # Sample data: Replace with your text/reviews column
         documents = zomato mini['reviews list'] # Replace 'reviews' with the name of your text column
         # Step 1: Compute TF-IDF scores
         tfidf vectorizer = TfidfVectorizer(max features=100) # Limit to top 100 features for simplicity
         tfidf matrix = tfidf vectorizer.fit transform(documents)
         tfidf scores = dict(zip(tfidf vectorizer.get feature names out(), tfidf matrix.sum(axis=0).A1))
         # Step 2: Generate the Word Cloud
         wordcloud = WordCloud(background color="white", width=800, height=400).generate from frequencies(tfidf scores)
         # Step 3: Display the Word Cloud
         plt.figure(figsize=(10, 5))
         plt.imshow(wordcloud, interpolation="bilinear")
         plt.axis("off")
         plt.title("Word Cloud Based on TF-IDF Scores", fontsize=16)
         plt.show()
```

Word Cloud Based on TF-IDF Scores

```
delicious    tasted,
worth cheese
                                       amazingzomato
pizza
spicy
                                                quite
   even U
                                                              made
                          35
               order
                                                                     loved
best
                                                                    dishes
                                           people
                                                      delivery
                          bit
              friendly
                                                         visited
               menumoney
          get
                                                             chocolate
              one
                                                       recommend
                          went
                                     awesome
                                10tlike
                                                 would
                                 veg
                                 little
                         ambiance
                                           must
                         items
   could
                               pretty
decent
                                         indian | better
                                                            experience
```

```
In [ ]:
In [52]:
         df = zomato mini.copy()
         # Trim leading and trailing spaces from the 'name' column
         df['name'] = df['name'].str.strip()
         df['name'].head(5)
Out[52]: 0
                         Kalingas
                Angel Restaurant
         1
                  Paratha Xpress
          2
               Classic Lassi Shop
          3
                  Cad (M) Cad (B)
         Name: name, dtype: object
```

```
In [ ]:
```

Create a recommendation function, using Cosine Similarity.

```
In [61]: # Recommendation function
         def recommend_restaurants(name, cosine_sim, df, top_n=6):
             #print(df.head(20))
              # Find the index of the restaurant by its name
             index = -1
             if name in df['name'].values:
                index = df[df['name'] == name].index[0]
             else:
                 print(f" {name} : not found in dataset")
                 return []
             # Get similarity scores for the given restaurant
             sim_scores = list(enumerate(cosine_sim[index]))
             # Sort by similarity score in descending order
             sim_scores = sorted(sim_scores, key=lambda x: x[1], reverse=True)
             # Get the indices of the top N most similar restaurants (excluding itself)
             top_indices = [i[0] for i in sim_scores[1:top_n+1]]
             # Return the restaurant names
             return df.iloc[top_indices]['name'].values
In [ ]:
In [57]: import pandas as pd
         from sklearn.feature extraction.text import TfidfVectorizer
         from sklearn.metrics.pairwise import cosine similarity
```

```
import pandas as pd
from sklearn.feature_extraction.text import TfidfVectorizer
from sklearn.metrics.pairwise import cosine_similarity
# Combine reviews for each restaurant
df['reviews_combined'] = df['reviews_list'].apply(lambda x: ''.join(x.split()) if pd.notnull(x) else '')
# Vectorize the reviews using TF-IDF
tfidf = TfidfVectorizer(stop_words='english')
tfidf_matrix = tfidf.fit_transform(df['reviews_combined'])
# Compute cosine similarity
```

```
cosine_sim = cosine_similarity(tfidf_matrix, tfidf_matrix)
print(f"Cosine similarity matrix shape: {cosine_sim.shape}")
Cosine similarity matrix shape: (2371, 2371)
```

Check Recommendation based on Restaurant Name

Ask Restaurant Name From User

```
rest_name = input("Enter the name of the restaurant: ")
        #rest_name = "Kalingas"
        top_recommendations = recommend_restaurants(rest_name, cosine_sim, df, 6)
        if(len(top_recommendations)==0):
            print("Restaurant Name Could Not Find.")
        else:
            print(f"\n ======= Top-6 Recomended for Restaurant:: '{rest_name}' =========")
            recommendations_df = pd.DataFrame({'Rank': range(1, total_len+1), 'Restaurant Name': top_recommendations})
            print(recommendations df)
       ======= Top-6 Recomended for Restaurant:: 'Bansuri Sweets' ===========
                       Restaurant Name
         Rank
                             Chowpatty
      1
            2 Soda Bottle Opener Wala
      2
                         Cafe @ Elanza
            4
                           Antigravity
                                Smoor
                    1992 Chats - Space
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