

# Food-Hub Ordering Project

## Python Foundations

April 10, 2023

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- Data Overview Summary and Observations Analysis, including:
  - EDA - Univariate Analysis
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# Executive Summary

- Summary of observations and conclusions
  - No rating is the highest contribution and second rating is 5. It is suspected most satisfied customer did not bother to vote and submit the rating.
  - Cuisine type ordered was consistent regardless weekdays or weekends. American, Japanese, Italian and Chinese food is the top 4 contributor of cuisine type.
  - Weekends order is the highest compared with weekdays. However, delivery time for weekdays is longer than weekends.
  - Highest rating may be associated with faster delivery time regardless cuisine type

# Business Problem Overview and Solution Approach

- Business problem overview:
  - Cuisine type needs to be more diversify to tackle low cuisine type order
  - Business owner need to focus more improvement on weekdays sales
  - Expensive food cost may not attractive more customers
- Solution approach/business improvement/recommendation
  - Improve customer rating submission, by giving them voucher discount or reward for the next purchase
  - Business owner with the lowest cuisine type may need to improve by giving a food discount for certain amount of time window
  - Better food promotion or discount need to focus to boost sales on weekday
  - Delivery time at weekdays need to improve to boost restaurant rating
  - Business owner need to improve which total order is more than 60 minutes, by giving customer some food discount for the next purchase as a apologize gesture

# Data Overview Summary and Observations Analysis

- It is found the total analysed restaurant took part in the single smartphone app for restaurant in NY is 178 with total 14 cuisine type.
- Below is the overall summary for analysed data. The order cost is ranging between 4 dollars to 35 dollars, and average of foods to be prepared is around 27 minutes.
- Based on histogram, delivery time is ranging between 15 to 33 minutes, with the most highest delivery time is between 25-28 minutes.

|                                    | Min  | Average | Max   |
|------------------------------------|------|---------|-------|
| cost_of_the_order (dollars)        | 4.47 | 16.50   | 35.41 |
| food_preparation_time<br>(minutes) | 20   | 27      | 35    |
| delivery_time (minutes)            | 15   | 24      | 33    |

# Data Overview Summary and Observations Analysis

- The histogram also found the highest count of `cost_of_the_order` is between 11-12 dollars, while 34-35 dollars is the lowest count.
- The countplot divided data into 2, which is weekend and weekdays with weekend is the higher contributor of the food ordered compared with weekdays. It is assumed that weekend is most people stay at home and recuperate with their family, hence food delivery is expected.
- This assumption may be true due to we found estimation 1350 orders in weekend while weekday was found only 550 orders.
- Countplot also disclosed 14 cuisine types were divided during this analysis, with the top 4 cuisine is determined to be American, Japanese, Italian and Chinese food (the top 4 cuisine also similar on weekend) while countplot also disclosed the lowest cuisine type is Vietnamese and Spanish and Korean estimated share the same lowest spot.

# Data Overview Summary and Observations Analysis

- Below is the top 5 restaurant:
  - Shake Shack
  - The Meatball Shop
  - Blue Ribbon Sushi
  - Blue Ribbon Fried Chicken
  - Parm
- We found there is 555 orders/29.24% for total order more than 20 dollars.
- Heatmap plot shows very weak correlation between the variables.

# Data Overview Summary and Observations Analysis

- Boxplot analysis (multivariate) analysis shows:
  - cost\_of\_the\_order is varied with cuisine\_type, and observed Korean, Mediterranean and Vietnamese having some outliers.
  - Food\_preparation\_time is more or less having a similar average regardless cuisine\_type
  - Delivery time generally takes longer on weekdays
- Pointplot analysis (multivariate) analysis shows:
  - Highest rating 4 may be associated with faster delivery\_time regardless cuisine\_type, while rating 3 is having larger spread compared with rating 5 and no rating.
  - Average rating 5 and 4 for cost\_of\_the\_order is higher than rating 3 and no rating, with estimated around 16.8 dollars.



# Data Overview Summary and Observations Analysis

- Restaurant who is able to fulfil the rating count more than 50 and rating 4 and able to get promotional offer: Shake Shack, The Meatball Shop, Blue Ribbon Sushi, Blue Ribbon Fried Chicken, RedFarm Broadway
- Net revenue for total all restaurant: 6166.3 dollars
- We found total order for more than 60 minutes is 200 dollars/10.54%
- Mean delivery weekdays=28 minutes, mean delivery weekends=22 minutes

# APPENDIX

# Data Overview

- Q1: How many rows and columns present in the data
  - By using `df.shape`, it has 1898 columns and 9 rows

```
In [4]: #rows and columns
df.shape
```

```
Out[4]: (1898, 9)
```

- Q2: What are the datatypes of the different columns in the dataset
  - By using `df.info()`, it will print to concise the dataframe summary

```
In [39]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1898 entries, 0 to 1897
Data columns (total 9 columns):
#   Column                Non-Null Count  Dtype
---  -
0   order_id              1898 non-null  int64
1   customer_id           1898 non-null  int64
2   restaurant_name       1898 non-null  object
3   cuisine_type          1898 non-null  object
4   cost_of_the_order     1898 non-null  float64
5   day_of_the_week       1898 non-null  object
6   rating                1898 non-null  object
7   food_preparation_time 1898 non-null  int64
8   delivery_time         1898 non-null  int64
dtypes: float64(1), int64(4), object(4)
memory usage: 133.6+ KB
```

# Data Overview

- Q3: Are there any missing values in the data?
  - No missing values found in the data

```
In [40]: # Checking for missing values in the data  
print(df.isnull().sum())
```

```
order_id          0  
customer_id       0  
restaurant_name   0  
cuisine_type      0  
cost_of_the_order 0  
day_of_the_week   0  
rating            0  
food_preparation_time 0  
delivery_time     0  
dtype: int64
```

# Data Overview

- Q4: Check the statistical summary of the data. What is the minimum, average, and maximum time it takes for food to be prepared once an order is placed?

```
In [23]: #statistical summary  
df.describe().T
```

Out[23]:

|                       | count  | mean         | std           | min        | 25%        | 50%        | 75%          | max        |
|-----------------------|--------|--------------|---------------|------------|------------|------------|--------------|------------|
| order_id              | 1898.0 | 1.477496e+06 | 548.049724    | 1476547.00 | 1477021.25 | 1477495.50 | 1.477970e+06 | 1478444.00 |
| customer_id           | 1898.0 | 1.711685e+05 | 113698.139743 | 1311.00    | 77787.75   | 128600.00  | 2.705250e+05 | 405334.00  |
| cost_of_the_order     | 1898.0 | 1.649885e+01 | 7.483812      | 4.47       | 12.08      | 14.14      | 2.229750e+01 | 35.41      |
| food_preparation_time | 1898.0 | 2.737197e+01 | 4.632481      | 20.00      | 23.00      | 27.00      | 3.100000e+01 | 35.00      |
| delivery_time         | 1898.0 | 2.416175e+01 | 4.972637      | 15.00      | 20.00      | 25.00      | 2.800000e+01 | 33.00      |

- Minimum time takes for food to be prepared: 20 minutes
- Maximum time takes for food to be prepared: 35 minutes
- Average time takes for food to be prepared: 27 minutes

# Data Overview

- Q5: How many orders are not rated?

```
In [41]: df['rating'].value_counts()
```

```
Out[41]: Not given    736  
         5           588  
         4           386  
         3           188  
         Name: rating, dtype: int64
```

- It is found that 736 of food order were not given a rating by customers

# Univariate Analysis

- Q6: Explore all the variables and provide observations on their distributions. (Generally, histograms, boxplots, countplots, etc. are used for univariate exploration.)

## Order ID

```
In [42]: # check unique order ID  
df['order_id'].nunique()
```

```
Out[42]: 1898
```

## Customer ID

```
In [43]: # check unique customer ID  
df['customer_id'].nunique()
```

```
Out[43]: 1200
```

## Restaurant name

```
In [44]: # check unique Restaurant Name  
df['restaurant_name'].nunique()
```

```
Out[44]: 178
```

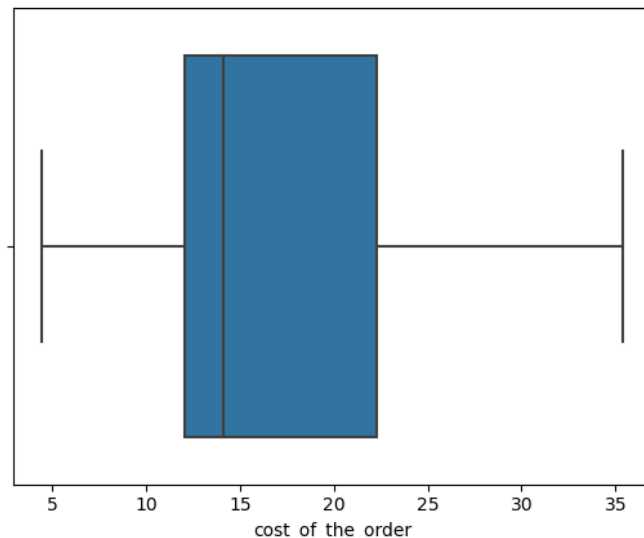
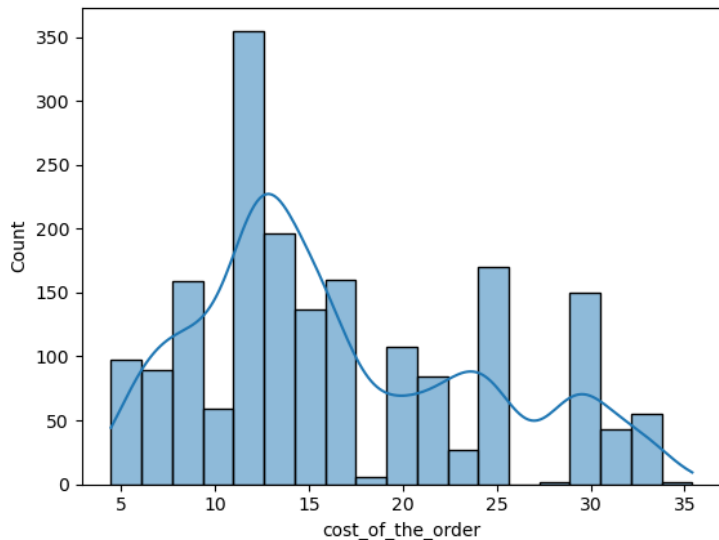
## Cuisine type

```
In [45]: # Check unique cuisine type  
df['cuisine_type'].nunique() |
```

```
Out[45]: 14
```

# Univariate Analysis

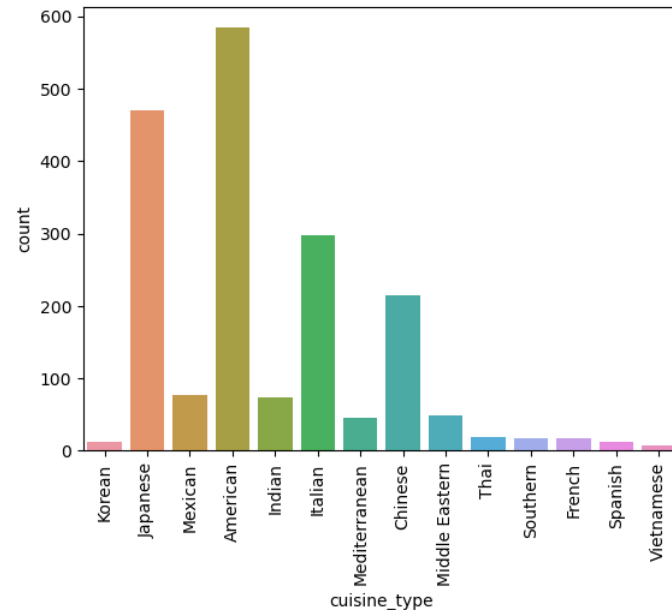
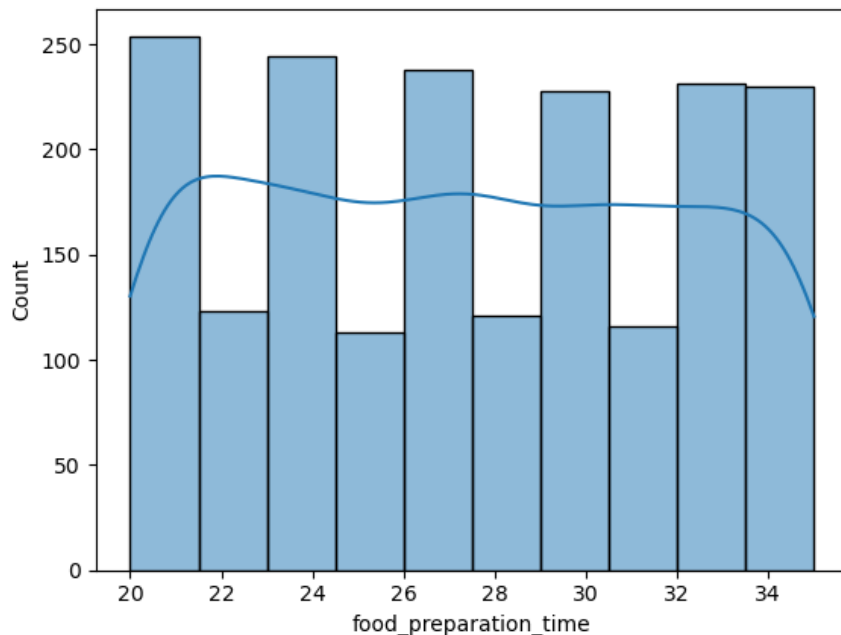
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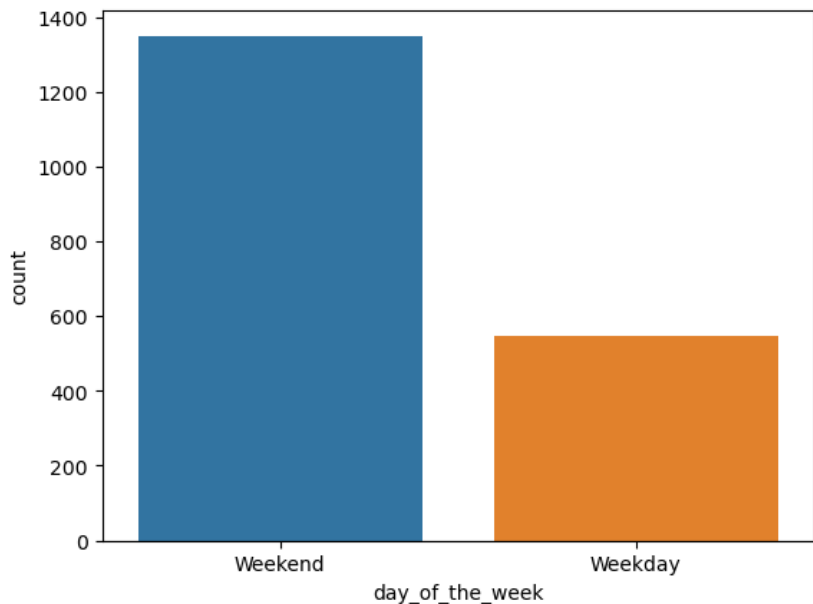
# Univariate Analysis

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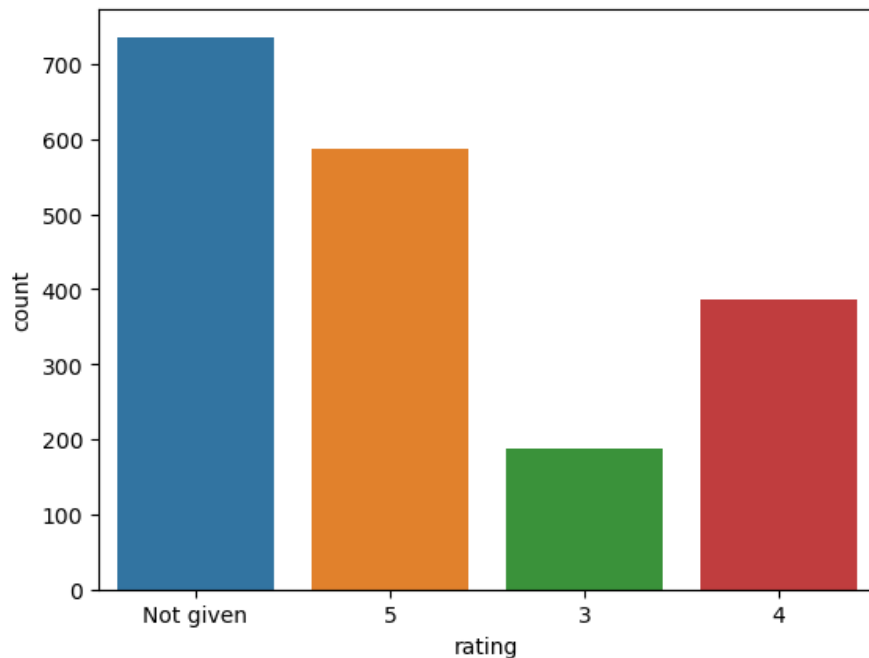
**Day of the week**

```
In [17]: ## Check the unique values  
df['day_of_the_week'].nunique()
```

Out[17]: 2

# Univariate Analysis

- Q6: Explore all the variables and provide observations on their distributions. (Generally, histograms, boxplots, countplots, etc. are used for univariate exploration.)



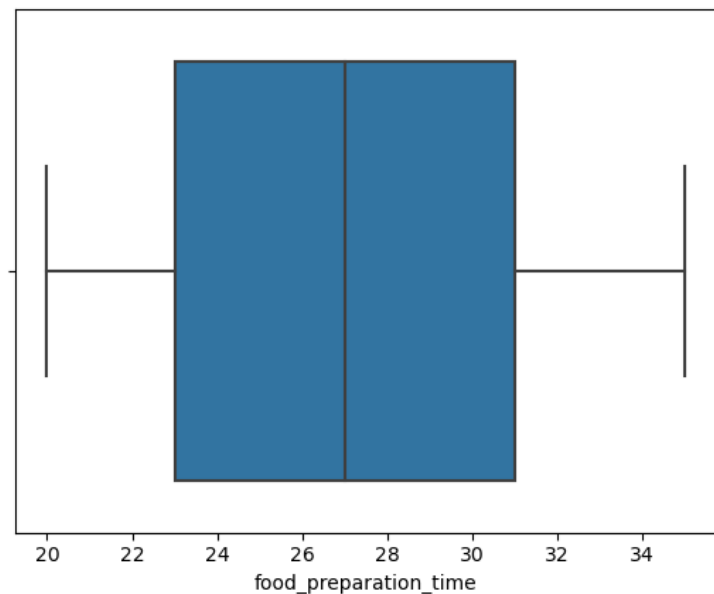
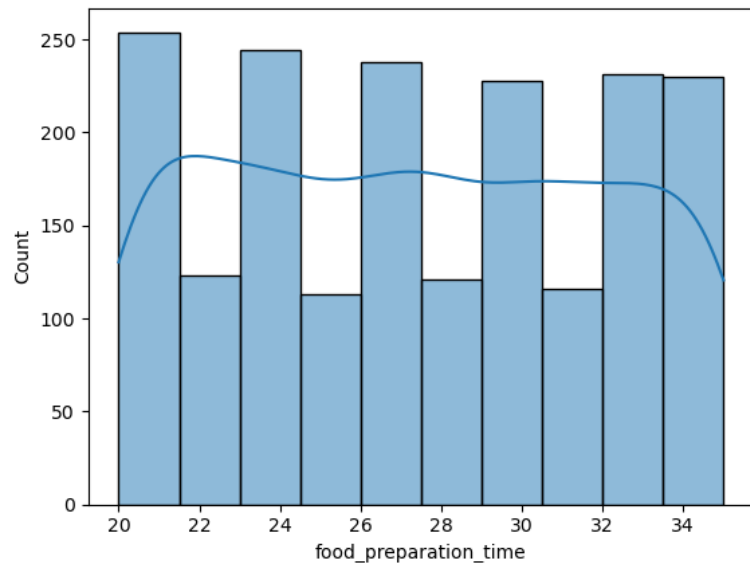
Rating

```
In [18]: # Check the unique values  
df['rating'].nunique()
```

```
Out[18]: 4
```

# Univariate Analysis

- Q6: Explore all the variables and provide observations on their distributions. (Generally, histograms, boxplots, countplots, etc. are used for univariate exploration.)



# Univariate Analysis

- Q7: Which are the top 5 restaurants in terms of the number of orders received?

```
df[['restaurant_name','order_id']].groupby('restaurant_name').count().sort_values(by =  
'order_id',axis = 0, ascending=False).head()
```

Out[19]:

| restaurant_name           | order_id |
|---------------------------|----------|
| Shake Shack               | 219      |
| The Meatball Shop         | 132      |
| Blue Ribbon Sushi         | 119      |
| Blue Ribbon Fried Chicken | 96       |
| Parm                      | 68       |

# Univariate Analysis

- Q8: Which is the most popular cuisine on weekends?

```
df[df['day_of_the_week'] == 'Weekend'].groupby('cuisine_type').count().sort_values(by = 'order_id', axis = 0, ascending=False).head()
```

```
Out[25]:
```

|              | order_id | customer_id | restaurant_name | cost_of_the_order | day_of_the_week | rating | food_preparation_time | delivery_time |
|--------------|----------|-------------|-----------------|-------------------|-----------------|--------|-----------------------|---------------|
| cuisine_type |          |             |                 |                   |                 |        |                       |               |
| American     | 415      | 415         | 415             | 415               | 415             | 415    | 415                   | 415           |
| Japanese     | 335      | 335         | 335             | 335               | 335             | 335    | 335                   | 335           |
| Italian      | 207      | 207         | 207             | 207               | 207             | 207    | 207                   | 207           |
| Chinese      | 163      | 163         | 163             | 163               | 163             | 163    | 163                   | 163           |
| Mexican      | 53       | 53          | 53              | 53                | 53              | 53     | 53                    | 53            |

# Univariate Analysis

- Q9: What percentage of the orders cost more than 20 dollars?

```
df_greater_than_20 = df[df['cost_of_the_order']>20]
print('The number of total orders that cost above 20 dollars is:', df_greater_than_20.shape[0])
percentage = (df_greater_than_20.shape[0] / df.shape[0]) * 100
print("Percentage of orders above 20 dollars:", round(percentage, 2), '%')
```

The number of total orders that cost above 20 dollars is: 555 orders  
Percentage of orders above 20 dollars: 29.24%

# Univariate Analysis

- Q10: What is the mean order delivery time?

```
mean_del_time = df['delivery_time'].mean()
print('The mean delivery time for this dataset is', round(mean_del_time, 2), 'minutes')
```

The mean delivery time for this dataset is 24.16 minutes

- Q11: The company has decided to give 20% discount vouchers to the top 3 most frequent customers. Find the IDs of these customers and the number of orders they placed.

```
df[['customer_id','order_id']].groupby('customer_id').count().sort_values(by = 'order_id',axis = 0,
ascending=False).head(3)
```

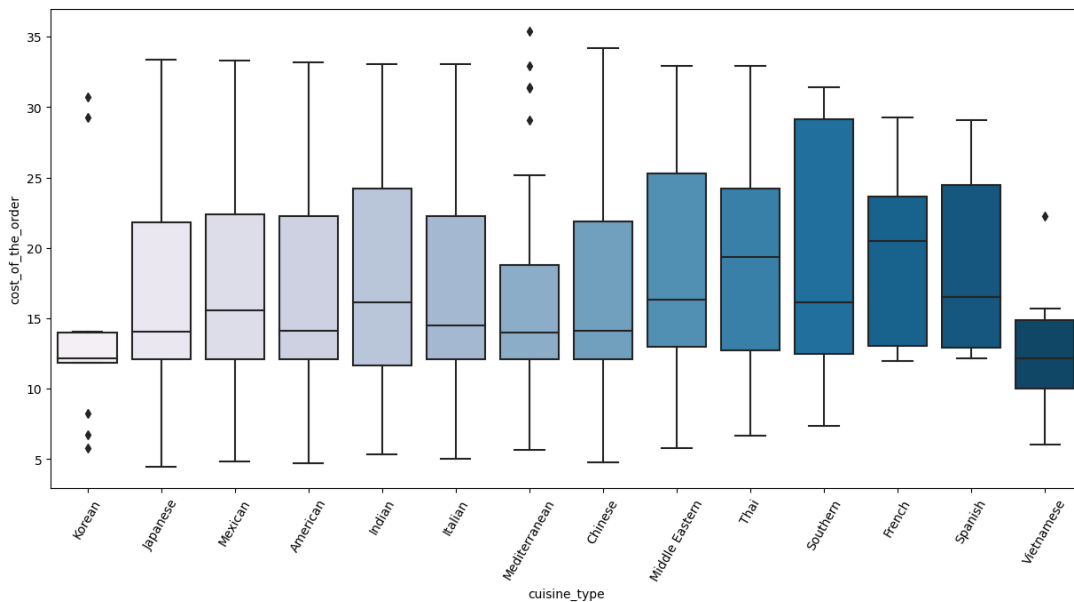
Out[32]:

|             | order_id |
|-------------|----------|
| customer_id |          |
| 52832       | 13       |
| 47440       | 10       |
| 83287       | 9        |



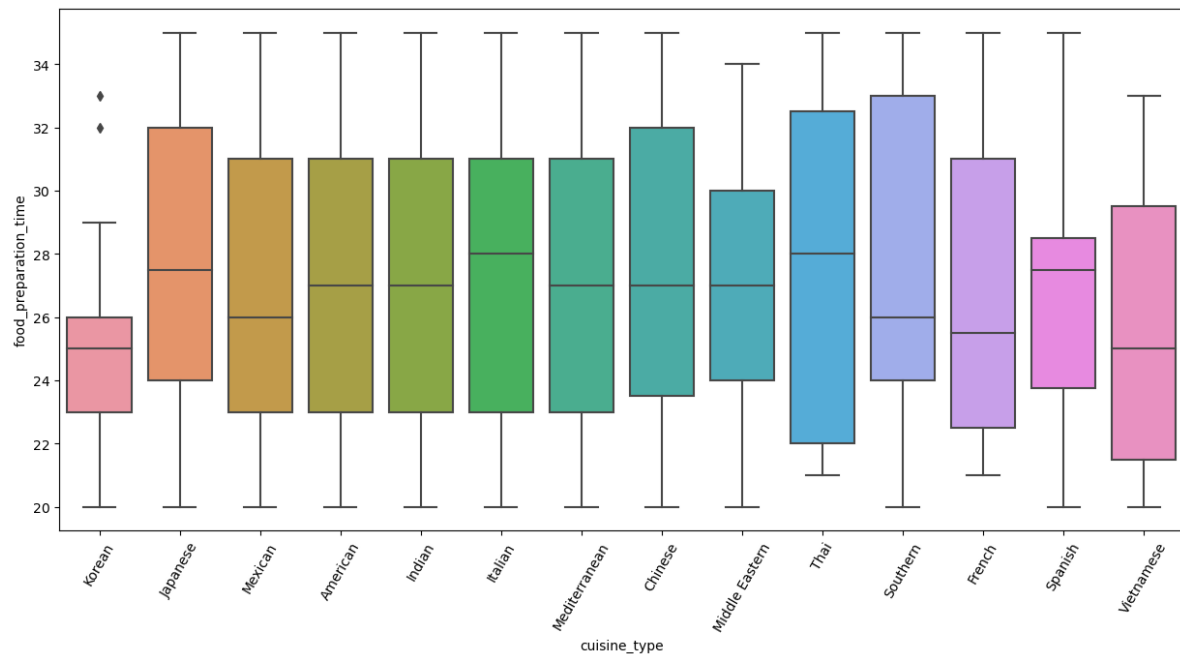
# Multivariate Analysis

- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.



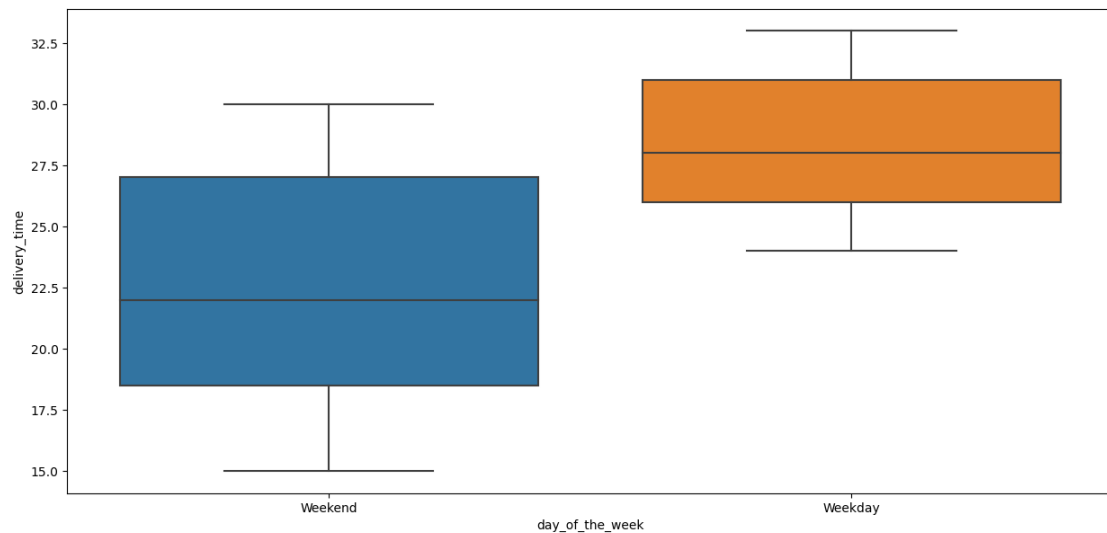
# Multivariate Analysis

- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.



# Multivariate Analysis

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# Multivariate Analysis

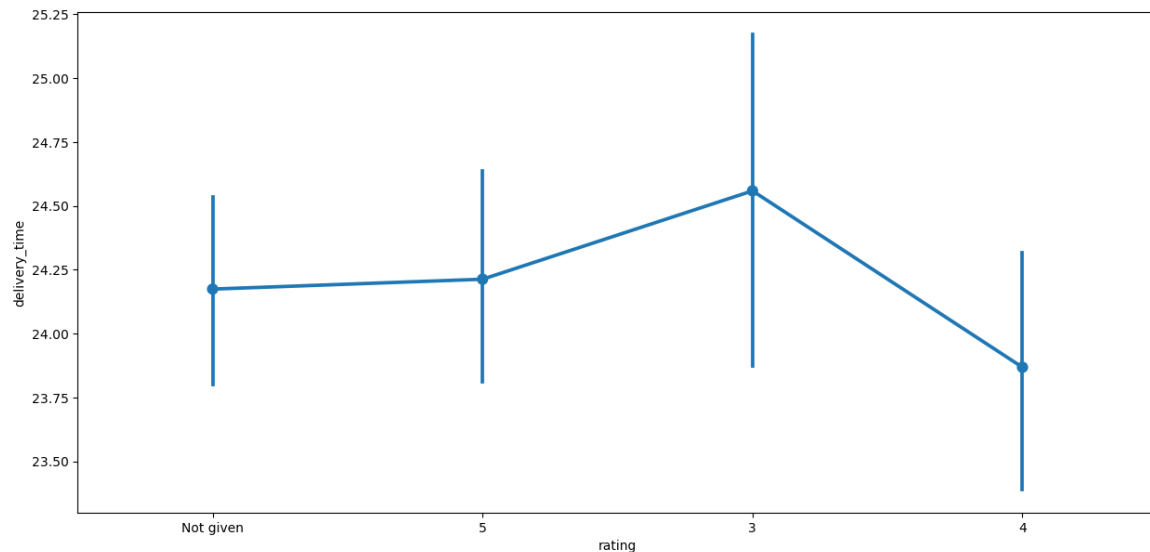
- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.
- Revenue generated

```
df.groupby(['restaurant_name'])['cost_of_the_order'].sum().sort_values(ascending = False).head(14)
```

```
Out[47]: restaurant_name
Shake Shack                3579.53
The Meatball Shop          2145.21
Blue Ribbon Sushi          1903.95
Blue Ribbon Fried Chicken  1662.29
Parm                       1112.76
RedFarm Broadway           965.13
RedFarm Hudson             921.21
TAO                        834.50
Han Dynasty                755.29
Blue Ribbon Sushi Bar & Grill 666.62
Rubirosa                   660.45
Sushi of Gari 46           640.87
Nobu Next Door             623.67
Five Guys Burgers and Fries 506.47
Name: cost_of_the_order, dtype: float64
```

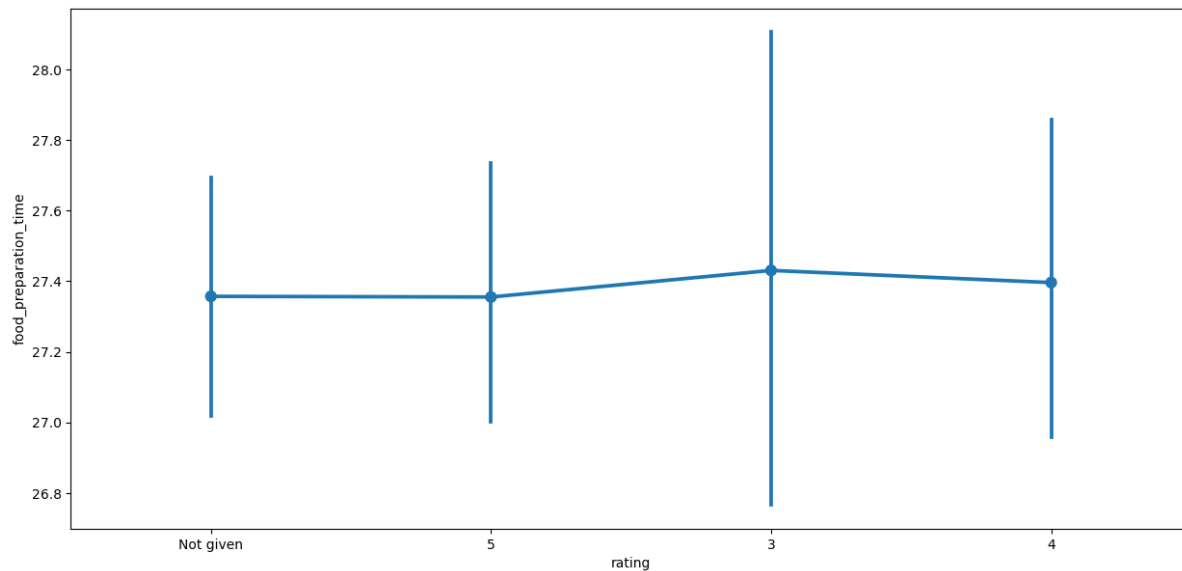
# Multivariate Analysis

- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.



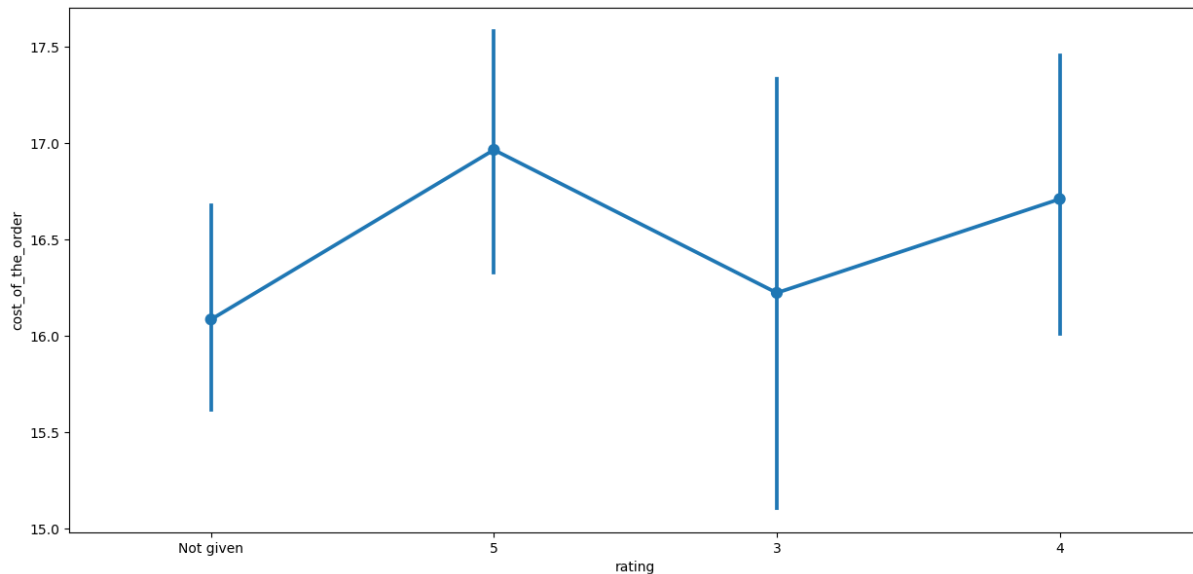
# Multivariate Analysis

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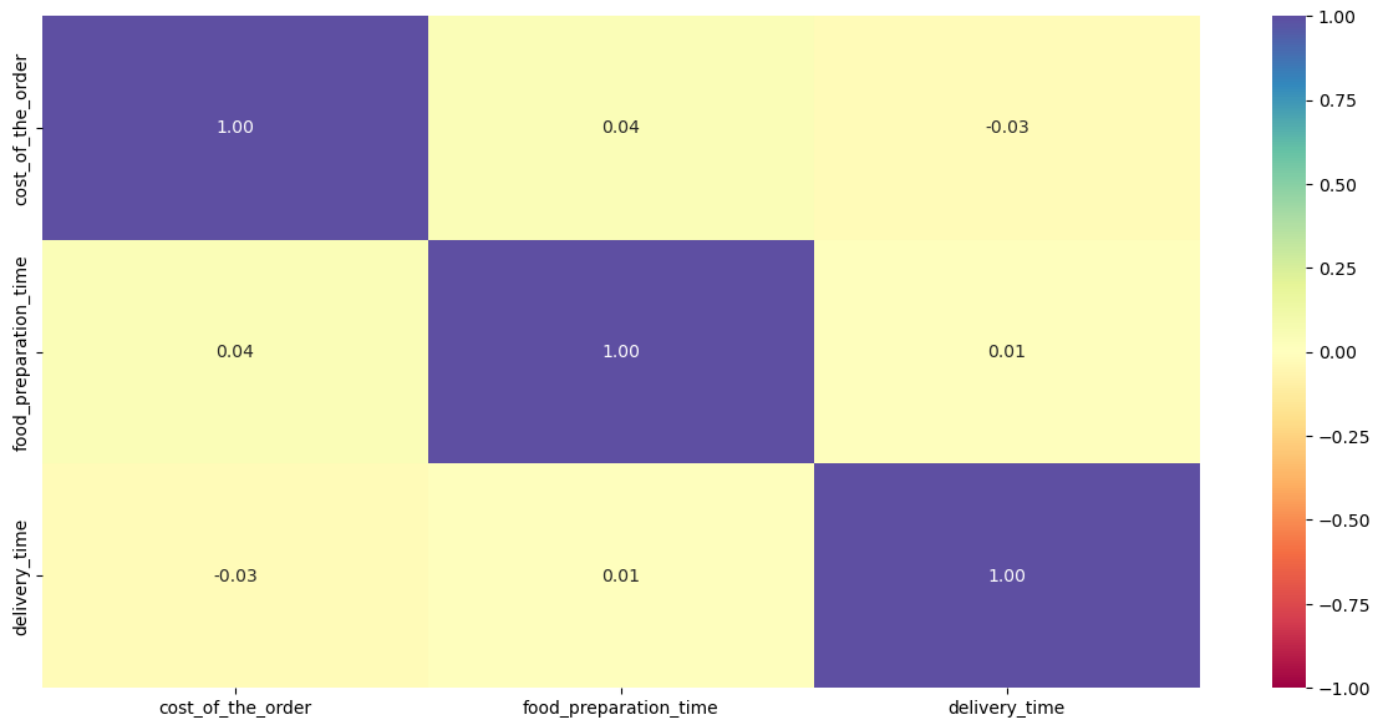
# Multivariate Analysis

- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.



# Multivariate Analysis

- Q12: Perform a multivariate analysis to explore relationships between the important variables in the dataset.





# Multivariate Analysis

- Q13: The company wants to provide a promotional offer in the advertisement of the restaurants. The condition to get the offer is that the restaurants must have a rating count of more than 50 and the average rating should be greater than 4. Find the restaurants fulfilling the criteria to get the promotional offer.

# Filter the rated restaurants

```
df_rated = df[df['rating'] != 'Not given'].copy()
```

# Convert rating column from object to integer

```
df_rated['rating'] = df_rated['rating'].astype('int')
```

# Create a dataframe that contains the restaurant names with their rating counts

```
df_rating_count = df_rated.groupby(['restaurant_name'])['rating'].count().sort_values(ascending = False).reset_index()
```

```
df_rating_count.head()
```

Out[48]:

|   | restaurant_name           | rating |
|---|---------------------------|--------|
| 0 | Shake Shack               | 133    |
| 1 | The Meatball Shop         | 84     |
| 2 | Blue Ribbon Sushi         | 73     |
| 3 | Blue Ribbon Fried Chicken | 64     |
| 4 | RedFarm Broadway          | 41     |

# Multivariate Analysis

- Q13: The company wants to provide a promotional offer in the advertisement of the restaurants. The condition to get the offer is that the restaurants must have a rating count of more than 50 and the average rating should be greater than 4. Find the restaurants fulfilling the criteria to get the promotional offer.

```
# Get the restaurant names that have rating count more than 50
```

```
rest_names = df_rating_count[df_rating_count['rating']>50]['restaurant_name']
```

```
# Filter to get the data of restaurants that have rating count more than 50
```

```
df_mean_4 = df_rated[df_rated['restaurant_name'].isin(rest_names)].copy()
```

```
# Group the restaurant names with their ratings and find the mean rating of each restaurant
```

```
df_mean_4.groupby(df_mean_4['restaurant_name'])['rating'].mean().sort_values(ascending = False).reset_index().dropna()
```

Out[49]:

|   | restaurant_name           | rating   |
|---|---------------------------|----------|
| 0 | The Meatball Shop         | 4.511905 |
| 1 | Blue Ribbon Fried Chicken | 4.328125 |
| 2 | Shake Shack               | 4.278195 |
| 3 | Blue Ribbon Sushi         | 4.219178 |

# Multivariate Analysis

- Q14: The company charges the restaurant 25% on the orders having cost greater than 20 dollars and 15% on the orders having cost greater than 5 dollars. Find the net revenue generated by the company across all orders.

```
#function to determine the revenue
```

```
def compute_rev(x):
```

```
    if x > 20:
```

```
        return x*0.25
```

```
    elif x > 5:
```

```
        return x*0.15
```

```
    else:
```

```
        return x*0
```

```
df['Revenue'] = df['cost_of_the_order'].apply(compute_rev)
```

```
df.head()
```

# Multivariate Analysis

- Q14: The company charges the restaurant 25% on the orders having cost greater than 20 dollars and 15% on the orders having cost greater than 5 dollars. Find the net revenue generated by the company across all orders.

Out[50]:

|   | order_id | customer_id | restaurant_name           | cuisine_type | cost_of_the_order | day_of_the_week | rating    | food_preparation_time | delivery_time | Revenue |
|---|----------|-------------|---------------------------|--------------|-------------------|-----------------|-----------|-----------------------|---------------|---------|
| 0 | 1477147  | 337525      | Hangawi                   | Korean       | 30.75             | Weekend         | Not given | 25                    | 20            | 7.6875  |
| 1 | 1477685  | 358141      | Blue Ribbon Sushi Izakaya | Japanese     | 12.08             | Weekend         | Not given | 25                    | 23            | 1.8120  |
| 2 | 1477070  | 66393       | Cafe Habana               | Mexican      | 12.23             | Weekday         | 5         | 23                    | 28            | 1.8345  |
| 3 | 1477334  | 106968      | Blue Ribbon Fried Chicken | American     | 29.20             | Weekend         | 3         | 25                    | 15            | 7.3000  |
| 4 | 1478249  | 76942       | Dirty Bird to Go          | American     | 11.59             | Weekday         | 4         | 25                    | 24            | 1.7385  |

# total revenue and print it

```
total_rev = df['Revenue'].sum()
```

```
print('The net revenue is around', round(total_rev, 2), 'dollars')
```

The net revenue is around 6166.3 dollars

# Multivariate Analysis

- Q15: The company wants to analyze the total time required to deliver the food. What percentage of orders take more than 60 minutes to get delivered from the time the order is placed? (The food has to be prepared and then delivered.)

```
#Calculate total delivery time and add a new column to the dataframe df to store the total delivery time
df['total_time'] = df['food_preparation_time']+df['delivery_time']
print(df.head())
```

```
df_greater_than_60 = df[df['total_time']>60]
```

```
print('The total orders that take more than 60 minutes is:', df_greater_than_60.shape[0])
```

```
# Calculate percentage of such orders in the dataset
```

```
df_percentage_60 = (df_greater_than_60.shape[0] / df.shape[0]) * 100
```

```
print("Percentage of total orders that take more than 60 minutes is:", round(df_percentage_60, 2), '%')
```

# Multivariate Analysis

- Q15: The company wants to analyze the total time required to deliver the food. What percentage of orders take more than 60 minutes to get delivered from the time the order is placed? (The food has to be prepared and then delivered.)

|   | order_id | customer_id | restaurant_name           | cuisine_type | \ |
|---|----------|-------------|---------------------------|--------------|---|
| 0 | 1477147  | 337525      | Hangawi                   | Korean       |   |
| 1 | 1477685  | 358141      | Blue Ribbon Sushi Izakaya | Japanese     |   |
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| 3 | 1477334  | 106968      | Blue Ribbon Fried Chicken | American     |   |
| 4 | 1478249  | 76942       | Dirty Bird to Go          | American     |   |

|   | cost_of_the_order | day_of_the_week | rating    | food_preparation_time | \ |
|---|-------------------|-----------------|-----------|-----------------------|---|
| 0 | 30.75             | Weekend         | Not given | 25                    |   |
| 1 | 12.08             | Weekend         | Not given | 25                    |   |
| 2 | 12.23             | Weekday         | 5         | 23                    |   |
| 3 | 29.20             | Weekend         | 3         | 25                    |   |
| 4 | 11.59             | Weekday         | 4         | 25                    |   |

|   | delivery_time | Revenue | Total | total_time |
|---|---------------|---------|-------|------------|
| 0 | 20            | 7.6875  | 45    | 45         |
| 1 | 23            | 1.8120  | 48    | 48         |
| 2 | 28            | 1.8345  | 51    | 51         |
| 3 | 15            | 7.3000  | 40    | 40         |
| 4 | 24            | 1.7385  | 49    | 49         |

The total orders that take more than 60 minutes is: 200

Percentage of total orders that take more than 60 minutes is: 10.54 %

The total orders that take more than 60 minutes is: 200

Percentage of total orders that take more than 60 minutes is: 10.54%

# Multivariate Analysis

- Q16: The company wants to analyze the delivery time of the orders on weekdays and weekends. How does the mean delivery time vary during weekdays and weekends?

```
# Get the mean delivery time on weekdays and print it
print('The mean delivery time on weekdays is around',
      round(df[df['day_of_the_week'] == 'Weekday']['delivery_time'].mean()), 'minutes')
```

```
# Get the mean delivery time on weekends and print it
print('The mean delivery time on weekends is around',
      round(df[df['day_of_the_week'] == 'Weekend']['delivery_time'].mean()), 'minutes')
```

The mean delivery time on weekdays is around 28 minutes  
The mean delivery time on weekends is around 22 minutes

# Conclusion and Recommendation

- Q17: What are your conclusions from the analysis? What recommendations would you like to share to help improve the business? (You can use cuisine type and feedback ratings to drive your business recommendations.)
- Conclusions
  - No rating is the highest contribution and second rating is 5. It is suspected most satisfied customer did not bother to vote and submit the rating.
  - Cuisine type ordered was consistent regardless weekdays or weekends. American, Japanese, Italian and Chinese food is the top 4 contributor of cuisine type.
  - Weekends order is the highest compared with weekdays. However, delivery time for weekdays is longer than weekends.
  - Highest rating may be associated with faster delivery time regardless cuisine type



# Conclusion and Recommendation

- Q17: What are your conclusions from the analysis? What recommendations would you like to share to help improve the business? (You can use cuisine type and feedback ratings to drive your business recommendations.)
- Recommendations
  - Improve customer rating submission, by giving them voucher discount or reward for the next purchase
  - Business owner with the lowest cuisine type may need to improve by giving a food discount for certain amount of time window
  - Cuisine type needs to be more diversify to tackle low cuisine type order
  - Better food promotion or discount need to focus to boost sales on weekday
  - Delivery time at weekdays need to improve to boost restaurant rating
  - Business owner need to improve which total order is more than 60 minutes, by giving customer some food discount for the next purchase as a apologize gesture



**Happy Learning !**

