

# Food Delivery application case study

## Context

The culinary landscape of New York is ever-expanding, with a burgeoning number of restaurants catering to the needs of a bustling population. Among them, students and busy professionals, pressed for time by their hectic schedules, find solace in the diverse offerings of these eateries. Recognizing the demand for convenience, online food delivery services emerge as a beacon, offering a seamless solution. In this realm, FoodHub shines as a premier food aggregator company, granting users access to a multitude of restaurants through a single, user-friendly smartphone application.

The food app streamlines the process of online ordering by enabling direct communication between customers and restaurants. Once an order is confirmed by the restaurant, the app seamlessly assigns a delivery person from the company to facilitate the pickup. Utilizing integrated mapping features, the delivery person navigates to the restaurant and awaits the packaged order. Upon receiving the package, the delivery person confirms the pickup within the app and embarks on the journey to the customer's location. Following a successful delivery, the drop-off is confirmed within the app. Customers are empowered to rate their orders, contributing to the platform's user feedback loop. The food aggregator sustains its operations by collecting a fixed margin from the delivery orders facilitated through the app, ensuring a sustainable revenue model for all stakeholders involved.

## Objective

The food aggregator company has stored the data of the different orders made by the registered customers in their online portal. They want to analyze the data to get a fair idea about the demand of different restaurants which will help them in enhancing their customer experience. Suppose you are hired as a Data Scientist in this company and the Data Science team has shared some of the key questions that need to be answered. Perform the data analysis to find answers to these questions that will help the company to improve the business.

## Data Description

The data contains the different data related to a food order. The detailed data dictionary is given below.

## Data Dictionary

- order\_id: Unique ID of the order
- customer\_id: ID of the customer who ordered the food
- restaurant\_name: Name of the restaurant
- cuisine\_type: Cuisine ordered by the customer
- cost: Cost of the order
- day\_of\_the\_week: Indicates whether the order is placed on a weekday or weekend (The weekday is from Monday to Friday and the weekend is Saturday and Sunday)
- rating: Rating given by the customer out of 5

- `food_preparation_time`: Time (in minutes) taken by the restaurant to prepare the food. This is calculated by taking the difference between the timestamps of the restaurant's order confirmation and the delivery person's pick-up confirmation.
- `delivery_time`: Time (in minutes) taken by the delivery person to deliver the food package. This is calculated by taking the difference between the timestamps of the delivery person's pick-up confirmation and drop-off information

Let us start by importing the required libraries

```
# import libraries for data manipulation
import numpy as np
import pandas as pd

# import libraries for data visualization
import matplotlib.pyplot as plt
import seaborn as sns
```

Understanding the structure of the data

```
from google.colab import drive
drive.mount('/content/drive')

Mounted at /content/drive

df = pd.read_csv('/content/foodhub_order (1).csv')
df.head()

{"summary": "{\n  \"name\": \"df\",\n  \"rows\": 1898,\n  \"fields\": [\n    {\n      \"column\": \"order_id\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 548,\n        \"min\": 1476547,\n        \"max\": 1478444,\n        \"num_unique_values\": 1898,\n        \"samples\": [\n          1477722,\n          1478319,\n          1477650\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"customer_id\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 113698,\n        \"min\": 1311,\n        \"max\": 405334,\n        \"num_unique_values\": 1200,\n        \"samples\": [\n          351329,\n          49987,\n          345899\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"restaurant_name\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 178,\n        \"samples\": [\n          \"Tortaria\",\n          \"Osteria Morini\",\n          \"Philippe Chow\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"cuisine_type\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 14,\n        \"samples\": [\n          \"Thai\",\n          \"French\",\n          \"Korean\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"cost_of_the_order\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 113698,\n        \"min\": 1311,\n        \"max\": 405334,\n        \"num_unique_values\": 1200,\n        \"samples\": [\n          351329,\n          49987,\n          345899\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      }\n    ]\n  }\n}
```

```

{"properties": {"dtype": "number", "std": 7.48381211004957, "min": 4.47, "max": 35.41, "num_unique_values": 312, "samples": [21.29, 7.18, 13.34]}, "semantic_type": "", "description": "", "column": "day_of_the_week", "properties": {"dtype": "category", "num_unique_values": 2, "samples": ["Weekday", "Weekend"]}, "semantic_type": "", "description": "", "column": "rating", "properties": {"dtype": "category", "num_unique_values": 4, "samples": ["5", "4"]}, "semantic_type": "", "description": "", "column": "food_preparation_time", "properties": {"dtype": "number", "std": 4, "min": 15, "max": 33, "num_unique_values": 19, "samples": [20, 21]}, "semantic_type": "", "description": ""}, {"type": "dataframe", "variable_name": "df"}

```

Observations: The DataFrame has 9 columns as mentioned in the Data Dictionary. Data in each row corresponds to the order placed by a customer.

```
df.shape
```

```
(1898, 9)
```

Observations: The data set has 1898 rows and 9 columns

```
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
```

Observations: df.info() method gives the data type of all the column values

```
df['rating'].unique()
array(['Not given', '5', '3', '4'], dtype=object)
```

Observations: The above function returns a list of values present in the column rating

```
df = df.drop(df[df['rating'] == 'Not given'].index)
df.head()

{"summary": "{\n  \"name\": \"df\",\n  \"rows\": 1162,\n  \"fields\": [\n    {\n      \"column\": \"order_id\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 546,\n        \"min\": 1476547,\n        \"max\": 1478444,\n        \"num_unique_values\": 1162,\n        \"samples\": [\n          1477517,\n          1476725,\n          1477694\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"customer_id\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 114551,\n        \"min\": 5139,\n        \"max\": 403019,\n        \"num_unique_values\": 859,\n        \"samples\": [\n          40745,\n          65306,\n          92832\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"restaurant_name\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 156,\n        \"samples\": [\n          \"Xi'an Famous Foods\",\n          \"Balthazar Boulangerie\",\n          \"Mira Sushi\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"cuisine_type\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 14,\n        \"samples\": [\n          \"Southern\",\n          \"French\",\n          \"Mexican\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"cost_of_the_order\",\n      \"properties\": {\n        \"dtype\": \"number\",\n        \"std\": 7.572578335774905,\n        \"min\": 4.47,\n        \"max\": 35.41,\n        \"num_unique_values\": 259,\n        \"samples\": [\n          11.16,\n          5.72,\n          11.3\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"day_of_the_week\",\n      \"properties\": {\n        \"dtype\": \"category\",\n        \"num_unique_values\": 2,\n        \"samples\": [\n          \"Weekend\",\n          \"Weekday\"\n        ],\n        \"semantic_type\": \"\",\n        \"description\": \"\"\n      },\n      \"column\": \"rating\",\n      \"properties\": {
```

```
{\n      \"dtype\": \"category\", \n      \"num_unique_values\":\n3,\n      \"samples\": [\n      \"5\", \n      \"3\"\n],\n      \"semantic_type\": \"\", \n      \"description\": \"\"\n}\n    }, \n    {\n      \"column\": \"food_preparation_time\", \n      \"properties\": {\n      \"dtype\": \"number\", \n      \"std\":\n4,\n      \"min\": 20, \n      \"max\": 35, \n      \"num_unique_values\": 16, \n      \"samples\": [\n      23, \n      25\n], \n      \"semantic_type\": \"\", \n      \"description\": \"\"\n    }, \n    {\n      \"column\":\n\"delivery_time\", \n      \"properties\": {\n      \"dtype\":\n\"number\", \n      \"std\": 4, \n      \"min\": 15, \n      \"max\": 33, \n      \"num_unique_values\": 19, \n      \"samples\":\n[\n      28, \n      22\n], \n      \"semantic_type\":\n\"\", \n      \"description\": \"\"\n    } \n  ]\n},\n  \"type\": \"dataframe\", \"variable_name\": \"df\"}
```

Observations: The above line of code drops tuple with column name 'rating' and having value as 'not given'

```
# Write your code here
print(df['food_preparation_time'].min())
print(df['food_preparation_time'].max())
print(df['food_preparation_time'].mean())

20
35
27.371970495258168
```

Observations: The statistical analysis are min=20 , max=35 , mean=27.371970495258168

```
df['rating'].value_counts()

rating
Not given    736
5            588
4            386
3            188
Name: count, dtype: int64
```

Observations:

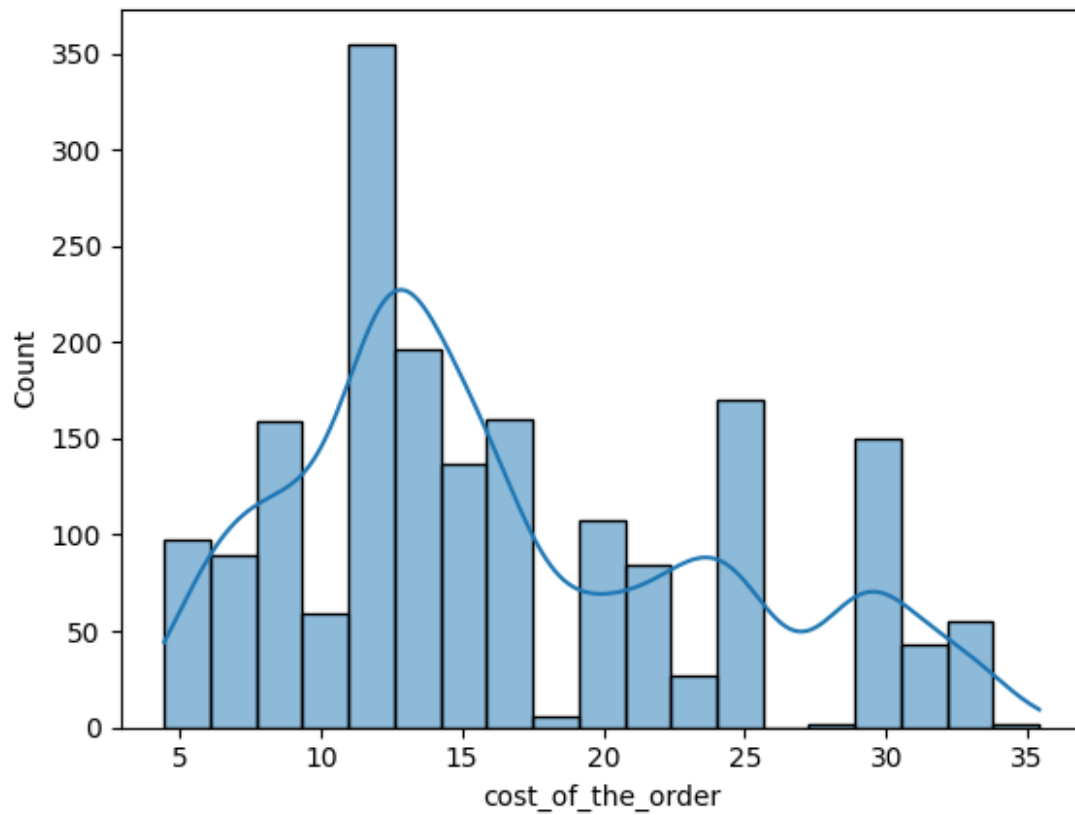
number of rows with value of column 'not given' is 736 ,therefore 736 rows will be dropped

## Exploratory Data Analysis (EDA)

### Univariate Analysis

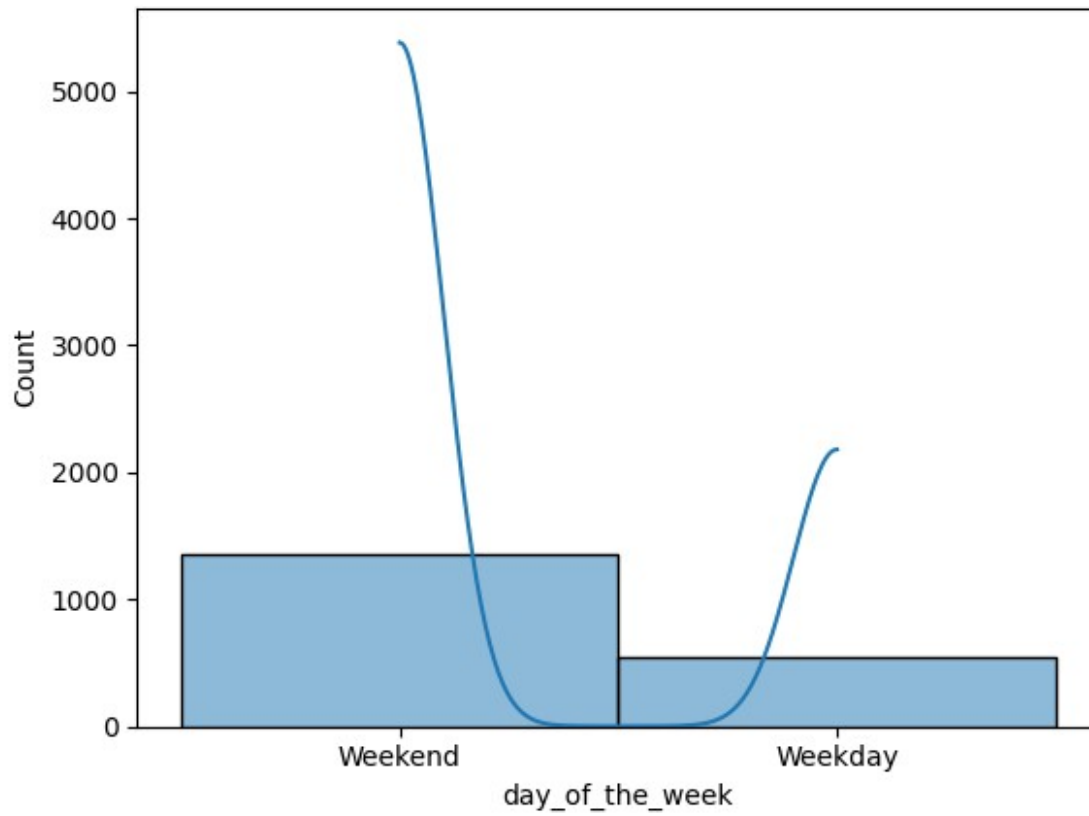
```
# Write the code here
sns.histplot(data=df,x='cost_of_the_order',kde='true')
```

```
<Axes: xlabel='cost_of_the_order', ylabel='Count'>
```



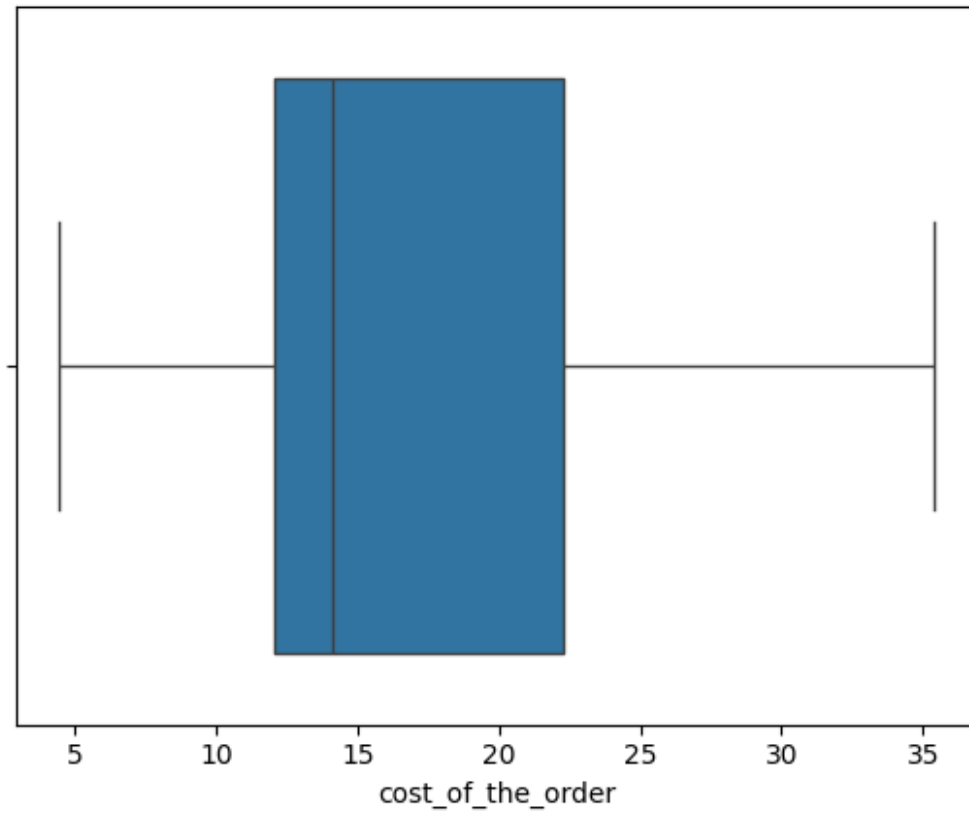
```
sns.histplot(data=df,x='day_of_the_week',kde='true')
```

```
<Axes: xlabel='day_of_the_week', ylabel='Count'>
```



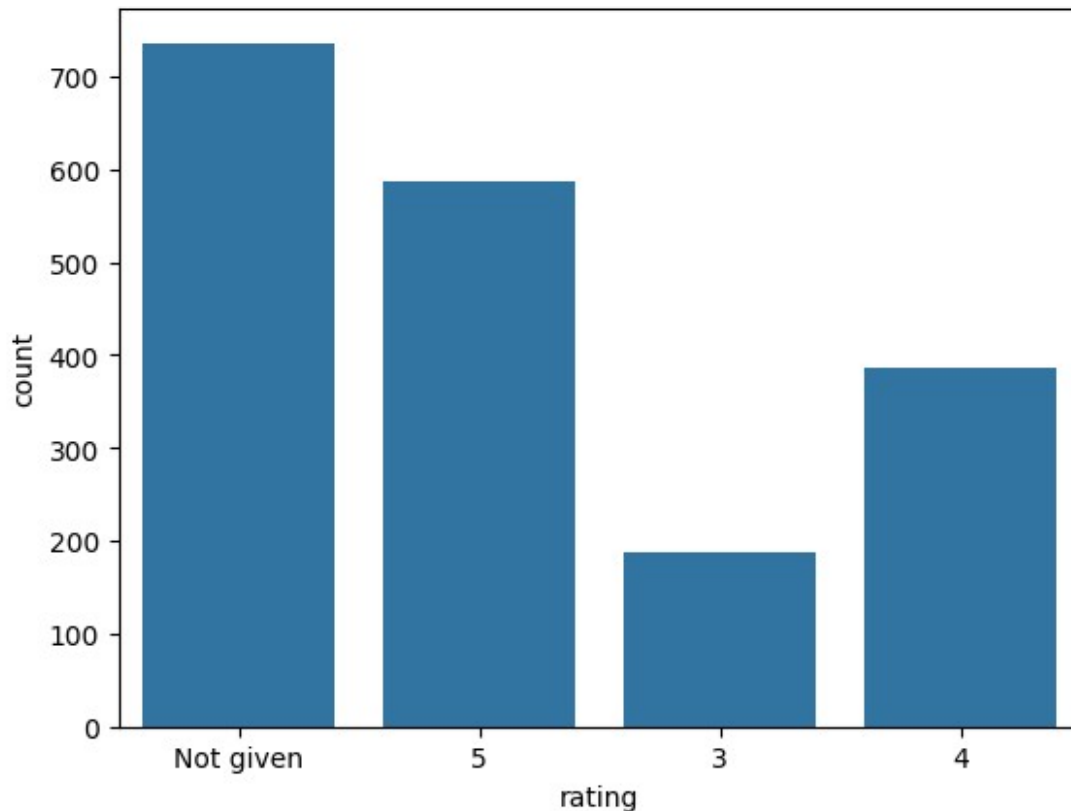
```
sns.boxplot(data=df,x='cost_of_the_order')  
print(df['cost_of_the_order'].min())
```

4.47



```
sns.countplot(data=df,x='rating')  
<Axes: xlabel='rating', ylabel='count'>
```





```
df.groupby(['restaurant_name'])
['order_id'].count().sort_values(ascending =
False).reset_index().head()

{"summary":{"name": "df", "rows": 5, "fields": [
{"column": "restaurant_name", "properties": {
"datatype": "string", "num_unique_values": 5,
"samples": [
"The Meatball Shop", "Parm",
"Blue Ribbon Sushi"
],
"semantic_type": "", "description": ""
}, {
"column": "order_id", "properties": {
"datatype": "number", "std": 56,
"min": 68, "max": 219, "num_unique_values":
5, "samples": [
132, 68,
119
],
"semantic_type": "",
"description": ""
}
]
}, "type": "dataframe"}
```

Observations: The above output are the top 5 restaurants which received highest number of orders

```
d_o_w = (df['day_of_the_week']=='Weekend')
df.loc[d_o_w]
['cuisine_type'].value_counts().sort_values(ascending=False).reset_ind
```

```
ex().head(1)
```

```
{"summary":{"name": "df", "rows": 1, "fields": [{"column": "cuisine_type", "properties": {"dtype": "string", "num_unique_values": 1, "samples": ["American"], "semantic_type": "", "description": ""}], {"column": "count", "properties": {"dtype": "number", "std": null, "min": 415, "max": 415, "num_unique_values": 1, "samples": [415], "semantic_type": "", "description": ""}]}], "type": "dataframe"}
```

Observations: The most popular cuisine on weekend is American with the count 415

```
s=df.loc[df['cost_of_the_order']>20, 'cost_of_the_order'].count()
l=df['cost_of_the_order'].count()
perc=s/l*100
print(perc)

29.24130663856691
```

Observations: 29.24130663856691 percent of the order costed more than 20\$

```
df['delivery_time'].mean()

24.161749209694417
```

Observations: mean delivery time of order is df['delivery\_time'].mean()

```
df.groupby(df['customer_id'])
['order_id'].count().sort_values(ascending=False).reset_index().head()

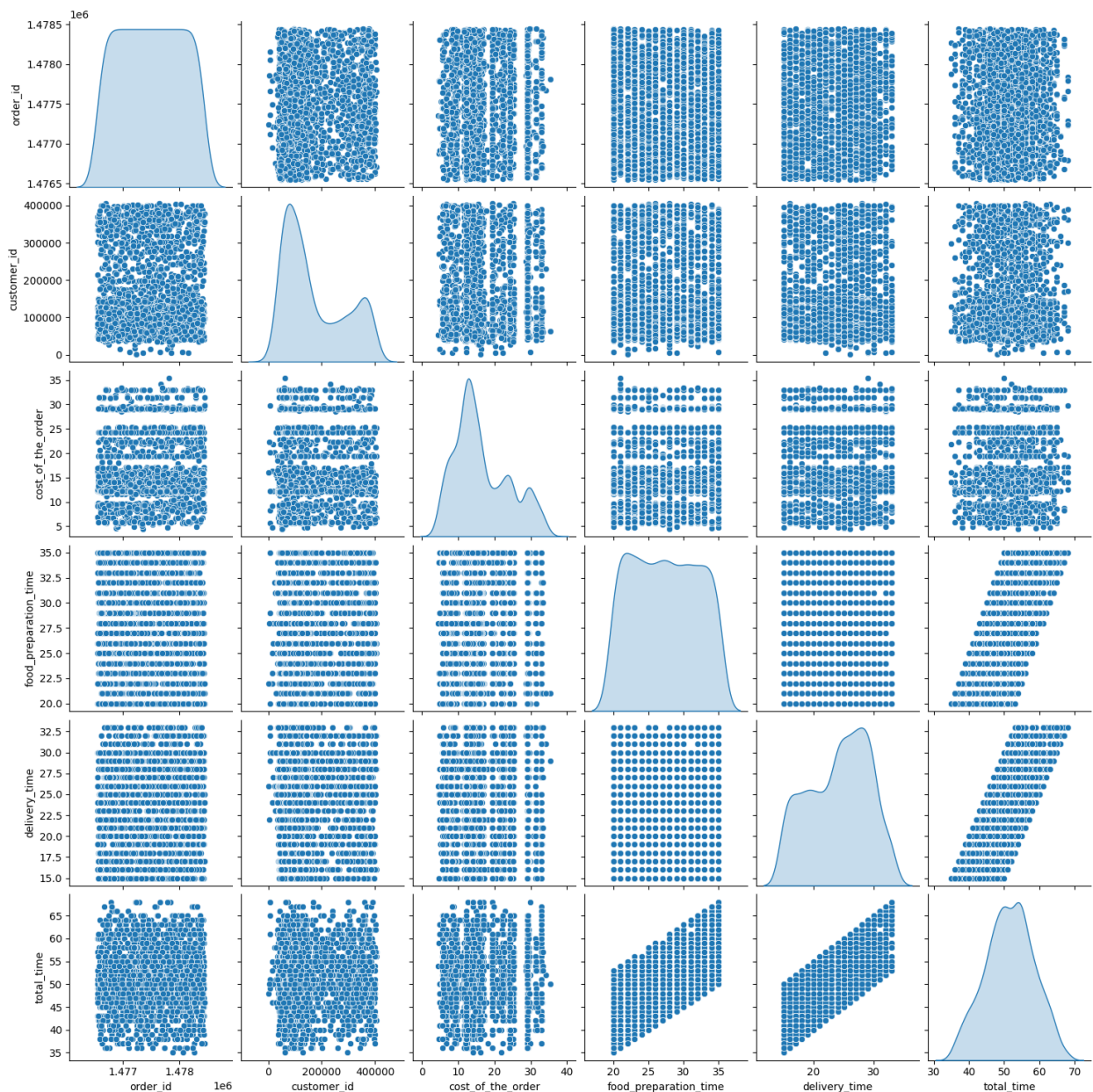
{"summary":{"name": "df", "rows": 5, "fields": [{"column": "customer_id", "properties": {"dtype": "number", "std": 85351, "min": 47440, "max": 250494, "num_unique_values": 5, "samples": [47440, 65009, 83287], "semantic_type": "", "description": ""}], {"column": "order_id", "properties": {"dtype": "number", "std": 2, "min": 7, "max": 13, "num_unique_values": 5, "samples": [7, 9, 10], "semantic_type": "", "description": ""}]}], "type": "dataframe"}
```

Observations: the above line of code returns the most frequent customers with total number of times they have ordered the food

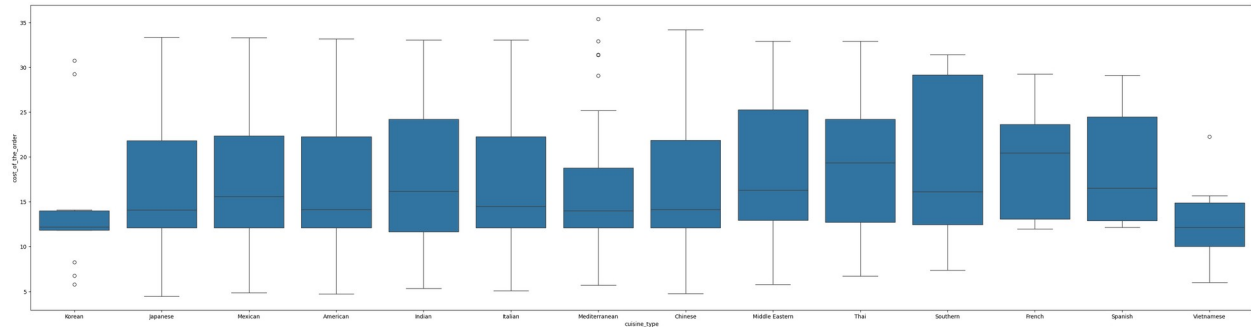
## Multivariate Analysis

```
sns.pairplot(df, diag_kind="kde")
```

```
<seaborn.axisgrid.PairGrid at 0x7c91dc76edd0>
```



```
plt.figure(figsize=(40,10))  
sns.boxplot(data=df,x='cuisine_type',y='cost_of_the_order');
```



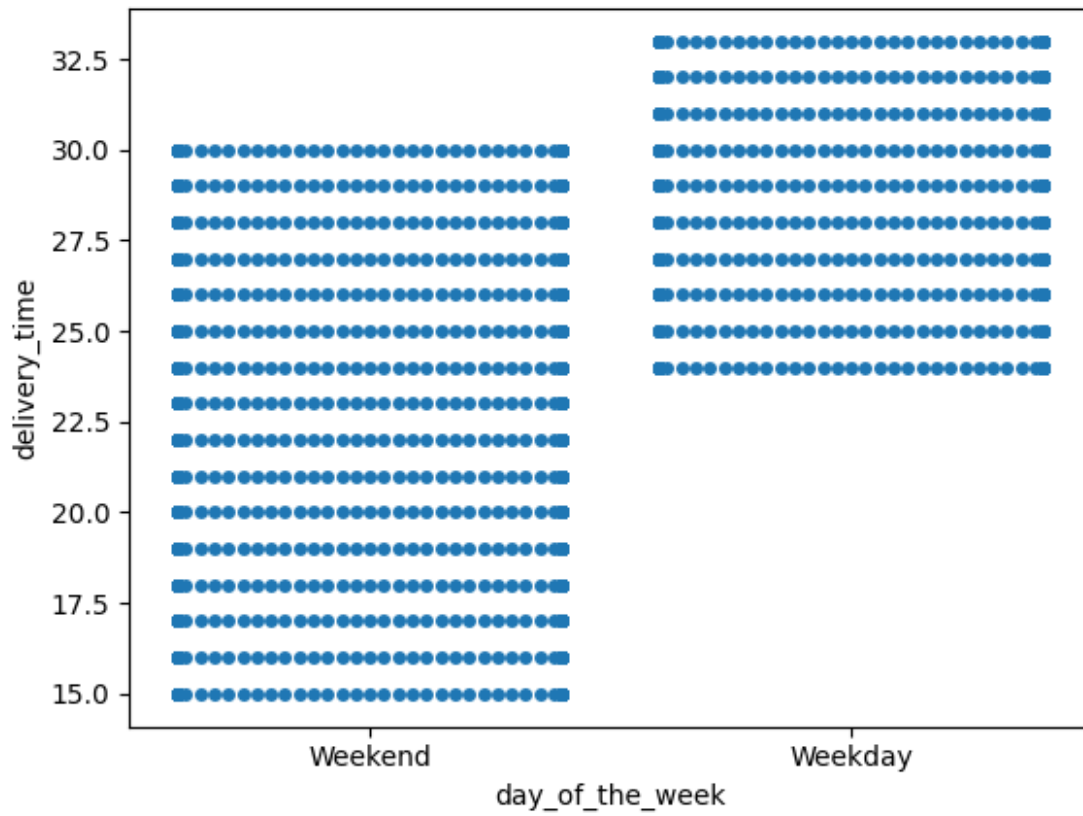
```
sns.swarmplot(x="day_of_the_week", y="delivery_time", data=df);
```

/usr/local/lib/python3.10/dist-packages/seaborn/categorical.py:3398:  
UserWarning: 42.0% of the points cannot be placed; you may want to  
decrease the size of the markers or use stripplot.  
warnings.warn(msg, UserWarning)

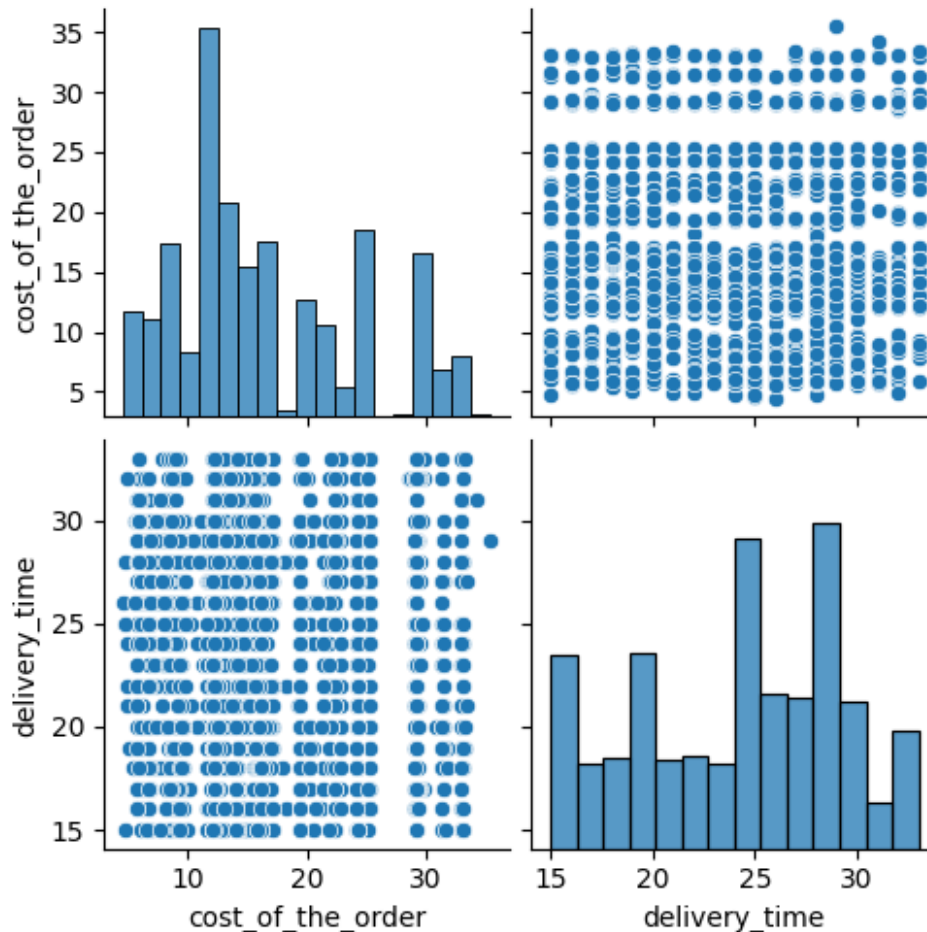
/usr/local/lib/python3.10/dist-packages/seaborn/categorical.py:3398:  
UserWarning: 13.5% of the points cannot be placed; you may want to  
decrease the size of the markers or use stripplot.  
warnings.warn(msg, UserWarning)

/usr/local/lib/python3.10/dist-packages/seaborn/categorical.py:3398:  
UserWarning: 68.0% of the points cannot be placed; you may want to  
decrease the size of the markers or use stripplot.  
warnings.warn(msg, UserWarning)

/usr/local/lib/python3.10/dist-packages/seaborn/categorical.py:3398:  
UserWarning: 50.6% of the points cannot be placed; you may want to  
decrease the size of the markers or use stripplot.  
warnings.warn(msg, UserWarning)



```
sns.pairplot(df[['cost_of_the_order', 'rating', 'delivery_time']]);
```



```
tot_count = df.groupby(['restaurant_name'])
['rating'].count().reset_index()
tot_count_50 = tot_count[tot_count['rating']>50]['restaurant_name']
average_count = tot_count.groupby(['restaurant_name'])
['rating'].mean().reset_index()
average_count_4= average_count[average_count['rating']>4]
average_count_4[average_count_4['restaurant_name'].isin(tot_count_50)]
.sort_values(by='rating',ascending = False).reset_index()
```

```
{"summary":{"\n  \"name\":\n  \"average_count_4[average_count_4['restaurant_name']]\",\n  \"rows\":\n  7,\n  \"fields\": {\n    \"column\": \"index\",\n    \"properties\": {\n      \"dtype\": \"number\",\n      \"std\":\n      54,\n      \"min\": 20,\n      \"max\": 153,\n      \"num_unique_values\": 7,\n      \"samples\": [\n        136,\n        153,\n        121\n      ],\n      \"semantic_type\": \"\",\n      \"description\": \"\",\n      \"column\":\n      \"restaurant_name\",\n      \"properties\": {\n        \"dtype\":\n        \"string\",\n        \"num_unique_values\": 7,\n        \"samples\":\n        [\n          \"Shake Shack\",\n          \"The Meatball Shop\",\n          \"RedFarm Broadway\"\n        ],\n        \"semantic_type\": \"\",
```

```
"description": "\n\n    },\n    {\n        "column":  
"rating",\n        "properties": {\n            "dtype": "number",\n            "std": 57.68139090853182,\n            "min": 55.0,\n            "max": 219.0,\n            "num_unique_values": 7,\n            "samples": [\n                219.0,\n                132.0,\n                59.0\n            ],\n            "semantic_type": "\n",\n            "description": "\n\n    }\n    }\n]\n","type":"dataframe"}

```

Observations: the above output we can analyse the restaurants having a rating count of more than 50 and the average rating is greater than 4

```
# Write the code here
revenue=0.00
for i in df['cost_of_the_order']:
    if i >20.00:
        revenue = (i*0.25)+revenue
    elif i>5.00:
        revenue = (i*0.15)+revenue
print(revenue)

6166.302999999994
```

Observations: The total revenue generated by the company for the orders above 20 and 5 dollars is 6166.3029999999994\$

```
# Write the code here
df['total_time']=df['delivery_time']+df['food_preparation_time']
time60=df.loc[df['total_time']>60]['total_time'].count()
(time60/1898)*100
10.537407797681771
```

Observations: 10.54% of the orders take more than 60 minutes to deliver the order.

```
end = (df.loc[df['day_of_the_week']=='Weekend']
['delivery_time']).mean()
day = (df.loc[df['day_of_the_week']=='Weekday']
['delivery_time']).mean()
print(end)
print(day)
```

22.4700222057735  
28.340036563071298

Observations: the mean delivery time on

weekdays is 28.340036563071298 % , weekends is 22.4700222057735 %

## Conclusion

- total of 736 out of 1898 orders were not rated.

- The most popular cuisine on weekend is American
  - total revenue generated by the company is 6166.30 dollars
  - The mean delivery time of the orders on weekends is greater than mean delivery time on weekdays.
  - more than 10.5% of the order takes more than 60 min to prepare and deliver the food to the customer
  - the customer id 52832 has made order 13 times
-