

```
import datetime
from datetime import datetime, timedelta
# import eli5
# from IPython.display import display
#import os
#import zipfile
import scipy.stats
from collections import Counter
import sklearn
# from sklearn.preprocessing import StandardScaler, MinMaxScale
# from sklearn.linear model import LinearRegression, LogisticRe
# from sklearn.model selection import cross val score, train to
# from sklearn.metrics import accuracy score, auc, classificat.
# from sklearn.metrics import plot confusion matrix, plot roc
# from sklearn.metrics import mean absolute error, mean square
# from sklearn.linear model import ElasticNet, Lasso, LinearRed
# from sklearn.tree import DecisionTreeClassifier, DecisionTree
# from sklearn.svm import SVC, SVR, LinearSVC, LinearSVR
# from sklearn.naive bayes import GaussianNB, MultinomialNB
%matplotlib inline
#sets the default autosave frequency in seconds
%autosave 60
sns.set style('dark')
sns.set(font_scale=1.2)
plt.rc('axes', titlesize=9)
plt.rc('axes', labelsize=14)
plt.rc('xtick', labelsize=12)
plt.rc('ytick', labelsize=12)
import warnings
warnings.filterwarnings('ignore')
# Use Feature-Engine library
#import feature engine
#from feature engine import imputation as mdi
#from feature engine.outlier removers import Winsorizer
#from feature_engine import categorical_encoders as ce
#from feature engine.discretisation import EqualWidthDiscretis
#from feature engine.discretisation import ArbitraryDiscretise
#from feature engine.encoding import OrdinalEncoder
pd.set option('display.max columns', None)
#pd.set option('display.max rows', None)
pd.set option('display.width', 1000)
pd.set option('display.float format','{:.2f}'.format)
random.seed(0)
np.random.seed(0)
np.set printoptions(suppress=True)
```

12

Quantity

## **Exploratory Data Analysis**

```
In [2]:
         df = pd.read csv("LittleLemondata.csv", parse dates=["Order Date"]
In [3]:
         df.head()
Out[3]:
               Row
                    Order Order
                                   Delivery Customer
                                                      Customer
                                                                   City C
           Number
                       ID
                            Date
                                      Date
                                                   ID
                                                          Name
                      92- 2019-
                                              48-951-
                                                       Lowrance
        0
               975
                     392-
                             06- 10/10/2019
                                                                Beigang
                                                1953 Kleinmintz
                     7061
                              23
                      92- 2019-
                                              48-951-
                                                       Lowrance
         1
                             06- 10/10/2019
              1975
                     392-
                                                                Beigang
                                                1953
                                                      Kleinmintz
                     7061
                              23
                      92- 2019-
                                              48-951-
                                                       Lowrance
         2
              2975
                             06-
                                 10/10/2019
                     392-
                                                                Beigang
                                                1953 Kleinmintz
                              23
                     7061
                      92- 2019-
                                              48-951-
                                                       Lowrance
        3
              3975
                     392-
                             06- 10/10/2019
                                                                Beigang
                                                1953
                                                      Kleinmintz
                     7061
                              23
                      92- 2019-
                                              48-951-
                                                       Lowrance
        4
              4975
                     392-
                             06- 10/10/2019
                                                                Beigang
                                                      Kleinmintz
                                                1953
                     7061
                              23
In [4]:
         df.info()
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 21000 entries, 0 to 20999
       Data columns (total 21 columns):
            Column
                          Non-Null Count
                                            Dtype
            Row Number
        0
                            21000 non-null int64
        1
            Order ID
                            21000 non-null object
        2
            Order Date
                            21000 non-null datetime64[ns]
        3
            Delivery Date 21000 non-null object
            Customer ID
                            21000 non-null object
        5
            Customer Name 21000 non-null object
        6
            City
                          21000 non-null object
        7
                            21000 non-null object
            Country
        8
            Postal Code
                            21000 non-null object
            Country Code 20958 non-null
        9
                                            object
        10 Cost
                            21000 non-null float64
        11
            Sales
                            21000 non-null float64
```

21000 non-null int64

```
14 Delivery Cost 21000 non-null float64
                           21000 non-null object
        15 Course Name
        16 Cuisine Name
                           21000 non-null object
        17 Starter Name
                           21000 non-null object
        18 Desert Name
                           21000 non-null object
        19 Drink
                           21000 non-null object
        20 Sides
                           21000 non-null object
       dtypes: datetime64[ns](1), float64(4), int64(2), object(14)
       memory usage: 3.4+ MB
In [5]:
         df["Profit"] = df["Sales"] - df["Cost"]
In [6]:
         df.head()
              Row Order Order
Out[6]:
                                  Delivery Customer Customer
                                                                  City C
                      ID
                           Date
           Number
                                     Date
                                                        Name
                          2019-
                     92-
                                            48-951-
                                                     Lowrance
        0
                    392-
                            06- 10/10/2019
               975
                                                               Beigang
                                               1953 Kleinmintz
                    7061
                             23
                     92- 2019-
                                            48-951-
                                                     Lowrance
        1
                            06- 10/10/2019
              1975
                    392-
                                                               Beigang
                                               1953 Kleinmintz
                    7061
                             23
                     92- 2019-
                                            48-951-
                                                     Lowrance
        2
              2975
                    392-
                            06- 10/10/2019
                                                               Beigang
                                               1953 Kleinmintz
                    7061
                             23
                     92- 2019-
                                            48-951-
                                                     Lowrance
        3
                    392-
                            06- 10/10/2019
                                                               Beigang
              3975
                                                    Kleinmintz
                                               1953
                     7061
                             23
                     92- 2019-
                                            48-951-
                                                     Lowrance
        4
                            06- 10/10/2019
              4975
                    392-
                                                               Beigang
                                               1953 Kleinmintz
                    7061
                             23
In [7]:
         #df.to csv("modified.csv", index=False)
In [8]:
         df.describe()
Out[8]:
                   Row
                                                             Delivery
                           Cost
                                    Sales Quantity Discount
               Number
                                                                Cost
        count 21000.00 21000.00 21000.00 21000.00
                                                            21000.00 210
        mean 10500.50
                          147.04
                                   220.56
                                              2.12
                                                      49.16
                                                               50.98
               6062.32
                          76.57 114.85
                                              0.78
                                                      31.53
                                                               28.45
          std
```

21000 non-null float64

13 Discount

min	1.00	44.57	66.86	1.00	9.12	1.11	
25%	5250.75	91.84	137.76	1.75	20.00	26.64	
50%	10500.50	125.00	187.50	2.00	47.84	51.11	
75%	15750.25	210.00	315.00	3.00	80.34	76.12	1
max	21000.00	320.00	480.00	3.00	99.24	99.91	1

In [9]: df.columns

Out[9]: Index(['Row Number', 'Order ID', 'Order Date', 'Delivery Dat e', 'Customer ID', 'Customer Name', 'City', 'Country', 'Postal Code', 'Country Code', 'Cost', 'Sales', 'Quantity', 'Discoun t', 'Delivery Cost', 'Course Name', 'Cuisine Name', 'Starter N ame', 'Desert Name', 'Drink', 'Sides', 'Profit'], dtype='objec t')

## **Data Visualization**

In the first task, you need to create a bar chart that shows customers sales and filter data based on sales with at least \$70.

In [10]: df2 = df[df["Sales"] >= 70.00]

In [11]: df2

Out[11]:

	Row Number	Order ID	Order Date	Delivery Date	Customer ID	Customer Name	Ci
0	975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigar
1	1975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigar
2	2975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigar
3	3975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigar
4	4975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigar

	_			_	

•••	•••	•••	•••				
20995	16721	67- 723- 0322	2022- 03-13	7/1/2023	69-530- 7688	Devonne Whal	Balbo
20996	17721	67- 723- 0322	2022- 03-13	7/1/2023	69-530- 7688	Devonne Whal	Balbo
20997	18721	67- 723- 0322	2022- 03-13	7/1/2023	69-530- 7688	Devonne Whal	Balbo
20998	19721	67- 723- 0322	2022- 03-13	7/1/2023	69-530- 7688	Devonne Whal	Balbo
20999	20721	67- 723- 0322	2022- 03-13	7/1/2023	69-530- 7688	Devonne Whal	Balbo

## 20045 rows × 22 columns

**Aaron Cromley** 4527.56

Abigail Struis 4323.54

```
In [12]:
          df2.groupby(["Customer Name"])["Sales"].sum()
Out[12]: Customer Name
         Aaron Cromley
                             4527.56
         Abigail Struis
                             4323.54
         Adah Adamczewski 4812.30
         Adaline Reichartz
                             4301.04
         Adamo Rumens
                             4812.30
         Zita Coldbath
                             4631.37
         Zolly Heinzel
                             4466.61
         Zora Hanalan
                             4728.87
         Zorana Diggin
                             4453.78
         Zorine Delacourt
                             4453.78
         Name: Sales, Length: 1000, dtype: float64
In [13]:
          task1 = pd.DataFrame(df2.groupby(["Customer Name"])["Sales"].st
In [14]:
          task1
Out[14]:
                             Sales
            Customer Name
```

 Adah Adamczewski
 4812.30

 Adaline Reichartz
 4301.04

 Adamo Rumens
 4812.30

 ...
 ...

 Zita Coldbath
 4631.37

 Zolly Heinzel
 4466.61

 Zora Hanalan
 4728.87

 Zorana Diggin
 4453.78

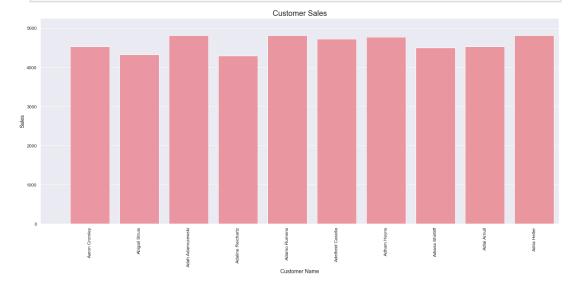
 Zorine Delacourt
 4453.78

1000 rows × 1 columns

```
In [15]: # Sort Barplots by Values and Single Plot

fig = plt.figure(figsize=(20,10))

sns.barplot(x=taskl.index, y=taskl.Sales, data=taskl)
plt.title("Customer Sales", size=20)
plt.xlabel("Customer Name")
#plt.ylabel("Average Ticket Prices")
plt.xticks(rotation=90)
#plt.ticklabel_format(style='plain', axis='y')
plt.xlim(-1, 9.5)
plt.tight_layout()
plt.show()
```



In the second task, you need to create a line chart to show the sales trend from 2019 to 2022.

```
In [16]:
           df3 = df[df["Order Date"] < "2023-01-01"]</pre>
In [17]:
           df3.head()
Out[17]:
                 Row
                      Order Order
                                      Delivery Customer
                                                          Customer
                                                                        City C
             Number
                              Date
                          ID
                                         Date
                                                       ID
                                                              Name
                        92-
                             2019-
                                                 48-951-
                                                           Lowrance
          0
                 975
                       392-
                                06-
                                    10/10/2019
                                                                     Beigang
                                                    1953
                                                          Kleinmintz
                       7061
                                23
                        92-
                             2019-
                                                 48-951-
                                                           Lowrance
          1
                1975
                       392-
                               06-
                                    10/10/2019
                                                                     Beigang
                                                    1953
                                                          Kleinmintz
                       7061
                                23
                        92-
                             2019-
                                                 48-951-
                                                           Lowrance
          2
                2975
                       392-
                               06-
                                    10/10/2019
                                                                     Beigang
                                                    1953
                                                          Kleinmintz
                       7061
                                23
                        92-
                             2019-
                                                 48-951-
                                                           Lowrance
          3
                3975
                       392-
                               06-
                                    10/10/2019
                                                                     Beigang
                                                          Kleinmintz
                                                    1953
                        7061
                                23
                             2019-
                        92-
                                                 48-951-
                                                           Lowrance
          4
                4975
                       392-
                               06-
                                    10/10/2019
                                                                     Beigang
                                                    1953
                                                          Kleinmintz
                        7061
                                23
In [18]:
           df3["Order Date"].min()
          Timestamp('2019-01-10 00:00:00')
Out[18]:
In [19]:
           df3["Order Date"].max()
          Timestamp('2022-12-31 00:00:00')
Out[19]:
In [20]:
           fig = plt.figure(figsize=(30,10))
           sns.lineplot(x=df3["Order Date"], y=df3.Profit, data=df3, estir
           plt.title("Profit chart", fontsize=20)
           plt.xlabel("", fontsize=20)
           plt.ylabel("Profit", fontsize=20)
           plt.xlim('2019-01-10', '2022-01-10')
           #plt.legend(['',''])
           plt.show()
```

In the third task, you need to create a Bubble chart of sales for all customers. The chart should show the names of all customers. Once you roll over a bubble, the chart should show the name, profit and sale.

```
In [21]:
          df.groupby(["Customer Name"])["Sales","Profit"].sum()
Out[21]:
                               Sales
                                       Profit
             Customer Name
              Aaron Cromley 4661.27 1553.76
               Abigail Struis 4457.25 1485.75
          Adah Adamczewski 4812.30 1604.10
           Adaline Reichartz 4434.75
                                    1478.25
             Adamo Rumens 4812.30 1604.10
               Zita Coldbath 4631.37 1543.79
               Zolly Heinzel 4600.32 1533.44
               Zora Hanalan 4728.87
                                     1576.29
               Zorana Diggin
                             4587.49
                                      1529.16
            Zorine Delacourt 4587.49
                                      1529.16
```

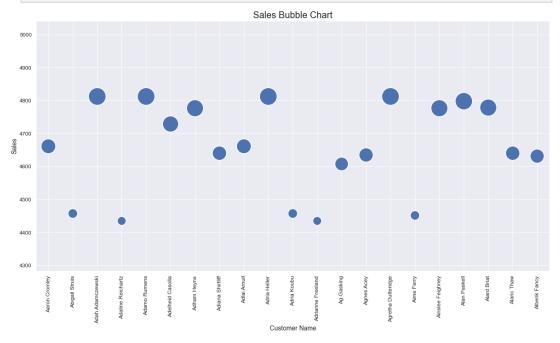
1000 rows × 2 columns

Abigail Struis	4457.25	1485.75
Adah Adamczewski	4812.30	1604.10
Adaline Reichartz	4434.75	1478.25
Adamo Rumens	4812.30	1604.10
Zita Coldbath	4631.37	1543.79
Zolly Heinzel	4600.32	1533.44
Zora Hanalan	4728.87	1576.29
Zorana Diggin	4587.49	1529.16
Zorine Delacourt	4587.49	1529.16

1000 rows × 2 columns

```
In [24]: p
```

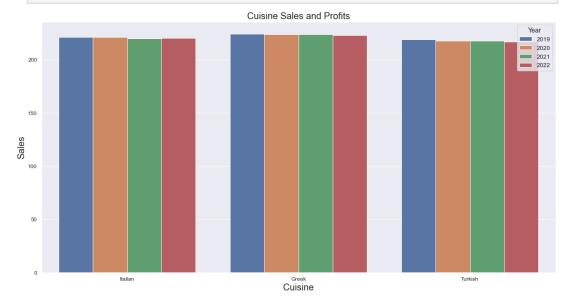
```
plt.figure(figsize=(20,10))
sns.scatterplot(x=df4.index, y=df4.Sales, size='Profit', data=opt.title("Sales Bubble Chart", fontsize=20)
#plt.xlabel("Flight Number", fontsize=20)
#plt.ylabel("Launch Site", fontsize=20)
plt.xlim(-0.5, 20.5)
plt.xticks(rotation = 90)
plt.show()
```



In this task, you need to compare the sales of the three different cuisines sold at Little Lemon. Create a Bar chart that shows the sales of the Turkish, Italian and Greek cuisines.

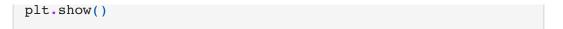
In [25]: df3.head() Out [25]: Order Order **Delivery Customer** Row Customer City C Number ID **Date Date** Name 2019-92-48-951-Lowrance 0 975 392-06-10/10/2019 Beigang 1953 Kleinmintz 7061 23 2019-92-48-951-Lowrance 1 1975 392-06-10/10/2019 Beigang Kleinmintz 1953 7061 23 92-2019-48-951-Lowrance 2 2975 392-06- 10/10/2019 Beigang 1953 Kleinmintz 7061 23 92- 2019-48-951-Lowrance 3 3975 392-06-10/10/2019 Beigang 1953 Kleinmintz 7061 23 92-2019-48-951-Lowrance 4 4975 392-06- 10/10/2019 Beigang 1953 Kleinmintz 7061 23 In [26]: df3.groupby("Cuisine Name").sum() Out[26]: Row De Cost Sales Quantity **Discount** Number Cuisine Name Greek 54893769 779435.97 1169153.96 10458 256964.57 2725 Italian 109814922 1537555.91 2306333.86 18333 514305.95 5285 Turkish 55135500 761790.33 1142685.50 258158.21 2665 15750 In [27]: df3["Year"] = df3["Order Date"].dt.year In [28]: df3.head() Out [28]: Row Order Order **Delivery Customer** Customer City C Number Name ID Date **Date** ID 2019-92-48-951-Lowrance 0 975 392-06- 10/10/2019 Beigang

		7061	23		1953	KIEINMINTZ	
1	1975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigang
2	2975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigang
3	3975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigang
4	4975	92- 392- 7061	2019- 06- 23	10/10/2019	48-951- 1953	Lowrance Kleinmintz	Beigang



```
In [30]:
    plt.figure(figsize=(20,10))

    sns.barplot(y="Profit", x="Cuisine Name", hue="Year", data=df3
    plt.xlabel("Cuisine", fontsize=20)
    plt.ylabel("Profit", fontsize=20)
    plt.title("Cuisine Sales and Profits", fontsize=20)
```

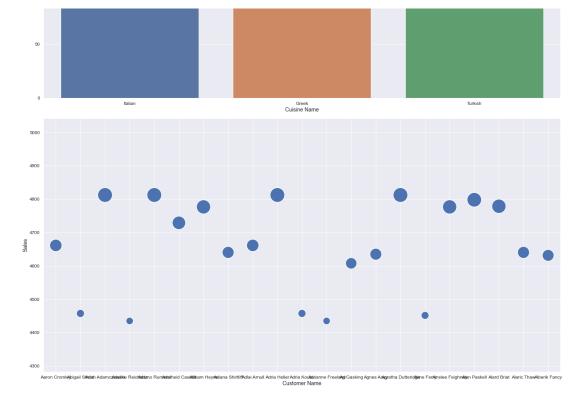




In this final task, you need to create an interactive dashboard that combines the Bar chart called Customers sales and the Sales Bubble Chart.

```
In [50]:
          fig, ax = plt.subplots(2,1, sharex=False, figsize=(20,20))
          #fig.suptitle('Main Title')
          sns.barplot(x="Cuisine Name", y="Sales", data=df3, ci=None, ax
          #ax[0].set title('Title of the first chart')
          #ax[0].tick_params('x', labelrotation=45)
          ax[0].set xlabel("Cuisine Name")
          ax[0].set ylabel("Sales")
          sns.scatterplot(x=df4.index, y=df4.Sales, size='Profit', data=
          #ax[1].set_title('Title of the second chart')
          #ax[1].tick_params('x', labelrotation=45)
          ax[1].set xlabel("Customer Name")
          ax[1].set ylabel("Sales")
          ax[1].set_xlim(-0.5, 20.5)
          plt.ticklabel format(style='plain', axis='y')
          plt.tight layout()
          plt.show()
```





## Python code done by Dennis Lam

