EDA on Coffee Quality Dataset



Identification of attributes and implementing the DataSet

In [9]: #Breif information of all attributes

df.info()

```
#Importing necessary libraries to perform EDA
         import numpy as np
         import pandas as pd
         import matplotlib.pyplot as plt
         import seaborn as sns
In [7]: #To read/open csv file
         df=pd.read_csv("df_Coffee.csv")
         print("First/Top 2 records>>>")
         #Top 2 records serially
         df.head(2)
         First/Top 2 records>>>
Out[7]:
                                                                                                           Total
                                                                                                                            Category
                          Country
                                                                 ICO
                                                                                                                   Moisture
            Unnamed:
                                    Farm
                      ID
                                           Lot Number
                                                         Mill
                                                                      Company Altitude
                                                                                                Region ...
                                                                                                            Cup
                                                                                                                                One
                         of Origin
                                                              Number
                   0
                                                                                                                 Percentage
                                   Name
                                                                                                          Points
                                                                                                                             Defects
                                                                         Coffee
                                                                                  1700-
                   0 0 Colombia
                                      EI CQU2022015
                                                          EI
                                                                 NaN
                                                                         Quality
                                                                                        Piendamo, Cauca ...
                                                                                                           89.33
                                                                                                                       11.8
                                                                                                                                   0
                                                                                   1930
                                  Paraiso
                                                      Paraiso
                                                                          Union
                                    Royal
                                             The 2022
                                                        Royal
                                                                         Taiwan
                                            Pacific Rim
                                                        Bean
                                    Bean
                                                                                                                       10.5
                                                                                                                                   0
                           Taiwan
                                                                 NaN
                                                                         Coffee
                                                                                   1200
                                                                                                Chiayi ...
                                                                                                           87.58
                                   Geisha
                                               Coffee
                                                       Geisha
                                                                      Laboratory
                                   Estate
                                          Summit,T037
        2 rows × 41 columns
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 207 entries, 0 to 206
Data columns (total 41 columns):
     Column
                             Non-Null Count Dtype
                             -----
                             207 non-null
0
     Unnamed: 0
                                             int64
 1
                             207 non-null
                                             int64
     Country of Origin
 2
                             207 non-null
                                             object
 3
     Farm Name
                             205 non-null
                                             object
 4
     Lot Number
                             206 non-null
                                              object
 5
     Mill
                             204 non-null
                                             object
     ICO Number
                             75 non-null
 6
                                             object
 7
     Company
                             207 non-null
                                              object
 8
     Altitude
                             206 non-null
                                              object
 9
                             205 non-null
     Region
                                             obiect
 10
     Producer
                             206 non-null
                                             object
 11
     Number of Bags
                             207 non-null
                                              int64
 12
     Bag Weight
                             207 non-null
                                             object
     In-Country Partner
 13
                             207 non-null
                                             object
 14
     Harvest Year
                             207 non-null
                                             object
 15
     Grading Date
                             207 non-null
                                             object
 16
     0wner
                             207 non-null
                                             obiect
     Variety
                             201 non-null
 17
                                             object
 18
     Status
                             207 non-null
                                              object
 19
     Processing Method
                             202 non-null
                                             object
                             207 non-null
 20
     Aroma
                                              float64
 21
     Flavor
                             207 non-null
                                              float64
 22
     Aftertaste
                             207 non-null
                                              float64
     Acidity
 23
                             207 non-null
                                              float64
 24
                             207 non-null
                                              float64
     Body
 25
     Balance
                             207 non-null
                                              float64
 26
                             207 non-null
     Uniformity
                                              float64
 27
     Clean Cup
                             207 non-null
                                              float64
 28
     Sweetness
                             207 non-null
                                              float64
 29
     Overall
                             207 non-null
                                              float64
 30
     Defects
                             207 non-null
                                              float64
     Total Cup Points
                             207 non-null
 31
                                              float64
 32
     Moisture Percentage
                             207 non-null
                                              float64
 33
     Category One Defects
                             207 non-null
                                              int64
 34
     Ouakers
                             207 non-null
                                              int64
 35
     Color
                             207 non-null
                                              object
 36
     Category Two Defects
                             207 non-null
                                              int64
 37
                             207 non-null
     Expiration
                                             object
 38
     Certification Body
                             207 non-null
                                             object
 39
     Certification Address
                             207 non-null
                                              object
 40 Certification Contact
                             207 non-null
                                             object
dtypes: float64(13), int64(6), object(22)
memory usage: 66.4+ KB
```

In [10]: #Statistical infromation of the given coffee data set attribute
 df.describe()

```
Unnamed:
                                Number of
                                                                                                                               Clean
                                                                     Aftertaste
                                                                                   Acidity
                                                                                                                    Uniformity
                                                Aroma
                                                             Flavor
                                                                                                Body
                                                                                                          Balance
                                     Bags
                                                                                                                                 Cup
                                207.000000 207.000000 207.000000 207.000000 207.000000 207.000000 207.000000
count 207.000000 207.000000
                                                                                                                                207.0
mean 103.000000 103.000000
                                155.449275
                                              7.721063
                                                          7.744734
                                                                      7.599758
                                                                                  7.69029
                                                                                             7.640918
                                                                                                         7.644058
                                                                                                                     9.990338
                                                                                                                                 10.0
  std
        59.899917
                    59.899917
                                244.484868
                                              0.287626
                                                          0.279613
                                                                      0.275911
                                                                                  0.25951
                                                                                             0.233499
                                                                                                         0.256299
                                                                                                                     0.103306
                                                                                                                                  0.0
                                                                                                                                 10.0
         0.000000
                     0.000000
                                  1.000000
                                              6.500000
                                                          6.750000
                                                                      6.670000
                                                                                  6.83000
                                                                                             6.830000
                                                                                                         6.670000
                                                                                                                     8.670000
 min
 25%
        51.500000
                    51.500000
                                  1.000000
                                              7.580000
                                                          7.580000
                                                                      7.420000
                                                                                  7.50000
                                                                                             7.500000
                                                                                                         7.500000
                                                                                                                     10.000000
                                                                                                                                 10.0
 50% 103.000000 103.000000
                                 14.000000
                                              7.670000
                                                          7.750000
                                                                      7.580000
                                                                                  7.67000
                                                                                             7.670000
                                                                                                         7.670000
                                                                                                                     10.000000
                                                                                                                                 10.0
 75% 154.500000 154.500000
                                275.000000
                                                          7.920000
                                                                      7.750000
                                                                                             7.750000
                                                                                                         7.790000
                                                                                                                    10.000000
                                                                                                                                 10.0
                                              7.920000
                                                                                  7.87500
 max 206.000000 206.000000 2240.000000
                                              8.580000
                                                          8.500000
                                                                      8.420000
                                                                                  8.58000
                                                                                             8.250000
                                                                                                         8.420000
                                                                                                                    10.000000
                                                                                                                                 10.0
```

```
max 206.000000 206.000000 2240.000000 8.580000 8.500000 8.420000 8.58000 8.250000 8.420000 10.000000 10.0

In [11]: # To count the total rows and columns present in the data set df.shape

Out[11]: (207, 41)
```

In [13]: # Determining the start and the stop index df.index

Out[13]: RangeIndex(start=0, stop=207, step=1)

Observation

• In this block, there were basic syntax to get a brief overview of the dataset. Here are few conclusions drawn: -There are 207 rows and $40\ columns.$ -Also drawn the statistical inference. -The index starts from 0 and goes till 207.

DataCleaning



In [42]: #Removing Unwanted column
 df.drop('Unnamed: 0',axis=1)

Out[42]:		ID	Country of Origin	Farm Name	Lot Number	Mill	ICO Number	Company	Altitude	Region	Producer	 Total Cup Points
	0	0	Colombia	Finca El Paraiso	CQU2022015	Finca El Paraiso	NaN	Coffee Quality Union	1700- 1930	Piendamo,Cauca	Diego Samuel Bermudez	 89.33
	1	1	Taiwan	Royal Bean Geisha Estate	The 2022 Pacific Rim Coffee Summit,T037	Royal Bean Geisha Estate	NaN	Taiwan Coffee Laboratory	1200	Chiayi	曾福森	 87.58
	2	2	Laos	OKLAO coffee farms	The 2022 Pacific Rim Coffee Summit,LA01	oklao coffee processing plant	NaN	Taiwan Coffee Laboratory	1300	Laos Borofen Plateau	WU TAO CHI	 87.42
	3	3	Costa Rica	La Cumbre	CQU2022017	La Montana Tarrazu Mill	NaN	Coffee Quality Union	1900	Los Santos,Tarrazu	Santa Maria de Dota	 87.17
	4	4	Colombia	Finca Santuario	CQU2023002	Finca Santuario	NaN	Coffee Quality Union	1850- 2100	Popayan,Cauca	Camilo Merizalde	 87.08
	202	202	Brazil	Fazenda Conquista	019/22	Dry Mill	NaN	Ipanema Coffees	950	Sul de Minas	Ipanema Coffees	 80.08
	203	203	Nicaragua	Finca San Felipe	017-053-0155	Beneficio Atlantic Sébaco	017-053-0155	Exportadora Atlantic S.A	1200	Matagalpa	Exportadora Atlantic S.A.	 80.00
	204	204	Laos	-	105/3/VL7285- 005	DRY MILL	105/3/VL7285- 005	Marubeni Corporation	1300	Bolaven Plateau	LAO MINH TIEN COFFEE SOLE CO.,LTD	 79.67
	205	205	El Salvador	Rosario de Maria II, Area de La Pila	0423A01	Optimum Coffee, San Salvador, El Salvador	NaN	Aprentium Enterprises LLC	1200	Volcan de San Vicente, La Paz, El Salvador	Roselia Yglesias	 78.08

207 rows × 40 columns

Brazil

206 206

Walter

Matter

```
#To rename a column from bag_weight to bag_weight\kg
dfl=df.rename(
In [46]:
               columns={
                    'bag_weight': 'bag_weight\kg'
               })
```

002/1208/1016

Beneficio

1058 y 1059 Berielioic humedo/seco

Descafeinadores

Mexicano SA. de CV

850-

1100

Minas Gerais

Walter Matter ...

78.00

In [46]: # Top 5 rows from df1 dataSet
df1.head()

Out[46]:	U	nnamed: 0	ID	Country of Origin	Farm Name	Lot Number	Mill	ICO Number	Company	Altitude	Region	 Total Cup Points	Moisture Percentage	Catego Oı Defec
	0	0	0	Colombia	Finca El Paraiso	CQU2022015	Finca El Paraiso	NaN	Coffee Quality Union	1700- 1930	Piendamo,Cauca	 89.33	11.8	
	1	1	1	Taiwan	Royal Bean Geisha Estate	The 2022 Pacific Rim Coffee Summit,T037	Royal Bean Geisha Estate	NaN	Taiwan Coffee Laboratory	1200	Chiayi	 87.58	10.5	
	2	2	2	Laos	OKLAO coffee farms	The 2022 Pacific Rim Coffee Summit,LA01	oklao coffee processing plant	NaN	Taiwan Coffee Laboratory	1300	Laos Borofen Plateau	 87.42	10.4	
	3	3	3	Costa Rica	La Cumbre	CQU2022017	La Montana Tarrazu Mill	NaN	Coffee Quality Union	1900	Los Santos,Tarrazu	 87.17	11.8	
	4	4	4	Colombia	Finca Santuario	CQU2023002	Finca Santuario	NaN	Coffee Quality Union	1850- 2100	Popayan,Cauca	 87.08	11.6	

5 rows × 41 columns

```
In [15]: dfn=df1.select_dtypes(exclude='object')
In [16]: # To check whether the given rows have duplicate values
         dfn.duplicated()
         0
                False
Out[16]:
                False
         2
                False
         3
                False
         4
                False
         202
                False
         203
                False
         204
                False
         205
                False
         206
                False
         Length: 207, dtype: bool
In [17]: dfn.duplicated().sum()
```

Out[17]: 0

In [18]: # To check whether the given rows have null values dfn.isnull()

		(/															
ıt[18]:		Unnamed: 0	ID	Number of Bags	Aroma	Flavor	Aftertaste	Acidity	Body	Balance	Uniformity	Clean Cup	Sweetness	Overall	Defects	Total Cup Points	F
	0	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	_
	1	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	2	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	3	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	4	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	202	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	203	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	204	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	205	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	
	206	False	False	False	False	False	False	False	False	False	False	False	False	False	False	False	

207 rows × 19 columns

```
In [19]: dfn.isnull().sum()
Out[19]: Unnamed: 0
                                   0
                                  0
          Number of Bags
                                   0
                                   0
          Aroma
          Flavor
                                  0
          Aftertaste
                                   0
          Acidity
                                   0
                                  0
          Body
          Balance
                                  0
          Uniformity
                                  0
          Clean Cup
                                  0
          Sweetness
                                  0
          0verall
                                  0
          Defects
          Total Cup Points
                                  0
          Moisture Percentage
                                  0
          Category One Defects
                                   0
          Quakers
                                  0
          Category Two Defects
                                  0
          dtype: int64
```

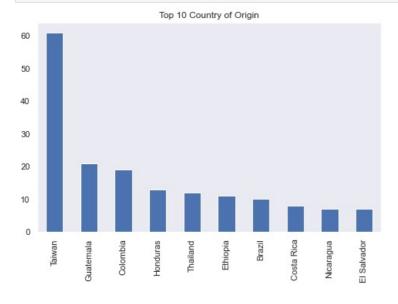
Observations

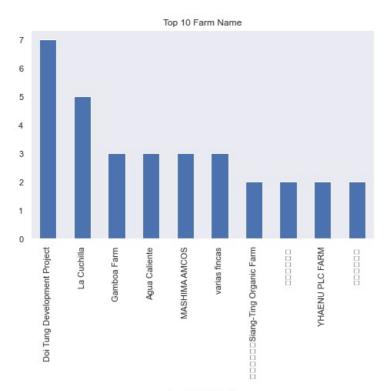
- -There existed a column with no significance 'Unnamed: 0', that has been dropped.
- -All the values are checked whether there are null present in the dataset, but none of them has null values.
- -All the values are checked whether there are duplicated present in the dataset, but none of them has duplicated values.

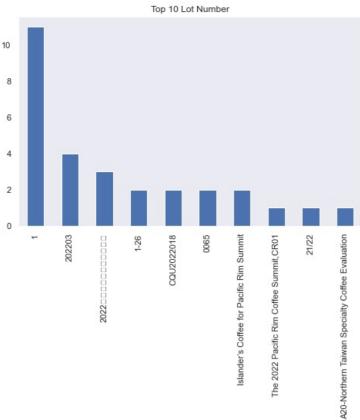
EDA on coffee data set

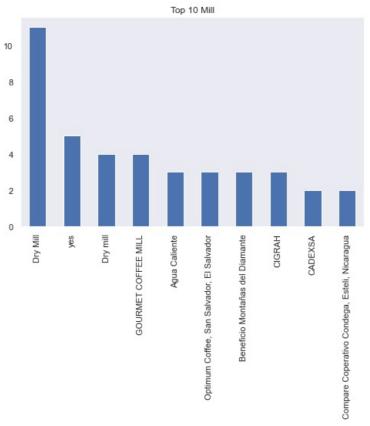
```
In [20]: import seaborn as sns
import warnings
warnings.filterwarnings('ignore')
sns.set()

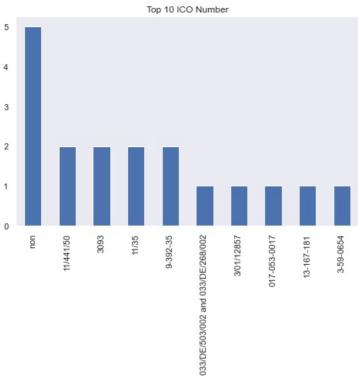
In [48]: cat_list = df1.select_dtypes(include=["object"]).columns.tolist()
for col in cat_list:
    plt.figure(figsize=(8,5))
    top10 = df1[col].value_counts()[:10]
    top10.plot(kind='bar')
    plt.title("Top 10 " + col)
    plt.grid(visible=False)
    plt.show()
```

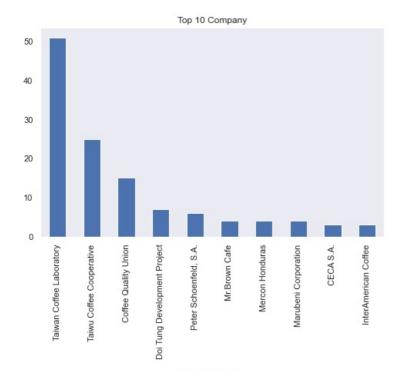


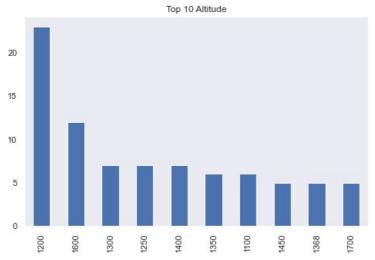


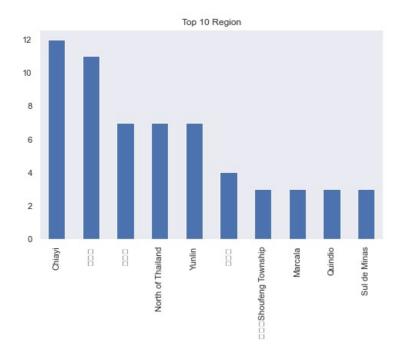


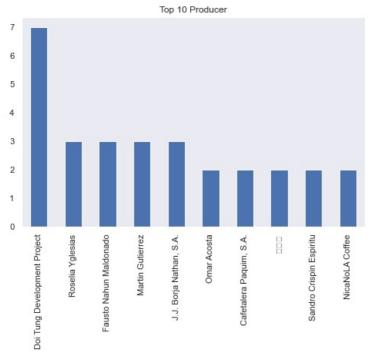


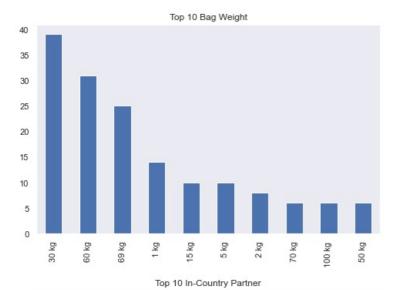




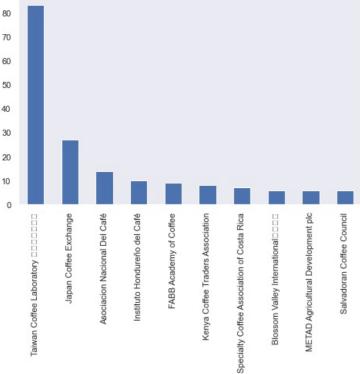




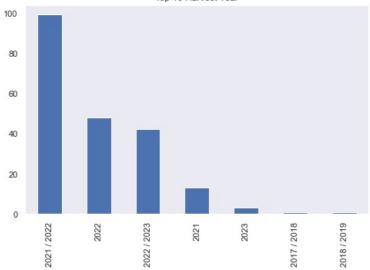


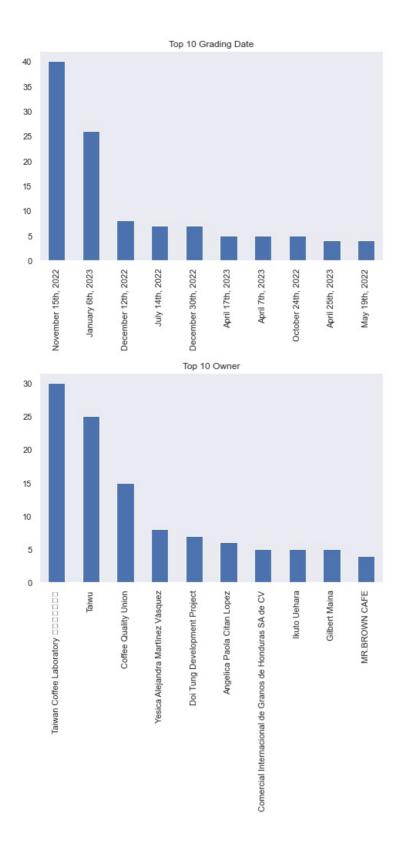


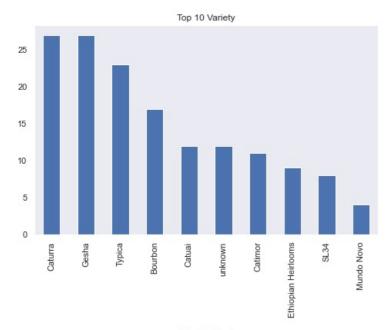


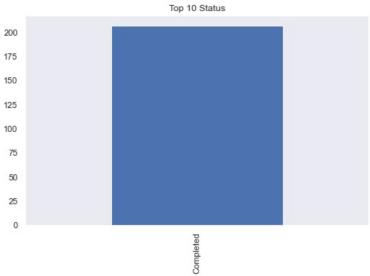


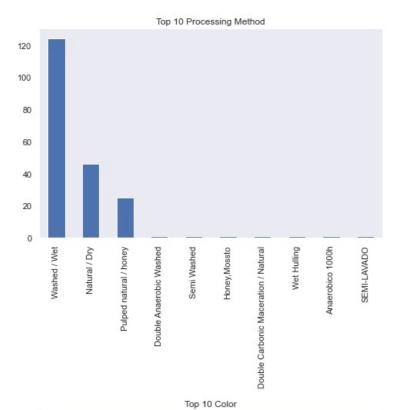
Top 10 Harvest Year

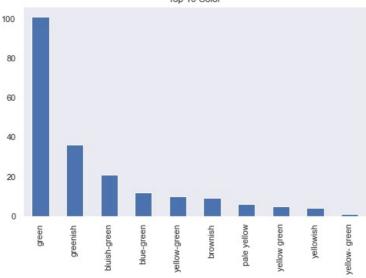


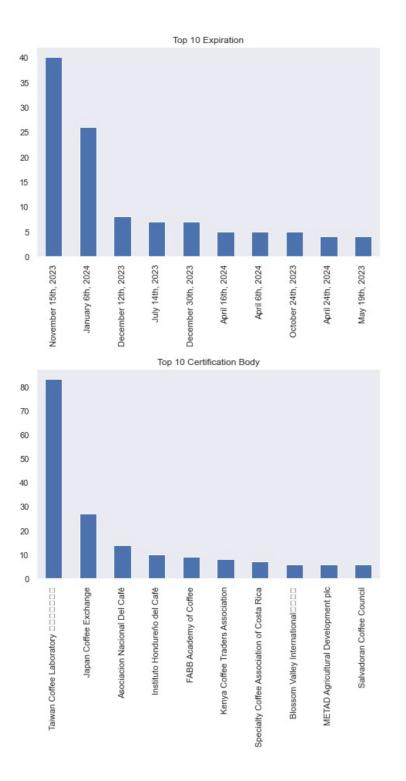


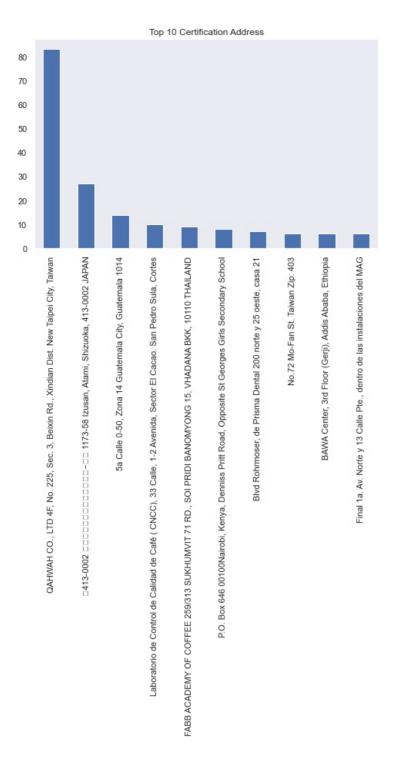


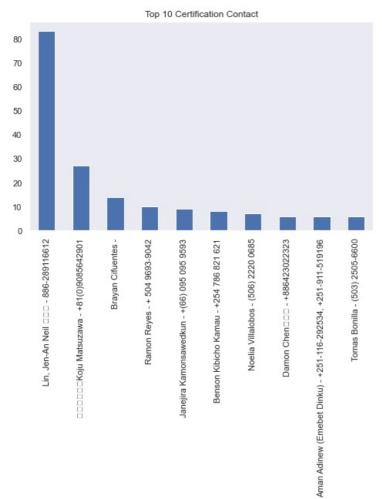












```
In [21]: # company wise count
         df1['Company'].value_counts()#Return a Series containing counts of unique rows in the DataFrame.
         Taiwan Coffee Laboratory
                                          51
Out[21]:
         Taiwu Coffee Cooperative
                                          25
                                          15
         Coffee Quality Union
         Doi Tung Development Project
                                           7
         Peter Schoenfeld, S.A.
                                           6
         Taylor Winch Coffee Ltd
         ECOM COLOMBIA
                                           1
         Exportadora Café California
                                           1
         Coffee Quality Institute
                                           1
         marubeni
         Name: Company, Length: 72, dtype: int64
```

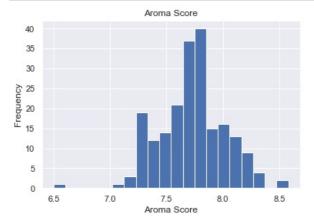
In [65]: # Variety wise count
df1['Variety'].value_counts()#Return a Series containing counts of unique rows in the DataFrame.

```
Out[65]: Caturra
                                                                            27
                                                                            27
         Gesha
         Typica
                                                                            23
         Bourbon
                                                                            17
                                                                            12
         Catuai
         unknown
                                                                            12
         Catimor
                                                                             11
                                                                             9
         Ethiopian Heirlooms
         SL34
                                                                             8
         Mundo Novo
                                                                             4
         SL14
                                                                             3
         Yellow Bourbon
                                                                             3
                                                                             3
         SHG
         Java
                                                                             3
                                                                             2
         Maragogype
                                                                             2
         Parainema
                                                                             2
         Pacamara
         Sarchimor
                                                                             2
         SL28
                                                                             2
         Santander
                                                                             1
         Typica Gesha
         Catucai
                                                                             1
         Yellow Catuai
                                                                             1
         SL28, SL34, Ruiru11
                                                                             1
         Caturra-Catuai
                                                                             1
         Typica Bourbon Caturra Catimor
                                                                             1
         Caturra, Colombia, Castillo
                                                                             1
         Castillo, Caturra, Bourbon
                                                                             1
         unknow
                                                                             1
         Bourbon, Catimor, Caturra, Typica
                                                                             1
         Pacas
                                                                             1
         Gayo
         Castillo
                                                                             1
         Lempira
         Red Bourbon, Caturra
         MARSELLESA, CATUAI, CATURRA & MARSELLESA, ANACAFE 14, CATUAI
                                                                              1
         Typica + SL34
         Catimor, Catuai, Caturra, Bourbon
                                                                             1
         Bourbon Sidra
                                                                             1
         BOURBON, CATURRA Y CATIMOR
                                                                             1
         Jember,TIM-TIM,Ateng
                                                                             1
         Castillo and Colombia blend
                                                                              1
                                                                             1
         Catrenic
         Castillo Paraguaycito
                                                                             1
         Wolishalo, Kurume, Dega
                                                                             1
         Sl34+Gesha
                                                                             1
         Red Bourbon
                                                                              1
         Catuai and Mundo Novo
                                                                             1
         Name: Variety, dtype: int64
In [22]: # color wise count
         df1['Color'].value_counts()#Return a Series containing counts of unique rows in the DataFrame.
Out[22]: green
                           101
         greenish
                            36
         bluish-green
                            21
         blue-green
                            12
         yellow-green
                            10
         brownish
                             9
         pale yellow
                             6
         yellow green
                             5
                             4
         yellowish
         yellow- green
                             1
         browish-green
                             1
         yello-green
         Name: Color, dtype: int64
In [56]: dfl.groupby('Country of Origin')['Country of Origin'].agg('count')
```

#A groupby operation involves some combination of splitting the # object, applying a function, and combining the results.

```
Out[56]: Country of Origin
          Brazil
                                            10
          Colombia
                                            19
          Costa Rica
                                             8
                                             7
          El Salvador
          Ethiopia
                                            11
          Guatemala
                                            21
          Honduras
                                            13
                                             3
2
          Indonesia
          Kenya
                                             3
          Laos
                                             1
          Madagascar
          Mexico
          Myanmar
                                             1
                                             7
          Nicaragua
                                             2
          Panama
          Peru
                                             4
          Taiwan
                                            61
          Tanzania, United Republic Of
                                             6
                                            12
          Thailand
          Uganda
                                             3
                                             5
          United States (Hawaii)
          Vietnam
          Name: Country of Origin, dtype: int64
```

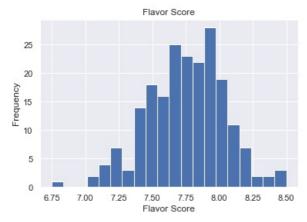
```
In [35]: #Creating a GRAPH to analyze AROMA distribution
ax = df1['Aroma'].plot(kind='hist',bins=20,title= 'Aroma Score')
ax.set_xlabel("Aroma Score")
plt.show()
```



observation

- Aroma score, i.e, between 7.5 to 8.0, has the highest frequency.

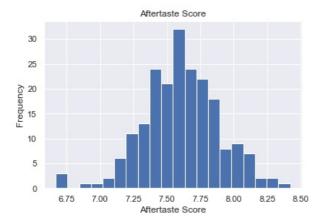
```
In [33]: #Creating a GRAPH to analyze Flavour distribution
ax = df1['Flavor'].plot(kind='hist', bins=20, title= 'Flavor Score')
ax.set_xlabel("Flavor Score")
plt.show()
```



Observation

- Flavor score, i.e, between 7.75 to 8.0, has the highest frequency.

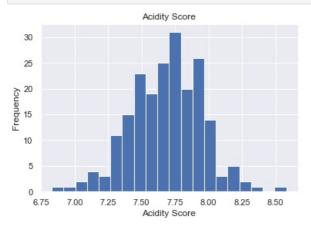
```
In [34]: #Creating a GRAPH to analyze After Taste distribution
ax = df1['Aftertaste'].plot(kind='hist', bins=20, title= 'Aftertaste Score')
ax.set_xlabel("Aftertaste Score")
plt.show()
```



Observation

- Aftertaste score, i.e, between 7.50 to 7.75, has the highest frequency.

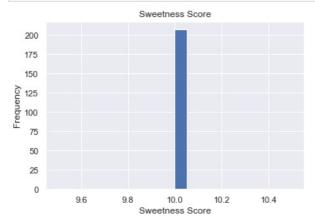
```
In [36]: #Creating a GRAPH to analyze Acidity Analysis distribution
ax = dfl['Acidity'].plot(kind='hist', bins=20, title= 'Acidity Score')
ax.set_xlabel("Acidity Score")
plt.show()
```



Observation

- Acidity score,i.e,between 7.50 to 8.0, has the highest frequency.

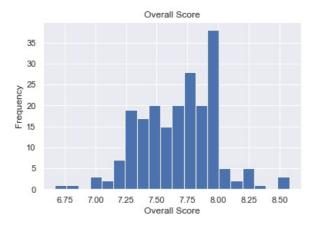
```
In [37]: #Creating a GRAPH to analyze Sweetness Analysis distribution
ax = df1['Sweetness'].plot(kind='hist', bins=20, title= 'Sweetness Score')
ax.set_xlabel("Sweetness Score")
plt.show()
```



Observation

- Sweetness score is 10 for frequency 200+, this signifies all the flavours/coffee has sweetness score 10.

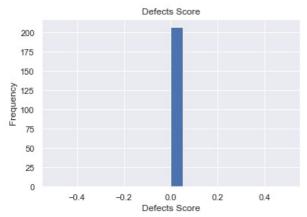
```
In [38]: #Creating a GRAPH to analyze Overall Analysis distribution
ax = df1['Overall'].plot(kind='hist', bins=20, title= 'Overall Score')
ax.set_xlabel("Overall Score")
plt.show()
```



Observation

- Overall score,i.e, between 7.50 to 8.0, has the highest frequency.

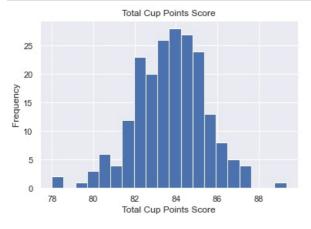
```
In [39]: #Creating a GRAPH to analyze Defects Analysis distribution
ax = df1['Defects'].plot(kind='hist', bins=20, title= 'Defects Score')
ax.set_xlabel("Defects Score")
plt.show()
```



Observation

- Defects score is 0.0 for 200+ frequencies, this signifies all the rows have no defects.

```
In [40]: #Creating a GRAPH to analyze Total Cup Points distribution
ax = df1['Total Cup Points'].plot(kind='hist', bins=20, title= 'Total Cup Points Score')
ax.set_xlabel("Total Cup Points Score")
plt.show()
```



Observation

- Total cup points score, i.e, from 82 to 86, has the highest frequency.

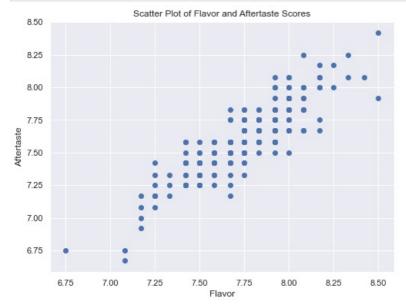
```
In [53]: # Plotting a scatter plot of flavor and aftertaste scores
plt.figure(figsize=(8, 6))

# Plotting the scatter plot
plt.scatter(df1['Flavor'], df1['Aftertaste'])

# Adding labels and title
```

```
plt.xlabel('Flavor')
plt.ylabel('Aftertaste')
plt.title('Scatter Plot of Flavor and Aftertaste Scores')

# Displaying the plot
plt.show()
```



Determining the countries Maximum and the Minimum total cup score
mean_country_cupscore = df1.groupby('Country of Origin')['Total Cup Points'].mean().reset_index().head(10)
mean_country_cupscore.sort_values('Total Cup Points', ascending=False)

Out[47]:		Country of Origin	Total Cup Points				
	4	Ethiopia	84.960909				
	5	Guatemala	84.301429				
	1	Colombia	83.877368				
	2	Costa Rica	83.740000				
	8	Kenya	83.710000				
	7	Indonesia	83.693333				
	9	Laos	83.390000				
	6	Honduras	83.282308				
	0	Brazil	81.883000				
	3	El Salvador	81.532857				

Observations

- -Ethiopia has the highest total cup score with mean score 84.960909.
- -El Salvador has the lowest total cup score with mean score 81.532857.

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