

IMPORTING THE LIBRARIES

```
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
```

READ THE DATASET

```
In [21]: df=pd.read_csv('winquality.csv')
```

DATA ANALYSIS

```
In [22]: df.head()
```

	type	fixed acidity	volatile acidity	citric acid	residual sugar	chlorides	free sulfur dioxide	total sulfur dioxide	density	pH	sulphates	alcohol	quality
0	white	7.0	0.27	0.36	20.7	0.045	45.0	170.0	1.0010	3.00	0.45	8.8	6
1	white	6.3	0.30	0.34	1.6	0.049	14.0	132.0	0.9940	3.30	0.49	9.5	6
2	white	8.1	0.28	0.40	6.9	0.050	30.0	97.0	0.9951	3.26	0.44	10.1	6
3	white	7.2	0.23	0.32	8.5	0.058	47.0	186.0	0.9956	3.19	0.40	9.9	6
4	white	7.2	0.23	0.32	8.5	0.058	47.0	186.0	0.9956	3.19	0.40	9.9	6

```
In [23]: df.tail()
```

	type	fixed acidity	volatile acidity	citric acid	residual sugar	chlorides	free sulfur dioxide	total sulfur dioxide	density	pH	sulphates	alcohol	quality
6482	red	6.2	0.600	0.08	2.0	0.090	32.0	44.0	0.9940	3.45	0.58	10.5	5
6483	red	5.9	0.550	0.10	2.2	0.062	39.0	51.0	0.9952	3.52	NaN	11.2	6
6484	red	6.3	0.510	0.13	2.3	0.076	29.0	40.0	0.99574	3.42	0.75	11.0	6
6485	red	5.9	0.645	0.12	2.0	0.075	32.0	44.0	0.99547	3.57	0.71	10.2	5
6486	red	6.0	0.330	0.47	3.6	0.067	18.0	42.0	0.99549	3.39	0.66	11.0	6

```
In [24]: df.columns
```

```
Index(['type', 'fixed acidity', 'volatile acidity', 'citric acid', 'residual sugar', 'chlorides', 'free sulfur dioxide', 'total sulfur dioxide', 'density', 'pH', 'sulphates', 'alcohol', 'quality'],
      dtype='object')
```

```
In [25]: df.shape
```

```
Out[25]: (6487, 13)
```

```
In [26]: df.describe()
```

	fixed acidity	volatile acidity	citric acid	residual sugar	chlorides	free sulfur dioxide	total sulfur dioxide	density	pH	sulphates	alcohol	quality
count	6487	6487	6487	6487	6487	6487	6487	6487	6487	6487	6487	6487
min	5.25679	0.23000	0.13022	0.44436	0.05050	30.00000	97.00000	1.001000	2.99400	0.280000	8.800000	5.000000
std	1.250790	0.164648	0.145395	4.781625	0.009696	17.744600	56.821865	0.002399	0.160748	0.148814	1.19712	0.873556
min	3.000000	0.080000	0.000000	0.000000	0.000000	1.000000	6.000000	0.987110	2.720000	0.220000	8.000000	3.000000
25%	6.400000	0.230000	0.250000	1.800000	0.038000	17.000000	77.000000	0.992340	3.110000	0.430000	9.500000	5.000000
50%	7.000000	0.200000	0.310000	3.000000	0.050000	20.000000	118.000000	0.994890	3.210000	0.510000	10.300000	6.000000
75%	7.000000	0.400000	0.390000	8.100000	0.065000	41.000000	156.000000	0.996990	3.200000	0.800000	11.300000	6.000000
max	15.000000	1.500000	1.800000	45.000000	0.121000	200.000000	440.000000	1.029960	4.020000	2.000000	14.900000	9.000000

```
In [27]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
RangeIndex: 6487 entries, 0 to 6486
```

```
Data columns (total 13 columns):
```

```
0      type      float64  6487 non-null      object
1  fixed acidity  float64  6487 non-null      float64
2  volatile acidity  float64  6487 non-null      float64
3  citric acid    float64  6487 non-null      float64
4  residual sugar  float64  6487 non-null      float64
5  chlorides      float64  6487 non-null      float64
6  free sulfur dioxide  float64  6487 non-null      float64
7  total sulfur dioxide  float64  6487 non-null      float64
8  density        float64  6487 non-null      float64
9  pH            float64  6487 non-null      float64
10 sulphates     float64  6487 non-null      float64
11 alcohol       float64  6487 non-null      float64
12 quality       int64    6487 non-null      int64
dtypes: float64(12), int64(1), object(1)
```

```
memory usage: 668.6+ KB
```

```
In [28]: df.isnull().sum()
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  0
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[28]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

REPLACING THE NULL VALUES

```
In [29]: df.fillna(method='ffill',inplace=True)
```

```
In [30]: df.isnull().sum()
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  0
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[30]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

DATA VISUALIZATION

MATPLOTLIB

```
In [50]: plt.bar(df['type'],df['fixed acidity'],color='b')
plt.title('BAR CHART')
plt.xlabel('Type')
plt.ylabel('Fixed Acidity')
```

```
Out[50]:
```

```
Text(0, 0.5, 'Fixed Acidity')
```



```
In [52]: plt.scatter(df['type'],df['citric acid'],color='b')
plt.title('SCATTER PLOT')
plt.xlabel('Type')
plt.ylabel('Citric Acid')
```

```
Out[52]:
```

```
Text(0, 0.5, 'Citric Acid')
```



```
In [54]: plt.hist(df['type'])
plt.title('HIST PLOT')
plt.xlabel('Type')
plt.ylabel('Count')
```

```
Out[54]:
```

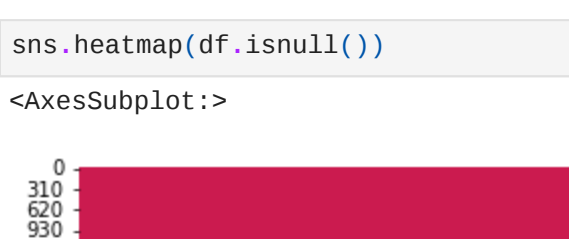
```
Text(0, 0.5, 'Count')
```



SEABORN

```
In [48]: sns.countplot(x='type',data=df)
```

```
Out[48]: <AxesSubplot: xlabel='type', ylabel='count'>
```



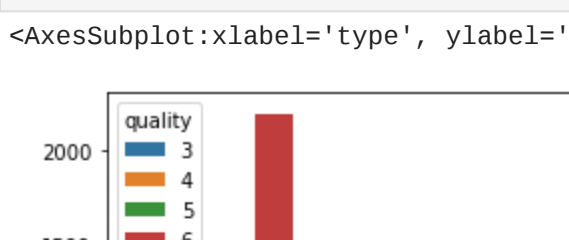
```
In [56]: sns.heatmap(df.isnull())
```

```
Out[56]: <AxesSubplot>
```



```
In [57]: sns.countplot(x='type',hue='Quality',data=df)
```

```
Out[57]: <AxesSubplot: xlabel='type', ylabel='count'>
```



```
In [58]: df.dropna(inplace=True)
```

```
Out[58]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  0
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[58]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
In [61]: df.dropna(inplace=True)
```

```
Out[61]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  0
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[61]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[61]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[61]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[61]:
```

```
type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

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```

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type      0
fixed acidity  0
volatile acidity  0
citric acid    0
residual sugar  2
chlorides      0
free sulfur dioxide  0
total sulfur dioxide  0
density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
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total sulfur dioxide  0
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alcohol       0
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sulphates     4
alcohol       0
quality       0
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pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
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density        0
pH            0
sulphates     4
alcohol       0
quality       0
dtypes: int64
```

```
Out[61]:
```

```
type      0
fixed
```