

▼ Dataset

▼ Loading the Dataset:

```

1 import pandas as pd
2
3 # Read the individual CSV files
4 btc_df = pd.read_csv("https://raw.githubusercontent.com/Amarpreet3/CIND-820-CAPSTONE/main/Dataset/coin_Bitcoin.csv")
5 eth_df = pd.read_csv("https://raw.githubusercontent.com/Amarpreet3/CIND-820-CAPSTONE/main/Dataset/coin_Ethereum.csv")
6 xrp_df = pd.read_csv("https://raw.githubusercontent.com/Amarpreet3/CIND-820-CAPSTONE/main/Dataset/coin_XRP.csv")
7 ltc_df = pd.read_csv("https://raw.githubusercontent.com/Amarpreet3/CIND-820-CAPSTONE/main/Dataset/coin_Litecoin.csv")
8 usdc_df = pd.read_csv("https://raw.githubusercontent.com/Amarpreet3/CIND-820-CAPSTONE/main/Dataset/coin_USDCoin.csv")
9
10 # Concatenate the datasets vertically
11 df = pd.concat([btc_df, eth_df, xrp_df, ltc_df, usdc_df])
12
13 # Save the merged dataset to a new CSV file
14 df.to_csv("cryptocurrency.csv", index=False)
15
16

```

▼ EDA

▼ Loading packages

```

1 import numpy as np
2 import pandas as pd
3 import matplotlib.pyplot as plt
4 from sklearn import preprocessing
5 from sklearn import tree
6 from sklearn.metrics import confusion_matrix
7 from sklearn.model_selection import train_test_split
8 from sklearn.metrics import confusion_matrix, classification_report
9 from sklearn import metrics
10 import seaborn as sns
11 %matplotlib inline

1 import sys
2 !{sys.executable} -m pip install -U pandas-profiling
3 !jupyter nbextension enable --py widgetsnbextension
4 !pip install matplotlib
5 !pip install graphviz

Looking in indexes: https://pypi.org/simple, https://us-python.pkg.dev/colab-wheels/public/simple/
Collecting pandas-profiling
  Downloading pandas_profiling-3.6.6-py2.py3-none-any.whl (324 kB)
    324.4/324.4 kB 5.8 MB/s eta 0:00:00
Collecting ydata-profiling (from pandas-profiling)
  Downloading ydata_profiling-4.2.0-py2.py3-none-any.whl (352 kB)
    352.3/352.3 kB 11.2 MB/s eta 0:00:00
Requirement already satisfied: scipy<1.11,>=1.4.1 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: pandas!=1.4.0,<2,>1.1 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: matplotlib<4,>=3.2 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: pydantic<2,>=1.8.1 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: PyYAML<6.1,>=5.0.0 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: jinja2<3.2,>=2.11.1 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Collecting visions[type_image_path]==0.7.5 (from ydata-profiling->pandas-profiling)
  Downloading visions-0.7.5-py3-none-any.whl (102 kB)
    102.7/102.7 kB 8.3 MB/s eta 0:00:00
Requirement already satisfied: numpy<1.24,>=1.16.0 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Collecting htmlmin==0.1.12 (from ydata-profiling->pandas-profiling)
  Downloading htmlmin-0.1.12.tar.gz (19 kB)
  Preparing metadata (setup.py) ... done
Collecting phik<0.13,>=0.11.1 (from ydata-profiling->pandas-profiling)
  Downloading phik-0.12.3-cp310-cp310-manylinux_2_17_x86_64.manylinux2014_x86_64.whl (679 kB)
    679.5/679.5 kB 20.3 MB/s eta 0:00:00
Requirement already satisfied: requests<3,>=2.24.0 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling)
Requirement already satisfied: tqdm<5,>=4.48.2 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profiling) (<

```

```
Requirement already satisfied: seaborn<0.13,>=0.10.1 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profil)
Collecting multimethod<2,>=1.4 (from ydata-profiling->pandas-profiling)
  Downloading multimethod-1.9.1-py3-none-any.whl (10 kB)
Requirement already satisfied: statsmodels<1,>=0.13.2 in /usr/local/lib/python3.10/dist-packages (from ydata-profiling->pandas-profi)
Collecting typeguard<3,>=2.13.2 (from ydata-profiling->pandas-profiling)
  Downloading typeguard-2.13.3-py3-none-any.whl (17 kB)
Collecting imagehash==4.3.1 (from ydata-profiling->pandas-profiling)
  Downloading ImageHash-4.3.1-py2.py3-none-any.whl (296 kB)
  296.5/296.5 KB 23.9 MB/s eta 0:00:00
Collecting wordcloud>=1.9.1 (from ydata-profiling->pandas-profiling)
  Downloading wordcloud-1.9.2-cp310-cp310-manylinux_2_17_x86_64.manylinux2014_x86_64.whl (455 kB)
  455.4/455.4 KB 28.0 MB/s eta 0:00:00
Collecting dacite>=1.8 (from ydata-profiling->pandas-profiling)
  Downloading dacite-1.8.1-py3-none-any.whl (14 kB)
Requirement already satisfied: PyWavelets in /usr/local/lib/python3.10/dist-packages (from imagehash==4.3.1->ydata-profiling->pandas)
Requirement already satisfied: pillow in /usr/local/lib/python3.10/dist-packages (from imagehash==4.3.1->ydata-profiling->pandas-pro)
Requirement already satisfied: attrs>=19.3.0 in /usr/local/lib/python3.10/dist-packages (from visions[type_image_path]==0.7.5->ydata)
Requirement already satisfied: networkx>=2.4 in /usr/local/lib/python3.10/dist-packages (from visions[type_image_path]==0.7.5->ydata)
Collecting tangled-up-in-unicode>=0.0.4 (from visions[type_image_path]==0.7.5->ydata-profiling->pandas-profiling)
  Downloading tangled_up_in_unicode-0.2.0-py3-none-any.whl (4.7 MB)
  4.7/4.7 MB 39.9 MB/s eta 0:00:00
Requirement already satisfied: MarkupSafe>=2.0 in /usr/local/lib/python3.10/dist-packages (from jinja2<3.2,>=2.11.1->ydata-profiling)
Requirement already satisfied: contourpy>=1.0.1 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling)
Requirement already satisfied: cycler>=0.10 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling->pa)
Requirement already satisfied: fonttools>=4.22.0 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling)
Requirement already satisfied: kiwisolver>=1.0.1 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling)
Requirement already satisfied: packaging>=20.0 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling)
Requirement already satisfied: pyparsing>=2.3.1 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profiling)
Requirement already satisfied: python-dateutil>=2.7 in /usr/local/lib/python3.10/dist-packages (from matplotlib<4,>=3.2->ydata-profi)
Requirement already satisfied: pytz>=2020.1 in /usr/local/lib/python3.10/dist-packages (from pandas!=1.4.0,<2,>1.1->ydata-profiling)
Requirement already satisfied: joblib>=0.14.1 in /usr/local/lib/python3.10/dist-packages (from phik<0.13,>=0.11.1->ydata-profiling->
Requirement already satisfied: typing-extensions>=4.2.0 in /usr/local/lib/python3.10/dist-packages (from pydantic<2,>=1.8.1->ydata-p
```

▼ Data Description

```
1 print(type(df))

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

```
1 df.head()
```

SNo	Name	Symbol	Date	High	Low	Open	Close	Volume	Marketcap
0	1	Bitcoin	BTC	2013-04-29 23:59:59	147.488007	134.000000	134.440000	144.539993	0.0 1.603769e+09
1	2	Bitcoin	BTC	2013-04-30 23:59:59	146.929993	134.050003	144.000000	139.000000	0.0 1.542813e+09
2	3	Bitcoin	BTC	2013-05-01 23:59:59	139.889999	107.720001	139.000000	116.989998	0.0 1.298955e+09
3	4	Bitcoin	BTC	2013-05-02 23:59:59	125.599998	92.281898	116.379997	105.209999	0.0 1.168517e+09
4	5	Bitcoin	BTC	2013-05-03 23:59:59	108.127998	79.099998	106.250000	97.750000	0.0 1.085995e+09

```
1 df.tail()
```

SNo	Name	Symbol	Date	High	Low	Open	Close	Volume	Marketcap
997	998	USD Coin	USDC	2021-07-02 23:59:59	1.000916	0.999966	1.000177	1.000035	1.787896e+09 2.539775e+10
998	999	USD Coin	USDC	2021-07-03 23:59:59	1.000670	0.999925	1.000048	0.999984	1.491017e+09 2.550437e+10
999	1000	USD Coin	USDC	2021-07-04 23:59:59	1.000187	0.998901	0.999956	0.999500	1.578667e+09 2.551172e+10
1000	1001	USD Coin	USDC	2021-07-05 23:59:59	1.000839	0.999459	0.9999565	1.000528	1.887496e+09 2.554724e+10
1001	1002	USD Coin	USDC	2021-07-06 23:59:59	1.000731	0.999662	1.000501	1.000059	2.312602e+09 2.567322e+10

```
1 df.Name.unique()
```

```
array(['Bitcoin', 'Ethereum', 'XRP', 'Litecoin', 'USD Coin'], dtype=object)
```

```
1 df.Symbol.unique()
```

```
array(['BTC', 'ETH', 'XRP', 'LTC', 'USDC'], dtype=object)
```

```
1 df.columns  
  
Index(['SNo', 'Name', 'Symbol', 'Date', 'High', 'Low', 'Open', 'Close',  
       'Volume', 'Marketcap'],  
      dtype='object')  
  
1 df[['Name', 'Symbol']].value_counts()  
  
Name      Symbol  
Bitcoin    BTC      2991  
Litecoin   LTC      2991  
XRP        XRP      2893  
Ethereum   ETH      2160  
USD Coin   USDC     1002  
dtype: int64  
  
1 df['Name'].value_counts()  
  
Bitcoin    2991  
Litecoin   2991  
XRP        2893  
Ethereum   2160  
USD Coin   1002  
Name: Name, dtype: int64  
  
1 import matplotlib.pyplot as plt  
2  
3 counts = df[['Name', 'Symbol']].value_counts()  
4  
5 # Plotting the bar chart  
6 plt.figure(figsize=(12, 6))  
7 ax = counts.plot(kind='bar')  
8 plt.xlabel('Name, Symbol')  
9 plt.ylabel('Count')  
10 plt.title('Count of Unique Name, Symbol Combinations')  
11 plt.xticks(rotation=90)  
12  
13 # Labeling the height on top of each bar  
14 for p in ax.patches:  
15     ax.annotate(str(p.get_height()), (p.get_x() + p.get_width() / 2, p.get_height()), ha='center', va='bottom')  
16  
17 plt.show()  
18
```

Count of Unique Name, Symbol Combinations

```

1
2 print(df.dtypes)

SNo      int64
Name     object
Symbol   object
Date     object
High    float64
Low     float64
Open    float64
Close   float64
Volume  float64
Marketcap float64
dtype: object

```

```

1
2 # Get the shape of the merged dataset
3 rows, columns = df.shape
4 print("Number of rows:", rows)
5 print("Number of columns:", columns)

```

Number of rows: 12037
Number of columns: 10

```

1 # Displaying the summary information
2 summary = df.info()
3 print(summary)
4

<class 'pandas.core.frame.DataFrame'>
Int64Index: 12037 entries, 0 to 1001
Data columns (total 10 columns):
 #   Column      Non-Null Count  Dtype  
---  --  
 0   SNo         12037 non-null   int64  
 1   Name        12037 non-null   object  
 2   Symbol      12037 non-null   object  
 3   Date        12037 non-null   object  
 4   High        12037 non-null   float64 
 5   Low         12037 non-null   float64 
 6   Open        12037 non-null   float64 
 7   Close       12037 non-null   float64 
 8   Volume      12037 non-null   float64 
 9   Marketcap   12037 non-null   float64 
dtypes: float64(6), int64(1), object(3)
memory usage: 1.0+ MB
None

```

```

1 # Let's see meta information about numeric data, we can also see if there any extreme values
2 df.describe()

```

	SNo	High	Low	Open	Close	Volume	Marketcap
count	12037.000000	12037.000000	12037.000000	12037.000000	12037.000000	1.203700e+04	1.203700e+04
mean	1326.877627	1797.247945	1689.071077	1745.961716	1748.923766	4.652802e+09	4.082986e+10
std	836.777590	6507.990175	6085.346811	6312.961050	6319.601286	1.141572e+10	1.194340e+11
min	1.000000	0.003082	0.002802	0.002809	0.002810	0.000000e+00	0.000000e+00
25%	602.000000	1.000692	0.990570	0.999090	0.999228	5.895540e+06	3.682208e+08
50%	1255.000000	33.345750	30.523111	32.016525	32.001958	3.204215e+08	5.655924e+09
75%	2007.000000	372.767424	350.941986	360.312012	361.045990	3.146472e+09	2.090613e+10
max	2991.000000	64863.098908	62208.964366	63523.754869	63503.457930	3.509679e+11	1.186364e+12

```
1 df.describe().transpose()
```

	count	mean	std	min	25%	50%	75%	max
SNo	12037.0	1.326878e+03	8.367776e+02	1.000000	6.020000e+02	1.255000e+03	2.007000e+03	2.991000e+03
High	12037.0	1.797248e+03	6.507990e+03	0.003082	1.000692e+00	3.334575e+01	3.727674e+02	6.486310e+04
Low	12037.0	1.689071e+03	6.085347e+03	0.002802	9.905703e-01	3.052311e+01	3.509420e+02	6.220896e+04
Open	12037.0	1.745962e+03	6.312961e+03	0.002809	9.990903e-01	3.201653e+01	3.603120e+02	6.352375e+04

```

1
2 # Convert the 'Date' column to datetime
3 df['Date'] = pd.to_datetime(df['Date'])
4
5 # Group the data by each coin
6 grouped_df = df.groupby('Symbol')
7
8 # Calculate the date duration for each coin and description
9 for symbol, group in grouped_df:
10    min_date = group['Date'].min()
11    max_date = group['Date'].max()
12    duration = max_date - min_date
13
14    print("Coin:", symbol)
15    print("Start Date:", min_date)
16    print("End Date:", max_date)
17    print("Date Duration:", duration)
18    print(group.describe().transpose())
19    print()
20

```

Coin: BTC
 Start Date: 2013-04-29 23:59:59
 End Date: 2021-07-06 23:59:59
 Date Duration: 2990 days 00:00:00

	count	mean	std	min	25%	50%	75%	max
SNo	2991.0	1.496000e+03	8.635717e+02	1.000000e+00	7.485000e+02			
High	2991.0	6.893326e+03	1.164283e+04	7.456110e+01	4.361790e+02			
Low	2991.0	6.486010e+03	1.086903e+04	6.552600e+01	4.228795e+02			
Open	2991.0	6.700146e+03	1.128804e+04	6.850500e+01	4.304455e+02			
Close	2991.0	6.711290e+03	1.129814e+04	6.843100e+01	4.305695e+02			
Volume	2991.0	1.090633e+10	1.888895e+10	0.000000e+00	3.036725e+07			
Marketcap	2991.0	1.208761e+11	2.109438e+11	7.784112e+08	6.305579e+09			

	50%	75%	max
SNo	1.496000e+03	2.243500e+03	2.991000e+03
High	2.387610e+03	8.733927e+03	6.486310e+04
Low	2.178500e+03	8.289800e+03	6.220896e+04
Open	2.269890e+03	8.569656e+03	6.352375e+04
Close	2.286410e+03	8.576239e+03	6.350346e+04
Volume	9.460360e+08	1.592015e+10	3.509679e+11
Marketcap	3.741503e+10	1.499957e+11	1.186364e+12

Coin: ETH
 Start Date: 2015-08-08 23:59:59
 End Date: 2021-07-06 23:59:59
 Date Duration: 2159 days 00:00:00

	count	mean	std	min	25%	50%	75%	max
SNo	2160.0	1.088500e+03	6.236826e+02	1.000000e+00	5.407500e+02			
High	2160.0	3.982586e+02	6.280823e+02	4.829880e-01	1.426522e+01			
Low	2160.0	3.655926e+02	5.666115e+02	4.208970e-01	1.319095e+01			
Open	2160.0	3.828799e+02	5.997199e+02	4.315890e-01	1.375760e+01			
Close	2160.0	3.839107e+02	6.010788e+02	4.348290e-01	1.381920e+01			
Volume	2160.0	7.057058e+09	1.064526e+10	1.021280e+05	3.825102e+07			
Marketcap	2160.0	4.172084e+10	6.909184e+10	3.221363e+07	1.135576e+09			

	50%	75%	max
SNo	1.080500e+03	1.620250e+03	2.160000e+03
High	2.051246e+02	3.964946e+02	4.362351e+03
Low	1.933027e+02	3.751468e+02	3.785849e+03
Open	1.984251e+02	3.862649e+02	4.174636e+03
Close	1.986437e+02	3.864353e+02	4.168701e+03
Volume	2.148880e+09	9.629136e+09	8.448291e+10
Marketcap	2.070063e+10	4.231010e+10	4.828819e+11

Coin: LTC
 Start Date: 2013-04-29 23:59:59
 End Date: 2021-07-06 23:59:59
 Date Duration: 2990 days 00:00:00

	count	mean	std	min	25%	50%	75%	max
SNo	2991.0	1.496000e+03	8.635717e+02	1.000000e+00	7.485000e+02			
High	2991.0	5.134440e+01	6.657230e+01	1.344810e+00	3.841130e+00			

```

Low      2991.0  4.693123e+01  5.947442e+01  1.113740e+00  3.730025e+00
Open     2991.0  4.924736e+01  6.325627e+01  1.153240e+00  3.792325e+00
Close    2991.0  4.927901e+01  6.324046e+01  1.157010e+00  3.794135e+00
Volume   2991.0  1.284851e+09  2.247871e+09  0.000000e+00  2.242845e+06
Marketcap 2991.0  2.934139e+09  3.964279e+09  3.789242e+07  1.614311e+08

      50%           75%           max

```

▼ Analysing Null/NAN values

```
1 df.isnull().sum()
```

```

SNo      0
Name     0
Symbol   0
Date     0
High     0
Low      0
Open     0
Close    0
Volume   0
Marketcap 0
dtype: int64

```

```
1 df.isnull().count()
```

```

SNo      12037
Name     12037
Symbol   12037
Date     12037
High     12037
Low      12037
Open     12037
Close    12037
Volume   12037
Marketcap 12037
dtype: int64

```

▼ Statistics Summary

```

1 # Display summary statistics of numeric columns
2 numeric_columns = df.select_dtypes(include=[int, float])
3 summary_statistics = numeric_columns.describe()
4 print("Summary Statistics:")
5 print(summary_statistics)

```

```

Summary Statistics:
      SNo      High       Low      Open      Close \
count  12037.000000  12037.000000  12037.000000  12037.000000  12037.000000
mean   1326.877627  1797.247945  1689.071077  1745.961716  1748.923766
std    836.777590  6507.990175  6085.346811  6312.961050  6319.601286
min    1.000000     0.003082     0.002802     0.002809     0.002810
25%   602.000000    1.000692     0.990570     0.999090     0.999228
50%   1255.000000    33.345750    30.523111    32.016525    32.001958
75%   2007.000000   372.767424   350.941986   360.312012   361.045990
max   2991.000000   64863.098908  62208.964366  63523.754869  63503.457930

      Volume      Marketcap
count  1.203700e+04  1.203700e+04
mean   4.652802e+09  4.082986e+10
std    1.141572e+10  1.194340e+11
min    0.000000e+00  0.000000e+00
25%   5.895540e+06  3.682208e+08
50%   3.204215e+08  5.655924e+09
75%   3.146472e+09  2.090613e+10
max   3.509679e+11  1.186364e+12

```

▼ Categorical to One-Hot (numeric) Encoding

```

1 #Let's create a list for our categorical columns
2 #cat_cols=["Name", "Symbol", "Date"]

```

```

1 # Create a copy of the data frame in memory with a different name
2 #df_onehot=df.copy()
3 #convert only categorical variables/features to dummy/one-hot features
4 #df_onehot = pd.get_dummies(df, columns=cat_cols, prefix = cat_cols)
5 #print the dataset
6 #df_onehot

```

▼ Pandas Profiling

```

1 from pandas_profiling import ProfileReport
2 profile = ProfileReport(df)

<ipython-input-24-ce1e41813c97>:1: DeprecationWarning: 'import pandas_profiling' is going to be deprecated by April 1st. Please use `im
from pandas_profiling import ProfileReport

1 profile.to_notebook_iframe()

Summarize dataset: 100%                                     68/68 [00:26<00:00, 1.80it/s, Completed]
Generate report structure: 100%                           1/1 [00:13<00:00, 13.66s/it]
Render HTML: 100%                                         1/1 [00:03<00:00, 3.41s/it]

```

Overview

Dataset statistics

Number of variables	10
Number of observations	12037
Missing cells	0
Missing cells (%)	0.0%
Duplicate rows	0
Duplicate rows (%)	0.0%
Total size in memory	1.3 MiB
Average record size in memory	110.0 B

Variable types

Numeric	7
Categorical	2
DateTime	1

Alerts

Volume has 628 (5.2%) zeros

Zeros

Reproduction

Analysis started	2023-06-07 12:53:12.684952
Analysis finished	2023-06-07 12:53:39.580828

▼ Visualizing the Data

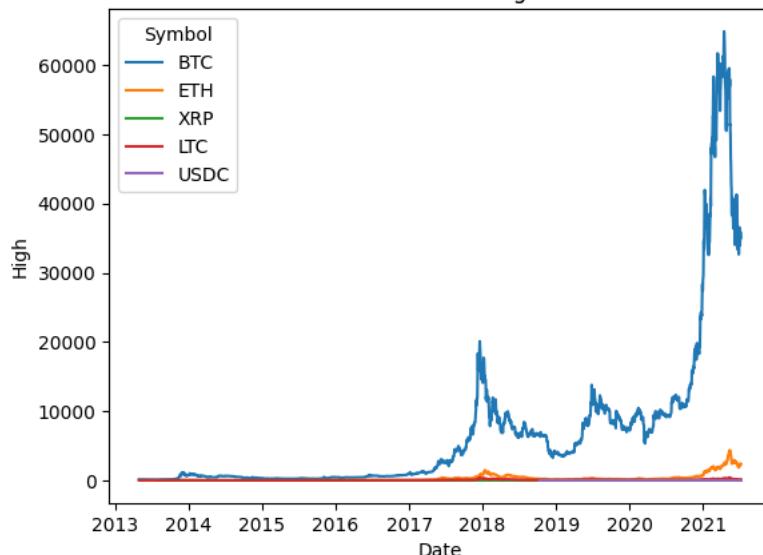
```
1 import pandas as pd
2 import matplotlib.pyplot as plt
3 import seaborn as sns

1 #DataFrame copied to keep the original unaltered
2 df_visual = df.copy()
```

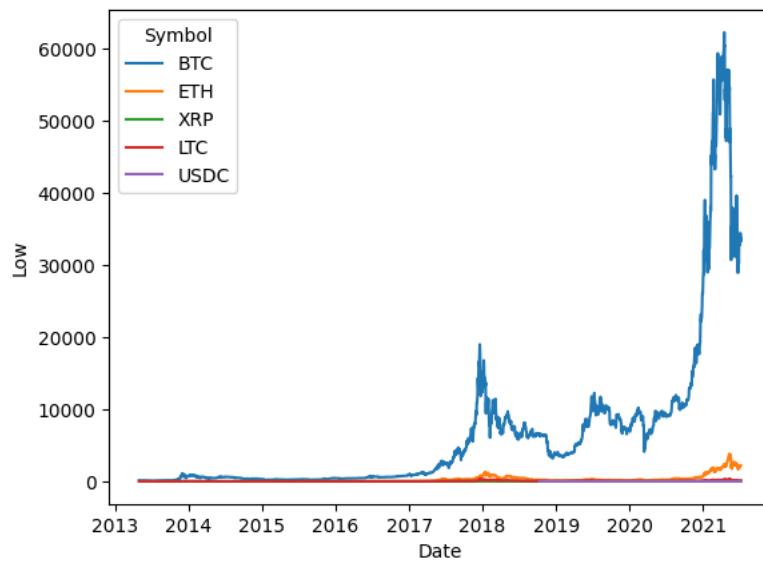
▼ Visualizing each attribute for selected coins - Line graph

```
1
2 # List of columns to visualize
3 columns_to_visualize = ['High', 'Low', 'Open', 'Close', 'Volume', 'Marketcap']
4
5 # Loop through each column
6 for column in columns_to_visualize:
7     # Set up the plot for the current column
8     sns.lineplot(data=df_visual, x='Date', y=column, hue='Symbol')
9
10    # Add title and labels
11    plt.title(f'Time Series - {column}')
12    plt.xlabel('Date')
13    plt.ylabel(column)
14
15    # Display the plot
16    plt.show()
17
```

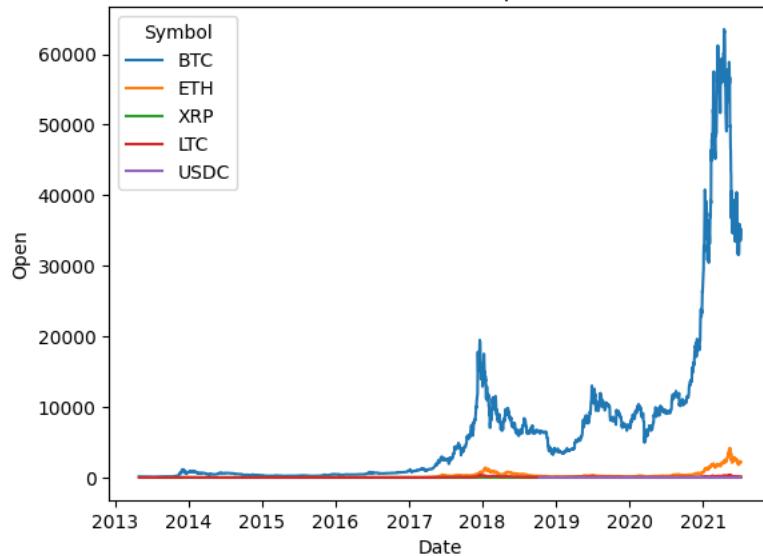
Time Series - High



Time Series - Low

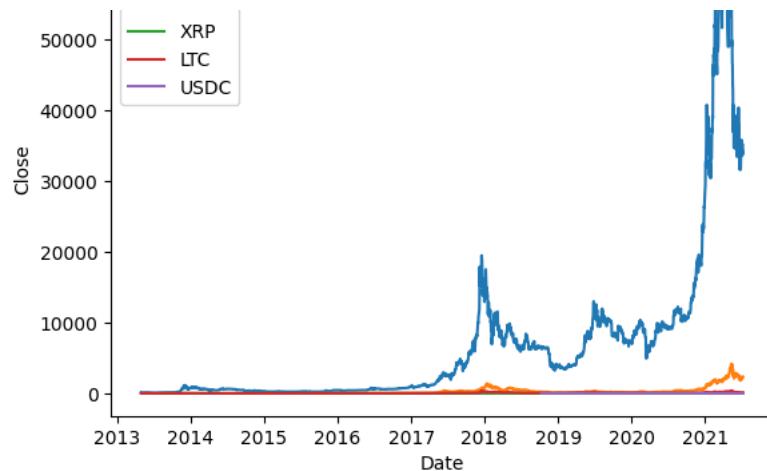


Time Series - Open



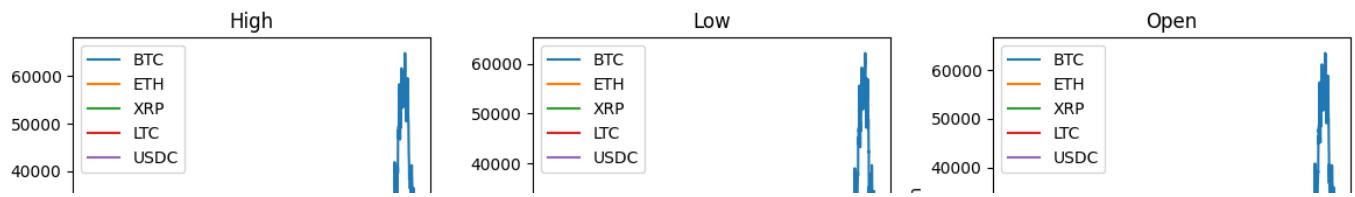
Time Series - Close





Time Series - Volume

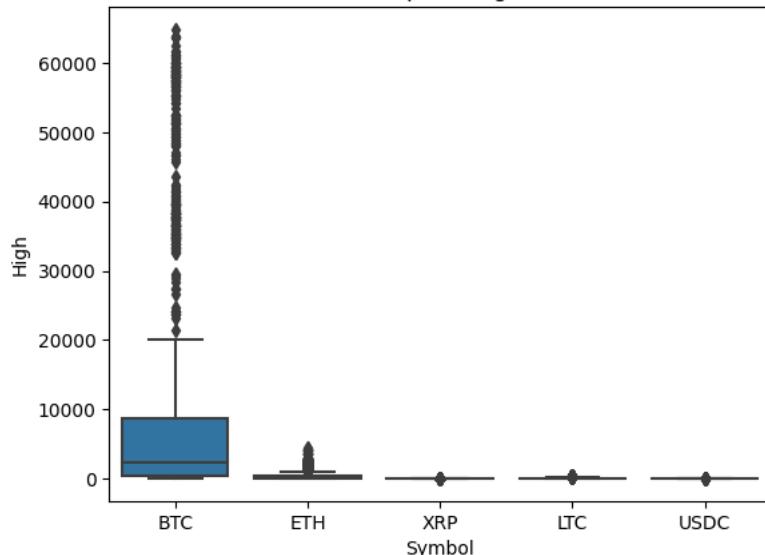
```
1 # Create a list of unique symbols
2 symbols = df_visual['Symbol'].unique()
3
4 # Plot the data for each column in a 2x3 grid
5 fig, axs = plt.subplots(2, 3, figsize=(12, 8))
6 for i, column in enumerate(columns_to_visualize):
7     row, col = i // 3, i % 3
8
9     for symbol in symbols:
10         data = df_visual[df_visual['Symbol'] == symbol]
11         axs[row, col].plot(data['Date'], data[column], label=symbol)
12
13     axs[row, col].set_title(column)
14     axs[row, col].set_xlabel('Date')
15     axs[row, col].set_ylabel(column)
16     axs[row, col].legend()
17     axs[row, col].tick_params(axis='x', rotation=45)
18
19 plt.tight_layout()
20 plt.show()
21
```



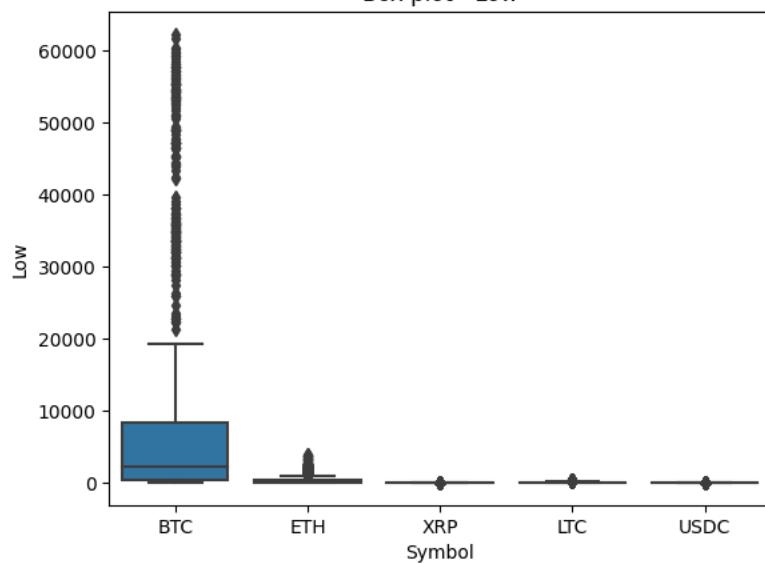
▼ Visualizing each attribute for selected coins - Box Plot

```
1
2 # Loop through each column
3 for column in columns_to_visualize:
4     # Set up the boxplot for the current column
5     sns.boxplot(x='Symbol', y=column, data=df_visual)
6
7     # Add title and labels
8     plt.title(f'Box plot - {column}')
9     plt.xlabel('Symbol')
10    plt.ylabel(column)
11
12    # Display the plot
13    plt.show()
14
```

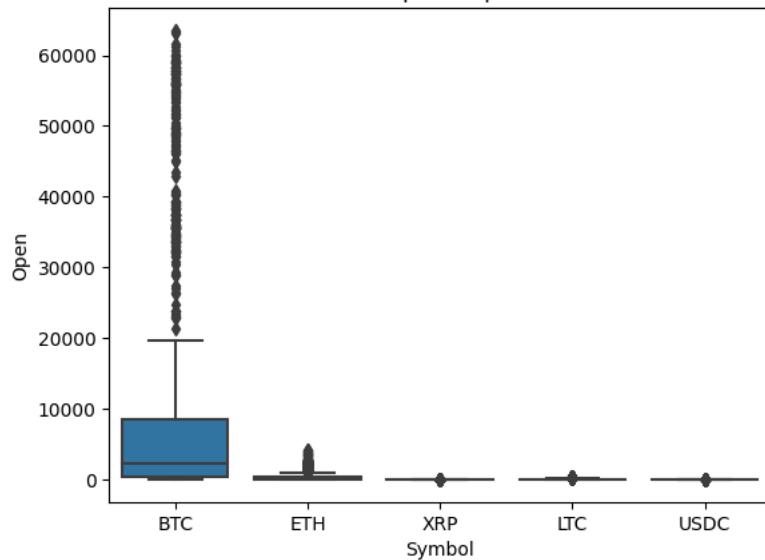
Box plot - High



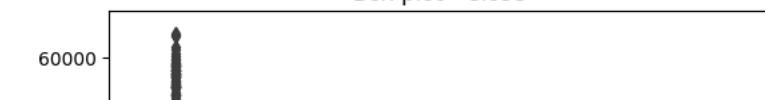
Box plot - Low

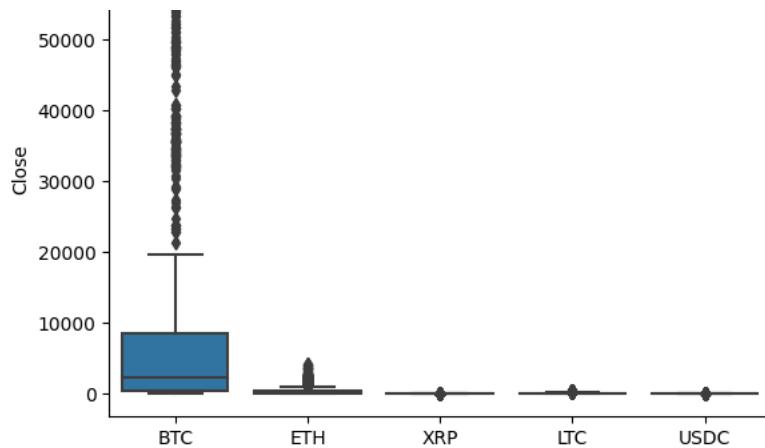


Box plot - Open

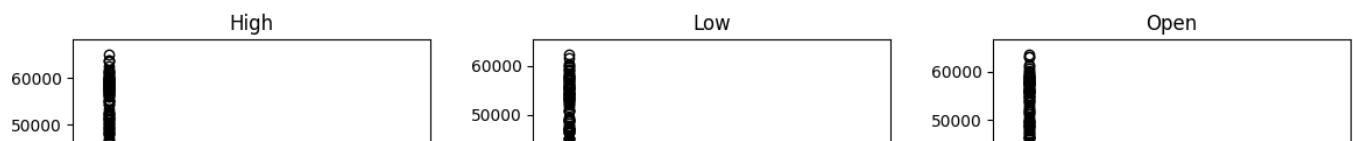


Box plot - Close





```
1 # Create a list of unique symbols
2 symbols = df_visual['Symbol'].unique()
3
4 # Plot the data for each column in a 2x3 grid
5 fig, axs = plt.subplots(2, 3, figsize=(12, 8))
6 for i, column in enumerate(columns_to_visualize):
7     row, col = i // 3, i % 3
8
9     data_to_plot = []
10    for symbol in symbols:
11        data = df_visual[df_visual['Symbol'] == symbol][column]
12        data_to_plot.append(data)
13
14    axs[row, col].boxplot(data_to_plot, labels=symbols)
15    axs[row, col].set_title(column)
16    axs[row, col].set_xlabel('Symbol')
17    axs[row, col].set_ylabel(column)
18    axs[row, col].tick_params(axis='x', rotation=45)
19
20 plt.tight_layout()
21 plt.show()
22
```



▼ Skewness Analysis

```

1 import pandas as pd
2
3 # Calculate skewness for each coin and column
4 skewness = df_visual.groupby('Symbol')[columns_to_visualize].skew()
5
6 # Display the skewness
7 print("Skewness:")
8 print(skewness)
9

Skewness:
      High      Low      Open      Close      Volume  Marketcap
Symbol
BTC    3.012925  3.033504  3.025191  3.018634  3.742112  3.071752
ETH    2.982709  2.931693  2.959628  2.948667  2.442103  3.099590
LTC    2.020982  1.907707  1.971091  1.966783  2.610141  2.021090
USDC   2.360479  -1.784938  1.459959  1.498858  2.496024  2.667453
XRP    3.405164  3.012947  3.168133  3.158788  5.141658  2.928928

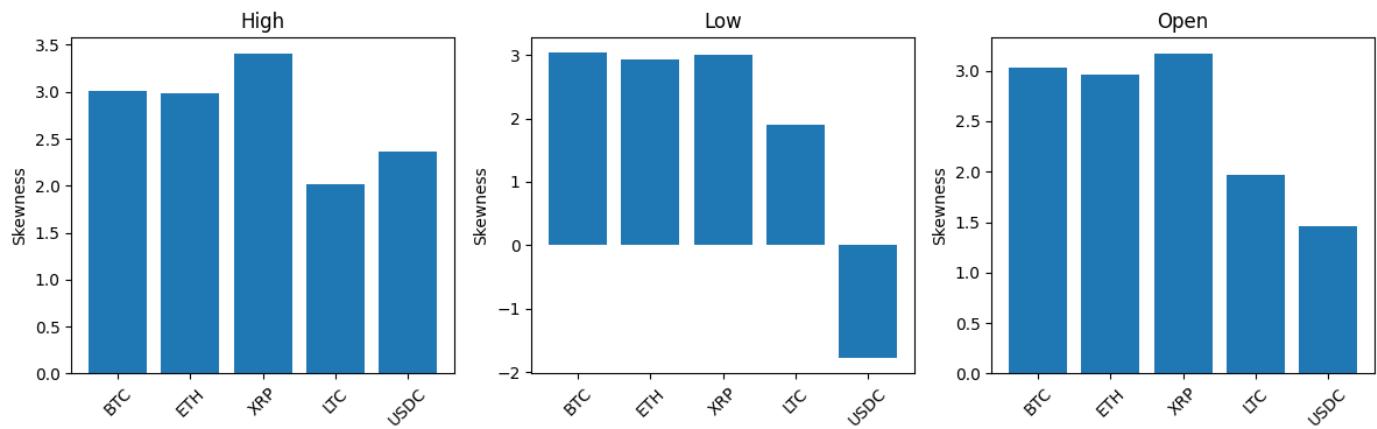
```

20000 | | . . | | 0.4 | |

```

1 # Create a list of unique symbols
2 symbols = df_visual['Symbol'].unique()
3
4 # Plot the skewness for each column in a 2x3 grid
5 fig, axs = plt.subplots(2, 3, figsize=(12, 8))
6 for i, column in enumerate(columns_to_visualize):
7     row, col = i // 3, i % 3
8
9     # Get the skewness for each coin
10    skewness_values = []
11    for symbol in symbols:
12        data = df_visual[df_visual['Symbol'] == symbol][column]
13        skewness_value = data.skew()
14        skewness_values.append(skewness_value)
15
16    axs[row, col].bar(symbols, skewness_values)
17    axs[row, col].set_title(column)
18    axs[row, col].set_xlabel('Symbol')
19    axs[row, col].set_ylabel('Skewness')
20    axs[row, col].tick_params(axis='x', rotation=45)
21
22 plt.tight_layout()
23 plt.show()
24

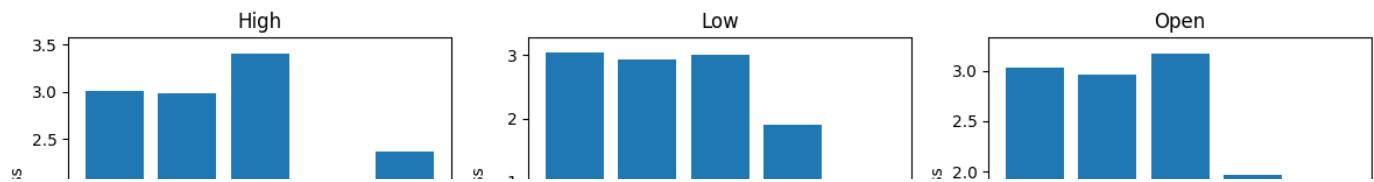
```



```

1 df_visual = df.copy() # Create a copy of the DataFrame
2 # Create a list of unique symbols
3 symbols = df_visual['Symbol'].unique()
4
5 # Plot the skewness for each column in a 2x3 grid
6 fig, axs = plt.subplots(2, 3, figsize=(12, 8))
7 for i, column in enumerate(columns_to_visualize):
8     row, col = i // 3, i % 3
9
10    # Get the skewness for each coin
11    skewness_values = []
12    for symbol in symbols:
13        data = df_visual[df_visual['Symbol'] == symbol][column]
14        skewness_value = data.skew()
15        skewness_values.append(skewness_value)
16
17    axs[row, col].bar(symbols, skewness_values)
18    axs[row, col].set_title(column)
19    axs[row, col].set_xlabel('Symbol')
20    axs[row, col].set_ylabel('Skewness')
21    axs[row, col].tick_params(axis='x', rotation=45)
22
23 plt.tight_layout()
24 plt.show()
25
26

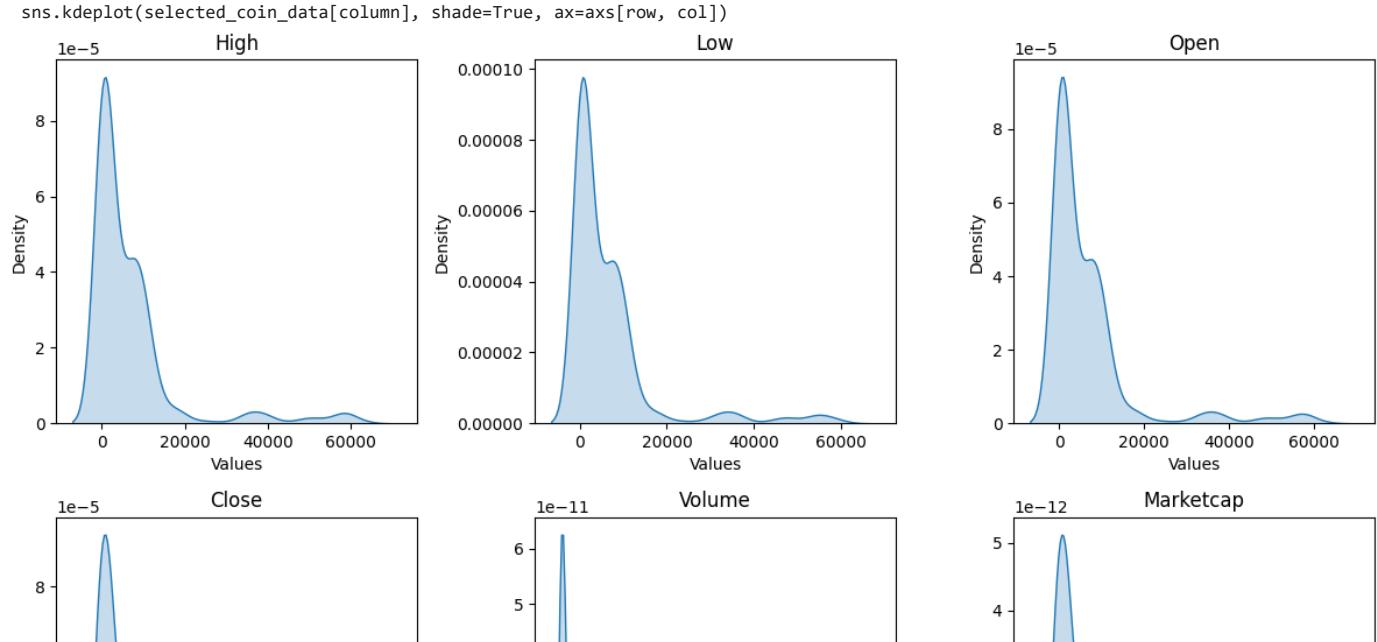
```



```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3
4 # Create a list of unique symbols
5 symbols = df_visual['Symbol'].unique()
6
7 # Set up the plot grid
8 fig, axs = plt.subplots(2, len(columns_to_visualize), figsize=(16, 8))
9
10 # Loop through each column
11 for i, column in enumerate(columns_to_visualize):
12     # Plot density for the current column
13     for j, symbol in enumerate(symbols):
14         data = df_visual[df_visual['Symbol'] == symbol][column]
15         sns.kdeplot(data, shade=True, ax=axs[j // len(columns_to_visualize), i], color='darkblue')
16
17     # Add title and labels for density plot
18     axs[0, i].set_title(f'Density Plot - {column}')
19     axs[0, i].set_xlabel(column)
20     axs[0, i].set_ylabel('Density')
21     axs[0, i].legend(symbols)
22
23     # Calculate and plot skewness
24     skewness_values = []
25     for symbol in symbols:
26         data = df_visual[df_visual['Symbol'] == symbol][column]
27         skewness_value = data.skew()
28         skewness_values.append(skewness_value)
29
30     # Plot skewness
31     axs[1, i].bar(symbols, skewness_values)
32     axs[1, i].set_title(f'Skewness - {column}')
33     axs[1, i].set_xlabel('Symbol')
34     axs[1, i].set_ylabel('Skewness')
35     axs[1, i].tick_params(axis='x', rotation=45)
36
37 # Adjust the layout and spacing
38 plt.tight_layout()
39
40 # Show the plots
41 plt.show()
42
```

```
<ipython-input-35-0d6c1c6765d4>:15: FutureWarning:  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(data, shade=True, ax=axs[j // len(columns_to_visualize), i], color='darkblue')  
<ipython-input-35-0d6c1c6765d4>:15: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(data, shade=True, ax=axs[j // len(columns_to_visualize), i], color='darkblue')  
<ipython-input-35-0d6c1c6765d4>:15: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(data, shade=True, ax=axs[j // len(columns_to_visualize), i], color='darkblue')  
<ipython-input-35-0d6c1c6765d4>:15: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(data, shade=True, ax=axs[j // len(columns_to_visualize), i], color='darkblue')  
<ipython-input-35-0d6c1c6765d4>:15: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
1 import seaborn as sns  
2 import matplotlib.pyplot as plt  
3  
4 # Choose the coin for analysis  
5 selected_coin = 'BTC'  
6  
7 # Filter the data for the selected coin  
8 selected_coin_data = df_visual[df_visual['Symbol'] == selected_coin]  
9  
10 # Set up the plot grid  
11 fig, axs = plt.subplots(2, 3, figsize=(12, 8))  
12  
13 # Loop through each column  
14 for i, column in enumerate(columns_to_visualize):  
15     row, col = i // 3, i % 3  
16  
17     # Plot density for the current column  
18     sns.kdeplot(selected_coin_data[column], shade=True, ax=axs[row, col])  
19  
20     # Add title and labels  
21     axs[row, col].set_title(column)  
22     axs[row, col].set_xlabel('Values')  
23     axs[row, col].set_ylabel('Density')  
24  
25 # Adjust the layout  
26 plt.tight_layout()  
27  
28 # Show the plot  
29 plt.show()  
30
```

```
<ipython-input-36-43bc8c5ac3a4>:18: FutureWarning:  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(selected_coin_data[column], shade=True, ax=axs[row, col])  
<ipython-input-36-43bc8c5ac3a4>:18: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(selected_coin_data[column], shade=True, ax=axs[row, col])  
<ipython-input-36-43bc8c5ac3a4>:18: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(selected_coin_data[column], shade=True, ax=axs[row, col])  
<ipython-input-36-43bc8c5ac3a4>:18: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(selected_coin_data[column], shade=True, ax=axs[row, col])  
<ipython-input-36-43bc8c5ac3a4>:18: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.
```



Skewness of each coin for each attribute

```
1 import seaborn as sns  
2 import matplotlib.pyplot as plt  
3  
4 # List of coins to analyze  
5 coins = df_visual['Symbol'].unique()  
6  
7 # Set up the plot grid  
8 fig, axs = plt.subplots(len(coins), len(columns_to_visualize), figsize=(12, 8))  
9  
10 # Define a list of colors for the density plots  
11 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']  
12  
13 # Loop through each coin  
14 for i, coin in enumerate(coins):  
15     coin_data = df_visual[df_visual['Symbol'] == coin]
```

```
16
17     # Loop through each column
18     for j, column in enumerate(columns_to_visualize):
19         # Plot density for the current column and coin with the corresponding color
20         sns.kdeplot(coin_data[column], shade=True, ax=axs[i, j], color=colors[j % len(colors)])
21
22     # Add title and labels
23     axs[i, j].set_title(f'{coin} - {column}')
24     axs[i, j].set_xlabel('Values')
25     axs[i, j].set_ylabel('Density')
26
27 # Adjust the layout
28 plt.tight_layout()
29
30 # Show the plot
31 plt.show()
32
```

```
1 import pandas as pd
2
3 # Calculate skewness for each column
4 skewness = df_visual[columns_to_visualize].skew()
5
6 # Find the column with the highest skewness
```

```

7 highest_skewness_column = skewness.idxmax()
8
9 # Get the highest skewness value
10 highest_skewness_value = skewness[highest_skewness_column]
11
12 # Print the result
13 print(f"The column with the highest skewness is '{highest_skewness_column}' with a skewness value of {highest_skewness_value:.2f}.")
14

```

The column with the highest skewness is 'Low' with a skewness value of 6.27.

```

15     sns.kdeplot(coin_data[column], shade=True, ax=axs[i], color=colors[i % len(colors)])
16
17 import pandas as pd
18
19 # List of coins to analyze
20 coins = df_visual['Symbol'].unique()
21
22 # Loop through each coin
23 for coin in coins:
24     print(f"Coin: {coin}")
25
26     # Filter data for the current coin
27     coin_data = df_visual[df_visual['Symbol'] == coin]
28
29     # Calculate skewness for each column
30     skewness = coin_data[columns_to_visualize].skew()
31
32     # Sort the skewness values in descending order
33     sorted_skewness = skewness.sort_values(ascending=False)
34
35     # Retrieve the column names in descending order of skewness
36     columns_sorted_by_skewness = sorted_skewness.index.tolist()
37
38     # Print the columns in descending order of skewness
39     print("Columns in descending order of skewness:")
40     for column in columns_sorted_by_skewness:
41         print(column)
42
43     print() # Add a blank line between coins
44
45

```

Coin: BTC

Columns in descending order of skewness:

- Volume
- Marketcap
- Low
- Open
- Close
- High

Coin: ETH

Columns in descending order of skewness:

- Marketcap
- High
- Open
- Close
- Low
- Volume

Coin: XRP

Columns in descending order of skewness:

- Volume
- High
- Open
- Close
- Low
- Marketcap

Coin: LTC

Columns in descending order of skewness:

- Volume
- Marketcap
- High
- Open
- Close
- Low

Coin: USDC

Columns in descending order of skewness:

- Marketcap
- Volume

High
Close
Open
Low

✓ python_input_27_b7ca1b6af0a12b4 · 20 · FutureWarning:

▼ Apply the skewness transformations

▼ Logarithmic Transformation

```
1 #Taking the logarithm of the data can help reduce right-skewness (positive skewness). It can be done using functions like np.log or np.log1p
2
3 import seaborn as sns
4 import matplotlib.pyplot as plt
5 import numpy as np
6
7 # List of coins to analyze
8 coins = df_visual['Symbol'].unique()
9
10 # Set up the plot grid
11 fig, axs = plt.subplots(len(coins), len(columns_to_visualize), figsize=(12, 8))
12
13 # Define a list of colors for the density plots
14 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
15
16 # Loop through each coin
17 for i, coin in enumerate(coins):
18     coin_data = df_visual[df_visual['Symbol'] == coin]
19
20     # Loop through each column
21     for j, column in enumerate(columns_to_visualize):
22         # Apply the logarithmic transformation to the data
23         transformed_data = np.log1p(coin_data[column])
24
25         # Plot density for the transformed data
26         sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])
27
28         # Add title and labels
29         axs[i, j].set_title(f'{coin} - {column} (T)')
30         axs[i, j].set_xlabel('Values')
31         axs[i, j].set_ylabel('Density')
32
33 # Adjust the layout
34 plt.tight_layout()
35
36 # Show the plot
37 plt.show()
```

```
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])  
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])  
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])  
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])  
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j], color=colors[j % len(colors)])  
<ipython-input-41-4a4198343e9e>:24: FutureWarning:  
  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
1 #Now sidewise the original to compare  
2  
3 # This will be Values in appen in seahorn Values in a: please und Values in code  
4  
5 # List of coins to analyze  
6 coins = df_visual['Symbol'].unique()  
7  
8 # Set up the plot grid  
9 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))  
10  
11 # Define a list of colors for the density plots  
12 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']  
13  
14 # Loop through each coin  
15 for i, coin in enumerate(coins):  
16     coin_data = df_visual[df_visual['Symbol'] == coin]  
17  
18     # Loop through each column  
19     for j, column in enumerate(columns_to_visualize):  
20         # Original data  
21         original_data = coin_data[column]  
22  
23         # Apply the logarithmic transformation to the data  
24         transformed_data = np.log1p(original_data)  
25  
26         # Plot density for the original data  
27         sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])  
28         axs[i, j*2].set_title(f'{coin} - {column} (O)')  
29         axs[i, j*2].set_xlabel('Values')  
30         axs[i, j*2].set_ylabel('Density')  
31  
32         # Plot density for the transformed data  
33         sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])  
34         axs[i, j*2+1].set_title(f'{coin} - {column} (T)')  
35         axs[i, j*2+1].set_xlabel('Values')  
36         axs[i, j*2+1].set_ylabel('Density')  
37  
38 # Adjust the layout  
39 plt.tight_layout()  
40  
41 # Show the plot  
42 plt.show()
```

```
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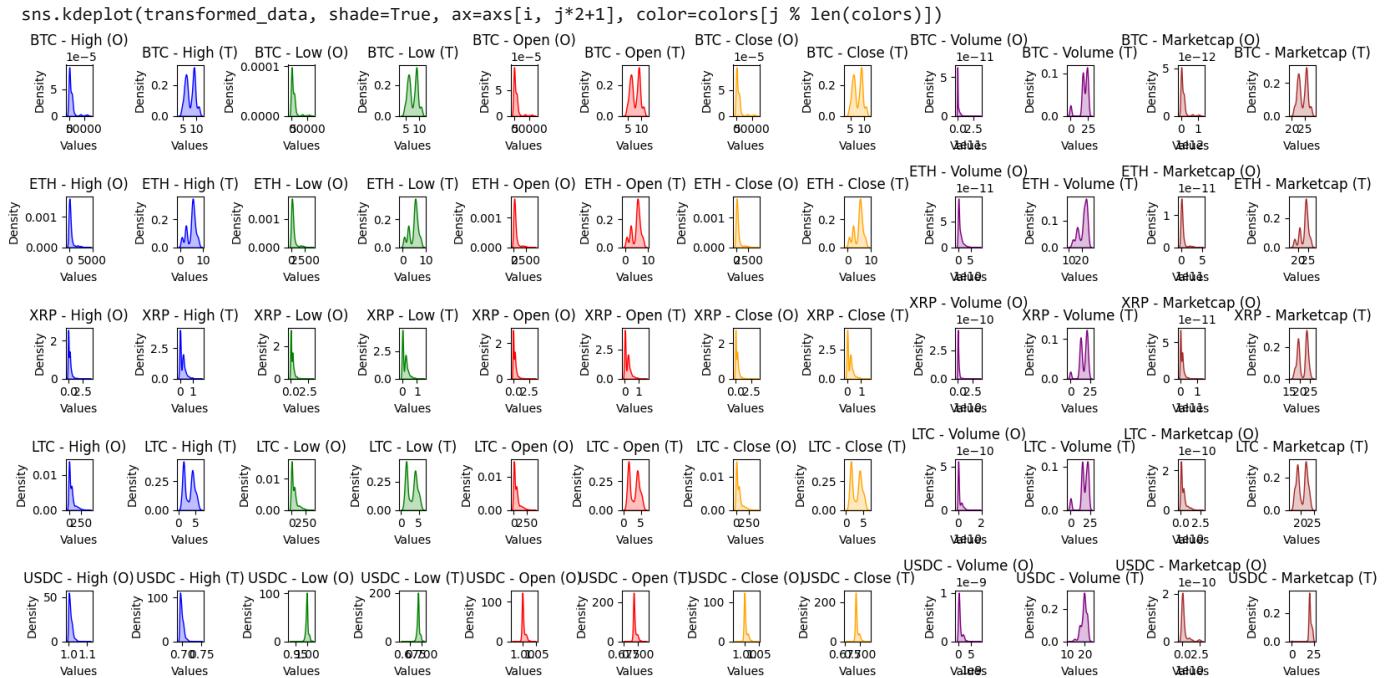
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▼ Square Root Transformation

1 #Taking the square root of the data can help reduce right-skewness. It can be done using the `np.sqrt` function.

```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
```

```
4
5 # List of coins to analyze
6 coins = df_visual['Symbol'].unique()
7
8 # Set up the plot grid
9 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))
10
11 # Define a list of colors for the density plots
12 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
13
14 # Loop through each coin
15 for i, coin in enumerate(coins):
16     coin_data = df_visual[df_visual['Symbol'] == coin]
17
18     # Loop through each column
19     for j, column in enumerate(columns_to_visualize):
20         # Original data
21         original_data = coin_data[column]
22
23         # Apply the square root transformation to the data
24         transformed_data = np.sqrt(original_data)
25
26         # Plot density for the original data
27         sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])
28         axs[i, j*2].set_title(f'{coin} - {column} (O)')
29         axs[i, j*2].set_xlabel('Values')
30         axs[i, j*2].set_ylabel('Density')
31
32         # Plot density for the transformed data
33         sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
34         axs[i, j*2+1].set_title(f'{coin} - {column} (T)')
35         axs[i, j*2+1].set_xlabel('Values')
36         axs[i, j*2+1].set_ylabel('Density')
37
38 # Adjust the layout
39 plt.tight_layout()
40
41 # Show the plot
42 plt.show()
43
```

```
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This will become an error in seaborn v0.14.0; please update your code.
```

```
sns.kdeplot(original_data, shade=True, ax= axs[i, j*2], color= colors[j % len(colors)])  
<ipython-input-45-586d99960ae0>:33: FutureWarning:
```

```
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This will become an error in seaborn v0.14.0; please update your code.
```

```
sns.kdeplot(transformed_data, shade=True, ax= axs[i, j*2+1], color= colors[j % len(colors)])  
<ipython-input-45-586d99960ae0>:27: FutureWarning:
```

```
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This will become an error in seaborn v0.14.0; please update your code.

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sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])
<ipython-input-45-586d99960ae0>:33: FutureWarning:
```

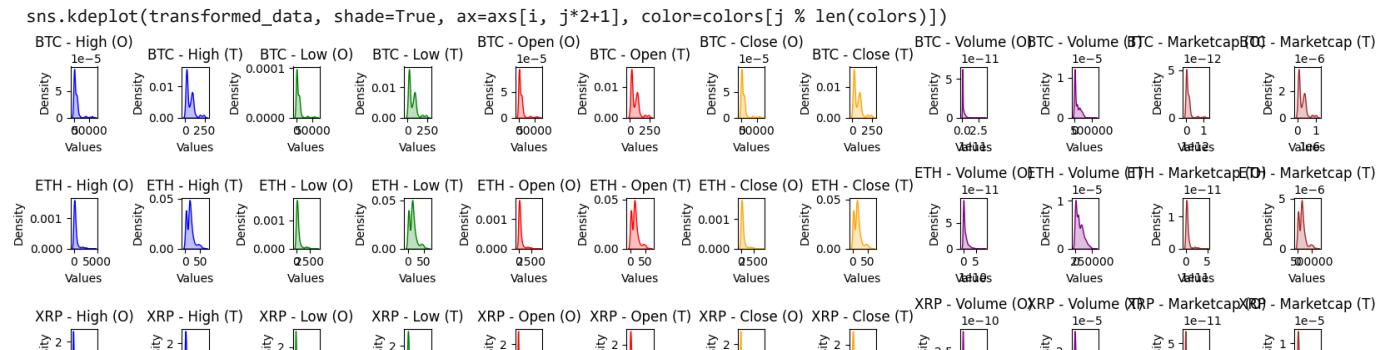
`'shade'` is now deprecated in favor of `'fill'`; setting `'fill=True'`. This will become an error in seaborn v0.14.0; please update your code.

```
sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
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▼ Box-Cox Transformation

```
1 #The Box-Cox transformation is a more generalized method that can handle both positive and negative skewness. It uses a power transformati
2 import seaborn as sns
3 import matplotlib.pyplot as plt
4 from sklearn.preprocessing import PowerTransformer
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(columns_to_visualize):
21         # Original data
22         original_data = coin_data[column]
23
24         # Exclude columns with negative values
25         if original_data.min() >= 0:
26             # Apply the Yeo-Johnson transformation to the data
27             transformer = PowerTransformer(method='yeo-johnson')
28             transformed_data = transformer.fit_transform(original_data.values.reshape(-1, 1))
29             transformed_data = transformed_data.flatten()
30
31         # Plot density for the original data
32         sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])
33         axs[i, j*2].set_title(f'{coin} - {column} (0)')
34         axs[i, j*2].set_xlabel('Values')
35         axs[i, j*2].set_ylabel('Density')
36
37         # Plot density for the transformed data
38         sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
39         axs[i, j*2+1].set_title(f'{coin} - {column} (1)')
```

```
39         axs[i, j*2+1].set_xlabel('Values')
40         axs[i, j*2+1].set_ylabel('Density')
41
42 # Adjust the layout
43 plt.tight_layout()
44
45 # Show the plot
46 plt.show()
47
```

```
<ipython-input-47-50e9e65183cd>:31: FutureWarning:  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
This will become an error in seaborn v0.14.0; please update your code.  
  
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```
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<ipython-input-47-50e9e65183cd>:31: FutureWarning:
```

shade is now deprecated in favor of `till`; setting `till=True`.
This will become an error in seaborn v0.14.0; please update your code.

▼ Reciprocal Transformation

```
1 #Taking the reciprocal (1/x) of the data can help reduce left-skewness (negative skewness).
```

```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3
4 # List of coins to analyze
5 coins = df_visual['Symbol'].unique()
6
7 # Set up the plot grid
8 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))
9
10 # Define a list of colors for the density plots
11 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
12
13 # Loop through each coin
14 for i, coin in enumerate(coins):
15     coin_data = df_visual[df_visual['Symbol'] == coin]
16
17     # Loop through each column
18     for j, column in enumerate(columns_to_visualize):
19         # Original data
20         original_data = coin_data[column]
21
22         # Apply the reciprocal transformation to the data
23         transformed_data = 1 / original_data
24
25         # Plot density for the original data
26         sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])
27         axs[i, j*2].set_title(f'{coin} - {column} (O)')
28         axs[i, j*2].set_xlabel('Values')
29         axs[i, j*2].set_ylabel('Density')
30
31         # Plot density for the transformed data
32         sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
33         axs[i, j*2+1].set_title(f'{coin} - {column} (T)')
34         axs[i, j*2+1].set_xlabel('Values')
35         axs[i, j*2+1].set_ylabel('Density')
36
37 # Adjust the layout
38 plt.tight_layout()
39
40 # Show the plot
41 plt.show()
42
```

```
<ipython-input-49-fc23af5fbc54>:26: FutureWarning:  
`shade` is now deprecated in favor of `fill`; setting `fill=True`.  
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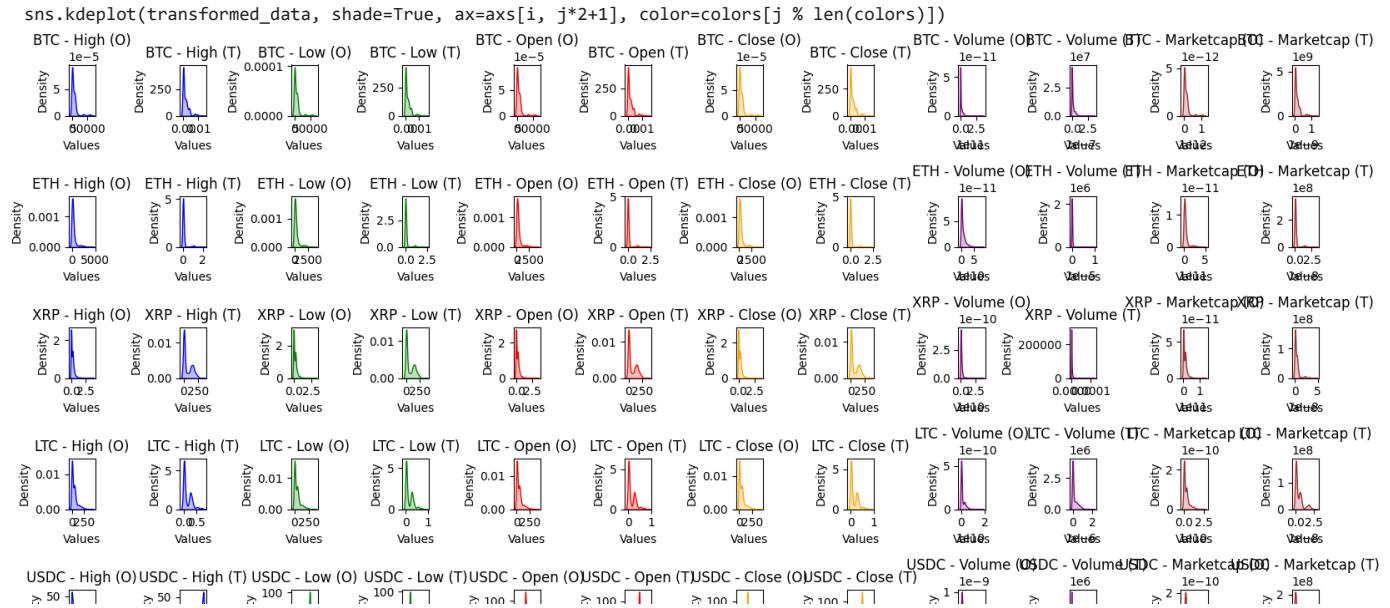
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▼ Yeo-Johnson Transformation

```
1 #Similar to the Box-Cox transformation, the Yeo-Johnson transformation is a power transformation that can handle both positive and negative
```

```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 from sklearn.preprocessing import PowerTransformer
4
5 # List of coins to analyze
6 coins = df_visual['Symbol'].unique()
7
8 # Set up the plot grid
9 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))
10
11 # Define a list of colors for the density plots
12 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
13
14 # Loop through each coin
15 for i, coin in enumerate(coins):
16     coin_data = df_visual[df_visual['Symbol'] == coin]
17
18     # Loop through each column
19     for j, column in enumerate(columns_to_visualize):
20         # Original data
21         original_data = coin_data[column]
22
23         # Apply the Yeo-Johnson transformation to the data
24         transformer = PowerTransformer(method='yeo-johnson')
25         transformed_data = transformer.fit_transform(original_data.values.reshape(-1, 1))
26         transformed_data = transformed_data.flatten()
27
28         # Plot density for the original data
```

```
29     sns.kdeplot(original_data, shade=True, ax=axs[i, j*2], color=colors[j % len(colors)])
30     axs[i, j*2].set_title(f'{coin} - {column} (0)')
31     axs[i, j*2].set_xlabel('Values')
32     axs[i, j*2].set_ylabel('Density')
33
34     # Plot density for the transformed data
35     sns.kdeplot(transformed_data, shade=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
36     axs[i, j*2+1].set_title(f'{coin} - {column} (T)')
37     axs[i, j*2+1].set_xlabel('Values')
38     axs[i, j*2+1].set_ylabel('Density')
39
40 # Adjust the layout
41 plt.tight_layout()
42
43 # Show the plot
44 plt.show()
45
```

```
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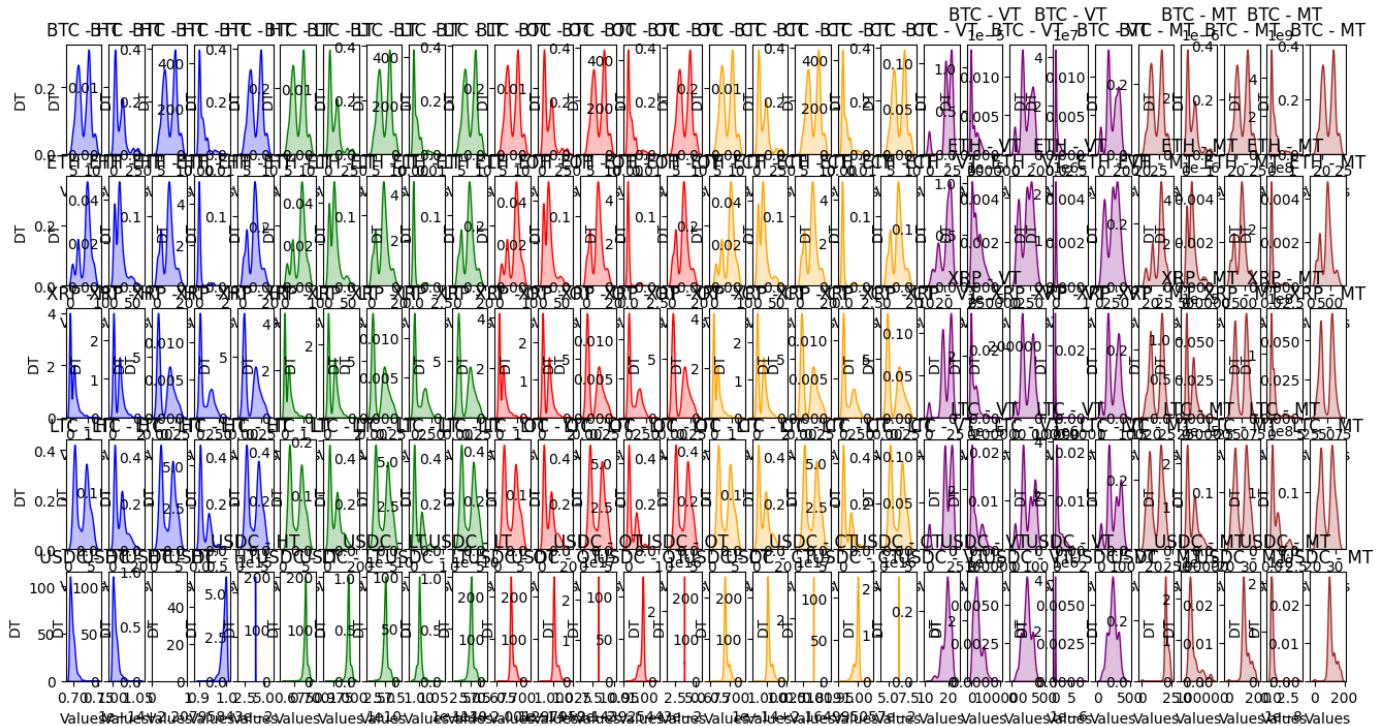
▼ All Transformations sidewise

```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 5, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(columns_to_visualize):
21         # Original data
22         original_data = coin_data[column]
23
24         # Logarithmic transformation
25         log_transformed_data = np.log1p(original_data)
26
27         # Square root transformation
28         sqrt_transformed_data = np.sqrt(original_data)
29
30         # Box-Cox transformation
31         boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
32
33         # Reciprocal transformation
34         reciprocal_transformed_data = 1 / original_data
35
36         # Yeo-Johnson transformation
37         yeojohnson_transformed_data, _ = stats.yeojohnson(original_data)
38
39         # Plot density for the logarithmic transformed data
40         sns.kdeplot(log_transformed_data, fill=True, ax= axs[i, j*5], color=colors[j % len(colors)])
41         axs[i, j*5].set_title(f'{coin} - {column[0]}T')
42         axs[i, j*5].set_xlabel('Values')
43         axs[i, j*5].set_ylabel('DT')
44
45         # Plot density for the square root transformed data
46         sns.kdeplot(sqrt_transformed_data, fill=True, ax= axs[i, j*5+1], color=colors[j % len(colors)])
47         axs[i, j*5+1].set_title(f'{coin} - {column[0]}T')
48         axs[i, j*5+1].set_xlabel('Values')
49         axs[i, j*5+1].set_ylabel('DT')
50
51         # Plot density for the Box-Cox transformed data
52         sns.kdeplot(boxcox_transformed_data, fill=True, ax= axs[i, j*5+2], color=colors[j % len(colors)])
53         axs[i, j*5+2].set_title(f'{coin} - {column[0]}T')
54         axs[i, j*5+2].set_xlabel('Values')
55         axs[i, j*5+2].set_ylabel('DT')
56
57         # Plot density for the reciprocal transformed data
58         sns.kdeplot(reciprocal_transformed_data, fill=True, ax= axs[i, j*5+3], color=colors[j % len(colors)])
59         axs[i, j*5+3].set_title(f'{coin} - {column[0]}T')
60         axs[i, j*5+3].set_xlabel('Values')
61         axs[i, j*5+3].set_ylabel('DT')
62
63         # Plot density for the Yeo-Johnson transformed data
```

```

64     sns.kdeplot(yeojohnson_transformed_data, fill=True, ax= axs[i, j*5+4], color=colors[j % len(colors)])
65     axs[i, j*5+4].set_title(f'{coin} - {column[0]}T')
66     axs[i, j*5+4].set_xlabel('Values')
67     axs[i, j*5+4].set_ylabel('DT')
68
69 # Adjust the layout
70 plt.tight_layout()
71
72 # Show the plot
73 plt.show()
74
<ipython-input-52-c41bf16b2614>:52: UserWarning: Dataset has 0 variance; skipping density estimate. Pass `warn_singular=False` to disable.
  sns.kdeplot(boxcox_transformed_data, fill=True, ax= axs[i, j*5+2], color=colors[j % len(colors)])
<ipython-input-52-c41bf16b2614>:70: UserWarning: Tight layout not applied. tight_layout cannot make axes width small enough to accommodate all axes.
  plt.tight_layout()

```



▼ Removing the labels to visualize

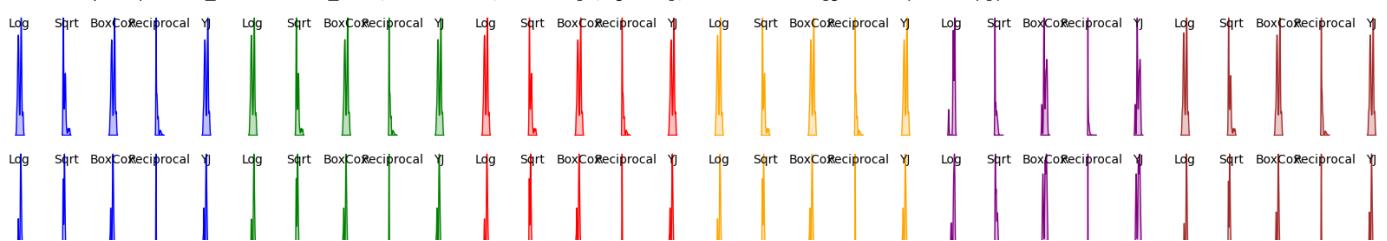
```

1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 5, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(columns_to_visualize):

```

```
21      # Original data
22      original_data = coin_data[column]
23
24      # Logarithmic transformation
25      log_transformed_data = np.log1p(original_data)
26
27      # Square root transformation
28      sqrt_transformed_data = np.sqrt(original_data)
29
30      # Box-Cox transformation
31      boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
32
33      # Reciprocal transformation
34      reciprocal_transformed_data = 1 / original_data
35
36      # Yeo-Johnson transformation
37      yeojohnson_transformed_data, _ = stats.yeojohnson(original_data)
38
39      # Plot density for the logarithmic transformed data
40      sns.kdeplot(log_transformed_data, fill=True, ax=axs[i, j*5], color=colors[j % len(colors)])
41      axs[i, j*5].text(0.5, 0.9, 'Log', horizontalalignment='center', verticalalignment='center',
42                      transform=axs[i, j*5].transAxes)
43      axs[i, j*5].axis('off')
44
45      # Plot density for the square root transformed data
46      sns.kdeplot(sqrt_transformed_data, fill=True, ax=axs[i, j*5+1], color=colors[j % len(colors)])
47      axs[i, j*5+1].text(0.5, 0.9, 'Sqrt', horizontalalignment='center', verticalalignment='center',
48                          transform=axs[i, j*5+1].transAxes)
49      axs[i, j*5+1].axis('off')
50
51      # Plot density for the Box-Cox transformed data
52      sns.kdeplot(boxcox_transformed_data, fill=True, ax=axs[i, j*5+2], color=colors[j % len(colors)])
53      axs[i, j*5+2].text(0.5, 0.9, 'BoxCox', horizontalalignment='center', verticalalignment='center',
54                          transform=axs[i, j*5+2].transAxes)
55      axs[i, j*5+2].axis('off')
56
57      # Plot density for the reciprocal transformed data
58      sns.kdeplot(reciprocal_transformed_data, fill=True, ax=axs[i, j*5+3], color=colors[j % len(colors)])
59      axs[i, j*5+3].text(0.5, 0.9, 'Reciprocal', horizontalalignment='center', verticalalignment='center',
60                          transform=axs[i, j*5+3].transAxes)
61      axs[i, j*5+3].axis('off')
62
63      # Plot density for the Yeo-Johnson transformed data
64      sns.kdeplot(yeojohnson_transformed_data, fill=True, ax=axs[i, j*5+4], color=colors[j % len(colors)])
65      axs[i, j*5+4].text(0.5, 0.9, 'YJ', horizontalalignment='center', verticalalignment='center',
66                          transform=axs[i, j*5+4].transAxes)
67      axs[i, j*5+4].axis('off')
68
69 # Adjust the layout
70 plt.tight_layout()
71
72 # Show the plot
73 plt.show()
74
75
```

```
<ipython-input-53-4e1d44754c8d>:52: UserWarning: Dataset has 0 variance; skipping density estimate. Pass `warn_singular=False` to disable.
```



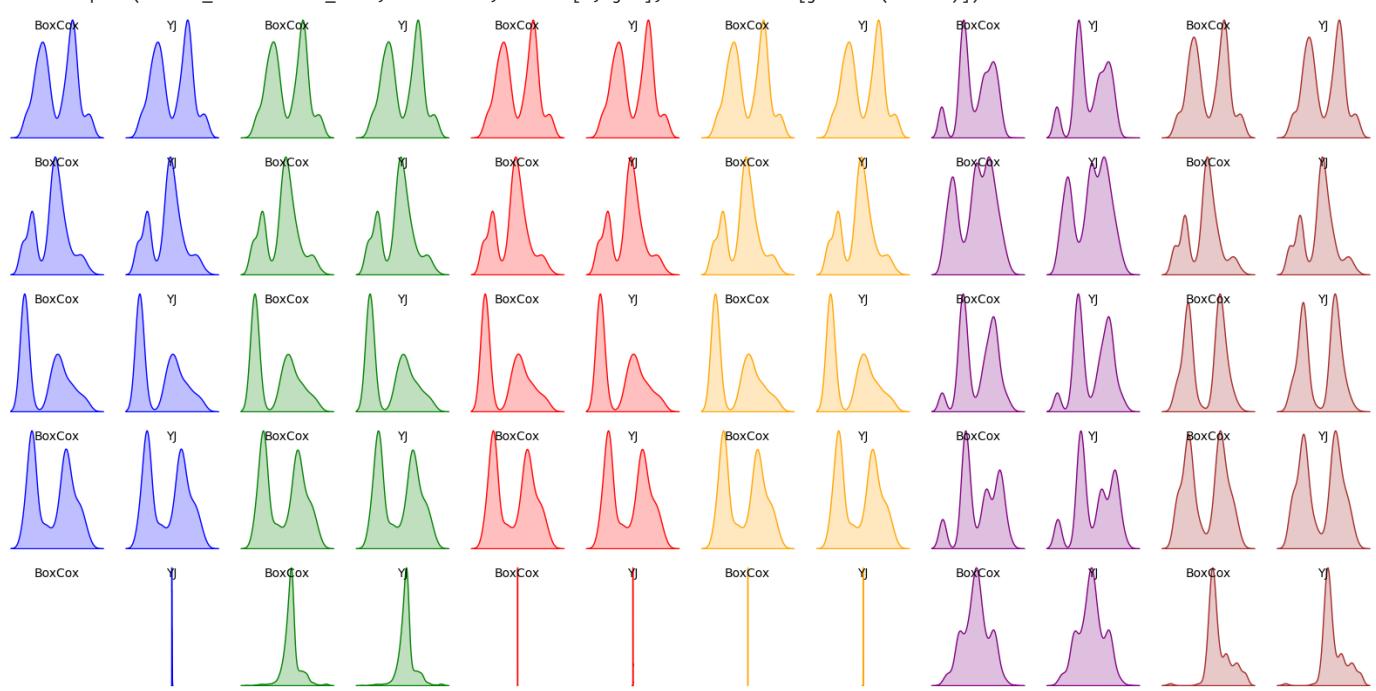
```
1 #Based on the density plots generated for each transformation, it appears that the Box-Cox Transformation (BoxCox) and the Yeo-Johnson Tra
2
3 #Both methods are capable of handling both positive and negative skewness and provide more flexibility in transforming the data distributi
4
5 #You can compare the density plots of the transformed data for both the BoxCox and YJ methods and choose the one that appears to have the
```

▼ Choose the two transformations which effectively reduced the skewness



```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), len(columns_to_visualize) * 2, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red', 'orange', 'purple', 'brown']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(columns_to_visualize):
21         # Original data
22         original_data = coin_data[column]
23
24         # Box-Cox transformation
25         boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
26
27         # Yeo-Johnson transformation
28         yeojohnson_transformed_data, _ = stats.yeojohnson(original_data)
29
30         # Plot density for the Box-Cox transformed data
31         sns.kdeplot(boxcox_transformed_data, fill=True, ax=axs[i, j*2], color=colors[j % len(colors)])
32         axs[i, j*2].text(0.5, 0.9, 'BoxCox', horizontalalignment='center', verticalalignment='center',
33                           transform=axs[i, j*2].transAxes)
34         axs[i, j*2].axis('off')
35
36         # Plot density for the Yeo-Johnson transformed data
37         sns.kdeplot(yeojohnson_transformed_data, fill=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
38         axs[i, j*2+1].text(0.5, 0.9, 'YJ', horizontalalignment='center', verticalalignment='center',
39                           transform=axs[i, j*2+1].transAxes)
40         axs[i, j*2+1].axis('off')
41
42 # Adjust the layout
43 plt.tight_layout()
44
45 # Show the plot
46 plt.show()
47
```

```
<ipython-input-55-91373e4aaac9>:31: UserWarning: Dataset has 0 variance; skipping density estimate. Pass `warn_singular=False` to disable.
```

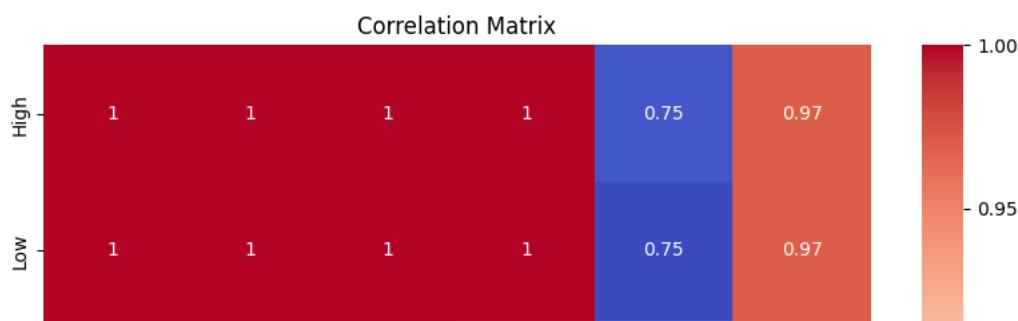


▼ Correlation of columns_to_visualize

```

1 import pandas as pd
2 import seaborn as sns
3 import matplotlib.pyplot as plt
4
5 # Assuming you have a DataFrame called 'df' with your data
6 # and a list called 'columns_to_visualize' with the columns to analyze
7
8 # Subset the DataFrame with the columns to visualize
9 subset_df = df[columns_to_visualize]
10
11 # Compute the correlation matrix
12 correlation_matrix = subset_df.corr()
13
14 # Plot the correlation matrix as a heatmap
15 plt.figure(figsize=(10, 8))
16 sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm')
17 plt.title('Correlation Matrix')
18 plt.show()
19

```



1 #High- Open - Low- Close are highly correlated so closing Close only

2 #

▼ Apply the transformations on reduced attributes

```

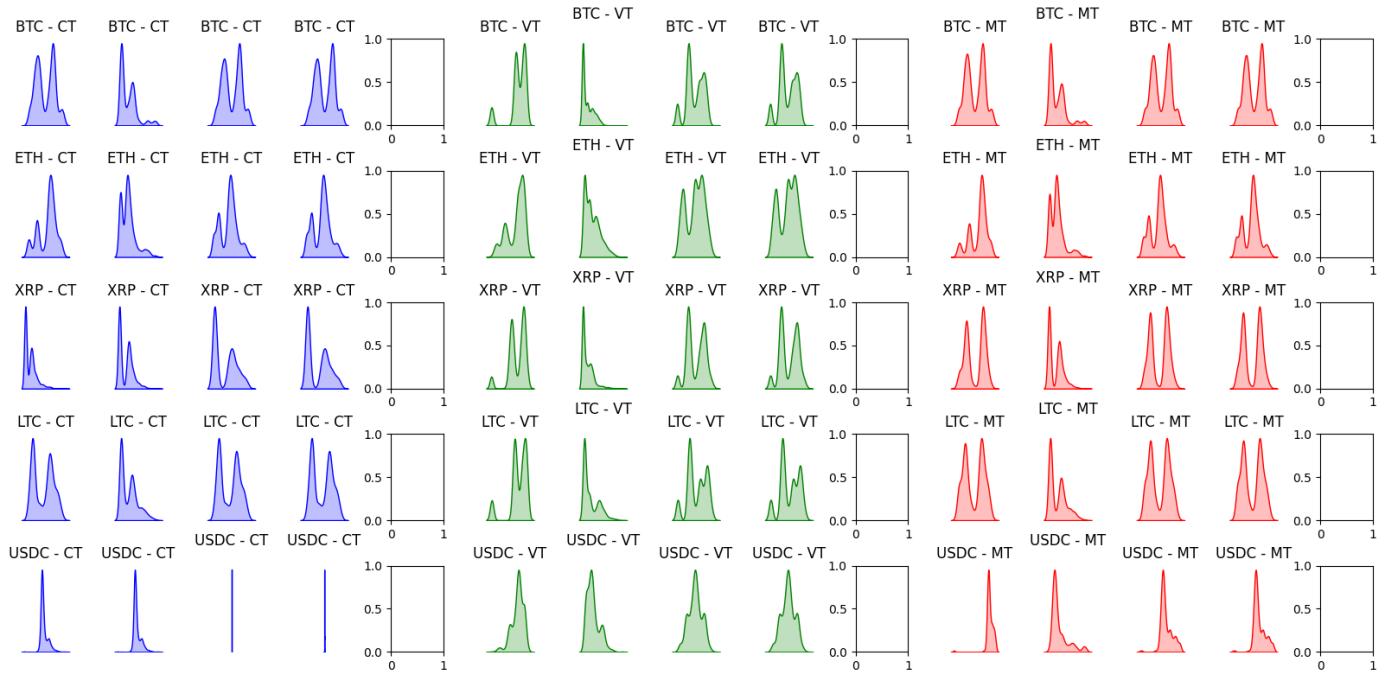
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), 15, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(['Close', 'Volume', 'Marketcap']):
21         # Original data
22         original_data = coin_data[column]
23
24         # Logarithmic transformation
25         log_transformed_data = np.log1p(original_data)
26
27         # Square root transformation
28         sqrt_transformed_data = np.sqrt(original_data)
29
30         # Box-Cox transformation
31         boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
32
33         # Yeo-Johnson transformation
34         yeojohnson_transformed_data, _ = stats.yeojohnson(original_data)
35
36         # Plot density for the logarithmic transformed data
37         sns.kdeplot(log_transformed_data, fill=True, ax=axs[i, j*5], color=colors[j % len(colors)])
38         axs[i, j*5].set_title(f'{coin} - {column[0]}')
39         axs[i, j*5].set_xlabel('')
40         axs[i, j*5].set_ylabel('DT')
41         axs[i, j*5].axis('off')
42
43         # Plot density for the square root transformed data
44         sns.kdeplot(sqrt_transformed_data, fill=True, ax=axs[i, j*5+1], color=colors[j % len(colors)])
45         axs[i, j*5+1].set_title(f'{coin} - {column[0]}')
46         axs[i, j*5+1].set_xlabel('')
47         axs[i, j*5+1].set_ylabel('DT')
48         axs[i, j*5+1].axis('off')
49
50         # Plot density for the Box-Cox transformed data
51         sns.kdeplot(boxcox_transformed_data, fill=True, ax=axs[i, j*5+2], color=colors[j % len(colors)])
52         axs[i, j*5+2].set_title(f'{coin} - {column[0]}')
53         axs[i, j*5+2].set_xlabel('')
54         axs[i, j*5+2].set_ylabel('DT')
55         axs[i, j*5+2].axis('off')
56
57         # Plot density for the Yeo-Johnson transformed data

```

```

58     sns.kdeplot(yeojohnson_transformed_data, fill=True, ax= axs[i, j*5+3], color=colors[j % len(colors)])
59     axs[i, j*5+3].set_title(f'{coin} - {column[0]}T')
60     axs[i, j*5+3].set_xlabel('')
61     axs[i, j*5+3].set_ylabel('DT')
62     axs[i, j*5+3].axis('off')
63
64 # Adjust the layout
65 plt.tight_layout()
66
67 # Show the plot
68 plt.show()
69

```



▼ Results based on above transformations

```

1 #Based on the provided density plots, we can make some observations about the effectiveness of each transformation method in reducing skew
2
3 #For the 'Close' attribute:
4 #- The Box-Cox transformation (CT) appears to be the most effective in reducing skewness for most coins, as it results in distributions th
5 #- The Yeo-Johnson transformation (YT) also shows some improvement in reducing skewness, but it is not as consistent as the Box-Cox transf
6
7 #For the 'Volume' attribute:
8 #- The Box-Cox transformation (CT) and the Yeo-Johnson transformation (YT) both show similar effectiveness in reducing skewness, with slig
9
10 #For the 'Marketcap' attribute:
11 #- The Box-Cox transformation (CT) and the Yeo-Johnson transformation (YT) again show similar effectiveness in reducing skewness, with som
12
13 #Based on these observations, it seems that the Box-Cox transformation (CT) generally performs well in reducing skewness for the given att

```

▼ Box-Cox transformation (CT) for the 'Close', 'Volume', and 'Marketcap' attributes.

```

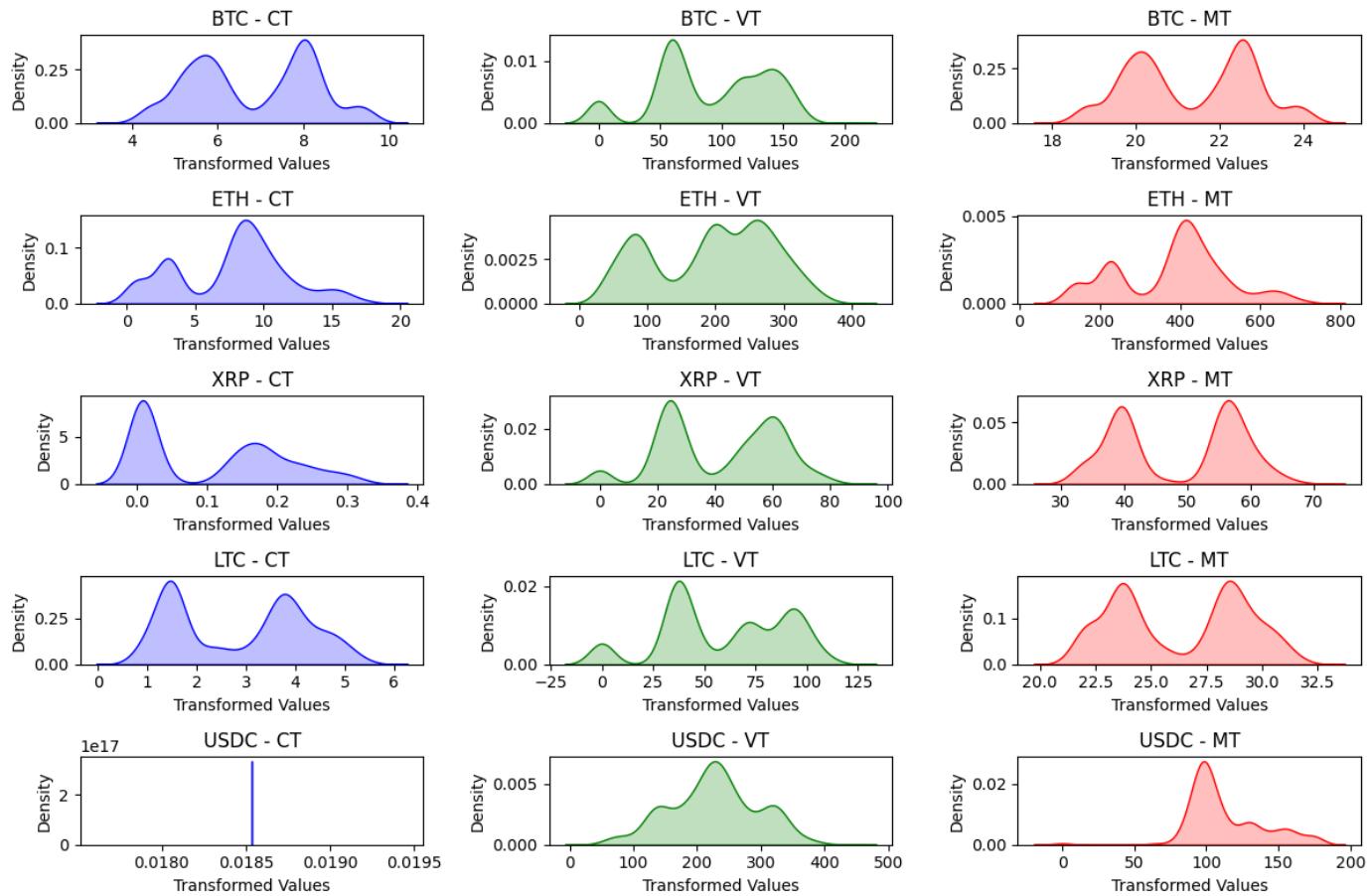
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8

```

```

9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), 3, figsize=(12, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(['Close', 'Volume', 'Marketcap']):
21         # Original data
22         original_data = coin_data[column]
23
24         # Box-Cox transformation
25         boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
26
27         # Plot density for the Box-Cox transformed data
28         sns.kdeplot(boxcox_transformed_data, fill=True, ax=axs[i, j], color=colors[j % len(colors)])
29         axs[i, j].set_title(f'{coin} - {column[0]}T')
30         axs[i, j].set_xlabel('Transformed Values')
31         axs[i, j].set_ylabel('Density')
32
33 # Adjust the layout
34 plt.tight_layout()
35
36 # Show the plot
37 plt.show()
38

```



- Box-Cox transformation (CT) for the 'Close', 'Volume', and 'Marketcap' attributes- Original Vs Transformed

```
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3 import numpy as np
4 from scipy import stats
5
6 # List of coins to analyze
7 coins = df_visual['Symbol'].unique()
8
9 # Set up the plot grid
10 fig, axs = plt.subplots(len(coins), 6, figsize=(16, 8))
11
12 # Define a list of colors for the density plots
13 colors = ['blue', 'green', 'red']
14
15 # Loop through each coin
16 for i, coin in enumerate(coins):
17     coin_data = df_visual[df_visual['Symbol'] == coin]
18
19     # Loop through each column
20     for j, column in enumerate(['Close', 'Volume', 'Marketcap']):
21         # Original data
22         original_data = coin_data[column]
23
24         # Box-Cox transformation
25         boxcox_transformed_data, _ = stats.boxcox(original_data + 1) # Adding 1 to handle zero or negative values
26
27         # Plot density for the original data
28         sns.kdeplot(original_data, fill=True, ax=axs[i, j*2], color=colors[j % len(colors)])
29         axs[i, j*2].set_title(f'{coin} - {column}')
30         axs[i, j*2].set_xlabel('Values')
31         axs[i, j*2].set_ylabel('Density')
32
33         # Plot density for the Box-Cox transformed data
34         sns.kdeplot(boxcox_transformed_data, fill=True, ax=axs[i, j*2+1], color=colors[j % len(colors)])
35         axs[i, j*2+1].set_title(f'{coin} - {column}T')
36         axs[i, j*2+1].set_xlabel('Transformed Values')
37         axs[i, j*2+1].set_ylabel('Density')
38
39 # Adjust the layout
40 plt.tight_layout()
41
42 # Show the plot
43 plt.show()
44
```



▼ Univariate Analysis

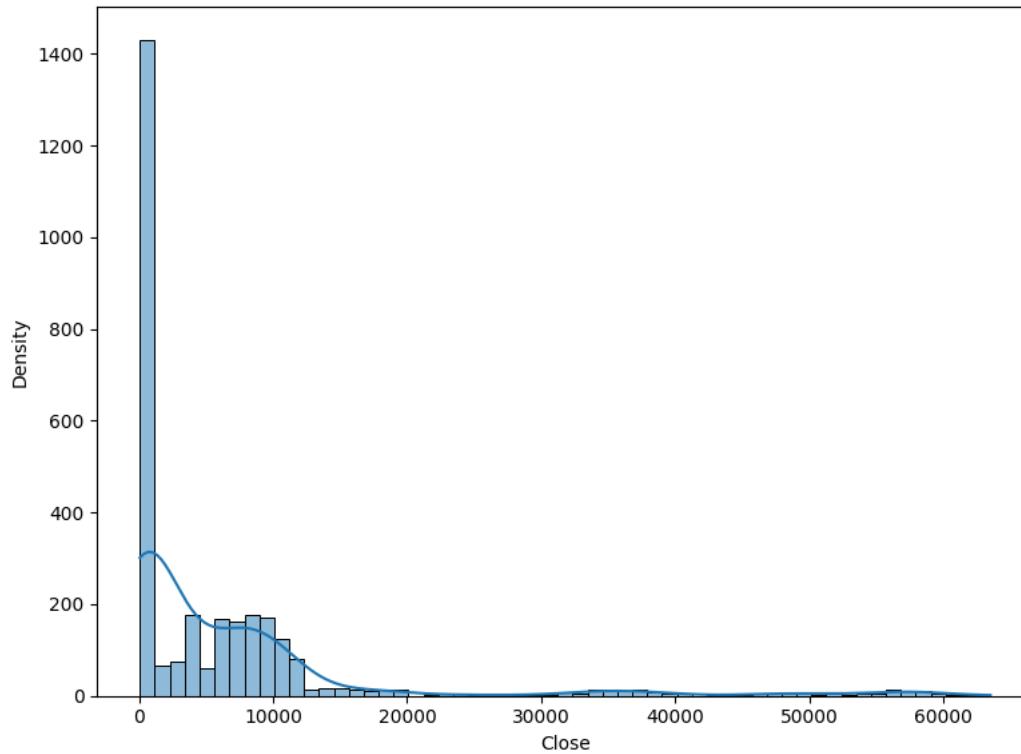
- To perform univariate analysis for each coin using the attribute "Close"

```

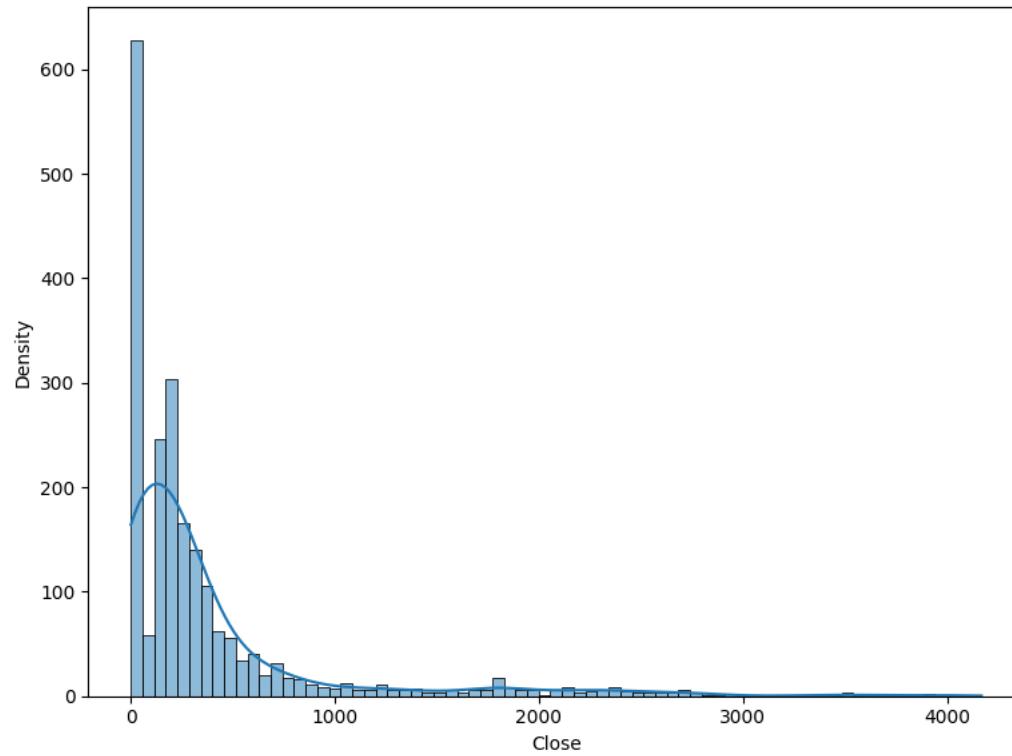
1 import seaborn as sns
2 import matplotlib.pyplot as plt
3
4 # List of coins to analyze
5 coins = df_visual['Symbol'].unique()
6
7 # Set up the plot grid
8 fig, axs = plt.subplots(len(coins), 1, figsize=(8, 6 * len(coins)))
9
10 # Loop through each coin
11 for i, coin in enumerate(coins):
12     coin_data = df_visual[df_visual['Symbol'] == coin]
13
14     # Plot the distribution of 'Close' attribute for the current coin
15     sns.histplot(data=coin_data, x='Close', kde=True, ax=axs[i])
16     axs[i].set_title(f'{coin} - Close Distribution')
17     axs[i].set_xlabel('Close')
18     axs[i].set_ylabel('Density')
19
20 # Adjust the layout
21 plt.tight_layout()
22
23 # Show the plot
24 plt.show()
25

```

BTC - Close Distribution

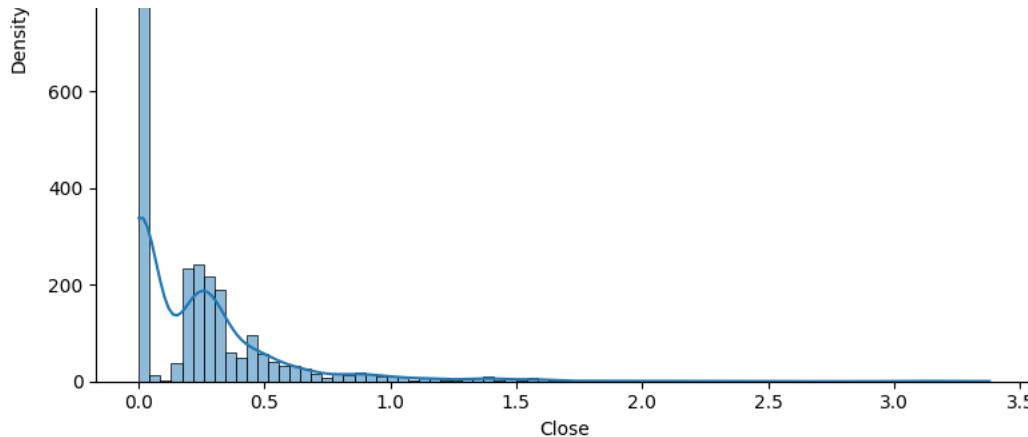


ETH - Close Distribution

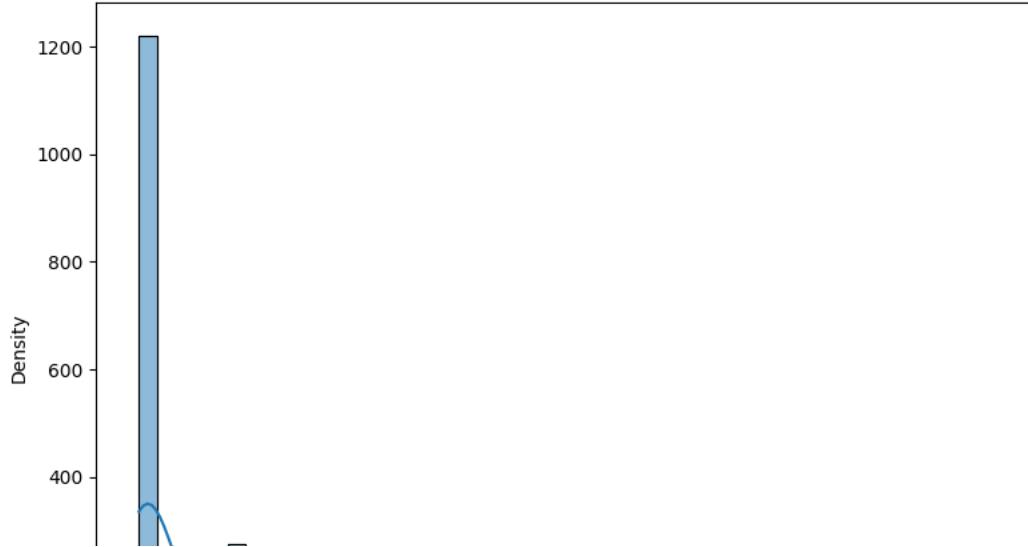


XRP - Close Distribution





LTC - Close Distribution



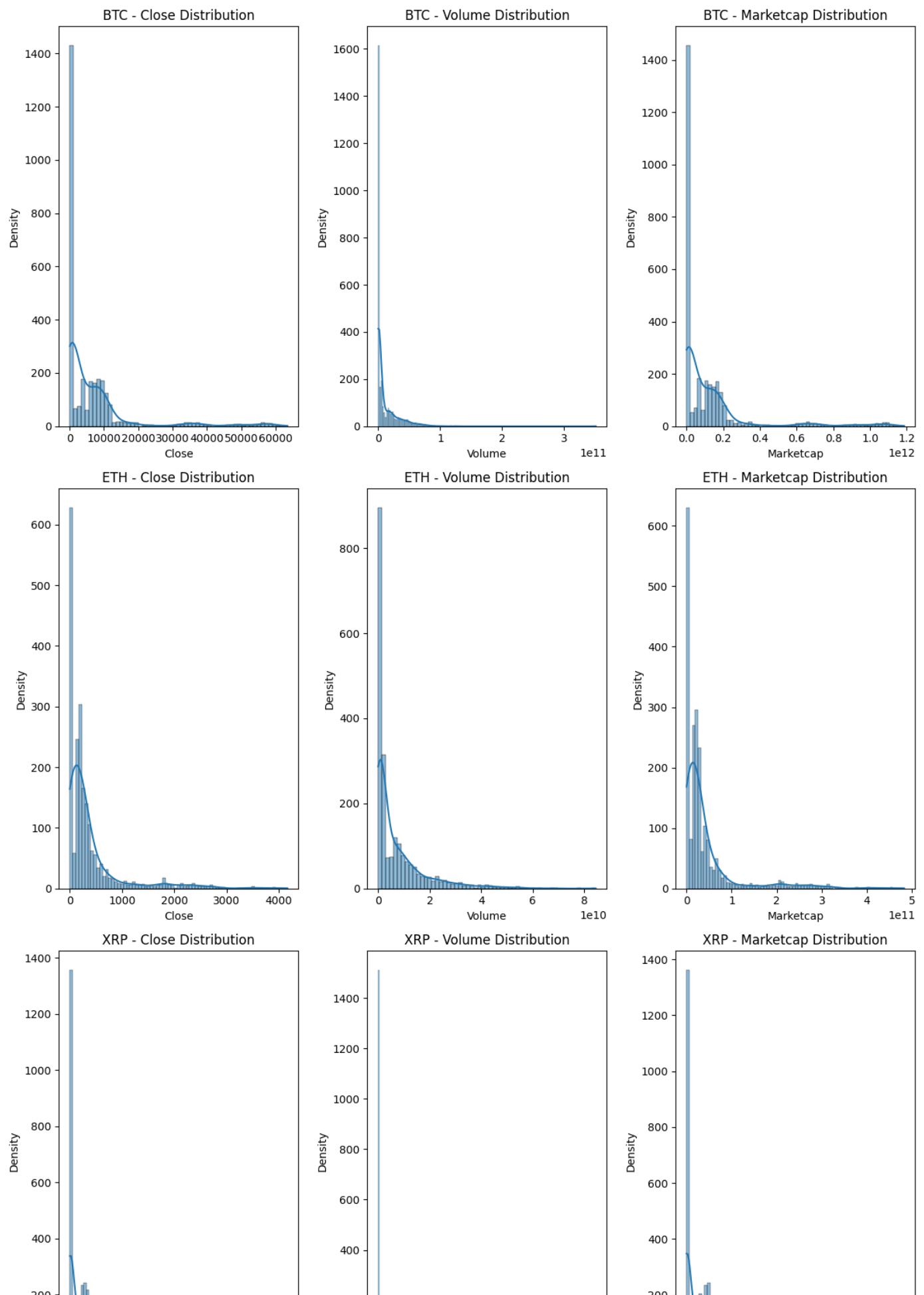
- To generate univariate analysis for the attributes 'Close', 'Volume', and 'Marketcap' for each coin

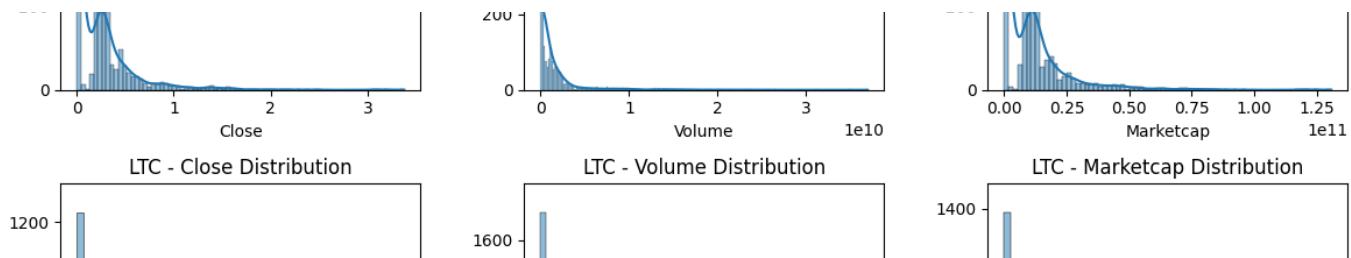
```

1 import seaborn as sns
2 import matplotlib.pyplot as plt
3
4 # List of coins to analyze
5 coins = df_visual['Symbol'].unique()
6
7 # Set up the plot grid
8 fig, axs = plt.subplots(len(coins), 3, figsize=(12, 6 * len(coins)))
9
10 # Loop through each coin
11 for i, coin in enumerate(coins):
12     coin_data = df_visual[df_visual['Symbol'] == coin]
13
14     # Plot the distribution of 'Close' attribute for the current coin
15     sns.histplot(data=coin_data, x='Close', kde=True, ax=axs[i, 0])
16     axs[i, 0].set_title(f'{coin} - Close Distribution')
17     axs[i, 0].set_xlabel('Close')
18     axs[i, 0].set_ylabel('Density')
19
20     # Plot the distribution of 'Volume' attribute for the current coin
21     sns.histplot(data=coin_data, x='Volume', kde=True, ax=axs[i, 1])
22     axs[i, 1].set_title(f'{coin} - Volume Distribution')
23     axs[i, 1].set_xlabel('Volume')
24     axs[i, 1].set_ylabel('Density')
25
26     # Plot the distribution of 'Marketcap' attribute for the current coin
27     sns.histplot(data=coin_data, x='Marketcap', kde=True, ax=axs[i, 2])
28     axs[i, 2].set_title(f'{coin} - Marketcap Distribution')
29     axs[i, 2].set_xlabel('Marketcap')
30     axs[i, 2].set_ylabel('Density')
31
32 # Adjust the layout

```

```
33 plt.tight_layout()  
34  
35 # Show the plot  
36 plt.show()  
37
```





▼ Bivariate Analysis

- To perform bivariate analysis for the attributes 'Close', 'Volume', and 'Marketcap' for each coin

```

1 import seaborn as sns
2 import matplotlib.pyplot as plt
3
4 # List of coins to analyze
5 coins = df_visual['Symbol'].unique()
6
7 # Set up the plot grid
8 fig, axs = plt.subplots(len(coins), 3, figsize=(12, 8))
9
10 # Loop through each coin
11 for i, coin in enumerate(coins):
12     coin_data = df_visual[df_visual['Symbol'] == coin]
13
14     # Bivariate analysis for 'Close' and 'Volume'
15     sns.scatterplot(x='Close', y='Volume', data=coin_data, ax=axs[i, 0], color='blue')
16     axs[i, 0].set_title(f'{coin} - Close vs. Volume')
17
18     # Bivariate analysis for 'Close' and 'Marketcap'
19     sns.scatterplot(x='Close', y='Marketcap', data=coin_data, ax=axs[i, 1], color='green')
20     axs[i, 1].set_title(f'{coin} - Close vs. Marketcap')
21
22     # Bivariate analysis for 'Volume' and 'Marketcap'
23     sns.scatterplot(x='Volume', y='Marketcap', data=coin_data, ax=axs[i, 2], color='red')
24     axs[i, 2].set_title(f'{coin} - Volume vs. Marketcap')
25
26 # Adjust the layout
27 plt.tight_layout()
28
29 # Show the plot
30 plt.show()
31

```