



PRESIDENCY UNIVERSITY

Laboratory Certificate

This is to certify that Mr. Raghavendra N Reg No 20201ISB0014
has satisfactorily completed the course of Experiments in DATA HANDLING
AND VISUALIZATION Prescribed by the PRESIDENCY UNIVERSITY in
The Laboratory of this College in the year 2023 - 2024

Signature of the Lecturer
in Charge

DATE:

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LABSHEET-1

INTRODUCTION TO NUMPY

```

import numpy as np
a=np.array([1,2,3])
b=np.array([1,2,3])
add=np.add(a,b) add
↳ array([2, 4,
6])
a=np.array([5,10,20]
)
b=np.array([4,8,10])
sub=np.subtract(a,b) sub
↳ array([ 1, 2,
10])
a=np.array([5,10,20])
b=np.array([4,8,10])
sub=np.multiply(a,b)
sub  ↳ array([ 20, 80,
200])
a=np.array([5,7,9]
)
b=np.array([4,5,6]
)
sub=np.mod(a,b) sub
↳ array([1, 2, 3])
a=np.array([1,2,3]
)
b=np.array([1,2,3]
)
add=np.power(a,b) add
↳ array([ 1, 4,
27])

```

Series creation

```

import pandas as pd import numpy as np
data=np.array(['a','b','c','d']) s=pd.Series(data) print(s)
0  ↳
a
1  b

2

3  c

d

dtype: object

```

Series with index

```
import pandas as pd import numpy as np data=np.array(['a','b','c','d'])
s=pd.Series(data,index=[101,102,103,104]) print(s)
```

```
↔ 101 a
102 b
103 c
104 d
dtype:
object
```

Series with Dictionary

```
import pandas as pd import numpy as
np data={'a': 0.,'b': 1.,'c': 2.}
s=pd.Series(data) print(s)
```

```
↔ a
0.0
b 1.0
c 2.0
dtype: float64
```

Series with Dictionary with index

```
import pandas as pd import numpy as
np
data={'a': 0.,'b': 1.,'c': 2.}
s=pd.Series(data,index=['b','c','d','a']) print(s)
```

```
↔ b
1.0 c
2.0 d
NaN a
0.0
```

```
dtype: float64
```

Create Series from Scalar

```
import pandas as pd import numpy as
np s= pd.Series(5, index=[0,1,2,3])
print(s)
```

```
↔ 0 5
1 5
2 5
3 5
dtype: int64
Retrieving
data from
the zeroth
position
```

```
import pandas as pd s=
pd.Series([1,2,3,4,5],index=['a','b','c','d','e']) print(s[0])
```

```

1  ↗
import
pandas as pd s=
pd.Series([100,101,102,103,104,105,106,107,108,109,110],index=['a','b','c','d','e','f'
',
' g
','h','i','j','k'])
) print(s[:3])
↗ a 100 b
      101
c      102
dtype: int64      import pandas as pd s=
pd.Series([100,101,102,103,104,105,106,107,108,109,110],index=['a','b','c','d','e','f'
',
' g ','h','i','j','k'])
print(s[2:8])

↗ c
      102 d
      103 e
      104 f
      105 g
      106 h
      107
dtype: int64

```

Using lable value

```

import pandas as pd s=
pd.Series([100,101,102,103,104,105,106,107,108,109,110],index=['a','b','c','d','e','f'
',
' g
','h','i','j','k']) print(s['a']) ↗ 100 import pandas as pd s=
pd.Series([100,101,102,103,104,105,106,107,108,109,110],index=['a','b','c','d','e','f'
',
' g
',,
'h',
'i'
',j
',,
k'])
)
pri
nt(
s[[
'a'
,e
',,
i',
'd'
]])

```

```

a
100 e
104 i
108 d
103

```

dtype: int64

Data Frames

```

import pandas as pd
df=pd.read_csv("/content/nyc_weather.csv")

```

Create data frame with empty data

```

import pandas as pd
df=pd.DataFrame() print(df)

```

```

Empty DataFrame Columns: []
Index: []

```

Create data frame from list

```

import pandas as pd data=[1,2,3,4,5] df=pd.DataFrame(data)
print(df)

```

```

0
0 1
1 2
2 3
3 4
4 5
import pandas as pd data=[['Alex',10],['Bob',12],['Clarke',13]]
df=pd.DataFrame(data,columns=['Name','Age']) print(df)
Name
Age
Alex 10

```

```

Bob 12
Clarke 13
import pandas as pd data=[['Dha',21, 10001,'A'],['Sha',23,
10002,'B'],['Dee',22, 10003,'C']]
df=pd.DataFrame(data,columns=['Name','Age','Rollno','Sec'],dtype=float) print(df)
Name Age Rollno Sec
0 Dha 21.0 10001.0 A
1 Sha 23.0 10002.0 B
2 Dee 22.0 10003.0 C
<ipython-input-31-f22448152035>:3: FutureWarning: Could not cast to float64, falling
back to object. This behavior is deprecated. I
df=pd.DataFrame(data,columns=['Name','Age','Rollno','Sec'],dtype=float)

```

Create data frame from Dictionary

```
import pandas as  
pd  
data={'Name':['Tom','Jack','Steve','Ricky'],'Age':[23,25,22,29]}  
df=pd.DataFrame(data,index=['rank1','rank2','rank3','rank4'])  
print(df)
```



```
Name Age rank1  
Tom 23 rank2  
Jack 25 rank3
```


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Steve 22 rank4 Ricky
29

LABSHEET-2 WORKING WITH PANDAS

```
import pandas as pd
def load_data():
    df_all = pd.read_csv('/content/train.csv')
    return df_all.loc[:300, ['Survived', 'Pclass', 'Sex', 'Cabin', 'Embarked']].dropna()
df=load_data()
```

```
df.head()
```



	Survived	Pclass	Sex	Cabin	Embarked
0	0	1	male	C30	S
1	1	1	female	D33	C
9	1	3	male	E121	S
10	1	1	female	B22	S
14	0	1	male	B51 B53 B55	S

FINDING DUPLICATE ROWS

```
df.Cabin.duplicated()
False
False
9      False
10     False
14     False
...
271    False
278    False
286    False
False
False
Name: Cabin, Length: 80, dtype: bool
df.duplicated()
False
False
9      False
10     False
14     False
...
271    False
278    False
286    False
False
False
Length: 80, dtype: bool
df.duplicated(subset=['Survived', 'Pclass', 'Sex'])
False
False
9      False
10     True
14     True
...
271    True
278    True
286    True
299    True
300    True
```

Length: 80, dtype: bool

COUNTING DUPLICATES AND NON DUPLICATES

```
df.Cabin.duplicated().sum()
```

↕

```
11 df.duplicated().sum() 3
```

↕

```
df.duplicated(subset=['Survived', 'Pclass', 'Sex']).sum() ↕
```

70

```
(~df.duplicated()).sum() ↕ 77
```

EXTRACTING DUPLICATE ROWS USING

```
LOC df.loc[df.duplicated(),
:]
```

↕

	Survived	Pclass	Sex	Cabin	Embarked
138	1	2	female	F33	S
169	1	1	female	B77	S
237	1	1	female	B96 B98	S

USING KEEP

```
df.loc[df.duplicated(keep='first'),
:]
```

↕

	Survived	Pclass	Sex	Cabin	Embarked
138	1	2	female	F33	S
169	1	1	female	B77	S
237	1	1	female	B96 B98	S

```
df.loc[df.duplicated(keep='last'), :]
```

↕

	Survived	Pclass	Sex	Cabin	Embarked
36	1	1	female	B77	S
77	1	1	female	B96 B98	S
134	1	2	female	F33	S

```
df.loc[df.duplicated(keep=False),
```

:]

↕

	Survived	Pclass	Sex	Cabin	Embarked
36	1	1	female	B77	S
77	1	1	female	B96 B98	S
134	1	2	female	F33	S
138	1	2	female	F33	S
169	1	1	female	B77	S
237	1	1	female	B96 B98	S

DROPPING DUPLICATED ROWS

```
df.drop_duplicates()
```

↕

	Survived	Pclass	Sex	Cabin	Embarked
0	0	1	male	C30	S
1	1	1	female	D33	C
9	1	3	male	E121	S

10	1	1	female	B22	S
14	0	1	male	B51 B53 B55	S
...
271	1	1	male	C93	S
278	0	1	male	C111	C
286	1	1	male	C148	C
299	1	1	female	D21	S
300	1	2	male	F2	S

77 rows × 5 columns

df.drop_duplicates(keep=False)



	Survived	Pclass	Sex	Cabin	Embarked
0	0	1	male	C30	S
1	1	1	female	D33	C
9	1	3	male	E121	S
10	1	1	female	B22	S
14	0	1	male	B51 B53 B55	S
...
271	1	1	male	C93	S
278	0	1	male	C111	C
286	1	1	male	C148	C
299	1	1	female	D21	S
300	1	2	male	F2	S

74 rows × 5 columns

LABSHEET-3 DATA CLEANING

```
import pandas as pd
import numpy as np
df=pd.read_csv('/content/2,1 dataset titanic.csv')
cols=['Name','Ticket','Cabin']
df=df.drop(cols,axis=1) df.info()
<class 'pandas.core.frame.DataFrame'> RangeIndex: 891 entries, 0 to 890 Data
columns (total 9 columns):
# Column Non-Null Count Dtype
-----
0 PassengerId      891 non-null int64
1 Survived         891 non-null int64
2 Pclass           891 non-null int64
3 Sex              891 non-null object
4 Age              714 non-null float64
5 SibSp            891 non-null int64
6 Parch            891 non-null int64
7 Fare             891 non-null float64
8 Embarked         889 non-null object dtypes: float64(2), int64(5), object(2) memory usage:
62.8+ KB df=df.dropna()
df.info()
```

```
<class 'pandas.core.frame.DataFrame'> Int64Index: 712 entries, 0 to 890 Data
columns (total 9 columns):
# Column Non-Null Count Dtype
```

```

0 PassengerId      712 non-null int64
1 Survived      712 non-null int64
2 Pclass        712 non-null int64
3 Sex           712 non-null object
4 Age           712 non-null float64
5 SibSp         712 non-null int64
6 Parch         712 non-null int64
7 Fare          712 non-null float64
8 Embarked      712 non-null object dtypes: float64(2), int64(5), object(2) memory usage:
55.6+ KB  dummies=[] cols=['Pclass','Sex','Embarked'] for col in cols:
dummies.append(pd.get_dummies(df[col]))
titanic_dummies=
pd.concat(dummies,axis=1)      df=
pd.concat((df,titanic_dummies), axis=1)
df=
df.drop(['Pclass','Sex','Embarked'],axis=1
)      df['Age'] = df['Age'].interpolate()
print(df)

```

```

PassengerId Survived Age SibSp Parch      Fare 1 2 3 female \
0 1          0 22.0 1          0 7.2500 0 0 1 0
1 2          1 38.0 1          0 71.2833 1 0 0 1
2 3          1 26.0 0          0 7.9250 0 0 1 1
3 4          1 35.0 1          0 53.1000 1 0 0 1
4 5 0 35.0 0 0 8.0500 0 0 1 0 .. ... .. 885 886 0 39.0 0 5 29.1250 0 0 1 1
886 887          0          27.0 0 0          13.0000 0 1 0 0
887 888          1          19.0 0          0          30.0000 1 0 0 1
889 890 1 26.0 0 0 30.0000 1 0 0 0 890 891 0 32.0 0 0
7.7500 0 0 1 0

male C Q S 0 1 0 0
1
1      0      1 0 0
2      0      0 0 1
3      0      0 0 1
4      1      0 0 1 ..      ... ..

885 0 0 1 0
886 1 0 0 1
887 0 0 0 1
889 1 1 0 0
890 1 0 1 0

```

[712 rows x 14 columns]

```

MIN MAX SCALAR STANDARDIZATION      from sklearn.preprocessing
import MinMaxScaler data=[[-1,2],[-
0.5,6],[0,10],[1,18]] scaler=MinMaxScaler()
print(scaler.fit(data)) print('
MinMaxScaler()
print(scaler.data_max_) print('
print('scaler.transform(data)')
MinMaxScaler() [ 1. 18.]

```

```

scaler.transform(data)
from numpy import asarray
from sklearn.preprocessing import StandardScaler data=asarray([[100,0.001],
[8,0.05],
[50,0.005],
[88,0.07], [4,0.1]])
print(data)
scaler= StandardScaler()
scaled = scaler.fit_transform(data) print(scaled)

```

```

→ [[1.0e+02 1.0e-03]
[8.0e+00 5.0e-02]
[5.0e+01 5.0e-03]
[8.8e+01 7.0e-02]
[4.0e+00 1.0e-01]]
[[ 1.26398112 -1.16389967]
[-1.06174414  0.12639634]
[ 0. -1.05856939]
[ 0.96062565  0.65304778]  [-1.16286263
1.44302493]]
from sklearn.preprocessing import MinMaxScaler data=[[-1,2],[-
0.5,6],[0,10],[1,18]] scaler=MinMaxScaler()
print(scaler.fit(data)) MinMaxScaler()
print(scaler.data_max_)
print('scaler.transform(data)')

```

```

→ MinMaxScaler() [ 1. 18.] scaler.transform(data)

```

LABSHEET-4 Z-SCORE NORMALIZATION

```

import numpy as np data=
[1,2,2,2,3,1,1,15,2,2,2,3,1,1,2] mean= np.mean(data)
std= np.std(data) print("mean of the dataset ids",
mean) print("std is", std) threshold=3 outlier=[] for
i in data: z=(imean)/std if z>threshold:
outlier.append(i) print("outlier in dataset is",
outlier) → mean of the dataset ids
2.6666666666666665 std is
3.3598941782277745
outlier in dataset is [15]

```

LABSHEET-5 OUTLIER DETECTION WITH IQR

```

import numpy as np  import seaborn as
sns  data=[6,2,3,4,5,1,50]
sort_data=np.sort(data) sort_data
array([ 1, 2, 3, 4, 5, 6, 50])

Q1=-np.percentile(data, 25, interpolation = 'midpoint') Q2=-np.percentile(data, 50,
interpolation = 'midpoint') Q3=-np.percentile(data, 75, interpolation = 'midpoint')
print('Q1 25 percentile of the given data is, ', Q1) print('Q2 50 percentile of the
given
data is, ', Q2) print('Q3 75 percentile of the given data is, ',
Q3)  IQR = Q3 - Q1 print('IQR is', IQR)
Q1 25 percentile of the given data is, -2.5 Q2 50 percentile of the given data is,
4.0 Q3 75 percentile of the given data is, -5.5 IQR is -3.0
low_lim = Q1 - 1.5 * IQR up_lim = Q3 + 1.5 * IQR

```

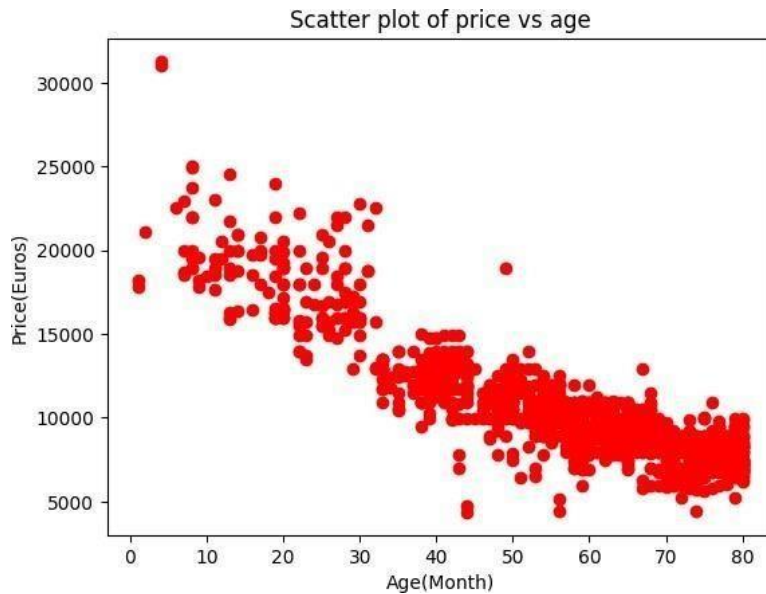
LABSHEET-6 MATPLOTLIB

```
import pandas as pd  import numpy as np  import
matplotlib.pyplot as plt
df=pd.read_csv("/content/Toyota.csv", index_col = 0, na_values =
['??','???'])
df.info()
<class 'pandas.core.frame.DataFrame'> Index: 1436 entries, 0 to 1435 Data
columns (total 10 columns):
# Column      Non-Null Count  Dtype
-----
0 Price    1436 non-null  int64
1 Age      1336 non-null  float64
2 KM       1421 non-null  float64
3 FuelType 1336 non-null  object
4 HP        1436 non-null  object
5 MetColor 1286 non-null  float64
6 Automatic 1436 non-null  int64
7 CC        1436 non-null  int64
8 Doors     1436 non-null  object
9 Weight    1436 non-null  int64 dtypes: float64(3), int64(4), object(3) memory usage:
123.4+ KB
df.dropna(axis=0,inplace=True) df
```

```

Price    Age    KM    FuelType    HP    MetColor    Automatic    CC    Doors    Weight
0    13500  23.0  46986.0  Diesel  90  1.0  0  2000  three  1165
1    13750  23.0  72937.0  Diesel  90  1.0  0  2000  3  1165
3    14950  26.0  48000.0  Diesel  90  0.0  0  2000  3  1165
4    13750  30.0  38500.0  Diesel  90  0.0  0  2000  3  1170
5    12950      32.0  61000.0      Diesel    90      0.0      0      2000
      3      1170
...
1423  7950  80.0  35821.0  Petrol  86  0.0  1  1300  3  1015
1424  7750  73.0  34717.0  Petrol  86  0.0  0  1300  3  1015
      1429  8950  78.0  24000.0  Petrol  86  1.0  1  1300  5  1065
      1430  8450  80.0  23000.0  Petrol  86  0.0  0  1300  3  1015  1435  6950  76.0
      1.0  Petrol  110  0.0  0
1600  5  1114  1099 rows x 10 columns
```

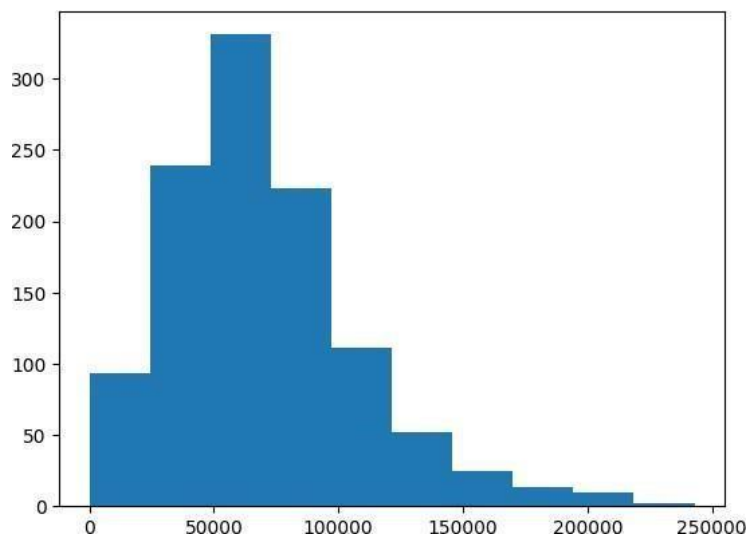
```
SCATTER PLOT      plt.scatter(df['Age'], df['Price'], c='red') plt.title('Scatter
plot of price vs age') plt.xlabel('Age(Month)') plt.ylabel('Price(Euros)')
plt.show()
```



HISTOGRAM

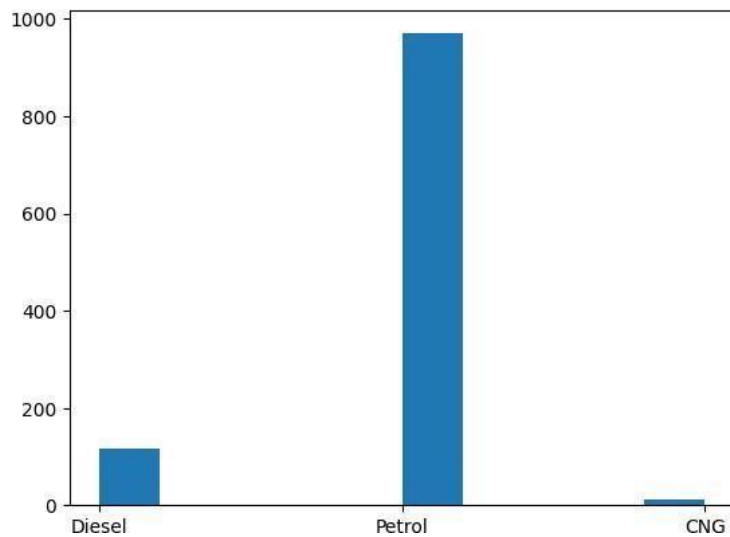
```
plt.hist(df['KM'])
```

```
(array([ 93., 239., 331., 223., 111., 52., 25., 13., 10., 2.]), array([1.000000e+00,
2.430090e+04, 4.860080e+04, 7.290070e+04,
9.720060e+04, 1.215005e+05, 1.458004e+05, 1.701003e+05,
1.944002e+05, 2.187001e+05, 2.430000e+05])), <BarContainer
object of 10 artists>)
```



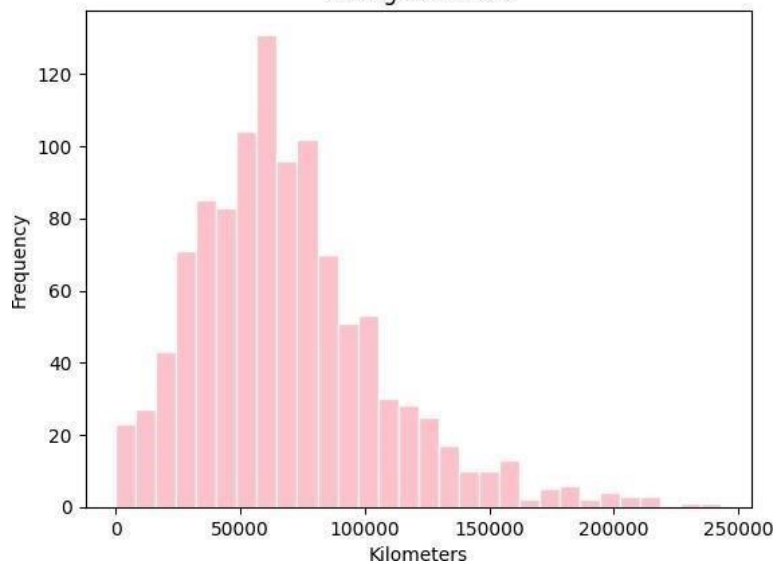
```
plt.hist(df['FuelType'])
```

```
(array([117., 0., 0., 0., 0., 970., 0., 0., 0., 12.]), array([0.
, 0.2, 0.4, 0.6, 0.8, 1. , 1.2, 1.4, 1.6, 1.8, 2. ]),
<BarContainer object of 10 artists>)
```

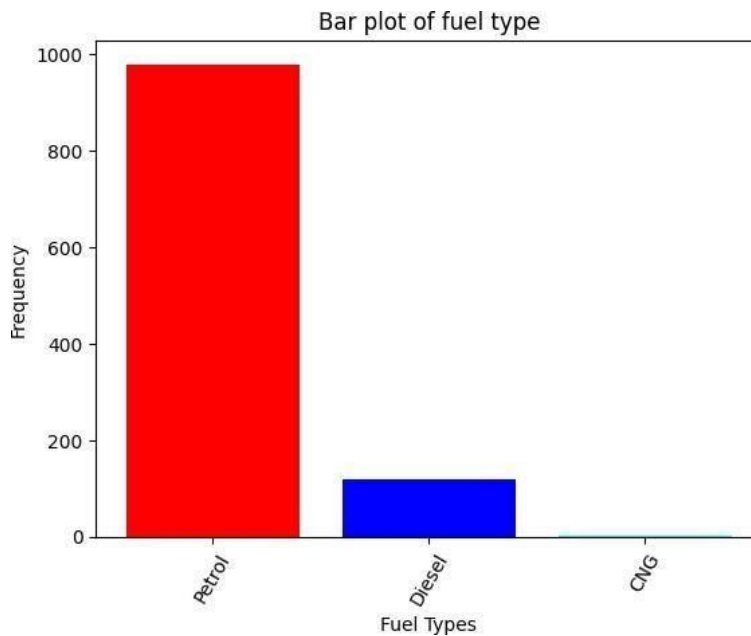



```
plt.hist(df['KM'],color='pink',edgecolor='white',bins=30) plt.title('Histogram of KM') plt.xlabel('Kilometers') plt.ylabel('Frequency') plt.show()
```

Histogram of KM



```
BAR PLOT counts = [979,120,2] fueltype= ('Petrol','Diesel','CNG') index=
np.arange(len(fueltype)) plt.bar(index,counts,color=['red','blue','cyan'])
plt.title('Bar plot of fuel type') plt.xlabel('Fuel Types') plt.ylabel('Frequency')
plt.xticks(index, fueltype, rotation= 60) plt.show()
```

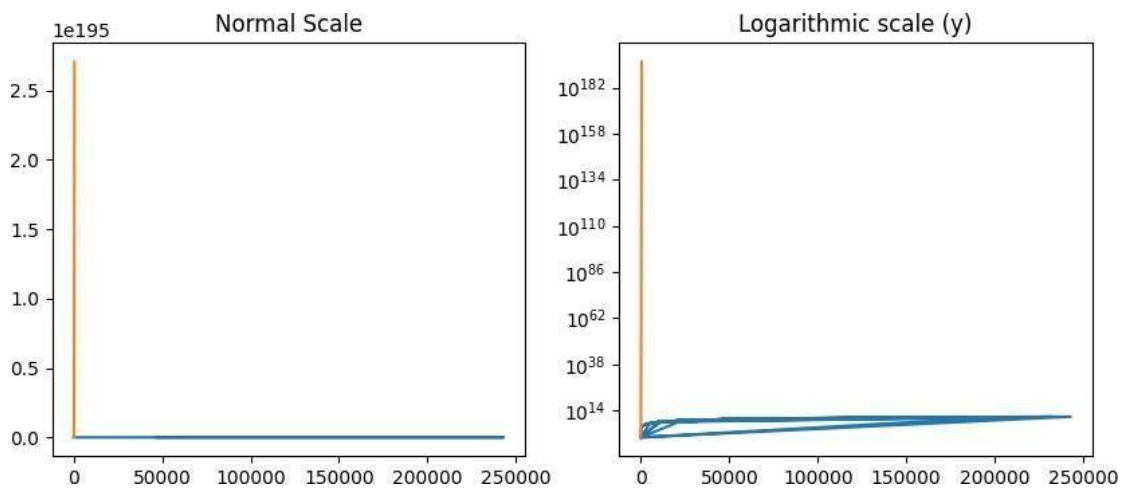


```

LINE PLOT    fig, axes = plt.subplots(1, 2,
figsize=(10,4)) x=df['KM']
axes[0].plot(x, x**2, x, np.exp(x)) axes[0].set_title("Normal Scale")
axes[1].plot(x, x**2, x, np.exp(x))
axes[1].set_yscale("log") axes[1].set_title("Logarithmic
scale (y)")

```

/usr/local/lib/python3.10/dist-packages/pandas/core/arraylike.py:396:
RuntimeWarning: overflow encountered in exp result = getattr(ufunc, method)(*inputs,
**kwargs) Text(0.5, 1.0, 'Logarithmic scale (y)')



```

fig, ax = plt.subplots(figsize=(10,4)) x=df['KM'] ax.plot(x, x**2,x,x**3,
lw=2) ax.set_xticks([1,2,3,4,5])
ax.set_xticklabels([r'$\alpha$',r'$\beta$',r'$\gamma$',r'$\delta$',
, r'$\epsilon$'], fontsize=18) yticks=[0,50,100,150]
ax.set_yticks(yticks) ax.set_yticklabels(["%.1f$" % y for y in
yticks])

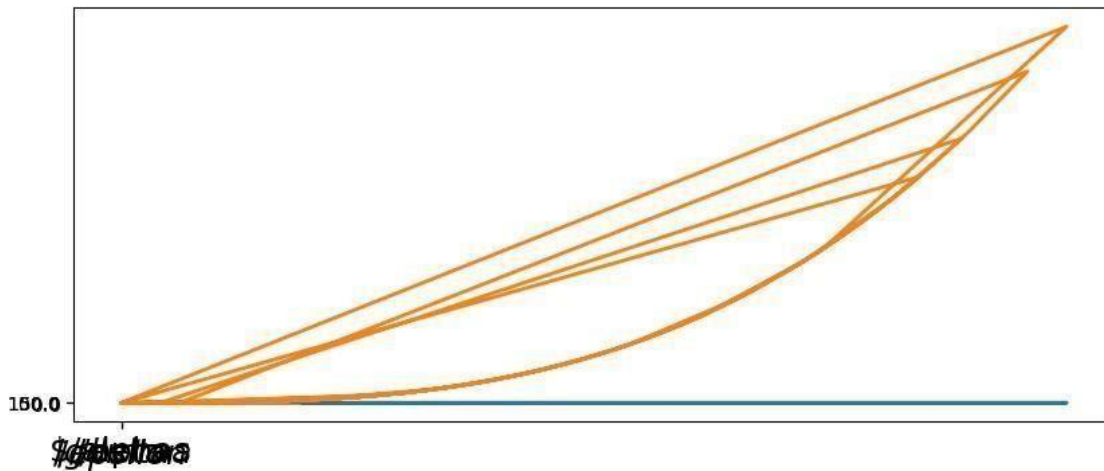
```

```

[Text(0, 0, '$0.0$'),
Text(0, 50, '$50.0$'),
Text(0, 100, '$100.0$'),

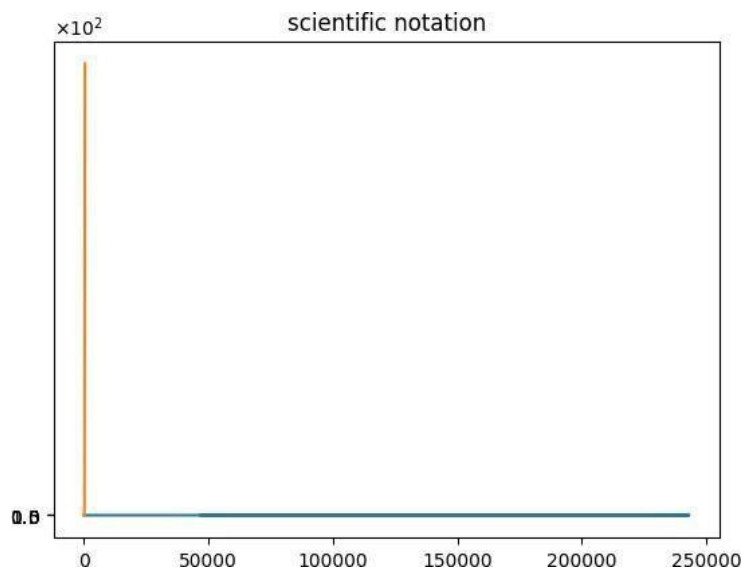
```

```
Text(0, 150, '$150.0$')]
```



```
fig, ax= plt.subplots(1,1) x=df['KM']
```

```
ax.plot(x, x**2, x, np.exp(x))
ax.set_title("scientific notation") ax.set_yticks([0,50,100,150])
from matplotlib import ticker
formatter = ticker.ScalarFormatter(useMathText=True) formatter.set_scientific(True)
formatter.set_powerlimits((-1,1)) ax.yaxis.set_major_formatter(formatter)
```



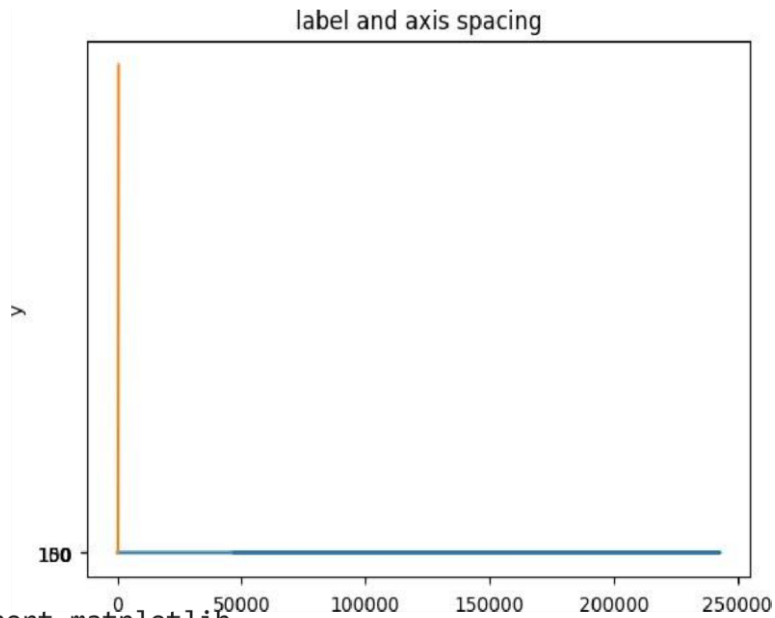
```
import matplotlib
matplotlib.rcParams['xtick.major.pad'] =
5 matplotlib.rcParams['ytick.major.pad']
= 5 x
=
df['KM']
]
fig, ax = plt.subplots(1, 1)
```

```
ax.plot(x, x**2, x, np.exp(x)) ax.set_yticks([0, 50, 100, 150])
ax.set_title("label and axis spacing") ax.xaxis.labelpad = 5
ax.yaxis.labelpad = 5 ax.set_ylabel("x") ax.set_xlabel("y") plt.show()
```



/usr/local/lib/python3.10/dist-packages/pandas/core/arraylike.py:396:

RuntimeWarning: overflow encountered in exp result = getattr(ufunc, method)(*inputs, **kwargs)



```
import matplotlib
```

```
matplotlib.rcParams['xtick.major.pad'] = 3
matplotlib.rcParams['ytick.major.pad'] = 3
```

LABSHEET-7 INTERACTING WITH WEB API

```

Import requests pip install --upgrade 'library'
Collecting library
Downloading Library-0.0.0.tar.gz (1.4 kB) Preparing metadata (setup.py) ... done
Building wheels for collected packages: library
Building wheel for library (setup.py) ... done
Created wheel for library: filename=Library-0.0.0-py3-none-any.whl size=2054
sha256=33e04a1cd46e5d3b86146af77a7e80978fe44edaeba4a Stored in directory:
/root/.cache/pip/wheels/e0/71/7d/b0e29b944e43374597cd4e3b88c85197001c9bfcd5dce191f4
Successfully built library
Installing collected packages: library Successfully installed library-0.0.0

```

```

r =
requests.get('https://www.romexchange.com/')
r

```

```

<Response [406]>

```

```

r.status_code 406 url = 'https://www.romexchange.com/'
headers = {'Content-type': 'application/json'}
url
1

```

```

'https://www.romexchange.com/'
header
s

```

```

{'Content-type': 'application/json'} r=requests.get(url, headers = headers) url
= 'https://www.romexchange.com/'
headers = {'User-Agent': 'XY', 'Content-type': 'application/json'} r =
requests.get(url, headers=headers)
url

```

```

'https://www.romexchange.com/'
header
s

```

```

{'User-Agent': 'XY', 'Content-type': 'application/json'}
r
<Re
spo
nse
[20
0]>

```

```

r.status_code 200 url =
'https://www.romexchange.com/api?item=mastela&exact=false' headers =
{'UserAgent': 'XY', 'Content-type': 'application/json'}

```

```

r= requests.get(url,
headers=headers) r.status_code

```

↔ 500

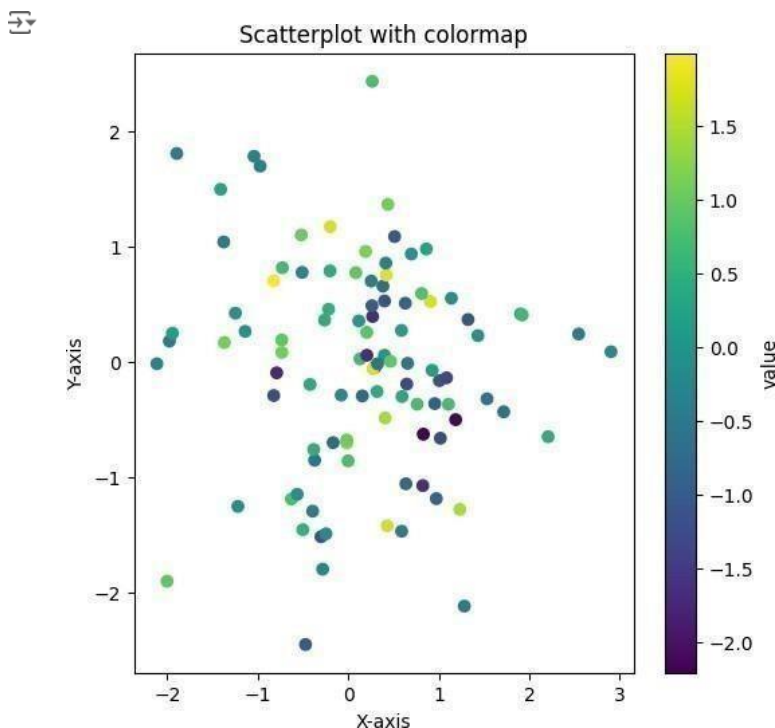
r.text

↔ ..

LABSHEET-8

COLORMAPS

```
import pandas as pd import numpy as np
import matplotlib.pyplot as plt
#sample dataframe with multiple columns
data=pd.DataFrame({"x":np.random.randn(100),"y":np.random.randn(100),"value":np.random.randn(100)}) #define the colormap and alpha values cmap="viridis" alpha=1 #create the scatterplot
plt.figure(figsize=(6,6))
plt.scatter(data["x"],data["y"],c=data["value"],cmap=cmap,alpha=alpha) #customize the plot(optional)
plt.xlabel("X-axis") plt.ylabel("Y-axis")
plt.title("Scatterplot with colormap") plt.colorbar(label="value") #show the plot
plt.show()
```



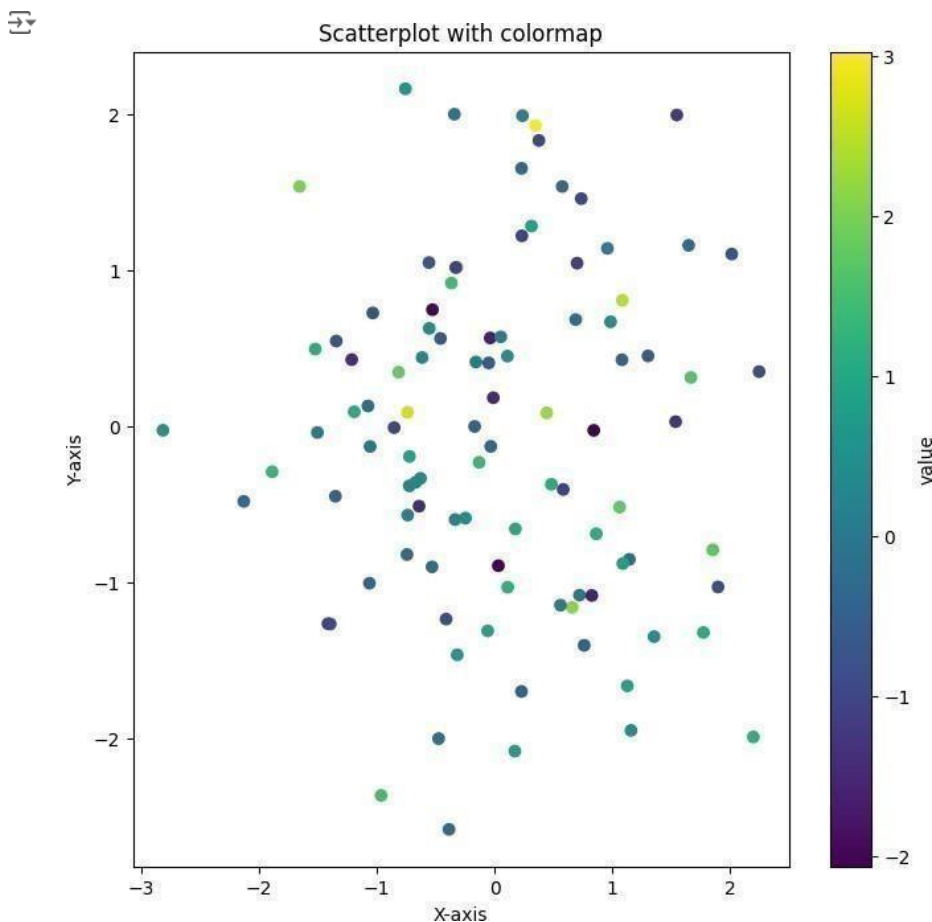
```
import pandas as pd import numpy as np
np print(np.random.randn(100))
```

```
[-1.65970274e-01 -3.26301492e-01 -6.97091694e-01 5.29185683e-01 1.65900203e-01
 2.57310809e-01 1.87945887e-01 -1.47856355e+00
 1.85465880e+00 -5.74773399e-02 -7.28047219e-01 1.43513290e+00 1.16276640e-
 01 3.62925427e-01 2.27296732e-01 -4.68725785e-01
 -7.20465601e-01 2.31190101e-01 5.47647007e-01 6.14310198e-01
 -2.88178116e-01 -2.59650445e-01 7.14726089e-02 2.91407763e-01 7.44199514e-01
 1.03744520e+00 5.19583750e-02 -1.22315192e+00
 2.82553552e-01 9.27484581e-01 4.68496647e-01 3.97669795e-01
 -6.15495640e-01 -3.59199216e-01 1.45247374e-01 -1.61267440e-01
 -1.08796055e+00 2.03942727e-01 1.33177945e-03 7.08911052e-01 1.92045492e+00
 1.06460553e+00 9.71054014e-01 8.14301945e-01
 1.01645092e-01 -9.38076692e-02 1.33631841e+00 2.55274328e-01
 -5.17379367e-01 -1.71773916e+00 9.24194703e-01 1.67657214e-01]
```

```

-1.72214971e+00 4.27042698e-01 -1.20346437e+00 2.83589309e-01 1.21334367e+00
4.14428011e-02 -1.48913563e+00 4.39560682e-01
-8.90366916e-01 -9.11298844e-01 3.62446399e-01 5.87632377e-01 1.22152619e+00
7.44396580e-01 1.75575979e+00 3.12178887e-01
-3.40512410e-01 -1.01818680e+00 4.62977518e-02 2.30443390e-01 -3.96879315e-
01 1.20713778e+00 -1.20064064e+00 -9.12708432e-01 9.06172668e-01
7.05249075e-02 -9.42170303e-01 -8.52966288e-01
1.96198904e+00 3.61012540e-02 9.66762176e-01 -4.97875528e-01
2.78681896e-01 -1.16708383e+00 7.39087305e-01 1.27038245e+00
7.81304235e-01 -4.62440127e-01 1.00117969e+00 -9.07298230e-02
-1.95950298e-01 1.59291286e+00 -1.22572212e+00 -4.62563405e-01 5.41920487e-01
7.41261996e-01 1.42219990e+00 -9.65150475e-01] import
pandas as pd import numpy as np import
matplotlib.pyplot as plt
#sample dataframe with multiple columns
data=pd.DataFrame({"x":np.random.randn(100),"y":np.random.randn(100),"value":np.random.
ran dn(100)}) #define the colormap and alpha values cmap="viridis" alpha=1 #create the
scatterplot plt.figure(figsize=(8,8))
plt.scatter(data["x"],data["y"],c=data["value"],cmap=cmap,alpha=alpha) #customize the
plot(optional)
plt.xlabel("X-axis") plt.ylabel("Y-axis")
plt.title("Scatterplot with colormap") plt.colorbar(label="value") #show
the plot plt.show()

```



LABSHEET-9 HEATMAPS

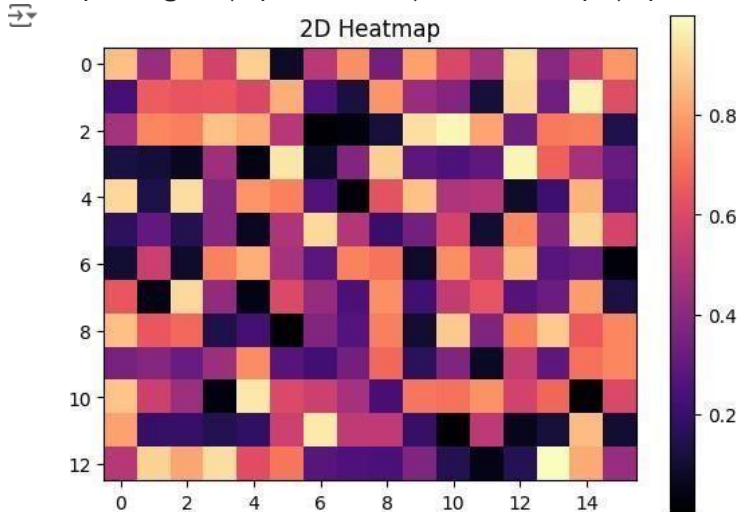
```

import numpy as np      import matplotlib.pyplot as plt data=
np.random.random((13,16))

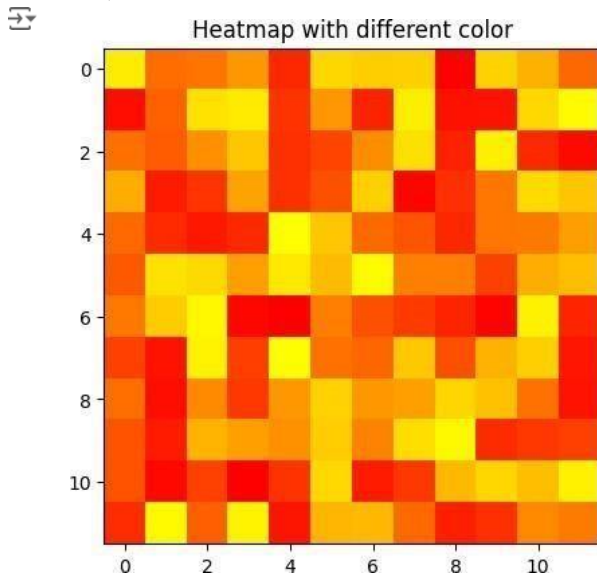
```



```
plt.imshow(
data,cmap="magma") plt.title("2D Heatmap") plt.colorbar() plt.show()
```



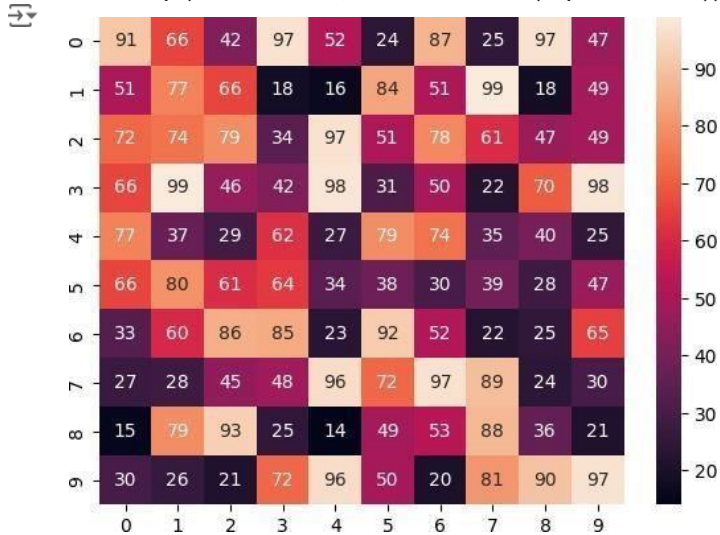
```
import numpy as np import matplotlib.pyplot as plt
data=np.random.random((12,12)) plt.imshow(data, cmap='autumn')
plt.title("Heatmap with different color") plt.show()
```



```
import numpy as np import seaborn as sns import matplotlib.pyplot
as plt data=
np.random.randint(low=14,high=100, size=(10,10))
hm=sns.heatmap(data=data, annot=True) plt.show()
```



```
import pandas as pd
import numpy as np
df=pd.read_csv('/content/train.csv')
df= np.random.randint(low=55, high=60, size=(8,8))
hm=sns.heatmap(data=df, annot=True) plt.show()
```



LABSHEET-10 SEABORN COLOR PALETTES

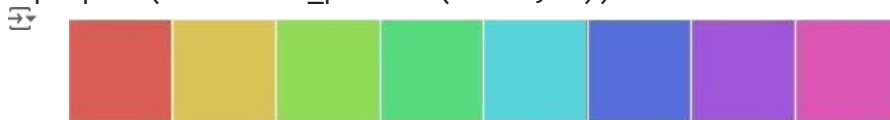
```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
%matplotlib inline
sns.set(rc={"figure.figsize": (6,6)})
```

BUILDING COLOR PALETTES

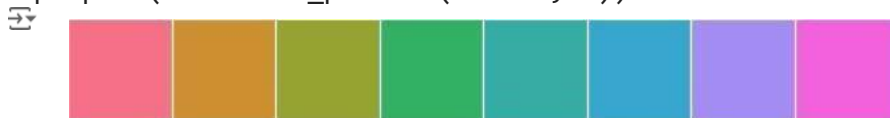
```
current_palette = sns.color_palette()
sns.palplot(current_palette)
```



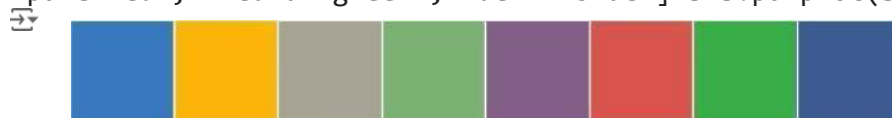
```
sns.palplot(sns.color_palette("hls", 8))
```



```
sns.palplot(sns.color_palette("husl", 8))
```



```
sample_colors = ["windows blue", "amber", "greyish", "faded green", "dusty purple", "pale red", "medium green", "denim blue"]
sns.palplot(sns.xkcd_palette(sample_colors))
```



```
sns.palplot(sns.color_palette("cubehelix", 8))
```



```
sns.palplot(sns.cubehelix_palette(8))
```

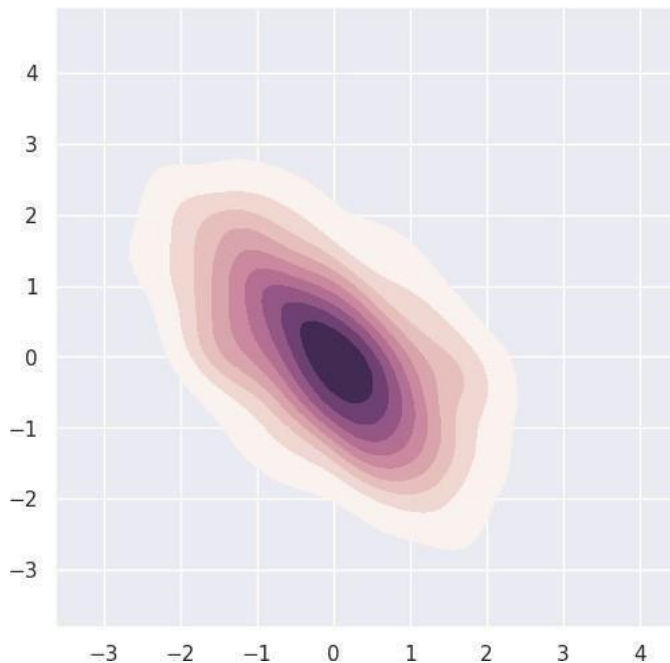


```
x,y =
np.random.multivariate_normal([0,0], [[1,-.5],[-.5,1]], size=300).T
sample_cmap =
sns.cubehelix_palette(light=1, as_cmap=True)
sns.kdeplot(x=x,y=y,cmap=sample_cmap,
shade=True)  <ipython-input-16-534ef71d14c3>:3:
```

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(x=x,y=y,cmap=sample_cmap,
shade=True) <Axes: >
```

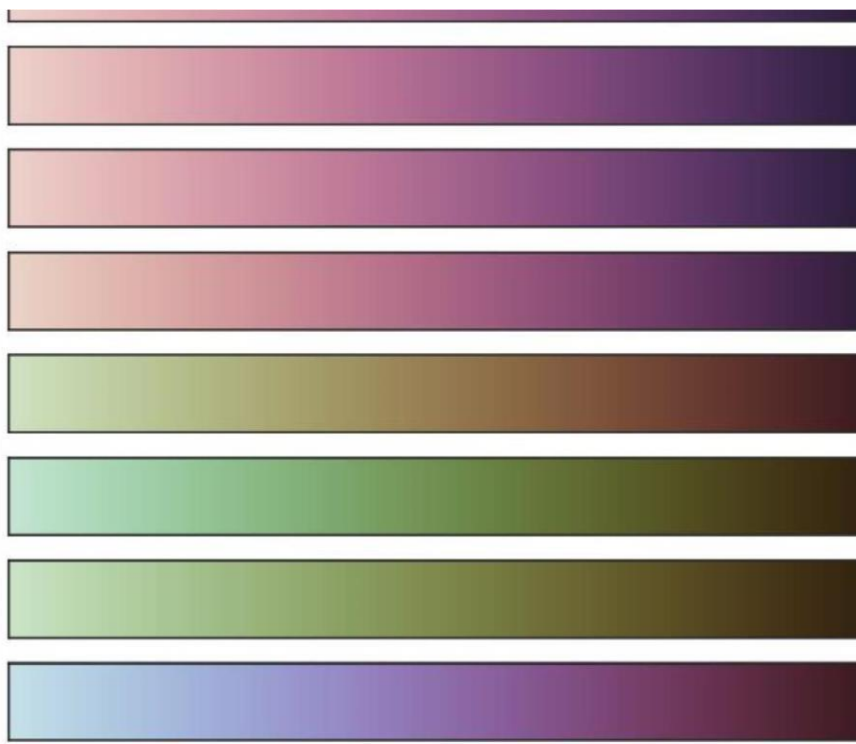


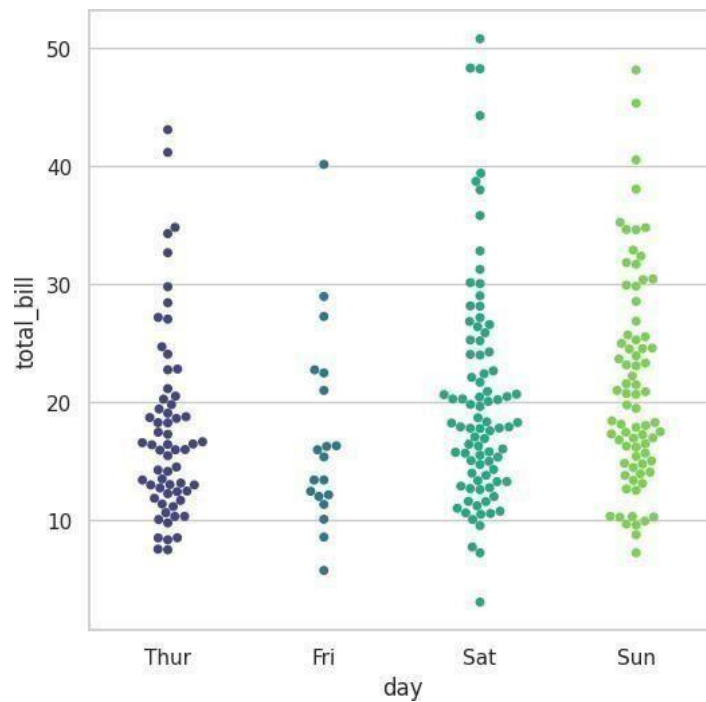
```
sns.choose_cubehelix_palette(as_cmap=True)
```



```
sns.set_style('whitegrid')
sns.swarmplot(x="day", y="total_bill", data=tips, palette="viridis")
```

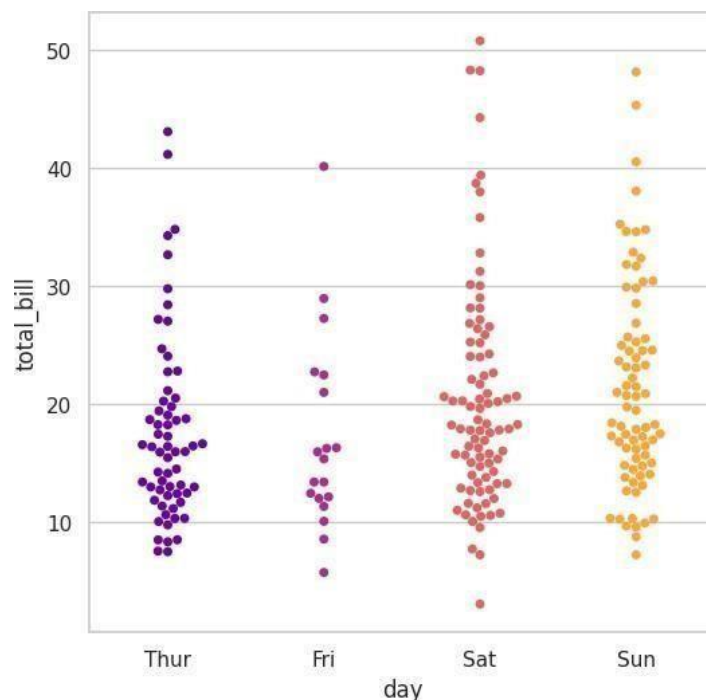
[↗](#) <ipython-input231576c2e5eda7>:2: FutureWarning:
 Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
 Assign the `x` variable to `hue` and set `l`
 sns.swarmplot(x="day", y="total_bill", data=tips, palette="viridis")
 <Axes: xlabel='day', ylabel='total_bill'>





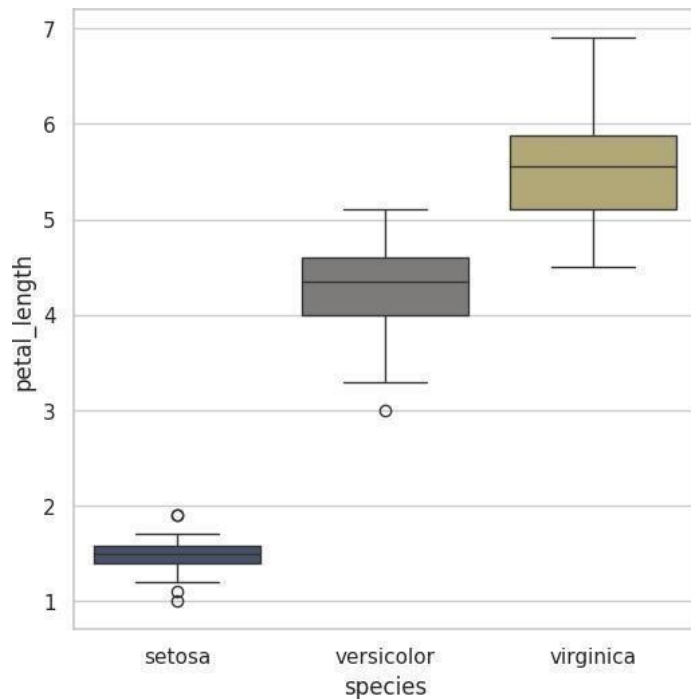
```
sns.set_style('whitegrid') sns.swarmplot(x="day", y="total_bill", data=tips,
palette="plasma")
```

<ipython-input-248931cda8de8a>:2: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l`
sns.swarmplot(x="day", y="total_bill", data=tips, palette="plasma")
<Axes: xlabel='day', ylabel='total_bill'>

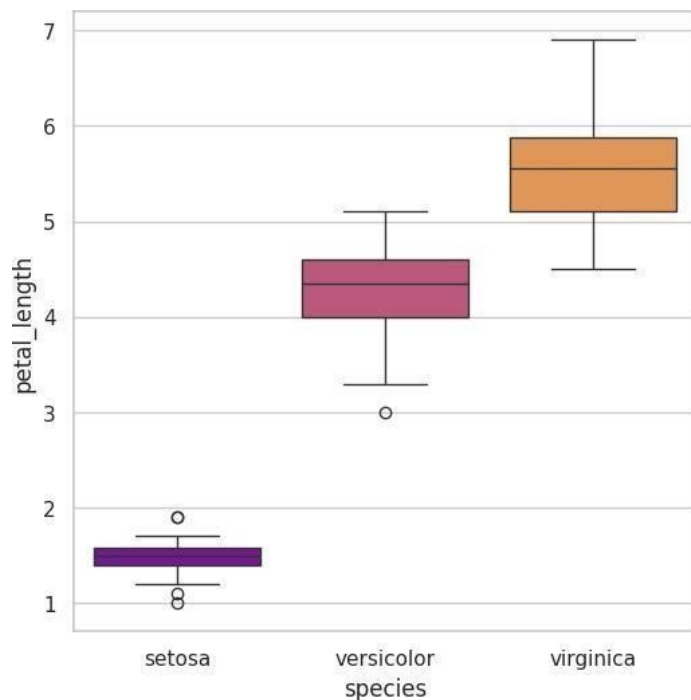


```
iris = sns.load_dataset("iris") sns.boxplot(x="species", y="petal_length",
data=iris, palette="cividis")
```

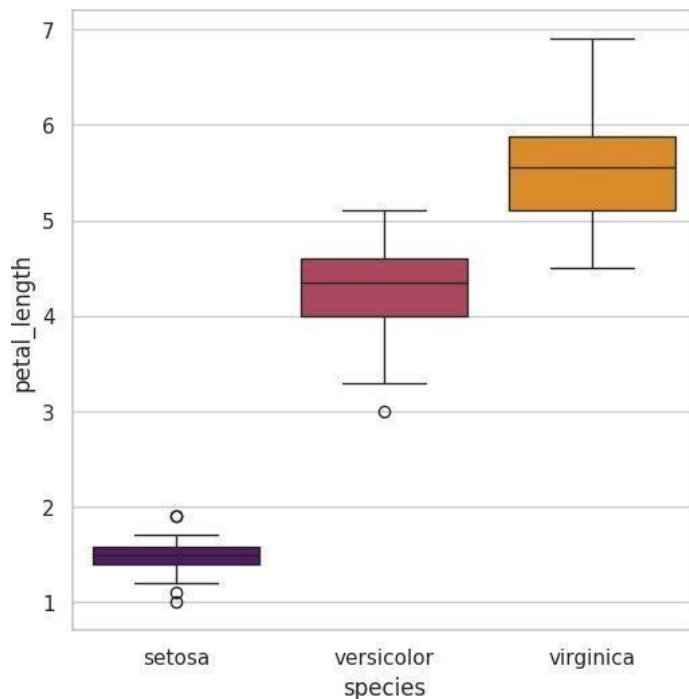
<ipythoninput-26-cc37ff1b7cba>:2: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l`
sns.boxplot(x="species", y="petal_length", data=iris, palette="cividis")
<Axes: xlabel='species', ylabel='petal_length'>



```
iris = sns.load_dataset("iris")  sns.boxplot(x="species", y="petal_length",
data=iris, palette="plasma")  <ipythoninput-27-0b4fe890c1f3>:2: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l sns.boxplot(x="species", y="petal_length",
data=iris, palette="plasma")
<Axes: xlabel='species', ylabel='petal_length'>
```



```
iris = sns.load_dataset("iris")  sns.boxplot(x="species", y="petal_length",
data=iris, palette="inferno")  <ipythoninput-28-e860428b94f7>:2: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l sns.boxplot(x="species", y="petal_length",
data=iris, palette="inferno")
<Axes: xlabel='species', ylabel='petal_length'>
```



```
iris = sns.load_dataset("iris")
sns.boxplot(x="species", y="petal_length", data=iris, palette="magma")
<ipython-input29-ebb177fa7cb5>:2: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l
sns.boxplot(x="species", y="petal_length", data=iris, palette="magma")
<Axes: xlabel='species', ylabel='petal_length'>
```

LABSHEET-11 MULTIVARIATE VISUALIZATION

Relational plots: relation b/w two variables
categorical plots: categorical values are displayed

distribution plots: examining univariate and bivariate distributions
matrix plots: array of scatterplots

Regression plots: emphasize patterns in dataset during exploratory data

analysis

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

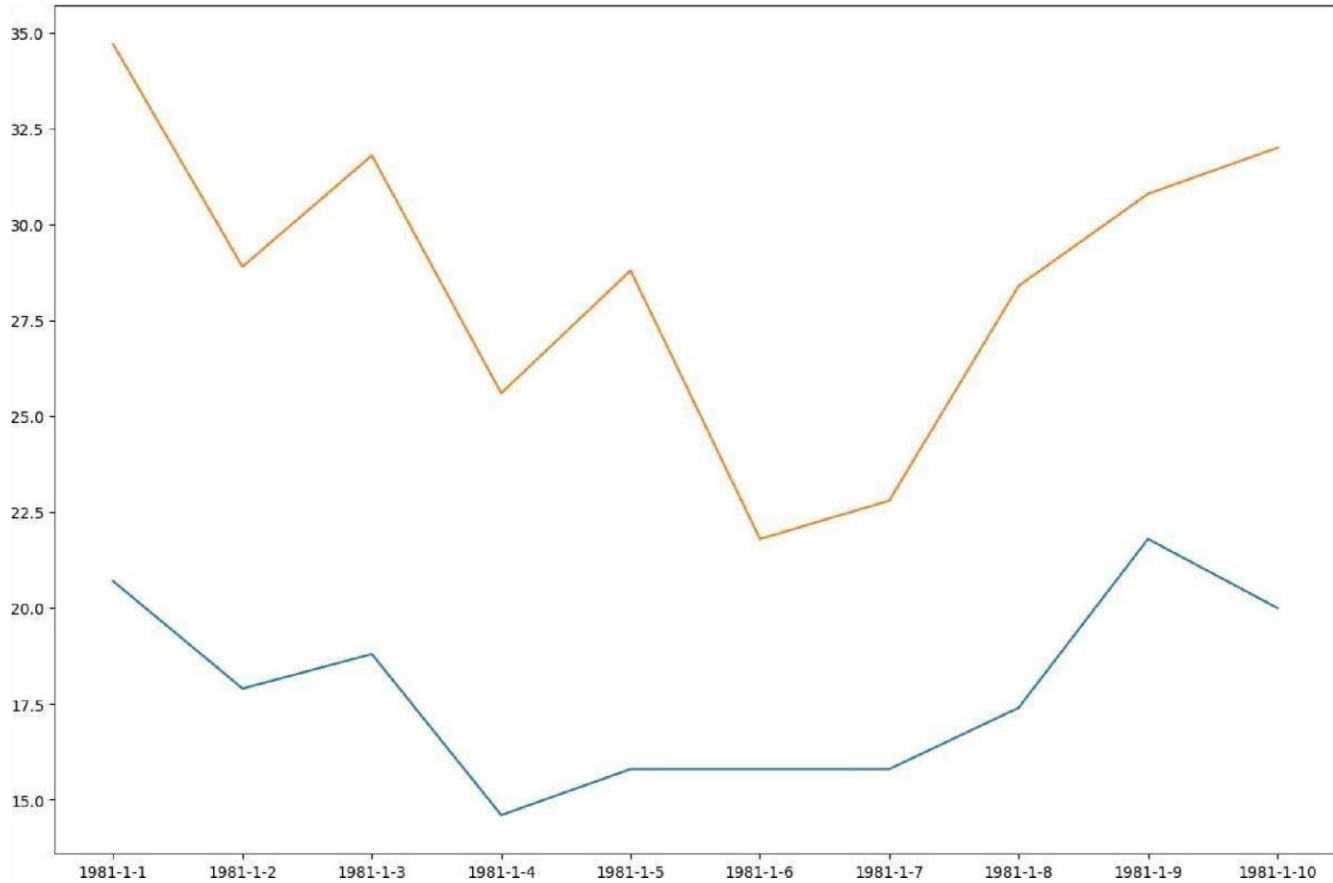
```
from matplotlib.pyplot import figure
import seaborn as sns %matplotlib
```

```
inline
```

```
dates = ['1981-1-1', '1981-1-2', '1981-1-3', '1981-1-4', '1981-1-5', '1981-1-6', '1981-1-7', '1981-1-8', '1981-1-9', '1981-1-10']
min_temperature = [20.7, 17.9, 18.8, 14.6, 15.8, 15.8, 15.8, 17.4, 21.8, 20.0]
max_temperature = [34.7, 28.9, 31.8, 25.6, 28.8, 21.8, 22.8, 28.4, 30.8, 32.0]
fig, axes = plt.subplots(nrows=1, ncols=1, figsize=(15, 10))
axes.plot(dates, min_temperature, label='Min temperature')
```

```
def legend(*args, **kwargs)
/usr/local/lib/python3.10/dist-packages/matplotlib/axes/_axes.py
Place a legend on the Axes.
```

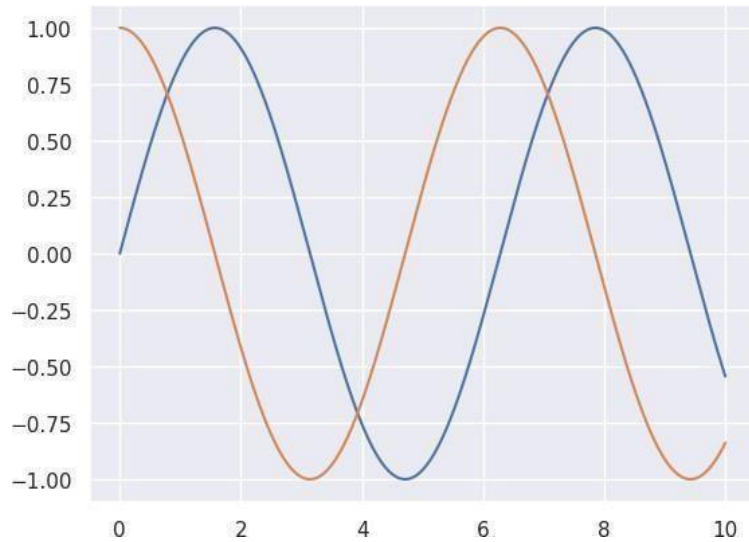
```
Call signatures::
```



```
axes.plot(dates,max_temperature, label='Max temperature') axes.legend
matplotlib.axes._axes.Axes.legend sns.set()
```



```
x = np.linspace(0,10,1000) plt.plot(x,
np.sin(x), x, np.cos(x))
↳ [<matplotlib.lines.Line2D at 0x7e3acaaaffa0>,
<matplotlib.lines.Line2D at 0x7e3acaae0040>]
```



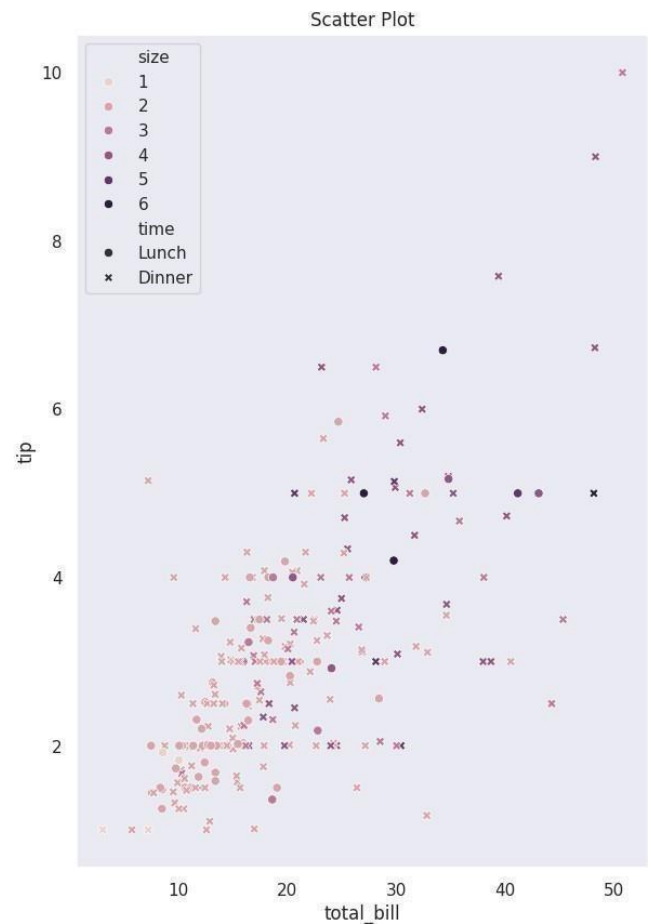
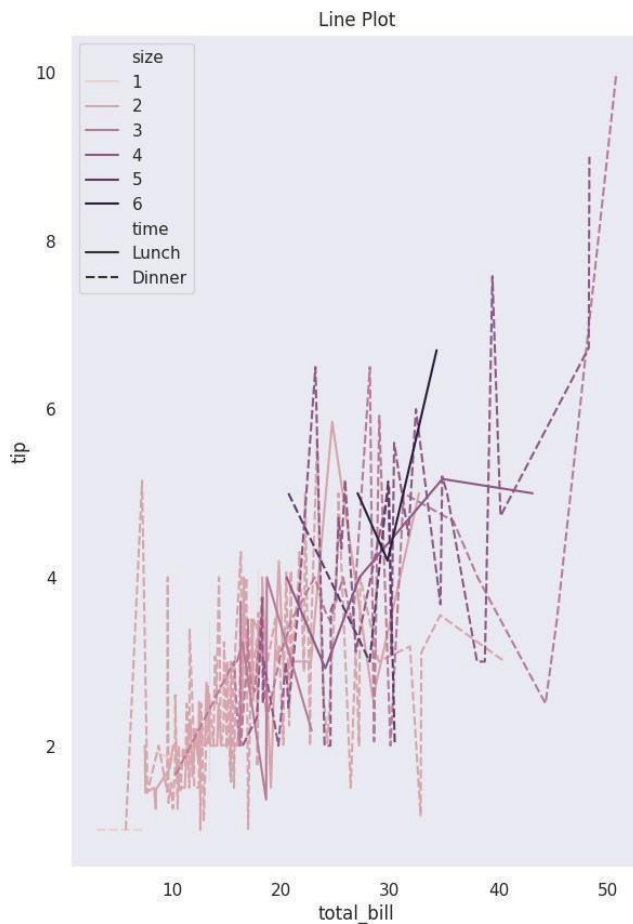
```
sns.set(style="dark")
fig, ax = plt.subplots(ncols=2, nrows=1, figsize=(15,10)) df= sns.load_dataset("tips")

print(df.head())
sns.lineplot(x="total_bill", y="tip", hue="size", style=
"time", data=df,ax=ax[0]).set_title("Line Plot")
sct_plt = sns.scatterplot(x="total_bill", y="tip", hue="size", style="time", data=df,
ax=ax[1]).set_title("Scatter Plot") sct_plt.figure.savefig('Scatter_plot1.png')
print('Plot Saved')
```


```
↳ total_bill tip sex smoker day time size
```

```
16.99 1.01 Female      No Sun Dinner    2
10.34 1.66      Male    No Sun Dinner    3
21.01 3.50      Male    No Sun Dinner    3
23.68 3.31      Male    No Sun Dinner    2
24.59 3.61 Female      No Sun Dinner    4
```

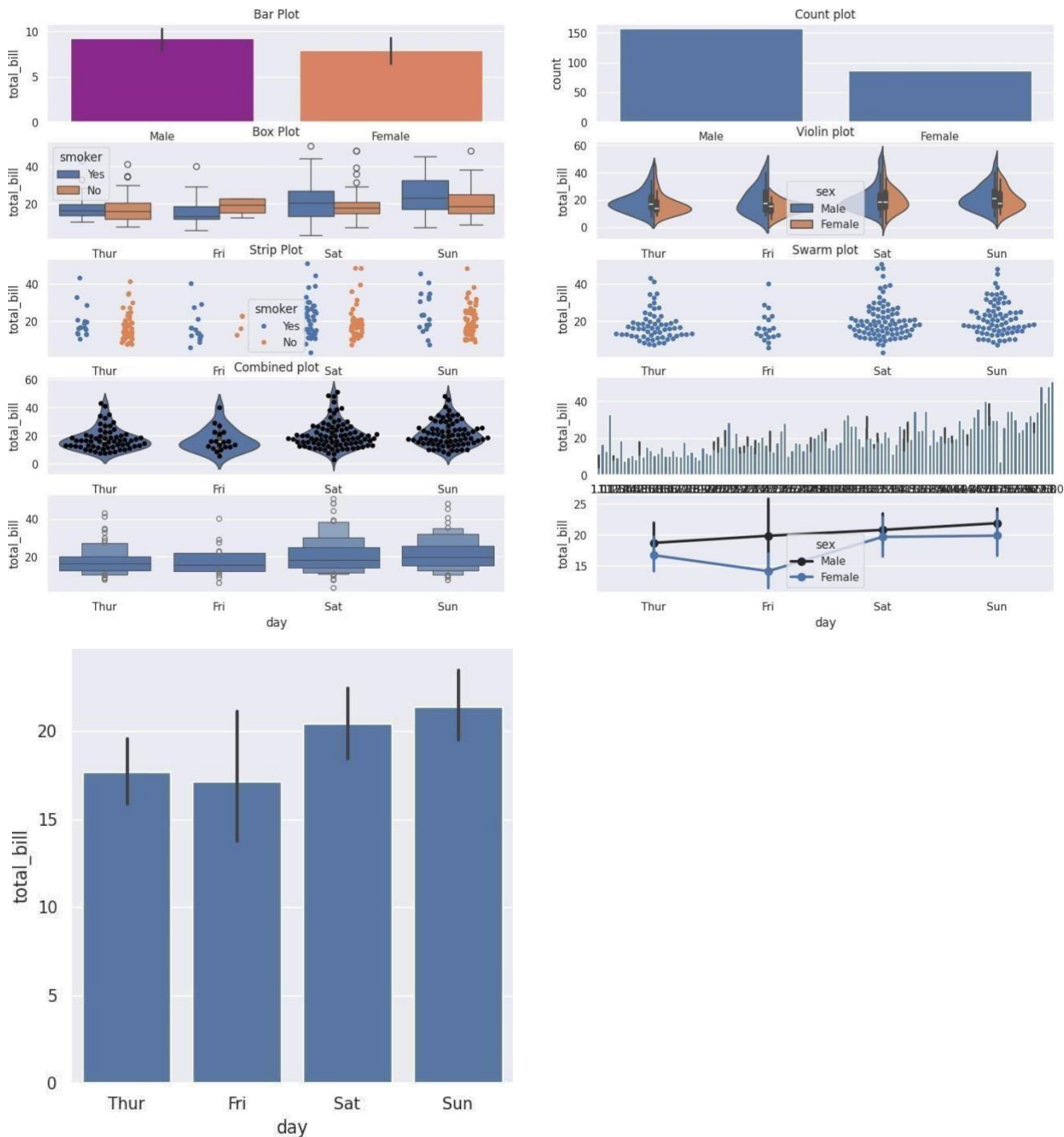
Plot Saved



```
sns.set_style('darkgrid')
fig, ax = plt.subplots(nrows=5, ncols=2) fig.set_size_inches(18.5, 10.5)
df=sns.load_dataset('tips')
sns.barplot(x='sex', y='total_bill', data=df, palette='plasma', estimator=
np.std, ax=ax[0,0]).set_title('Bar Plot') sns.countplot(x='sex', data=df,
ax=ax[0,1]).set_title('Count plot')
sns.boxplot(x='day', y='total_bill', data=df, hue='smoker',
ax=ax[1,0]).set_title('Box Plot')
sns.violinplot(x='day', y='total_bill', data=df, hue='sex', split= True,
ax=ax[1,1]).set_title('Violin plot')
sns.stripplot(x='day', y='total_bill', data=df, jitter= True, hue='smoker',
dodge=True, ax=ax[2,0]).set_title('Strip Plot') sns.swarmplot(x='day', y='total_bill',
data=df, ax=ax[2,1]).set_title('Swarm plot')
sns.violinplot(x='day', y='total_bill', data=df, ax=ax[3,0])
sns.swarmplot(x='day',y='total_bill',data=df, color='black',
ax=ax[3,0]).set_title('Combined plot') sns.barplot(x='tip',y='total_bill', data=df,
ax=ax[3,1])
```

```
sns.boxenplot(x="day", y="total_bill", color="b", scale="linear", data=df, ax=ax[4,0])
sns.pointplot(x="day", y="total_bill", color="b", hue="sex", data=df, ax=ax[4,1])
sns.catplot(x='day',y='total_bill',data=df, kind='bar')  <ipython-
input679e72dcff921>:7: FutureWarning:
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0.
Assign the `x` variable to `hue` and set `l sns.barplot(x='sex', y='total_bill', data=df,
palette='plasma', estimator= np.std, ax=ax[0,0]).set_title('Bar Plot') <ipython-
input679e72dcff921>:24: FutureWarning:
```

```
The `scale` parameter has been renamed to `width_method` and will be removed in
v0.15. Pass `width_method='linear' for the same eff sns.boxenplot(x="day",
y="total_bill", color="b", scale="linear", data=df, ax=ax[4,0]) <ipython-input-6-
79e72dcff921>:26: FutureWarning:
Setting a gradient palette using color= is deprecated and will be removed in v0.14.0. Set
`palette='dark:b'` for the same effect. sns.pointplot(x="day", y="total_bill", color="b",
hue="sex", data=df, ax=ax[4,1])
<seaborn.axisgrid.FacetGrid at 0x7e3ac3b802e0>
```



```
sns.set_style('whitegrid')
```

```
#loading the dataset directly without any files df=sns.load_dataset('iris')
print(df.head())
```

```
sepal_length sepal_width petal_length
petal_width species
```

```
0 5.1 3.5 1.4 0.2 setosa
```

```
1 4.9 3.0 1.4 0.2 setosa
```

```
2 4.7 3.2 1.3 0.2 setosa
```

```
3 4.6 3.1 1.5 0.2 setosa
```

```
4 5.0 3.6 1.4 0.2 setosa
```

```
sns.distplot(df['petal_length'], kde=True,
color='red', bins=30).set_title('Dist plot')
```

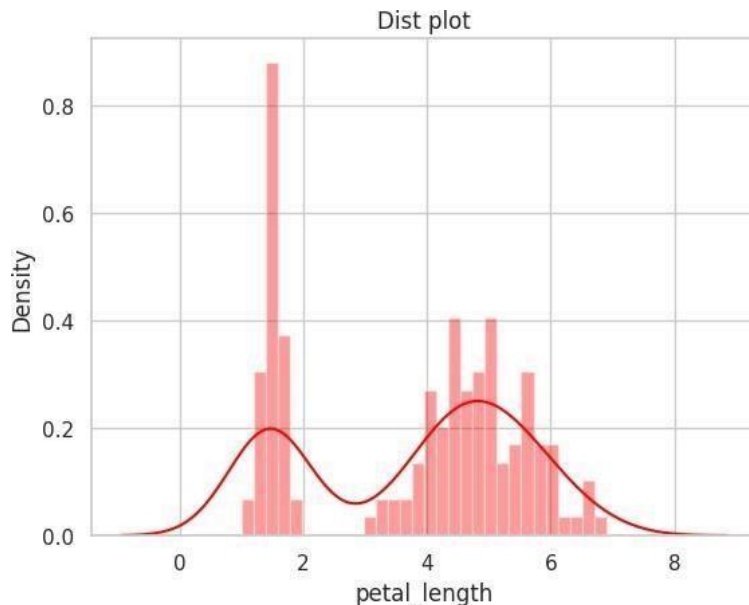
```
UserWarning:
```

``distplot`` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either ``displot`` (a figure-level function with similar flexibility) or ``histplot`` (an axes-level function for histograms). For a guide to updating your code to use the new functions, please see

<https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751>

```
sns.distplot(df['petal_length'], kde=True, color='red', bins=30).set_title('Dist plot')
Text(0.5, 1.0, 'Dist plot')
```



```
jointgrid = sns.JointGrid(x='petal_length', y='petal_width',
data=df) jointgrid.plot_joint(sns.scatterplot)
jointgrid.plot_marginals(sns.distplot)
/usr/local/lib/python3.10/dist-packages/seaborn/axisgrid.py:1886:
UserWarning:
```



``distplot`` is a deprecated function and will be removed in seaborn v0.14.0.

Please adapt your code to use either ``displot`` (a figure-level function with similar flexibility) or ``histplot`` (an axes-level function for histograms). For a guide to updating your code to use the new functions, please see

<https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751> func(self.x,

```
**orient_kw_x,
**kwargs)
```

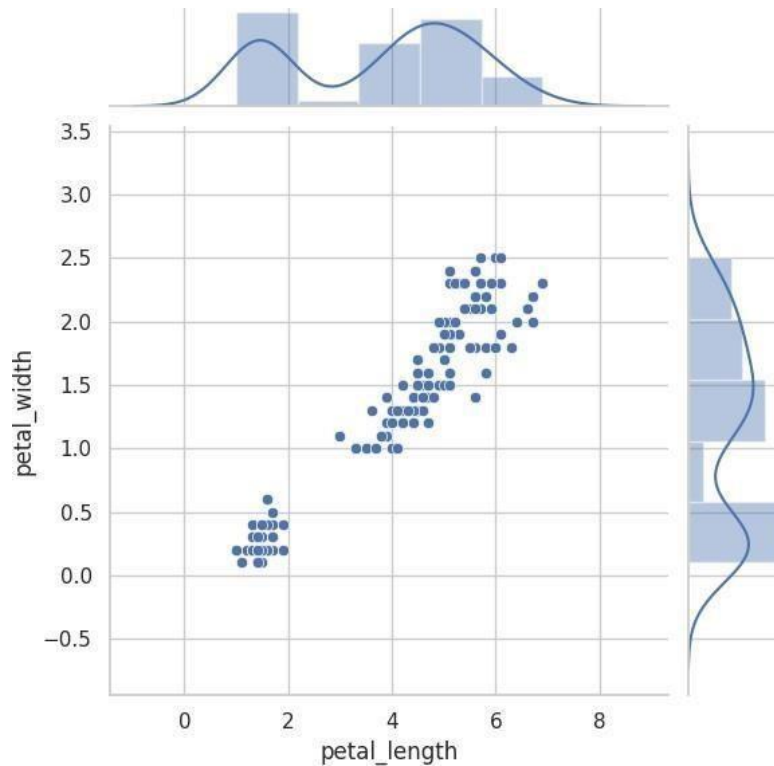
```
/usr/local/lib/python3.10/dist-packages/seaborn/axisgrid.py:1892: UserWarning:
```

``distplot`` is a deprecated function and will be removed in seaborn v0.14.0.

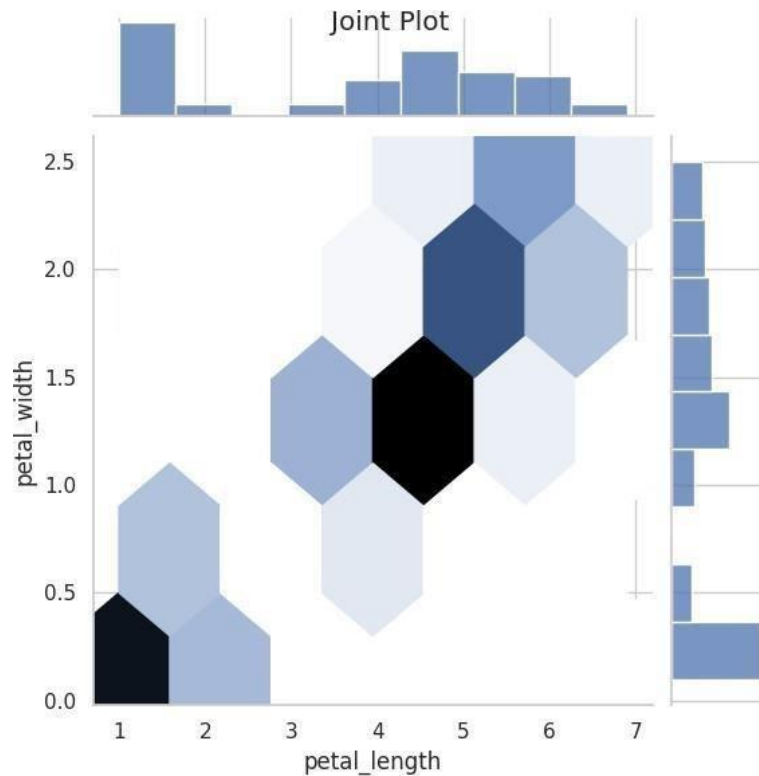
Please adapt your code to use either ``displot`` (a figure-level function with similar flexibility) or ``histplot`` (an axes-level function for histograms). For a guide to updating your code to use the new functions, please see

<https://gist.github.com/mwaskom/de44147ed2974457ad6372750bbe5751>

```
func(self.y, **orient_kw_y, **kwargs)
<seaborn.axisgrid.JointGrid at 0x7e3b00f8d120>
```



```
g=sns.jointplot(x='petal_length', y= 'petal_width', data=df,
kind='hex') g.fig.suptitle('Joint Plot') Text(0.5, 0.98, 'Joint Plot')
```

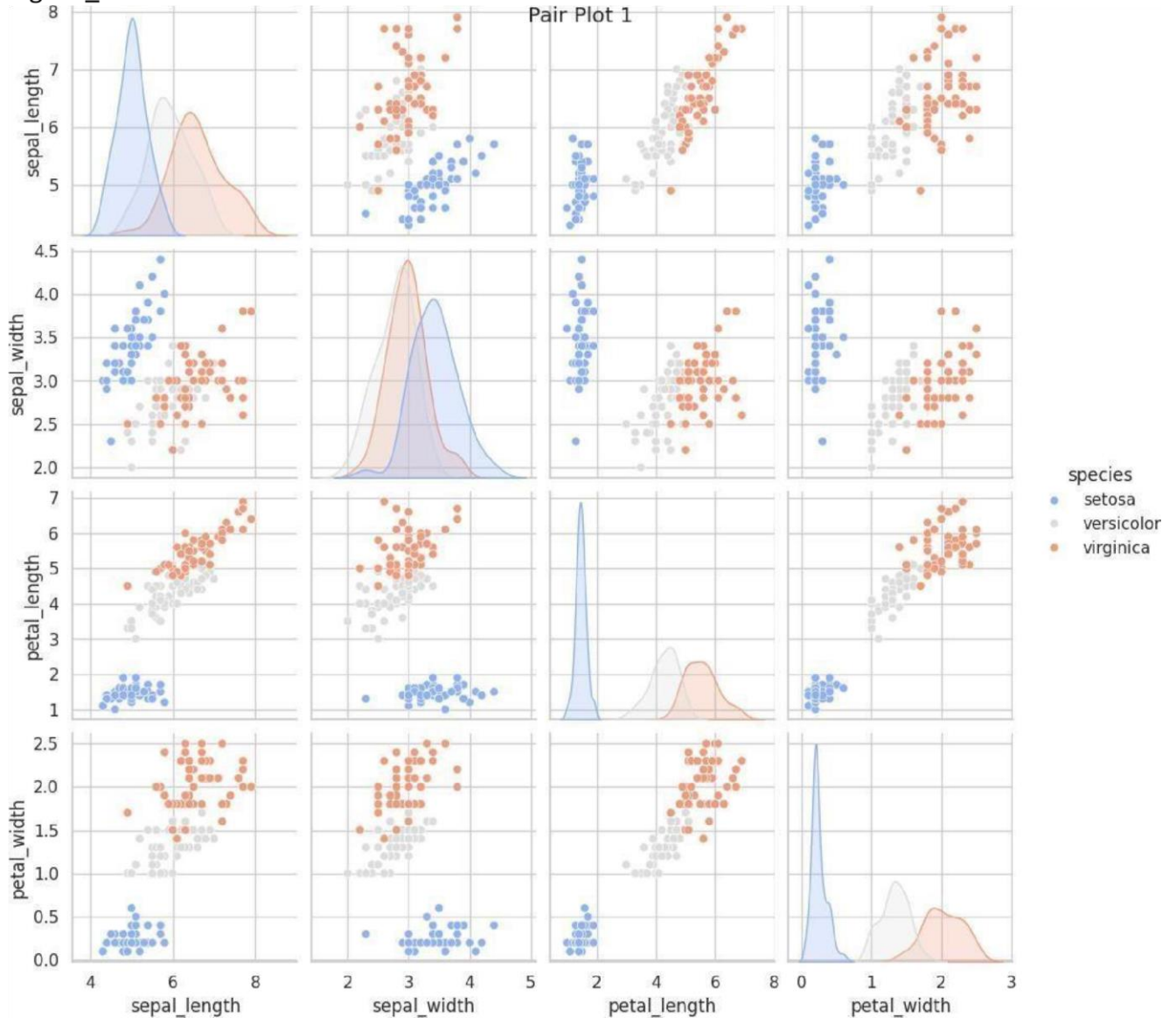


```
g=sns.pairplot(df, hue="species", palette= 'coolwarm') g.fig.suptitle("Pair Plot 1")
g.add_legend
```

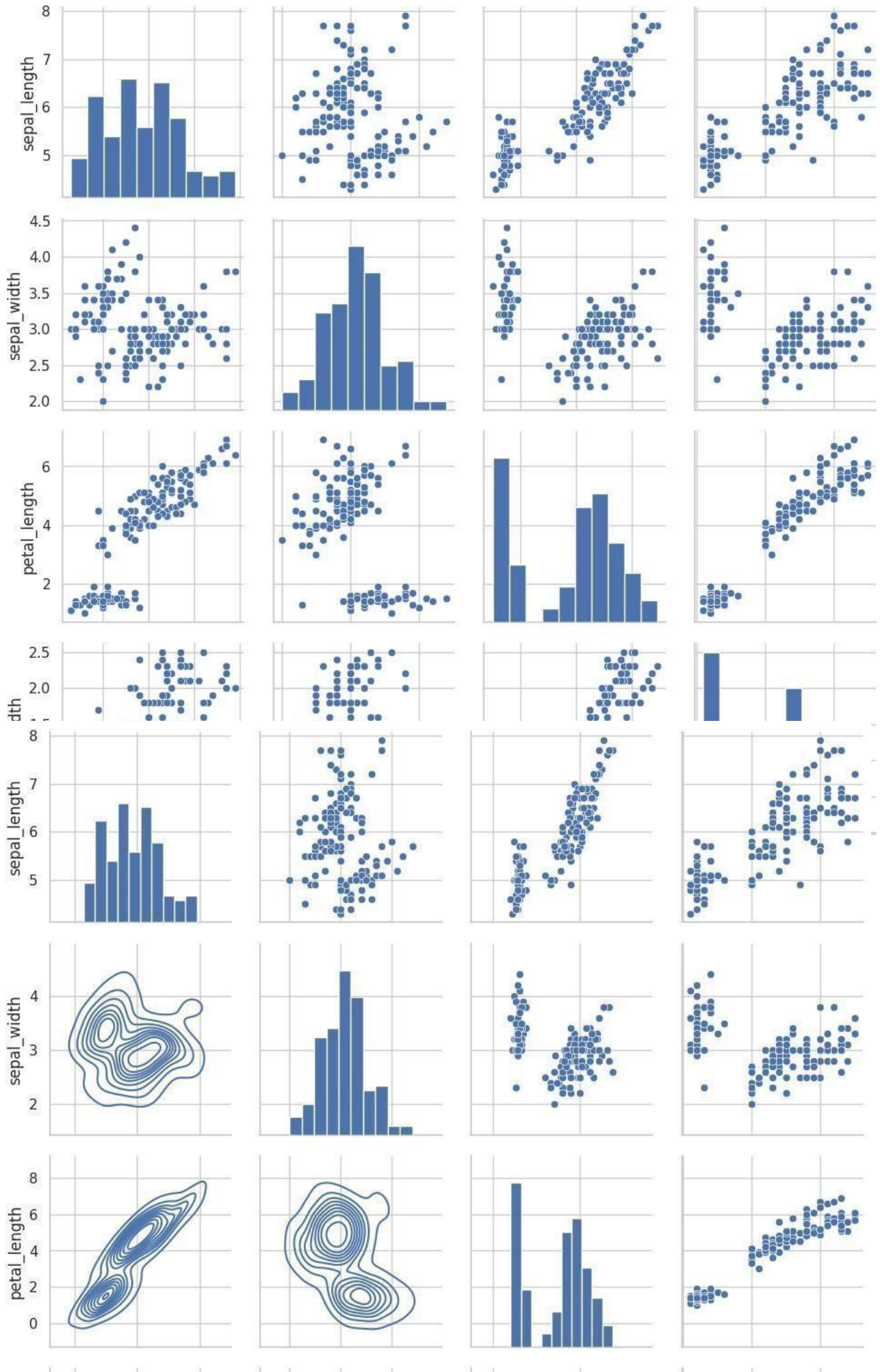
```
seaborn.axisgrid.Grid.add_legend
def add_legend(legend_data=None, title=None, label_order=None,
adjust_subtitles=False, **kwargs)
/usr/local/lib/python3.10/dist-packages/seaborn/axisgrid.py
Draw a legend, maybe placing it outside axes and resizing the
figure.
```

Parameters

legend_data : dict



```
pairgrid= sns.PairGrid(data=df)
pairgrid= pairgrid.map_offdiag(sns.scatterplot) pairgrid= pairgrid.map_diag(plt.hist)
pairgrid = sns.PairGrid(data=df) pairgrid =
pairgrid.map_upper(sns.scatterplot) pairgrid =
pairgrid.map_diag(plt.hist) pairgrid = pairgrid.map_lower(sns.kdeplot)
```

LABSHEET-12 TEXT VISUALIZATION

```
import pandas as pd
import matplotlib.pyplot as plt from wordcloud import WordCloud from wordcloud import
STOPWORDS
df= pd.read_csv('/content/netflix_titles.csv', usecols=['cast'])
df.head()
↳
```

```
cast
NaN
Ama Qamata, Khosi Ngema, Gail Mababane, Thaban... Sami
Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
NaN
Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
```

```
ndf=df.dropna()
ndf.head()
↳
cast
```

```
Ama Qamata, Khosi Ngema, Gail Mababane, Thaban...
Sami Bouajila, Tracy Gotoas, Samuel Jouy, Nabi...
Mayur More, Jitendra Kumar, Ranjan Raj, Alam K...
Kate Siegel, Zach Gilford, Hamish Linklater, H...
Vanessa Hudgens, Kimiko Glenn, James Marsden, ...
```

```
text= " ".join(item for item in ndf['cast']) print(text)
↳ Ama Qamata, Khosi Ngema, Gail Mababane, Thabang Molaba, Dillon Windvogel, Natasha
Thahane, Arno Greeff, Xolile Tshabalala, Getmore
```

```
stopwords =
set(STOPWORDS)
```

```
wordcloud = WordCloud(background_color="White").generate(text) plt.imshow(wordcloud,
interpolation= 'bilinear') plt.axis("off")
plt.margins(x=0, y=0) plt.show()
```



```
wordcloud = WordCloud(background_color="White", max_words=100, max_font_size=300, width=
800, height=500, colormap="magma").generate(text) plt.figure(figsize=(20,20))
```



A time series is the series of data points listed in time order.
A time series is a sequence of successive equal interval points in time.
A time-series analysis consists of methods for analyzing time series data in order to extract meaningful insights and other useful characteristics of data. For performing time series analysis download stock data.csv

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

```
# reading the dataset using read_csv
df = pd.read_csv("/content/stock_data.csv", parse_dates=True, index_col="Date")
# displaying the first five rows of dataset df.head()
High Low Close Volume Name
Date
```

2006-01-03	39.69	41.22	38.79	40.91	24232729	AABA		
2006-01-04	41.22	41.90	40.77	40.97	20553479	AABA		
2006-01-05	40.93	41.73	40.85	41.53	12829610	AABA		
2006-01-06	42.88	43.57	42.80	43.21	29422828	AABA	2006-01-09	43.10 43.66
	42.82	43.42	16268338	AABA				

Next steps:

Generate code with `df`

[View recommended plots](#)

We have used the 'parse_dates' parameter in the read_csv function to convert the 'Date' column to the DatetimeIndex format. By default, Dates are stored in string format which is not the right format for time series data analysis.

Now, removing the unwanted columns from dataframe i.e. 'Unnamed: 0'.

```
# deleting column
df=df.drop(columns='Name') print(df)
```

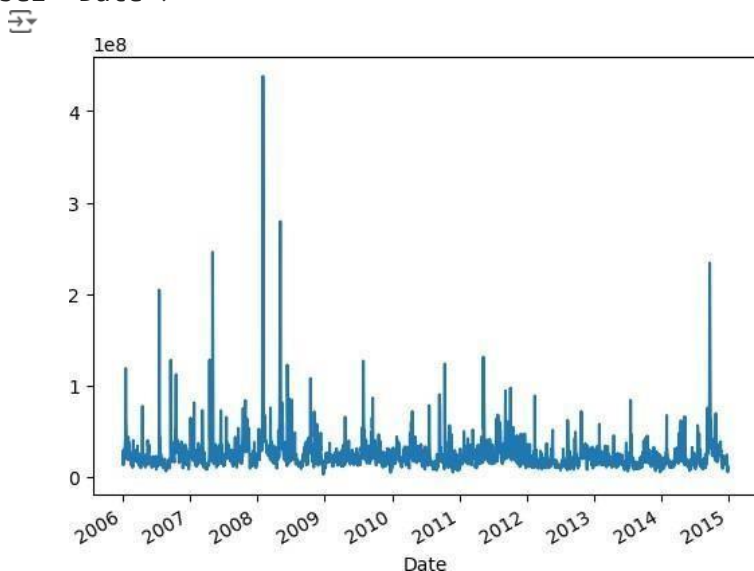
```

Open High      Low Close  Volume
Date
2006-01-03 39.69 41.22 38.79 40.91 24232729
2006-01-04 41.22 41.90 40.77 40.97 20553479
2006-01-05 40.93 41.73 40.85 41.53 12829610
2006-01-06 42.88 43.57 42.80 43.21 29422828
2006-01-09 43.10 43.66 42.82 43.42 16268338
...
2014-12-23 51.46 51.46 49.93 50.02 15514036
2014-12-24 50.19 50.92 50.19 50.65 5962870
2014-12-26 50.65 51.06 50.61 50.86 5170048
2014-12-29 50.67 51.01 50.51 50.53 6624489 2014-12-30 50.35
51.27 50.35 51.22 10703455
```

[2263 rows x 5 columns]

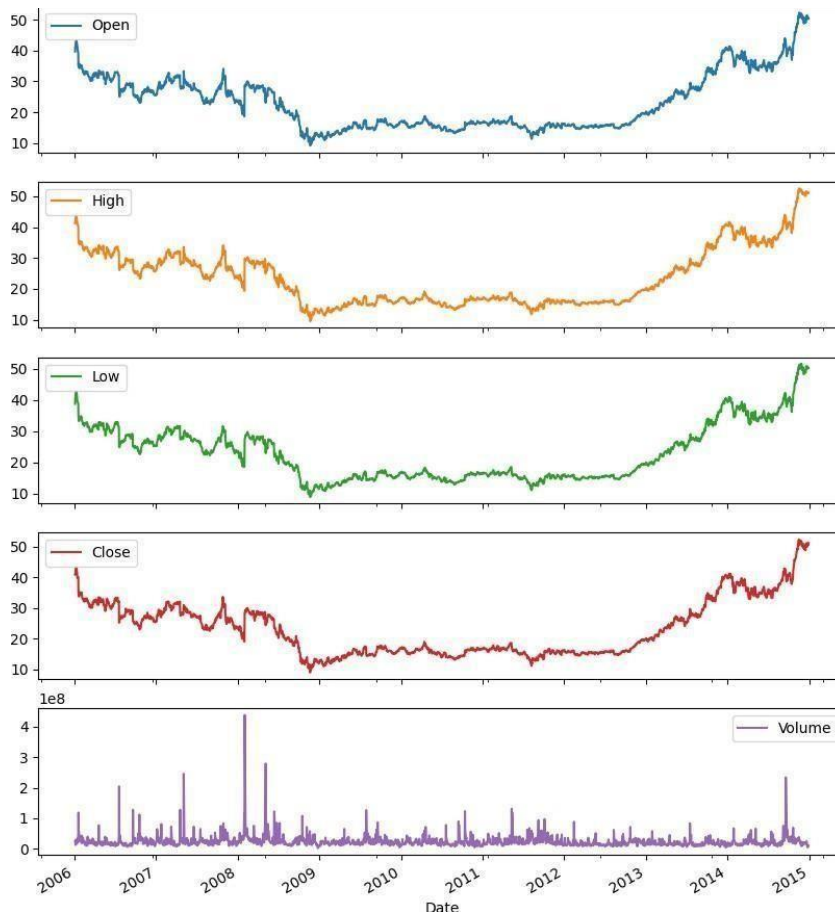
Example 1: Plotting a simple line plot for time series data.

```
df['Volume'].plot()
<Axes:
xlabel='Date'>
```



Example 2: Now let's plot all other columns using subplot.

```
df.plot(subplots=True, figsize=(10, 12))
array([<Axes: xlabel='Date'>,
<Axes: xlabel='Date'>,
<Axes: xlabel='Date'>, <Axes: xlabel='Date'>,
<Axes: xlabel='Date'>], dtype=object)
```



Resampling: Resampling is a methodology of economically using a data sample to improve the accuracy and quantify the uncertainty of a population parameter. Resampling for months or weeks and making bar plots is another very simple and widely used method of finding seasonality. Here we are going to make a bar plot of month data for 2016 and 2017. Example 3:

```
# Resampling the time series data based on monthly 'M' frequency df_month
= df.resample("M").mean() print(df_month)
```

```
# using subplot
fig, ax = plt.subplots(figsize=(10, 6))
```

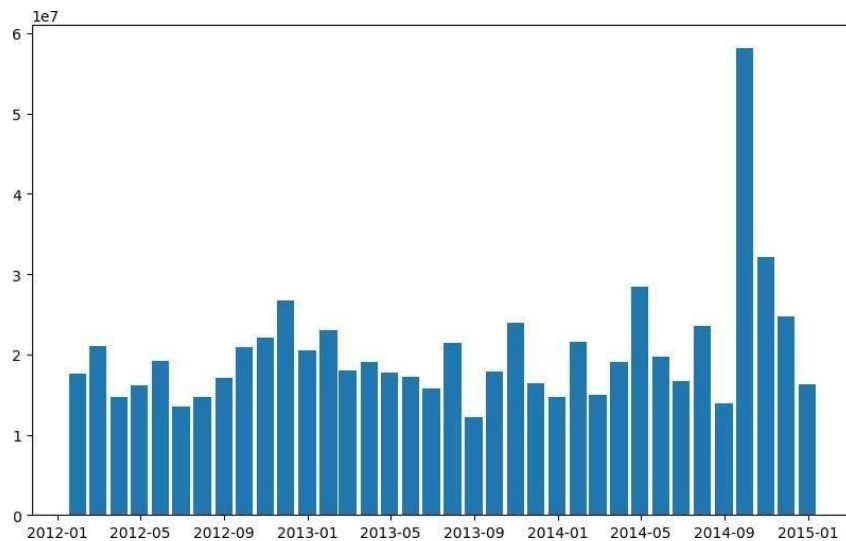
```
# plotting bar graph ax.bar(df_month['2012':'2014'].index,
df_month.loc['2012':'2014', "Volume"],width=25, align='center')
```

Date	Open	High	Low	Close	Volume	Change
2006-01-31	38.245500	38.694000	37.641500	38.113000	3.400594e+07	0.991442
2006-02-28	33.141579	33.436842	32.627368	32.975789	2.329848e+07	0.996423
2006-03-31	31.333478	31.696957	30.929130	31.218696	2.095522e+07	1.000390
2006-04-30	32.383684	32.790000	31.914737	32.283158	2.200768e+07	1.001098
2006-05-31	31.744545	32.175455	31.171364	31.517273	2.218047e+07	0.998535
...
2014-08-31	36.836190	37.150000	36.545238	36.876667	1.396539e+07	1.003530
2014-09-30	40.662857	41.270000	39.983810	40.671905	5.811769e+07	1.003005
2014-10-31	41.253043	41.886087	40.784783	41.393913	3.210848e+07	1.005501
2014-11-30	49.879474	50.553158	49.440000	50.151579	2.474402e+07	1.006233
2014-12-31	50.359524	50.975714	49.852857	50.331905	1.623090e+07	0.999653

[108 rows x 6 columns]

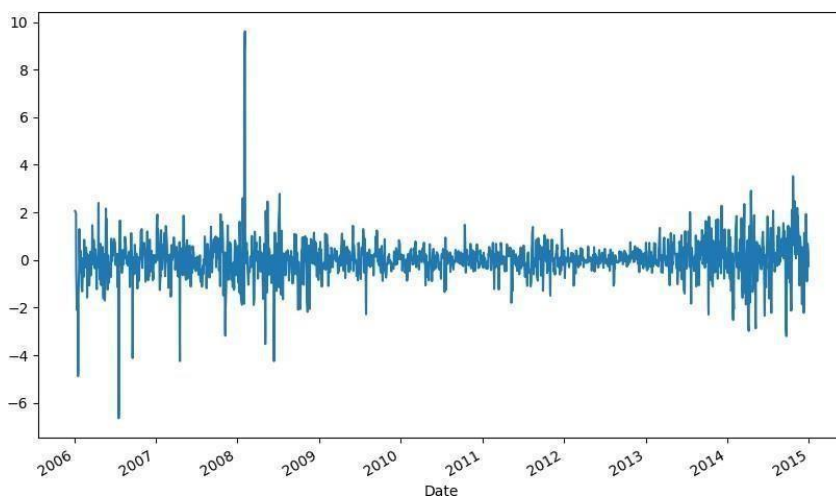
<BarContainer object of 36 artists>

20201ISB0014

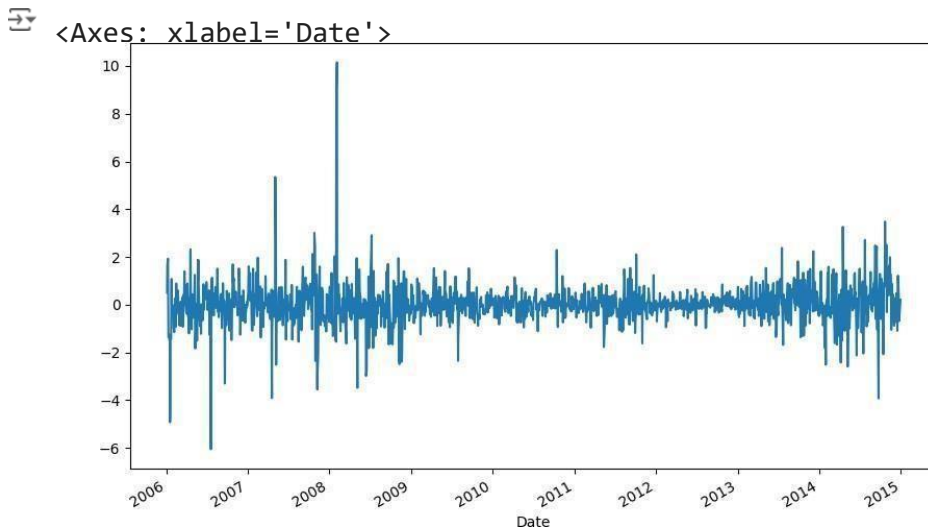


Differencing: Differencing is used to make the difference in values of a specified interval. By default, it's one, we can specify different values for plots. It is the most popular method to remove trends in the data.

```
df.Low.diff(2).plot(figsize=(10, 6))
```



```
df.High.diff(2).plot(figsize=(10, 6))
```

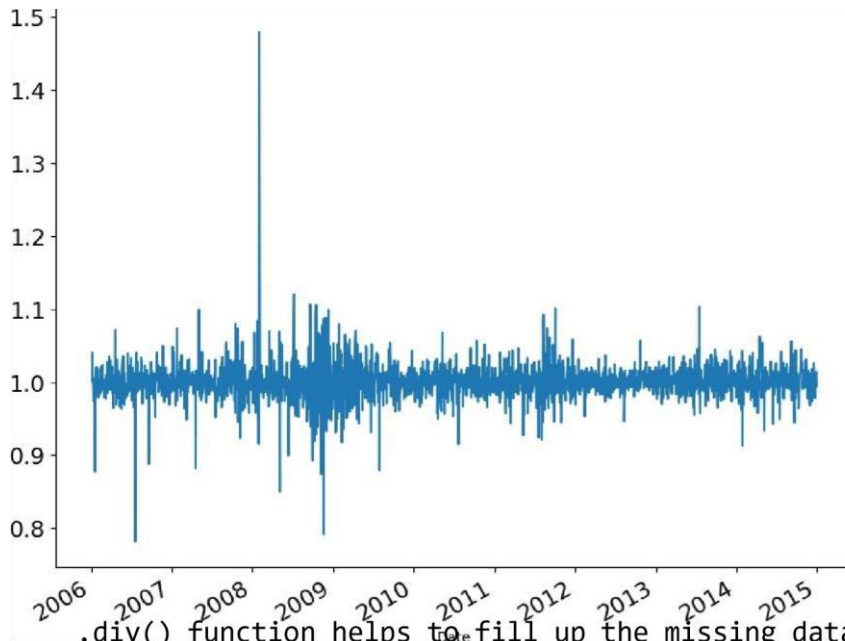


Plotting the Changes in Data

We can also plot the changes that occurred in data over time. There are a few ways to plot changes in data.

Shift: The shift function can be used to shift the data before or after the specified time interval. We can specify the time, and it will shift the data by one day by default. That means we will get the previous day's data. It is helpful to see previous day data and today's data simultaneously side by side.

```
df['Change'] =
df.Close.div(df.Close.shift())
df['Change'].plot(figsize=(10, 8), fontsize=16)
```



`.div()` function helps to fill up the missing data values. Actually, `div()` means division.

If we take `df.div(6)` it will divide each element in `df` by 6.

We do this to avoid the null or missing values that are created by the `'shift()'` operation.

```
df['Change'].plot(figsize=(10, 6))
```

```
< Axes: xlabel='Date' >
```

