```
In [63]: img1.save(r"C:\Users\CTTC\Downloads\modified_img.jpg")
```

## **PANDAS:- Panel Data Analysis**

It is a python library that helps to deal with analyzing and manipulating the datas.

We can also read datasets using pandas. Pandas is 2 types:-

- Series (single column)
- DataFrame (multiple columns)

```
In [64]: # importing the library:
         import pandas as pd
In [65]: # Creating a Series:-
         s = pd.Series(['a','b','c','d'])
Out[65]: 0
               b
               С
               d
         dtype: object
In [66]: # assigning index values to the series.
         s1 = pd.Series(['a','b','c'],index=[10,20,30])
         s1
Out[66]: 10
                а
          20
          30
         dtype: object
In [67]: # Indexing in Series:-
         s1[20]
Out[67]: 'b'
In [69]: # Slicing:
         s1[::2]
Out[69]: 10
                а
                C
         dtype: object
In [70]: # Creating a Series from tuple:
         s2 = ('apple','bat','cow','dog')
```

```
type(s2)
Out[70]: tuple
In [71]:
         pd.Series(s2)
Out[71]: 0
               apple
                 bat
          1
          2
                 COW
          3
                 dog
          dtype: object
In [73]: # Creating a Series from set
         s = \{100, 200, 300, 400, 500\}
         pd.Series(s)
        TypeError
                                                   Traceback (most recent call last)
        Cell In[73], line 3
              1 # Creating a Series from set
              2 s = \{100, 200, 300, 400, 500\}
        ---> 3 pd.Series(s)
        File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\series.py:512, in Serie
        s.__init__(self, data, index, dtype, name, copy, fastpath)
            510
                        data = data.copy()
            511 else:
        --> 512
                    data = sanitize_array(data, index, dtype, copy)
            514
                    manager = get_option("mode.data_manager")
            515
                    if manager == "block":
        File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\construction.py:641, in
        sanitize_array(data, index, dtype, copy, allow_2d)
            632
                     return sanitize_array(
            633
                        data,
            634
                         index=index,
           (\ldots)
            637
                         allow_2d=allow_2d,
            638
                     )
            640 else:
        --> 641
                    _sanitize_non_ordered(data)
            642
                    # materialize e.g. generators, convert e.g. tuples, abc.ValueView
            643
                    data = list(data)
        File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\construction.py:692, in
        _sanitize_non_ordered(data)
            688 """
            689 Raise only for unordered sets, e.g., not for dict_keys
            690 """
            691 if isinstance(data, (set, frozenset)):
                    raise TypeError(f"'{type(data).__name__}' type is unordered")
        TypeError: 'set' type is unordered
```

```
In [74]: # Creating a Series using dictionary:
         d = pd.Series({1:'apple',2:'kiwi',3:'orange'})
In [75]:
         d
                apple
Out[75]: 1
          2
                 kiwi
          3
               orange
          dtype: object
 In [1]: import pandas as pd
         import numpy as np
 In [2]: d = pd.Series({'a':100,'b':200,'c':300,'d':400})
         d
 Out[2]: a
               100
               200
               300
               400
          dtype: int64
 In [3]: d1 = pd.Series({'a':100,'b':200,'c':300,'d':400},
                          index=['a','e','f','d'])
         d1
 Out[3]: a
               100.0
          e
                 NaN
                 NaN
          f
               400.0
          d
          dtype: float64
 In [4]:
 Out[4]: a
               100
               200
          b
               300
          C
               400
          dtype: int64
 In [5]: # DataFrame:- multiple columns.
         dt = pd.DataFrame({'Name':['Lily','Jasmin','Yuvraj','Tani'],
                            'Roll_No':[101,102,103,104],
                            'Courses':['AIML','Python','C','Java']})
 In [6]: dt
```

```
Out[6]:
             Name Roll_No Courses
         0
               Lily
                        101
                               AIML
          1 Jasmin
                        102
                              Python
            Yuvraj
                        103
                                  C
                        104
               Tani
                                Java
 In [7]:
         type(dt)
 Out[7]: pandas.core.frame.DataFrame
 In [8]: # Accessing a specific columns value.
         dt.Courses[3]
 Out[8]: 'Java'
 In [9]:
         dt.Name[0]
 Out[9]: 'Lily'
In [10]: # head(): returns the first top 5 values of the dataframe
         dt.head()
Out[10]:
             Name Roll_No Courses
          0
               Lily
                        101
                               AIML
                        102
                              Python
          1 Jasmin
                                  C
          2
             Yuvraj
                        103
          3
                        104
               Tani
                                Java
In [11]: # returns the first specified datas from dataframe.
         dt.head(2)
Out[11]:
             Name Roll_No Courses
               Lily
                               AIML
                        101
                              Python
          1 Jasmin
                        102
In [12]: # tail(): returns the last 5 values from dataframe.
         dt.tail()
```

Out[12]:	Name		Roll_No	Courses	
	0	Lily	101	AIML	
	1	Jasmin	102	Python	
	2	Yuvraj	103	С	
	3	Tani	104	Java	

In [13]: dt.tail(3)

 Out[13]:
 Name
 Roll\_No
 Courses

 1
 Jasmin
 102
 Python

 2
 Yuvraj
 103
 C

**3** Tani 104 Java

In [14]: # Slicing of Dataframe:
 dt[::,::]

```
TypeError
                                                 Traceback (most recent call last)
       File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3791, in
       Index.get_loc(self, key)
          3790 try:
       -> 3791
                   return self._engine.get_loc(casted_key)
          3792 except KeyError as err:
       File index.pyx:152, in pandas._libs.index.IndexEngine.get_loc()
       File index.pyx:158, in pandas. libs.index.IndexEngine.get loc()
       TypeError: '(slice(None, None, None), slice(None, None, None))' is an invalid key
       During handling of the above exception, another exception occurred:
       InvalidIndexError
                                                 Traceback (most recent call last)
       Cell In[14], line 2
             1 # Slicing of Dataframe:
       ----> 2 dt[::,::]
       File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\frame.py:3893, in DataFr
       ame. getitem (self, key)
          3891 if self.columns.nlevels > 1:
                   return self._getitem_multilevel(key)
       -> 3893 indexer = self.columns.get_loc(key)
          3894 if is_integer(indexer):
          3895
                  indexer = [indexer]
       File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3803, in
       Index.get_loc(self, key)
          3798
                   raise KeyError(key) from err
          3799 except TypeError:
                 # If we have a listlike key, _check_indexing_error will raise
          3800
                  # InvalidIndexError. Otherwise we fall through and re-raise
          3801
          3802
                  # the TypeError.
                  self._check_indexing_error(key)
       -> 3803
          3804
                   raise
       File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:5975, in
       Index._check_indexing_error(self, key)
          5971 def _check_indexing_error(self, key):
          5972
                  if not is_scalar(key):
                       # if key is not a scalar, directly raise an error (the code below
          5973
                       # would convert to numpy arrays and raise later any way) - GH29926
          5974
       -> 5975
                       raise InvalidIndexError(key)
       InvalidIndexError: (slice(None, None, None), slice(None, None, None))
In [ ]: # iloc: this helps to perform slicing on Dataframes.
In [ ]: |dt.iloc[::,::]
In [ ]: dt.iloc[::2,::]
```

```
dt.iloc[::,::2]
In [15]:
Out[15]:
             Name Courses
               Lily
                      AIML
                     Python
          1 Jasmin
                          C
            Yuvraj
               Tani
                       Java
In [16]: # returns all rows and only 2nd indexed column.
         dt.iloc[::,2]
                 AIML
Out[16]: 0
               Python
          1
          2
                    C
                 Java
          Name: Courses, dtype: object
In [17]: # Renaming a columns name:-
Out[17]:
             Name Roll_No Courses
          0
               Lily
                        101
                               AIML
          1 Jasmin
                        102
                              Python
          2 Yuvraj
                        103
                                  C
          3
                        104
               Tani
                                Java
In [18]: dt = dt.rename(columns={'Name':'Students_Name'})
         dt
Out[18]:
             Students_Name Roll_No Courses
                                        AIML
          0
                       Lily
                                101
                                      Python
                     Jasmin
                                102
          2
                                           C
                     Yuvraj
                                103
          3
                       Tani
                                104
                                        Java
In [19]: # Set Index:-
         dt.set_index('Roll_No')
```

> Out[19]: Students\_Name Courses

> > Roll\_No 101 Lily AIML Python 102 Jasmin 103 C Yuvraj 104 Tani Java

In [20]: dt

Out[20]:

	Students_Name	KOII_NO	Courses
0	Lily	101	AIML
1	Jasmin	102	Python
2	Yuvraj	103	С
3	Tani	104	Java

In [21]: dt1 = dt.set\_index('Roll\_No')

Out[21]:

Students\_Name Courses

		Roll_No
AIML	Lily	101
Python	Jasmin	102
С	Yuvraj	103
Java	Tani	104

In [22]: dt

Out[22]:

	Students_Name	Roll_No	Courses
0	Lily	101	AIML
1	Jasmin	102	Python
2	Yuvraj	103	С
3	Tani	104	Java

In [23]: dt.set\_index('Roll\_No',inplace=True)

In [24]: dt

Out[24]: Students\_Name Courses

Roll_No		
101	Lily	AIML
102	Jasmin	Python
103	Yuvraj	С
104	Tani	Java

In [27]: dt.Students\_Name[101]

Out[27]: 'Lily'

In [28]: dt.Students\_Name[0]

```
KevError
                                          Traceback (most recent call last)
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3791, in
Index.get_loc(self, key)
  3790 try:
            return self._engine.get_loc(casted_key)
-> 3791
  3792 except KeyError as err:
File index.pyx:152, in pandas._libs.index.IndexEngine.get_loc()
File index.pyx:181, in pandas. libs.index.IndexEngine.get loc()
File pandas\_libs\hashtable_class_helper.pxi:2606, in pandas._libs.hashtable.Int64Ha
shTable.get_item()
File pandas\ libs\hashtable class helper.pxi:2630, in pandas. libs.hashtable.Int64Ha
shTable.get_item()
KeyError: 0
The above exception was the direct cause of the following exception:
KeyError
                                          Traceback (most recent call last)
Cell In[28], line 1
---> 1 dt.Students_Name[0]
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\series.py:1040, in Serie
s.__getitem__(self, key)
  1037
            return self. values[key]
   1039 elif key_is_scalar:
-> 1040
            return self._get_value(key)
  1042 # Convert generator to list before going through hashable part
  1043 # (We will iterate through the generator there to check for slices)
  1044 if is_iterator(key):
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\series.py:1156, in Serie
s._get_value(self, label, takeable)
           return self._values[label]
  1153
  1155 # Similar to Index.get_value, but we do not fall back to positional
-> 1156 loc = self.index.get_loc(label)
  1158 if is_integer(loc):
  1159
            return self._values[loc]
File C:\ProgramData\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3798, in
Index.get loc(self, key)
  3793
            if isinstance(casted_key, slice) or (
  3794
                isinstance(casted_key, abc.Iterable)
  3795
                and any(isinstance(x, slice) for x in casted_key)
  3796
            ):
  3797
                raise InvalidIndexError(key)
            raise KeyError(key) from err
-> 3798
   3799 except TypeError:
            # If we have a listlike key, _check_indexing_error will raise
  3800
            # InvalidIndexError. Otherwise we fall through and re-raise
  3801
  3802
           # the TypeError.
  3803
           self._check_indexing_error(key)
```

```
KeyError: 0
```

```
In [32]: # Working with Null Values:-
          d = pd.DataFrame({'Days':[1,2,3,4,5,6],
                            'Places':['Odisha',np.nan,'Manali','Puri','Goa','Kashmir'],
                            'Visitors':[6000,2500,4600,4592,2350,1000]})
In [33]: d
Out[33]:
                    Places Visitors
             Days
                               6000
          0
                    Odisha
                1
                      NaN
                              2500
          1
                2
          2
                3
                    Manali
                              4600
          3
                4
                       Puri
                              4592
                5
          4
                      Goa
                              2350
                6 Kashmir
                               1000
In [34]: # to check missing/null values.
          d.isnull()
Out[34]:
             Days Places Visitors
          0 False
                     False
                             False
          1 False
                     True
                             False
          2 False
                     False
                             False
                             False
          3 False
                     False
          4 False
                     False
                             False
          5 False
                     False
                             False
In [35]: d.isnull().sum()
                       0
Out[35]: Days
                       1
          Places
          Visitors
                       0
          dtype: int64
In [36]: # to replace the null value.
          d.fillna('Hyderabad')
```

Out[36]: **Days Places Visitors** 0 1 Odisha 6000 1 Hyderabad 2500 2 3 Manali 4600 3 4 Puri 4592 4 5 Goa 2350 5 6 Kashmir 1000

In [37]:

Out[37]:

```
Days
           Places Visitors
0
          Odisha
                      6000
      1
1
      2
             NaN
                     2500
2
           Manali
                     4600
      3
3
      4
                     4592
             Puri
4
      5
             Goa
                     2350
      6 Kashmir
                      1000
```

In [39]: # to replace the null values permanently.
d.fillna('Hyderabad',inplace=True)
d

Out[39]:

,		Days	Places	Visitors
	0	1	Odisha	6000
	1	2	Hyderabad	2500
	2	3	Manali	4600
	3	4	Puri	4592
	4	5	Goa	2350
	5	6	Kashmir	1000

In [40]: d

```
Out[40]:
             Days
                       Places Visitors
          0
                1
                       Odisha
                                 6000
          1
                   Hyderabad
                                 2500
          2
                3
                       Manali
                                 4600
          3
                4
                         Puri
                                 4592
          4
                5
                         Goa
                                 2350
                6
                      Kashmir
                                 1000
In [41]: d.isnull().sum()
Out[41]: Days
          Places
                       0
          Visitors
          dtype: int64
In [42]: # Working with Null Values:-
          d = pd.DataFrame({'Days':[1,2,3,4,5,6],
                            'Places':['Odisha',np.nan,'Manali','Puri',np.nan,'Kashmir'],
                            'Visitors':[6000,2500,4600,4592,2350,1000]})
In [43]: d
Out[43]:
             Days
                    Places Visitors
          0
                    Odisha
                              6000
                1
          1
                2
                              2500
                      NaN
          2
                    Manali
                              4600
                3
          3
                4
                       Puri
                              4592
          4
                5
                      NaN
                              2350
                6 Kashmir
                               1000
In [44]:
         d.isnull().sum()
Out[44]: Days
                       0
                       2
          Places
          Visitors
          dtype: int64
In [45]: d.fillna('Bangalore',inplace=True)
```

```
Out[45]:
            Days
                     Places Visitors
         0
               1
                     Odisha
                              6000
                              2500
                  Bangalore
         2
               3
                     Manali
                              4600
         3
               4
                       Puri
                              4592
         4
                  Bangalore
                              2350
               5
                    Kashmir
                              1000
               6
In [47]: # returns the datatype of every column in dataframe.
         d.dtypes
Out[47]: Days
                      int64
         Places
                     object
         Visitors
                      int64
         dtype: object
In [49]: # info(): returns all the information of our dataset.
         d.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 6 entries, 0 to 5
        Data columns (total 3 columns):
            Column
                      Non-Null Count Dtype
            ----
                       -----
            Days
                      6 non-null
                                       int64
         0
         1
             Places
                      6 non-null
                                      object
             Visitors 6 non-null
                                       int64
        dtypes: int64(2), object(1)
        memory usage: 276.0+ bytes
In [50]: # to find the unique values.
         d.Places.unique()
Out[50]: array(['Odisha', 'Bangalore', 'Manali', 'Puri', 'Kashmir'], dtype=object)
In [51]: d.Visitors.unique()
Out[51]: array([6000, 2500, 4600, 4592, 2350, 1000], dtype=int64)
In [52]: # to find the average.
         d.Visitors.mean()
Out[52]: 3507.0
In [54]:
        d.Visitors.max()
Out[54]: 6000
```

```
In [56]: # to find all the statistical values of our dataframe.
# describe(): returns statistical values of only integer cols.
d.describe()
```

```
        count
        6.000000
        6.00000

        mean
        3.500000
        3507.00000

        std
        1.870829
        1856.05334

        min
        1.000000
        1000.00000

        25%
        2.250000
        2387.50000

        50%
        3.500000
        3546.00000

        75%
        4.750000
        4598.00000
```

**max** 6.000000 6000.00000

```
In [59]: # returns the statistical values of only object col.
d.describe(include='0')
```

```
count 6
unique 5
top Bangalore
freq 2
```

```
In [61]: # returns the statistical values of all the columns in dataset.
d.describe(include='all')
```

Out[61]:		Days	Places	Visitors
	count	6.000000	6	6.00000
	unique	NaN	5	NaN
	top	NaN	Bangalore	NaN
	freq	NaN	2	NaN
	mean	3.500000	NaN	3507.00000
	std	1.870829	NaN	1856.05334
	min	1.000000	NaN	1000.00000
	25%	2.250000	NaN	2387.50000
	50%	3.500000	NaN	3546.00000
	75%	4.750000	NaN	4598.00000
	max	6.000000	NaN	6000.00000

## **Working with Datasets:-**

```
In [62]: import numpy as np
import pandas as pd

In [63]: # to read the dataset.
    df = pd.read_csv(r"C:\Users\CTTC\Downloads\iris\iris.data")
    df
```

Out[63]:		5.1	3.5	1.4	0.2	Iris-setosa
	0	4.9	3.0	1.4	0.2	Iris-setosa
	1	4.7	3.2	1.3	0.2	Iris-setosa
	2	4.6	3.1	1.5	0.2	Iris-setosa
	3	5.0	3.6	1.4	0.2	Iris-setosa
	4	5.4	3.9	1.7	0.4	Iris-setosa
	•••					
	144	6.7	3.0	5.2	2.3	Iris-virginica
	145	6.3	2.5	5.0	1.9	Iris-virginica
	146	6.5	3.0	5.2	2.0	Iris-virginica
	147	6.2	3.4	5.4	2.3	Iris-virginica
	148	5.9	3.0	5.1	1.8	Iris-virginica

149 rows × 5 columns

In the above code ⟨ as our dataset doesnot contain the columns name, the 1st row data is being interpreted as column's name.

Therefore, inorder to overcome this we are using "header = None" as below  $\P$ .

```
In [64]: # to read the dataset.
df = pd.read_csv(r"C:\Users\CTTC\Downloads\iris\iris.data",header=None)
df
```

0       5.1       3.5       1.4       0.2       Iris-setosa         1       4.9       3.0       1.4       0.2       Iris-setosa         2       4.7       3.2       1.3       0.2       Iris-setosa         3       4.6       3.1       1.5       0.2       Iris-setosa         4       5.0       3.6       1.4       0.2       Iris-setosa                 145       6.7       3.0       5.2       2.3       Iris-virginica         146       6.3       2.5       5.0       1.9       Iris-virginica         147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica         149       5.9       3.0       5.1       1.8       Iris-virginica	ut[64]:		0	1	2	3	4
2       4.7       3.2       1.3       0.2       Iris-setosa         3       4.6       3.1       1.5       0.2       Iris-setosa         4       5.0       3.6       1.4       0.2       Iris-setosa                 145       6.7       3.0       5.2       2.3       Iris-virginica         146       6.3       2.5       5.0       1.9       Iris-virginica         147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica		0	5.1	3.5	1.4	0.2	Iris-setosa
3       4.6       3.1       1.5       0.2       Iris-setosa         4       5.0       3.6       1.4       0.2       Iris-setosa                 145       6.7       3.0       5.2       2.3       Iris-virginica         146       6.3       2.5       5.0       1.9       Iris-virginica         147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica		1	4.9	3.0	1.4	0.2	Iris-setosa
4       5.0       3.6       1.4       0.2       Iris-setosa                 145       6.7       3.0       5.2       2.3       Iris-virginica         146       6.3       2.5       5.0       1.9       Iris-virginica         147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica		2	4.7	3.2	1.3	0.2	Iris-setosa
<ul> <li></li> <li>145 6.7 3.0 5.2 2.3 Iris-virginica</li> <li>146 6.3 2.5 5.0 1.9 Iris-virginica</li> <li>147 6.5 3.0 5.2 2.0 Iris-virginica</li> <li>148 6.2 3.4 5.4 2.3 Iris-virginica</li> </ul>		3	4.6	3.1	1.5	0.2	Iris-setosa
1456.73.05.22.3Iris-virginica1466.32.55.01.9Iris-virginica1476.53.05.22.0Iris-virginica1486.23.45.42.3Iris-virginica		4	5.0	3.6	1.4	0.2	Iris-setosa
146       6.3       2.5       5.0       1.9       Iris-virginica         147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica		•••					
147       6.5       3.0       5.2       2.0       Iris-virginica         148       6.2       3.4       5.4       2.3       Iris-virginica		145	6.7	3.0	5.2	2.3	Iris-virginica
<b>148</b> 6.2 3.4 5.4 2.3 Iris-virginica		146	6.3	2.5	5.0	1.9	Iris-virginica
-		147	6.5	3.0	5.2	2.0	Iris-virginica
<b>149</b> 5.9 3.0 5.1 1.8 Iris-virginica		148	6.2	3.4	5.4	2.3	Iris-virginica
		149	5.9	3.0	5.1	1.8	Iris-virginica

150 rows × 5 columns

In [ ]: