# **Data Analysis with Numpy and Pandas**

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- 3. Indexing and Slicing
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- 9. Re-indexing
- 10. Handling missing Values

```
In [1]: import numpy as cipher_np #Importing numpy
import pandas as cipher_pd

In [2]: dummy_list = [1, 2, 3, 4, 5] #List creation
dummy_list

Out[2]: [1, 2, 3, 4, 5]

In [3]: type(dummy_list)

Out[3]: list

In [4]: dummy_array = cipher_np.array(dummy_list) #Passing List as numpy array
dummy_array

Out[4]: array([1, 2, 3, 4, 5])

In [5]: type(dummy_array)

Out[5]: numpy.ndarray
```

## Indexing

```
In [6]: print(dummy_list[0])
    print(dummy_array[0])
    1
```

## Slicing

```
In [7]: len(dummy_array)
 Out[7]: 5
 In [8]: # create a random nd-array
         cipher_np.random.randint(-10, 100, (4, 5))
 Out[8]: array([[18, 42, 74, 41, 16],
                [51, 24, -2, 38, 50],
                [85, 34, -5, 98, 47],
                [85, 92, 14, 43, 47]])
 In [9]: # Create an nd-array of 1's
         cipher_np.ones((3, 4))
Out[9]: array([[1., 1., 1., 1.],
                [1., 1., 1., 1.],
                [1., 1., 1., 1.]])
In [10]: # Create an nd-array of 0's
         cipher_np.zeros((3, 4))
Out[10]: array([[0., 0., 0., 0.],
                [0., 0., 0., 0.],
                [0., 0., 0., 0.]
In [11]: | dummy_md_list = [[1, 2, 3, 4, 5], [11, 22, 33, 44, 55], [111, 222, 333, 444, 555]]
         dummy_md_list
Out[11]: [[1, 2, 3, 4, 5], [11, 22, 33, 44, 55], [111, 222, 333, 444, 555]]
In [12]: dummy_md_array = cipher_np.array(dummy_md_list)
         dummy_md_array
Out[12]: array([[ 1,
                        2, 3, 4,
                                       5],
                [ 11, 22, 33, 44, 55],
                [111, 222, 333, 444, 555]])
In [13]: # dummy_md_array = dummy_md_array[:, :-3] ## XXXXXXX
In [14]: # Checking the order of the multi-dimensional array
         dummy_md_array.shape
Out[14]: (3, 5)
In [15]: # Get ALL rows and ALL FIRST 3 COLUMNS of the multi-dimensional array
         # Expected output:
         # [[1, 2, 3],
         # [11, 22, 33],
         # [111, 222, 333]]
         # How to do slicing in nd-array?
             # "," - Before the comma, we mention row indices (as list or as single integers
             # ":" - Collon is used to access all the rows or all the columns in the nd-arra
             # ":4" - This slices the nd-array till 4th index
```

```
dummy_md_array[:, :]
Out[15]: array([[ 1, 2, 3, 4,
               [ 11, 22, 33, 44, 55],
               [111, 222, 333, 444, 555]])
In [16]: dummy_md_array[:, [0, 1,2]]
Out[16]: array([[ 1, 2,
                          3],
               [ 11, 22, 33],
               [111, 222, 333]])
In [17]: dummy_md_array[:, 0:3]
Out[17]: array([[ 1, 2, 3],
               [ 11, 22, 33],
               [111, 222, 333]])
In [19]: # Get the first 2 rows and first 3 columns of the multi-dimensional array
         # Expected output:
         # [[ 1, 2, 3],
         # [ 11, 22, 33]]
         dummy_md_array[:2, :3]
Out[19]: array([[ 1, 2, 3],
               [11, 22, 33]])
In [20]: dummy_md_array[0:2, 0:3]
Out[20]: array([[ 1, 2, 3],
               [11, 22, 33]])
In [21]: # Access the last index of the nd-array
         dummy_md_array[:, -1]
Out[21]: array([ 5, 55, 555])
In [22]: # Get the nd-array with all rows and till before the last column index
         # Expected output:
         # [[1, 2, 3, 4],
         # [11, 22, 33, 44],
         # [111, 222, 333, 444]]
         dummy_md_array[:, :-1]
Out[22]: array([[ 1, 2, 3, 4],
               [ 11, 22, 33, 44],
               [111, 222, 333, 444]])
In [23]: dummy_md_array
Out[23]: array([[ 1, 2, 3, 4, 5],
               [ 11, 22, 33, 44, 55],
               [111, 222, 333, 444, 555]])
```

```
In [24]: # Get the nd-array with (1st and 3rd rows) and (till before the last 2 columns) ind
         # Expected output:
         # [[1, 2, 3],
         # [111, 222, 333]]
         dummy_md_array[[0, 2],0:3]
Out[24]: array([[ 1, 2,
                             3],
                [111, 222, 333]])
In [25]: dummy_md_array[[0, 2], :-2]
Out[25]: array([[ 1, 2,
                             3],
                [111, 222, 333]])
         Statistical operations on nd-arrays
         Sum
In [26]: # Sum of ALL elements in the md-array
         dummy_md_array.sum()
Out[26]: 1845
In [27]: # Row-wise sum of elements in md-array
         dummy_md_array.sum(axis = 1)
Out[27]: array([ 15, 165, 1665])
In [28]: # Column-wise sum of elements in md-array
         dummy_md_array.sum(axis = 0)
Out[28]: array([123, 246, 369, 492, 615])
         Mean
In [29]: # Mean of ALL elements in the md-array
         dummy_md_array.mean()
Out[29]: 123.0
In [30]: # Row-wise mean of elements in md-array
         dummy_md_array.mean(axis = 1)
Out[30]: array([ 3., 33., 333.])
In [31]: # Column-wise mean of elements in md-array
         dummy_md_array.mean(axis = 0)
Out[31]: array([ 41., 82., 123., 164., 205.])
```

#### Variance

```
In [32]: # Variance of ALL elements in the md-array
         dummy_md_array.var()
Out[32]: 30495.333333333333
In [33]: # Row-wise variance of elements in md-array
         dummy_md_array.var(axis = 1)
Out[33]: array([2.0000e+00, 2.4200e+02, 2.4642e+04])
In [34]: # Column-wise variance of elements in md-array
         dummy_md_array.var(axis = 0)
Out[34]: array([ 2466.66666667, 9866.66666667, 22200.
                                                           , 39466.66666667,
                61666.6666667])
         Standard deviation
In [35]: # Standard-deviation of ALL elements in the md-array
         dummy_md_array.std()
Out[35]: 174.62913082682778
In [36]: # Row-wise Standard-deviation of elements in md-array
         dummy_md_array.std(axis = 1)
Out[36]: array([ 1.41421356, 15.55634919, 156.97770542])
In [37]: # Column-wise Standard-deviation of elements in md-array
         dummy_md_array.std(axis = 0)
Out[37]: array([ 49.66554809, 99.33109617, 148.99664426, 198.66219234,
                248.32774043])
         Add a constant number to a nd-array
In [38]: dummy_md_array2 = dummy_md_array + 2.5 # Element wise operation
         dummy_md_array2
Out[38]: array([[ 3.5, 4.5, 5.5,
                                       6.5,
                                             7.5],
                [ 13.5, 24.5, 35.5, 46.5, 57.5],
                [113.5, 224.5, 335.5, 446.5, 557.5]])
         Summing 2 nd-arrays
In [39]: print(dummy_md_array.shape)
         print(dummy_md_array2.shape)
       (3, 5)
       (3, 5)
In [40]: dummy_md_array + dummy_md_array2
```

```
Out[40]: array([[ 4.5, 6.5, 8.5, 10.5, 12.5],
                [24.5, 46.5, 68.5, 90.5, 112.5],
                [ 224.5, 446.5, 668.5, 890.5, 1112.5]])
In [41]: dummy_md_array[:, :-3] + dummy_md_array2
       ValueError
                                                Traceback (most recent call last)
       Cell In[41], line 1
       ---> 1 dummy_md_array[:, :-3] + dummy_md_array2
       ValueError: operands could not be broadcast together with shapes (3,2) (3,5)
In [42]: dummy_md_array - dummy_md_array2
Out[42]: array([[-2.5, -2.5, -2.5, -2.5, -2.5],
                [-2.5, -2.5, -2.5, -2.5, -2.5],
                [-2.5, -2.5, -2.5, -2.5, -2.5]]
In [43]: cipher_np.dot(dummy_md_array[:, :-2], dummy_md_array2)
Out[43]: array([[ 371.,
                           727., 1083., 1439., 1795.],
                [ 4081., 7997., 11913., 15829., 19745.],
                [ 41181., 80697., 120213., 159729., 199245.]])
In [44]: cipher_np.multiply(dummy_md_array[:, :-2], dummy_md_array2)
       ValueError
                                                Traceback (most recent call last)
       Cell In[44], line 1
       ----> 1 cipher np.multiply(dummy md array[:, :-2], dummy md array2)
       ValueError: operands could not be broadcast together with shapes (3,3) (3,5)
In [45]: dummy_md_array * dummy_md_array2 # Element ise multiplication
Out[45]: array([[3.500000e+00, 9.000000e+00, 1.650000e+01, 2.600000e+01,
                 3.750000e+01],
                [1.485000e+02, 5.390000e+02, 1.171500e+03, 2.046000e+03,
                 3.162500e+03],
                [1.259850e+04, 4.983900e+04, 1.117215e+05, 1.982460e+05,
                 3.094125e+05]])
In [46]: cipher_np.multiply(dummy_md_array, dummy_md_array2) # Element ise multiplication
Out[46]: array([[3.500000e+00, 9.000000e+00, 1.650000e+01, 2.600000e+01,
                 3.750000e+01],
                [1.485000e+02, 5.390000e+02, 1.171500e+03, 2.046000e+03,
                 3.162500e+03],
                [1.259850e+04, 4.983900e+04, 1.117215e+05, 1.982460e+05,
                 3.094125e+05]])
In [ ]:
```

## **Pandas**

## Creating a dataframe

```
In [49]: # cipher_pd.DataFrame(data = dummy_md_array)
dummy_df=cipher_pd.DataFrame(dummy_md_array)
dummy_df
```

```
Out[49]: 0 1 2 3 4

0 1 2 3 4 5

1 11 22 33 44 55

2 111 222 333 444 555
```

Out[50]:		Column 1	Column 2	Column 3	Column 4	Column 5
	Row 1	1	2	3	4	5
	Row 2	11	22	33	44	55
	Row 3	111	222	333	444	555

### Renaming a column name

```
In [51]: dummy_df2 = dummy_df.rename(columns = {"Column 4": "Column Y"}) # Reassigning to a
dummy_df2
```

t[51]:		Column 1	Column 2	Column 3	Column Y	Column 5	
	Row 1	1	2	3	4	5	
	Row 2	11	22	33	44	55	
	Row 3	111	222	333	444	555	
[52]:	dummy_c	lf.rename(d	columns = {	["Column 4'	': "Column	X"}) # Ren	aming inplace
t[52]:		Column 1	Column 2	Column 3	Column X	Column 5	
	Row 1	1	2	3	4	5	
	Row 2	11	22	33	44	55	
	Row 3	111	222	333	444	555	
[53]:	dummy_c	lf #datafr	rame remain	ns same as	original		
t[53]:		Column 1	Column 2	Column 3	Column 4	Column 5	
	Row 1	1	2	3	4	5	
	Row 2	11	22	33	44	55	
	Row 3	111	222	333	444	555	
[54]:	dummy_c		columns = {	("Column 4'	': "Column	X"},inplac	e=True)
t[54]:		Column 1	Column 2	Column 3	Column X	Column 5	
	Row 1	1	2	3	4	5	
	Row 2	11	22	33	44	55	
	Row 3	111	222	333	444	555	
	Rena	ming a ı	row nam	ne			
[55]:	dummy_c	lf.rename(i	index = {"F	Row 2": "Ro	ow X", "Rov	v 3": "Row	Y"}, inplace = True)
[55]: [56]:	dummy_c		index = {"F	Row 2": "Ro	w X", "Rov	v 3": "Row	Y"}, inplace = True)
[56]:				Row 2": "Ro			Y"}, inplace = True)
		lf					Y"}, inplace = True)

Row Y

```
In [ ]:
In [57]: dummy_md_array.shape
Out[57]: (3, 5)
In [58]: dummy_df.shape
Out[58]: (3, 5)
In [59]: dummy_md_array[1]
Out[59]: array([11, 22, 33, 44, 55])
In [60]: dummy_md_array[1, 2]
Out[60]: 33
In [75]: dummy_df.loc["Row X", "Column 3"]
Out[75]: 33
In [76]: dummy_df.iloc[1, 2]
Out[76]: 33
         Read CSV files
In [61]: csv_df = cipher_pd.read_csv("./dummy_csv.csv",index_col=0)
                 Col1
                        col2
                              col3
Out[61]:
                                    col4
                                          col5
                                                 col6
                                                       col7
          Row 1
                   1.0
                         2.0
                               3.0
                                     4.0
                                            5.0
                                                  6.0
                                                        7.0
          Row 2
                  11.0
                        22.0
                              33.0
                                    44.0
                                           55.0
                                                 66.0
                                                       77.0
          Row 3 111.0 222.0 333.0 444.0 555.0 666.0 777.0
          Row 4
                        NaN
                  NaN
                              NaN
                                    NaN
                                          NaN
                                                 NaN
                                                       NaN
In [62]: # Check the column names of the dataframe
         csv_df.columns
Out[62]: Index(['Col1', 'col2', 'col3', 'col4', 'col5', 'col6', 'col7'], dtype='object')
In [63]: # Getv the row names of the dataframe
         csv df.index
Out[63]: Index(['Row 1', 'Row 2', 'Row 3', 'Row 4'], dtype='object')
```

## Reading XLSX data

```
In [65]: mangoes_xlsx_df = cipher_pd.read_excel("./mangoes_basket.xlsx", engine = "openpyxl"
    mangoes_xlsx_df
```

Out[65]:

	weight	length	diameter	age
Mango 1	1.0	10.0	10	1
Mango 2	1.4	12.0	21	2
Mango 3	1.1	1.0	11	5
Mango 4	332.0	3.0	13	7
Mango 5	1.3	NaN	9	1
Mango 6	1.6	NaN	10	3
Mango 7	1.7	12.0	11	5
Mango 8	1.9	34.0	22	4
Mango 9	1.8	23.0	33	0
Mango 10	1.2	21.0	13	10

In [66]: # ALL Statistical properties of the dataframe
mangoes\_xlsx\_df.describe()

Out[66]:

	weight	length	diameter	age
count	10.000000	8.000000	10.000000	10.000000
mean	34.500000	14.500000	15.300000	3.800000
std	104.531282	10.967484	7.703535	3.084009
min	1.000000	1.000000	9.000000	0.000000
25%	1.225000	8.250000	10.250000	1.250000
50%	1.500000	12.000000	12.000000	3.500000
75%	1.775000	21.500000	19.000000	5.000000
max	332.000000	34.000000	33.000000	10.000000

```
In [67]: # Series
mangoes_xlsx_df["length"]
```

```
Out[67]: Mango 1
                     10.0
         Mango 2
                     12.0
         Mango 3
                      1.0
         Mango 4
                      3.0
         Mango 5
                      NaN
         Mango 6
                      NaN
         Mango 7
                     12.0
                     34.0
         Mango 8
         Mango 9
                     23.0
                     21.0
         Mango 10
         Name: length, dtype: float64
In [68]: print(type(mangoes_xlsx_df["length"]))
        <class 'pandas.core.series.Series'>
In [69]: mangoes_xlsx_df["length"].mean()
Out[69]: 14.5
In [70]: # Handle missing values
         mangoes_xlsx_df.fillna(mangoes_xlsx_df["length"].mean(), inplace = True)
In [71]: mangoes_xlsx_df["length"] + mangoes_xlsx_df["weight"]
Out[71]: Mango 1
                      11.0
         Mango 2
                      13.4
         Mango 3
                       2.1
         Mango 4
                     335.0
         Mango 5
                      15.8
         Mango 6
                      16.1
         Mango 7
                      13.7
                      35.9
         Mango 8
         Mango 9
                      24.8
         Mango 10
                      22.2
         dtype: float64
In [72]: mangoes_xlsx_df
```

_		$\Gamma = 0.7$	
( ) (	17	1 / 2 1	
-	<i>a</i>	1 / 6 1	

	weight	length	diameter	age
Mango 1	1.0	10.0	10	1
Mango 2	1.4	12.0	21	2
Mango 3	1.1	1.0	11	5
Mango 4	332.0	3.0	13	7
Mango 5	1.3	14.5	9	1
Mango 6	1.6	14.5	10	3
Mango 7	1.7	12.0	11	5
Mango 8	1.9	34.0	22	4
Mango 9	1.8	23.0	33	0
Mango 10	1.2	21.0	13	10

In [73]: # mng\_xls2=mangoes\_xlsx\_df.backfill()

In [74]: #TRANSPOSE OPERATION
dummy\_df2.T

Out[74]:

	Row 1	Row 2	Row 3
Column 1	1	11	111
Column 2	2	22	222
Column 3	3	33	333
Column Y	4	44	444
Column 5	5	55	555