





PYTHON FUNDAMENTALS: A COMPREHENSIVE TRAINING

Advanced data manipulation with Numpy/Pandas

Python Course -By Binatna Data-¶

- Sessions of December 2023
- Session of 16/12/2023

1. Initialisation:

→ List in python:

 A list is a data structure in Python that is a mutable, or changeable, ordered sequence of elements. Each element or value that is inside of a list is called an item.

```
mylist = ["apple", "banana", "orange"]
mylist

['apple', 'banana', 'orange']

mylist = [1,2,3,"apple"]
mylist

[1, 2, 3, 'apple']
```

→ Dictionary in python:

- Dictionaries are used to store data values in key:value pairs.
- A dictionary is a collection which is ordered*, changeable and do not allow duplicates.

```
my_dict = {"Nom et prenom": "Hassan taroudant", "age": 20}

print(my_dict)
print(my_dict["Nom et prenom"])
print(my_dict["age"])

{'Nom et prenom': 'Hassan taroudant', 'age': 20}
Hassan taroudant
20
```

- The values in dictionary items can be of any data type.
- It is also possible to use the dict() constructor to make a dictionary.

```
thisdict = dict(name = "John", age = 36, country = "Norway")

print(thisdict)

{'name': 'John', 'age': 36, 'country': 'Norway'}
```

```
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# creation d'un dictionnaire vide
students = {}
print(students)
print()
# Add
students["g14"]={"Nom et prenom": "Hassan taroudant", "age": 20}
print("Apres l'ajout")
print(students)
print()
# update
students["g14"]={"Nom et prenom": "Yassine Casa", "age": 23} # students["g14"].update()
print("Apres la modification")
print(students)
print()
# Select element
print(students["g14"])
print()
# Initialze
students = {
   "G14": {"Nom et prenom": "Hassan taroudant", "age": 20},
   "G15": {"Nom et prenom": "Yassine Casa", "age": 23},
   "G16": {"Nom et prenom": "Fatima benguerir", "age": 19}
print(students)
{}
Apres l'ajout
{'g14': {'Nom et prenom': 'Hassan taroudant', 'age': 20}}
Apres la modification
{'g14': {'Nom et prenom': 'Yassine Casa', 'age': 23}}
{'Nom et prenom': 'Yassine Casa', 'age': 23}
{'G14': {'Nom et prenom': 'Hassan taroudant', 'age': 20}, 'G15': {'Nom et prenom': 'Yassine Casa', 'age':
23}, 'G16': {'Nom et prenom': 'Fatima benguerir', 'age': 19}}
```

- Here are some methods that can be called from a dictionary object:
 - keys(): Returns a sequence of keys.
 - o values(): Returns a sequence of values.
 - o items(): Returns a sequence of tuples (key, value).
 - o clear(): Deletes all items.
 - get(key): Returns the value of the key.
 - o pop(key): Deletes the element from the key and returns its value.
 - popitem(): tuple Returns a randomly selected key/value pair as a tuple and deletes the selected element.

→ Range(), list(), len() and Type() functions:

• The range() function generates an arithmetic sequence. Its result is converted into a list using the list() function.

```
range(10)

range(0, 10)

list(range(10))

[0, 1, 2, 3, 4, 5, 6, 7, 8, 9]

list(range(5, 10, 2))

[5, 7, 9]
```

• The len() function returns the number of elements.

```
a = list(range(1,10,2))
print(a)
len(a)

[1, 3, 5, 7, 9]
5
```

- To access an element of a list, we enter the element index between square brackets [].
- The index of the first element of a list is 0.

```
a[3]
7
```

• To find out the type of an item or the type of a value, simply use the type() function.

```
print(type(15))
print(type("toto"))
print(type(1.2))

<class 'int'>
<class 'str'>
<class 'float'>
```

→ Operation in lists

• It is possible to concatenate lists with +.

```
a=[1,3,5]
b=[0,2,4]
c = a+b
print(c)
[1, 3, 5, 0, 2, 4]
```

- you can add an element to the list in two ways: by using the append() function, or by using the insert() function.
- Insert() takes 2 arguments, the first is the index of the location where you want to add the element, and the second is the value of the element to be added.
- You can remove an element from a list in two ways: using the remove() function, which takes the element to be removed as a parameter, and the pop() function, which takes the index of the element to be removed.

```
a=[1,3,5]

# Add using append
a.append(6)
print(a)

# Add using insert
a.insert(0, 4)
print(a)

# Remove the given element
a.remove(4)
print(a)

# Remove using index
a.pep()
print(a)

[1, 3, 5, 6]
[4, 1, 3, 5, 6]
[1, 3, 5, 6]
[1, 3, 5, 6]
[1, 3, 5, 6]
[1, 3, 5, 6]
```

→ Exercices:

- Create a Python program that performs the following operations on a list of numbers:
 - Create an empty list called numbers.
 - ❖ Append the numbers 1 to 10 (inclusive) to the list.
 - Print the original list.
 - Print the length of the list.
 - Print the sum of all the numbers in the list (use the sum() function).
 - Remove the last element from the list.
 - Print the modified list.
 - Check if the number 5 is in the list and print the result (use the "in" keyword)
 - ❖ Double the value of each element in the list.
 - Print the final modified list.
- Create a Python program that performs the following operations on a dictionary representing a person's information:
 - Create a dictionary called person with keys: 'name', 'age', 'city', and 'country'. Assign appropriate values.
 - Print the original dictionary.
 - Add a new key-value pair: 'occupation' with a value representing the person's job.
 - Print the modified dictionary.
 - ❖ Check if the key 'gender' is in the dictionary and print the result.
 - Update the value of 'age' in the dictionary.
 - Print the final modified dictionary.

2. Numpy:

→ Why numpy ?

- Numpy is a Python package specializing in the manipulation of arrays, for us essentially vectors and matrices.
- Numpy" arrays only handle objects of the same type
- The package offers a large number of routines for rapid access to data (e.g. search, extraction, etc.), for various manipulations (e.g. sorting), for scientific calculations (e.g. statistical calculation, numerical calculation, etc.). calculation, ...)
- Numpy arrays are more powerful (speed, volume management) than the usual Python collections.

→ Install and Import

To use NumPy, you should install the package via this command: `pip install numpy`
.

Once the installation is complete, we can import the package as follows:

```
import numpy as np

mylist = [2,3,4,5]

numpy_list = np.array(mylist)
numpy_list
array([2, 3, 4, 5])
```

→ Creating NumPy arrays:

- np.array: Create an array from a Python list or tuple.
- np.arange: Generate an array with regularly spaced values.
- np.linspace: Generate an array with a specified number of evenly spaced values over a specified range.
- np.ones: Create an array filled with ones.
- np.full: Create an array with a specified shape and fill value.

- np.zeros: Create an array filled with zeros.
- np.eye: Create a 2-D identity matrix.

```
import numpy as np
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# Creating arrays
arr_from_list = np.array([1, 2, 3])
arr_range = np.arange(0, 10, 2) # Start from 0, end at 10 (exclusive), step by 2
arr_linspace = np.linspace(0, 1, 5) # 5 evenly spaced values from 0 to 1
arr_ones = np.ones((2, 3)) # 2x3 array of ones
arr_full = np.full((3, 3), 7) # 3x3 array filled with 7
arr_zeros = np.zeros((2, 2)) # 2x2 array of zeros
arr_eye = np.eye(3) # 3x3 identity matrix
# Displaying arrays
display("Array from list:", arr from list)
display("Array range:", arr_range)
display("Array linspace:", arr_linspace)
display("Array of ones:", arr_ones)
display("Array filled with 7:", arr_full)
display("Array of zeros:", arr_zeros)
display("Identity matrix:", arr_eye)
'Array from list:'
array([1, 2, 3])
'Array range:'
array([0, 2, 4, 6, 8])
'Array linspace:'
array([0. , 0.25, 0.5 , 0.75, 1. ])
'Array of ones:'
array([[1., 1., 1.],
      [1., 1., 1.]])
'Array filled with 7:'
array([[7, 7, 7],
      [7, 7, 7],
      [7, 7, 7]])
'Array of zeros:'
array([[0., 0.],
      [0., 0.]])
'Identity matrix:'
array([[1., 0., 0.],
      [0., 1., 0.],
       [0., 0., 1.]])
```

→ Array attributes (shape, size, dtype)

Arrays have attributes that provide information about their structure and content:

- shape: Tuple representing the array dimensions.
- size: Total number of elements in the array.
- dtype: Data type of the array elements.

```
print("Shape:", arr_range.shape)
print("Size:", arr_linspace.size)
print("Data type:", arr_ones.dtype)

Shape: (5,)
Size: 5
Data type: float64
```

→ Accessing elements and subarrays

Accessing individual elements or subarrays in a NumPy array can be done using indexing and slicing.

```
arr_from_list = np.array([1, 2, 3])
arr_range = np.arange(0, 10, 2)

print("Element at index 2:", arr_from_list[2])

# Slicing subarrays
subarray = arr_range[1:4] # Elements at index 1, 2, 3
print("Subarray:", subarray)

Element at index 2: 3
Subarray: [2 4 6]
```

→ Reshaping arrays

Changing the shape of an array without changing its data. The reshape method is used for this.

→ Appending and inserting elements

Adding elements to an array using np.append or np.insert.

```
arr_from_list = np.array([1, 2, 3])

# Appending and inserting elements
arr_appended = np.append(arr_from_list, 4)
arr_inserted = np.insert(arr_from_list, 1, [0.5, 1.5]) # Insert elements at index 1

print("Appended array:", arr_appended)
print("Inserted array:", arr_inserted)

Appended array: [1 2 3 4]
Inserted array: [1 0 1 2 3]
```

→ Deleting elements

Removing elements from an array using np.delete.

```
arr_range = np.arange(2, 10, 2)
print(arr_range)

arr_deleted = np.delete(arr_range, [0, 2]) # Delete elements at indices 0 and 2
print("\nArray after deletion:", arr_deleted)

[2 4 6 8]

Array after deletion: [4 8]
```

→ Slicing and indexing techniques

Various techniques for slicing and indexing arrays based on conditions or intervals.

```
arr_range = np.arange(1, 10, 2)

print(arr_range)

# Slicing and indexing techniques

arr_slice_condition = arr_range[arr_range > 5] # Elements greater than 5

arr_slice_interval = arr_range[1:4] # Elements at index 1, 2, 3

print("\nSlice by condition:", arr_slice_condition)

print("Slice by interval:", arr_slice_interval)

[1 3 5 7 9]

Slice by condition: [7 9]

Slice by interval: [3 5 7]
```

→ Concatenating arrays

Combining multiple arrays along an existing axis.

```
arr_range = np.arange(1, 10, 2)
arr_linspace = np.linspace(0, 1, 5)
print(arr_range)
print(arr_linspace)

# Concatenating arrays
arr_concatenated = np.concatenate([arr_range, arr_linspace])
print("Concatenated array:", arr_concatenated)

[1 3 5 7 9]
[0. 0.25 0.5 0.75 1. ]
Concatenated array: [1. 3. 5. 7. 9. 0. 0.25 0.5 0.75 1. ]
```

→ Random sampling from arrays

Generating random samples from arrays using functions like np.random.choice.

```
arr_range = np.arange(1, 10, 2)
print(arr_range)

# Random sampling from arrays
random_samples = np.random.choice(arr_range, size=3)
print("Random samples:", random_samples)

[1 3 5 7 9]
Random samples: [9 3 9]
```

→ Loading and saving data using NumPy

NumPy provides functions to read and write data from/to files, such as CSV, TXT, and other common formats.

```
arr_range = np.arange(1, 10, 2)
print(arr_range)

np.savetxt('my_array.txt', arr_range, delimiter=',') # Save array to text file

loaded_array = np.loadtxt('my_array.txt', delimiter=',') # Load array from text file

print("Loaded array:", loaded_array)

[1 3 5 7 9]
Loaded array: [1. 3. 5. 7. 9.]
```

→ Statistics functions

```
v = np.array([1.2,7.4,4.2,8.5,6.3])

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print(np.mean(v)) # 5.52

print(np.median(v)) # 6.3

print(np.var(v)) # 6.6856

print(np.percentile(v,50)) #6.3 (50\% = médiane)

print(np.sum(v)) # 27.6

print(np.cumsum(v)) # [1.2 8.6 12.8 21.3 27.6]

5.5200000000000005
6.3
6.68559999999999
6.3
27.6
[ 1.2 8.6 12.8 21.3 27.6]
```

→ Exercice:

- 1. Create a NumPy array (arr1) with values [1, 2, 3, 4, 5].
- Create a NumPy array (arr2) with values [10, 20, 30, 40, 50].
- 3. Perform element-wise multiplication of arr1 and arr2. Save the result in a new array (result_mult).
- 4. Create a 3x3 identity matrix (identity_matrix).
- 5. Check the shape, size, and data type of arr1.
- 6. Reshape arr2 into a 5x1 matrix and name it reshaped_arr2.
- 7. Append a new element 6 to the end of arr1 and name the new array arr1_appended.
- 8. Insert a new element 25 at index 2 in arr2 and name the new array arr2_inserted.
- 9. Delete the element at index 3 in arr1 and name the new array arr1_deleted.
- 10. Delete the first row in identity_matrix and name the new array identity matrix deleted.
- 11. Slice arr1 to get elements greater than 2 and name the result arr1_slice_condition.
- 12. Slice arr2 to get elements between index 1 and 3 (inclusive) and name the result arr2_slice_interval.
- 13. Concatenate arr1 and arr2 along a new axis and name the result concatenated arrays.
- 14. Generate an array (random_array) of 10 random integers between 0 and 100.

- 15. Sample 3 random elements from random array without replacement.
- 16. Save random_array to a CSV file named "random_data.csv".
- 17. Load the data from "random_data.csv" into a new array (loaded_array).
- 18. Calculate the sum, cumulative sum, and mean of loaded array.
- 19. Calculate the mean of each column in identity_matrix_deleted.
- 20. Create an array called results containing the variables: sum_arr1, arr1_mean as elements, then save the result to a csv file named "results.csv".

3. Pandas:

The pandas module was designed for data manipulation and analysis. It is particularly powerful for handling structured data in table form.

To import pandas, we use the usual import command: "import pandas"

→ Series

A Series is a one-dimensional labeled array capable of holding any data type. It is similar to a column in a spreadsheet or a column in a SQL table.

```
import pandas as pd
import numpy as np

# Creating a Series from a list
data = [1, 3, 5, np.nan, 6, 8]
s = pd.Series(data)
print(s)

0    1.0
1    3.0
2    5.0
3    NaN
4    6.0
5    8.0
dtype: float64
```

→ DataFrame

A DataFrame is a two-dimensional, size-mutable, and potentially heterogeneous tabular data structure with labeled axes (rows and columns). It is similar to a spreadsheet or SQL table.

```
# Creating a DataFrame from a dictionary
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# first way
columns = ["Name", "Age", "City"]
index_list = [0,1,2]
# data
row1 = ['John', 25, 'New York']
row2 = ['Alice', 28, 'San Francisco']
row3 = ['Bob', 22, 'Los Angeles']
df = pd.DataFrame(columns = columns, index = index_list, data = [row1,row2,row3])
print(df)
Name Age City
0 John 25 New York
1 Alice 28 San Francisco
2 Bob 22 Los Angeles
data = {'Name': ['John', 'Alice', 'Bob'],
         'Age': [25, 28, 22],
         'City': ['New York', 'San Francisco', 'Los Angeles']}
df = pd.DataFrame(data)
print(df)
Name Age City
0 John 25 New York
1 Alice 28 San Francisco
2 Bob 22 Los Angeles
```

→ Reading data from different sources (CSV, Excel, SQL, etc.)

Pandas provides functions to read data from various sources like CSV, Excel, SQL databases, etc.

```
# Reading data from a CSV file

csv_data = pd.read_csv('Greenhouse_Gas_Emissions.csv')

# Reading data from an Excel file

excel_data = pd.read_excel('RuralAtlasData24.xlsx')

# Reading data from a SQL database

sql_data = pd.read_sql('SELECT * FROM table', connection)
```

→ Displaying basic information (head, tail, info)

Pandas provides methods like head, tail, and info to display basic information about the DataFrame.

```
# Reading data from a CSV file
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df = pd.read csv('Greenhouse Gas Emissions.csv')
# Displaying the first few rows
print("Head of the dataframe")
print(df.head())
# Displaying the last few rows
print("\n\nTail of the dataframe")
print(df.tail())
# Displaying information about the DataFrame
print("\n\nInfo about the dataframe")
print(df.info())
Head of the dataframe
 Month/Year Facilities Fleet Total
0 Aug 2020 4617 3946 8563
1 Oct 2020 4337 4140 8477
                 4681 4017 8686
2 Nov 2020
3 Dec 2020 6195 4319 10514
4 Jan 2021 6011 4192 10203
Tail of the dataframe
  Month/Year Facilities Fleet Total
```

```
Month/Year Facilities Fleet Total
43 Apr 2023 3843 3899 7742
44 May 2023 4013 3976 7989
45 Jun 2023 3882 4528 8410
46 Jul 2023 4427 4465 8892
47 Aug 2023 4118 4807 8925
```

Info about the dataframe
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 48 entries, 0 to 47
Data columns (total 4 columns):
Column Non-Null Count Dtype

0 Month/Year 48 non-null object 1 Facilities 48 non-null int64 2 Fleet 48 non-null int64 3 Total 48 non-null int64

dtypes: int64(3), object(1)
memory usage: 1.4+ KB

None

→ Descriptive statistics (describe)

The describe method provides descriptive statistics of the DataFrame, including measures like mean, standard deviation, min, max, etc.

```
print(df.describe())

Facilities Fleet Total
count 48.000000 48.000000 48.000000
mean 4672.541667 4329.354167 8998.354167
std 737.594248 683.400960 1152.077485
min 3486.000000 2410.000000 6400.000000
25% 4101.000000 4064.000000 8308.000000
50% 4506.500000 4282.500000 8886.000000
75% 5160.000000 4639.250000 9886.500000
max 6284.000000 6891.000000 11267.000000
```

→ Selecting columns and rows

Pandas allows selecting specific columns and rows using various methods, such as loc and iloc.

```
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# Selecting a specific column
print(df['Facilities'][:5])
# Selecting specific rows
print("\n\n\n")
print(df.iloc[0]) # Selects the first row
0 4617
  4337
2 4681
3
  6195
   6011
Name: Facilities, dtype: int64
Month/Year Aug 2020
Facilities 4617
Fleet
              3946
              8563
Total
Name: 0, dtype: object
```

→ Conditional selection

Conditional selection allows filtering data based on specific conditions.

```
# Selecting rows where Age is greater than 25
 print(df[df['Total'] > 8998])
    Month/Year Facilities Fleet Total
3 Dec 2020 6195 4319 10514
4 Jan 2021 6011 4192 10203
5 Feb 2021 5736 4170 9906
13 Nov 2021 4851 4584 9435
14 Dec 2021 5614 4354 9968
15 Jan 2022 6028 4596 10624
16 Mar 2022
                             4684 5196 9880
                             4820 4183 9003
19 Oct 2019
                             6238 4976 11214
 20 Dec 2019
                             5166 5133 10299
 21 Jul 2019
 22 Nov 2019
                               5507 4838 10345
 23
       Aug 2019
                               5160 5237 10397
 24
       Sep 2019
                                4597
                                           4742
                                6284 4983 11267
 25
        Jan 2020
                               5384 4486
 27
       Feb 2020
                                                      9870
 33 Jun 2022
                              4222 6891 11113

    33
    Jun 2022
    4222
    6891
    11113

    35
    Aug 2022
    4312
    4884
    9196

    38
    Nov 2022
    4586
    4658
    9244

    39
    Dec 2022
    5665
    4423
    10088

    40
    Jan 2023
    5160
    4246
    9406

    41
    Feb 2023
    5011
    4370
    9381

    42
    Mar 2023
    4790
    4633
    9423
```

→ Detecting and filling missing values

Pandas provides methods like isnull to detect missing values and fillna to fill them.

```
# Detecting missing values
print(df.isnull().sum())

# Filling missing values with a specific value
df.fillna(0, inplace=True)

Month/Year 0
Facilities 0
Fleet 0
Total 0
dtype: int64
```

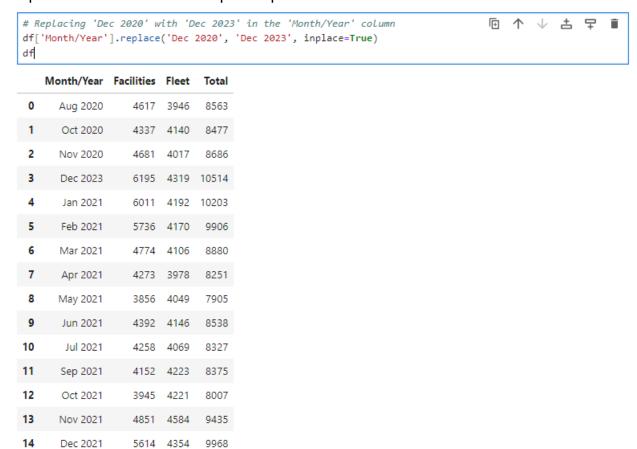
→ Dropping missing values

The dropna method is used to remove rows with missing values.

```
# Dropping rows with missing values
df.dropna(inplace=True, axis=0)
```

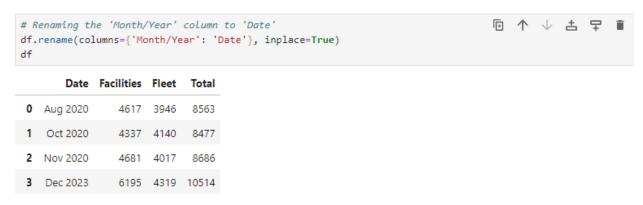
→ Replacing values

'replace' method is used to replace specific values with other values.



→ Renaming columns

The 'rename' method is used to rename columns in a DataFrame.



→ Grouping data with `groupby`

The 'groupby' method is used to group data based on one or more columns.

```
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# Grouping data by 'Date' and calculating the mean of each group
grouped_data = df.groupby('Date').mean()
print(grouped_data)
      Facilities Fleet Total
Date
Apr 2020
         3990.0 2421.5 6411.5
         4273.0 3978.0 8251.0
Apr 2021
Apr 2022
           4031.0 4004.0 8035.0
         3843.0 3899.0
Apr 2023
Aug 2019
           5160.0 5237.0 10397.0
         4617.0 3946.0
Aug 2020
         4312.0 4884.0
                         9196.0
Aug 2022
         4118.0 4807.0 8925.0
Aug 2023
Dec 2019
        6238.0 4976.0 11214.0
Dec 2021 5614.0 4354.0 9968.0
Dec 2022 5665.0 4423.0 10088.0
Dec 2023 6195.0 4319.0 10514.0
Feb 2020 5384.0 4486.0 9870.0
Feb 2021 5736.0 4170.0 9906.0
Feb 2023 5011.0 4370.0 9381.0
```

→ Aggregating functions (sum, mean, count)

Aggregating functions like sum, mean, and count are used to perform operations on grouped data.

```
# Calculating the sum of Fleets for each Date
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sum_fleet = df.groupby('Date')['Fleet'].sum()
sum_fleet
Apr 2020
        4843
Apr 2021 3978
        4004
Apr 2022
Apr 2023 3899
Aug 2019 5237
Aug 2020 3946
Aug 2022 4884
Aug 2023 4807
Dec 2019 4976
Dec 2021 4354
Dec 2022 4423
Dec 2023 4319
```

→ Combining DataFrames using merge and concat

Pandas provides merge and concat methods to combine DataFrames.

```
# Concatenating two DataFrames vertically

df_concatenated = pd.concat([df, grouped_data])

# Merging two DataFrames based on a common column

df_merged = pd.merge(df, grouped_data, on='Total')

len(df_concatenated)

95
```

→ Exporting data as csv, excel ..

Pandas allows exporting data to various formats like CSV, Excel, SQL, etc.

```
# Exporting DataFrame to a CSV file

df.to_csv('output.csv', index=False)

# Exporting DataFrame to an Excel file

df.to_excel('output.xlsx', index=False)
```

→ Exercise :

- 1. Develop a script that utilizes the pandas library to read the contents of the csv file named "solar_energy_data_by_binatnaData.csv" into a DataFrame, and assign it the variable name "df".
- 2. Display the first and last few rows of the DataFrame 'data' using the 'head()' and 'tail()' functions, and the column names.
- 3. Rename the columns by the following names: A, E, I, T
- 4. Determine and print the count of missing (NaN) values for each column in the DataFrame.
- 5. Eliminate the rows containing NaN values from the DataFrame.
- Check for duplicate rows in the DataFrame using the 'duplicated()' method.
- 7. Calculate the Energy for each row by applying the formula: Energy = Solar Panel Area * Solar Panel Efficiency * Solar Irradiance * Time.
- 8. Calculate the energy for each row by applying the same formula, this time using a function that takes 4 arguments: A (Area), E (Efficiency), I (Irradiance), T (Time), then the function returns the calculated Energy.
- 9. Introduce a new column in the DataFrame, naming it "Energy," and populate it with the calculated energy values.
- 10. Save the modified DataFrame with the additional "Energy" column to a new csv file.