

# Data Analysis Tools with Pandas 2 - SF Salaries Exercise

แบบฝึกหัดนี้เป็นแบบฝึกหัดทดสอบทักษะการใช้งาน library pandas ด้วย [SF Salaries Dataset](https://www.kaggle.com/kaggle/sf-salaries) (<https://www.kaggle.com/kaggle/sf-salaries>) จากเว็บไซต์ Kaggle ให้ทำตามคำสั่ง ต่อไปนี้

Import pandas as pd.

```
In [1]: 1 import pandas as pd
```

ให้นำเข้าข้อมูลจากไฟล์ Salaries.csv มาในรูปของ dataframe โดยตั้งชื่อตัวแปรว่า sal

```
In [2]: 1 sal = pd.read_csv("Salaries.csv")
```

Check the head of the DataFrame.

```
In [3]: 1 sal.head()
```

Out[3]:

|   | Id | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits | TotalPay  |
|---|----|-------------------|--|-----------|-------------|-----------|----------|-----------|
| 0 | 1  | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | NaN      | 567595.43 |
| 1 | 2  | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | NaN      | 538909.28 |
| 2 | 3  | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | NaN      | 335279.91 |
| 3 | 4  | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | NaN      | 332343.61 |
| 4 | 5  | PATRICK GARDNER   | DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)  | 134401.60 | 9737.00     | 182234.59 | NaN      | 326373.19 |

ใช้คำสั่ง .info() method to ในการดูภาพรวมของข้อมูลทั้งหมด

In [4]: 1 sal.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 148654 entries, 0 to 148653
Data columns (total 13 columns):
#   Column                Non-Null Count  Dtype
---  -
0   Id                    148654 non-null int64
1   EmployeeName          148654 non-null object
2   JobTitle              148654 non-null object
3   BasePay               148045 non-null float64
4   OvertimePay           148650 non-null float64
5   OtherPay              148650 non-null float64
6   Benefits              112491 non-null float64
7   TotalPay              148654 non-null float64
8   TotalPayBenefits      148654 non-null float64
9   Year                  148654 non-null int64
10  Notes                  0 non-null      float64
11  Agency                148654 non-null object
12  Status                0 non-null      float64
dtypes: float64(8), int64(2), object(3)
memory usage: 14.7+ MB
```

**ลบคอลัมน์ Notes และ Status ออก**

In [5]: 1 sal.drop("Notes", axis = 1, inplace = True)  
2 sal.drop("Status", axis = 1, inplace = True)

In [6]: 1 sal

Out[6]:

|   | Id | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits |
|---|----|-------------------|--|-----------|-------------|-----------|----------|
| 0 | 1  | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | NaN      |
| 1 | 2  | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | NaN      |
| 2 | 3  | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | NaN      |
| 3 | 4  | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | NaN      |
|   |    |                   | DEPUTY CHIEF                                   |           |             |           |          |

**หาค่าเฉลี่ยของ Benefits ใน sal**

```
In [7]: 1 sal["Benefits"].mean()
```

```
Out[7]: 25007.893150829852
```

ใน sal แทน Benefits ที่เป็น null ด้วย 0

```
In [8]: 1 sal["Benefits"].fillna(value = 0, inplace = True)
```

```
In [9]: 1 sal.head()
```

```
Out[9]:
```

|   | Id | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits | TotalPay  |
|---|----|-------------------|--|-----------|-------------|-----------|----------|-----------|
| 0 | 1  | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      | 567595.43 |
| 1 | 2  | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | 0.0      | 538909.28 |
| 2 | 3  | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | 0.0      | 335279.91 |
| 3 | 4  | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | 0.0      | 332343.61 |
| 4 | 5  | PATRICK GARDNER   | DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)  | 134401.60 | 9737.00     | 182234.59 | 0.0      | 326373.19 |

หาค่าเฉลี่ยของ Benefits ใน sal อีกครั้ง

```
In [10]: 1 sal["Benefits"].mean()
```

```
Out[10]: 18924.23283887417
```

จงเพิ่มคอลัมน์ Year(TH) ใน sal ให้เป็นเลขปี พศ

```
In [11]: 1 sal["Year(TH)"] = sal["Year"] + 543
```

In [12]:

1 sal

Out[12]:

|   | Id | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits |
|---|----|-------------------|--|-----------|-------------|-----------|----------|
| 0 | 1  | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      |
| 1 | 2  | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | 0.0      |
| 2 | 3  | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | 0.0      |
| 3 | 4  | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | 0.0      |
|   |    |                   | DEPUTY CHIEF                                   |           |             |           |          |

จงเพิ่มคอลัมน์ Level มีค่าเป็น L เมื่อ TotalPayBenefits น้อยกว่า 1 แสน และเป็น H เมื่อมากกว่าเท่ากับ 1 แสน

In [24]:

```

1 def cal(TPB):
2
3     if (TPB < 100000) :
4         return "L"
5     else:
6         return "H"

```

In [25]:

```

1 sal["Level"] = sal["TotalPayBenefits"].apply(cal)

```

In [26]:

|        |                   |   |           |           |           |     |        |  |
|--------|-------------------|---|-----------|-----------|-----------|-----|--------|--|
| 1      | sal               |   |           |           |           |     |        |  |
| 3      | ALBERT PARDINI    | (POLICE DEPARTMENT)                           | 212739.13 | 106088.18 | 16452.60  | 0.0 | 335279 |  |
| 4      | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC          | 77916.00  | 56120.71  | 198306.90 | 0.0 | 332343 |  |
| 5      | PATRICK GARDNER   | DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT) | 134401.60 | 9737.00   | 182234.59 | 0.0 | 326373 |  |
| ...    | ...               | ...   | ...       | ...       | ...       | ... | ...    |  |
| 148654 | Joe Lopez         | Counselor, Log Cabin Ranch                    | 0.00      | 0.00      | -618.13   | 0.0 | -618   |  |
| 148656 | David Copperfield | Magician                                      | NaN       | NaN       | NaN       | NaN | NaN    |  |
| 0      | A                 | NaN   | 10000.00  | NaN       | NaN       | NaN | NaN    |  |

เซต Id ให้เป็น index

In [13]:

1 sal.set\_index("Id", inplace = True)

In [14]:

1 sal

Out[14]:

|    | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits | Total  |
|----|-------------------|--|-----------|-------------|-----------|----------|--------|
| Id |                   |  |           |             |           |          |        |
| 1  | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      | 567595 |
| 2  | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | 0.0      | 538909 |
| 3  | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | 0.0      | 335279 |
| 4  | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | 0.0      | 332343 |

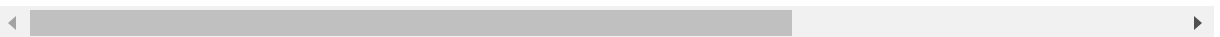
เปลี่ยนชื่อคอลัมน์ Year เป็น Year(Eng)

In [15]: 1 sal.rename(columns = {"Year" : "Year(Eng)"})

Out[15]:

|        | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits | TotalPay  |
|--------|-------------------|--|-----------|-------------|-----------|----------|-----------|
| Id     |                   |  |           |             |           |          |           |
| 1      | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      | 567595.43 |
| 2      | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | 0.0      | 538909.28 |
| 3      | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | 0.0      | 335279.91 |
| 4      | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | 0.0      | 332343.61 |
| 5      | PATRICK GARDNER   | DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)  | 134401.60 | 9737.00     | 182234.59 | 0.0      | 326373.19 |
| ...    | ...               | ...  | ...       | ...         | ...       | ...      | ...       |
| 148650 | Roy I Tillery     | Custodian                                      | 0.00      | 0.00        | 0.00      | 0.0      | 0.00      |
| 148651 | Not provided      | Not provided                                   | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148652 | Not provided      | Not provided                                   | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148653 | Not provided      | Not provided                                   | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148654 | Joe Lopez         | Counselor, Log Cabin Ranch                     | 0.00      | 0.00        | -618.13   | 0.0      | -618.13   |

148654 rows × 11 columns



เพิ่มคนชื่อ David Copperfield ทำงานเป็น Magician คอลัมอื่นๆเป็น null

In [18]: 1 sal.loc["148656", "EmployeeName"] = "David Copperfield"  
2 sal.loc["148656", "JobTitle"] = "Magician"

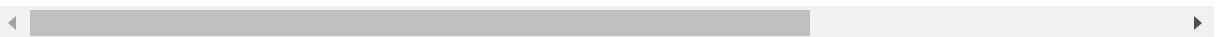
In [19]:

1 sal

Out[19]:

|        | EmployeeName         | JobTitle  | BasePay   | OvertimePay | OtherPay  | Benefits | TotalPay  |
|--------|----------------------|---|-----------|-------------|-----------|----------|-----------|
| Id     |                      |   |           |             |           |          |           |
| 1      | NATHANIEL FORD       | GENERAL<br>MANAGER-<br>METROPOLITAN<br>TRANSIT<br>AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      | 567595.43 |
| 2      | GARY JIMENEZ         | CAPTAIN III<br>(POLICE<br>DEPARTMENT)                       | 155966.02 | 245131.88   | 137811.38 | 0.0      | 538909.28 |
| 3      | ALBERT<br>PARDINI    | CAPTAIN III<br>(POLICE<br>DEPARTMENT)                       | 212739.13 | 106088.18   | 16452.60  | 0.0      | 335279.91 |
| 4      | CHRISTOPHER<br>CHONG | WIRE ROPE<br>CABLE<br>MAINTENANCE<br>MECHANIC               | 77916.00  | 56120.71    | 198306.90 | 0.0      | 332343.61 |
| 5      | PATRICK<br>GARDNER   | DEPUTY CHIEF<br>OF<br>DEPARTMENT,<br>(FIRE<br>DEPARTMENT)   | 134401.60 | 9737.00     | 182234.59 | 0.0      | 326373.19 |
| ...    | ...                  | ...   | ...       | ...         | ...       | ...      | ...       |
| 148651 | Not provided         | Not provided  | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148652 | Not provided         | Not provided  | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148653 | Not provided         | Not provided  | NaN       | NaN         | NaN       | 0.0      | 0.00      |
| 148654 | Joe Lopez            | Counselor, Log<br>Cabin Ranch                               | 0.00      | 0.00        | -618.13   | 0.0      | -618.13   |
| 148656 | David<br>Copperfield | Magician  | NaN       | NaN         | NaN       | NaN      | NaN       |

148655 rows × 11 columns



สร้าง Dataframe ที่ EmployeeName มีนาย A , B และ C ซึ่งมี BasePay เป็น 10000 แล้วนำไปรวมกับ sal

```
In [20]: 1 df = pd.DataFrame({"EmployeeName" : ["A", "B", "C"],
2                        "BasePay" : [10000, 10000, 10000]},
3      index = [0, 1, 2])
4      df
```

Out[20]:

|   | EmployeeName | BasePay |
|---|--------------|---------|
| 0 | A            | 10000   |
| 1 | B            | 10000   |
| 2 | C            | 10000   |

```
In [21]: 1 sal = pd.concat([sal, df])
2      sal
```

Out[21]:

|   | EmployeeName      | JobTitle                                       | BasePay   | OvertimePay | OtherPay  | Benefits | TotalF |
|---|-------------------|--|-----------|-------------|-----------|----------|--------|
| 1 | NATHANIEL FORD    | GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY | 167411.18 | 0.00        | 400184.25 | 0.0      | 567595 |
| 2 | GARY JIMENEZ      | CAPTAIN III (POLICE DEPARTMENT)                | 155966.02 | 245131.88   | 137811.38 | 0.0      | 538909 |
| 3 | ALBERT PARDINI    | CAPTAIN III (POLICE DEPARTMENT)                | 212739.13 | 106088.18   | 16452.60  | 0.0      | 335279 |
| 4 | CHRISTOPHER CHONG | WIRE ROPE CABLE MAINTENANCE MECHANIC           | 77916.00  | 56120.71    | 198306.90 | 0.0      | 332343 |
|   |                   | DEPUTY CHIEF                                   |           |             |           |          |        |

สร้างตาราง salB ซึ่งเก็บเฉพาะของคนที่ไม่มี BasePay

```
In [22]: 1 salB = sal[sal["BasePay"].isnull()]
```



In [23]: 1 salB.head()

Out[23]:

|              | EmployeeName        | JobTitle                        | BasePay | OvertimePay | OtherPay  | Benefits | TotalPay  | TotalP |
|--------------|---------------------|---------------------------------|---------|-------------|-----------|----------|-----------|--------|
| <b>81392</b> | Kevin P<br>Cashman  | Deputy<br>Chief 3               | NaN     | 0.0         | 149934.11 | 0.00     | 149934.11 |        |
| <b>84507</b> | Demetria<br>Mullens | Licensed<br>Vocational<br>Nurse | NaN     | 0.0         | 110485.41 | 20779.00 | 110485.41 |        |
| <b>84961</b> | Michael M<br>Horan  | Park<br>Patrol<br>Officer       | NaN     | 0.0         | 120000.00 | 8841.48  | 120000.00 |        |
| <b>90526</b> | Thomas Tang         | Police<br>Officer 3             | NaN     | 0.0         | 106079.31 | 0.00     | 106079.31 |        |
| <b>90787</b> | Michael C Hill      | Deputy<br>Sheriff               | NaN     | 0.0         | 81299.02  | 23877.53 | 81299.02  |        |

In [165]: 1 salB.info()

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 610 entries, 81392 to 148655
Data columns (total 12 columns):
#   Column                Non-Null Count  Dtype
---  -
0   EmployeeName          610 non-null    object
1   JobTitle               610 non-null    object
2   BasePay                0 non-null      float64
3   OvertimePay            605 non-null    float64
4   OtherPay               605 non-null    float64
5   Benefits               609 non-null    float64
6   TotalPay               609 non-null    float64
7   TotalPayBenefits       609 non-null    float64
8   Year(Eng)              609 non-null    float64
9   Agency                 609 non-null    object
10  Year(TH)                609 non-null    float64
11  Level                  609 non-null    object
dtypes: float64(8), object(4)
memory usage: 62.0+ KB
```

----- ภาพนามยปัญญา ปัญญาที่เกิดจากการลงมือทำ! -----