

```
In [2]: import pandas as pd
data = pd.read_csv("D:\DATA ANALYST AND DATA SCIENCE\PYTHON\pandas project\SALARIES.csv")
data
```

Out[2]:

	Id	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year	Notes	Agency	Status
0	1	NATHANIEL FORD	GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	567595.43	2011	NaN	San Francisco	NaN
1	2	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	538909.28	2011	NaN	San Francisco	NaN
2	3	ALBERT PARDINI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	335279.91	2011	NaN	San Francisco	NaN
3	4	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.00	56120.71	198306.90	NaN	332343.61	332343.61	2011	NaN	San Francisco	NaN
4	5	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT,(FIRE DEPARTMENT)	134401.60	9737.00	182234.59	NaN	326373.19	326373.19	2011	NaN	San Francisco	NaN
...	...	...	...	...	...	...	...	...	...	...	...	...	...
148649	148650	Roy I Tillery	Custodian	0.00	0.00	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
148650	148651	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
148651	148652	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
148652	148653	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
148653	148654	Joe Lopez	Counselor, Log Cabin Ranch	0.00	0.00	-618.13	0.0	-618.13	-618.13	2014	NaN	San Francisco	NaN

148654 rows × 13 columns



## DISPLAY TOP 10 ROWS OF THE DATASET

In [3]:

```
data.head(10)
```

Out[3]:

	Id	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year	Notes	Agency	Status
0	1	NATHANIEL FORD	GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	567595.43	2011	NaN	San Francisco	NaN
1	2	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	538909.28	2011	NaN	San Francisco	NaN
2	3	ALBERT PARDINI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	335279.91	2011	NaN	San Francisco	NaN
3	4	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.00	56120.71	198306.90	NaN	332343.61	332343.61	2011	NaN	San Francisco	NaN
4	5	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT,(FIRE DEPARTMENT)	134401.60	9737.00	182234.59	NaN	326373.19	326373.19	2011	NaN	San Francisco	NaN
5	6	DAVID SULLIVAN	ASSISTANT DEPUTY CHIEF II	118602.00	8601.00	189082.74	NaN	316285.74	316285.74	2011	NaN	San Francisco	NaN
6	7	ALSON LEE	BATTALION CHIEF, (FIRE DEPARTMENT)	92492.01	89062.90	134426.14	NaN	315981.05	315981.05	2011	NaN	San Francisco	NaN
7	8	DAVID KUSHNER	DEPUTY DIRECTOR OF INVESTMENTS	256576.96	0.00	51322.50	NaN	307899.46	307899.46	2011	NaN	San Francisco	NaN
8	9	MICHAEL MORRIS	BATTALION CHIEF, (FIRE DEPARTMENT)	176932.64	86362.68	40132.23	NaN	303427.55	303427.55	2011	NaN	San Francisco	NaN
9	10	JOANNE HAYES-WHITE	CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	285262.00	0.00	17115.73	NaN	302377.73	302377.73	2011	NaN	San Francisco	NaN





## CHECK THE LAST 10 ROWS OF THE DATASET

In [5]: `data.tail(10)`

	<b>Id</b>	<b>EmployeeName</b>	<b>JobTitle</b>	<b>BasePay</b>	<b>OvertimePay</b>	<b>OtherPay</b>	<b>Benefits</b>	<b>TotalPay</b>	<b>TotalPayBenefits</b>	<b>Year</b>	<b>Notes</b>	<b>Agency</b>	<b>Status</b>
<b>148644</b>	148645	Randy D Winn	Stationary Eng, Sewage Plant	0.0	0.0	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148645</b>	148646	Carolyn A Wilson	Human Services Technician	0.0	0.0	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148646</b>	148647	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148647</b>	148648	Joann Anderson	Communications Dispatcher 2	0.0	0.0	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148648</b>	148649	Leon Walker	Custodian	0.0	0.0	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148649</b>	148650	Roy I Tillery	Custodian	0.0	0.0	0.00	0.0	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148650</b>	148651	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148651</b>	148652	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148652</b>	148653	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	0.00	2014	NaN	San Francisco	NaN
<b>148653</b>	148654	Joe Lopez	Counselor, Log Cabin Ranch	0.0	0.0	-618.13	0.0	-618.13	-618.13	2014	NaN	San Francisco	NaN

## FIND SHAPE OF OUR DATASET(NUMBER OF ROWS AND NUMBER OF COLUMNS)

In [6]: `data.shape`

Out[6]: `(148654, 13)`

In [7]: `print("Number of Rows", data.shape[0])`  
`print("Number of Columns", data.shape[1])`

Number of Rows 148654  
Number of Columns 13

## GETTING INFORMATION ABOUT OUR DATASET LIKE TOTAL NUMBER OF ROWS, TOTAL NUMBER OF COLUMNS, DATATYPES OF EACH COLUMNS AND MEMORY REQUIREMENT

In [8]: `data.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
```





## CHECK NULL VALUES IN THE DATASET

```
In [9]: data.isnull().sum()
```

```
Out[9]: Id                0
EmployeeName            0
JobTitle                0
BasePay                609
OvertimePay            4
OtherPay               4
Benefits              36163
TotalPay               0
TotalPayBenefits       0
Year                  0
Notes               148654
Agency               0
Status              148654
dtype: int64
```

## DROP ID, NOTES, AGENCY AND STATUS COLUMNS

```
In [11]: data.columns
```

```
Out[11]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
               'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency',
               'Status'],
              dtype='object')
```

```
In [12]: data = data.drop(["Id", "Notes", "Agency", "Status"], axis=1)
```

```
In [13]: data.head(1)
```

```
Out[13]:
```

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year
0	NATHANIEL FORD	GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY	167411.18	0.0	400184.25	NaN	567595.43	567595.43	2011

```
In [13]: data.head(1)
```

Out[13]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year
0	NATHANIEL FORD	GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY	167411.18	0.0	400184.25	NaN	567595.43	567595.43	2011



# GET OVERALL STATISTICS ABOUT THE DATAFRAME

```
In [14]: data.describe(include="all")
```

Out[14]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year
count	148654	148654	148045.000000	148650.000000	148650.000000	112491.000000	148654.000000	148654.000000	148654.000000
unique	110811	2159	NaN	NaN	NaN	NaN	NaN	NaN	NaN
top	Kevin Lee	Transit Operator	NaN	NaN	NaN	NaN	NaN	NaN	NaN
freq	13	7036	NaN	NaN	NaN	NaN	NaN	NaN	NaN
mean	NaN	NaN	66325.448840	5066.059886	3648.767297	25007.893151	74768.321972	93692.554811	2012.522643
std	NaN	NaN	42764.635495	11454.380559	8056.601866	15402.215858	50517.005274	62793.533483	1.117538
min	NaN	NaN	-166.010000	-0.010000	-7058.590000	-33.890000	-618.130000	-618.130000	2011.000000
25%	NaN	NaN	33588.200000	0.000000	0.000000	11535.395000	36168.995000	44065.650000	2012.000000
50%	NaN	NaN	65007.450000	0.000000	811.270000	28628.620000	71426.610000	92404.090000	2013.000000
75%	NaN	NaN	94691.050000	4658.175000	4236.065000	35566.855000	105839.135000	132876.450000	2014.000000
max	NaN	NaN	319275.010000	245131.880000	400184.250000	96570.660000	567595.430000	567595.430000	2014.000000

## FIND OCCURRENCE OF THE EMPLOYEE NAMES(TOP 5)

In [15]: `data.columns`

Out[15]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
dtype='object')

In [17]: `data["EmployeeName"].value_counts().head()`

Out[17]: Kevin Lee 13  
Richard Lee 11  
Steven Lee 11  
William Wong 11  
Stanley Lee 9  
Name: EmployeeName, dtype: int64

## FIND THE NUMBER OF UNIQUE JOB TITLES

In [18]: `data.columns`

Out[18]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
dtype='object')

In [19]: `data["JobTitle"].nunique()`

Out[19]: 2159

## TOTAL NUMBER OF JOB TITLES CONTAIN CAPTAIN

In [20]: `data.columns`

Out[20]: `Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
 dtype='object')`

In [24]: `len(data[data["JobTitle"].str.contains("CAPTAIN", case=False)])`

Out[24]: 552

## DISPLAY ALL THE EMPLOYEE NAMES FROM THE FIRE DEPARTMENT

In [25]: `data.columns`

Out[25]: `Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
 dtype='object')`

In [26]: `data[data["JobTitle"].str.contains("fire", case=False)]["EmployeeName"]`

Out[26]:

4	PATRICK GARDNER
6	ALSON LEE
8	MICHAEL MORRIS
9	JOANNE HAYES-WHITE
10	ARTHUR KENNEY
	...
145956	Kenneth C Farris
147556	Edward A Dunn
148021	Kari A Johnson
148209	Sheryl K Lee
148554	Lawrence F Gatt

Name: EmployeeName, Length: 5879, dtype: object



## FIND THE MINIMUM, MAXIMUM AND AVERAGE BASE PAY



```
In [28]: data.columns
```

```
Out[28]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
              'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
              dtype='object')
```

```
In [29]: data["BasePay"].describe()
```

```
Out[29]: count    148045.000000  
mean      66325.448840  
std       42764.635495  
min       -166.010000  
25%       33588.200000  
50%       65007.450000  
75%       94691.050000  
max       319275.010000  
Name: BasePay, dtype: float64
```

## REPLACE "NOT PROVIDED" IN EMPLOYEE NAME COLUMN TO NaN

In [32]: `data.columns`

Out[32]: `Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
 dtype='object')`

In [35]: `import numpy as np  
data["EmployeeName"] = data["EmployeeName"].replace("Not provided", np.nan)`

In [36]: `data["EmployeeName"]`

Out[36]: `0 NATHANIEL FORD  
1 GARY JIMENEZ  
2 ALBERT PARDINI  
3 CHRISTOPHER CHONG  
4 PATRICK GARDNER  
...  
148649 Roy I Tillery  
148650 NaN  
148651 NaN  
148652 NaN  
148653 Joe Lopez  
Name: EmployeeName, Length: 148654, dtype: object`

```
name: EmployeeName, dtype: object
```

## DROP THE ROWS HAVING 5 MISSING VALUES



```
In [37]: data.drop(data[data.isnull().sum(axis=1)==5].index,axis=0,inplace=True)
```

```
In [38]: data.isnull().sum(axis=1)
```

```
Out[38]: 0      1
1      1
2      1
3      1
4      1
...
148645  0
148647  0
148648  0
148649  0
148653  0
Length: 148650, dtype: int64
```

## FIND JOB TITLE OF ALBERT PARDINI

```
In [39]: data.columns
```

```
Out[39]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
              'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
              dtype='object')
```

```
In [41]: data[data["EmployeeName"]=="ALBERT PARDINI"]["JobTitle"]
```

```
Out[41]: 2    CAPTAIN III (POLICE DEPARTMENT)
Name: JobTitle, dtype: object
```



## HOW MUCH ALBERT PARDINI MAKE(INCLUDE BENEFITS)

In [42]: `data.columns`

Out[42]: `Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
 dtype='object')`

In [45]: `data[data["EmployeeName"]=="ALBERT PARDINI"]["TotalPayBenefits"]`

Out[45]: `2 335279.91  
Name: TotalPayBenefits, dtype: float64`

## DISPLAY NAME OF THE PERSON HAVING THE HIGHEST BASE PAY

In [46]: `data.columns`

Out[46]: `Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
 dtype='object')`

In [50]: `data[data["BasePay"].max()=="data["BasePay"]"]["EmployeeName"]`

Out[50]: `72925 Gregory P Suhr  
Name: EmployeeName, dtype: object`

## FIND AVERAGE BASE PAY OF ALL EMPLOYEE PER YEAR

In [51]: `data.columns`

Out[51]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
dtype='object')

In [53]: `data.groupby("Year").mean()["BasePay"]`

C:\Users\somna\AppData\Local\Temp\ipykernel\_17600\1521391884.py:1: FutureWarning: The default value of numeric\_only in DataFrameGroupBy.mean is deprecated. In a future version, numeric\_only will default to False. Either specify numeric\_only or select only columns which should be valid for the function.  
`data.groupby("Year").mean()["BasePay"]`

Out[53]: Year  
2011 63595.956517  
2012 65436.406857  
2013 69630.030216  
2014 66564.421924  
Name: BasePay, dtype: float64

## FIND AVERAGE BASE PAY OF ALL EMPLOYEE PER JOB TITLE

In [54]: `data.columns`

Out[54]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
dtype='object')

In [55]: `data.groupby("JobTitle").mean()["BasePay"]`

C:\Users\somna\AppData\Local\Temp\ipykernel\_17600\3250857243.py:1: FutureWarning: The default value of numeric\_only in DataFrameGroupBy.mean is deprecated. In a future version, numeric\_only will default to False. Either specify numeric\_only or select only columns which should be valid for the function.  
`data.groupby("JobTitle").mean()["BasePay"]`

Out[55]: JobTitle  
ACCOUNT CLERK 43300.806506  
ACCOUNTANT 46643.172000  
ACCOUNTANT INTERN 28732.663958  
ACPO,JuvP, Juv Prob (SFERS) 62290.780000  
ACUPUNCTURIST 66374.400000

```
In [55]: data.groupby("JobTitle").mean()["BasePay"]
```

C:\Users\somna\AppData\Local\Temp\ipykernel\_17600\3250857243.py:1: FutureWarning: The default value of numeric\_only in DataFrameGroupBy.mean is deprecated. In a future version, numeric\_only will default to False. Either specify numeric\_only or select only columns which should be valid for the function.

```
data.groupby("JobTitle").mean()["BasePay"]
```

```
Out[55]: JobTitle
ACCOUNT CLERK          43300.806506
ACCOUNTANT             46643.172000
ACCOUNTANT INTERN      28732.663958
ACPO,JuvP, Juv Prob (SFERS) 62290.780000
ACUPUNCTURIST          66374.400000
...
X-RAY LABORATORY AIDE   47664.773077
X-Ray Laboratory Aide   46086.387100
YOUTH COMMISSION ADVISOR, BOARD OF SUPERVISORS 52609.910000
Youth Comm Advisor      39077.957500
ZOO CURATOR            43148.000000
Name: BasePay, Length: 2158, dtype: float64
```

## FIND AVERAGE BASE PAY OF ALL EMPLOYEE HAVING JOB TITLE ACCOUNTANT

```
In [56]: data.columns
```

```
Out[56]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
              'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
              dtype='object')
```

```
In [58]: data[data["JobTitle"]=="ACCOUNTANT"]["BasePay"].mean()
```

```
Out[58]: 46643.172
```

Out[58]: 46643.172

## FIND TOP 5 MOST COMMON JOBS

In [59]: `data.columns`

Out[59]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',  
          'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],  
          dtype='object')

In [61]: `data["JobTitle"].value_counts().head()`

Out[61]:

Transit Operator	7036
Special Nurse	4389
Registered Nurse	3736
Public Svc Aide-Public Works	2518
Police Officer 3	2421

Name: JobTitle, dtype: int64

In [ ]: