In [1]: import numpy as np
import pandas as pd
#%matplotlib notebook
%matplotlib inline

import the dataset into a dataframe

Out[2]:

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

148654 rows × 13 columns

```
display the column names

In [3]: df.columns

Out[3]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay', 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency', 'Status'], dtype='object')

display the number of rows and cols

In [4]: df.shape

Out[4]: (148654, 13)

display the dataframe info (types of data in columns and not null values etc.)
```

```
In [5]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 148654 entries, 0 to 148653
Data columns (total 13 columns):
    Column
                      Non-Null Count
                                       Dtype
    ____
                      _____
 0
    Τd
                      148654 non-null int64
    EmployeeName
                      148654 non-null object
 1
    JobTitle
                      148654 non-null object
 2
 3
    BasePay
                      148045 non-null float64
 4
    OvertimePay
                      148650 non-null float64
    OtherPay
                      148650 non-null float64
    Benefits
                      112491 non-null float64
 7
    TotalPay
                      148654 non-null float64
    TotalPayBenefits 148654 non-null float64
                      148654 non-null int64
 9
    Year
 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
```

display stats of the dataframe like count, mean, std, max, 25% etc.....

In [6]: df.describe(include='all')

Out[6]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	
count	148654.000000	148654	148654	148045.000000	148650.000000	148650.000000	112491.000000	148654.000000	148654.000000	1
unique	NaN	110811	2159	NaN	NaN	NaN	NaN	NaN	NaN	
top	NaN	Kevin Lee	Transit Operator	NaN	NaN	NaN	NaN	NaN	NaN	
freq	NaN	13	7036	NaN	NaN	NaN	NaN	NaN	NaN	
mean	74327.500000	NaN	NaN	66325.448841	5066.059886	3648.767297	25007.893151	74768.321972	93692.554811	
std	42912.857795	NaN	NaN	42764.635495	11454.380559	8056.601866	15402.215858	50517.005274	62793.533483	
min	1.000000	NaN	NaN	-166.010000	-0.010000	-7058.590000	-33.890000	-618.130000	-618.130000	
25%	37164.250000	NaN	NaN	33588.200000	0.000000	0.000000	11535.395000	36168.995000	44065.650000	
50%	74327.500000	NaN	NaN	65007.450000	0.000000	811.270000	28628.620000	71426.610000	92404.090000	
75%	111490.750000	NaN	NaN	94691.050000	4658.175000	4236.065000	35566.855000	105839.135000	132876.450000	
max	148654.000000	NaN	NaN	319275.010000	245131.880000	400184.250000	96570.660000	567595.430000	567595.430000	

In [7]: #0R

df.describe()

Out[7]:

	ld	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Year	Notes	Statu
count	148654.000000	148045.000000	148650.000000	148650.000000	112491.000000	148654.000000	148654.000000	148654.000000	0.0	0.0
mean	74327.500000	66325.448841	5066.059886	3648.767297	25007.893151	74768.321972	93692.554811	2012.522643	NaN	Naf
std	42912.857795	42764.635495	11454.380559	8056.601866	15402.215858	50517.005274	62793.533483	1.117538	NaN	Nal
min	1.000000	-166.010000	-0.010000	-7058.590000	-33.890000	-618.130000	-618.130000	2011.000000	NaN	Naľ
25%	37164.250000	33588.200000	0.000000	0.000000	11535.395000	36168.995000	44065.650000	2012.000000	NaN	Naf
50%	74327.500000	65007.450000	0.000000	811.270000	28628.620000	71426.610000	92404.090000	2013.000000	NaN	Naľ
75%	111490.750000	94691.050000	4658.175000	4236.065000	35566.855000	105839.135000	132876.450000	2014.000000	NaN	Naf
max	148654.000000	319275.010000	245131.880000	400184.250000	96570.660000	567595.430000	567595.430000	2014.000000	NaN	Nai

4.1

display null values per column

In	[8]:	df.isnu	ull().sum()	
0ut	[8]:	Id		0
		Employe	eeName	0
		JobTit	le	0
		BasePa	У	609
		0verti	mePay	4
		OtherPa	ay	4
		Benefi ⁻	ts	36163
		TotalPa	ay	0
		TotalPa	ayBenefits	0
		Year	•	0
		Notes		148654
		Agency		0
		Status		148654
		<pre>dtype:</pre>	int64	

remove columns will all values as NaN

Out[9]:

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

148654 rows × 11 columns

display number of unique values in each column

```
In [10]: for x in df.columns:
             print(x, df[x].nunique())
         Id 148654
         EmployeeName 110811
         JobTitle 2159
         BasePay 109489
         OvertimePay 65998
         OtherPay 83225
         Benefits 98465
         TotalPay 138486
         TotalPayBenefits 142098
         Year 4
         Agency 1
         mean of total pay of all people based on year
In [11]: df.groupby('Year')['TotalPay'].mean()
Out[11]: Year
         2011
                  71744.103871
         2012
                  74113.262265
         2013
                  77611.443142
                  75463.918140
         2014
         Name: TotalPay, dtype: float64
         how many people have 0 overtime pay
In [12]: len(df[df['OvertimePay']==0])
Out[12]: 77321
```

max, min, mean, median and other stats of TotalPay of people having 0 OvertimePay

```
In [13]: df[df['OvertimePay']==0]['TotalPay'].describe()
Out[13]: count
                     77321.000000
                     60229.348901
          mean
                     49307.912350
          std
                      -618.130000
          min
                     13290.450000
          25%
          50%
                     58158.590000
          75%
                     91115.090000
          max
                    567595.430000
          Name: TotalPay, dtype: float64
          find Id of that person with max TotalPay you got in previous question
In [14]: df[df['TotalPay']==567595.430000].index
Out[14]: Int64Index([0], dtype='int64')
          name of employee with total pay benefits = 87619.78
In [15]: len(df[df['TotalPayBenefits']==87619.78])
Out[15]: 1
          how many people have BasePay > 150000 and OvertimePay > 100000
In [16]: len(df[(df['BasePay']>150000) & (df['OvertimePay']>100000)])
Out[16]: 12
          which job title generally has highest average TotalPayBenefits
In [17]: df[df['TotalPayBenefits']==max(df['TotalPayBenefits'])]['JobTitle']
Out[17]: 0
               GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY
          Name: JobTitle, dtype: object
```

How many employees are POLICE

```
In [18]: # .str.contains()
len(df[df['JobTitle'].str.contains('POLICE')])
Out[18]: 2512
```