```
In [1]: #Data Analysis With Python Pandas ---- Employee Salary DataSet
```

In [2]: import numpy as np
import pandas as pd

In [3]: pd.set_option("display.max_columns",None)
 df=pd.read_csv("E:\\KVR-PANDAS-EXCLUSIVE\\EMPLOYEE SALARAY ANALYSIS PROJECT\\Salaries.cs
 print(df)

```
Id
                       EmployeeName
                                     \
0
              1
                    NATHANIEL FORD
1
              2
                       GARY JIMENEZ
2
              3
                    ALBERT PARDINI
3
              4
                 CHRISTOPHER CHONG
              5
4
                   PATRICK GARDNER
. . .
                      Roy I Tillery
148649
        148650
148650
        148651
                       Not provided
                       Not provided
148651
        148652
148652
        148653
                       Not provided
148653
        148654
                          Joe Lopez
                                                  JobTitle
                                                               BasePay
0
        GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY
                                                             167411.18
1
                         CAPTAIN III (POLICE DEPARTMENT)
                                                             155966.02
2
                         CAPTAIN III (POLICE DEPARTMENT)
                                                             212739.13
3
                   WIRE ROPE CABLE MAINTENANCE MECHANIC
                                                              77916.00
4
          DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)
                                                             134401.60
                                                        . . .
                                                                    . . .
. . .
                                                 Custodian
                                                                   0.00
148649
148650
                                              Not provided
                                                                   NaN
                                              Not provided
                                                                   NaN
148651
148652
                                              Not provided
                                                                   NaN
                                                                   0.00
148653
                              Counselor, Log Cabin Ranch
        OvertimePay
                        OtherPay
                                   Benefits
                                               TotalPay
                                                          TotalPayBenefits
                                                                             Year
0
                0.00
                       400184.25
                                        NaN
                                              567595.43
                                                                 567595.43
                                                                              2011
1
                                                                             2011
          245131.88
                       137811.38
                                        NaN
                                              538909.28
                                                                 538909.28
2
          106088.18
                        16452.60
                                        NaN
                                              335279.91
                                                                 335279.91
                                                                             2011
            56120.71
3
                       198306.90
                                                                              2011
                                        NaN
                                              332343.61
                                                                 332343.61
4
             9737.00
                       182234.59
                                        NaN
                                              326373.19
                                                                 326373.19
                                                                              2011
                                        . . .
                                                                               . . .
                 . . .
148649
                0.00
                            0.00
                                        0.0
                                                   0.00
                                                                              2014
                                                                       0.00
148650
                 NaN
                             NaN
                                        NaN
                                                   0.00
                                                                       0.00
                                                                              2014
148651
                 NaN
                             NaN
                                        NaN
                                                                             2014
                                                   0.00
                                                                       0.00
148652
                 NaN
                             NaN
                                        NaN
                                                   0.00
                                                                       0.00
                                                                              2014
148653
                0.00
                         -618.13
                                        0.0
                                                -618.13
                                                                    -618.13
                                                                             2014
        Notes
                        Agency
                                Status
0
          NaN
                San Francisco
                                    NaN
                San Francisco
1
          NaN
                                    NaN
2
          NaN
                San Francisco
                                    NaN
3
          NaN
                San Francisco
                                    NaN
4
          NaN
                San Francisco
                                    NaN
           . . .
. . .
                                    . . .
                San Francisco
148649
          NaN
                                    NaN
148650
          NaN
                San Francisco
                                    NaN
148651
          NaN
                San Francisco
                                    NaN
          NaN
                San Francisco
                                    NaN
148652
                San Francisco
148653
          NaN
                                    NaN
[148654 rows x 13 columns]
```

In [4]: df.head(2)

Out[4]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBe ₁
0	1	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	5675
1	2	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	5389
4									

In [5]: #1. Display Top 10 Rows of The Dataset df.head(10)

Out[5]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBe
0	1	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	5675
1	2	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	5389
2	3	ALBERT PARD I NI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	3352
3	4	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.00	56120.71	198306.90	NaN	332343.61	3323
4	5	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	134401.60	9737.00	182234.59	NaN	326373.19	3263
5	6	DAVID SULLIVAN	ASSISTANT DEPUTY CHIEF II	118602.00	8601.00	189082.74	NaN	316285.74	3162
6	7	ALSON LEE	BATTALION CHIEF, (FIRE DEPARTMENT)	92492.01	89062.90	134426.14	NaN	315981.05	3159
7	8	DAVID KUSHNER	DEPUTY DIRECTOR OF INVESTMENTS	256576.96	0.00	51322.50	NaN	307899.46	3078
8	9	MICHAEL MORRIS	BATTALION CHIEF, (FIRE DEPARTMENT)	176932.64	86362.68	40132.23	NaN	303427.55	3034
9	10	JOANNE HAYES-WHITE	CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	285262.00	0.00	17115.73	NaN	302377.73	3023
4									>

In [6]: #2. Check Last 10 Rows of The Dataset
df.tail(10)

Out[6]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	Tota
148644	148645	Randy D Winn	Stationary Eng, Sewage Plant	0.0	0.0	0.00	0.0	0.00	
148645	148646	Carolyn A Wilson	Human Services Technician	0.0	0.0	0.00	0.0	0.00	
148646	148647	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	
148647	148648	Joann Anderson	Communications Dispatcher 2	0.0	0.0	0.00	0.0	0.00	
148648	148649	Leon Walker	Custodian	0.0	0.0	0.00	0.0	0.00	
148649	148650	Roy I Tillery	Custodian	0.0	0.0	0.00	0.0	0.00	
148650	148651	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	
148651	148652	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	
148652	148653	Not provided	Not provided	NaN	NaN	NaN	NaN	0.00	
148653	148654	Joe Lopez	Counselor, Log Cabin Ranch	0.0	0.0	- 618.13	0.0	-618.13	
4									•

In [7]: #3. Find Shape of Our Dataset (Number of Rows And Number of Columns)
df.shape

Out[7]: (148654, 13)

In [8]: print("Number of Rows=",df.shape[0])
print("Number of Columns=",df.shape[1])

Number of Rows= 148654 Number of Columns= 13

```
In [9]:
         #4. Getting Information About Our Dataset Like Total Number Rows,
         #Total Number of Columns, Datatypes of Each Column And Memory Requirement
         df.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 148654 entries, 0 to 148653
         Data columns (total 13 columns):
          #
              Column
                                Non-Null Count
                                                  Dtype
          0
                                148654 non-null int64
              Ιd
          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
In [10]: df.index
Out[10]: RangeIndex(start=0, stop=148654, step=1)
In [11]: df.columns
Out[11]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency',
                 'Status'],
               dtype='object')
In [13]: #5. Check Null Values In The Dataset
         df.isnull().sum()
Out[13]: Id
                                   0
                                   0
         EmployeeName
         JobTitle
                                   0
         BasePay
                                 609
         OvertimePay
                                   4
                                   4
         OtherPay
         Benefits
                               36163
         TotalPay
                                   0
         TotalPayBenefits
                                   0
         Year
                                   0
         Notes
                             148654
         Agency
                                   0
         Status
                             148654
         dtype: int64
```

```
In [14]:
         #6. Drop ID, Notes, Agency, and Status Columns
          df.columns
Out[14]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                  'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency',
                 'Status'],
                dtype='object')
         df=df.drop(["Id","Notes","Agency","Status"],axis=1)
In [15]:
In [16]:
         print(df)
                        EmployeeName
                                                                               JobTitle
                                                                                         \
          0
                     NATHANIEL FORD
                                      GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY
          1
                       GARY JIMENEZ
                                                      CAPTAIN III (POLICE DEPARTMENT)
          2
                                                      CAPTAIN III (POLICE DEPARTMENT)
                     ALBERT PARDINI
          3
                  CHRISTOPHER CHONG
                                                 WIRE ROPE CABLE MAINTENANCE MECHANIC
                                        DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)
          4
                    PATRICK GARDNER
          . . .
          148649
                      Roy I Tillery
                                                                              Custodian
          148650
                       Not provided
                                                                          Not provided
                       Not provided
                                                                          Not provided
          148651
          148652
                       Not provided
                                                                          Not provided
          148653
                           Joe Lopez
                                                           Counselor, Log Cabin Ranch
                                                       Benefits
                    BasePay OvertimePay
                                             OtherPay
                                                                   TotalPay
                                     0.00
          0
                  167411.18
                                           400184.25
                                                             NaN
                                                                  567595.43
          1
                  155966.02
                                245131.88
                                           137811.38
                                                             NaN
                                                                  538909.28
          2
                  212739.13
                                106088.18
                                             16452.60
                                                             NaN
                                                                  335279.91
          3
                   77916.00
                                 56120.71
                                            198306.90
                                                             NaN
                                                                  332343.61
          4
                  134401.60
                                  9737.00
                                           182234.59
                                                                  326373.19
                                                             NaN
                         . . .
                                      . . .
                                                  . . .
                                                             . . .
                                                                        . . .
                       0.00
                                     0.00
                                                 0.00
                                                             0.0
                                                                       0.00
          148649
          148650
                         NaN
                                      NaN
                                                  NaN
                                                             NaN
                                                                       0.00
          148651
                        NaN
                                      NaN
                                                  NaN
                                                             NaN
                                                                       0.00
          148652
                                                                       0.00
                        NaN
                                      NaN
                                                  NaN
                                                             NaN
                       0.00
                                                                    -618.13
          148653
                                     0.00
                                              -618.13
                                                             0.0
                  TotalPayBenefits
                                     Year
          0
                          567595.43
                                     2011
          1
                          538909.28
                                     2011
          2
                          335279.91
                                     2011
          3
                          332343.61
                                     2011
          4
                          326373.19
                                     2011
                                . . .
          148649
                               0.00
                                     2014
          148650
                               0.00
                                     2014
          148651
                                     2014
                               0.00
          148652
                               0.00
                                     2014
          148653
                                     2014
                            -618.13
          [148654 rows x 9 columns]
```

In [18]: df.head()

Out[18]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefit
0	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	567595.4
1	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	538909.2
2	ALBERT PARDINI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	335279.9
3	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.00	56120.71	198306.90	NaN	332343.61	332343.6
4	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	134401.60	9737.00	182234.59	NaN	326373.19	326373.1

In [19]: df.columns

In [20]: len(df.columns)

Out[20]: 9

Out[21]:

	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	
count	148045.000000	148650.000000	148650.000000	112491.000000	148654.000000	148654.000000	148654
mean	66325.448840	5066.059886	3648.767297	25007.893151	74768.321972	93692.554811	2012
std	42764.635495	11454.380559	8056.601866	15402.215858	50517.005274	62793.533483	
min	-166.010000	-0.010000	-7058.590000	-33.890000	-618.130000	-618.130000	201′
25%	33588.200000	0.000000	0.000000	11535.395000	36168.995000	44065.650000	2012
50%	65007.450000	0.000000	811.270000	28628.620000	71426.610000	92404.090000	2010
75%	94691.050000	4658.175000	4236.065000	35566.855000	105839.135000	132876.450000	2014
max	319275.010000	245131.880000	400184.250000	96570.660000	567595.430000	567595.430000	2014
4							

Out[22]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPa
count	148654	148654	148045.000000	148650.000000	148650.000000	112491.000000	148654.00000
unique	110811	2159	NaN	NaN	NaN	NaN	Na
top	Kevin Lee	Transit Operator	NaN	NaN	NaN	NaN	Na
freq	13	7036	NaN	NaN	NaN	NaN	Na
mean	NaN	NaN	66325.448840	5066.059886	3648.767297	25007.893151	74768.32197
std	NaN	NaN	42764.635495	11454.380559	8056.601866	15402.215858	50517.00527
min	NaN	NaN	-166.010000	-0.010000	-7058.590000	-33.890000	-618.1300(
25%	NaN	NaN	33588.200000	0.000000	0.000000	11535.395000	36168.99500
50%	NaN	NaN	65007.450000	0.000000	811.270000	28628.620000	71426.61000
75%	NaN	NaN	94691.050000	4658.175000	4236.065000	35566.855000	105839.13500
max	NaN	NaN	319275.010000	245131.880000	400184.250000	96570.660000	567595.43000

```
In [25]: #8. Find Occurrence of The Employee Names (Top 5)
df["EmployeeName"].value_counts()
```

```
Out[25]: EmployeeName
         Kevin Lee
                                      13
         Richard Lee
                                      11
         Steven Lee
                                      11
         William Wong
                                      11
         Stanley Lee
                                       9
         Jeffrey Skover
                                       1
         Ken Dever
                                       1
         Kevin Whitfield
                                       1
         Granville McCollough III
                                       1
         Joe Lopez
         Name: count, Length: 110811, dtype: int64
```

```
In [27]: #8. Find Occurrence of The Employee Names (Top 5)
df["EmployeeName"].value_counts().head()
```

```
Out[27]: EmployeeName

Kevin Lee 13

Richard Lee 11

Steven Lee 11

William Wong 11

Stanley Lee 9

Name: count, dtype: int64
```

```
In [29]: #9. Find The Number of Unique Job Titles
df['JobTitle'].nunique()
```

Out[29]: 2159

In [35]: #10.Total Number of Job Titles Contain Captain
df[df['JobTitle'].str.contains("CAPTAIN")]

Out[35]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBe
1	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	5389
2	ALBERT PARDINI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	3352
11	PATRICIA JACKSON	CAPTAIN III (POLICE DEPARTMENT)	99722.00	87082.62	110804.30	NaN	297608.92	2976
17	SEBASTIAN WONG	CAPTAIN, EMERGENCYCY MEDICAL SERVICES	140546.87	119397.26	18625.08	NaN	278569.21	2785
22	GEORGE GARC I A	CAPTAIN, FIRE SUPPRESSION	140546.88	93200.58	39955.25	NaN	273702.71	2737
8684	JEANNE SEYLER	CAPTAIN, FIRE SUPPRESSION	95055.34	0.00	9197.14	NaN	104252.48	1042
10485	JANE SMITH	CAPTAIN, EMERGENCYCY MEDICAL SERVICES	74592.00	1538.59	18804.68	NaN	94935.27	949
11198	KATHRYN BROWN	CAPTAIN III (POLICE DEPARTMENT)	10684.50	0.00	81244.87	NaN	91929.37	919
31297	MARCO CARNIGLIA	CAPTAIN, EMERGENCYCY MEDICAL SERVICES	9839.72	0.00	1203.77	NaN	11043.49	11(
34124	JOHN FORBES- 3	CAPTAIN, FIRE SUPPRESSION	0.00	982.06	2277.34	NaN	3259.40	32

141 rows × 9 columns

In [36]: #10.Total Number of Job Titles Contain Captain
df[df['JobTitle'].str.contains("CAPTAIN")].count()

Out[36]: EmployeeName 141 JobTitle 141 BasePay 141 OvertimePay 141 OtherPay 141 Benefits 0 TotalPay 141 TotalPayBenefits 141 141 Year

dtype: int64

```
In [40]:
         #10.Total Number of Job Titles Contain Captain
          df[df['JobTitle'].str.contains("CAPTAIN", case=False)].count()
Out[40]: EmployeeName
                                552
          JobTitle
                                552
          BasePay
                               551
          OvertimePay
                               552
          OtherPay
                                552
          Benefits
                               411
          TotalPay
                               552
          TotalPayBenefits
                               552
          Year
                                552
          dtype: int64
In [43]:
          #10.Total Number of Job Titles Contain Captain
          len(df[df['JobTitle'].str.contains("CAPTAIN",case=False)])
Out[43]: 552
         #Display All the Employee Names From Fire Department
In [54]:
          df.loc[df['JobTitle'].str.contains("Fire",case=False)][["EmployeeName",'JobTitle']]
Out[54]:
                        EmployeeName
                                                                               JobTitle
                     PATRICK GARDNER
                                          DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)
               4
               6
                            ALSON LEE
                                                      BATTALION CHIEF, (FIRE DEPARTMENT)
               8
                      MICHAEL MORRIS
                                                      BATTALION CHIEF, (FIRE DEPARTMENT)
                  JOANNE HAYES-WHITE
                                                CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)
               q
                       ARTHUR KENNEY ASSISTANT CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)
              10
           145956
                        Kenneth C Farris
                                                                              Firefighter
           147556
                         Edward A Dunn
                                                                              Firefighter
           148021
                          Kari A Johnson
                                                                              Firefighter
           148209
                           Sheryl K Lee
                                                                              Firefighter
           148554
                         Lawrence F Gatt
                                                                      Fire Alarm Dispatcher
          5879 rows × 2 columns
In [55]:
         #Display Number Employee Names From Fire Department
          len(df.loc[df['JobTitle'].str.contains("Fire",case=False)][["EmployeeName",'JobTitle']]
Out[55]: 5879
In [58]:
         #12. Find Minimum, Maximum, and Average BasePay
          df['BasePay'].max()
Out[58]: 319275.01
```

```
Examples on Data Analysis With Python Pandas -- Employee Salary DataSet - Jupyter Notebook
In [59]:
          #12. Find Minimum, Maximum, and Average BasePay
           df['BasePay'].min()
Out[59]: -166.01
In [60]:
           df['BasePay'].mean()
Out[60]: 66325.4488404877
In [61]:
           #OR
           df.describe()
Out[61]:
                                                     OtherPay
                                                                     Benefits
                                                                                   TotalPay TotalPayBenefits
                        BasePay
                                   OvertimePay
            count 148045.000000
                                                148650.000000
                                                               112491.000000
                                                                              148654.000000
                                                                                                             148654
                                  148650.000000
                                                                                               148654.000000
                    66325.448840
                                    5066.059886
                                                   3648 767297
                                                                25007.893151
                                                                               74768.321972
                                                                                                93692.554811
                                                                                                                2012
            mean
                    42764 635495
                                   11454.380559
                                                  8056.601866
                                                                15402.215858
                                                                               50517.005274
                                                                                                62793.533483
              std
              min
                     -166.010000
                                      -0.010000
                                                  -7058.590000
                                                                   -33.890000
                                                                                -618.130000
                                                                                                 -618.130000
                                                                                                                2011
                    33588.200000
                                                     0.000000
                                                                11535.395000
                                                                                                44065.650000
             25%
                                       0.000000
                                                                               36168.995000
                                                                                                                2012
             50%
                    65007.450000
                                       0.000000
                                                    811.270000
                                                                28628.620000
                                                                               71426.610000
                                                                                                92404.090000
                                                                                                                2013
             75%
                    94691.050000
                                    4658.175000
                                                   4236.065000
                                                                35566.855000
                                                                              105839.135000
                                                                                               132876.450000
                                                                                                                2014
             max 319275.010000 245131.880000 400184.250000
                                                                96570.660000
                                                                              567595.430000
                                                                                               567595.430000
                                                                                                                2014
In [63]:
          #13. Replace 'Not Provided' in EmployeeName' Column to NaN
           df.loc[df['EmployeeName']=='Not Provided']
Out[63]:
                   EmployeeName
                                             JobTitle
                                                     BasePay OvertimePay
                                                                            OtherPay
                                                                                       Benefits
                                                                                                 TotalPay TotalPayB
                                      PUBLIC SAFETY
            13797
                      Not Provided
                                  COMMUNICATIONS
                                                     57963.39
                                                                   19683.91
                                                                              4373.86
                                                                                           NaN
                                                                                                 82021.16
                                                                                                                  82
                                        DISPATCHER
                                    Public SafetyComm
            44151
                      Not Provided
                                                      82196.52
                                                                   25934.20
                                                                                       38024.3 111883.21
                                                                                                                 149
                                                                              3752.49
                                                Disp
In [66]:
           import numpy as np
```

df['EmployeeName']=df['EmployeeName'].str.replace('Not Provided', "np.NaN")

df.loc[df['EmployeeName']=="np.NaN"] In [68]:

Out[68]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayB
13797	np.NaN	PUBLIC SAFETY COMMUNICATIONS DISPATCHER	57963.39	19683.91	4373.86	NaN	82021.16	82
44151	np.NaN	Public SafetyComm Disp	82196.52	25934.20	3752.49	38024.3	111883.21	149
4								>

```
In [69]:
          df['EmployeeName']=df['EmployeeName'].str.replace("np.NaN","MS DHONI")
In [70]:
          df.loc[df['EmployeeName']=="MS DHONI"]
Out[70]:
                  EmployeeName
                                           JobTitle
                                                   BasePay OvertimePay OtherPay
                                                                                    Benefits
                                                                                              TotalPay TotalPayB
                                    PUBLIC SAFETY
                       MS DHONI COMMUNICATIONS
           13797
                                                    57963.39
                                                                 19683.91
                                                                            4373.86
                                                                                       NaN
                                                                                              82021.16
                                                                                                              82
                                       DISPATCHER
                                  Public SafetyComm
           44151
                      MS DHONI
                                                    82196.52
                                                                                                             149
                                                                 25934.20
                                                                            3752.49
                                                                                    38024.3
                                                                                            111883.21
                                               Disp
In [77]:
          #14. Drop The Rows Having 4 Missing Values
          df[df.isnull().sum(axis=1)==4]
Out[77]:
                                  JobTitle
                                           BasePay OvertimePay OtherPay Benefits TotalPay
                                                                                             TotalPayBenefits
                                                                                                              Υє
                   EmployeeName
                                       Not
           148646
                                                            NaN
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                                                                                                         0.0 20
                                  provided
```

In [80]: df.drop(df[df.isnull().sum(axis=1)==4].index,axis=0)

Out[80]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayE
0	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.00	400184.25	NaN	567595.43	567
1	GARY JIMENEZ	CAPTAIN III (POLICE DEPARTMENT)	155966.02	245131.88	137811.38	NaN	538909.28	538
2	ALBERT PARD I NI	CAPTAIN III (POLICE DEPARTMENT)	212739.13	106088.18	16452.60	NaN	335279.91	33!
3	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.00	56120.71	198306.90	NaN	332343.61	332
4	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	134401.60	9737.00	182234.59	NaN	326373.19	326
148645	Carolyn A Wilson	Human Services Technician	0.00	0.00	0.00	0.0	0.00	
148647	Joann Anderson	Communications Dispatcher 2	0.00	0.00	0.00	0.0	0.00	
148648	Leon Wa l ker	Custodian	0.00	0.00	0.00	0.0	0.00	
148649	Roy I Tillery	Custodian	0.00	0.00	0.00	0.0	0.00	
148653	Joe Lopez	Counselor, Log Cabin Ranch	0.00	0.00	-618.13	0.0	-618.13	

148650 rows × 9 columns

In [81]: df.drop(df[df.isnull().sum(axis=1)==4].index,axis=0,inplace=True)

```
In [82]: print(df)
```

In []:

1 GARY JIMENEZ CAPTAIN III (POLICE DEPARTMENT) 2 ALBERT PARDINI 3 CHRISTOPHER CHONG WIRE ROPE CABLE MAINTENANCE MECHANIC 4 PATRICK GARDNER DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT) 148645 Carolyn A Wilson Human Services Technician 148647 Joann Anderson Communications Dispatcher 2 148648 Leon Walker Custodian 148649 Roy I Tillery Custodian 148649 Roy I Tillery Custodian 148653 Joe Lopez Counselor, Log Cabin Ranch BasePay OvertimePay OtherPay Benefits TotalPay Custodian 155966.02 245131.88 137811.38 NaN 538909.28 2 212739.13 106088.18 16452.60 NaN 335279.91 3 77916.00 56120.71 198306.90 NaN 332343.61 4 134401.60 9737.00 182234.59 NaN 326373.19 148645 0.00 0.00 0.00 0.00 0.0 0.00 148647 0.00 0.00 0.00 0.0 0.00 148648 0.00 0.00 0.00 0.0 0.00 148649 0.00 0.00 0.00 0.0 0.00 148649 0.00 0.00 0.00 0.0 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148645 0.00 0.00 0.00 0.00 0.00 148647 0.00 0.00 0.00 0.00 0.00 148648 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148640 0.00 0.00 0.00 0.00 0.00 148645 0.00 0.00 0.00 0.00 0.00 148646 0.00 0.00 0.00 0.00 0.00 148647 0.00 0.01 148648 0.00 0.00 0.00 0.00 0.00 148648 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 0.00 148649 0.00 0.00 0.00 0.00 0.00 0.00 0.00 0.		Emplo	yeeName					JobTitle	\
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