Data Analysis case study

June 9, 2024

```
[46]: import pandas as pd
      import numpy as np
     data = pd.read_csv('Salaries.csv')
 [3]:
 [6]:
     data.head(2)
 [6]:
         Ιd
               EmployeeName
                                                                       JobTitle
      0
             NATHANIEL FORD
                               GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY
      1
               GARY JIMENEZ
                                               CAPTAIN III (POLICE DEPARTMENT)
           BasePay
                     OvertimePay
                                    OtherPay
                                                          TotalPay
                                                                     TotalPayBenefits
                                               Benefits
         167411.18
                            0.00
      0
                                   400184.25
                                                         567595.43
                                                                             567595.43
                                                    NaN
         155966.02
                       245131.88
                                   137811.38
                                                    NaN
                                                         538909.28
                                                                             538909.28
         Year
               Notes
                               Agency
                                       Status
         2011
                  NaN
                       San Francisco
                                          NaN
         2011
                  NaN
                       San Francisco
                                          NaN
 [7]:
     data.tail(10)
                           EmployeeName
 [7]:
                   Ιd
                                                                JobTitle
                                                                          BasePay
              148645
                                          Stationary Eng, Sewage Plant
                                                                               0.0
      148644
                           Randy D Winn
      148645
              148646
                       Carolyn A Wilson
                                              Human Services Technician
                                                                               0.0
      148646
              148647
                           Not provided
                                                           Not provided
                                                                               NaN
      148647
              148648
                         Joann Anderson
                                                                               0.0
                                           Communications Dispatcher 2
                            Leon Walker
      148648
              148649
                                                               Custodian
                                                                               0.0
      148649
              148650
                          Roy I Tillery
                                                               Custodian
                                                                               0.0
      148650
              148651
                           Not provided
                                                           Not provided
                                                                               NaN
                           Not provided
      148651
              148652
                                                           Not provided
                                                                               NaN
      148652
              148653
                           Not provided
                                                           Not provided
                                                                               NaN
      148653
              148654
                               Joe Lopez
                                             Counselor, Log Cabin Ranch
                                                                               0.0
              OvertimePay
                            OtherPay
                                       Benefits
                                                  TotalPay
                                                            TotalPayBenefits
                                                                                Year
                       0.0
                                                      0.00
      148644
                                 0.00
                                             0.0
                                                                         0.00
                                                                                2014
                       0.0
                                 0.00
                                             0.0
                                                      0.00
                                                                         0.00
                                                                                2014
      148645
      148646
                       NaN
                                 NaN
                                             NaN
                                                      0.00
                                                                         0.00
                                                                                2014
      148647
                       0.0
                                 0.00
                                             0.0
                                                      0.00
                                                                         0.00
                                                                               2014
```

```
0.00
148648
                 0.0
                           0.00
                                        0.0
                                                                      0.00 2014
148649
                 0.0
                           0.00
                                        0.0
                                                  0.00
                                                                      0.00 2014
                 NaN
                                        NaN
                                                  0.00
                                                                      0.00 2014
148650
                            {\tt NaN}
                                                                      0.00
148651
                 {\tt NaN}
                            {\tt NaN}
                                        NaN
                                                  0.00
                                                                            2014
148652
                 NaN
                            NaN
                                        NaN
                                                  0.00
                                                                      0.00 2014
148653
                 0.0
                        -618.13
                                        0.0
                                              -618.13
                                                                  -618.13 2014
```

	Notes		Agency	Status
148644	NaN	San	Francisco	NaN
148645	NaN	San	Francisco	NaN
148646	NaN	San	Francisco	NaN
148647	NaN	San	Francisco	NaN
148648	NaN	San	Francisco	NaN
148649	NaN	San	Francisco	NaN
148650	NaN	San	Francisco	NaN
148651	NaN	San	Francisco	NaN
148652	NaN	San	Francisco	NaN
148653	NaN	San	Francisco	NaN

[8]: data.shape

[8]: (148654, 13)

[9]: 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	${\tt TotalPayBenefits}$	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

[12]: data.dtypes

```
[12]: Id
                            int64
      EmployeeName
                           object
      JobTitle
                           object
      BasePay
                          float64
      OvertimePay
                          float64
      OtherPay
                          float64
      Benefits
                          float64
                          float64
      TotalPay
      TotalPayBenefits
                          float64
                            int64
      Year
      Notes
                          float64
      Agency
                           object
                          float64
      Status
      dtype: object
[13]: data.isnull().sum()
[13]: Id
                               0
      EmployeeName
                               0
      JobTitle
                               0
      BasePay
                             609
      OvertimePay
      OtherPay
      Benefits
                           36163
      TotalPay
                               0
      TotalPayBenefits
                               0
     Year
                               0
      Notes
                          148654
      Agency
                               0
      Status
                          148654
      dtype: int64
[14]: data.columns
[14]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency',
             'Status'],
            dtype='object')
[15]: data = data.drop(['Id','Notes','Status','Agency'],axis=1)
[17]: data.head(1)
[17]:
           EmployeeName
                                                                JobTitle
                                                                             BasePay \
      O NATHANIEL FORD GENERAL MANAGER-METROPOLITAN TRANSIT AUTHORITY 167411.18
         OvertimePay
                       OtherPay Benefits
                                             TotalPay TotalPayBenefits Year
      0
                 0.0
                      400184.25
                                      NaN 567595.43
                                                              567595.43 2011
```

```
[18]: data.describe()
「18]:
                               OvertimePay
                                                                 Benefits
                   BasePay
                                                  OtherPay
      count
             148045.000000
                            148650.000000
                                            148650.000000
                                                            112491.000000
              66325.448840
                               5066.059886
                                              3648.767297
                                                             25007.893151
      mean
      std
              42764.635495
                              11454.380559
                                              8056.601866
                                                             15402.215858
      min
               -166.010000
                                 -0.010000
                                              -7058.590000
                                                               -33.890000
      25%
                                                  0.000000
                                                             11535.395000
              33588.200000
                                  0.000000
      50%
              65007.450000
                                  0.000000
                                               811.270000
                                                             28628.620000
      75%
              94691.050000
                                              4236.065000
                                                             35566.855000
                               4658.175000
      max
             319275.010000
                             245131.880000
                                            400184.250000
                                                             96570.660000
                  TotalPay
                             TotalPayBenefits
                                                         Year
             148654.000000
                                148654.000000
                                               148654.000000
      count
              74768.321972
                                 93692.554811
                                                  2012.522643
      mean
      std
              50517.005274
                                 62793.533483
                                                     1.117538
      min
               -618.130000
                                  -618.130000
                                                  2011.000000
      25%
              36168.995000
                                                  2012.000000
                                 44065.650000
      50%
              71426.610000
                                 92404.090000
                                                  2013.000000
      75%
             105839.135000
                                132876.450000
                                                  2014.000000
      max
             567595.430000
                                567595.430000
                                                  2014.000000
[19]: data.columns
[19]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[22]: ## Find the occurance of employee name?
      data['EmployeeName'].value counts().head(5)
[22]: Kevin Lee
                      13
      Richard Lee
                      11
      Steven Lee
                      11
      William Wong
                       11
                        9
      Stanley Lee
      Name: EmployeeName, dtype: int64
[24]: ## find the numbers of unique job title.
      data['JobTitle'].nunique()
[24]: 2159
[28]: ## find the total number of job titles contain captain.
      len(data[data['JobTitle'].str.contains('CAPTAIN',case=False)])
[28]: 552
```

```
[35]: data[data['JobTitle'].str.contains('CAPTAIN',case=False)].count()
[35]: EmployeeName
                          552
      JobTitle
                          552
      BasePay
                          551
      OvertimePay
                          552
      OtherPay
                          552
      Benefits
                          411
      TotalPay
                          552
      TotalPayBenefits
                          552
      Year
                          552
      dtype: int64
[37]: ## display all the employees from fire department.
      data.columns
[37]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[44]: data[data['JobTitle'].str.contains('FIRE_
       ⇒DEPARTMENT', case=False)]['EmployeeName']
[44]: 4
                     PATRICK GARDNER
                           ALSON LEE
      8
                      MICHAEL MORRIS
      9
                  JOANNE HAYES-WHITE
      10
                       ARTHUR KENNEY
      32623
                        JAMES BARDEN
                  Joanne Hayes-White
      36162
      72926
                Joanne M Hayes-White
      102303
                      Robert E Evans
      110535
                Joanne M Hayes-White
      Name: EmployeeName, Length: 226, dtype: object
[45]: ## Find the MAX ,MIN AVG, BASEPAY.
      data['BasePay'].describe()
[45]: count
               148045.000000
      mean
                66325.448840
      std
                42764.635495
     min
                 -166.010000
      25%
                33588.200000
      50%
                65007.450000
      75%
                94691.050000
               319275.010000
     max
      Name: BasePay, dtype: float64
```

```
[48]: ## repalce "not provided" in employee name column to nan.
      data['EmployeeName'].replace('Not provided',np.nan)
[48]: 0
                   NATHANIEL FORD
                     GARY JIMENEZ
      1
      2
                   ALBERT PARDINI
                CHRISTOPHER CHONG
      3
                  PATRICK GARDNER
      4
      148649
                    Roy I Tillery
      148650
                              NaN
      148651
                              NaN
      148652
                              NaN
      148653
                        Joe Lopez
      Name: EmployeeName, Length: 148654, dtype: object
[57]: ## drop the rows having 5 missing values.
      data.drop(data[data.isnull().sum(axis=1)==5].index,axis=0,inplace=True)
[58]: data.isnull().sum(axis=1)
[58]: 0
                1
                1
      1
      2
                1
      3
                1
                1
      148649
                0
      148650
      148651
                4
                4
      148652
      148653
                0
      Length: 148654, dtype: int64
[59]: ## how much albert pardeni make(include benifite).
      data.columns
[59]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[61]: data[data['EmployeeName'] == 'ALBERT PARDINI']['TotalPayBenefits']
[61]: 2
           335279.91
      Name: TotalPayBenefits, dtype: float64
[62]: ## diplay the name person having highest basepay.
      data.columns
```

```
[62]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[72]: data[data['BasePay'].max()==data['BasePay']]['EmployeeName']
[72]: 72925
               Gregory P Suhr
      Name: EmployeeName, dtype: object
[73]: ## find the average basepay all employees per year.
      data.columns
[73]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[83]: data.groupby('Year').mean()['BasePay']
     C:\Users\Vikas\AppData\Local\Temp\ipykernel 7100\3282093210.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']
[83]: Year
     2011
              63595.956517
      2012
              65436.406857
     2013
              69630.030216
      2014
              66564.421924
     Name: BasePay, dtype: float64
[85]: ## find the average basepay of all employees per job title.
      data.columns
[85]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
             'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
            dtype='object')
[90]: data.groupby('JobTitle').mean()['BasePay']
     C:\Users\Vikas\AppData\Local\Temp\ipykernel 7100\3409582655.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']
[90]: 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: 2159, dtype: float64
[98]: ## find the average basepay employee having jobtitle acountant.
       data[data['JobTitle'] == 'ACCOUNTANT']['BasePay'].mean()
[98]: 46643.172
[99]: ## find the top 5 most common jobs.
       data.columns
[99]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
              'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
             dtype='object')
[103]: data['JobTitle'].value_counts().head()
[103]: Transit Operator
                                       7036
       Special Nurse
                                       4389
       Registered Nurse
                                       3736
      Public Svc Aide-Public Works
                                       2518
       Police Officer 3
                                       2421
       Name: JobTitle, dtype: int64
  []:
```