```
In [1]: import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
import warnings
warnings.filterwarnings('ignore')
f2 = {"family":"cambria","color":"g","size":50}
f3 = {"family":"cambria","color":"k","size":40}
f1 = {"family":"cambria","color":"b","size":30}
In [2]: SF = pd.read_csv(r"C:\Users\Sinha Rahul\Downloads\Salaries.csv.zip")
```

In [3]:

SF

Out[3]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits
0	1	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.0	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	16452.6	NaN
3	4	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.0	56120.71	198306.9	NaN
4	5	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	134401.6	9737.0	182234.59	NaN
148649	148650	Roy I Tillery	Custodian	0.00	0.00	0.00	0.00
148650	148651	Not provided	Not provided	Not Provided	Not Provided	Not Provided	Not Provided
148651	148652	Not provided	Not provided	Not Provided	Not Provided	Not Provided	Not Provided
148652	148653	Not provided	Not provided	Not Provided	Not Provided	Not Provided	Not Provided
148653	148654	Joe Lopez	Counselor, Log Cabin Ranch	0.00	0.00	-618.13	0.00
148654	rows × 1	3 columns					
4							>

Display Top 10 row in dataset

In [4]: SF.head(10)

Out[4]:

	ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay
0	1	NATHANIEL FORD	GENERAL MANAGER- METROPOLITAN TRANSIT AUTHORITY	167411.18	0.0	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	16452.6	NaN	335279.91
3	4	CHRISTOPHER CHONG	WIRE ROPE CABLE MAINTENANCE MECHANIC	77916.0	56120.71	198306.9	NaN	332343.61
4	5	PATRICK GARDNER	DEPUTY CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	134401.6	9737.0	182234.59	NaN	326373.19
5	6	DAVID SULLIVAN	ASSISTANT DEPUTY CHIEF II	118602.0	8601.0	189082.74	NaN	316285.74
6	7	ALSON LEE	BATTALION CHIEF, (FIRE DEPARTMENT)	92492.01	89062.9	134426.14	NaN	315981.05
7	8	DAVID KUSHNER	DEPUTY DIRECTOR OF INVESTMENTS	256576.96	0.0	51322.5	NaN	307899.46
8	9	MICHAEL MORRIS	BATTALION CHIEF, (FIRE DEPARTMENT)	176932.64	86362.68	40132.23	NaN	303427.55
9	10	JOANNE HAYES-WHITE	CHIEF OF DEPARTMENT, (FIRE DEPARTMENT)	285262.0	0.0	17115.73	NaN	302377.73
4								•

Display last 10 row in dataset

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

Out[5]:

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

Find the shape of our dataset(number of column & number of row)

```
In [6]: SF.shape
Out[6]: (148654, 13)
In [7]: print("number of rows", SF.shape[0])
    print("number of columns", SF.shape[1])
    number of rows 148654
    number of columns 13
```

Getting information about our dataset likes total number of rows, total number of columns,data type of each column and memory requirement

```
SF.info()
In [8]:
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 148654 entries, 0 to 148653
        Data columns (total 13 columns):
             Column
                                Non-Null Count
                                                 Dtype
             -----
        _ _ _
                                                  ____
         0
             Ιd
                                148654 non-null
                                                 int64
         1
             EmployeeName
                                148654 non-null object
         2
             JobTitle
                                                 object
                                148654 non-null
         3
             BasePay
                                148049 non-null
                                                 object
         4
                                148654 non-null
                                                 object
             OvertimePay
         5
                                                 object
             OtherPay |
                                148654 non-null
         6
             Benefits
                                112495 non-null
                                                 object
         7
             TotalPay
                                148654 non-null
                                                 float64
         8
             TotalPayBenefits 148654 non-null
                                                 float64
         9
             Year
                                148654 non-null
                                                 int64
                                0 non-null
         10 Notes
                                                  float64
         11 Agency
                                148654 non-null object
                                38119 non-null
         12 Status
                                                 object
        dtypes: float64(3), int64(2), object(8)
        memory usage: 14.7+ MB
        series_list=['BasePay','OvertimePay','OtherPay','Benefits']
In [9]:
        for i in series_list:
            SF[i]=pd.to_numeric(SF[i],errors='coerce')
            print(SF[i])
        0
                   167411.18
        1
                   155966.02
        2
                   212739.13
        3
                    77916.00
                   134401.60
        148649
                        0.00
        148650
                         NaN
        148651
                         NaN
                         NaN
        148652
                        0.00
        148653
        Name: BasePay, Length: 148654, dtype: float64
                        0.00
        1
                   245131.88
        2
                   106088.18
        3
                    56120.71
        4
                     9737.00
        148649
                        0.00
```

getting overall statistics about the dataframe

In [10]: SF.describe()

Out[10]:

	ld	BasePay	OvertimePay	OtherPay	Benefits	TotalPa
count	148654.000000	148045.000000	148650.000000	148650.000000	112491.000000	148654.00000
mean	74327.500000	66325.448841	5066.059886	3648.767297	25007.893151	74768.32197
std	42912.857795	42764.635495	11454.380559	8056.601866	15402.215858	50517.00527
min	1.000000	-166.010000	-0.010000	-7058.590000	-33.890000	-618.13000
25%	37164.250000	33588.200000	0.000000	0.000000	11535.395000	36168.99500
50%	74327.500000	65007.450000	0.000000	811.270000	28628.620000	71426.61000
75%	111490.750000	94691.050000	4658.175000	4236.065000	35566.855000	105839.13500
max	148654.000000	319275.010000	245131.880000	400184.250000	96570.660000	567595.43000

In [11]: SF.describe(include="all") # include categorigal valuebb

Out[11]:

unique NaN 110811 2159 NaN NaN NaN top NaN Kevin Lee Transit Operator NaN NaN NaN freq NaN 13 7036 NaN NaN NaN mean 74327.500000 NaN NaN 66325.448841 5066.059886 3648.76729 std 42912.857795 NaN NaN 42764.635495 11454.380559 8056.60186 min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 811.27000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000		ld	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPa
top NaN Kevin Lee Transit Operator NaN NaN Na freq NaN 13 7036 NaN NaN Na mean 74327.500000 NaN NaN 66325.448841 5066.059886 3648.76729 std 42912.857795 NaN NaN 42764.635495 11454.380559 8056.60186 min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 811.27000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	count	148654.000000	148654	148654	148045.000000	148650.000000	148650.00000
top NaN Revin Lee Operator NaN NaN Na freq NaN 13 7036 NaN NaN Na mean 74327.500000 NaN NaN 66325.448841 5066.059886 3648.76729 std 42912.857795 NaN NaN 42764.635495 11454.380559 8056.60186 min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 811.27000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	unique	NaN	110811	2159	NaN	NaN	Na
mean 74327.500000 NaN NaN 66325.448841 5066.059886 3648.76729 std 42912.857795 NaN NaN 42764.635495 11454.380559 8056.60186 min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 811.27000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	top	NaN	Kevin Lee		NaN	NaN	Na
std 42912.857795 NaN NaN 42764.635495 11454.380559 8056.60186 min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 0.000000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	freq	NaN	13	7036	NaN	NaN	Na
min 1.000000 NaN NaN -166.010000 -0.010000 -7058.59000 25% 37164.250000 NaN NaN 33588.200000 0.000000 0.000000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	mean	74327.500000	NaN	NaN	66325.448841	5066.059886	3648.76729
25% 37164.250000 NaN NaN 33588.200000 0.000000 0.000000 50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	std	42912.857795	NaN	NaN	42764.635495	11454.380559	8056.60186
50% 74327.500000 NaN NaN 65007.450000 0.000000 811.27000	min	1.000000	NaN	NaN	-166.010000	-0.010000	-7058.59000
	25%	37164.250000	NaN	NaN	33588.200000	0.000000	0.00000
75 % 111490.750000 NaN NaN 94691.050000 4658.175000 4236.06500	50%	74327.500000	NaN	NaN	65007.450000	0.000000	811.27000
	75%	111490.750000	NaN	NaN	94691.050000	4658.175000	4236.06500

In [12]: SF.describe(exclude=[object]) # exclude categorigal values

Out[12]:

	ld	BasePay	OvertimePay	OtherPay	Benefits	TotalPa
count	148654.000000	148045.000000	148650.000000	148650.000000	112491.000000	148654.00000
mean	74327.500000	66325.448841	5066.059886	3648.767297	25007.893151	74768.32197
std	42912.857795	42764.635495	11454.380559	8056.601866	15402.215858	50517.00527
min	1.000000	-166.010000	-0.010000	-7058.590000	-33.890000	-618.13000
25%	37164.250000	33588.200000	0.000000	0.000000	11535.395000	36168.99500
50%	74327.500000	65007.450000	0.000000	811.270000	28628.620000	71426.61000
75%	111490.750000	94691.050000	4658.175000	4236.065000	35566.855000	105839.13500
max	148654.000000	319275.010000	245131.880000	400184.250000	96570.660000	567595.43000
4						>

In [13]: | SF.describe(include=[np.number])

Out[13]:

	ld	BasePay	OvertimePay	OtherPay	Benefits	TotalPa
count	148654.000000	148045.000000	148650.000000	148650.000000	112491.000000	148654.00000
mean	74327.500000	66325.448841	5066.059886	3648.767297	25007.893151	74768.32197
std	42912.857795	42764.635495	11454.380559	8056.601866	15402.215858	50517.00527
min	1.000000	-166.010000	-0.010000	-7058.590000	-33.890000	-618.13000
25%	37164.250000	33588.200000	0.000000	0.000000	11535.395000	36168.99500
50%	74327.500000	65007.450000	0.000000	811.270000	28628.620000	71426.61000
75%	111490.750000	94691.050000	4658.175000	4236.065000	35566.855000	105839.13500
max	148654.000000	319275.010000	245131.880000	400184.250000	96570.660000	567595.43000
4						>

In [14]: | SF.describe(exclude=[np.number])

Out[14]:

	EmployeeName	JobTitle	Agency	Status
count	148654	148654	148654	38119
unique	110811	2159	1	2
top	Kevin Lee	Transit Operator	San Francisco	FT
freq	13	7036	148654	22334

Drop ID, Notes, Agency, status Columns

```
SF.columns
In [15]:
Out[15]: Index(['Id', 'EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPa
                 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year', 'Notes', 'Agency',
                'Status'],
               dtype='object')
         SF = SF.drop(['Id','Notes','Agency','Status'],axis=1)
In [16]:
         SF.head()
```

Out[16]:

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

```
In [17]: SF.columns
```

```
Out[17]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
               dtype='object')
```

In [18]: SF.describe()

Out[18]:

	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBen
count	148045.000000	148650.000000	148650.000000	112491.000000	148654.000000	148654.000
mean	66325.448841	5066.059886	3648.767297	25007.893151	74768.321972	93692.554
std	42764.635495	11454.380559	8056.601866	15402.215858	50517.005274	62793.533
min	-166.010000	-0.010000	-7058.590000	-33.890000	-618.130000	-618.13(
25%	33588.200000	0.000000	0.000000	11535.395000	36168.995000	44065.650
50%	65007.450000	0.000000	811.270000	28628.620000	71426.610000	92404.090
75%	94691.050000	4658.175000	4236.065000	35566.855000	105839.135000	132876.450
max	319275.010000	245131.880000	400184.250000	96570.660000	567595.430000	567595.430

In [19]: SF.corr()

Out[19]:

	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPayBenefits	Y
BasePay	1.000000	0.266740	0.285655	0.918028	0.954494	0.946595	0.033
OvertimePay	0.266740	1.000000	0.316592	0.301207	0.504859	0.467981	0.027
OtherPay	0.285655	0.316592	1.000000	0.233178	0.470496	0.422341	-0.002
Benefits	0.918028	0.301207	0.233178	1.000000	0.884097	0.930140	-0.043
TotalPay	0.954494	0.504859	0.470496	0.884097	1.000000	0.977313	0.032
TotalPayBenefits	0.946595	0.467981	0.422341	0.930140	0.977313	1.000000	0.151
Year	0.033751	0.027887	-0.002499	-0.043136	0.032090	0.151947	1.000
4							•

```
In [20]: plt.figure(figsize=(15,8))
sns.heatmap(SF.corr(),cmap = "icefire", annot = True)
```

Out[20]: <AxesSubplot:>



check the null value in our dataset

In [21]:	<pre>SF.isnull().sum()</pre>		
Out[21]:	EmployeeName	0	
	JobTitle	0	
	BasePay	609	
	OvertimePay	4	
	OtherPay	4	
	Benefits	36163	
	TotalPay	0	
	TotalPayBenefits	0	
	Year	0	
	dtype: int64		

```
In [22]: SF.isnull().sum().sort_values(ascending=False)
Out[22]: Benefits
                              36163
                                609
         BasePay
         OvertimePay
                                  4
                                  4
         OtherPay
         EmployeeName
                                  0
         JobTitle
                                  0
         TotalPay
                                  0
         TotalPayBenefits
                                  0
                                  0
         dtype: int64
In [23]: SF.shape[0]
Out[23]: 148654
In [24]:
         SF.shape[1]
Out[24]: 9
In [25]: SF.isnull().sum().sum()
Out[25]: 36780
         SF = SF.dropna()
In [26]:
         SF.isnull().sum().sum()
In [27]:
Out[27]: 0
In [28]: SF.isnull().sum()
Out[28]: EmployeeName
                              0
         JobTitle
                              0
         BasePay
                              0
         OvertimePay
                              0
         OtherPay
                              0
         Benefits
                              0
         TotalPay
                              0
         TotalPayBenefits
                              0
         dtype: int64
```

```
SF.isnull().any()
In [29]:
Out[29]: EmployeeName
                              False
         JobTitle
                              False
         BasePay
                              False
         OvertimePay
                              False
         OtherPay |
                              False
         Benefits
                              False
         TotalPay
                              False
         TotalPayBenefits
                              False
                              False
         dtype: bool
         SF.isnull().all()
In [30]:
Out[30]: EmployeeName
                              False
         JobTitle
                              False
         BasePay
                              False
         OvertimePay
                              False
         OtherPay |
                              False
         Benefits
                              False
         TotalPay
                              False
         TotalPayBenefits
                              False
         Year
                              False
         dtype: bool
```

Find Occurrence of the employee Names (Top 5)

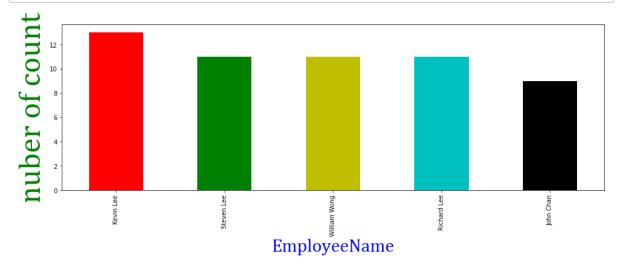
```
In [31]: |SF.columns
Out[31]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                 'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
               dtype='object')
In [32]: SF['EmployeeName'].value_counts().head(5)
Out[32]: Kevin Lee
                          13
         Steven Lee
                         11
         William Wong
                          11
         Richard Lee
                          11
         John Chan
                           9
         Name: EmployeeName, dtype: int64
```

Out[33]:

	EmployeeName	count
0	Kevin Lee	13
1	Steven Lee	11
2	William Wong	11
3	Richard Lee	11
4	John Chan	9

data visualization

```
In [34]: cm = ["r","g","y","c","k"]
SF['EmployeeName'].value_counts().head(5).plot(kind = "bar",figsize=(16,5), co
plt.xlabel("EmployeeName", fontdict=f1)
plt.ylabel("nuber of count",fontdict=f2)
plt.show()
```



```
In [35]: SF.sort_values(by = "Benefits", ascending=False).head(5)
```

Out[35]:

	EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	Tot
110533	William J Coaker Jr.	Chief Investment Officer	257340.00	0.00	82313.70	96570.66	339653.70	
110534	Gregory P Suhr	Chief of Police	307450.04	0.00	19266.72	91302.46	326716.76	
110535	Joanne M Hayes-White	Chief, Fire Department	302068.00	0.00	24165.44	91201.66	326233.44	
110537	John L Martin	Dept Head V	311298.55	0.00	0.00	89772.32	311298.55	
110532	Amy P Hart	Asst Med Examiner	318835.49	10712.95	60563.54	89540.23	390111.98	
4								•

110537 John L Martin 110532 Amy P Hart Name: EmployeeName, dtype: object

Find the number of unique job title

```
SF["JobTitle"]
In [40]:
Out[40]: 36159
                    Lieutenant, Fire Suppression
         36160
                                 Chief of Police
         36161
                     Electronic Maintenance Tech
         36162
                          Chief, Fire Department
                       EMT/Paramedic/Firefighter
         36163
         148645
                       Human Services Technician
         148647
                     Communications Dispatcher 2
         148648
                                       Custodian
         148649
                                       Custodian
                      Counselor, Log Cabin Ranch
         148653
         Name: JobTitle, Length: 111886, dtype: object
In [41]: type(SF["JobTitle"])
Out[41]: pandas.core.series.Series
In [42]: |list1 =[]
         for value in SF['JobTitle']:
             list1.append(value.split(','))
In [43]: |list1
          ['EMT/Paramedic/Firefighter'],
          ['Captain', 'Emergency Med Svcs'],
          ['Firefighter'],
          ['Anesthetist'],
          ['Nursing Supervisor'],
          ['Dep Dir V'],
          ['Manager VIII'],
          ['Supervising Physician Spec'],
          ['Battlion Chief', 'Fire Suppressi'],
          ['Wire Rope Cable Maint Sprv'],
          ['Transit Supervisor'],
          ['Battlion Chief', 'Fire Suppressi'],
          ['Firefighter'],
          ['Firefighter'],
          ['Captain 3'],
          ['Dep Dir V'],
          ['Firefighter'],
          ['Nurse Manager'],
          ['Firefighter'],
          ['Firefighter']
In [44]: len(list1)
Out[44]: 111886
```

localhost:8888/notebooks/part 2 EDA %3D%3D%3D%3D%3D Explore San Francisco city employee salary data.ipynb

```
In [45]:
         one_d = []
         for item in list1:
              for item1 in item:
                  one_d.append(item1)
In [46]: one_d
Out[46]: ['Lieutenant',
           ' Fire Suppression',
           'Chief of Police',
           'Electronic Maintenance Tech',
           'Chief',
           ' Fire Department',
           'EMT/Paramedic/Firefighter',
           'Dept Head V',
           'Gen Mgr',
           ' Public Trnsp Dept',
           'Dept Head V',
           'Captain 3',
           'Asst Chf of Dept (Fire Dept)',
           'Battlion Chief',
           ' Fire Suppressi',
           'Battlion Chief',
           ' Fire Suppressi',
           'Battlion Chief',
           ' Fire Suppressi',
In [47]: len(one_d)
Out[47]: 117365
In [48]:
         uni_list = []
         for item in one_d:
              if item not in uni list:
                  uni_list.append(item)
```

```
uni_list
In [49]:
Out[49]: ['Lieutenant',
           ' Fire Suppression',
           'Chief of Police',
           'Electronic Maintenance Tech',
           'Chief',
           ' Fire Department',
           'EMT/Paramedic/Firefighter',
           'Dept Head V',
           'Gen Mgr',
           ' Public Trnsp Dept',
           'Captain 3',
           'Asst Chf of Dept (Fire Dept)',
           'Battlion Chief',
           ' Fire Suppressi',
           'Assistant Deputy Chief 2',
           'Transit Manager 2',
           'Asst Med Examiner',
           'Dep Chf of Dept (Fire Dept)',
           'Executive Contract Employee',
In [50]: len(uni_list)
Out[50]: 1168
```

Total Number of job title contains captain

```
SF[SF["JobTitle"].str.contains("captain", case = False)]
In [53]:
Out[53]:
                                                                                          TotalPay
                   EmployeeName
                                      JobTitle
                                               BasePay OvertimePay
                                                                     OtherPay
                                                                                Benefits
            36167
                     John Goldberg
                                     Captain 3
                                              104404.00
                                                                0.00
                                                                     245999.41
                                                                               24287.23
                                                                                        350403.41
                                      Captain,
                          Michael
            36180
                                         Fire
                                              145659.03
                                                           125868.06
                                                                      30474.97 45129.03 302002.06
                          Rolovich
                                  Suppression
                                      Captain,
            36184
                      Darryl Hunter
                                         Fire
                                              145659.03
                                                           115673.73
                                                                      32610.00 49571.51 293942.76
                                  Suppression
                                      Captain,
            36186
                    Michael Delane
                                         Fire
                                              147069.71
                                                           113372.94
                                                                      33012.58 45978.15 293455.23
                                  Suppression
                                      Captain,
            36189
                                                            53895.92 130200.40 28907.03 308669.82
                     Philip Stevens
                                              124573.50
                                         Fire
                                  Suppression
          len(SF[SF["JobTitle"].str.contains("cAPTAIN", case = False)])
In [54]:
Out[54]: 410
          len(SF[SF["JobTitle"].str.contains("CAPTAIN")])
Out[55]: 0
          len(SF[SF["JobTitle"].str.contains("CAPTAIN",case= False)])
In [56]:
Out[56]: 410
          SF[SF["JobTitle"].str.contains("CAPTAIN")].count()
In [57]:
                                 0
Out[57]:
          EmployeeName
           JobTitle
                                 0
           BasePay
                                 0
           OvertimePay
                                 0
           OtherPay
                                 0
          Benefits
                                 0
          TotalPay
                                 0
           TotalPayBenefits
                                 0
          Year
                                 0
          dtype: int64
```

```
SF[SF["JobTitle"].str.contains("CAPTAIN", case = False)].count()
In [58]:
Out[58]: EmployeeName
                              410
         JobTitle
                              410
         BasePay
                              410
         OvertimePay
                              410
         OtherPay
                              410
         Benefits
                              410
         TotalPay
                              410
         TotalPayBenefits
                              410
                              410
         dtype: int64
```

Display All THe Employee Names From Fire Department

```
In [59]:
           SF.columns
Out[59]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                    'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
                  dtype='object')
In [60]:
           SF[SF["JobTitle"].str.contains("Fire",case = False)]
Out[60]:
                    EmployeeName
                                                   JobTitle
                                                             BasePay OvertimePay OtherPay
                                                                                               Benefit
                                             Lieutenant. Fire
             36159
                      Gary Altenberg
                                                             128808.87
                                                                          220909.48
                                                                                     13126.31
                                                                                               44430.1
                                                Suppression
                     Joanne Hayes-
             36162
                                       Chief, Fire Department 296943.01
                                                                               0.00
                                                                                     17816.59 72047.8
                             White
                          Frederick
                                    EMT/Paramedic/Firefighter
             36163
                                                            126863.19
                                                                          192424.49
                                                                                     17917.18 44438.2
                            Binkley
                                        Asst Chf of Dept (Fire
             36168
                      David Franklin
                                                            204032.52
                                                                           85503.16
                                                                                     26193.09
                                                                                              58486.1
                                                      Dept)
                                           Battlion Chief, Fire
             36169
                      Brendan Ward
                                                             174822.47
                                                                          118215.58
                                                                                     28845.78
                                                                                              49648.0
                                                  Suppressi
                         Kenneth C
            145956
                                                  Firefighter
                                                                  0.00
                                                                               0.00
                                                                                         0.00
                                                                                                4645.5
                             Farris
```

```
SF["JobTitle"].str.contains("Fire",case = False)
In [61]:
Out[61]: 36159
                     True
         36160
                    False
         36161
                    False
         36162
                     True
         36163
                     True
                    . . .
         148645
                    False
         148647
                    False
                    False
         148648
                    False
         148649
                    False
         148653
         Name: JobTitle, Length: 111886, dtype: bool
In [62]: len(SF[SF["JobTitle"].str.contains("Fire",case = False)])
Out[62]: 4399
In [63]: len(SF[SF["JobTitle"].str.contains("Fire")])
Out[63]: 4399
In [64]:
         SF[SF["JobTitle"].str.contains("Fire",case = False)]["EmployeeName"]
Out[64]: 36159
                        Gary Altenberg
         36162
                    Joanne Hayes-White
         36163
                     Frederick Binkley
         36168
                        David Franklin
                          Brendan Ward
         36169
         145956
                      Kenneth C Farris
                         Edward A Dunn
         147556
         148021
                        Kari A Johnson
         148209
                          Sheryl K Lee
         148554
                       Lawrence F Gatt
         Name: EmployeeName, Length: 4399, dtype: object
```

```
SF[SF["JobTitle"].str.contains("Fire",case = False)][["EmployeeName","JobTitle
In [65]:
Out[65]:
                         EmployeeName
                                                            JobTitle
              36159
                           Gary Altenberg
                                          Lieutenant, Fire Suppression
              36162 Joanne Hayes-White
                                                Chief, Fire Department
              36163
                         Frederick Binkley
                                            EMT/Paramedic/Firefighter
              36168
                           David Franklin
                                           Asst Chf of Dept (Fire Dept)
              36169
                           Brendan Ward Battlion Chief, Fire Suppressi
             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
```

Find the minimum And Maximum avarage Basepay

```
SF.columns
In [66]:
Out[66]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
               dtype='object')
         SF['BasePay'] = pd.to_numeric(SF['BasePay'], errors='coerce')
In [67]:
         SF.info()
In [68]:
         <class 'pandas.core.frame.DataFrame'>
         Int64Index: 111886 entries, 36159 to 148653
         Data columns (total 9 columns):
              Column
                                Non-Null Count
                                                 Dtype
                                _____
          0
              EmployeeName
                                111886 non-null
                                                 object
              JobTitle
                                                 object
          1
                                111886 non-null
          2
                                111886 non-null float64
              BasePay
          3
              OvertimePay
                                111886 non-null float64
          4
              OtherPay |
                                111886 non-null float64
          5
                                111886 non-null float64
              Benefits
          6
              TotalPay
                                111886 non-null float64
          7
              TotalPayBenefits 111886 non-null float64
                                111886 non-null
                                                 int64
         dtypes: float64(6), int64(1), object(2)
         memory usage: 8.5+ MB
```

```
SF["BasePay"].describe()
In [69]:
Out[69]: count
                   111886.000000
         mean
                    67207.558425
         std
                    43417.689463
         min
                    -166.010000
         25%
                    33644.427500
         50%
                    65547.035000
         75%
                    95229.030000
                   319275.010000
         max
         Name: BasePay, dtype: float64
In [70]: SF["BasePay"].mean()
Out[70]: 67207.55842466283
In [71]: SF["BasePay"].min()
Out[71]: -166.01
In [72]: SF["BasePay"].max()
Out[72]: 319275.01
```

REplace non provied in Employee name column to nan

```
SF["EmployeeName"].replace("Not provided", np.nan)
In [73]:
Out[73]: 36159
                        Gary Altenberg
         36160
                          Gregory Suhr
         36161
                            Khoa Trinh
         36162
                    Joanne Hayes-White
         36163
                    Frederick Binkley
         148645
                     Carolyn A Wilson
         148647
                        Joann Anderson
         148648
                           Leon Walker
         148649
                         Roy I Tillery
         148653
                             Joe Lopez
         Name: EmployeeName, Length: 111886, dtype: object
         SF["EmployeeName"] = SF["EmployeeName"].replace("Not provided", np.nan)
In [74]:
```

In [75]: SF

Out[75]:

EmployeeName	JobTitle	BasePay	OvertimePay	OtherPay	Benefits	
Gary Altenberg	Lieutenant, Fire Suppression	128808.87	220909.48	13126.31	44430.12	;
Gregory Suhr	Chief of Police	302578.00	0.00	18974.11	69810.19	
Khoa Trinh	Electronic Maintenance Tech	111921.00	146415.32	78057.41	53102.29	;
Joanne Hayes- White	Chief, Fire Department	296943.01	0.00	17816.59	72047.88	;
Frederick Binkley	EMT/Paramedic/Firefighter	126863.19	192424.49	17917.18	44438.25	;
Carolyn A Wilson	Human Services Technician	0.00	0.00	0.00	0.00	
Joann Anderson	Communications Dispatcher 2	0.00	0.00	0.00	0.00	
Leon Walker	Custodian	0.00	0.00	0.00	0.00	
Roy I Tillery	Custodian	0.00	0.00	0.00	0.00	
Joe Lopez	Counselor, Log Cabin Ranch	0.00	0.00	-618.13	0.00	
rows × 9 columns	s					
					•	·
	Gary Altenberg Gregory Suhr Khoa Trinh Joanne Hayes- White Frederick Binkley Carolyn A Wilson Joann Anderson Leon Walker Roy I Tillery Joe Lopez	Gary Altenberg Gregory Suhr Khoa Trinh Joanne Hayes- White Frederick Binkley Carolyn A Wilson Carolyn A Wilson Wilson Wilson Communications Dispatcher 2 Leon Walker Roy I Tillery Lieutenant, Fire Suppression Chief of Police Electronic Maintenance Tech Chief, Fire Department EMT/Paramedic/Firefighter Carolyn A Human Services Technician Communications Dispatcher 2 Custodian Counselor, Log Cabin	Gary Altenberg Gary Altenberg Chief of Police Suppression Chief of Police 302578.00 Khoa Trinh Electronic Maintenance Tech Joanne Hayes- White Frederick Binkley Carolyn A Wilson Communications Dispatcher 2 Leon Walker Roy I Tillery Chief, Fire Department Lieutenant, Fire Suppression 128808.87 11921.00 1119	Gary Altenberg Lieutenant, Fire Suppression 128808.87 220909.48 Gregory Suhr Chief of Police 302578.00 0.00 Khoa Trinh Electronic Maintenance Tech 111921.00 146415.32 Joanne Hayes-White Chief, Fire Department 296943.01 0.00 Frederick Binkley EMT/Paramedic/Firefighter 126863.19 192424.49 Carolyn A Wilson Human Services Technician 0.00 0.00 Joann Anderson Communications Dispatcher 2 0.00 0.00 Leon Walker Custodian 0.00 0.00 Roy I Tillery Custodian 0.00 0.00 Joe Lopez Counselor, Log Cabin Ranch 0.00 0.00	Gary Altenberg Lieutenant, Fire Suppression 128808.87 220909.48 13126.31 Gregory Suhr Chief of Police 302578.00 0.00 18974.11 Khoa Trinh Electronic Maintenance Tech 111921.00 146415.32 78057.41 Joanne Hayes-White Chief, Fire Department 296943.01 0.00 17816.59 Frederick Binkley EMT/Paramedic/Firefighter 126863.19 192424.49 17917.18 Carolyn A Wilson Human Services Technician 0.00 0.00 0.00 Joann Anderson Communications Dispatcher 2 0.00 0.00 0.00 Leon Walker Custodian 0.00 0.00 0.00 Roy I Tillery Custodian 0.00 0.00 -618.13	Gary Altenberg Lieutenant, Fire Suppression 128808.87 220909.48 13126.31 44430.12 Gregory Suhr Chief of Police 302578.00 0.00 18974.11 69810.19 Khoa Trinh Electronic Maintenance Tech 111921.00 146415.32 78057.41 53102.29 Joanne Hayes-White Chief, Fire Department 296943.01 0.00 17816.59 72047.88 Frederick Binkley EMT/Paramedic/Firefighter 126863.19 192424.49 17917.18 44438.25 Carolyn A Wilson Human Services Technician 0.00 0.00 0.00 0.00 0.00 Joann Anderson Communications Dispatcher 2 0.00 0.00 0.00 0.00 0.00 Leon Walker Custodian 0.00 0.00 0.00 0.00 0.00 Joe Lopez Counselor, Log Cabin Ranch 0.00 0.00 -618.13 0.00

Find JOb title of albart pardini

How Many ALbart pardini make (include Benifit)?

Display name of person having the highest basepay

```
In [80]:
         SF.info()
         <class 'pandas.core.frame.DataFrame'>
         Int64Index: 111886 entries, 36159 to 148653
         Data columns (total 9 columns):
              Column
                                 Non-Null Count
                                                   Dtype
          0
               EmployeeName
                                 111886 non-null
                                                   obiect
          1
              JobTitle
                                 111886 non-null
                                                   object
          2
                                                   float64
              BasePay
                                 111886 non-null
          3
                                 111886 non-null float64
              OvertimePay
          4
              OtherPay
                                 111886 non-null float64
          5
              Benefits
                                 111886 non-null float64
              TotalPay
                                 111886 non-null float64
          7
              TotalPayBenefits 111886 non-null float64
                                 111886 non-null int64
              Year
         dtypes: float64(6), int64(1), object(2)
         memory usage: 8.5+ MB
In [81]:
         SF[SF["BasePay"].max() == SF["BasePay"]]
Out[81]:
                              JobTitle
                                       BasePay OvertimePay OtherPay
                EmployeeName
                                                                    Benefits
                                                                             TotalPay TotalPa
                               Chief of
          72925
                 Gregory P Suhr
                                      319275.01
                                                           20007.06 86533.21
                                                                            339282.07
                                Police
In [82]:
         SF[SF["BasePay"].max() == SF["BasePay"]]["EmployeeName"]
Out[82]: 72925
                   Gregory P Suhr
         Name: EmployeeName, dtype: object
```

```
In [83]: SF[SF["BasePay"] == SF["BasePay"].max()][["BasePay","EmployeeName"]]
Out[83]:
```

BasePay EmployeeName
72925 319275.01 Gregory P Suhr

Find the avarge basepay of all employee per year

```
In [84]: SF.groupby("Year")
Out[84]: <pandas.core.groupby.generic.DataFrameGroupBy object at 0x000001A52AF8CDC0>
          SF.groupby("Year").mean()
Out[85]:
                    BasePay OvertimePay
                                           OtherPay
                                                         Benefits
                                                                     TotalPay TotalPayBenefits
           Year
           2012 65436.406857
                             5023.417824 3653.437583 26439.966967 74113.262265
                                                                               100553.229232
           2013 69630.030216 5367.913512 3810.341313 24131.696305 78808.285041
                                                                               102939.981346
           2014 66564.421924
                             5401.993737 3505.421251 24789.601756 75471.836912
                                                                               100261.438668
In [86]:
          SF.groupby("Year").mean()["BasePay"].reset_index()
Out[86]:
              Year
                       BasePay
           0 2012 65436.406857
             2013 69630.030216
           2 2014 66564.421924
          SF.groupby("Year").mean()["BasePay"].reset_index().keys()
In [87]:
Out[87]: Index(['Year', 'BasePay'], dtype='object')
          SF.groupby("Year")["BasePay"].mean().reset_index()
In [88]:
Out[88]:
              Year
                       BasePay
             2012 65436.406857
             2013 69630.030216
           2 2014 66564.421924
```

```
In [89]: SF.groupby("Year").mean()["BasePay"]
Out[89]: Year
          2012
                  65436.406857
          2013
                  69630.030216
          2014
                  66564.421924
          Name: BasePay, dtype: float64
In [90]: SF.groupby("Year").mean()["BasePay"].keys()
Out[90]: Int64Index([2012, 2013, 2014], dtype='int64', name='Year')
          plt.pie(SF.groupby("Year").mean()["BasePay"],labels= SF.groupby("Year").mean()
In [113]:
          plt.show()
                                                      2012
                                              32.5%
           2013
                        34.5%
                                             33.0%
                                                      2014
```

Find the avarge basepay of all employee per jobtitle

In [92]: SF.groupby("JobTitle").mean()

Out[92]:

	BasePay	OvertimePay	OtherPay	Benefits	TotalPay	TotalPay
JobTitle						
ACPO,JuvP, Juv Prob (SFERS)	62290.780000	0.000000	0.000000	17975.590000	62290.780000	8026
ASR Senior Office Specialist	60551.580167	410.988500	2556.794500	26604.874167	63519.363167	9012 ₁
ASR-Office Assistant	41253.471951	18.502683	239.527317	19250.591707	41511.501951	6076
Account Clerk	42372.579396	193.827547	579.346830	20100.588226	43145.753774	6324
Accountant I	61777.832500	0.000000	258.268750	26086.087500	62036.101250	8812
Wire Rope Cable Maint Sprv	92751.746667	82446.923333	27835.050000	39084.603333	203033.720000	24211
Worker's Comp Supervisor 1	68867.296429	0.000000	1522.000714	25736.234286	70389.297143	9612
Worker's Compensation Adjuster	72363.278784	0.000000	885.991081	28072.155946	73249.269865	10132
X-Ray Laboratory Aide	46086.387100	3483.767100	1253.788500	18697.180500	50823.942700	6952
Youth Comm Advisor	39077.957500	0.000000	2336.350000	18704.242500	41414.307500	6011

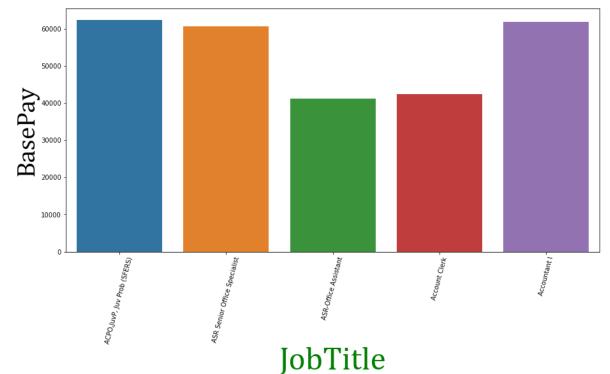
1109 rows × 7 columns

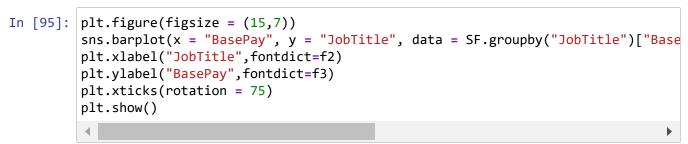
In [93]: SF.groupby("JobTitle")["BasePay"].mean().reset_index().head()

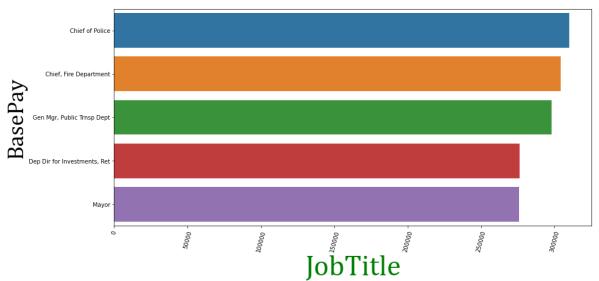
Out[93]:

	JobTitle	BasePay
0	ACPO,JuvP, Juv Prob (SFERS)	62290.780000
1	ASR Senior Office Specialist	60551.580167
2	ASR-Office Assistant	41253.471951
3	Account Clerk	42372.579396
4	Accountant I	61777.832500

```
In [94]: plt.figure(figsize = (15,7))
    sns.barplot(x = "JobTitle", y = "BasePay", data = SF.groupby("JobTitle")["Base
    plt.xlabel("JobTitle",fontdict=f2)
    plt.ylabel("BasePay",fontdict=f3)
    plt.xticks(rotation = 75)
    plt.show()
```





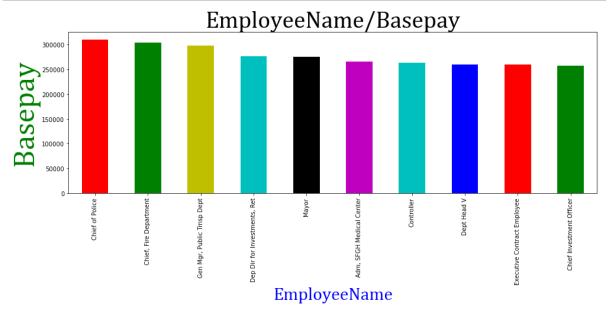


```
SF.groupby("JobTitle").mean()["BasePay"]
In [96]:
Out[96]: JobTitle
         ACPO, JuvP, Juv Prob (SFERS)
                                            62290.780000
         ASR Senior Office Specialist
                                            60551.580167
         ASR-Office Assistant
                                            41253.471951
         Account Clerk
                                            42372.579396
         Accountant I
                                            61777.832500
         Wire Rope Cable Maint Sprv
                                            92751.746667
         Worker's Comp Supervisor 1
                                            68867.296429
         Worker's Compensation Adjuster
                                            72363.278784
         X-Ray Laboratory Aide
                                            46086.387100
         Youth Comm Advisor
                                            39077.957500
         Name: BasePay, Length: 1109, dtype: float64
```

In [97]: SF.groupby("JobTitle").mean()["BasePay"].sort_values(ascending=False).head(10)

Out[97]:

	JobTitle	BasePay
0	Chief of Police	309767.683333
1	Chief, Fire Department	304232.340000
2	Gen Mgr, Public Trnsp Dept	297769.413333
3	Dep Dir for Investments, Ret	276153.765000
4	Mayor	275852.530000
5	Adm, SFGH Medical Center	265218.780000
6	Controller	263588.753333
7	Dept Head V	259590.712222
8	Executive Contract Employee	259328.458333
9	Chief Investment Officer	257340.000000



Find the avarge basepay of employee having jobtitle accountant

```
In [99]:
          SF.columns
Out[99]: Index(['EmployeeName', 'JobTitle', 'BasePay', 'OvertimePay', 'OtherPay',
                  'Benefits', 'TotalPay', 'TotalPayBenefits', 'Year'],
                 dtype='object')
In [100]:
          SF["JobTitle"]=="ACCOUNTANT"
Out[100]: 36159
                     False
          36160
                     False
          36161
                     False
          36162
                     False
          36163
                     False
          148645
                     False
          148647
                    False
          148648
                     False
          148649
                     False
                     False
          148653
          Name: JobTitle, Length: 111886, dtype: bool
```

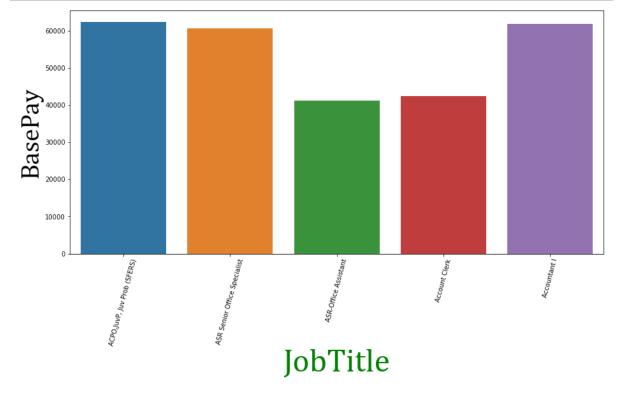
```
SF[SF['JobTitle'] == "ACCOUNTANT"]
In [101]:
Out[101]:
              EmployeeName JobTitle BasePay OvertimePay OtherPay Benefits TotalPay TotalPayBenefit
In [102]:
           SF[SF['JobTitle'] == "ACCOUNTANT"]["BasePay"]
Out[102]: Series([], Name: BasePay, dtype: float64)
           SF[SF['JobTitle'] == "ACCOUNTANT"]["BasePay"].mean()
In [103]:
Out[103]: nan
In [104]:
           SF.groupby('JobTitle')["BasePay"].mean().reset_index()
Out[104]:
                                      JobTitle
                                                   BasePay
                0
                   ACPO, JuvP, Juv Prob (SFERS)
                                              62290.780000
                1
                      ASR Senior Office Specialist 60551.580167
                2
                            ASR-Office Assistant 41253.471951
                3
                                 Account Clerk 42372.579396
                4
                                   Accountant I 61777.832500
             1104
                      Wire Rope Cable Maint Sprv 92751.746667
             1105
                     Worker's Comp Supervisor 1 68867.296429
             1106
                  Worker's Compensation Adjuster 72363.278784
             1107
                          X-Ray Laboratory Aide 46086.387100
             1108
                            Youth Comm Advisor 39077.957500
            1109 rows × 2 columns
           SF.groupby('JobTitle')["BasePay"].mean().reset_index().head()
In [105]:
Out[105]:
                                  JobTitle
                                               BasePay
               ACPO, JuvP, Juv Prob (SFERS)
                                          62290.780000
            0
                  ASR Senior Office Specialist 60551.580167
             1
             2
                        ASR-Office Assistant 41253.471951
             3
                             Account Clerk 42372.579396
                              Accountant I 61777.832500
             4
```

```
In [106]: SF.groupby('JobTitle')["BasePay"].mean().reset_index().head().round()
```

Out[106]:

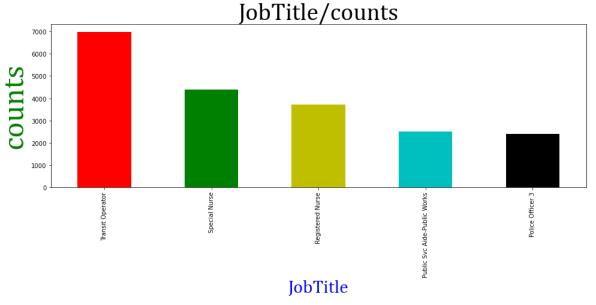
	Jobiille	БаѕеРау
0	ACPO,JuvP, Juv Prob (SFERS)	62291.0
1	ASR Senior Office Specialist	60552.0
2	ASR-Office Assistant	41253.0
3	Account Clerk	42373.0
4	Accountant I	61778.0

```
In [107]: plt.figure(figsize = (15,7))
    sns.barplot(x = "JobTitle", y = "BasePay", data = SF.groupby('JobTitle')["Base
    plt.xlabel("JobTitle",fontdict=f2)
    plt.ylabel("BasePay",fontdict=f3)
    plt.xticks(rotation = 75)
    plt.show()
```



Find the 5 most common job

```
SF['JobTitle'].value_counts()
In [109]:
Out[109]: Transit Operator
                                             6975
          Special Nurse
                                             4382
          Registered Nurse
                                             3725
          Public Svc Aide-Public Works
                                             2514
          Police Officer 3
                                             2411
          Commissioner 16.700c, No Pay
                                                1
          Chief Investment Officer
                                                1
          Chief Forensic Toxicologist
                                                1
          Lieutenant (Police Department)
                                                1
          Cashier 3
          Name: JobTitle, Length: 1109, dtype: int64
In [110]:
          SF['JobTitle'].value_counts().head()
Out[110]: Transit Operator
                                           6975
          Special Nurse
                                           4382
          Registered Nurse
                                           3725
          Public Svc Aide-Public Works
                                           2514
          Police Officer 3
                                           2411
          Name: JobTitle, dtype: int64
In [111]: | SF['JobTitle'].value_counts().head().plot(kind = "bar", color = cm, figsize=(16
          plt.xlabel('JobTitle', fontdict=f1)
          plt.ylabel("counts", fontdict=f2)
          plt.title("JobTitle/counts", fontdict = f3)
          plt.show()
```



```
In [112]: pwd
```

Out[112]: 'C:\\Users\\Sinha Rahul'