```
In [1]: #importing lib
         import numpy as np
         import pandas as pd
         import matplotlib.pyplot as plt
         import seaborn as sns
         data = pd.read csv("E:/Data Analytics Project/New folder (5)/New folder (4)/ds salaries.csv")
         print(data)
             Unnamed: 0 work_year experience_level employment_type \
       0
                      0
                               2020
                                                    ΜI
       1
                      1
                               2020
                                                    SE
                                                                     FT
       2
                      2
                               2020
                                                    SE
                                                                     FT
       3
                               2020
                                                    ΜI
                                                                     FT
                      3
       4
                      4
                               2020
                                                    SE
                                                                     FT
                               2022
       602
                    602
                                                    SE
                                                                     FT
       603
                    603
                               2022
                                                    SE
                                                                     FT
       604
                    604
                               2022
                                                    SE
                                                                     FT
       605
                    605
                               2022
                                                    SE
                                                                     FT
       606
                    606
                               2022
                                                    ΜI
                                                                     FT
                               job_title salary_salary_currency
                                                                     salary_in_usd \
       0
                          Data Scientist
                                            70000
                                                               EUR
                                                                              79833
       1
             Machine Learning Scientist
                                           260000
                                                                USD
                                                                             260000
       2
                      Big Data Engineer
                                            85000
                                                                GBP
                                                                             109024
                                            20000
                                                                              20000
       3
                   Product Data Analyst
                                                                USD
       4
              Machine Learning Engineer
                                           150000
                                                                USD
                                                                             150000
                           Data Engineer
                                           154000
                                                                USD
                                                                             154000
       602
                                           126000
       603
                           Data Engineer
                                                                USD
                                                                             126000
       604
                                                                USD
                                                                             129000
                            Data Analyst
                                           129000
       605
                            Data Analyst
                                           150000
                                                               USD
                                                                             150000
       606
                            AI Scientist 200000
                                                                USD
                                                                             200000
           employee residence
                                 remote_ratio company_location company_size
       0
                             DE
                                             0
                                                               DE
                                                                              L
       1
                             JΡ
                                             0
                                                               JΡ
       2
                                            50
                             GB
                                                               GB
                                                                              М
       3
                             HN
                                             0
                                                               HN
                                                                              S
       4
                             US
                                            50
                                                              US
                                                                              L
                                                              . . .
                                           100
                                                                              М
       602
                             US
                                                              US
       603
                             US
                                           100
                                                               US
                                                                              М
       604
                             US
                                                               US
                                                                              М
                                             0
       605
                             US
                                           100
                                                               US
                                                                              М
                                           100
       606
                             IN
                                                               US
                                                                              L
       [607 rows x 12 columns]
In [2]: data.head()
Out[2]:
           Unnamed:
                                                                            salary salary_currency salary_in_usd employee_residenc
                      work_year experience_level employment_type
                                                                 job_title
                   0
                                                                      Data
         0
                   0
                           2020
                                                                            70000
                                                                                             EUR
                                                                                                          79833
                                                                                                                                DΙ
                                             MI
                                                                   Scientist
                                                                   Machine
                                                                  Learning
         1
                    1
                           2020
                                             SE
                                                              FT
                                                                           260000
                                                                                             USD
                                                                                                         260000
                                                                                                                                J١
                                                                   Scientist
                                                                  Big Data
         2
                   2
                                                                                                         109024
                           2020
                                             SE
                                                                            85000
                                                                                             GBP
                                                                                                                                GI
                                                                  Engineer
                                                                   Product
         3
                   3
                           2020
                                             MI
                                                                            20000
                                                                                             USD
                                                                                                          20000
                                                                                                                                1H
                                                                      Data
                                                                    Analyst
                                                                   Machine
         4
                   4
                           2020
                                             SE
                                                                  Learning
                                                                           150000
                                                                                             USD
                                                                                                         150000
                                                                                                                                U
                                                                  Engineer
```

In [3]: data.dtypes

```
int64
Out[3]: Unnamed: 0
        work_year
                               int64
        experience_level
                              object
        employment_type
                              object
                              object
        job_title
        salary
        salary_currency
                              obiect
        salary in usd
                               int64
        employee_residence
                              object
        remote_ratio
                               int64
        company_location
                              object
        company_size
                              object
        dtype: object
In [4]: data.describe()
              Unnamed: 0
Out[4]:
                           work year
                                           salary salary in usd remote ratio
        count
               607.000000
                          607.000000 6.070000e+02
                                                    607.000000
                                                                 607.00000
        mean
               303.000000
                         2021.405272 3.240001e+05 112297.869852
                                                                  70.92257
              175.370085
                            0.692133 1.544357e+06
                                                  70957.259411
                                                                  40.70913
          std
                 0.000000 2020.000000 4.000000e+03
                                                   2859 000000
                                                                  0.00000
          min
         25%
               151.500000
                         2021.000000 7.000000e+04
                                                  62726.000000
                                                                  50.00000
         50%
               303.000000
                         2022.000000 1.150000e+05 101570.000000
                                                                 100.00000
         75%
               454.500000 2022.000000 1.650000e+05 150000.000000
                                                                 100.00000
               606.000000 2022.000000 3.040000e+07 600000.000000
                                                                 100.00000
         max
In [5]: print(data.info())
       <class 'pandas.core.frame.DataFrame'>
       RangeIndex: 607 entries, 0 to 606
       Data columns (total 12 columns):
                              Non-Null Count Dtype
        # Column
       - - -
           -----
                               -----
        0 Unnamed: 0
                               607 non-null
                                               int64
           work year
                              607 non-null int64
        1
           experience_level 607 non-null object
           employment_type 607 non-null object
        3
        4
           job title
                                607 non-null
                                                object
                               607 non-null
        5
                                               int64
           salary
          salary_currency 607 non-null salary in usd 607 non-null
        6
                                               object
        7
           salary_in_usd
                                               int64
        8
           employee residence 607 non-null
                                                object
                               607 non-null
        9
           remote_ratio
                                               int64
        10 company_location
                                607 non-null
                                                object
        11 company_size
                               607 non-null
                                               object
       dtypes: int64(5), object(7)
       memory usage: 57.0+ KB
```

None

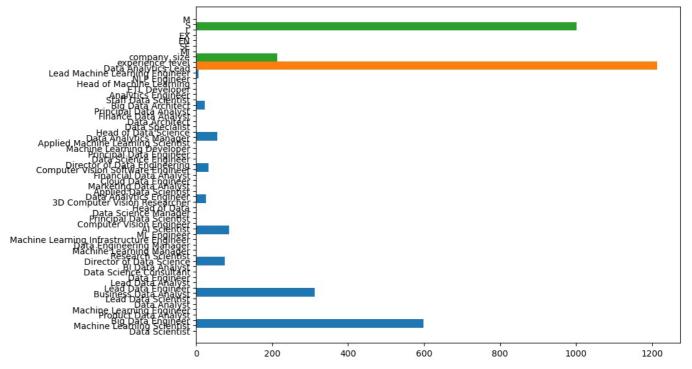
In [10]: df = pd.DataFrame(data)
print(df)

print(gp)

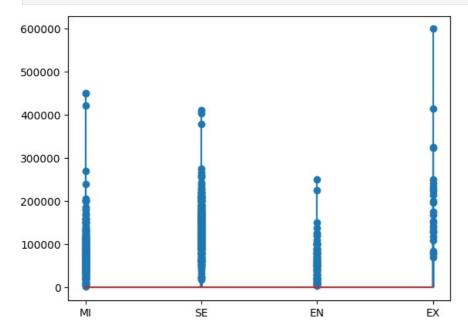
gp = data.groupby("job_title").agg({"salary_in_usd":"count"})

```
salary_in_usd
        job_title
        3D Computer Vision Researcher
        AI Scientist
                                                               7
        Analytics Engineer
                                                               4
                                                               5
        Applied Data Scientist
        Applied Machine Learning Scientist
        BI Data Analyst
                                                               6
        Big Data Architect
                                                               1
        Big Data Engineer
                                                               8
        Business Data Analyst
        Cloud Data Engineer
                                                               2
        Computer Vision Engineer
        Computer Vision Software Engineer
                                                               3
                                                              97
        Data Analyst
        Data Analytics Engineer
                                                               4
        Data Analytics Lead
                                                               7
        Data Analytics Manager
        Data Architect
                                                              11
        Data Engineer
                                                             132
        Data Engineering Manager
                                                               5
                                                               7
        Data Science Consultant
                                                               3
        Data Science Engineer
        Data Science Manager
                                                              12
        Data Scientist
                                                             143
        Data Specialist
                                                               1
        Director of Data Engineering
                                                               2
        Director of Data Science
                                                               7
        ETL Developer
        Finance Data Analyst
                                                               1
        Financial Data Analyst
                                                               2
        Head of Data
                                                               5
        Head of Data Science
                                                               4
        Head of Machine Learning
                                                               1
        Lead Data Analyst
                                                               3
        Lead Data Engineer
                                                               6
        Lead Data Scientist
                                                               3
        Lead Machine Learning Engineer
                                                               1
        ML Engineer
                                                               6
        Machine Learning Developer
                                                               3
        Machine Learning Engineer
                                                              41
        Machine Learning Infrastructure Engineer
                                                               3
        Machine Learning Manager
                                                               1
        Machine Learning Scientist
                                                               8
        Marketing Data Analyst
                                                               1
        NLP Engineer
                                                               1
        Principal Data Analyst
                                                               2
        Principal Data Engineer
                                                               3
        Principal Data Scientist
                                                               7
        Product Data Analyst
                                                               2
        Research Scientist
                                                              16
        Staff Data Scientist
                                                               1
In [15]: print(pd.melt(df, id vars = ["job title"], value vars =["experience level", "company size"], var name = "experience"
                               job_title experience_level values
                          Data Scientist experience level
        1
              Machine Learning Scientist experience_level
                    Big Data Engineer experience_level
Product Data Analyst experience_level
        2
                                                                SE
        3
                                                                MT
               Machine Learning Engineer experience_level
                                                                SE
        1209
                           Data Engineer
                                               company_size
        1210
                           Data Engineer
                                               company_size
                                                                М
        1211
                            Data Analyst
                                               company size
                                                                М
        1212
                            Data Analyst
                                               company_size
                                                                 М
        1213
                            AI Scientist
                                               company size
                                                                 L
        [1214 rows x 3 columns]
In [191... a=pd.melt(df, id vars = ["job_title"], value_vars =["experience_level","company_size"], var_name = "experience_
         plt.figure(figsize=(10, 7))
         plt.hist(a, orientation = 'horizontal' )
```

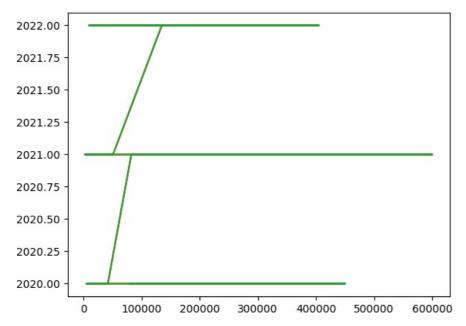
plt.savefig("hist.png", transparent = True)



```
In [173... plt.stem(df["experience_level"], df["salary_in_usd"])
   plt.savefig("stem.png")
   plt.show()
```

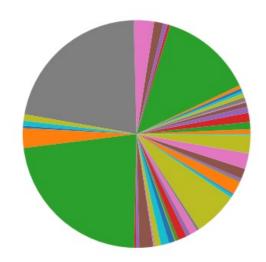


```
In [190... plt.plot(df["salary_in_usd"], df["work_year"], label = "2020")
   plt.plot(df["salary_in_usd"], df["work_year"], label = "2021")
   plt.plot(df["salary_in_usd"], df["work_year"], label = "2022")
   #plt.legend()
   plt.show()
   plt.savefig("plot.png", transparent = True)
```



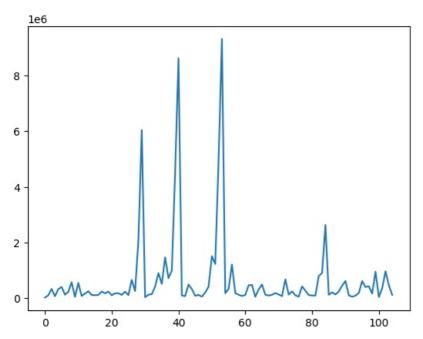
<Figure size 640x480 with 0 Axes>

```
In [189... grouped_by = df.groupby("job_title")["salary_in_usd"].sum()
#print(grouped_by)
plt.pie(grouped_by.values)
plt.show()
plt.savefig("pie.png", transparent = True)
```



<Figure size 640x480 with 0 Axes>

```
In [188... grouped by = df.groupby(["job title","experience level"])["salary in usd"].sum()
         print(grouped_by)
         plt.plot(grouped_by.values)
         plt.show()
         plt.savefig("plot.png" , transparent = True)
        job title
                                         experience_level
        3D Computer Vision Researcher
                                        ΜI
                                                               5409
        AI Scientist
                                        FN
                                                              87949
                                        ΜI
                                                             320000
                                        SE
                                                              55000
        Analytics Engineer
                                        \mathsf{EX}
                                                             310000
                                                              26072
        Product Data Analyst
                                        ΜI
        Research Scientist
                                        ΕN
                                                             344528
                                        ΜI
                                                             955487
                                                             444297
                                        SE
        Staff Data Scientist
                                        SE
                                                             105000
        Name: salary_in_usd, Length: 105, dtype: int64
```

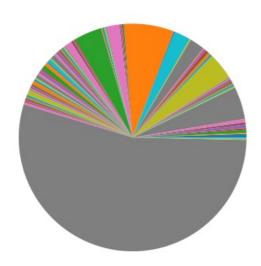


<Figure size 640x480 with 0 Axes>

```
In [187... gpl = df.groupby(["company_location","employee_residence"])["remote_ratio"].count()
    print(gpl)
    plt.pie(gpl)
    plt.show()
    plt.savefig("pie.png", transparent = True)
```

company_location	employee_residence	
AE	AE	3
AS	IN	1
AT	AT	3
	DE	1
AU	AU	3
US	R0	1
	RU	2
	US	330
	VN	1
VN	VN	1

Name: remote_ratio, Length: 90, dtype: int64

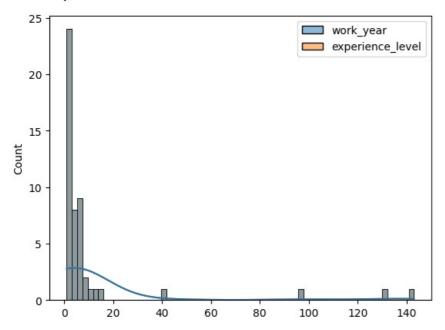


<Figure size 640x480 with 0 Axes>

```
In [115... gp2 = df.groupby("job_title").agg({"work_year":"count","experience_level":"count"})
    print(gp2)
    sns.histplot(gp2, kde = True)
```

	work_year	experience_level
job_title		
3D Computer Vision Researcher	1	1
AI Scientist	7	7
Analytics Engineer	4	4
Applied Data Scientist	5	5
Applied Machine Learning Scientist	4	4
BI Data Analyst	6	6
Big Data Architect	1	1
Big Data Engineer	8	8
Business Data Analyst	5	5
Cloud Data Engineer	2	2
Computer Vision Engineer	6	6
Computer Vision Software Engineer	3	3
Data Analyst	97	97
Data Analytics Engineer	4	4
Data Analytics Lead	1	1
Data Analytics Manager	7	7
Data Architect	11	11
Data Engineer	132	132
Data Engineering Manager	5	5
Data Science Consultant	7	7
Data Science Engineer	3	3
Data Science Manager	12	12
Data Scientist	143	143
Data Specialist	1	1
Director of Data Engineering	2	2
Director of Data Science	7	7
ETL Developer	2	2
Finance Data Analyst	1	1
Financial Data Analyst	2	2
Head of Data	5	5
Head of Data Science	4	4
Head of Machine Learning	1	1
Lead Data Analyst	3	3
Lead Data Engineer	6	6
Lead Data Scientist	3	3
Lead Machine Learning Engineer	1	1
ML Engineer	6	6
Machine Learning Developer	3	3
Machine Learning Engineer	41	41
Machine Learning Infrastructure Engineer	3	3
Machine Learning Manager	1	1
Machine Learning Scientist	8	8
Marketing Data Analyst	1	1
NLP Engineer	1	1
Principal Data Analyst	2	2
Principal Data Engineer	3	3
Principal Data Scientist	7	7
Product Data Analyst	2	2
Research Scientist	16	16
Staff Data Scientist	1	1

Out[115... <Axes: ylabel='Count'>

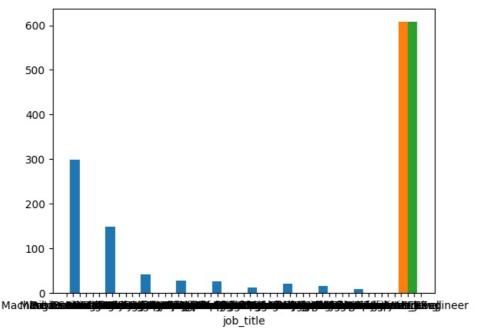


```
In [183... b = (pd.melt(df,id_vars = ["job_title"],value_vars = ["experience_level"]))
    print(b)
    plt.xlabel("job_title")
    plt.hist(b)
```

plt.savefig('hist.png', transparent = True)

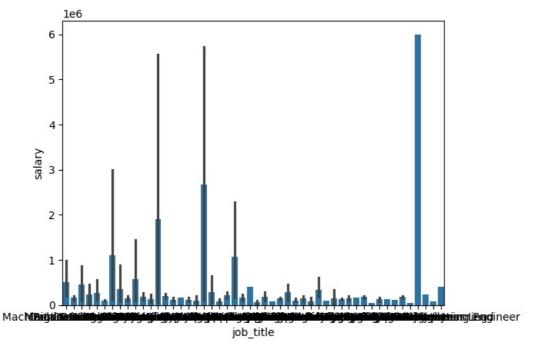
```
job title
                                         variable value
0
                 Data Scientist experience_level
1
     Machine Learning Scientist experience level
                                                      SE
2
              Big Data Engineer experience_level
                                                     SE
3
           Product Data Analyst experience level
     Machine Learning Engineer experience_level
4
                                                     SE
                  Data Engineer
                                 experience_level
602
                                                     SE
603
                  Data Engineer
                                 experience_level
                                                     SE
                   Data Analyst
604
                                                     SE
                                 {\tt experience\_level}
605
                   Data Analyst
                                 experience_level
                                                      SE
                   AI Scientist experience level
606
                                                     ΜI
```

[607 rows x 3 columns]



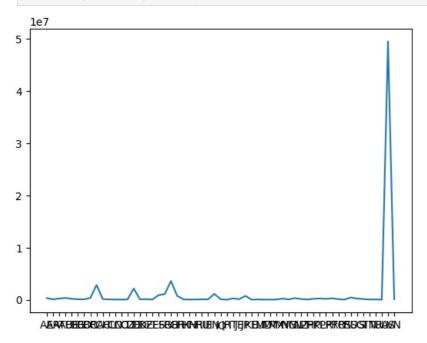
```
In [152... sns.barplot(data = data , x = "job_title", y = "salary")
#plt.legend(bbox_to_anchor = (0.2,0,1.2,1.2))
```

Out[152... <Axes: xlabel='job_title', ylabel='salary'>



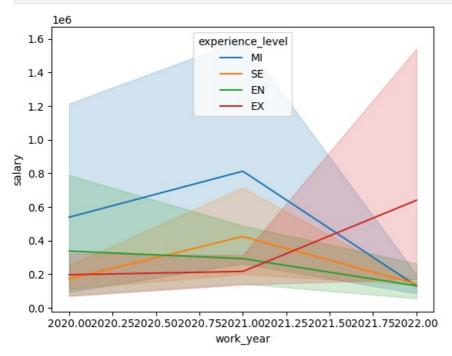
```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns

R = df.groupby("employee_residence")["salary_in_usd"].sum()
#print(R
plt.plot(R)
```



```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns

sns.lineplot(data = data, x = "work_year", y = "salary", hue = "experience_level") #style = "Bronzers")
plt.show()
```



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