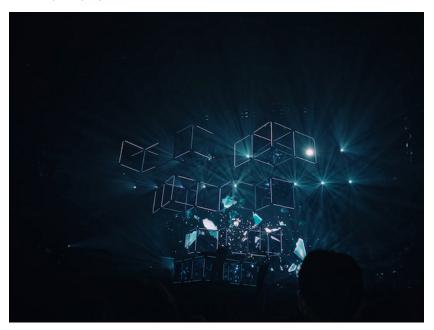
# Analysis of Data Science Salaries in 2024

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# Description

This analysis aims to check which are the top jobs within the Data Science field in terms of salaries, work type and arrangement, location, and many more. The insights in this report help data professionals decide which job should they pursue that would be aligned to their career, financial, and other personal goals. Furthermore, this work specifically answers the following questions:

- What is the highest paid Data Science job title in 2024?
- Which job seniority level is most sought-after by companies?
- Are there chances for freelance jobs within the Data Science space?
- What are the odds that I can land a remote Data Science job this year? As a foreigner, is there a chance that I can work in the US within the Data Science field remotely?
- Will Data Science field be saturated in the coming years?
- Which country offers the highest average salary?
- Do Data Science jobs salaries increase year-per-year?
- Do people working on-site earn more than working remotely?

### The Dataset

The data used in this project is imported from Sazidul Islam (Kaggle) which is retried from https://ai-jobs/net/. It includes Data Science salar information from 2020 to 2024. The file data\_science\_salaries.csv contains data with the following columns:

Column	Description
job_title	The job title or role associated with the reported salary.
experience_level	The level of experience of the individual.
employment_type	Indicates whether the employment is full-time, part-time, etc.
work_models	Describes different working models (remote, on-site, hybrid).
work_year	The specific year in which the salary information was recorded.
employee_residence	The residence location of the employee.
salary	The reported salary in the original currency.
salary_currency	The currency in which the salary is denominated.
salary_in_usd	The converted salary in US dollars.
company_location	The geographic location of the employing organization.
company_size	The size of the company, categorized by the number of employees.

# **Downloading libraries**

```
In [ ]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
```

# **Importing Dataset**

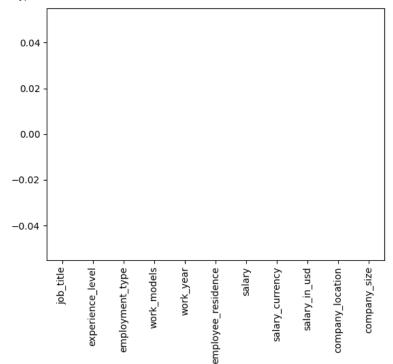
```
In [ ]: # Importing dataset from Kaggle
          ds_data = pd.read_csv('data_science_salaries.csv')
          ds_data.head(10)
               job_title experience_level employment_type work_models work_year employee_residence
                                                                                                             salary salary_currency salary_in_usd company_locat
                  Data
                                Mid-level
                                                   Full-time
                                                                   Remote
                                                                                2024
                                                                                              United States
                                                                                                            148100
                                                                                                                                USD
                                                                                                                                            148100
                                                                                                                                                         United Sta
              Engineer
                  Data
                                Mid-level
                                                   Full-time
                                                                   Remote
                                                                                2024
                                                                                              United States
                                                                                                             98700
                                                                                                                                USD
                                                                                                                                             98700
                                                                                                                                                         United Sta
              Engineer
                  Data
          2
                             Senior-level
                                                   Full-time
                                                                                2024
                                                                                              United States 140032
                                                                                                                                USD
                                                                                                                                            140032
                                                                                                                                                         United Sta
                                                                   Remote
               Scientist
                  Data
                                                   Full-time
                                                                                2024
                                                                                              United States 100022
                                                                                                                                USD
                                                                                                                                            100022
                             Senior-level
                                                                   Remote
                                                                                                                                                         United Sta
               Scientist
                                                                                                                                                         United Sta
                                Mid-level
                                                   Full-time
                                                                                2024
                                                                                              United States 120000
                                                                                                                                USD
                                                                                                                                            120000
                                                                   On-site
             Developer
                                                                                                                                USD
                                Mid-level
                                                   Full-time
                                                                   On-site
                                                                                2024
                                                                                              United States
                                                                                                             62100
                                                                                                                                             62100
                                                                                                                                                         United Sta
             Developer
              Research
                               Entry-level
                                                   Full-time
                                                                   On-site
                                                                                2024
                                                                                              United States 250000
                                                                                                                                USD
                                                                                                                                            250000
                                                                                                                                                         United Sta
                Analyst
              Research
                               Entry-level
                                                   Full-time
                                                                   On-site
                                                                                2024
                                                                                              United States 150000
                                                                                                                                USD
                                                                                                                                            150000
                                                                                                                                                         United Sta
                Analyst
                  Data
                                                   Full-time
                                                                                2024
                                                                                              United States 219650
                                                                                                                                USD
                                                                                                                                            219650
                                                                                                                                                          United Sta
                           Executive-level
                                                                   Remote
               Engineer
                  Data
                           Executive-level
                                                   Full-time
                                                                   Remote
                                                                                2024
                                                                                              United States 136000
                                                                                                                                USD
                                                                                                                                            136000
                                                                                                                                                         United Sta
               Engineer
```

# **Exploratory data analysis**

### Data cleaning

```
In [ ]: # Checking the data info
         ds_data.info()
         <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 6599 entries, 0 to 6598
        Data columns (total 11 columns):
         #
             Column
                                  Non-Null Count
         0
             job_title
                                  6599 non-null
                                                    object
             experience_level
                                  6599 non-null
                                                    object
             employment_type
                                  6599 non-null
                                                   object
         3
             work_models
                                  6599 non-null
                                                    object
             work_year
                                   6599 non-null
                                                    int64
             employee_residence
                                  6599 non-null
                                                    object
             salary
                                   6599 non-null
                                                    int64
             salary_currency
                                  6599 non-null
                                                    object
         8
             salary_in_usd
                                   6599 non-null
                                                    int64
                                  6599 non-null
             company_location
                                                    object
         10 company_size
                                  6599 non-null
                                                   object
        dtypes: int64(3), object(8)
        memory usage: 567.2+ KB
In [ ]: # Checking the data shape
         ds_data.shape
Out[ ]: (6599, 11)
In [ ]: # Are there missing values?
print(ds_data.isna().sum())
         ds_data.isna().sum().plot(kind = 'bar')
         plt.show()
```

```
job_title 0
experience_level 0
employment_type 0
work_models 0
work_year 0
employee_residence salary 0
salary_currency 0
salary_in_usd 0
company_location 0
company_size 0
dtype: int64
```



# **Summary Statistics**

```
In [ ]: # Checking the data as summary statistics
ds_data.describe().round(2)
```

Out[]:		work_year	salary	salary_in_usd
	count	6599.00	6599.00	6599.00
	mean	2022.82	179283.26	145560.56
	std	0.67	526372.24	70946.84
	min	2020.00	14000.00	15000.00
	25%	2023.00	96000.00	95000.00
	50%	2023.00	140000.00	138666.00
	75%	2023.00	187500.00	185000.00
	max	2024.00	30400000.00	750000.00

## Q1: What is the highest paid Data Science job titles in 2024?

```
In []: # Subsetting ds_data for Q1: ds_data_q1
    ds_data_q1 = ds_data[['job_title','salary_in_usd','work_year']]
    ds_data_q1.head()
```

ut[]:		job_title	salary_in_usd	work_year
	0	Data Engineer	148100	2024
	1	Data Engineer	98700	2024
	2	Data Scientist	140032	2024
	3	Data Scientist	100022	2024
	4	BI Developer	120000	2024

```
In []: # The average salary per job title per year: top_job_title_per_year
avg_job_salary = ds_data_q1.groupby(['work_year','job_title'])['salary_in_usd'].mean().reset_index(level = 0).sort_values([
         top_job_title_per_year = {}
         years = [2020, 2021, 2022, 2023, 2024]
         for year in years :
             top_job_title_per_year[f'top_job_title_per_year_{year}'] = avg_job_salary[avg_job_salary['work_year'] == year].head(3)
        top_job_title_per_year
Out[]: {'top_job_title_per_year_2020':
                                                                          work_year salary_in_usd
         job_title
         Director of Data Science
                                               2020
                                                           325000.0
         Managing Director Data Science
                                               2020
                                                           300000.0
                                                           260000.0,
                                               2020
         Machine Learning Scientist
          'top_job_title_per_year_2021':
                                                                              work_year salary_in_usd
         job_title
         Cloud Data Architect
                                                   2021
                                                               250000.0
         Principal Data Scientist
                                                   2021
                                                               239152.4
                                                               230700.0,
         Applied Machine Learning Scientist
                                                   2021
          top_job_title_per_year_2022':
                                                                  work year salary in usd
         job_title
                                       2022
                                                  405000.0
         Data Analytics Lead
         Data Science Tech Lead
                                       2022
                                                  375000.0
         AI Developer
                                       2022
                                                  275000.0
          'top_job_title_per_year_2023':
                                                                         work_year salary_in_usd
         job_title
         Analytics Engineering Manager
                                              2023
                                                         399880.0
         Head of Machine Learning
                                              2023
                                                          259000.0
         AWS Data Architect
                                              2023
                                                         258000.0.
          'top_job_title_per_year_2024':
                                                                          work_year salary_in_usd
         iob title
         Machine Learning Scientist
                                               2024
                                                         282916.67
                                                          260000.00
         Managing Director Data Science
                                               2024
         AI Architect
                                               2024
                                                         229662.50}
In []: avg_job_salary_count = ds_data_q1.value_counts().reset_index().set_index('job_title').groupby('job_title').count().sort_val
         print('Top 5 Data Science Job Titles In Terms of Availability: ')
         print('#############")
        print(avg_job_salary_count)
        Top 5 Data Science Job Titles In Terms of Availability:
        job title
        Data Scientist
                                      917
        Data Engineer
                                      886
        Data Analyst
                                      612
        Machine Learning Engineer
                                      501
        Analytics Engineer
                                      193
        Name: count, dtype: int64
```

### Q1 Insights:

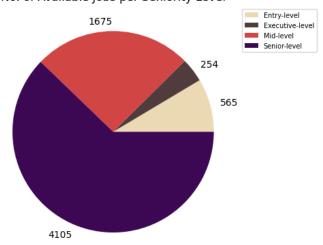
Based on the results per year analysis, jobs related to 'Al' and 'Machine Learning Scientist' are the hottest Data Science job titles in terms of the average annual salary. The top 3 among them for the year 2024 are the 'Machine Learning Scientist', 'Managing Director Data Science', and 'Al Architect'. In terms of the frequency of appearance in job boards, the top 5 job titles are Data Scientist, Data Enginee, Data Analyst, Machine Learning Engineer, and Analytics Engineer.

### Q2: Which job seniority level is most sought-after by companies?

```
In [ ]: # Subsetting ds_data for Q2: ds_data_q2
         ds_data_q2 = ds_data[['job_title','experience_level']]
         ds_data_q2.head()
                job_title experience_level
         O Data Engineer
                               Mid-level
         1 Data Engineer
                               Mid-level
         2 Data Scientist
                             Senior-level
         3 Data Scientist
                             Senior-level
         4 BI Developer
                               Mid-level
In []: # Comparison between the number of jobs available per seniority level: jobs_seniority
         jobs_seniority = ds_data_q2.groupby('experience_level')['job_title'].count()
         jobs_seniority
```

```
experience_level
        Entry-level
                            565
        Executive-level
                            254
        Mid-level
                           1675
        Senior-level
                           4105
        Name: job_title, dtype: int64
In [ ]: # Visualize the result
        jobs_seniority.plot(kind = 'pie', colors = ['#EBD9B4','#503C3C','#D24545','#3C0753'], labels = jobs_seniority)
        plt.xlabel('
        plt.ylabel('')
        plt.title('No. of Available Jobs per Seniority Level')
        plt.legend(jobs_seniority.reset_index()['experience_level'],loc='best', bbox_to_anchor=(1, 1), fontsize = 7)
```

### No. of Available Jobs per Seniority Level



### Q2 Insights

The figure shows that the number **Senior Level** positions is way higher compared to the other seniority levels from 2020 to 2024. Based on this trend, companies are more likely to look for experienced candidates in the Data Science field. Thus, **it would be a little harder for the freshers to find a Data Science job** so they should make an extra effort to stand out in the pool of professionals within this space.

### Q3: Are there chances for freelance jobs within the Data Science space?

```
In [ ]: # Subsetting ds_data for Q3: ds_data_q3
         ds_data_q3 = ds_data[['job_title','employment_type','work_year','salary_in_usd']]
         ds_data_q3.head()
                job_title employment_type work_year salary_in_usd
Out[]:
         0 Data Engineer
                                 Full-time
                                              2024
                                                         148100
         1 Data Engineer
                                 Full-time
                                              2024
                                                          98700
         2 Data Scientist
                                 Full-time
                                              2024
                                                         140032
                                 Full-time
                                              2024
                                                         100022
         3 Data Scientist
                                                         120000
           BI Developer
                                 Full-time
                                              2024
In []: emp_types_available = ds_data_q3.pivot_table(values = 'job_title', index = 'employment_type', aggfunc = 'count', columns =
         emp_types_available
Out[]:
                work_year 2020 2021 2022 2023 2024
                                                          ΑII
         employment_type
                      ΑII
                            75
                                 216
                                       1112 4625
                                                    571 6599
                 Full-time
                            69
                                 206
                                            4609
                                                    570
                                      1098
                                                         6552
                 Contract
                             3
                                   3
                                         4
                                                9
                                                      0
                                                           19
                Part-time
                             2
                                   4
                                          6
                                                3
                                                           16
                Freelance
                                                           12
```

In []: print('The freelance jobs account for ' + str(((emp\_types\_available['All'].Freelance / emp\_types\_available['All'].All) \* 10

The freelance jobs account for 0.18% of all Data Science jobs available in the dataset.

### Q3 Insights:

Compared to the other employment types, the number of companies posting freelance Data Science jobs in job boards is slim. Although, this doesn't account that there are websites for companies who are specifically looking for freelance Data Scientists such as Upwork, Fiverr, etc.

# Q4: What are the odds that I can land a remote Data Science job this year? As a foreigner, is there a chance that I can work in the US within the Data Science field remotely?

```
In []: # Subsetting ds_data for Q4: ds_data_q4
ds_data_q4 = ds_data[['job_title','work_models','work_year','employee_residence','company_location']]
ds_data_q4.head()
```

ut[]:		job_title	work_models	work_year	employee_residence	company_location
3	0	Data Engineer	Remote	2024	United States	United States
	1	Data Engineer	Remote	2024	United States	United States
	2	Data Scientist	Remote	2024	United States	United States
	3	Data Scientist	Remote	2024	United States	United States
	4	BI Developer	On-site	2024	United States	United States

```
In []: # Subsetting all remote jobs available per year: all_remote
all_remote = ds_data_q4.set_index('work_models').loc['Remote'].reset_index()

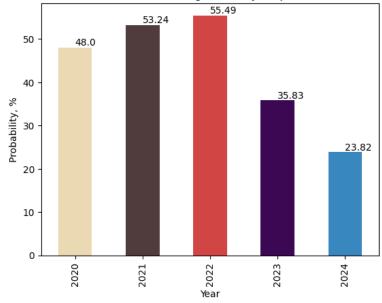
all_remote_sum = all_remote.groupby('work_year')['job_title'].count()

# Counting all jobs available per year: all_jobs
all_jobs = ds_data_q4.groupby('work_year')['job_title'].count()

# Probability of getting a remote job
prob_remote = ((all_remote_sum / all_jobs) * 100).round(2)

prob_remote.plot(kind = 'bar', color = ['#EBD9B4','#503C3C','#D24545','#3C0753','#3887BE'])
plt.xlabel('Year')
plt.ylabel('Probability, %')
plt.title('Chances of Getting Remote Jobs per Year')
for index,row in enumerate(prob_remote):
    plt.text(index,row,s = row, fontsize = 10, ha='left', va='bottom')
plt.show()
```

### Chances of Getting Remote Jobs per Year



```
In []: # Number of remote jobs available for foreigners: foreigner_remote
    foreigner_remote = all_remote[all_remote.employee_residence != all_remote.company_location]['job_title'].count()

# Portion of remote jobs available for foreigners: foreigner_remote_prop
    foreigner_remote_prop = ((foreigner_remote / all_remote_sum.sum())*100).round(2)
    print(str(foreigner_remote_prop) + '% of all remote jobs are available to foreigners.')

3.71% of all remote jobs are available to foreigners.
```

### Q4 Insights:

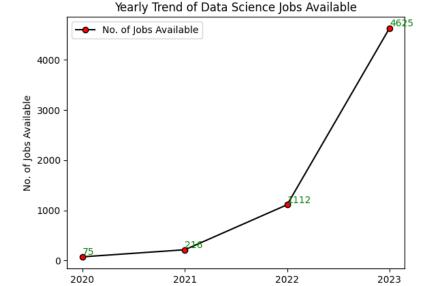
The chances of getting remote jobs vary year-by-year. From 2020 to 2022, the number of remote jobs increase but significantly dropped in 2023. Possible reason could be due to the lifting of COVID19 pandemic which urged companies to switch back to on-site work settings. Although 2024 has the least value based on the figures, it is not yet conclusive of the final probability of remote jobs this year since it is only nearly the end of its first month during this writing.

On the other hand, only 3.71% makes up the remote jobs available to foreigners based on the overall number of remote jobs posted over the last 5 years. This finding means that a very few number of international employers hire someone from different country. Thus, the competition for people who wants to work for companies from the other countries while being at their home countries is huge. Although there is a significant portion of the remote jobs, still, companies prefer more hiring workforce coming from the same country.

### Q5: Will Data Science field be saturated in the coming years?

```
In [ ]: # Subsetting ds_data for Q5: ds_data_q5
         ds_data_q5 = ds_data[['job_title','work_year']]
         ds_data_q5.head()
Out[]:
               job_title work_year
         0 Data Engineer
         1 Data Engineer
                            2024
         2 Data Scientist
                            2024
         3 Data Scientist
                            2024
            BI Developer
                            2024
In []: # Total number of jobs available per year: total_jobs_per_year
         total_jobs_per_year = ds_data_q5.pivot_table(values = 'job_title', index = 'work_year', aggfunc = 'count').reset_index()
         total_jobs_per_year = total_jobs_per_year[:4]
         total_jobs_per_year
            work_year job_title
         0
                2020
                          75
         1
                2021
                         216
         2
                2022
                         1112
```

```
In []: # Visualize yearly trend
  total_jobs_per_year.plot('work_year','job_title', marker = 'o', markerfacecolor = 'red', color = 'black')
  plt.xticks(np.arange(min(total_jobs_per_year.work_year.values), max(total_jobs_per_year.work_year.values)+1, 1))
  for index, row in total_jobs_per_year.iterrows():
      plt.text(row.work_year, row.job_title, s = row.job_title, fontsize = 10, ha='left', va='bottom', color = 'green')
  plt.xlabel('Year')
  plt.ylabel('No. of Jobs Available')
  plt.title('Yearly Trend of Data Science Jobs Available')
  plt.legend(labels = ['No. of Jobs Available'])
  plt.show()
```



Year

2023

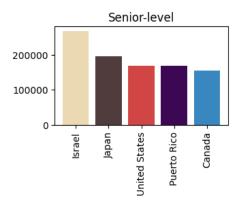
4625

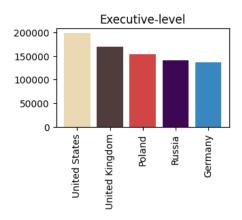
The year-by-year trend of the number of available jobs imply that a huge demand in Data Science professionals is expected in the coming years; probably, as companies shift to data-driven strategy of decision-making for their businesses. Alongside, the boom of AI and ML opportunities greatly contribute to the trend of available Data Science positions in the job market. To wrap up, the jobs available in the Data Science field is not expected to be saturated in the coming years based on the current yearly trend of data.

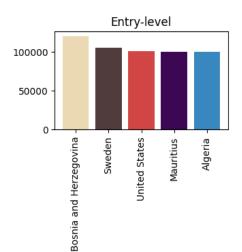
### Q6: Which country offers the highest average salary?

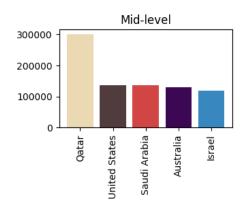
```
In [ ]: # Subsetting ds_data for Q6: ds_data_q6
                       ds_data_q6 = ds_data[['job_title','experience_level','work_year','salary_in_usd','company_location','company_size']]
                       ds_data_q6.head()
Out[]:
                                       job_title experience_level work_year salary_in_usd company_location company_size
                                                                                                                                                                      United States
                       0 Data Engineer
                                                                             Mid-level
                                                                                                             2024
                                                                                                                                         148100
                                                                                                                                                                                                                 Medium
                                                                                                                                          98700
                      1 Data Engineer
                                                                            Mid-level
                                                                                                             2024
                                                                                                                                                                      United States
                                                                                                                                                                                                                 Medium
                       2 Data Scientist
                                                                        Senior-level
                                                                                                             2024
                                                                                                                                        140032
                                                                                                                                                                      United States
                                                                                                                                                                                                                Medium
                       3 Data Scientist
                                                                        Senior-level
                                                                                                             2024
                                                                                                                                        100022
                                                                                                                                                                      United States
                                                                                                                                                                                                                 Medium
                       4 BI Developer
                                                                             Mid-level
                                                                                                             2024
                                                                                                                                        120000
                                                                                                                                                                      United States
                                                                                                                                                                                                                Medium
In [ ]: # Salaries per country: salary_per_country
                       salary_per_country = ds_data.groupby(['company_location','experience_level'])['salary_in_usd'].mean().reset_index().round(2
                       salary_per_country.columns = ['Country', 'Seniority Level', 'Mean Salary']
                       # Top 5 highest paying country in Data Science field: top_5_countries
                       seniority = salary_per_country['Seniority Level'].unique()
                       top_5_countries = []
                       for level in seniority:
                                  list_items = salary_per_country[salary_per_country['Seniority Level'] == level].head(5).reset_index(drop = True)
                                  top_5_countries.append(list_items)
                       top_5_countries = pd.concat(top_5_countries)
                       # Visualize
                       seniority_levels = top_5_countries['Seniority Level'].unique()
                       fig, ax = plt.subplots(2, 2, figsize=(8, 8))
                       for i, level in enumerate(seniority_levels):
                                  subplot = ax[(i - 1) // 2, (i - 1) % 2]
                                 data_subset = top_5_countries[top_5_countries['Seniority Level'] == level]
                                  subplot.bar(data_subset['Country'], data_subset['Mean Salary'], color=['#EBD9B4','#503C3C','#D24545','#3C0753','#3887BE
                                  subplot.title.set_text(f'{level.capitalize()}'
                                  subplot.set_xticklabels(data_subset['Country'].values, rotation=90)
                       fig.tight_layout(pad=4.0)
                       fig.suptitle('Avg. Salary per Country')
                       plt.show()
                      /var/folders/81/697km13d3bv5twb49p892q2m0000gn/T/ipykernel\_49454/3147810194.py: 28: \ UserWarning: \ set\_ticklabels() \ should \ online the substitution of the subs
                      y be used with a fixed number of ticks, i.e. after set_ticks() or using a FixedLocator. subplot.set_xticklabels(data_subset['Country'].values, rotation=90)
                       /var/folders/8l/697km13d3bv5twb49p892q2m0000gn/T/ipykernel\_49454/3147810194.py: 28: \ UserWarning: \ set\_ticklabels() \ should \ online the substitution of the subs
                      y be used with a fixed number of ticks, i.e. after set_ticks() or using a FixedLocator. subplot.set_xticklabels(data_subset['Country'].values, rotation=90)
                       /var/folders/8l/697km13d3bv5twb49p892q2m0000gn/T/ipykernel_49454/3147810194.py:28: UserWarning: set_ticklabels() should onl
                      y be used with a fixed number of ticks, i.e. after set_ticks() or using a FixedLocator. subplot.set_xticklabels(data_subset['Country'].values, rotation=90)
                       /var/folders/8l/697km13d3bv5twb49p892q2m0000gn/T/ipykernel_49454/3147810194.py:28: UserWarning: set_ticklabels() should onl
                      y be used with a fixed number of ticks, i.e. after set_ticks() or using a FixedLocator. subplot.set_xticklabels(data_subset['Country'].values, rotation=90)
```

### Avg. Salary per Country









```
In []: # Relationship between salary and company size: salary_vs_company_size
salary_vs_company_size = ds_data.groupby('company_size')['salary_in_usd'].mean().round(2).reset_index().sort_values('company salary_vs_company_size.columns = ['Company Size','Mean Salary']
salary_vs_company_size
```

```
        Out [ ]:
        Company Size
        Mean Salary

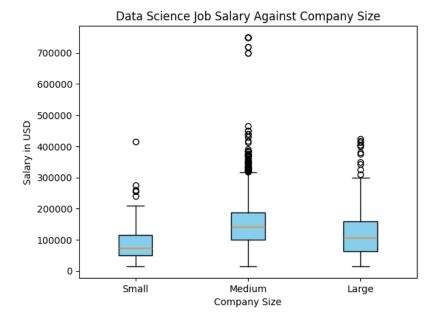
        0
        Small
        87687.46

        1
        Medium
        149659.39

        2
        Large
        120638.40
```

```
In []: # Visualize comparison
    salary_vs_company_size_bp = ds_data[['company_size', 'salary_in_usd']].sort_values('company_size', ascending = False)
    size = salary_vs_company_size_bp['company_size'].unique()
    data = []
    for s in size :
        vals = salary_vs_company_size_bp[salary_vs_company_size_bp['company_size'] == s].salary_in_usd.values
        data.append(vals)

plt.boxplot(data, labels = size, patch_artist=True, boxprops=dict(facecolor='skyblue'))
    plt.xlabel('Company Size')
    plt.ylabel('Salary in USD')
    plt.title('Data Science Job Salary Against Company Size')
    plt.show()
```



### Q6 Insights:

This analysis answers the question on which countries offer the highest Data Science job salaries. To achieve a more reliable result of analysis, the data is grouped by seniority since more experienced Data Science professionals are obviously offered the highest salaries and not every country in this dataset has equal number of data points per seniority. Based on the *Avg. Salary per Country* plot, it appears that United States is consistent to be on the top 5 highest paying countries across all seniority levels. Bosnia and Herzegovina, Qatar, Israel and the United States ranked first in Entry-, Mid-, Senior- and Executive-level seniorities, respectively.

On the other hand, it is hypothesized that the larger the company, the higher they can pay the Data Science professionals. However, the medium-sized companies offer way higher salaries than large companies based on *Avg. Data Science Salary Against Company Size*. Alongside, the number of outliers in the medium-sized companies is much higher than other company size and this could have contributed a lot to the distribution of its salaries. The maximum and minimum values and interquartile ranges of medium- and large-size companies are comparable; meaning, they most likely share similar distribution of data. To wrap up, company size was not seen to have a direct effect on the salary offered by the companies; but, medium-size companies offer much higher salaries compared to other company sizes based on this analysis.

### Q7: Do Data Science jobs salaries increase year-per-year?

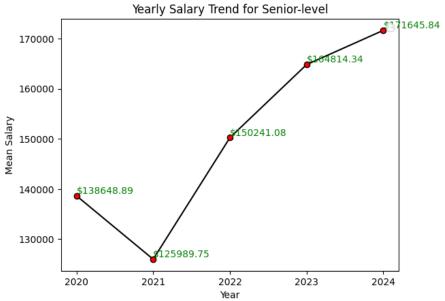
```
In [ ]: # Subsetting ds_data for Q7: ds_data_q7
          ds_data_q7 = ds_data[['job_title','work_year','experience_level','salary_in_usd']]
          ds_data_q7.head()
Out[]:
                 job_title work_year experience_level salary_in_usd
         0 Data Engineer
                                                           148100
                               2024
                                            Mid-level
          1 Data Engineer
                               2024
                                            Mid-level
                                                            98700
          2 Data Scientist
                               2024
                                         Senior-level
                                                           140032
          3 Data Scientist
                               2024
                                          Senior-level
                                                           100022
             BI Developer
                               2024
                                            Mid-level
                                                           120000
```

```
In []: # Salary against years grouped by seniority: salary_vs_year_by_seniority
seniority = ds_data_q7['experience_level'].unique()

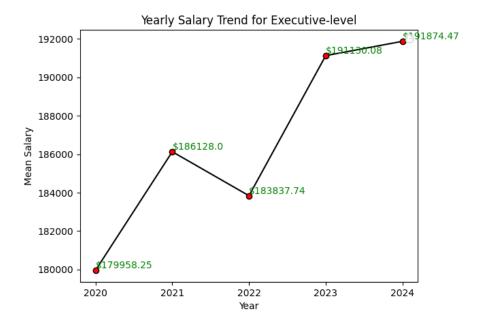
salary_vs_year_by_seniority = ds_data_q7.groupby(['experience_level','work_year'])['salary_in_usd'].mean().reset_index()
salary_vs_year_by_seniority

for index, row in enumerate(seniority):
    temp_vals = salary_vs_year_by_seniority.set_index('experience_level').loc[row]
    fig = temp_vals.plot('work_year','salary_in_usd', marker = 'o', markerfacecolor = 'red', color = 'black')
    plt.xticks(np.arange(min(temp_vals.work_year.values), max(temp_vals.work_year.values)+1, 1))
    fig.title.set_text(f'Yearly Salary Trend for {row}')
    plt.xlabel('Year')
    plt.ylabel('Mean Salary')
    plt.legend('')
    for index, row in temp_vals.iterrows():
        plt.text(row.work_year, row.salary_in_usd, s = f'${row.salary_in_usd.round(2)}', fontsize = 10, ha='left', va='bott
```









### Q7 Insights:

The Yearly Salary Trend plot tells that there is an observed increase in the average salary from year-to-year data across all seniority levels. Due to the transitioning of companies to data-driven decision-making, the demand for Data Science professionals are dramatically increasing and the opportunity for them to be paid handsomely is beyond expectations.

### Q8: Do people working on-site earn more than working remotely?

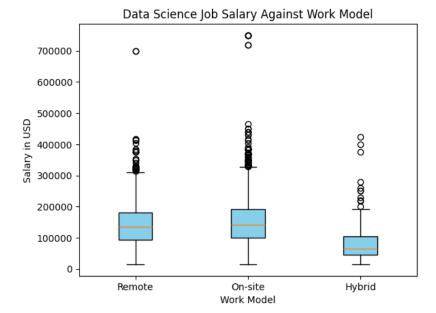
```
In [ ]: # Subsettting ds_daata for Q8: ds_data_q8
         ds_data_q8 = ds_data[['work_models','salary_in_usd']].sort_values('work_models', ascending = False)
         ds_data_q8
Out[]:
               work_models salary_in_usd
            0
                    Remote
                                 148100
         3789
                                 231000
                    Remote
         3751
                                 120096
                    Remote
         3752
                    Remote
                                 168000
         3760
                    Remote
                                  151410
           ...
         6026
                     Hybrid
                                 153000
         6379
                     Hybrid
                                 160000
         6381
                     Hybrid
                                  54094
         2167
                     Hybrid
                                  56500
         6251
                     Hybrid
                                 200000
```

6599 rows × 2 columns

```
In []: # Salary per work model: salary_per_work_model
    mdl = ds_data_q8['work_models'].unique()
    salary_per_work_model = []

for m in mdl:
        mdl_vals = ds_data_q8[ds_data_q8['work_models'] == m].salary_in_usd.values
        salary_per_work_model.append(mdl_vals)

plt.boxplot(salary_per_work_model, labels = mdl, patch_artist=True, boxprops=dict(facecolor='skyblue'))
    plt.xlabel('Work Model')
    plt.ylabel('Salary in USD')
    plt.title('Data Science Job Salary Against Work Model')
    plt.show()
```



### Q8 Insights:

Based on Data Science Job Salary Against Work Model figure, there is no observed difference between the salary given for those who work onsite versus the employees working remotely. The noteworthy result from this trend is that people who work on a hybrid setup appears to be less compensated than the other work models.

# Summary

This work has answered questions related to the opportunities in Data Science. To wrap up, the following insights have been drawn from the data analyzed:

- Jobs related to 'Al' and 'Machine Learning Scientist' are the hottest Data Science job titles in terms of the average annual salary.
- Senior Level positions is relativel higher in number compared to the other seniority levels from 2020 to 2024.
- The number of companies posting freelance Data Science jobs in job boards is very few.
- The number of remote jobs increase but significantly dropped in 2023 and only 3.71% makes up the remote jobs available to foreigners based on the overall number of remote jobs posted over the last 5 years.
- A huge demand in Data Science professionals is expected in the coming years.
- United States is consistent to be on the top 5 highest paying countries across all seniority levels. Bosnia and Herzegovina, Qatar, Israel and
  the United States ranked first in Entry-, Mid-, Senior- and Executive-level seniorities, respectively; medium-size companies offer much higher
  salaries compared to other company sizes based on this analysis.
- There is an observed increase in the average salary from year-to-year data across all seniority levels.
- There is no observed difference between the salary given for those who work on-site versus the employees working remotely and people who work on a hybrid setup appears to be less compensated than the other work models.

# References

https://www.kaggle.com/datasets/sazidthe1/data-science-salaries/data