

Way to Google Data Analysis



Python Data Analysis EDA Project

By Michael Tsai

Quick View



Demo of Project



Quick View – From Google Jobs

Google Careers

Teams

Locations

Benefits

Jobs

Students

My applications

685 jobs matched

Saved jobs

Job alert

What do you want to do?

Clear filters

Software engineering, Design, Sales

Locations

Skills & qualifications

Degree

Job types

Organizations

Turn on job alerts for your search

Sort by Relevance

Security Sales Specialist, VirusTotal, Google Cloud

Google

In-office: Atlanta, GA, USA Chicago, IL, USA Madison, WI, USA + 10 more locations

Qualifications:

- Bachelor's degree or equivalent practical experience.
- 5 years of experience in a sales role in the enterprise software or cloud space.
- 2 years of experience with clients in the enterprise cyber security or IT field.

Expand

Systems Development Engineer, United States Government, Google Cloud

Google

In-office: Reston, VA, USA

Qualifications:

- 3 years of experience in field deployment/implementation or IP network design for service providers or enterprise networks.
- Experience with troubleshooting across Linux and networking.
- Experience in automation and coding/programming in Python, Bash, or Powershell.
- US Government Top Secret/Sensitive Compartmentalized Information security clearance with polygraph.

Expand

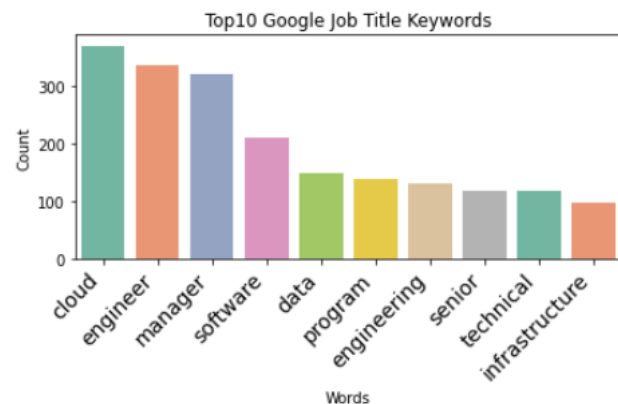
Software Engineer III, Site Reliability Engineering, Google Cloud

Google

In-office: San Bruno, CA, USA New York, NY, USA Sunnyvale, CA, USA



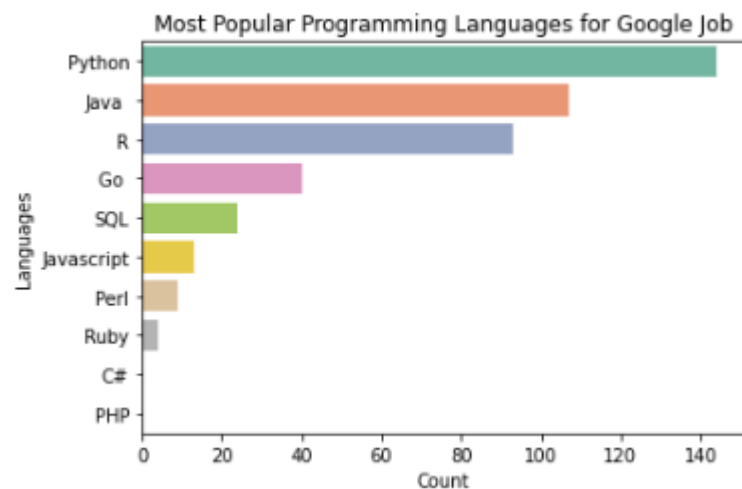
Quick View – To Jobs Analysis Dashboard



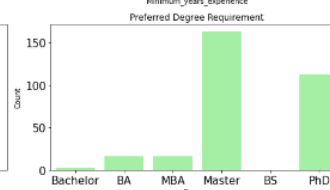
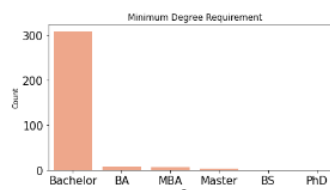
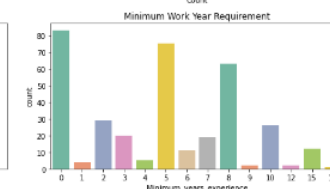
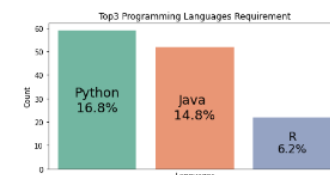
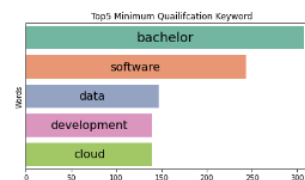
Google Cloud Jobs World Map



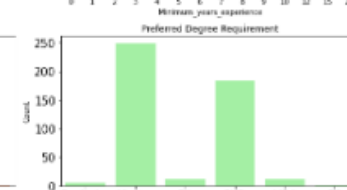
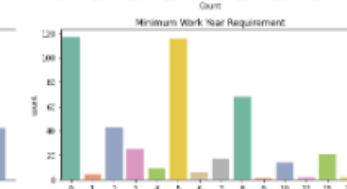
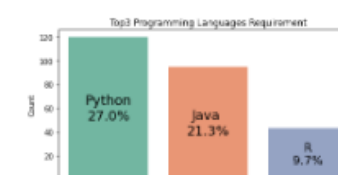
Google Engineer Jobs World Map



Google Cloud
Jobs Total Count:
352



Google Engineer
Jobs Total Count:
445



Summary



One page project summary

Way to Google!

Google Jobs Analysis Project

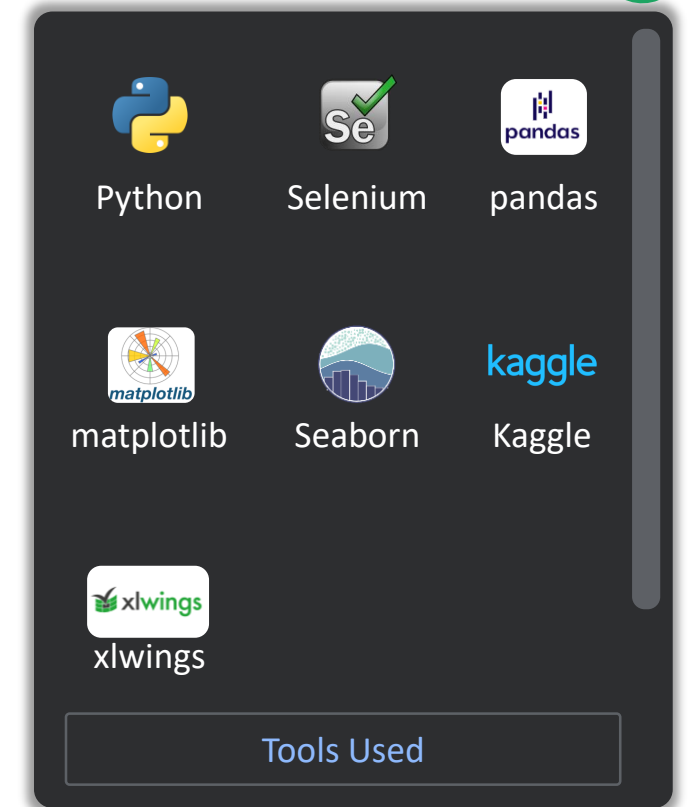
Purpose:

Google is my dream company. I believe lots of data analyst want to join Google, just like me. I wonder what will it require to work in Google.

Questions/Tasks:

- ☐ What Programming languages does Google request the most?
- ☐ What about the requirement for degrees?
- ☐ Does work experience important? If so, how many years work experience is generally required?
- ☐ What is the most popular job type in Google now?

Summary  



Skills:

- Selenium web scraping
- pandas data cleaning & processing
- matplotlib data visualization

Data Preparation



Date Cleaning & Data Processing



Data Source

Data Name: Google Jobs All Information

Source: [Google Careers Jobs](#)

Data Range: All the posts on January 21st 2023.

Data Size: 1K rows Data

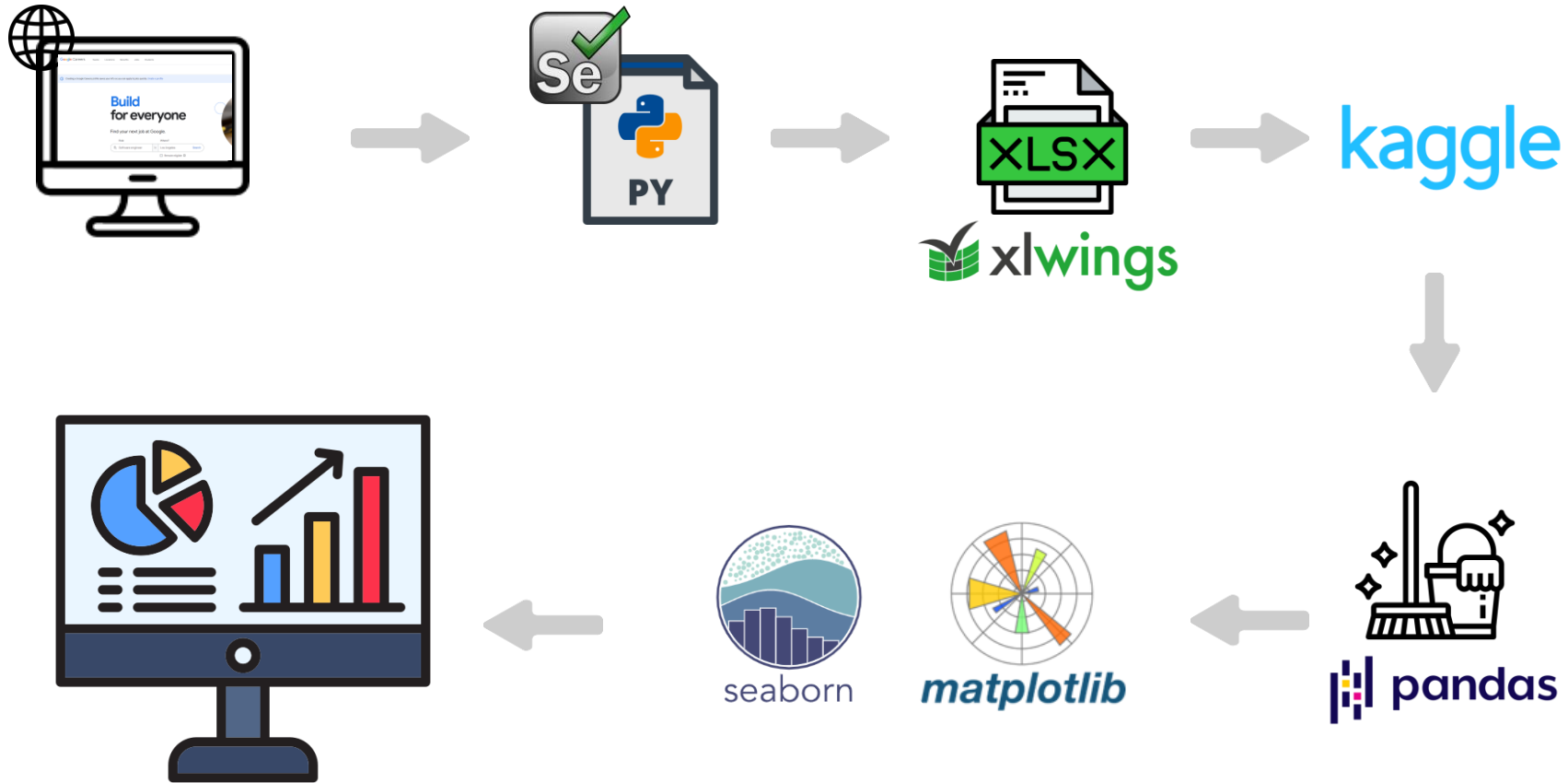
Data information:

- Company
- Job title
- Location
- Post Date
- Link
- Minimum Qualificatoin
- Preferred Qualification
- Responsibilities
- About Job

The screenshot displays the Google Careers website interface. At the top, there's a navigation bar with links for Teams, Locations, Benefits, Jobs (selected), and Students. Below this, a search bar indicates '680 jobs matched'. A left sidebar titled 'What do you want to do?' contains filter categories: Software engineering, Design, Sales; Locations; Skills & qualifications; Degree; Job types; and Organizations. The main content area shows a list of job postings. The first visible job is 'Engineering Manager, Fitbit Device Software Platform' by Google, located in Bucharest, Romania. It lists qualifications such as a Bachelor's degree in Computer Science, technical leadership experience, and software development experience. The second job is 'Partner Engineering Manager, Google Cloud' by Google, located in Amsterdam, Netherlands, requiring experience as a Technical Sales Engineer or in customer/partner-facing roles. The third job is 'Security Sales Specialist, VirusTotal, Google Cloud' by Google, with multiple locations including Atlanta, Chicago, and Madison, requiring a Bachelor's degree and 5 years of sales experience in enterprise software or cloud space. Each job listing includes 'Share' and 'Save' icons.



Data Process





Python Code - Web Scraping

Target:

Simulate user enter Google careers website, scrap the information we need save the data in XLSX.

Python Script: Link

Key Skills:

1. Create **Selenium Chrome driver** and get in to assigned url
2. Pause by **time.sleep()** to avoid crash
3. Use Selenium **find_elements()** with **X.path** to find all the job link in current page
4. Create a new tab by **Selenium executing java_script** command.
5. Find information we need by Selenium find_elements() with X.path and add into dataframe
6. Use Xlwings to create XLSX file, write data in it and save it.

```
wb = xw.Book()
sheet = wb.sheets[0]
sheet.range("A1").value = ['Title', 'Company', 'Remote Eligible', 'Location', 'Preferred qualifications', 'Responsibilities', 'About']

chrome_options = webdriver.ChromeOptions()
browser = webdriver.Chrome(options=chrome_options)
scrape(URL, browser, sheet)
wb.save(filename)

6.

def scrape(ini_url, browser, sheet):
    count_pages = 1
    while count_pages <= PAGE:
        url_page = ini_url.replace("page=1", f"page={count_pages}")
        job_links = []
        get_job_link(url_page, browser, job_links, sheet)
        count_pages += 1

def get_job_link(url_page, browser, job_links, sheet):
    global total
    browser.get(url_page)
    time.sleep(2)
    total_pages = browser.find_element(By.XPATH, "//p[@class='gc-h-flex gc-sidebar__"]
    print(f"Progress: {total_pages}")
    print(".....Scraping.....")
    job_box = browser.find_elements(By.XPATH, '//ol[@id="search-results"]/li/div[@c]
    for job in job_box:
        link = job.get_attribute("href")
        job_links.append(link)
    parse_jobs(browser, job_links, sheet)

def parse_jobs(browser, job_links, sheet):
    i = 0
    for link in job_links:
        browser.execute_script(f"window.open('{link}', 'new_window')")
        browser.switch_to.window(browser.window_handles[1])
        time.sleep(3)
```



Python Code – Data Cleaning

- Target: Simulate user enter Google careers website, scrap the information we need save the data in XLSX.

- Full Python Script on [Kaggle](#): Link

- Key Skills:

1. With **`str.contains()`** and **`re.findall()`**, I can Identify and drop NA, incorrect and space only data.
2. Organize the string into correct format by using **`column.apply(lambda...)`**
3. Extract the data (ex: country, keyword) we need from strings by using **`word_tokenize`**, **`nlk.stopwords`**, **`country_converter`**...etc through **`.apply(lambda...)`**

1.

```
Check if any NA in the datasets

pd.isnull(df).sum()

Title      0
Company    0
Location   0
Update_Time 0
Minimum_Qualifications 0
Preferred_Qualifications 1
Responsibilities 0
About_Job  0
Link       0
dtype: int64

But, is it really only 1 null data? Let's check if there're still

import re
df = df.replace(r'^\s+$', np.nan, regex=True)
pd.isnull(df).sum()

Title      0
Company    0
Location   0
Update_Time 0
Minimum_Qualifications 0
Preferred_Qualifications 0
Responsibilities 0
About_Job  0
Link       0
dtype: int64
```

2.

```
def string_manipulation(text):
    text = str(text).replace("\t", "").replace("\n", "").replace("\r", "").replace(";", " ").replace(":", " ")
    return text

df["Location"] = df.Location.apply(lambda x : string_manipulation(x))
df["Update_Time"] = df.Update_Time.apply(lambda x : x[:10])
df["Update_Time"] = pd.to_datetime(df["Update_Time"])
df["Minimum_Qualifications"] = df.Minimum_Qualifications.apply(lambda x : string_manipulation(x))
df["Preferred_Qualifications"] = df.Preferred_Qualifications.apply(lambda x : string_manipulation(x))
df["Responsibilities"] = df.Responsibilities.apply(lambda x : string_manipulation(x))
df.head()
```

3.

```
from nltk.corpus import stopwords
from nltk.tokenize import word_tokenize

stop_words = set(stopwords.words('english'))
exclude_list = ["years", "experience", "degree", "equivalent", "practical", "technical", "role"]

df['Responsibilities'] = df.Responsibilities.apply(lambda x: word_tokenize(x))
df['Responsibilities'] = df.Responsibilities.apply(lambda x: [w for w in x if w not in stop_words])
df['Responsibilities'] = df.Responsibilities.apply(lambda x: ' '.join(x))

df['Minimum_Qualifications'] = df.Minimum_Qualifications.apply(lambda x: word_tokenize(x))
df['Minimum_Qualifications'] = df.Minimum_Qualifications.apply(lambda x: [w for w in x if w not in stop_words and w.lower() not in exclude_list])
df['Minimum_Qualifications'] = df.Minimum_Qualifications.apply(lambda x: ' '.join(x))

df['Preferred_Qualifications'] = df.Preferred_Qualifications.apply(lambda x: word_tokenize(x))
df['Preferred_Qualifications'] = df.Preferred_Qualifications.apply(lambda x: [w for w in x if w not in stop_words])
df['Preferred_Qualifications'] = df.Preferred_Qualifications.apply(lambda x: ' '.join(x))
df.head()
```



Python Code – Data Analysis and Visualization (1/3)

Target: Analyze the data and visualize the insight

Full Analysis Process on Kaggle: [Link](#)

Key Skills:

1. Using **Counter()** from collections module to count **the keyword appearance** from mass data for further analysis, such as degrees, programming languages, title keyword...
2. Using **df.merge()** to join related table and showing chart with **plt.subplots()** for easy compare.
3. Using **Seaborn** module to generate more recognizable and visually appealing charts
4. Using **plotly.choroplethplot()** to generate geo map.
5. Defining a **huge function** to allow user to generate a **dashboard** based on the assigned position keyword, which will contain all the statistical data related to the job.

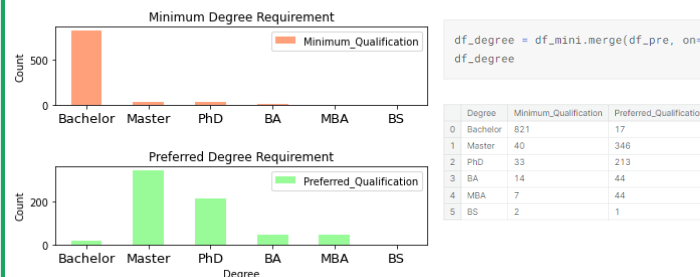
1.

```
programming_languages = ['Python', 'Java ', 'C#', 'PHP', 'Javascript', 'Ruby', 'Perl', 'SQL', 'Go ', 'R']
languages = {}
for pl in programming_languages:
    count = df['Minimum_Qualifications'].str.contains(pl).sum()
    languages[pl] = count
languages = sorted(languages.items(), key=lambda x: x[1], reverse=True)
print(languages)
```

```
[('Python', 144), ('Java ', 107), ('R', 93), ('Go ', 40), ('SQL', 24), ('Javascript', 13), ('Perl', 9), ('Ruby', 4), ('C#', 0), ('PHP', 0)]
```

2.

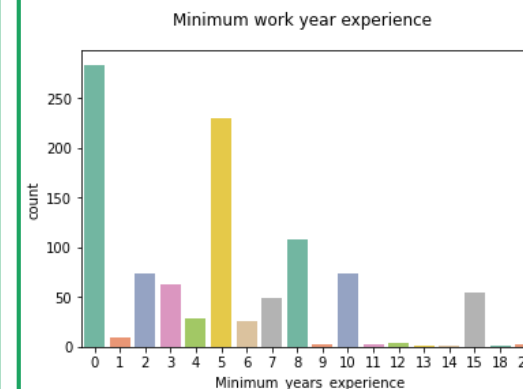
```
fig, axes = plt.subplots(2,1)
df_degree.plot.bar(x="Degree", y="Minimum_Qualification", ax=axes[0], color="lightsalmon", rot=0)
df_degree.plot.bar(x="Degree", y="Preferred_Qualification", ax=axes[1], color="palegreen", rot=0)
axes[0].title.set_text("Minimum Degree Requirement")
axes[0].set_ylabel("Count")
axes[0].set_xlabel(" ")
axes[0].tick_params(axis='x', labelsize=13)
axes[1].title.set_text("Preferred Degree Requirement")
axes[1].set_ylabel("Count")
axes[1].tick_params(axis='x', labelsize=13)
fig.tight_layout()
```



3.

```
import seaborn as sns
sns.countplot(x=df["Minimum_years_experience"], palette="Set2")
plt.suptitle('Minimum work year experience')
```

Text(0.5, 0.98, 'Minimum work year experience')





Python Code – Data Analysis and Visualization (2/3)

Target: Analyze the data and visualize the insight

Full Analysis Process on Kaggle: [Link](#)

Key Skills:

1. Counting the keyword occurrence from mass data for further analysis, such as degrees, programming languages...
2. Using `df.merge()` to join related table and showing chart with `plt.subplots()` for easy compare.
3. Using **Seaborn** module to generate more recognizable and visually appealing charts
4. Using `plotly.choroplethplotl()` to generate geo map to display job allocation.
5. Defining a **huge function** to allow user to **generate a dashboard in one picture** based on the assigned position keyword, which will contain all the statistical data related to the job.

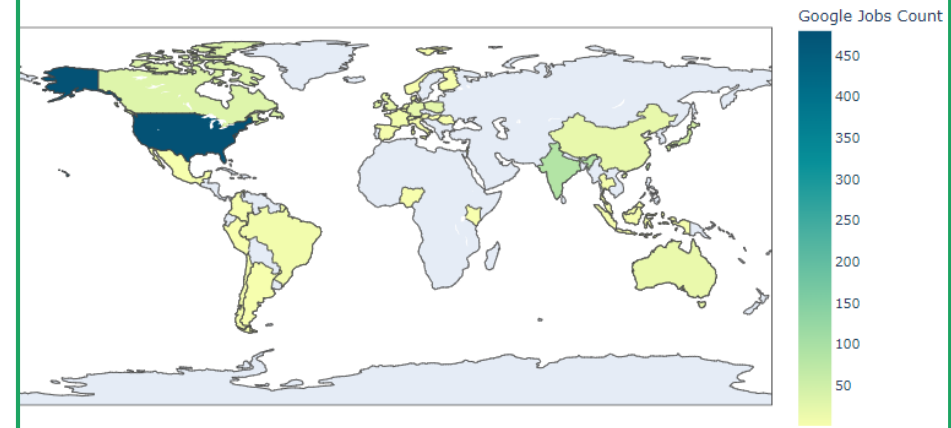
4.

```
import plotly.express as px
database = px.data.gapminder().query('year == 2007')
df_country_list = pd.merge(database, df_country, how='inner', on='country')
url = (
    "https://raw.githubusercontent.com/python-visualization/folium/master/examples/data"
)

fig = px.choropleth(df_country_list,
                    locations="country", # "iso_alpha",
                    locationmode="country names", # "ISO-3",
                    geojson = f"{url}/world-countries.json",
                    color="count",
                    color_continuous_scale="Bluy1",
                    labels={'count': 'Google Jobs Count'},
                    title=f"Google Jobs World Map",
)

fig.update_layout(
    autosize=False,
    width=850,
    height=500,
    margin={"r":0, "t":50, "l":0, "b":50, "pad": 4})
fig.show()
```

Google Jobs World Map





Python Code – Data Analysis and Visualization (3/3)

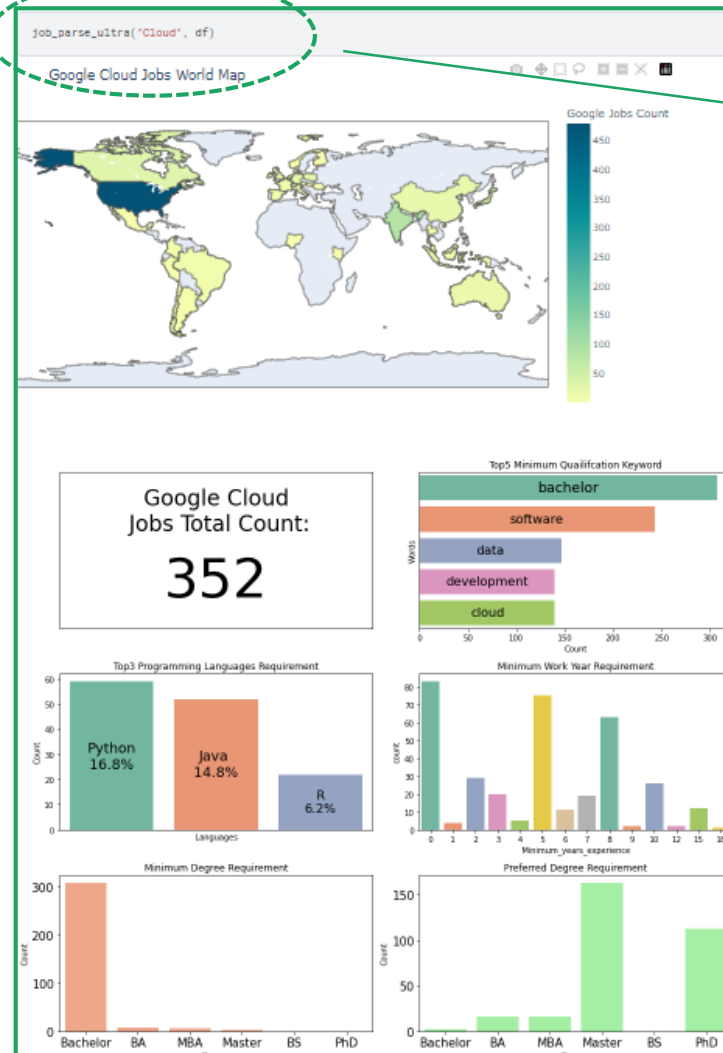
Target: Analyze the data and visualize the insight

Full Analysis Process on Kaggle: [Link](#)

Key Skills:

1. Counting the keyword occurrence from mass data for further analysis, such as degrees, programming languages...
2. Using `df.merge()` to join related table and showing chart with `plt.subplots()` for easy compare.
3. Using **Seaborn** module to generate more recognizable and visually appealing charts
4. Using `plotly.choroplethplotl()` to generate geo map to display job allocation.
5. Defining a **huge function** to allow user to **generate a dashboard in one picture** based on the assigned position keyword, which will contain all the statistical data related to the job.

5.



```
job_parse_ultra("Cloud", df)
```

Insight



Insight Finding during EDA



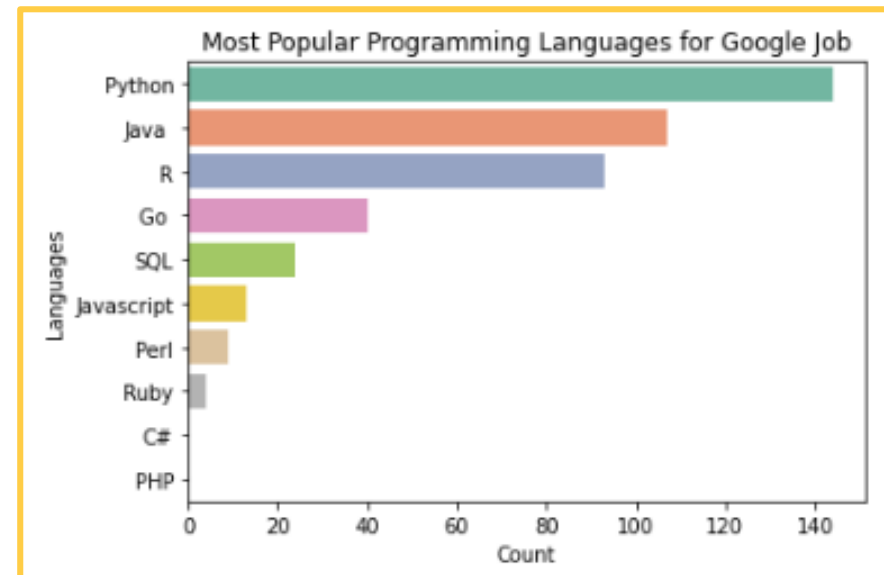
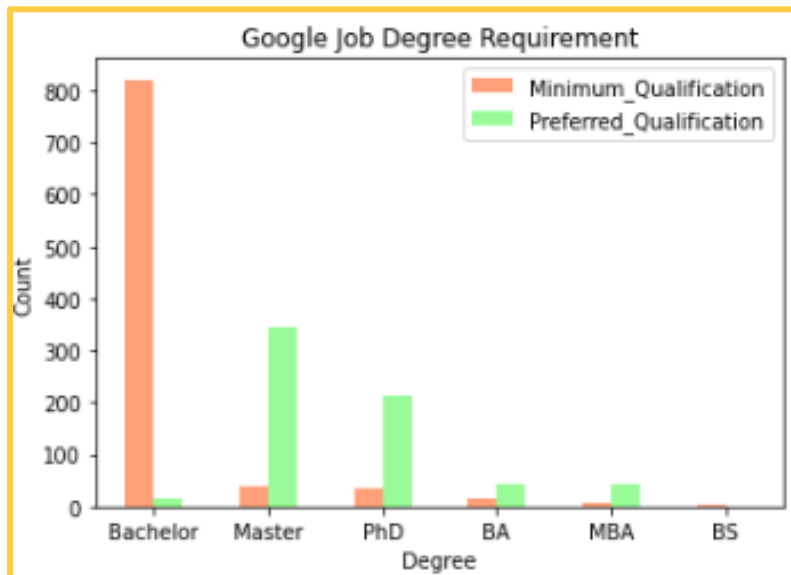
Insight 1 – Degree & Programming Languages

Degree Requirement:

You need **at least bachelor degree** to get in Google. **Master and MBA** make you **more competitive** than other candidates.

Programming Languages Requirement:

Python, Java, and **R** programming languages are the 3 most popular programming. Furthermore, the popularity of these 3 programming languages are significantly ahead of many other languages.

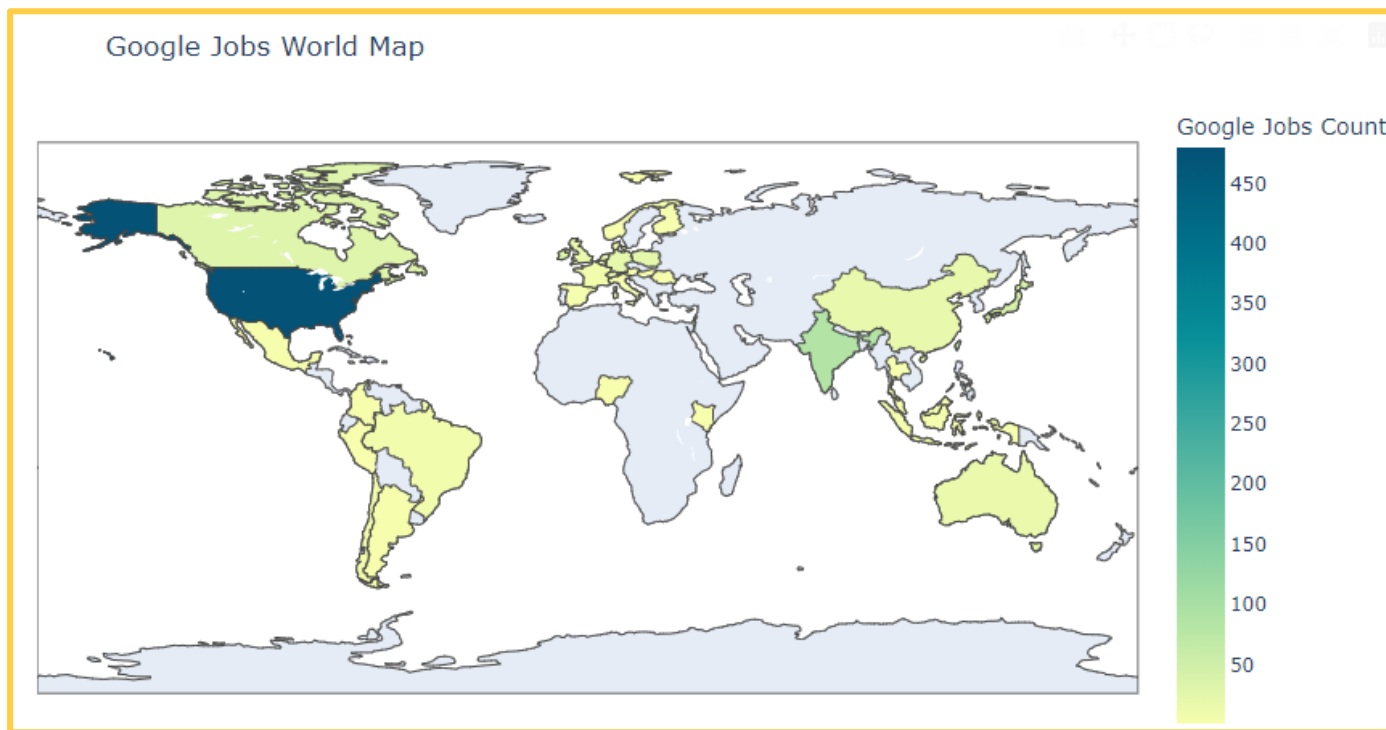




Insight 2 – Recruiting Location

In Google's global recruitment, **the United States stands out significantly** from other countries.

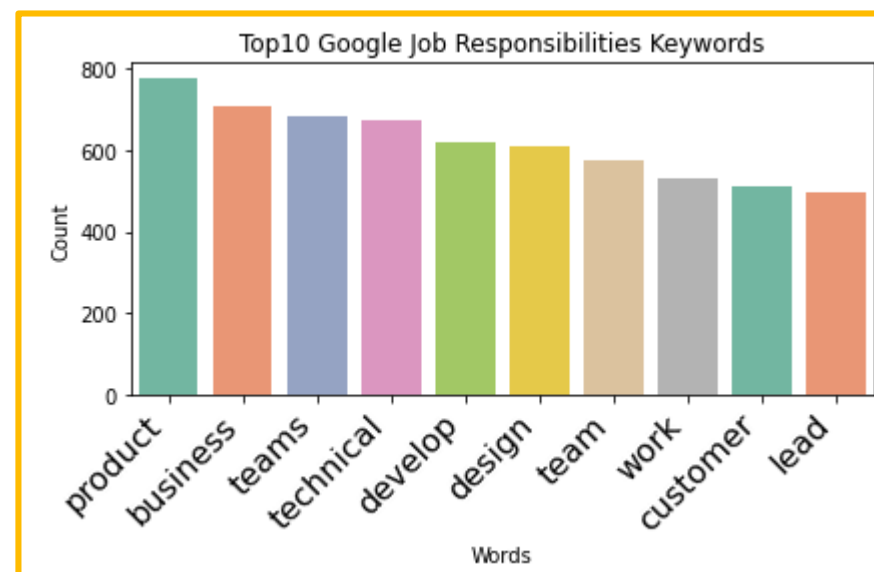
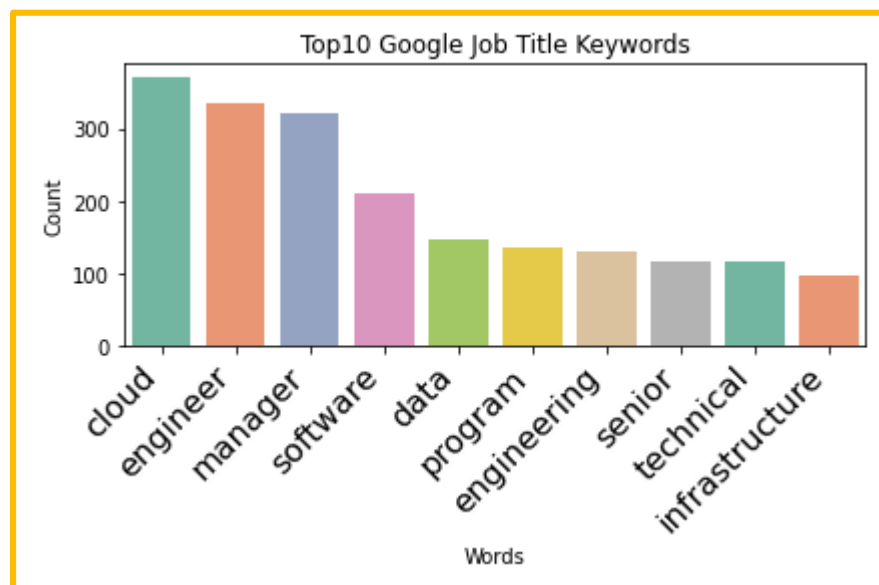
On top of that, **50% of the top 10 recruiting countries are in Asia**, which shows that Google also place a strong emphasis on the talent market in Asia, particularly in India, Taiwan, and Japan.





Insight 3 – Interest Fact

An interesting finding, despite most of the top 10 Google job opening title keywords are related to technical field, the top 10 responsibilities keywords are mostly related to leadership and teamwork. This shows **equipping technical skills alone is not enough to excel the job at Google**. Soft skills such as **communication, teamwork and business awareness** are also **required**.



Conclusion



Answer for Questions/Tasks:

- ❑ What Programming languages does Google request the most?
 - ✓ **Python** , **Java** and **R** are three popular programming languages for Google Jobs
- ❑ What about the requirement for degrees?
 - ✓ You need at least **bachelor degree** to get in Google. **Master and MBA** make you more competitive than other candidates.
- ❑ Does work experience important? If so, how many years work experience is generally required?
 - ✓ Most of the jobs did not mentioned work experience. Other than this, most of the works require **5 years work experience**
- ❑ What is the most popular job type in Google now?
 - ✓ By searching title keyword, Google have the highest talent demand in **Cloud related field**.

Recommendation



- If you are planning to learn a programming language before deciding on a career direction, **learning Python** will increase your chances of meeting the requirements for Google job openings.
- If you are looking for the country/location with the most job openings, you can refer **to the United States and Asia** as they are the places where Google have the **highest talent demand**.
- Although demonstrating technical skills is important in a resume, **Google also values teamwork and communication skills**. Therefore, do not forget to show these skills as well.

Google



Thank You!



Michael Tsai



Michael Tsai



Michael Tsai



Michael Tsai



h94xup6