## **INFO 6210 Project JOBS DATABASE**

Ву

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## **ABSTRACT**

In this project we will contribute to building a jobs database using mysql and python with proper documentation. We will each focus on job domain Software Engineering and Data Science. The database is focused around an employer like a company and research lab

## **PROJECT**

You have been given the beginnings of a jobs database but the previous developer was let go because the organization of the previous project is a mess. The developers all worked independently and the tables and schemas didn't match. There are some working scripts but they sometimes replicate and some are missing. Some scripts have bugs and may be in python 2.7. Data is in .csv, json, sqlite and mysql Your job is to salvage what data, schemas and scripts that you can and add what is missing.

Everything must be done in mysql using the InnoDB engine. All python scripst must be in python 3 or above and using Google Python Style Guide

## **Tasks**

- · Build the list of companies in some domain.
- Web scrape the data for each of the companies for job details.
- Automate the scraping.
- Get additional relevant data from sites like Glassdoor, LinkedIn (one per person)
- Get data from social media sites Twitter, YouTube, Instagram, Steam, Twitter, etc.. (One per person)
- · Tag the social media posts, including synonyms for the tags
- · Clean and integrate data.
- Build an ER diagram and model the db.
- · Build the dB schema and insert the data
- · Generate use cases.
- Optimize the database.
- Properly document that database
- Professionalism (Licensing, code style, file naming, README. Etc.)

## 2. Web scrape the data for each of the companies for job details

```
import numpy as np
            import pandas as pd
            import seaborn as sns
            import requests
            from bs4 import BeautifulSoup

    def indeed jobs scrapper(url):

In [8]:
                r = requests.get(url)
                soup = BeautifulSoup(r.text, 'html.parser')
                return soup
            soup = indeed_jobs_scrapper("https://www.indeed.com/jobs?q=data+scientist&l=\"
In [9]:

    def scrape_jobtitle(soup):

                jobs = []
                for div in soup.find_all(name="div", attrs={"class":"row"}):
                    for a in div.find_all(name="a", attrs={"data-tn-element":"jobTitle"})
                        jobs.append(a["title"])
                return(jobs)
            scrape jobtitle(soup)
   Out[9]: ['Data Scientist',
             'Data Scientist',
             'Data Scientist, Office of Data Science',
             'Data Scientist',
             'Principal Data Scientist',
             'Actuarial Services + Data Science Intern',
             'Data Scientist / Data Analytics',
             'Data Scientist/Machine Learning Engineer',
             'Data Scientist Entry Level - Pathrise Recruiting Partners',
             'Data Scientist',
             'Data Scientist Analyst',
             'Data Scientist',
             'Data Scientist - 68924BR',
             'Content Data Scientist',
             'Data Scientist',
             'Jr. Data Scientist',
             'Junior Data Scientist',
             'Analyst II, Data Science',
             'Data Scientist, Medical Diagnostics']
```

```
In [10]:

    def extract_company_from_result(soup):

                  companies = []
                  for div in soup.find all(name="div", attrs={"class":"row"}):
                      company = div.find all(name="span", attrs={"class":"company"})
                      if len(company) > 0:
                          for b in company:
                              companies.append(b.text.strip())
                      else:
                          sec try = div.find all(name="span", attrs={"class": "result-link-
                          for span in sec try:
                              companies.append(span.text.strip())
                  return(companies)
              extract company from result(soup)
    Out[10]: ['Triplebyte',
               'ClearOne Advantage',
               'Liberty Mutual Insurance',
               'Seen by Indeed',
               'Intuit',
               'Commonwealth Care Alliance, Inc.',
               'Tredence Inc.',
               'Mobile Insights',
               'Pathrise',
               'Conrelv Solutions Inc',
               'LOCKHEED MARTIN CORPORATION',
               'TISAA',
               'AETNA',
               'Buxton',
               'Foundation Medicine, Inc.',
               'Numero Data LLC',
               '1-800-Flowers',
               'Liberty Mutual Insurance',
               'Specific Diagnostics']
In [11]:
             def extract location from result(soup):
                  locations = []
                  spans = soup.findAll("span", attrs={"class": "location"})
                  for span in spans:
                      locations.append(span.text)
                  return(locations)
             extract location from result(soup)
    Out[11]: ['New York, NY',
               'Remote',
               'Boston, MA',
               'Sunnyvale, CA 94089 (Lakewood area)',
               'Seattle, WA',
               'Wellesley, MA 02481',
               'Seattle, WA',
               'Boston, MA 02210 (South Boston area)',
               'Herndon, VA 20170',
               'New York, NY 10013 (Tribeca area)']
```

```
In [12]:
             def extract_salary_from_result(soup):
                  salaries = []
                  for div in soup.find_all(name="div", attrs={"class":"row"}):
                          salaries.append(div.find("nobr").text)
                      except:
                          try:
                              div two = div.find(name="div", attrs={"class":"salarySnippet"
                              salaries.append(div_two.text.strip())
                          except:
                              salaries.append("Not Posted")
                  return(salaries)
             extract salary from result(soup)
   Out[12]: ['$150,000 - $225,000 a year',
               '$70,000 - $80,000 a year',
               '$93,400 - $134,100 a year',
               'Not Posted',
               'Not Posted',
               'Not Posted',
               '$100,000 - $130,000 a year',
               '$85,000 - $115,000 a year',
               'Not Posted',
               '$70,000 - $85,000 a year',
               'Not Posted',
               '$89,700 - $148,800 a year',
               'Not Posted']
```

'We want to see a passion for machine-learning and research.\nBuild pre dictive models and machine-learning algorithms.\nCombine models through ensemble modeling.',

'Demonstrated experience in deep learning, computer vision, natural lan guage processing, and/or interpretable machine learning.',

'With one application you can be considered for thousands of tech roles from leading companies on Seen. Seen by Indeed is a free service that co nnects you to...',

'Intuit's Innovation and Advanced Technology Group is hiring a Data Scientist to focus on Security and Anti-fraud.',

'Use programming and mathematical tools to solve important problems.\nE xperience with Python, git, SQL, healthcare data.',

'Data analytics: 3 years (Preferred).\nLead and manage independently the onsite-offshore relation, at the same time adding value to the clien t.',

'Develop machine learning applications according to requirements.\nRun machine learning tests and experiments.\nFamiliarity with machine learning frameworks (like...',

'0-3 years in data science.\nIn these positions you will be asked to ma nipulate and utilize data in order to inform key business decisions and model various...',

'They will be creating models to use machine learning to identify that customer, then using that info to do outreach to customer by contact and marketing towards...',

'Work on datasets with applied statistics and machine learning algorith ms; Use exploratory data analysis techniques to identify meaningful relationships,...',

'Content Data Scientist This is true data scientist who will be working on content efficiency modelling, taste personas, content acquisition, fo recast, Avod...',

'Demonstrates proficiency in several areas of data modeling, machine le arning algorithms, statistical analysis, data engineering and data visua lization.',

'Content Data Scientist - This is true data scientist who will be working on content efficiency modelling, taste personas, content acquisition, forecast, Avod...',

'Your focus will be on clinical use cases, such as biomarker-based outcomes analyses, examining correlates of genomics and clinical outcomes, c linical utility of...',

'Ability to break down and understand complex business problems, define a solution and implement it using advanced quantitative methods.',

'As Junior Data Scientist, you will be responsible for collecting, clea ning, and extracting data from a variety of systems at 1-800-flowers with intention to run...',

'The position requires a Master's degree, or foreign equivalent, in Sta

tistics, Mathematics, Economics, or another scientific field plus one (1) year of...',

'Used for bloodstream infection Specific's solution provides results 2 days sooner than existing methods, saving patients suffering from drug-resistant infection...']

## **Automating the scrapping of Indeed**

```
In [14]:
         | roles list = ["data+scientist", "game+designer", "software+engineer"]
             url = "https://www.indeed.com/jobs?q="
             columns = ["job_title", "company_name", "location", "summary", "salary"]
             df = pd.DataFrame(columns = columns)
             for role in roles list:
                 first = 0
                 while first <= 1000:
                     if first == 0:
                          req url = url + role + "&l=United+States"
                          first = 10
                     else:
                          req url = url + role + "&l=United+States" + "&start=" + str(first
                          first = first + 10
                      soup = indeed jobs scrapper(req url)
                      for div in soup.find_all(name="div", attrs={"class":"row"}):
                          num = (len(df) + 1)
                          jobs post = []
                          #grabbing title
                          for a in div.find_all(name="a", attrs={"data-tn-element":"jobTit]
                              jobs post.append(a["title"])
                          #grabbing company
                          company = div.find_all(name="span", attrs={"class":"company"})
                          if len(company) > 0:
                              for b in company:
                                  jobs post.append(b.text.strip())
                          else:
                              sec try = div.find all(name="span", attrs={"class": "result-]
                              for span in sec try:
                                  jobs_post.append(span.text.strip())
                          #grabbing location name
                          spans = div.findAll("div", attrs={"class": "location"})
                          if len(spans) == 0:
                              jobs post.append("Anywhere")
                          else:
                              jobs post.append(spans[0].text)
                          #grabbing summary text
                          spans = div.findAll("div", attrs={"class": "summary"})
                          for span in spans:
                              jobs post.append(span.text.strip())
                          #grabbing salary
                          try:
                              jobs post.append(div.find("nobr").text)
                          except:
                              try:
                                  div_two = div.find(name="div", attrs={"class":"salarySnip")
                                  jobs post.append(div two.text.strip())
```

['Data Scientist', 'Triplebyte', 'Remote', "You'll report directly to Tr iplebytes' Head of Machine Learning and will work alongside a team of 6-8 machine learning engineers and data scientists.", '\$150,000 - \$225,000 a year'] ['Data Scientist, Medical Diagnostics', 'Specific Diagnostics', 'Mountai n View, CA 94043', 'Used for bloodstream infection Specific's solution p rovides results 2 days sooner than existing methods, saving patients suf fering from drug-resistant infection...', 'Not Posted'] ['Data Scientist', 'ClearOne Advantage', 'Baltimore, MD 21224 (Canton In dustrial Area area)', 'We want to see a passion for machine-learning and research.\nBuild predictive models and machine-learning algorithms.\nCom bine models through ensemble modeling.', '\$70,000 - \$80,000 a year'] ['Analyst II, Data Science', 'Liberty Mutual Insurance', 'Boston, MA 021 01', 'The position requires a Master's degree, or foreign equivalent, in Statistics, Mathematics, Economics, or another scientific field plus one (1) year of...', '\$89,700 - \$148,800 a year'] ['Data Scientist/Machine Learning Engineer', 'Mobile Insights', 'Anywher e', 'Develop machine learning applications according to requirements.\nR

un machine learning tests and experiments.\nFamiliarity with machine lea

### In [15]: ► df.head()

#### Out[15]:

	job_title	company_name	location	summary	salary
1	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year
2	Data Scientist, Medical Diagnostics	Specific Diagnostics	Mountain View, CA 94043	Used for bloodstream infection Specific's solu	Not Posted
3	Data Scientist	ClearOne Advantage	Baltimore, MD 21224 (Canton Industrial Area area)	We want to see a passion for machine-learning	70, 000–80,000 a year
4	Analyst II, Data Science	Liberty Mutual Insurance	Boston, MA 02101	The position requires a Master's degree, or fo	89, 700-148,800 a year
5	Data Scientist/Machine Learning Engineer	Mobile Insights	Anywhere	Develop machine learning applications accordin	85, 000-115,000 a year

## Creating an excel sheet of jobs

```
df.to csv("./data/jobs.csv",encoding="utf-8",index=False)
In [212]:
              unique companies = set()
In [16]:
              for i in df['company name'].tolist():
                  unique_companies.add(i)
              unique companies
    Out[16]: {'University of Pennsylvania Health System',
               'The Oakleaf Group',
               'LOGIXTech Solutions',
               '2U',
               'SelectMinds',
               'Ameriprise Financial',
               'BTMG USA',
               'Animus Studios',
               'Age of Learning',
               'Alt Shift USA',
               'Tuvli, LLC',
               'IT Synergy',
               'Open Clinica',
               'Parametric',
               'The Ash Group',
               'bellevue university',
               'Affirmed Networks Inc.',
               'Navitus Health Solutions / Lumicera Health Service...',
                'Quantum Mechanix',
              # importing libraries required for downloading data
In [167]:
              import tweepy
              import twitter
              # keys for accesing twitter api
              consumerKey = 'AChFuchA4E4ywFLw02TY5vDHF'
              consumerSecret = 'ZhsHMVkC8UnVb6xs1fI9Y1vubjFk58kptUWNIWoAbyi7F6LtGz'
              ACCESS_TOKEN = '2483851159-GOBy7a31beVCmRvaAMcDF2M70AjReBJfCdVxGux'
              ACCESS_SECRET = 'V5LERc12DKFcI0nNHPlrSGzs19Lq8Z6GJf8TXyW02mn1m'
              auth = tweepy.OAuthHandler(consumer key=consumerKey, consumer secret=consumer
              #Connect to the Twitter API using the authentication
              api = tweepy.API(auth)
```

## Youtube Api set up

Out[19]: googleapiclient.discovery.Resource

## Accessing video search api

```
In [20]:
         # for company in unique companies:
             req = youtube.search().list(q="slalom build careers",part="snippet", type="vi
             items = req.execute()['items']
             items[0]
   Out[20]: {'kind': 'youtube#searchResult',
               'etag': '"nxOHAKTVB7baOKsQgTtJIyGxcs8/S9LlTo9MHP7aVTnazZ-2zhegWvc"',
              'id': {'kind': 'youtube#video', 'videoId': 'ON7h1AFAm3c'},
               'snippet': {'publishedAt': '2015-02-16T22:59:14.000Z',
               'channelId': 'UCfZs5rUpJk3KuISZkEBU1qg',
               'title': 'Slalom Boston',
               'description': "Slalom Boston's office is growing like gangbusters. Combi
             ning the best local talent with an energetic market and innovative clients,
             Slalom Boston is a great ...",
               'thumbnails': {'default': {'url': 'https://i.ytimg.com/vi/ON7h1AFAm3c/def
             ault.jpg',
                  'width': 120,
                 'height': 90},
                'medium': {'url': 'https://i.ytimg.com/vi/ON7h1AFAm3c/mqdefault.jpg',
                 'width': 320,
                 'height': 180},
                'high': {'url': 'https://i.ytimg.com/vi/ON7h1AFAm3c/hqdefault.jpg',
                  'width': 480,
                 'height': 360}},
               'channelTitle': 'Slalom',
               'liveBroadcastContent': 'none'}}
```

## Accessing video stats api

```
In [21]: M reqStats = youtube.videos().list(part="statistics",id="ON7h1AFAm3c")
    reqStats.execute()

Out[21]: {'kind': 'youtube#videoListResponse',
    'etag': '"nxOHAKTVB7baOKsQgTtJIyGxcs8/BAqpPz3yxJF8uYw_uRNqkqk_Aog"',
    'pageInfo': {'totalResults': 1, 'resultsPerPage': 1},
    'items': [{'kind': 'youtube#video',
        'etag': '"nxOHAKTVB7baOKsQgTtJIyGxcs8/JG3D6WTKBNFnoEzqQ7hYWAnRCc0"',
        'id': 'ON7h1AFAm3c',
        'statistics': {'viewCount': '994',
        'likeCount': '6',
        'dislikeCount': '0',
        'favoriteCount': '0',
        'commentCount': '0'}}]}
```

## Automating the youtube search process

```
In [210]:
              # data frame for youtube videos
              columns = ["videoId", "channelId", "title", "description", "viewCount", "like(
              youtube df = pd.DataFrame(columns=columns)
              # dictionary to create a dataFrame for youtube channels data
              channelsData = {"channelId": [], "channelTitle": []}
              # list of unique channels
              channels = []
              for company in list(unique_companies)[0:20]:
                  req = youtube.search().list(q= company +" careers",part="snippet", type="
                  items = req.execute()['items']
                  for item in items:
                      # index to append data to dataFrame
                      index = len(youtube df)+1
                      # list to keep all data regarding youtube video
                      video data = []
                      video_data.append(item["id"]["videoId"])
                      video data.append(item["snippet"]["channelId"])
                      # if channel not in list add it and in dict
                      channel = item["snippet"]["channelId"]
                      if channel not in channels:
                          channels.append(channel)
                          channelsData["channelId"].append(channel)
                          channelsData["channelTitle"].append(item["snippet"]["channelTitle"]
                      video data.append(item["snippet"]["title"])
                      video data.append(item["snippet"]["description"])
                      # req api for this video's statistics on youtube
                      reqStats = youtube.videos().list(part="statistics",id="ON7h1AFAm3c")
                      video stats = regStats.execute()["items"][0]
                      # add statistics data to list
                      video_data.append(video_stats["statistics"]["viewCount"])
                      video_data.append(video_stats["statistics"]["likeCount"])
                      video data.append(video stats["statistics"]["dislikeCount"])
                      video_data.append(video_stats["statistics"]["favoriteCount"])
                      video_data.append(video_stats["statistics"]["commentCount"])
                      video data.append(company)
                      youtube df.loc[index] = video data
```

## **Building channels Dataframe from collected data**

#### Out[34]:

channelTitle	channelld	
Penn State Health	UCXubLFOt4iiX2_0tYQD8gRA	0
Penn Commercial Business/Technical School	UCUngw5TivNYk845EpJQ1Mfg	1
Pennsylvania College of Technology	UCb_JeH-0SzKbKOqSe0DZnmA	2
Penn Medicine	UC36Nlm8ikeZ4tDRxBjJnA	3
Cincinnati Children's	UCSC8V1ez4zt3rviyPWzk9Sg	4

## Creating youtube channels data in excel

## Youtube dataframe

In [37]:	youtube_df.head()	
----------	-------------------	--

#### Out[37]:

			•
description	title	channelld	eold
At Penn State Health, we work to provide the b	Penn State Health - Careers	UCXubLFOt4iiX2_0tYQD8gRA	biM8
Dr. John D. Six, M.D., Vice President of Medic	Your Career in Healthcare Starts at Penn Comme	UCUngw5TivNYk845EpJQ1Mfg	Jbx4
https://www.pct.edu/academics/hs/healthIT Heal	Health Information Degrees at Penn College	UCb_JeH- 0SzKbKOqSe0DZnmA	olsw
In response to worldwide nursing concerns, the	Penn Medicine's Global Nurse Program	UC36Nlm8ikeZ4tDRxBjJnA	łb2w
The study of immunology is critical to our sur	Immunology Graduate Program   Cincinnati Child	UCSC8V1ez4zt3rviyPWzk9Sg	iKvw
	At Penn State Health, we work to provide the b  Dr. John D. Six, M.D., Vice President of Medic  https://www.pct.edu/academics/hs/healthIT Heal  In response to worldwide nursing concerns, the	Penn State Health - Careers  Your Career in Healthcare Starts at Penn Comme  Health Information Degrees at Penn College  Penn Medicinee #39;s Global Nurse Program  Immunology Graduate Program   Cincinnati  At Penn State Health, we work to provide the b  Dr. John D. Six, M.D., Vice President of Medic  Medic  In response to worldwide nursing concerns, the  The study of immunology is critical to our sur	UCXubLFOt4iiX2_0tYQD8gRA  Penn State Health - Careers  Your Career in Health Career in Health Comme  UCUngw5TivNYk845EpJQ1Mfg  UCb_JeH- 0SzKbKOqSe0DZnmA  UC36Nlm8ikeZ4tDRx_BjJnA  UCSC8V1ez4zt3rviyPWzk9Sg  Penn State Health, we work to provide the b  Por. John D. Six, M.D., Vice President of Medic  Dr. John D. Six, M.D., Vice President of Medic  https://www.pct.edu/academics/hs/healthIT Heal  Penn Medicine's Global Nurse Program Cincinnati  Immunology Graduate Program   Cincinnati

```
In [214]: 

youtube_df.to_csv("./data/youtubeVideos.csv",encoding="utf-8",index=False)
```

### **Glassdoor Reviews**

```
In [63]:
             def glassdoor ratings scrapper(url):
          headers = { 'accept': 'text/html,application/xhtml+xml,application/xml;q=
                              'accept-encoding': 'gzip, deflate, sdch, br',
                     'accept-language': 'en-GB,en-US;q=0.8,en;q=0.6',
                      'referer': 'https://www.glassdoor.com/',
                  'upgrade-insecure-requests': '1',
                  'user-agent': 'Mozilla/5.0 (X11; Linux x86 64) AppleWebKit/537.36 (KHTML,
                  'Cache-Control': 'no-cache',
                  'Connection': 'keep-alive'
                  }
                  location headers = {
                      'accept': 'text/html,application/xhtml+xml,application/xml;q=0.9,imag
                      'accept-encoding': 'gzip, deflate, sdch, br',
                      'accept-language': 'en-GB,en-US;q=0.8,en;q=0.6',
                      'referer': 'https://www.glassdoor.com/',
                      'upgrade-insecure-requests': '1',
                      'user-agent': 'Mozilla/5.0 (X11; Linux x86_64)                AppleWebKit/537.36 (KH
                      'Cache-Control': 'no-cache',
                      'Connection': 'keep-alive'
                  r = requests.get(url, headers=headers)
                  soup = BeautifulSoup(r.text, 'html.parser')
                  return soup
             soup = glassdoor ratings scrapper("https://www.glassdoor.com/Reviews/Google-F
```

#### In [64]: ▶ soup

ry:32":{"type":"COUNTRY","id":32,"identString":"N,32","name":"Benin","co ntainsEmployerHQ":false,"states":[{"type":"id","generated":false,"id":"S tate:-32","typename":"State"}],"\_\_typename":"Country"},"State:-32":{"typ e":"STATE","id":-32,"identString":null,"name":null,"containsEmployerHQ": false, "metros": [{"type": "id", "generated": false, "id": "Metro: 1254", "typena me":"Metro"}],"\_\_typename":"State"},"Metro:1254":{"type":"METRO","id":12 54, "identString": "M,1254", "name": "Porto-Novo, Benin Area", "contains Emplo yerHQ":false,"cities({\"onlyIfOther\":true})":null," typename":"Metr o"}, "Country:30":{"type":"COUNTRY", "id":30, "identString":"N,30", "nam e":"Bolivia","containsEmployerHQ":false,"states":[{"type":"id","generate d":false,"id":"State:3895","typename":"State"}],"\_\_typename":"Countr y"},"State:3895":{"type":"STATE","id":3895,"identString":"S,3895","nam e":"Cochabamba", "containsEmployerHQ":false, "metros":[{"type":"id", "gener ated":false,"id":"Metro:3049","typename":"Metro"}]," typename":"Stat e"}, "Metro: 3049": {"type": "METRO", "id": 3049, "identString": "M, 3049", "nam e":"Cochabamba, Bolivia Area", "containsEmployerHQ":false, "cities({\"only  $If Other \verb|":true|") ":null, "\_typename": "Metro"|, "Country: 36": {"type": "COUNTRY", "id": 36, "identString": "N, 36", "name": "Brazil", "contains Employer HQ": fallower than the string of the s$ lse, "states": [{"type": "id", "generated": false, "id": "State: 3919", "typenam

```
In [156]:
              def scrape reviews(soup, company):
                  companyName = []
                  reviewSummary = []
                  reviewLink = []
                  pros = []
                  cons = []
                  # iterating list of reviews in a page
                  for li in soup.find all(name="li", attrs={"class":"empReview"}):
                      companyName.append(company)
                      # header for summary
                      h2 = li.find(name="h2", attrs={"class":"summary"})
                      # link for individual review
                      a = h2.find(name="a", attrs={"class": "reviewLink"})
                      reviewSummary.append(a.text)
                      reviewLink.append("https://www.glassdoor.com/" + a.get('href'))
                      # div for pros and cons
                      div = li.find(name="div", attrs={"class": "row"})
                      p = div.find_all(name="p", attrs={"class": "mt-0"})
                      pros.append(p[0].text)
                      cons.append(p[1].text)
                        print(reviewLink)
                  return reviewSummary,reviewLink,pros,cons,companyName
              scrape reviews(soup, "Google")
   Out[156]: (['"One of the best places to work."',
                ""Moving at the speed of light, burn out is inevitable",
                '"Great balance between big-company security and fun, fast-moving proj
              ects"',
                '"The best place I\'ve worked and also the most demanding."',
                '"Amazing culture"',
                '"Great"',
                '"Best in Class"',
                '"Cool"',
                '"N/A"'
                '"A machine"'],
               ['https://www.glassdoor.com//Reviews/Employee-Review-Google-RVW3286794
              4.htm',
                'https://www.glassdoor.com//Reviews/Employee-Review-Google-RVW2757802.
              htm',
                'https://www.glassdoor.com//Reviews/Employee-Review-Google-RVW4204034.
                'https://www.glassdoor.com//Reviews/Employee-Review-Google-RVW5873129.
              htm',
                                           //5
              # Slalom Consulting , Accenture, Snapchat, Twitter, Amazon Web Services, Appl
In [157]:
```

## **Automating Review Scraping Process**

```
In [163]:
              # data frame for Glassdoor Reviews
              def scapeAllReviews():
                  columns = ["ReviewSummary", "link", "pros", "cons", "companyId"]
                  reviews df = pd.DataFrame(columns=columns)
                  i = 0
                  for link in reviewsLinks:
                      # calling functions for soup and scraping reviews
                      soup = glassdoor_ratings_scrapper(link)
                      reviewSummary,reviewLink,pros,cons,companyName = scrape reviews(soup,
                      i = i + 1
                      # creating a dict from recieved lists
                      reviewDict = {}
                      reviewDict["ReviewSummary"] = reviewSummary
                      reviewDict["link"] = reviewLink
                      reviewDict["pros"] = pros
                      reviewDict["cons"] = cons
                      reviewDict["companyId"] = companyName
                      # create a dataframe of reviews for particular company using dict abo
                      companyReview df = pd.DataFrame.from dict(reviewDict)
                      # ignore index and append to reviewDf for all companies
                      if i == 1:
                          reviews df = pd.DataFrame.from dict(reviewDict)
                      else:
                          reviews df = reviews df.append(companyReview df, ignore index = 1
                  return reviews df
              reviews = scapeAllReviews()
```

```
ReviewSummary
                                "Amazing experience."
0
1
                                              "Solid"
2
                                           "Software"
            "They really care about their employees"
3
4
                                               "Nice"
5
                             "Great Company to grow"
6
   "I believe this is what the kids would call a ...
7
                       "Best Place I've Ever Worked"
8
     "Great company to start your consulting career"
9
                               "Really Great Company"
                                                 link \
0 https://www.glassdoor.com//Reviews/Employee-Re... (https://www.glassd
oor.com//Reviews/Employee-Re...)
1 https://www.glassdoor.com//Reviews/Employee-Re... (https://www.glassd
oor.com//Reviews/Employee-Re...)
2 https://www.glassdoor.com//Reviews/Employee-Re... (https://www.glassd
oor.com//Reviews/Employee-Re...)
        1.1
```

In [165]: ▶ reviews.tail()

Out[165]:

	ReviewSummary	link	pros	cons	COI
105	"Great Work Environment, Great People"	https://www.glassdoor.com//Reviews/Employee-Re	Smart, Interesting, Innovative people to work	Office is still set up in cubicles which makes	
106	"Once great, now solid"	https://www.glassdoor.com//Reviews/Employee-Re	-Good (not amazing) benefits\r\n- decent corpor	-Very little support for retail stores\r\n- mic	
107	"Micromanaged from the First Day"	https://www.glassdoor.com//Reviews/Employee-Re	Smart colleagues; competent engineers; nice ca	Heavy in corporate bureaucracy; feels like wor	
108	"Bose: Company in Decline"	https://www.glassdoor.com//Reviews/Employee-Re	None whatsoever to speak of.	Closing all retail stores\r\nHit- or-miss manag	
109	"I enjoyed my time at Bose"	https://www.glassdoor.com//Reviews/Employee-Re	I had many good co- workers. We built great so	upper management did not always know what was	

## **Entering Glassdoor Reviews in excel**

In [215]: ▶ reviews.to\_csv("./data/glassdoorReviews.csv",encoding="utf-8",index=False)

## **Scraping all Ratings**

```
In [196]:
              def scrape ratings(soup, company):
                  overall = []
                  recommended = []
                  companyName = [company]
                  span = soup.find(name="div", attrs={"class": "v2__EIReviewsRatingsStyles\"
                  overall.append(span.text)
                  span = soup.find(name="tspan", attrs={"class": "donut__DonutStyle__donut(
                  recommended.append(span.text)
                  return overall, recommended, companyName
              soup = glassdoor ratings scrapper("https://www.glassdoor.com/Reviews/Google-F
              scrape ratings(soup, "Google")
   Out[196]: (['4.4'], ['89'], ['Google'])
In [200]:

▶ def scapeAllRatings():
                  columns = ["rating", "recommended", "companyId"]
                  ratings df = pd.DataFrame(columns=columns)
                  i = 0
                  for link in reviewsLinks:
                      # calling functions for soup and scraping reviews
                       soup = glassdoor ratings scrapper(link)
                       overall,recommended,companyName = scrape_ratings(soup, CompaniesList[
                       i = i + 1
                      # creating a dict from recieved lists
                       reviewDict = {}
                       reviewDict["ratings"] = overall
                       reviewDict["recommended"] = recommended
                       reviewDict["companyId"] = companyName
                      # create a dataframe of reviews for particular company using dict abo
                       companyRating = pd.DataFrame.from dict(reviewDict)
                       # ignore index and append to reviewDf for all companies
                      if i == 1:
                           ratings df = pd.DataFrame.from dict(reviewDict)
                      else:
                           ratings_df = ratings_df.append(companyRating, ignore_index = True
                  return ratings df
```

```
In [205]: ▶ ratings.head()
```

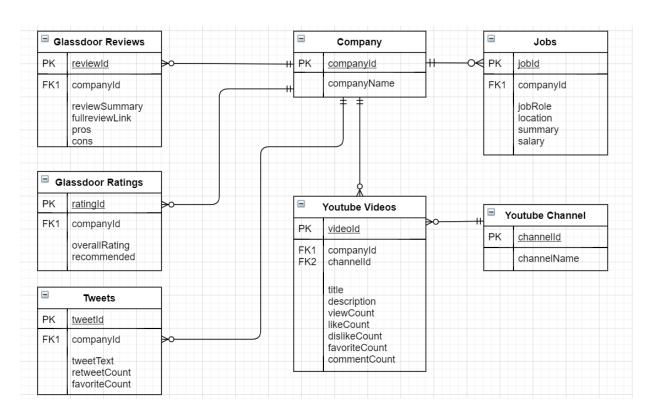
Out[205]:

companyld	recommended	ratings	
Google	89	4.4	0
Slalom Consulting	92	4.5	1
Accenture	77	3.8	2
Snapchat	65	3.4	3
Twitter	82	4.0	4

## **Entering company rating data into Excel**

```
In [216]:  ▶ ratings.to_csv("./data/glassdoorRatings.csv",encoding="utf-8",index=False)
```

## **ERD**



## **Table Description**

**TABLES** 

• COMPANY • JOBS • TWEETS • YOUTUBE\_VIDEOS • YOUTUBE\_CHANNELS • GLASSDOOR RATINGS • GLASSDOOR REVIEWS

#### 1) COMPANY\_TBL (company table):

- · This table contains the following attributes:
- COMPANY\_ID(PK): As we collected the data of the 300 finance company's we created a
  unique id for each of the company. This column is the primary key of the table and each row
  can be uniquely identified using this primary key.
- COMPANY\_NAME: This attribute or the column contains all the company names which we collected for the finance department.

#### 2) JOBS TBL:

- This table has the following attributes:
- JOB ID:
- When we check for any company website for the jobs we can see that there will be a job id
  uniquely defined for each and every different type of the job they post. This JOB\_ID refers to
  the same thing.
- JOB\_Role:
- Job position refers to the what type of position he is applying for. For example, he may apply
  to software Engineering, Data scientist etc.
- · COMPANY ID:
- This is the foreign key in this table which refers to the primary key in the COMPANY\_TBL.
- Foreign keys are used to provide the perfect link between the tables.
- JOB LOCATION: Job location refers to on which location this job is available.
- JOB\_SALARY: salary range of job
- · SUMMARY: summary provided by company about the job rol

#### 3) YOUTUBE CHANNEL:

- This table has the following attributes and the primary key in this table is channel id
- CHANNEL\_ID: Each channel in the YouTube is given the unique id. This unique id is called the CHANNEL ID.
- CHANNEL\_TITLE: Channel\_title is the title of the YouTube channel

#### 4) YOUTUBE\_VIDEO\_DATA:

- This table has the following attributes and the primary key in this table is the VIDEO\_ID and
  the foreign key in this table are COMPANY\_ID which references COMPANY\_TBL and the
  CHANNEL\_ID references the YOUTUBE\_DATA table.
- VIDEO\_ID: VIDEO\_ID represents the unique id given to each video posted in the YouTube.
- COMPANY\_ID: This is the foreign key which references the COMPANY\_ID in the COMPANY\_TBL.
- VIEW COUNT: VIEW COUNT represents the number of views for that table.
- COMMENT COUNT: COMMENT COUNT represents the number of counts for that video.
- LIKE\_COUNT: LIKE\_COUNT represents the number of likes for that video.
- DISLIKE\_COUNT: DISLIKE\_COUNT represents the number of dislikes for that video.
- FAVORITE COUNT: FAVORITE COUNT represents the number of favorites for that video.
- CHANNEL\_ID: This is the unique id given to each category in the category table. This is the
  foreign key in the table.

#### 5) GLASSDOORS DOOR RATINGS

- This table has the following attributes and the foreign keys in this table
- COMPANY\_ID: This is the foreign key which references the COMPANY\_ID in the COMPANY\_TBL.
- RATING\_OVERALL: It represents the overall Glassdoor rating of that particular company.
- RECOMMENDED: It represents how much people recommend that company

#### 6) GLASSDOOR\_REVIEWS:

- This table has the following attributes:
- COMPANY\_ID: This is the foreign key which references the COMPANY\_ID in the COMPANY\_TBL.
- REVIEW\_TITLE: Title given to each review.
- PROS: Pros about the company.
- CONS: Cons about the company
- REVIEW ID: It represents the unique id given to the each and every review.

#### 1) NORMALIZATION:

After the tables are created then the next step is data normalization. Normalization is used to
reduce the data redundancy. We can't eliminate the data redundancy completely, but we can
reduce the redundancy by dividing the repeating columns in the particular table into a new
table and generate a unique ld to that table. Now instead of repeating of all the columns we
will give this unique id to the table and it acts a s link between them.

#### 1) 1ST NORMALIZATION FORM:

- A table in 1NF should be atomic and have non repeating rows and columns.
- Our tables are in 1NF as they satisfy each requirement of first Normalization form.

#### 2) 2ND NORMALIZATION FORM:

- There should not be any partial dependency, which means that no value in the table should be dependent on a part of primary key.
- Our tables are in 2NF as they satisfy every requirement of second Normalization form.

#### 3) 3RD NORMALIZATION FORM:

- A table is said to be in 3NF if no non primary attribute in the table should be dependent on other nonprimary attribute in the table.
- Our tables are in 3NF as they satisfy every requirement of third Normalization form.

## Merging excel tables with common column

```
In [218]:
              # companies with id
              df q = pd.read excel('Unique.xlsx')
              # ratings with company name
              df_1 = pd.read_csv('./data/jobs.csv')
              df_new = pd.merge(df_1, df_q, left_on='company_name', right_on='company_name
              # df new.to excel('./data/final/jobs.xlsx')
              # ratings with company name
              df_1 = pd.read_csv('./data/glassdoorRatings.csv')
              df_new = pd.merge(df_1, df_q, left_on='company_name', right_on='company_name'
              # df_new.to_excel('./data/final/glassdoor_ratings.xlsx')
              # reviews with company name
              df_1 = pd.read_csv('./data/glassdoorReviews.csv')
              df_new = pd.merge(df_1, df_q, left_on='company_name', right_on='company_name'
              # df_new.to_excel('./data/final/glassdoor_reviews.xlsx')
              # youtube videos with company name
              df 1 = pd.read csv('./data/youtubeVideos.csv')
              df_new = pd.merge(df_1, df_q, left_on='company_name', right_on='company_name'
              # df new.to excel('./data/final/youtube videos.xlsx')
```

# All final excel tables with primary and foriegn keys

#### Out[224]:

company_name	company_id	
Global Science & Technology, Inc.	<b>0</b> 1	
SpiralTech Superior Dental Implants	1 2	
Tonk Tonk Games, Inc	<b>2</b> 3	:
Arrayo	3 4	;
ERNIESYS	<b>4</b> 5	

#### Out[225]:

	jobposting_id	job_title	company_name	location	summary	salary	company_i
0	j1	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year	47
1	j2	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year	47
2	j3	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year	47
3	j4	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year	47
4	j5	Data Scientist	Triplebyte	Remote	You'll report directly to Triplebytes' Head of	150, 000-225,000 a year	47

#### Out[226]:

	reviewid	ReviewSummary	link	pros	cons
0	rev1	"One of the best places to work."	https://www.glassdoor.com//Reviews/Employee- Re	Amazing place the work. Great culture, great p	Very difficult to get promoted.
1	rev2	"Moving at the speed of light, burn out is ine	https://www.glassdoor.com//Reviews/Employee-Re	1) Food, food, 15+ cafes on main campus	1) Work/life balance. What balance? All thos
2	rev3	"Great balance between big- company security an	https://www.glassdoor.com//Reviews/Employee-Re	* If you're a software engineer, you're among	* It *is* becoming larger, and with it comes g
3	rev4	"The best place I've worked and also the most	https://www.glassdoor.com//Reviews/Employee-Re	You can't find a more well- regarded company th	I live in SF so the commute can take between 1
4	rev5	"Amazing culture"	https://www.glassdoor.com//Reviews/Employee-Re	very caring about the individual, great benefi	very smart people, hence a very intense work e

#### Out[227]:

	ratingid	ratings	recommended	company_id
0	r1	4.4	89	586
1	r2	4.5	92	895
2	r3	3.8	77	757
3	r4	3.4	65	203
4	r5	4.0	82	516

#### Out[228]:

desc	title	channelld	videold	
At Penn State Health, we work to	Penn State Health - Careers	UCXubLFOt4iiX2_0tYQD8gRA	h5yJbbiM8	0
Dr. John D. Six, M.D., Vice Pres	Your Career in Healthcare Starts at Penn Comme	UCUngw5TivNYk845EpJQ1Mfg	Pabq5ElJbx4	1
https://www.pct.edu/academics/hs/h	Health Information Degrees at Penn College	UCb_JeH- 0SzKbKOqSe0DZnmA	pL-Ra2holsw	2
In response to worldwide concern	Penn Medicine's Global Nurse Program	UC36Nlm8ikeZ4tDRxBjJnA	zouPcloHb2w	3
The study of immunology is critical	Immunology Graduate Program   Cincinnati Child	UCSC8V1ez4zt3rviyPWzk9Sg	NlpK-1b5Kvw	4

#### Out[232]:

channelTitle	channelld	
Penn State Health	UCXubLFOt4iiX2_0tYQD8gRA	0
Penn Commercial Business/Technical School	UCUngw5TivNYk845EpJQ1Mfg	1
Pennsylvania College of Technology	UCb_JeH-0SzKbKOqSe0DZnmA	2
Penn Medicine	UC36Nlm8ikeZ4tDRxBjJnA	3
Cincinnati Children's	UCSC8V1ez4zt3rviyPWzk9Sg	4

## Now that we have all the final tables with primary keys and foriegn keys in excel.

## We created schema in workbench and exported all the excel files

### below are the screenshots for our sql workbench

CREATE TABLE jobs . company ( COMPANY\_ID INT NOT NULL, COMPANY\_NAME VARCHAR(45) NOT NULL, PRIMARY KEY ( COMPANY ID ));

CREATE TABLE jobs.jobpostings (jobposting\_id INT NOT NULL, job\_title VARCHAR(45) NULL, company\_name VARCHAR(45) NULL, location VARCHAR(45) NULL, summary VARCHAR(45) NULL, salary INT NULL, company\_id INT NULL, PRIMARY KEY (jobposting\_id));

CREATE TABLE jobs .youtubevideos ( videoId INT NOT NULL, channelId VARCHAR(4500) NULL, title VARCHAR(4500) NULL, description VARCHAR(4500) NULL, viewCount INT NULL, likeCount INT NULL, dislikeCount INT NULL, favoriteCount INT NULL, commentCount INT NULL, company\_name VARCHAR(450) NULL, company\_id INT NULL, PRIMARY KEY ( videoId ));

CREATE TABLE jobs . youtubechannels ( channelId VARCHAR(450) NOT NULL, channelTitle VARCHAR(450) NULL, PRIMARY KEY ( channelId ));

CREATE TABLE jobs . glassdoorratings ( ratingid INT NOT NULL, ratings FLOAT NULL, recommended INT NULL, company\_id INT NULL, PRIMARY KEY ( ratingid ));

CREATE TABLE jobs .glassdoorreviews ( reviewid VARCHAR(45) NOT NULL, ReviewSummary VARCHAR(450) NULL, link VARCHAR(450) NULL, pros VARCHAR(4500) NULL, company\_id INT NULL, PRIMARY KEY ( reviewid ));

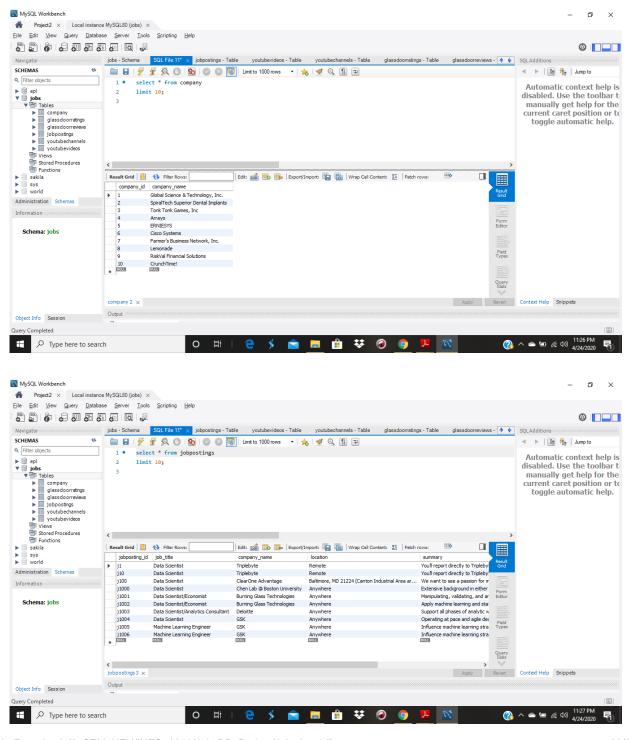
ALTER TABLE jobs . jobpostings ADD INDEX company\_id\_idx (company\_id ASC) VISIBLE;

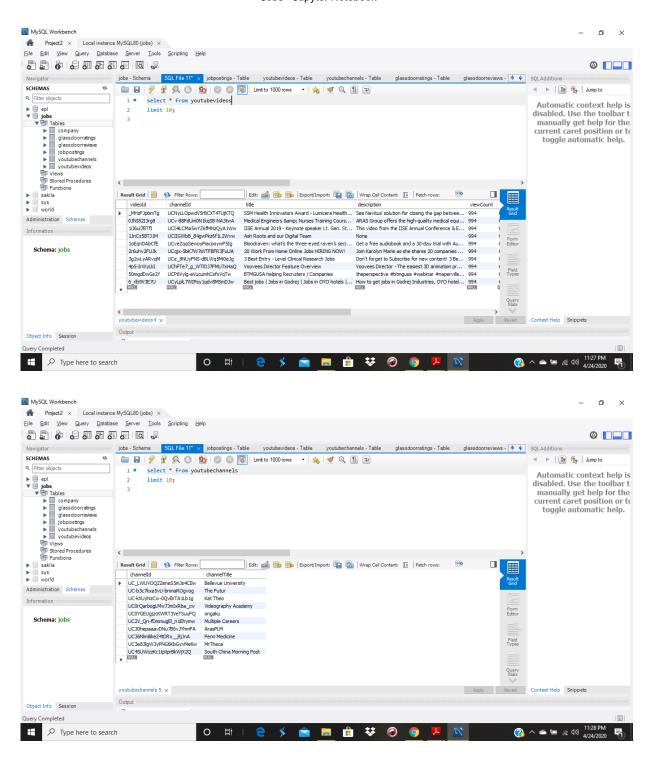
ALTER TABLE jobs . jobpostings ADD CONSTRAINT company\_id FOREIGN KEY (company\_id) REFERENCES jobs . company (company\_id) ON DELETE NO ACTION ON UPDATE NO ACTION;

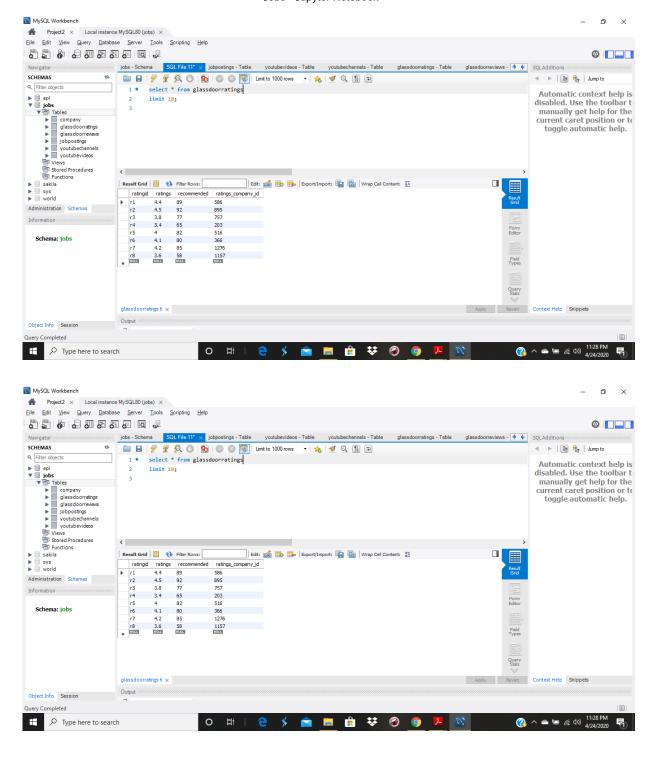
ALTER TABLE jobs . youtubevideos ADD INDEX channelId\_idx (channelId ASC) VISIBLE, ADD INDEX company\_id\_idx (company\_id ASC) VISIBLE; ; ALTER TABLE jobs . youtubevideos ADD CONSTRAINT company\_id FOREIGN KEY (company\_id) REFERENCES jobs . company (company\_id) ON DELETE NO ACTION ON UPDATE NO ACTION, ADD CONSTRAINT channelId FOREIGN KEY (channelId) REFERENCES jobs . youtubechannels (channelId) ON DELETE NO ACTION ON UPDATE NO ACTION;

ALTER TABLE jobs .glassdoorratings CHANGE COLUMN company\_id ratings\_company\_id INT(11) NULL DEFAULT NULL , ADD INDEX ratings\_company\_id (ratings\_company\_id ASC) VISIBLE;; ALTER TABLE jobs .glassdoorratings ADD CONSTRAINT ratings\_company\_id FOREIGN KEY (ratings\_company\_id) REFERENCES jobs .company (company\_id) ON DELETE NO ACTION ON UPDATE NO ACTION;

ALTER TABLE jobs .glassdoorreviews CHANGE COLUMN company\_id reviews\_company\_id INT(11) NULL DEFAULT NULL ,ADD INDEX reviews\_company\_id (reviews\_company\_id ASC) VISIBLE;; ALTER TABLE jobs .glassdoorreviews ADD CONSTRAINT reviews\_company\_id FOREIGN KEY (reviews\_company\_id) REFERENCES jobs .company (company\_id) ON DELETE NO ACTION ON UPDATE NO ACTION;







## **UseCases**

## select all from companies

**SELECT \* FROM COMPANIES** 

## select software jobs from job postings

select \* from jobs where job\_role like '%software%'

## select datascience jobs from job postings

select \* from jobs where job role like '%data%'

## Get a list of all the companies with remote jobs

select \* from jobs where location like '%remote%'

## Get the id of the companies with the most YouTube video views

select companyld, video Title, views from youtube Videos order by views desc limit 10

## Select company with most job postings

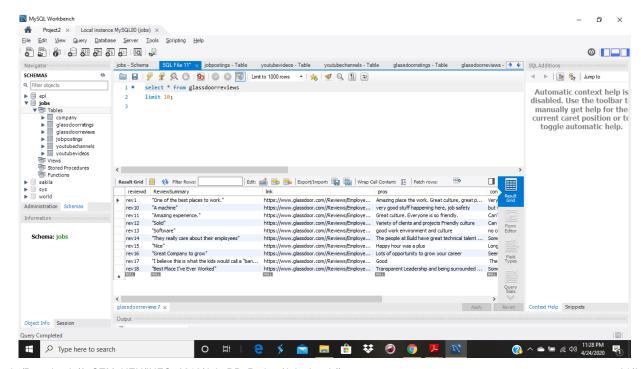
SELECT c.companyName, COUNT(j.jobId) AS jobs FROM JOBS\_TBL j JOIN company c ON c.companyId = J.job id GROUP BY c.companyName

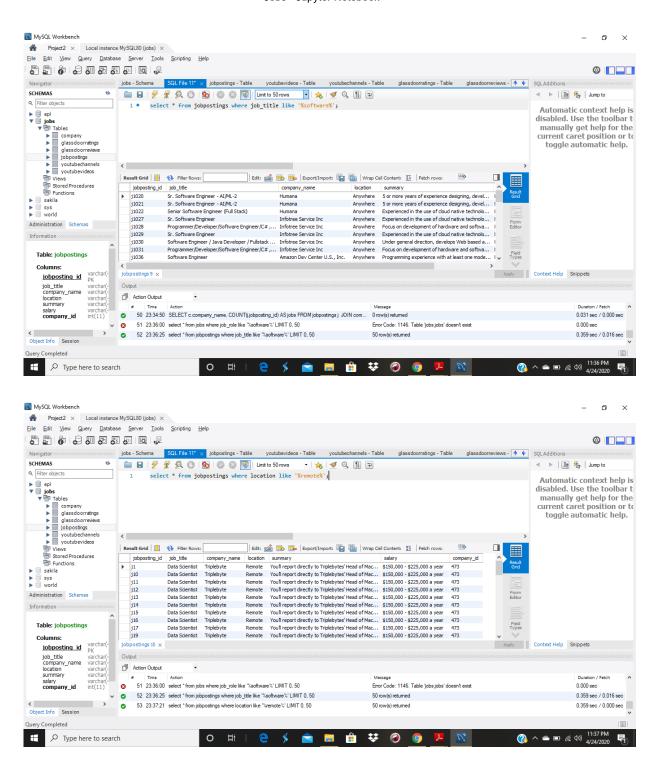
#### Get the name of the video with more likes

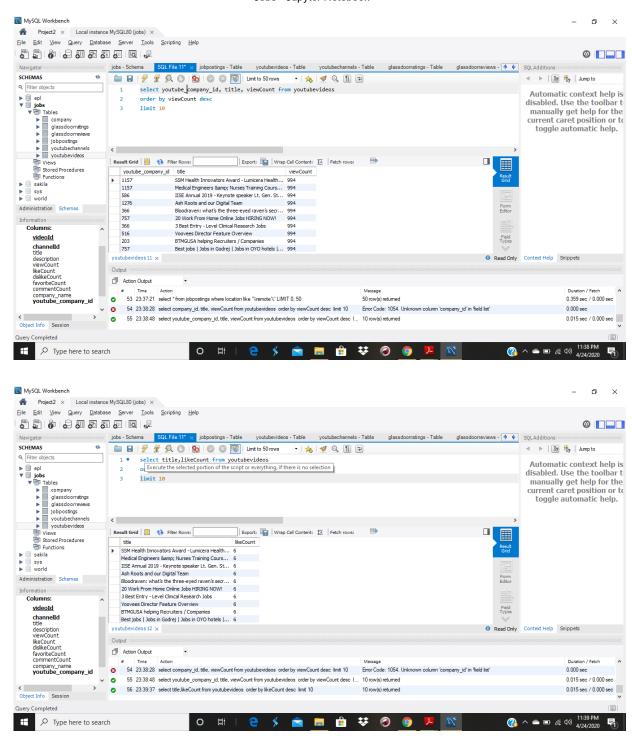
select companyld, video Title, likes from youtube Videos order by likes desc limit 10

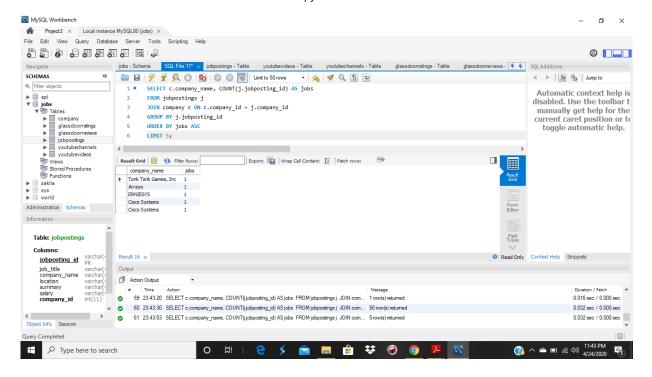
# Function: Get the role name given the JOB\_ID

CREATE FUNCTION GET\_ROLE\_NAME ( JOB\_ID\_IN IN VARCHAR2 , JOB\_POSITION\_OUT OUT VARCHAR2 ) RETURN VARCHAR2 AS BEGIN SELECT JOB\_POSITION INTO JOB\_POSITION\_OUT FROM JOBS\_TBL WHERE JOB\_ID = JOB\_ID\_IN; RETURN JOB\_POSITION\_OUT; END GET\_POSITION\_NAME;









#### **AUDIT VALIDITY/ACCURACY**

We say data is accurate only when it is neat and with no junk values. By using various commands like drop, del and lambda functions, all the unwanted junk values were deleted from the above rows and columns which gives valid and accuarate data report.

#### **AUDIT COMPLETNESS**

In real world, when a list of teams stats, player stats, player information, team information from a particular Player or Team or season is requested, a list of it will be displayed or presented, similarly when we compare it with above data too, we get proper real time data showing correct information for all the Matches played by teams/players. This can be extended for multiple seasons like which team is popular in that season.

#### **AUDIT CONSISTENCY/UNIFORMITY**

The datasets which have been used in this assignment show a uniform relationship between each of the dataset since they are linked to each other by a common attribute.

#### CONCLUSION

Primary focus of this assignment is to learn how to get the data from different sources, cleaning of data, checking null values present in the data, data munging and to reformat the data to fit a conceptual database model.

Later Created a SQL database of jobs so that job seekers and search for jobs mostly software and data jobs during the covid time

#### References

- <a href="https://medium.com/@msalmon00/web-scraping-job-postings-from-indeed-96bd588dcb4b">https://medium.com/@msalmon00/web-scraping-job-postings-from-indeed-96bd588dcb4b</a> (<a href="https://medium.com/@msalmon00/web-scraping-job-postings-from-indeed-96bd588dcb4b">https://medium.com/@msalmon00/web-scraping-job-postings-from-indeed-96bd588dcb4b</a>)
- https://developers.google.com/youtube/v3 (https://developers.google.com/youtube/v3)
- https://pbpython.com/pandas-list-dict.html (https://pbpython.com/pandas-list-dict.html)
- <a href="https://www.geeksforgeeks.org/python-pandas-dataframe-append/">https://www.geeksforgeeks.org/python-pandas-dataframe-append/</a>)
   <a href="https://www.geeksforgeeks.org/python-pandas-dataframe-append/">https://www.geeksforgeeks.org/python-pandas-dataframe-append/</a>)

#### CONTRIBUTION

Your contribution towards project. How much code did you write and how much you took from other site or some other source.

I contributed By Own: 30%
Teammate contribution: 60%
Provided by the template: 10%

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