

Data Scientist Role Play

Profiling and Analyzing the Yelp Datasets

DONE BY

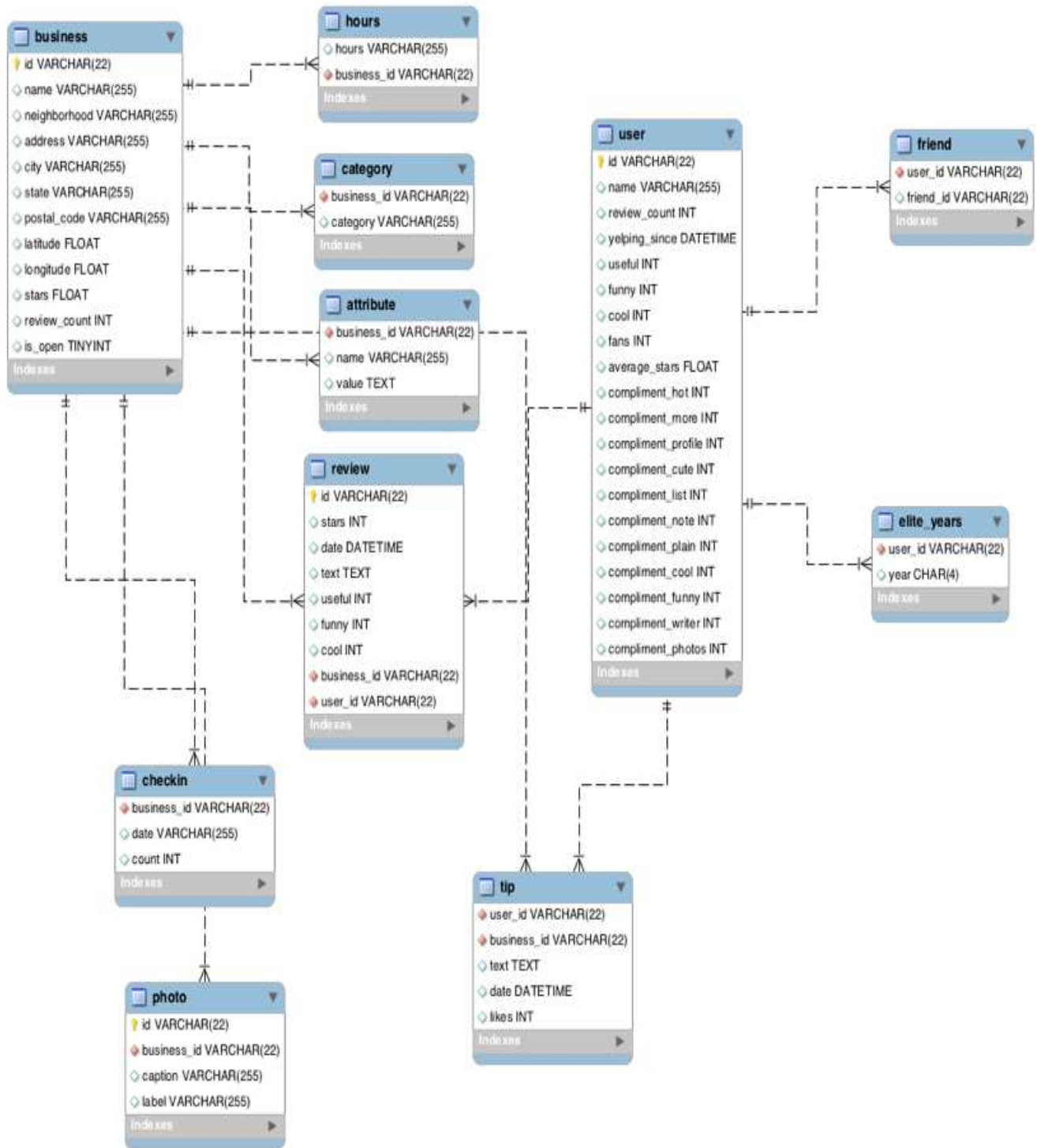
SHREYA BISWAS

In the first part of my project, I have profiled and understood the data just like a data scientist would.

In the second part I have analyzed the data with my own inferences. In order to do that I have prepared the dataset for the analysis.

Using the Yelp data sets I've analyzed , Yelp is a US-based organization which provides a platform for users to provide reviews and rate their interactions with a variety of organizations - businesses, restaurants, health clubs, hospitals, local governmental offices, charitable organizations, etc. Yelp has made a portion of this data available for personal, educational, and academic purposes.

I've used the following entity relationship (ER) diagram:



Part 1: Yelp Dataset Profiling and Understanding

1. Profile the data by finding the total number of records for each of the tables below:

- i. Attribute table = 10000
- ii. Business table = 10000
- iii. Category table = 10000
- iv. Checkin table = 10000
- v. elite_years table=10000
- vi. friend table = 10000
- vii. hours table = 10000
- viii. photo table = 10000
- ix. review table = 10000
- x. tip table = 10000
- xi. user table = 10000

SQL Code

- i. select * from attribute;
- ii. select * from business;
- iii. select * from category;
- iv. select * from checkin;
- v. select * from elite_years;
- vi. select * from friend;
- vii. Select * from hours;
- viii. Select * from photo;
- ix. Select * from review;
- x. select * from tip;
- xi. select * from user;

2. Find the total distinct records by either the foreign key or primary key for each table. If two foreign keys are listed in the table, please specify which foreign key.

- i. Business = 10000(id)
- ii. Hours = 1562(business_id)
- iii. Category= 2643(business_id)
- iv. Attribute= 1115(business_id)
- v. Review= 10000(id), 8090(business_id), 9581(user_id)
- vi. Checkin= 493(business_id)
- vii. Photo= 10000(id), 6493(business_id)
- viii. Tip= 537(user_id), 3979(business_id)
- ix. User= 10000(id)
- x. Friend= 11(user_id)
- xi. Elite_years=2780(user_id)

SQL Code

```
select distinct user_id from Elite_years;
```

3. Are there any columns with null values in the Users table? Indicate "yes," or "no."

Answer: No

SQL code used to arrive at answer:

```
select id
,name
,review_count
,yelping_since
,useful
,funny
,cool
,fans
,average_stars
,compliment_hot
,compliment_more
,compliment_profile
,compliment_cute
,compliment_list
,compliment_note
,compliment_plain
,compliment_cool
,compliment_funny
,compliment_writer
,compliment_photos
from user
where id is null
      or name is null
      or review_count is null
      or yelping_since is null
      or useful is null
      or funny is null
      or cool is null
```

```

or fans is null
or average_stars is null
or compliment_hot is null
or compliment_more is null
or compliment_profile is null
or compliment_cute is null
or compliment_list is null
or compliment_note is null
or compliment_plain is null
or compliment_cool is null
or compliment_funny is null
or compliment_writer is null
or compliment_photos is null

```

4. Find the minimum, maximum, and average value for the following fields:

```

i. Table: Review, Column: Stars
   min: 1          max: 5          avg: 3.7082

ii. Table: Business, Column: Stars
   min: 1.0        max: 5.0        avg: 3.6549

iii. Table: Tip, Column: Likes
   min: 0          max: 2          avg: 0.0144

iv. Table: Checkin, Column: Count
   min: 1          max: 53         avg: 1.9414

v. Table: User, Column: Review_count
   min: 0          max: 2000       avg: 24.2995

```

5. List the cities with the most reviews in descending order:

SQL code used to arrive at answer:

```

select city
,sum(review_count) from business group by city
order by sum(review_count) desc ;

```

Copy and Paste the Result Below:

city	sum(review_count)
Las Vegas	82854
Phoenix	34503
Toronto	24113
Scottsdale	20614
Charlotte	12523
Henderson	10871

Tempe	10504
Pittsburgh	9798
Montréal	9448
Chandler	8112
Mesa	6875
Gilbert	6380
Cleveland	5593
Madison	5265
Glendale	4406
Mississauga	3814
Edinburgh	2792
Peoria	2624
North Las Vegas	2438
Markham	2352
Champaign	2029
Stuttgart	1849
Surprise	1520
Lakewood	1465
Goodyear	1155

6. Find the distribution of star ratings to the business in the following cities:

i. Avon

SQL code used to arrive at answer:

```
select stars as star_rating
,count(stars) from business
where city='Avon' group by stars;
```

Copy and Paste the Result Below:

Star Rating	Count
1.5	1
2.5	2
3.5	3
4.0	2
4.5	1
5.0	1

ii. Beachwood

SQL code used to arrive at answer:

```
select stars as star_rating
,count(stars) from business
where city='Beachwood' group by stars;
```

Copy and Paste the Result Below:

Star Rating	Count
2.0	1
2.5	1
3.0	2
3.5	2
4.0	1
4.5	2
5.0	5

7.Find the top 3 users based on their total number of reviews:

SQL code used to arrive at answer:

```
select name as users
,sum(review_count) from user group by fans
order by review_count desc limit 3;
```

Copy and Paste the Result Below:

name	review_count
Gerald	2000
Sara	1834
Yuri	1339

8.Does posing more reviews correlate with more fans?

Please explain your findings and interpretation of the results:

SQL Code:

```
select name
,fans,review_count from user
order by fans desc limit 10;
```

Result:

No no. of fans and reviews are not correlated as we can see in the following table below that is our output, for each user there is no relationship between no. of reviews and fans.

name	review_count	fans
Amy	609	503
Mimi	968	497
Harald	1153	311
Gerald	2000	253
Christine	930	173
Lisa	813	159
Cat	377	133
William	1215	126
Fran	862	124
Lissa	834	120

9.Are there more reviews with the word "love" or with the word "hate" in them?

Answer:

SQL code used to arrive at answer:

```
select 'love' Word
,count(text) as Count from review
where text like "%love%" union select 'hate' word
,count(text) as count from review
where text like "%hate%";
```

Word	Count
hate	232
love	1780

10. Find the top 10 users with the most fans:

SQL code used to arrive at answer:

```
select name as users
,sum(fans) from user group by fans
order by fans desc limit 10;
```

Copy and Paste the Result Below:

name	fans
Amy	503
Mimi	497
Harald	311
Gerald	253
Christine	173
Lisa	159
Cat	133
William	126
Fran	124
Lissa	120

Part 2: Inferences and Analysis

1. Pick one city and category of your choice and group the businesses in that city or category by their overall star rating. Compare the businesses with 2-3 stars to the businesses with 4-5 stars and answer the following questions. Include your code.

i. Do the two groups you chose to analyze have a different distribution of hours?

Answer: Yes

SQL code used for analysis:

```
select stars,count(hours),city, neighborhood, address,hours,
case
when stars in (2.0,2.5,3.0,3.5) then 'lower' else 'upper' end comparison
from business inner join hours on business.id=hours.business_id where
city='Toronto' and stars>1.5 group by stars ;
```

ii. Do the two groups you chose to analyze have a different number of reviews?

Answer: No

SQL code used for analysis:

```
select stars
,review_count
,city
,neighborhood
,address,
case
when stars in (2.0,2.5,3.0,3.5) then 'lower'
else 'upper' end comparison
from business
where city='Avon' and stars>1.5
group by stars ;
```

iii. Are you able to infer anything from the location data provided between these two groups? Explain.

Answer:

So, in our output star rating of customer of the US-based company called **Yelp** is different for different location of the city Toronto(The analysis is done for Toronto city ,any one can do the same for other city).

We can consider the following causes regarding the variation of star rating

- customer's behavior
- Various location
- different quality of day by day business service.

SQL code used for analysis:

```
select stars
,city
,neighborhood
,address
,latitude
,longitude,
case
when stars in (2.0,2.5,3.0,3.5) then 'lower' else 'upper'
end comparison from business
where city='Toronto' and stars>1.5
group by stars ;
```

2. Group business based on the ones that are open and the ones that are closed. What differences can you find between the ones that are still open and the ones that are closed? List at least two differences and the SQL code you used to arrive at your answer.

Answer:

i. Difference 1:

The data is grouped in such a way that the ones that are open and the ones that are closed, then it can be noticed that how customer's behaviour is changed. In the distribution of star ratings, we can see business services of **Yelp** get highest rating from customer though their services are closed. Though no. of highest ratings such as 4-5 of closed services are less than that of open services

ii. Difference 2:

Average star rating & reviews of those business services **is_opened** is **3.6790** and **31.7570** respectively whereas, the same of **is_closed** is less than **is_open** that is average star rating and review are **3.5203** and **23.1980** respectively.

iii. Difference 3:

8480 business services are available of **Yelp** and **1520** are closed.

SQL code used for analysis:

For grouping:

```
select is_open,stars
,review_count
,city
,case
when is_open='1' then 'Yes' else 'No'
end binary_decision from business;
```

i. Difference 1

Distribution Of stars_rating

For open service

```
select is_open,stars
, count(stars)
, case
when is_open='1' then 'Yes' else 'No'
end binary_decision from business
where is_open='1'
group by stars;
```

For closed service

```
select is_open,stars
,count(stars)
, case
when is_open='1' then 'Yes' else 'No'
end binary_decision from business
where is_open='0'
group by stars;
```

ii. Difference 2

For open service

```
select is_open  
,avg(stars)  
,avg(review_count) from business  
where is_open='1';
```

For closed service

```
select is_open  
, avg(stars)  
,avg(review_count) from business  
where is_open='0';
```

iii. Difference 3

For open service

```
select is_open  
,count(is_open) from business  
where is_open='1'  
group by is_open;
```

For closed service

```
select is_open  
,count(is_open) from business
```

```
where is_open='0'  
  
group by is_open;
```

3. For this last part of your analysis, you are going to choose the type of analysis you want to conduct on the Yelp dataset and are going to prepare the data for analysis.

Ideas for analysis include: Parsing out keywords and business attributes for sentiment analysis, clustering businesses to find commonalities or anomalies between them, predicting the overall star rating for a business, predicting the number of fans a user will have, and so on. These are just a few examples to get you started, so feel free to be creative and come up with your own problem you want to solve. Provide answers, in-line, to all of the following:

1)i. Indicate the type of analysis you chose to do:

Correlation between star ratings and likes given by the consumer

ii. Write 1-2 brief paragraphs on the type of data you will need for your analysis and why you chose that data:

I need two sources of data (tables). First, I join these two tables based on the tables named **users** and **business**. Then I sort them based on rating to see whether there is any correlation between the number of stars and likes.

The reason I chose this analysis and thus, the data sets is that psychologists have shown that how people think about something can completely change even after a few minutes and they think that how people think just after occurrence of an event is a better representative for the quality of that event compared to what they say after thinking about it. Because tip table is related to the occurrence of the event (shopping) and they write a review after hours or even days, comparing these two tables can help us to explore the validity what psychologists claim. As the result shows there is a slight correlation between the number of likes and stars, but this correlation is not strong. So what psychologists claim seems to be fairly valid.

iii. Output of your finished dataset:

SQL Code For Correlation between stars rating and likes given by users

```

select r.stars

,t.likes from tip t inner join review r

on r.user_id=t.user_id

order by t.likes desc;

```

Output

```

+-----+-----+ | stars | likes | +-----+-----+ | 3 | 2 | | 5 | 2 | | 4 | 1 | | 3 | 1 |
| 3 | 1 | | 5 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 |
| 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | | 4 | 1 | |
4 | 1 | | 5 | 1 | | 5 | 1 | +-----+-----+ (Output limit exceeded, 25 of 1227 total rows
shown)

```

Another example of how thoughts of people change after occurrence of any event like shopping,bike parking etc.

Case studies

There is no relation between stars rating and likes of user in case of bike parking. As how people think about something can completely change even after a few minutes so before the occurrence of the event it seems that that would provide very good services but after the event like after parking bike user's view was completely changed and this view would be the best representative of that event compared what they said before the occurrence of the event. That's why there is no correlation between stars which was given before the event is happened and likes which was given after the occurrence of that event.

SQL Code

```

select
r.stars
,t.likes
,r.useful
,a.name
,case when r.useful='1' then 'useful'
else 'not useful' end binary_decision
from review r inner join tip t
on r.business_id=t.business_id inner join attribute a
on a.business_id=r.business_id
where a.name like '%parking%';

```

Output

```
+-----+-----+-----+-----+-----+ | stars | likes |
useful | name | binary_decision | +-----+-----+-----+-----+
+-----+-----+ | 4 | 0 | 0 | BikeParking | not useful | | 4 | 0 | 0 | BusinessParking |
not useful | | 1 | 0 | 1 | BikeParking | useful | | 1 | 0 | 1 | BikeParking | useful | | 1 |
0 | 1 | BikeParking | useful | | 1 | 0 | 1 | BikeParking | useful | | 1 | 0 | 1 |
BikeParking | useful | | 1 | 0 | 1 | BikeParking | useful | | 1 | 0 | 1 | BikeParking |
useful | | 1 | 0 | 1 | BikeParking | useful | | 1 | 0 | 1 | BikeParking | useful | | 1 | 0 |
1 | BikeParking | useful | | 1 | 0 | 1 | BusinessParking | useful | | 1 | 0 | 1 |
BusinessParking | useful | | 1 | 0 | 1 | BusinessParking | useful | | 1 | 0 | 1 |
BusinessParking | useful | | 1 | 0 | 1 | BusinessParking | useful | | 1 | 0 | 1 |
BusinessParking | useful | | 1 | 0 | 1 | BusinessParking | useful | | 1 | 0 | 1 |
BusinessParking | useful | | 1 | 0 | 1 | BusinessParking | useful | | 1 | 0 | 1 |
BusinessParking | useful | | 5 | 0 | 0 | BikeParking | not useful | | 5 | 0 | 0 |
BikeParking | not useful | | 5 | 0 | 1 | BikeParking | useful | +-----+-----+-----+
+-----+-----+-----+-----+ (Output limit exceeded, 25 of 38 total rows shown)
```

2)i. Indicate the type of analysis you chose to do:

Usefulness, user's feedback of business for a particular category. How people like that particular category.

ii. Write 1-2 brief paragraphs on the type of data you will need for your analysis and why you chose that data:

Here we do inner join operation to the tables review and category in order to analyze how people of US like Korean food. In review table they leave feedback and help us for our analysis purpose.

Here we can see there is a slight correlation between stars rating and the review what users leave for us in order to analyze the service quality of this company. If we do a sentiment analysis using this reviews it will be very interesting. Here we can also notice that there is no relation between useful of the reviews and stars rating.

SQL Code

```
select
r.useful
,c.category
,r.stars
,r.date
,r.cool
,r.funny
,r.text
from category c inner join review r
on c.business_id=r.business_id
```


where c.category='Korean';

Output

```
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
| useful | category | stars | date | cool | funny | text | +-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
| 0 | Korean | 4 | 2016-06-04 00:00:00 | 0 | 0 | I like the food, it was really fresh. The
service was also on point and it was a full house. The beef is really good, any of them. The
fried rice feeds about 3 ppl. I love this place, I come here often. And always bring ppl
here who come to Vegas to visit, they all love it. The price is also very reasonable. For 2
ppl I usually spend about $40 but leave STUFFED. | 0 | Korean | 4 | 2017-06-27 00:00:00 |
0 | 0 | one of the best korean bbq place we have been. portions are enough, side dishes were
great. place is kinda small and could get really crowded. i little bit expensive but its
worth it. we got free dessert just by checking in.i wish the serves would be more friendly
and attentive. meat has good quality. | | | | | | | | | | | | | | | | | | | | | | | | | | | |
back. | 0 | Korean | 4 | 2015-06-04 00:00:00 | 0 | 0 | Our first Korean BBQ meal in Vegas,
found it in Yelp rated almost five star. The place looks very clean, and the waitress is so
nice! We ordered beef tongue, pork belly and other meat. The meat tasted awesome!!!! | 0 |
Korean | 5 | 2017-01-16 00:00:00 | 0 | 0 | Atmosphere is amazing! Our server was the best!
Prices are defiantly reasonable compared to everything else and food was to die for ...
Defiantly will be coming back next time I'm in Vegas. | 0 | Korean | 5 | 2016-04-24
00:00:00 | 0 | 0 | Awsome awsome place to eat highly recomend there banana deserve was
delicious. Loved the BBQ here I'm in love | 0 | Korean | 5 | 2016-02-17 00:00:00 | 0 | 0 |
Great food, comfortable atmosphere and very friendly staff - kudos to "Back" and "Frank" who
were very friendly and kind! Highly recommend this restaurant! | 0 | Korean | 4 | 2014-01-
24 00:00:00 | 0 | 0 | My first experience with Korean BBQ. I was a bit intimidated at first.
The place was busy and my rookie flag was flapping wildly. I was able to get through the
ordering process with the help of a super friendly waitress that set me at ease from word
go. Happy hour prices made my experience even more palatable. | 0 | Korean | 5 | 2015-12-
27 00:00:00 | 0 | 0 | The food was amazing as well as the customer service. The wait was so
worth it. I'd come back everyday if I could! | 0 | Korean | 5 | 2016-04-04 00:00:00 | 0 |
0 | Great food! Great prices! Great service! One of the beat Korean BBQ places that I've
been to. | +-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+
```

3)i.Indicate the type of analysis you chose to do

How stars ratings of the coustomers based on services and usefulness of user's feedback are correlated.

ii. Write 1-2 brief paragraphs on the type of data you will need for your analysis and why you chose that data:

There is a weak correlation between ratings and usefulness. Here we join two tables review and user using inner join in order to analyze the customers' feedback.

SQL Code

```
select
r.stars
,u.useful
,u.review_count
from review r inner join user u
on r.user_id=u.id;
```

Output

stars	useful	review_count
2	17	71
5	1	26
5	0	1
3	2654	196
2	1402	279
3	37	8
1	0	10
4	38	564
5	2	8
4	4	8
4	72	174
1	2	13
5	0	35
5	4	676
5	3	96
4	6	10
5	0	12
4	8	83
5	6974	198
4	154	44
5	5	16
5	0	7
4	0	7
4	21	109

```
|      3 |      30 |      235 |
+-----+-----+-----+
(Output limit exceeded, 25 of 72 total rows shown)
```

4)i.Indicate the type of analysis you chose to do

Here we want to know how the quality of business services for specific category varies with respect to different location of different cities and how many hours they provide services.

ii. Write 1-2 brief paragraphs on the type of data you will need for your analysis and why you chose that data:

Here we consider "shopping" category ,anyone can select another category.From our output we can conclude that rating is high for the city **Pittsburgh** and average review is high for the city **Las Vegas** and the customers Services are opened for 10-12 hours(it can be changed for different service provider) except in Mesa where services are closed. Star rating is weekly correlated with average review.

SQL code

Category: Shopping

```
select
  b.nameas as 'Service Provider'
,b.city
,b.latitude
,b.longitude
,b.address
,b.stars,avg(b.stars)
,avg(b.review_count)
,MAX(CASE
  WHEN h.hours LIKE "%monday%" THEN TRIM(h.hours, '%MondayTuesWednesThursFriSatSun|
%') END) AS monday_hours,
```



```

10:00-18:00 | 12:00-17:00 | Shopping | 1 | Open | | Alterations Express | Strongsville |
41.3141 | -81.8207 | 17240 Royalton Rd | 4.0 | 4.0 | 3.0 | 8:00-19:00 | 8:00-19:00 | 8:00-
19:00 | 8:00-19:00 | 8:00-19:00 | 8:00-18:00 | None | Shopping | 1 | Open | | Bobs Smoke
Shop | Tempe | 33.408 | -111.91 | 1740 E Broadway Rd, Ste 102 | 3.5 | 3.5 | 3.0 | 9:30-22:00
| 9:30-22:00 | 9:30-22:00 | 9:30-22:00 | 9:30-22:00 | 9:30-22:00 | 9:30-22:00 | Shopping | 1
| Open | | Gussied Up | Toronto | 43.6727 | -79.4142 | 1090 Bathurst St | 4.5 | 4.5 | 6.0 |
None | 11:00-19:00 | 11:00-19:00 | 11:00-19:00 | 11:00-19:00 | 11:00-17:00 | 12:00-16:00 |
Shopping | 1 | Open | +-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+
+-----+-----+-----+-----+-----+-----+-----+-----+

```

5)i.Indicate the type of analysis you chose to do

Here we want to know whether people like chinese food and how many people,that will also give an effect on star ratings ,more stars rating is also a results of good service of Yelp.

ii. Write 1-2 brief paragraphs on the type of data you will need for your analysis and why you chose that data:

Here we have to collect all chinese restaurants in different cities .Here we have calculated average stars rating and average of no. of reviews given by customers regarding the services.

In output we can see there is only one chinese restaurant in the corresponding cities except in Edinburgh restaurants is closed and in Las Vegas restaurants got highest average stars and reviews.

Here we can also notice that a moderate positive correlation between average ratings and average reviews in respective cities.

SQL Code

```

SELECT
c.category
, COUNT(b.name) AS Number_Of_Resturants
, AVG(stars)
, AVG(review_count)
, b.city, b.is_open, case
when is_open='1' then 'Open' else 'Closed'
end Restuarant_is_open_or_not
FROM business b INNER JOIN category c
ON c.business_id = b.id
WHERE c.category like "chin%"
GROUP BY b.city
ORDER BY b.city DESC;

```

Output