DATA INTENSIVE COMPUTING

Statistical Analysis to support new data product





Problem 4: Collecting and Analyzing data on NYC Apartments and recommend a plan to Real Direct to offer Apartment Rentals as a product

Step 1: Parsing Tweets

In this step we will parse the tweets on NYC Apartments (tweets on apartments and home sales in Manhattan, Brooklyn, Bronx and Staten Island) which we collected over 1 week during problem 1

First we parsed the tweets and tweets and extracted meaningful information and stored it as a Data Frame

```
tweets_manhattan <- fromJSON(file = "Tweets_Manhattan.json")</pre>
10
    df_manhattan <- data.frame(tweets_manhattan[[1]]$id_str, tweets_manhattan[[1]]$created_at,
                                tweets_manhattan[[1]]$text, tweets_manhattan[[1]]$favorite_count,
11
12
                                tweets_manhattan[[1]]$retweet_count, tweets_manhattan[[1]]$user$id_str,
13
                                tweets_manhattan[[1]]$user$verified, tweets_manhattan[[1]]$user$followers_count,
14
                                tweets_manhattan[[1]]$user$friends_count, tweets_manhattan[[1]]$user$listed_count,
15
                                tweets_manhattan[[1]]$user$statuses_count, tweets_manhattan[[1]]$user$location)
   df_manhattan$data_location <- "Manhattan"</pre>
   df_manhattan$sentiment_buy_home <- "Neutral"
17
18 df_manhattan$sentiment_rent_apt <- "Neutral"</pre>
```

Step 2: Performing Sentiment Analysis on the tweets

In this step we will perform sentiment analysis on each tweet and analyze whether the user is talking about renting an apartment or buying an apartment.

This analyses will be our backing information for suggesting a new product to Real Direct.

Below is the script to perform sentiment analysis.

```
47 → repeat {
                                    print(paste("Creating Data Frame for Manhattan Tweets Data. Collected ", x," Tweets" ,sep=""))
48
49
                                    temp\_df\_manhattan <- \ data.frame(tweets\_manhattan[[x]] id\_str, \ tweets\_manhattan[[x]] structure temp\_df\_manhattan[[x]] structure
50
                                    temp_df_manhattan$data_location <- "Manhattan"</pre>
51
                                    temp_df_manhattan$sentiment_buy_home <- "Neutral"</pre>
52
                                    temp_df_manhattan$sentiment_rent_apt <- "Neutral"</pre>
53
                                    colnames(temp_df_manhattan) <- c("tweet_id","tweet_created_at","tweet_text","tweet_favorite_count","tweet_retweet_count",</pre>
54
55
56
                                    if((grepl("buy", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("purchase", text, ignore.case = TRUE) | grepl("purchase", ignore.case = TRUE) | grepl
57
                                                     & (grepl("house", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("housing", temp_df_manhattan$tweet_text,
                                                     \& \ (grepl("expensive", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case = TRUE) \ | \ grepl("high price", temp\_df\_manhattan\$tweet\_text, ignore.case =
58 -
                                               temp_df_manhattan$sentiment_buy_home <- "Expensive"</pre>
59
60
                                    } else if((grepl("buy", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("purchase", temp_df_manhattan$tweet_text
                                                                                              & (grepl("house", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("housing", temp_df_manhattan$tweet_
61 *
62
                                               temp_df_manhattan$sentiment_buy_home <- "Affordable"</pre>
63
64
 65
                                    # sentiment for renting home
                                    if((grepl("rent", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("rental", temp_df_manhattan$tweet_text, ignore
66
67
                                                       | (grepl("house", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("housing", temp_df_manhattan$tweet_text, ig
68 -
                                                    & (grepl("expensive", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("high price", text, ignore.case = TRUE) | grepl("high price", ignore.case = TRUE) | grepl("high price", text, ignore.case = TRUE) | grepl("high price", ignore.case = TRUE) 
 69
                                               temp_df_manhattan$sentiment_rent_apt <- "Expensive"
                                    } else if((grepl("rent", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("rental", temp_df_manhattan$tweet_text
 70
71 -
                                                                                              | (grepl("house", temp_df_manhattan$tweet_text, ignore.case = TRUE) | grepl("housing", text, ignore.case = TRUE) | grepl("housing", ignore.ca
 72
                                               temp_df_manhattan$sentiment_rent_apt <- "Affordable"</pre>
 73
74
75
                                    df_manhattan <- rbind(df_manhattan, temp_df_manhattan)</pre>
76
 77 -
                                    if (x > count_manhattan_tweets){
78
                                              break
79
80
                        df_manhattan = unique(df_manhattan)
```

After performing the analysis, we get to know how many users are talking about renting vs buying an apartment and also their response on cost of living at a particular place

This is the result of Sentiment analysis on individual locations

```
> head(df_manhattan)
            tweet_id
                                    tweet_created_at
1 705536615440056321 Thu Mar 03 23:33:32 +0000 2016
2 704297853708079104 Mon Feb 29 13:31:08 +0000 2016
3 703942120583860224 Sun Feb 28 13:57:34 +0000 2016
4 705529062328897536 Thu Mar 03 23:03:31 +0000 2016
5 705503297952735232 Thu Mar 03 21:21:08 +0000 2016
6 703941373196529664 Sun Feb 28 13:54:36 +0000 2016
tweet_text
                                    how does anyone move in manhattan like ever? this is so expensive and hard to find a
not-shithole :0
2 The rent that this Manhattan office asked in January hit a record high. #nyrealestate https://t.co/TKuLG2BKth https:/
/t.co/t7Cx61rGrV
                         RT @archangelcrew: Fiddler On The High Rent District Roof (Manhattan Beach Opening only) #Rejec
tedBroadwayPlays
                                 Most Expensive Residence in #Manhattan - Penthouse at the #RitzCarlton #Serrini https:/
/t.co/ggfeIS5Xki
                    Smaller Manhattan #condos Keep Getting More Expensive https://t.co/kqCZTQFKgi via @CurbedNY https:/
/t.co/kEwuszPwqQ
                                            Fiddler On The High Rent District Roof (Manhattan Beach Opening only) #Rejec
tedBroadwayPlays
  tweet_favorite_count tweet_retweet_count
                                               user_id user_verified user_followers_count user_friends_count
                     0
                                            213180708
                                                               FALSE
2
3
                     0
                                          0 3418262054
                                                               FALSE
                                                                                       106
                                                                                                           533
                     0
                                              31589284
                                                               FALSE
                                                                                      1763
                                                                                                          2019
4
5
6
                     1
                                          0 2784747340
                                                                FALSE
                                                                                        24
                                                                                                            15
                     0
                                          0 126354240
                                                               FALSE
                                                                                       665
                                                                                                           744
                     1
                                          2 2728424702
                                                               FALSE
                                                                                      9322
                                                                                                          5836
                                            user_location data_location sentiment_buy_home sentiment_rent_apt
  user_listed_count user_statuses_count
1
                  2
                                                              Manhattan
                                                                                    Neutral
                                                                                                      Expensive
                                     162
                                                      nyc
2
                 17
                                     436
                                                              Manhattan
                                                                                    Neutral
                                                                                                      Expensive
3
                254
                                   19051
                                                 New York
                                                              Manhattan
                                                                                    Neutral
                                                                                                      Expensive
4
                 16
                                    1107
                                           the interwebs
                                                                                                      Expensive
                                                              Manhattan
                                                                                    Neutral
5
                 60
                                    5048 White Plains, NY
                                                              Manhattan
                                                                                    Neutral
                                                                                                        Neutral
                158
                                          Bakersfield, CA
                                                              Manhattan
                                                                                    Neutral
                                                                                                      Expensive
```

	tweet_favorite_cour	nt tweet_retweet_cou	nt	user_id ι	user_veri	fied	user_follo	owers_count user_fri	iends_count
2		0	1	2786669724		0		1366	343
3		0	0	4784683639		0		183	0
4		0	0	2868205074		0		141	0
5		0	1	480002469		0		536	2269
6		3	1	1797991		1		53080	5038
7		6	1	9917512		1		59095	185
	user_listed_count ι	iser_statuses_count		user_	location	data	_location	sentiment_buy_home	sentiment_rent_apt
2	52	8453		New	York, NY		brooklyn	Affordable	Affordable
3	142	42126					brooklyn	Affordable	Affordable
4	135	51553					brooklyn	Neutral	Neutral
5	26	8188	New	York Public	Library		brooklyn	Neutral	Neutral
6	1938	143		Broo	klyn, NY		brooklyn	Neutral	Neutral
7	1857	15681		New	York, NY		brooklyn	Affordable	Affordable

Step 3: Collective Analysis

In this step we will do collective analysis on tweets of all locations. For this we done simple aggregation based on these 4 criteria: -

- 1. How many users talk about buying home at a particular location in NYC?
- 2. How many users talk about renting an apartment?
- 3. How many of users think its expensive/affordable to rent an apartment?
- 4. How many of users think its expensive/affordable to buy a home?

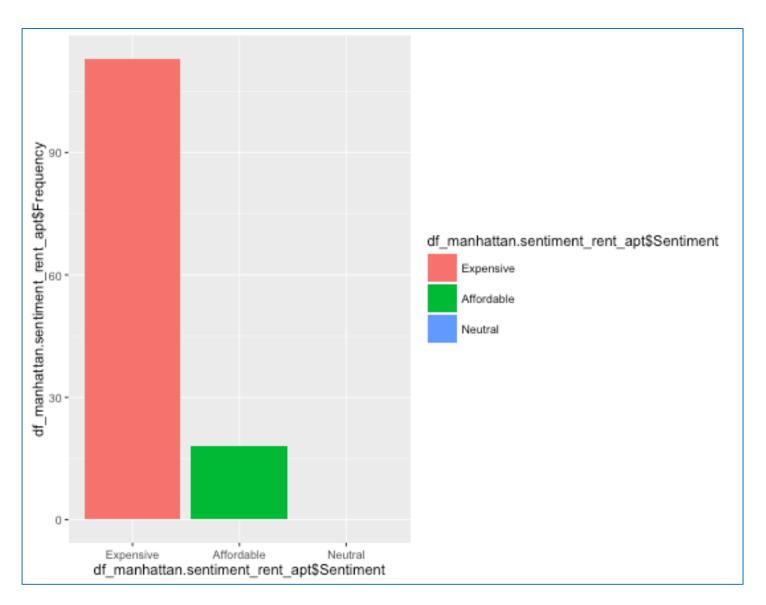
<u>Cumulative Sentiment Analysis</u>

> df_sentiment										
	location	<pre>freq_sentiment_buy_home</pre>	<pre>freq_sentiment_rent_apt</pre>							
1	Manhattan_Expensive	0		113						
2	M_Affordable	3		18						
3	M_Neutral	180		52						
4	Brooklyn_Expensive	0		49						
5	Br_Affordable	4		116						
6	Br_Neutral	238		77						
7	Bronx_Expensive	0		9						
8	B_Affordable	0		39						
9	B_Neutral	94		46						
10	Staten_Island_Expensive	0		1						
11	S_Affordable	0		0						
12	S_Neutral	17		16						

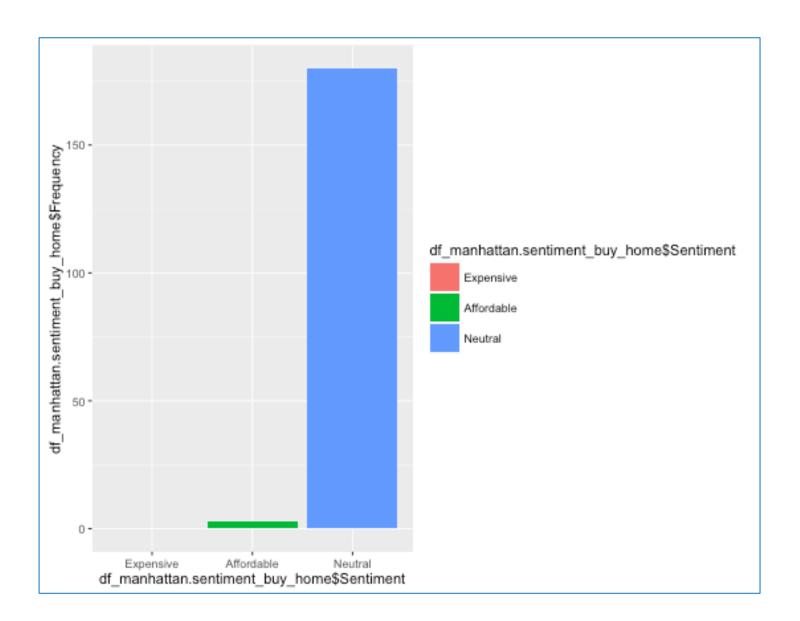
Step 4: Plotting Graphs

Now will backup our data and analysis by graphically

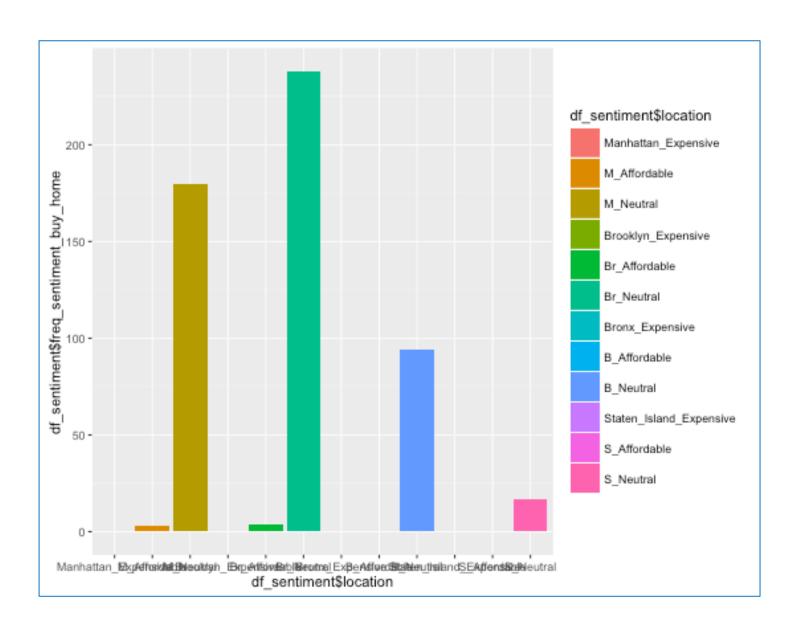
Graph on Users Sentiment on Renting an Apartment in Manhattan vs No. of users



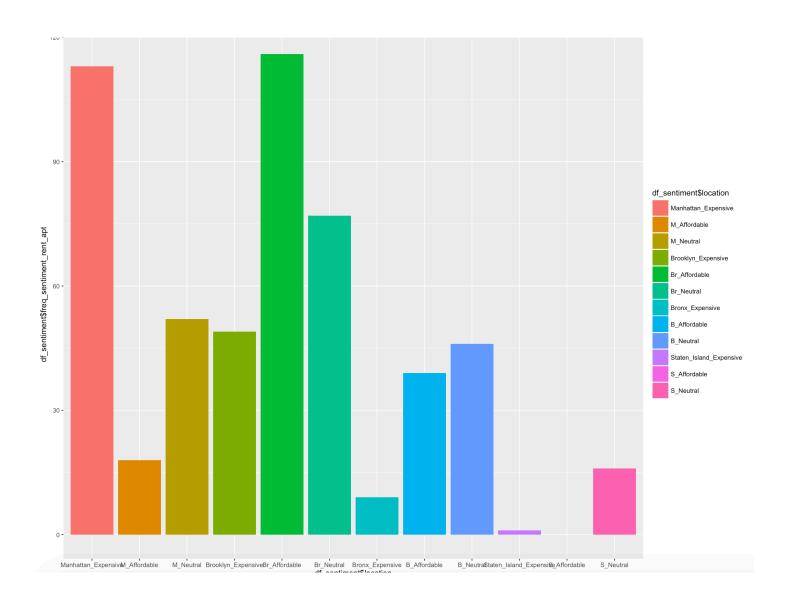
Graph on Users Sentiment on Buying home in Manhattan vs No. of users



Graph on Users Sentiment on buying home at different locations in NYC



Graph on Users Sentiment on Renting an Apartment at different locations in NYC



Results

After analyzing these graphs and watching users sentiments on Renting an Apartment in NYC vs. Buying a home, we came to know that more no. of users are talking about Renting an apartment.

This data was collected for 1 week and we can clearly see the results. Even if we have collected data over past 1 month or year we can easily figure out that more no. of people are towards renting instead of buying.

These graphs also talk about Cost of Living at particular location in NYC and the data support this claim. Based on our analysis we recommend CEO at Real Direct to consider offering Apartment Rentals as a product.