Data Driven Decision Making

Citi Bike Trip Histories

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List of the variables and their data types:

The dataset has fifteen variables:

- 1. Tripduration (number/numeric: in seconds)
- 2. Starttime (number/ Date and Time, date of number type)
- 3. Stoptime (number/ Date and Time, date of number type)
- 4. start station id (number/numeric)
- 5. start station name (text/string)
- 6. start station latitude (number/numeric)
- 7. start station longitude (number/numeric)
- 8. end station id (number/numeric)
- 9. end station name (text/string)
- 10. end station latitude (number/numeric)
- 11. end station longitude (number/numeric)
- 12. bikeid (number/numeric)
- 13. usertype (Customer = 24 hours pass or 03 days pass, Subscriber = Annual Membership)
- 14. birth year (number/numeric: in year)
- 15. gender (0=unknown, 1=male, 2=female)

Number of unique values in those fifteen variables:

Trip Duration: 12305
 Start Time: 37651
 Stop Time: 37770
 Start Station ID: 337
 Start Station Name: 337

6. Start Station Latitude: 3377. Start Station Longitude: 337

8. End Station ID: 3379. End Station Name: 33710. End Station Latitude: 337

11. End Station Longitude: 337

12. Bike ID: 5794

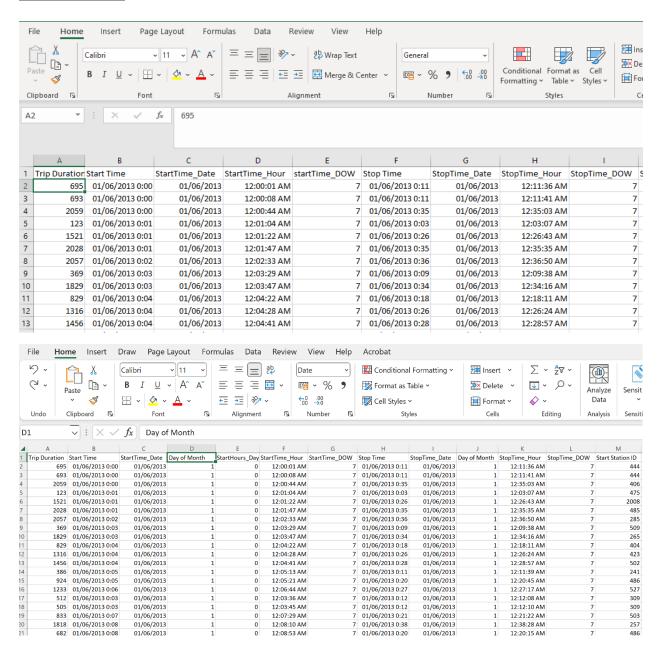
13. User Type: 02 (Subscriber = Annual Membership, Customer = 24 hours pass or 03 days

pass)

14. Year of Birth: 76

15. Gender: 03 (0=unknown, 1=male, 2=female)

Assignment 01:



Number of Missing data in the variables:

1. Trip Duration: 0

2. Start Time: 0

3. Stop Time: 0

4. Start Station ID: 0

5. Start Station Name:0

6. Start Station Latitude: 0

7. Start Station Longitude: 0

8. End Station ID: 18059

9. End Station Name: 18059

10. End Station Latitude: 18059

11. End Station Longitude: 18059

12. Bike ID : 0 13. User Type: 0

14. Year of Birth: 240321

15. Gender: 0

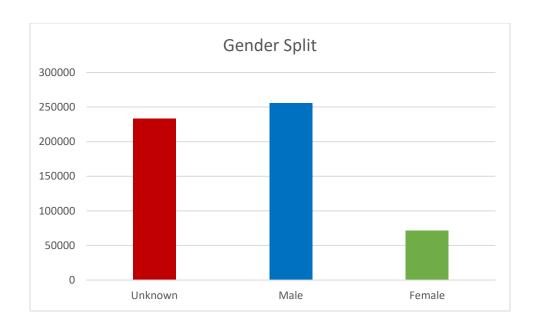
Dealing with Missing Values:

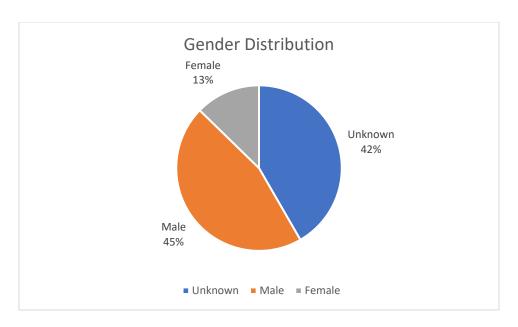
The missing values in End Station ID, End Station Name, End Station Latitude, End Station Longitude columns observations (18059) are only 3.1% of the total (577703) observations(rows). We can drop the rows with missing values. Now we have 559644 observations to work with. We can ignore the missing values of Year of Birth column (240321 which is 41.6% of the total observations) and can delete the entire column. Since we are not using this column (Year of Birth) values in this analyzing.

=FILTER(A2:T577704,(N2:N577704<>"NULL")+(O2:O577704<>"NULL")+(P2:P577704<>"NULL")+(Q2:Q577704<>"NULL"))

Gender Split:

Unknown	233215
Male	255339
Female	71090



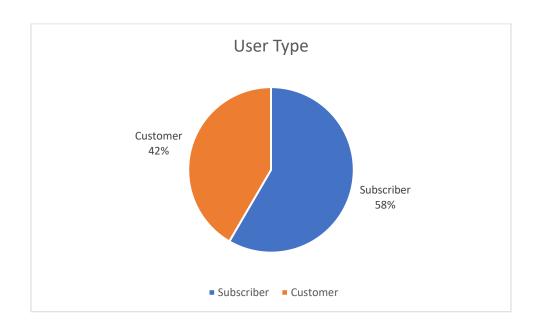


User Type Distribution:

There are 02 types of user:

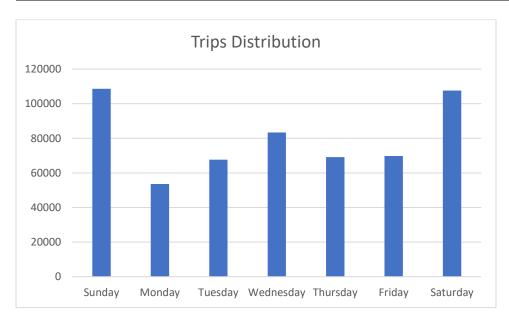
- 1. Subscriber = Annual Membership
- 2. Customer = 24 hours pass or 03 days pass

User Type					
Subscriber	326843				
Customer	232801				



Assignment 2:

Days of the week	Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
Total Rides	108576	53624	67659	83359	69142	69720	107564

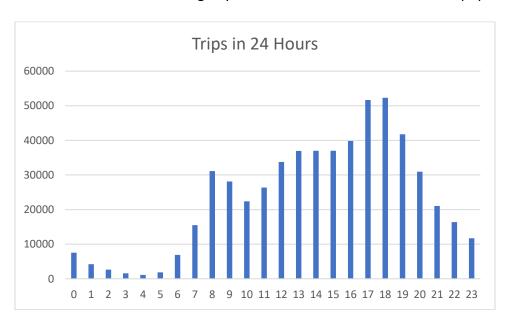


1. On which days of the week bike trips/rentals are the most popular?

Answer: Sunday is the most popular, then the second most popular is Saturday and Wednesday is the thirds most popular for bike rental.

- Weekends are more popular for bike riding than working days.
- 2. On which days of the week Citi bike rentals are least popular?

 Answer: Monday is the least popular. After that Tuesday, Thursday and Friday.
 - In the working days of the week bike rentals are least popular.



Hour	0	1	2	3	4	5	6	7	8	9	10	11
Trips	7528	4235	2664	1563	1133	1875	6884	15505	31105	28122	22379	26367

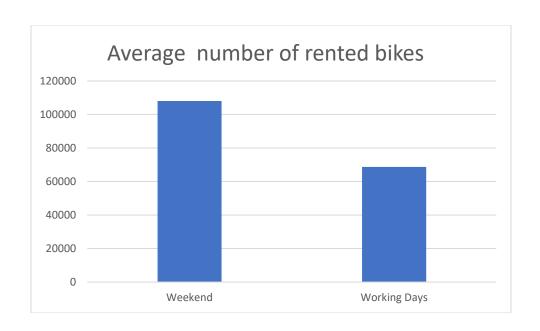
12	13	14	15	16	17	18	19	20	21	22	23
33753	36935	36980	36992	39829	51669	52300	41753	30951	21035	16383	11704

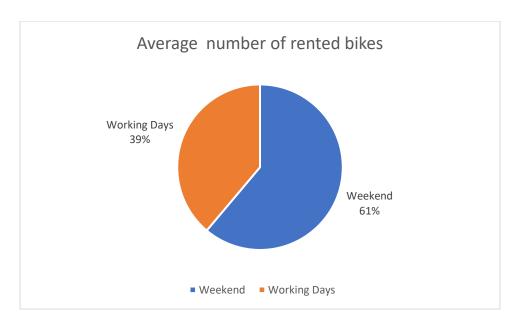
- 3. During which hours of the day Citi bike rentals are most popular?

 Answer: Between 16 and 19 Hours (04:00 PM to 07:00 PM) the bike rentals are most popular.
- 4. During which hours of the day Citi bike rentals are least popular?

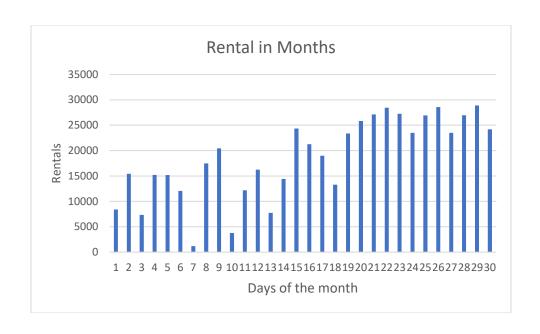
 Answer:0 to 6 Hours (Between 00.00 hrs to 06:00 AM) bike rentals are least popular.
- 5. A comparison between the average number of rented Citi bikes on the working days and the average number of rented Citi bikes during the weekend of the week.
- 6. Answer:

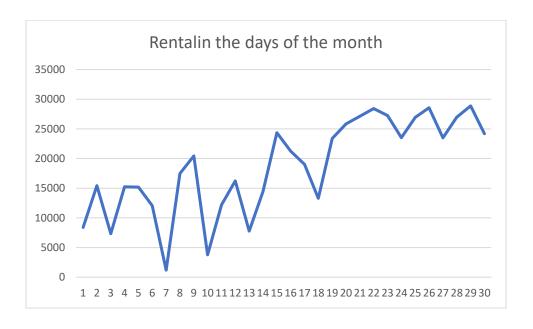
Average number of rented bikes on Weekend	108070
Average number of rented bikes on Working days	68701



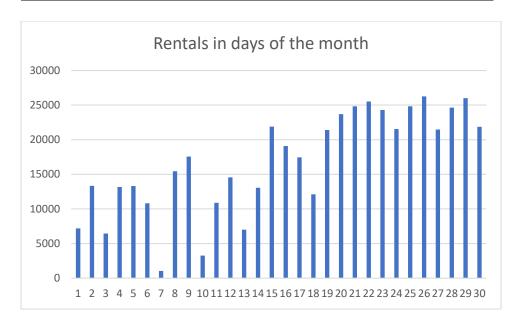


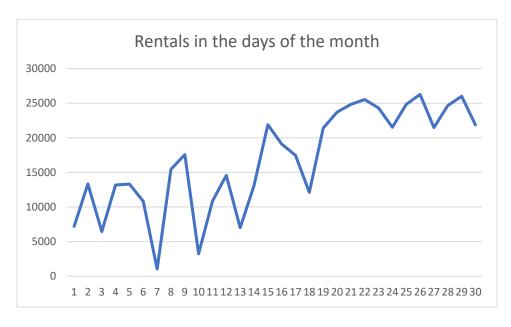
Before removing Outliers:





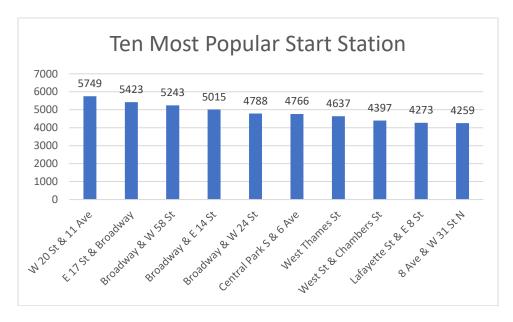
After removing the outliers By 5th percentile and 95th percentile values:





1. The Ten most popular start stations for Citi bike rentals: Answer:

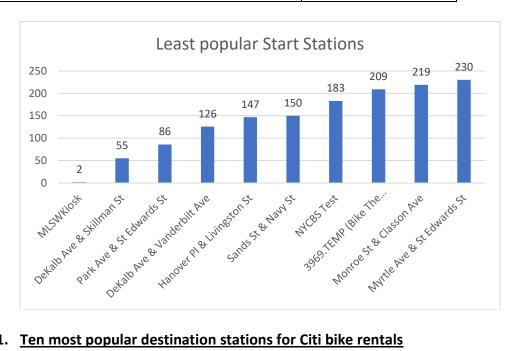
Name of the start stations	Total Rental
W 20 St & 11 Ave	5749
E 17 St & Broadway	5423
Broadway & W 58 St	5243
Broadway & E 14 St	5015
Broadway & W 24 St	4788
Central Park S & 6 Ave	4766
West Thames St	4637
West St & Chambers St	4397
Lafayette St & E 8 St	4273
8 Ave & W 31 St N	4259



The Ten least popular start stations for Citi bike rentals:

Answer:

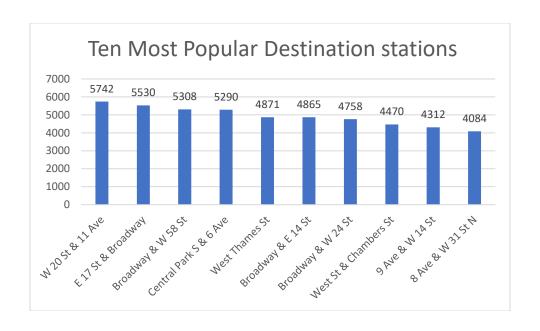
Name of the Start Station	Total number of rides
MLSWKiosk	2
DeKalb Ave & Skillman St	55
Park Ave & St Edwards St	86
DeKalb Ave & Vanderbilt Ave	126
Hanover PI & Livingston St	147
Sands St & Navy St	150
NYCBS Test	183
3969.TEMP (Bike The Branches - Central Branch)	209
Monroe St & Classon Ave	219



1. Ten most popular destination stations for Citi bike rentals

Answer:

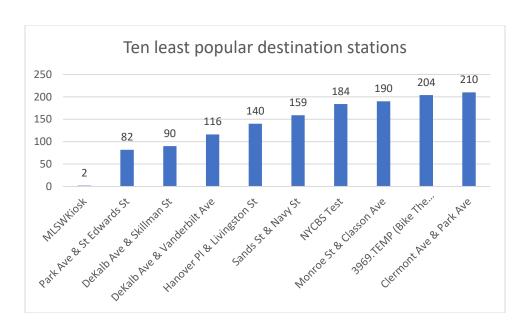
Name of the End Station	Total number of rides
W 20 St & 11 Ave	5742
E 17 St & Broadway	5530
Broadway & W 58 St	5308
Central Park S & 6 Ave	5290
West Thames St	4871
Broadway & E 14 St	4865
Broadway & W 24 St	4758
West St & Chambers St	4470
9 Ave & W 14 St	4312
8 Ave & W 31 St N	4084



2. Ten least popular destination stations for Citi bike rentals

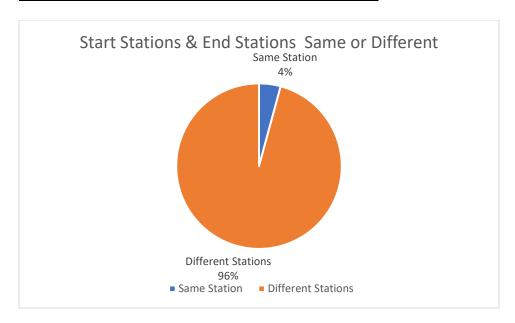
Answer:

Name of the Destination station	Number of rides
MLSWKiosk	2
Park Ave & St Edwards St	82
DeKalb Ave & Skillman St	90
DeKalb Ave & Vanderbilt Ave	116
Hanover PI & Livingston St	140
Sands St & Navy St	159
NYCBS Test	184
Monroe St & Classon Ave	190
3969.TEMP (Bike The Branches - Central Branch)	204
Clermont Ave & Park Ave	210



3. Are the start stations and the destination stations usually being the same or different? Answer:

Same Station	23624
Different Stations	536020



Assignment 3:

Before removing Outliers:

Before removing Outliers:	Trip Duration
Count	559644

Min	61
Max	3876479
Range	3876418
Mean	1371.34829
Median	874
Mode	547
stdev(σ)	9118.59798
Q1	514
Q3	1398

1. What are the most frequent ride durations?

Answer: Between 400 to 650 Seconds

2. What are the mean value and median value of the distribution of Citi bike trip durations?

Answer:

Mean = 1371 (around) and Median = 874

But, After removing Outliers by Z-score (>3 and <-3), Mean (around)= 1147, Median=871

- The mean is greater than the median.
- The Trip Duration distribution is right-skewed.
- 3. What Citi bike trip durations fall within 1 standard deviation from the mean value? Answer:

Values fall within one standard deviation from the mean value = From (Mean- Standard Deviation) to (Mean + Standard Deviation)

Before removing outliers,

Mean-SD	-7747.25
Mean+SD	10489.95

Our minimum Trip Durations is 61 Seconds. So, 61 to Mean+SD = 10489 seconds fall within one standard deviation from the mean value.

After removing outliers:

Mean -SD	-267
Mean +SD	2560

But, our minimum Trip Durations is 61 Seconds. So, 61 to 2560 seconds fall within one standard deviation from the mean value.

After removing outliers by 5th percentile and 95th percentile:

Mean	980
Standard Deviation	528
Mean-SD	452
Mean+SD	1433

From 452 to 1433 seconds fall with in the 1 standard deviation from the mean value.

4. What are the percentiles of the trip durations at the levels of 5%, 25%, 50%, 75% and 95%?

Before removing the Outliers Trip Durations:

Trip Duration	
5th percentile	237
25th percentile	514
50th percentile	874
75th percentile	1398
95th percentile	2545

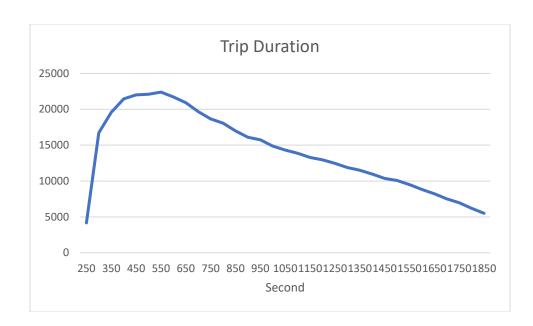
After removing the Outliers Trip Durations:

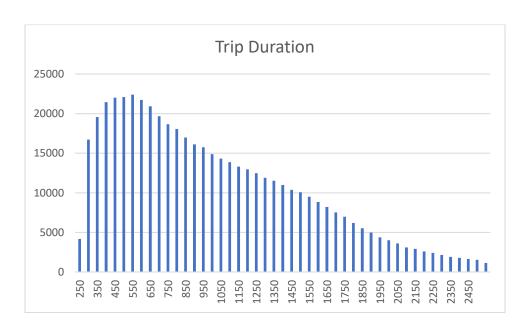
5th percentile	237
25th percentile	513
50th percentile	871
75th percentile	1393
95th percentile	2487

5. What is the shape of the distribution of Citi bike trip duration, i.e. is it symmetric or skewed?

Answer: It is not symmetric.

- The Trip Duration distribution is right-skewed.
- In Trip Duration variable, the mean is greater than the median.





6. What is the skewness coefficient of the distribution of Citi bike trip duration? Answer: 0.71 (around)

SKEW.P_Duration 0.711250943

- The positive value of skewness coefficient means right (or positive) skewness.
- 7. What is the relation between the mean and the median of the distribution of Citi bike ride duration? How does it relate to the assessment of the skewness of the distribution? Answer:

In Trip Duration distribution, the is Mean greater than Median value (Mean>Median).

- In positive skewness (Right Skewness): Mean>Median.
- In negative skewness (Left Skewness): Mean<Median
- 8. Which statistic, mean or median, better represents the central tendency of the distribution of the ride duration?

Answer:

Median. Because The Trip Duration distribution is Skewed. Mean is better for mostly symmetrical distributions and if they have no outliers.

9. Does the distribution of ride duration look like a normal distribution? Answer: No, the Trip Duration distribution is right-skewed.

Find the outliers of the ride duration variable using:

The z-score method:

If the z-score value is > 3 or <-3 , I consider the value as an outliers, There are 1616 Trips Duration values out of 559645 where the Z-score is >3. But no Trip duration Z-score is <3.

Number of Trip Duration where Z-score<-3	0
Number of Trip Duration where Z-score >3	1616

Number of outliers observations by using Z-score are 1616.

After removing Outliers	Trip Duration
Count	558028
Min	61
Max	28707
Range	28646
Mean	1146.575439
Median	871
Mode	547
Stdev (σ)	1413.104036
Q1	513
Q3	1393
5th percentile	237
25th percentile	513
50th percentile	871
75th percentile	1393
95th percentile	2487

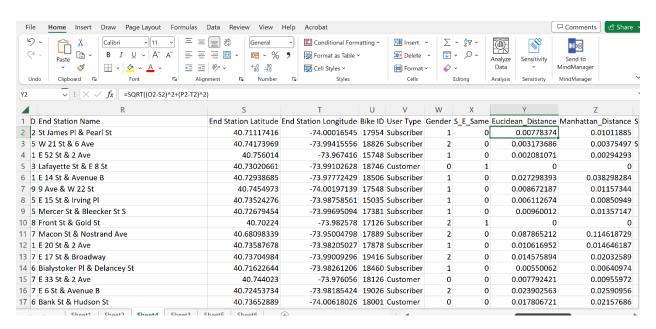
After Removing of the outliers observations by 05th percentile and 95th percentile:

Min	237
Max	2545
Range	2308
Mean	980
Median	873
Mode	547
STDEV:P	528
Mean-SD	452
Mean+SD	1433

Assignment 4:

Euclidean_Distance =SQRT((O2-S2)^2+(P2-T2)^2) and so on =SQRT((O503963-S503963)^2+(P503963-T503963)^2)

Manhattan_Distance: =ABS(O2-S2)+ABS(P2-T2)
And so on =ABS(O503963-S503963)+ABS(P503963-T503963)



After removing Outliers by using 5th percentile and 95th Percentile.

	Euclidean_Distince		Manhattan_Distince
Count	503962	Count	503962
Min	0	Min	0
Max	0.127477218	Max	0.169626
Range	0.127477218	Range	0.169626
Mean	0.022120532	Mean	0.028249373
Median	0.018657859	Median	0.02365919
Mode	0	Mode	0
stdev(σ)	0.015258803	stdev(σ)	0.019539297
Q1	0.010897601	Q1	0.01379603
Q3	0.029904661	Q3	0.038350148
5th percentile	0.004169926	5th percentile	0.00511489
25th percentile	0.010897601	25th percentile	0.01379603
50th percentile	0.018657859	50th percentile	0.02365919
75th percentile	0.029904661	75th percentile	0.038350148
95th percentile	0.052588522	95th percentile	0.06727859

- Manhattan Distance is more practical to measure ride distances is New York Citi bike ride.
- 1. What are the most frequent ride distances?
 Answer: From 0.01 to 0.02 (Manhattan Distance)
- 2. What are the mean and median values of the distribution of ride distances? Answer: Mean=0.028249373, Median=0.02365919 (Manhattan Distance)
- 3. What ride distances fall within the one standard deviation from the mean value? Answer:

Values fall within one standard deviation from the mean value = From (Mean-Standard Deviation) to (Mean + Standard Deviation). From 0.00871 to 0.047789

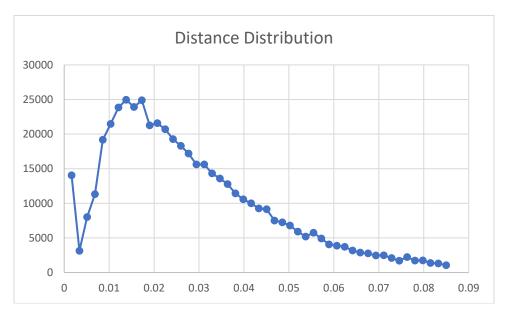
Mean-SD	0.00871
Mean+SD	0.047789

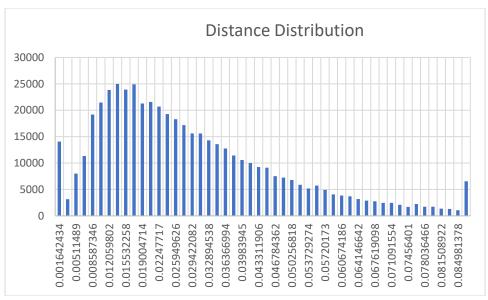
4. What are the percentiles of the ride distance at the level of 5%, 25%, 50%, 75% and 95%?

Answer: (For Manhattan Distance)

5th percentile	0.00511489
25th percentile	0.01379603
50th percentile	0.02365919
75th percentile	0.038350148
95th percentile	0.06727859

5. What is the shape of the distribution of the ride distance, i.e. is it symmetric or skewed? Answer: Not symmetric. It is right (Positive) skewed.





4. What is the skewness coefficient of the distribution of the ride distance? Answer: 1.19780466

7. What is the relation of the mean and median of the distribution of ride distance? How does it relate to the assessment of the skewness of the distribution?

Answer: In Citi bike ride distance distribution, the Mean is greater than Median value (Mean>Median). Mean=0.028249373, Median=0.02365919

- In positive skewness (Right Skewness): Mean>Median.
- In negative skewness (Left Skewness): Mean<Median
- 8. Which statistic mean or median better represents the central tendency of the distribution of distance?

Answer:

Median. Because The distribution of distance is Skewed. Mean is better for mostly symmetrical distributions and if they have no outliers.

9. Does the distribution of ride distance look like a normal distribution? Answer:

No, the distribution of distance is right-skewed.

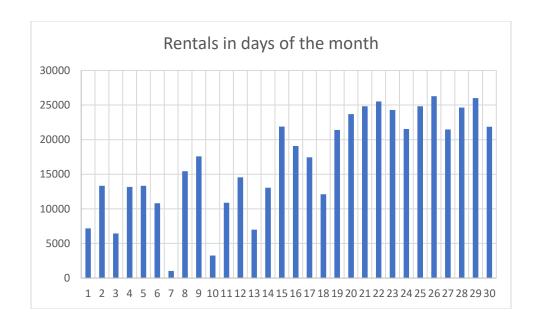
A Comparison between the Euclidean and Manhattan distance metrics:

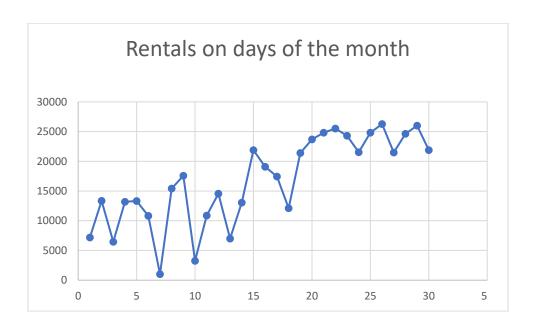
	Euclidean Distance		Manhattan Distance
Count	503962	Count	503962
Min	0	Min	0
Max	0.127477218	Max	0.169626
Range	0.127477218	Range	0.169626
Mean	0.022120532	Mean	0.028249373
Median	0.018657859	Median	0.02365919
Mode	0	Mode	0
stdev(σ)	0.015258803	stdev(σ)	0.019539297
Q1	0.010897601	Q1	0.01379603
Q3	0.029904661	Q3	0.038350148
5th percentile	0.004169926	5th percentile	0.00511489
25th percentile	0.010897601	25th percentile	0.01379603
50th percentile	0.018657859	50th percentile	0.02365919
75th percentile	0.029904661	75th percentile	0.038350148
95th percentile	0.052588522	95th percentile	0.06727859

Assignment 6:

Predicting the number of Trips for the first 07 days of the July 2013:

Day	Rentals
1	7187
2	13344
3	6446
4	13176
5	13322
6	10813
7	1028
8	15433
9	17578
10	3247
11	10875
12	14563
13	6998
14	13058
15	21882
16	19088
17	17447
18	12109
19	21411
20	23697
21	24826
22	25522
23	24295
24	21534
25	24829
26	26271
27	21472
28	24636
29	26004
30	21871



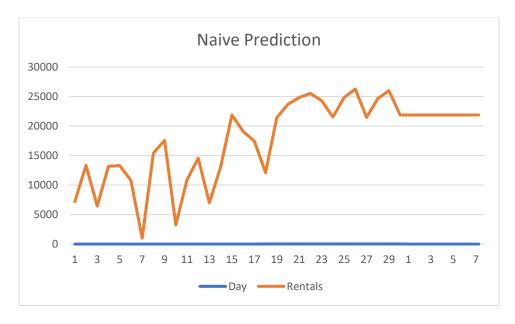


A naïve prediction:

In naïve prediction method, in a series of data, the last known observation is consider as the predictive value till the end of the future value. Here the last known value is 30 June 2013= 21871. So for the Forecasting number of Trips for the first seven days of the July 2013 will be 21871.

Date	Rentals
------	---------

26271
21472
24636
26004
21871
21871
21871
21871
21871
21871
21871
21871

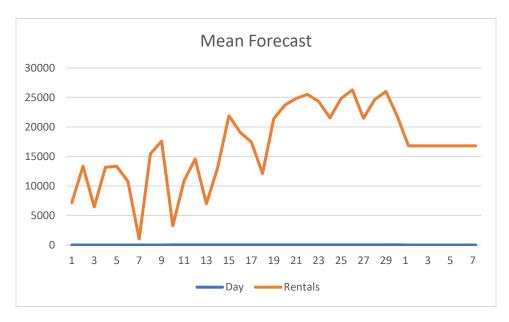


Mean forecast:

In Mean or Average forecast method, in the series of data, the average value of the known observations (historical data) is considere as the predictive value till the end of the future values. Therefore, for the forecasting number of Trips for the first seven days of the July 2013 will be 16799 (around).

Date	Rentals	
26 June 2013	26271	
27 June 2013	21472	
28 June 2013	24636	
29 June 2013	26004	
30 June 2013	21871	
01 July 2013	16799	

02 July 2013	16799
03 July 2013	16799
04 July 2013	16799
05 July 2013	16799
06 July 2013	16799
07 July 2013	16799

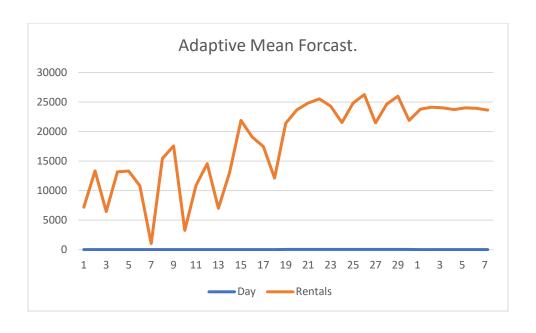


Adaptive mean forecast:

An adaptive mean forecast or rolling average forecast, takes the average value of the last k number of values to predict the future value.

By taking the average of the last 07 observations.

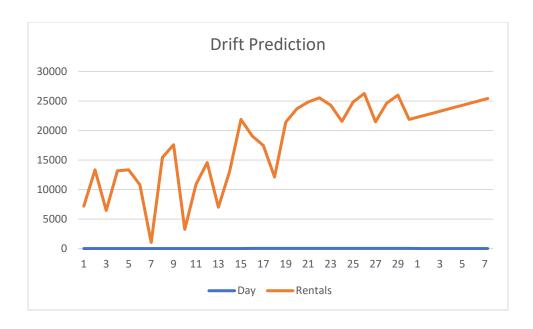
Date	Rentals
26 June 2013	26271
27 June 2013	21472
28 June 2013	24636
29 June 2013	26004
30 June 2013	21871
01 July 2013	23802
02 July 2013	24126
03 July 2013	24026
04 July 2013	23705
05 July 2013	24024
06 July 2013	23937
07 July 2013	23642



A drift prediction:

Answer: for the 01 July 2013 the formula was =\$B\$60+(\$B\$60-\$B\$31)/(30-1) and of the 07 July 2013 the formula was =\$B\$60+7*(\$B\$60-\$B\$31)/(30-1)

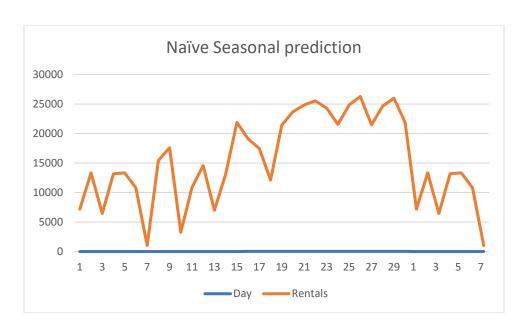
Date	Rentals
26 June 2013	26271
27 June 2013	21472
28 June 2013	24636
29 June 2013	26004
30 June 2013	21871
01 July 2013	22377
02 July 2013	22884
03 July 2013	23390
04 July 2013	23896
05 July 2013	24403
06 July 2013	24909
07 July 2013	25415



Naïve seasonal prediction:

Answer: In data, where there is a visible seasonal pattern, it forecast by taking the data form the history of the same point (past) of the season.

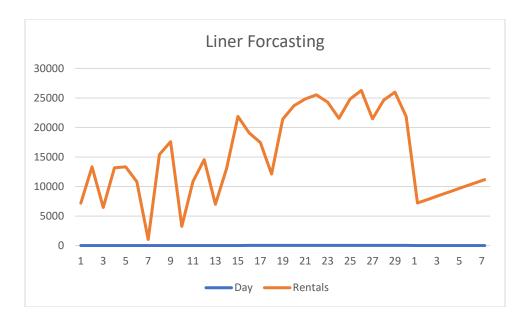
Day	Known Rentals	Day	Forecasting Rentals
01 June 2013	7187	01 July 2013	7187
02 June 2013	13344	02 July 2013	13344
03 June 2013	6446	03 July 2013	6446
04 June 2013	13176	04 July 2013	13176
05 June 2013	13322	05 July 2013	13322
06 June 2013	10813	06 July 2013	10813
07 June 2013	1028	07 July 2013	1028



Assignment 7:

<u>A linear trend:</u> By using FORECAST.LINEAR(x, known_y's, known_x's) function.

Date	Rentals
26 June 2013	26271
27 June 2013	21472
28 June 2013	24636
29 June 2013	26004
30 June 2013	21871
01 July 2013	7209
02 July 2013	7870
03 July 2013	8532
04 July 2013	9193
05 July 2013	9854
06 July 2013	10516
07 July 2013	11177



An exponential trend:

1	7187	
2	13344	
3	6446	
4	13176	
5	13322	
6	10813	
7	1028	
8	15433	
9	17578	
10	3247	
11	10875	
12	14563	
13	6998	
14	13058	
15	21882	
16	19088	
17	17447	
18	12109	
19	21411	
20	23697	
21	24826	
22	25522	
23	24295	
24	21534	
25	24829	

26	26271			
27	21472			
28	24636			
29	26004			
30	21871	21871	21871.00	21871.00
31		27031.45547	18502.75	35560.16
32		27693.27442	19164.53	36222.02
33		28355.09337	19826.28	36883.91
34		29016.91232	20487.99	37545.83
35		29678.73126	21149.66	38207.81
36		30340.55021	21811.27	38869.83
37		31002.36916	22472.81	39531.93
38		31664.1881	23134.29	40194.09

