

## Case Study 1: How Does a Bike-Share Navigate Speedy Success?

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Google Data Analytics Professional Certificate

Cyclistic is a fictional bike-share company in Chicago. The company wants to maximize the number of annual memberships and therefore wants to understand how do annual members and casual riders use Cyclistic bikes differently?

### STEP 1: ASK

Business Task (What is the problem you are trying to solve?)

How do annual members and casual riders use Cyclistic bikes differently?

Key Stakeholders

Lily Moren, director of marketing and manager

Cyclistic executive teams

How can your insights drive business decisions?

My insights will help the marketing team design marketing strategies aimed at converting casual riders into annual members.

### STEP 2: PREPARE

- Where is your data located? The data has been made available by Motivate International Inc.
- How is the data organized? The data is organized by trip by quarter up to 2020 and then we get monthly data files up to July 2023. For each trip, we have the start and end time, the bike ID, the bike type, the starting location and ending location (with latitude and longitude) and the usertype (casual or member).
- Are there issues with bias or credibility in this data? Does your data ROCCC? There doesn't seem to be any issues with bias or credibility in this data. The data is reliable, original, comprehensive, current and cited.
- How are you addressing licensing, privacy, security, and accessibility? The data was made available under the divvybikes.com data license agreement.

- How did you verify the data's integrity? I went to the source and verified that the source was credible.
- Are there any problems with the data? Some end times are before the start times. Some locations are missing.

We can filter the data by the customer vs subscriber and analyze the difference in number of trips, trip durations, genders and ages.

### STEP 3: PROCESS

- What tools are you choosing and why? I am choosing to work in R since it is a very large dataset, but I will do some data manipulation in Excel and use Tableau for visualizations.

#### Data cleaning & wrangling

##### Microsoft Excel

1. First made a copy of the original data before wrangling.
2. Changed the format of started\_at and ended\_at columns to Custom: yyyy-mm-dd h:mm:ss
3. Created a column named trip\_duration by subtracting started\_at from ended\_at (=D2-C2) and then changed the format to hh:mm:ss.
4. Checked for the largest and smallest value to make sure there are no negative values and no values greater than 24 hours. There are 0 values for trip duration where the start time equals the end time. There are also some negative values, the end start is before the start time, this could be a user error. Since we have so many values in each monthly dataset (over 700,000), we will remove those entries.

Data File	Original number of entries	Negative trip_duration entries removed
July 2023	767,650	30
June 2023	719,618	7
May 2023	604,827	10
April 2023	426,590	4
March 2023	258,678	0
February 2023	190,545	1
January 2023	190,301	
December 2022	181,806	
November 2022	337,735	41
October 2022	558,685	4
September 2022	701,339	9
August 2022	785,932	11

Trips that span over multiple days.

5. Created a date column (=DATE(YEAR(C2),MONTH(C2),DAY(C2)))
6. Created a month column and converted it to number (=VALUE(MONTH(O2)))

7. Created a quarter column  
(=IFS(OR(P2=1,P2=2,P2=3),"Q1",OR(P2=4,P2=5,P2=6),"Q2",OR(P2=7,P2=8,P2=9),"Q3",OR(P2=10,P2=11,P2=12),"Q4"))
8. Created a day column for the day of the week (=WEEKDAY(O2,1). 1 refers to Sunday and 7 to Saturday.

Moving to RStudio and converting script to RMarkdown

# First load and install the necessary packages

```
install.packages("tidyverse")
```

```
library(tidyverse)
```

```
library(janitor)
```

```
library(ggmap)
```

```
library(geosphere)
```

```
library(lubridate)
```

# Import the data

```
jul23 <- read.csv("202307-divvy-tripdata.csv")
```

```
jun23 <- read.csv("202306-divvy-tripdata.csv")
```

```
may23 <- read.csv("202305-divvy-tripdata.csv")
```

```
apr23 <- read.csv("202304-divvy-tripdata.csv")
```

```
mar23 <- read.csv("202303-divvy-tripdata.csv")
```

```
feb23 <- read.csv("202302-divvy-tripdata.csv")
```

```
jan23 <- read.csv("202301-divvy-tripdata.csv")
```

```
dec22 <- read.csv("202212-divvy-tripdata.csv")
```

```
nov22 <- read.csv("202211-divvy-tripdata.csv")
```

```
oct22 <- read.csv("202210-divvy-tripdata.csv")
```

```
sep22 <- read.csv("202209-divvy-publictripdata.csv")
```

```
aug22 <- read.csv("202208-divvy-tripdata.csv")
```

# Combining data frames with same column name

```
# We will only take the most 3 recent datasets as the data is too big
```

```
cyclistic_3months <- rbind(jul23, jun23, may23)
```

```
cyclistic <- rbind(jul23, jun23, may23, apr23, mar23, feb23, jan23, dec22, nov22, oct22, sep22, aug22)
```

```
head(cyclistic)
```

```
> head(cyclistic)
```

	ride_id	rideable_type	started_at	ended_at
1	9340B064F0AEE130	electric_bike	2023-07-23 20:06:14	2023-07-23 20:22:44
2	D1460EE3CE0D8AF8	classic_bike	2023-07-23 17:05:07	2023-07-23 17:18:37
3	DF41BE31B895A25E	classic_bike	2023-07-23 10:14:53	2023-07-23 10:24:29
4	9624A293749EF703	electric_bike	2023-07-21 8:27:44	2023-07-21 8:32:40
5	2F68A6A4CDB4C99A	classic_bike	2023-07-08 15:46:42	2023-07-08 15:58:08
6	9AEE973E6B941A9C	classic_bike	2023-07-10 8:44:47	2023-07-10 8:49:41

	trip_duration	start_station_name	start_station_id
1	00:16:30	Kedzie Ave & 110th St	20204
2	00:13:30	Western Ave & Walton St	KA1504000103
3	00:09:36	Western Ave & Walton St	KA1504000103
4	00:04:56	Racine Ave & Randolph St	13155
5	00:11:26	Clark St & Leland Ave	TA1309000014
6	00:04:54	Racine Ave & Randolph St	13155

	end_station_name	end_station_id	start_lat	start_lng	end_lat
1	Public Rack - Racine Ave & 109th Pl	877	41.69241	-87.70091	41.69483
2	Milwaukee Ave & Grand Ave	13033	41.89842	-87.68660	41.89158
3	Damen Ave & Pierce Ave	TA1305000041	41.89842	-87.68660	41.90940
4	Clinton St & Madison St	TA1305000032	41.88411	-87.65694	41.88275
5	Montrose Harbor	TA1308000012	41.96709	-87.66729	41.96398
6	Sangamon St & Lake St	TA1306000015	41.88407	-87.65685	41.88578

	end_lng	member_casual	date	month	quarter	day
1	-87.65304	member	7/23/2023	7	Q3	1
2	-87.64838	member	7/23/2023	7	Q3	1
3	-87.67769	member	7/23/2023	7	Q3	1
4	-87.64119	member	7/21/2023	7	Q3	6

```
# We now have 5,723,489 observations with 18 variables. We can now start our analysis.
```

```
# Let's look at the structure of the data
```

```
str(cyclistic)
```

```
> str(cyclistic)
```

```
'data.frame': 5723489 obs. of 18 variables:
```

```
$ ride_id      : chr "9340B064F0AEE130" "D1460EE3CE0D8AF8" "DF41BE31B895A25E" "9624A293749EF703" ...
```

```
$ rideable_type: chr "electric_bike" "classic_bike" "classic_bike" "electric_bike" ...
```

```
$ started_at   : chr "2023-07-23 20:06:14" "2023-07-23 17:05:07" "2023-07-23 10:14:53" "2023-07-21 8:27:44" ...
```

```
$ ended_at     : chr "2023-07-23 20:22:44" "2023-07-23 17:18:37" "2023-07-23 10:24:29" "2023-07-21 8:32:40" ...
```

```
$ trip_duration: chr "00:16:30" "00:13:30" "00:09:36" "00:04:56" ...
```

```
$ start_station_name: chr "Kedzie Ave & 110th St" "Western Ave & Walton St" "Western Ave & Walton St" "Racine Ave & Randolph St" ...
```

```
$ start_station_id : chr "20204" "KA1504000103" "KA1504000103" "13155" ...
```

```
$ end_station_name : chr "Public Rack - Racine Ave & 109th Pl" "Milwaukee Ave & Grand Ave" "Damen Ave & Pierce Ave" "Clinton St & Madison St" ...
```

```
$ end_station_id   : chr "877" "13033" "TA1305000041" "TA1305000032" ...
```

```
$ start_lat        : num 41.7 41.9 41.9 41.9 42 ...
```

```
$ start_lng        : num -87.7 -87.7 -87.7 -87.7 -87.7 ...
```

```
$ end_lat          : num 41.7 41.9 41.9 41.9 42 ...
```

```
$ end_lng          : num -87.7 -87.6 -87.7 -87.6 -87.6 ...
```

```
$ member_casual    : chr "member" "member" "member" "member" ...
```

```
$ date             : chr "7/23/2023" "7/23/2023" "7/23/2023" "7/21/2023" ...
```

```
$ month            : int 7 7 7 7 7 7 7 ...
```

```
$ quarter          : chr "Q3" "Q3" "Q3" "Q3" ...
```

```
$ day             : int 1 1 1 6 7 2 3 6 3 7 ...
```

# We can see that the structure of started\_at, ended\_at & trip\_duration columns is character. We need to change is to the appropriate type.

```
cyclistic$started_at <- strptime(cyclistic$started_at, "%Y-%m-%d %H:%M:%S")
```

```
cyclistic$ended_at <- strptime(cyclistic$ended_at, "%Y-%m-%d %H:%M:%S")
```

```
cyclistic$trip_duration <- difftime(cyclistic$ended_at, cyclistic$started_at)
```

# Let's look at the structure of the data again

```
str(cyclistic)
```

```
> str(cyclistic)
'data.frame': 5723489 obs. of 18 variables:
 $ ride_id      : chr "9340B064F0AEE130" "D1460EE3CE0D8AF8" "DF41BE31B895A25E" "9624A293749EF703" ...
 $ rideable_type: chr "electric_bike" "classic_bike" "classic_bike" "electric_bike" ...
 $ started_at   : POSIXlt, format: "2023-07-23 20:06:14" "2023-07-23 17:05:07" ...
 $ ended_at     : POSIXlt, format: "2023-07-23 20:22:44" "2023-07-23 17:18:37" ...
 $ trip_duration: 'difftime' num 990 810 576 296 ...
 .. attr(*, "units")= chr "secs"
 $ start_station_name: chr "Kedzie Ave & 110th St" "western Ave & walton St" "western Ave & walton St" "Racine Ave & Randolph St" ...
 $ start_station_id : chr "20204" "KA1504000103" "KA1504000103" "13155" ...
 $ end_station_name : chr "Public Rack - Racine Ave & 109th Pl" "Milwaukee Ave & Grand Ave" "Damen Ave & Pierce Ave" "Clinton St & Madison St" ...
 $ end_station_id   : chr "877" "13033" "TA1305000041" "TA1305000032" ...
 $ start_lat        : num 41.7 41.9 41.9 41.9 42 ...
 $ start_lng        : num -87.7 -87.7 -87.7 -87.7 -87.7 ...
 $ end_lat          : num 41.7 41.9 41.9 41.9 42 ...
 $ end_lng          : num -87.7 -87.6 -87.7 -87.6 -87.6 ...
 $ member_casual   : chr "member" "member" "member" "member" ...
 $ date            : chr "7/23/2023" "7/23/2023" "7/23/2023" "7/21/2023" ...
 $ month           : int 7 7 7 7 7 7 7 7 ...
 $ quarter         : chr "q3" "q3" "q3" "q3" ...
 $ day            : int 1 1 1 6 7 2 3 6 3 7 ...
```

# Type of members vs casual

```
unique(cyclistic$member_casual)
```

```
[1] "member" "casual"
```

# Type of ride type

```
unique(cyclistic$rideable_type)
```

```
[1] "electric_bike" "classic_bike" "docked_bike"
```

# There are 3 different types of ride in our dataset: electric\_bike, classic\_bike and docked\_bike.

# Checking for duplicates, there are 95 duplicates

```
sum(duplicated(cyclistic$ride_id))
```

```
[1] 95
```

# Let's check again for trip\_duration that is negative

```
cyclistic <- cyclistic%>%
```

```
  distinct(ride_id, .keep_all = TRUE)%>%
```

```
filter(trip_duration > 0)
```

```
head(cyclistic)
```

	ride_id	rideable_type	started_at	ended_at
1	9340B064F0AEE130	electric_bike	2023-07-23 20:06:14	2023-07-23 20:22:44
2	D1460EE3CE0D8AF8	classic_bike	2023-07-23 17:05:07	2023-07-23 17:18:37
3	DF41BE31B895A25E	classic_bike	2023-07-23 10:14:53	2023-07-23 10:24:29
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5	2F68A6A4CDB4C99A	classic_bike	2023-07-08 15:46:42	2023-07-08 15:58:08
6	9AEE973E6B941A9C	classic_bike	2023-07-10 08:44:47	2023-07-10 08:49:41

	trip_duration	start_station_name	start_station_id
1	990 secs	Kedzie Ave & 110th St	20204
2	810 secs	Western Ave & Walton St	KA1504000103
3	576 secs	Western Ave & Walton St	KA1504000103
4	296 secs	Racine Ave & Randolph St	13155
5	686 secs	Clark St & Leland Ave	TA1309000014
6	294 secs	Racine Ave & Randolph St	13155

	end_station_name	end_station_id	start_lat	start_lng	end_lat
1	Public Rack - Racine Ave & 109th Pl	877	41.69241	-87.70091	41.69483
2	Milwaukee Ave & Grand Ave	13033	41.89842	-87.68660	41.89158
3	Damen Ave & Pierce Ave	TA1305000041	41.89842	-87.68660	41.90940
4	Clinton St & Madison St	TA1305000032	41.88411	-87.65694	41.88275
5	Montrose Harbor	TA1308000012	41.96709	-87.66729	41.96398
6	Sangamon St & Lake St	TA1306000015	41.88407	-87.65685	41.88578

	end_lng	member_casual	date	month	quarter	day
1	-87.65304	member	7/23/2023	7	Q3	1
2	-87.64838	member	7/23/2023	7	Q3	1
3	-87.67769	member	7/23/2023	7	Q3	1
4	-87.64119	member	7/21/2023	7	Q3	6
5	-87.63818	member	7/8/2023	7	Q3	7
6	-87.65102	member	7/10/2023	7	Q3	2

```
# Now let's remove those entries with no station info
```

```
cycli <- cyclistic%>%
```

```
drop_na()
```

```
nrow(cycli)
```

```
[1] 5516602
```

```
# We now have (5,516,602) rows. This is the data we will use to make analysis in Tableau.
```

```
write.csv(cycli, "cyclistic.csv")
```

```
write.table(cycli, "cyclistic.txt")
```

```
# Let's look at the number of rides per customer type.
```

```
ride_per_customer <- cycli%>%
  group_by(member_casual)%>%
  summarize(n=n())%>%
  mutate(percentage = n*100/sum(n))
view(ride_per_customer)
```

	member_casual	avg_trip_duration
1	casual	1330.8128
2	member	773.5653

```
ggplot(data = cycli, mapping= aes(x= member_casual, fill= member_casual)) + geom_bar() +
labs(title="No of Rides per Customer Type")
```

```
# Trip duration per customer type
cycli$trip_duration <- as.numeric(cycli$trip_duration)
trip_duration_per_customer <- cycli%>%
  group_by(member_casual)%>%
  summarize(avg_trip_duration = mean(trip_duration))
view(trip_duration_per_customer)
```

	member_casual	avg_trip_duration
1	casual	1227.9363
2	member	728.9206

```
# Ride Type per customer type
ridetype_per_customer <- cycli%>%
  group_by(member_casual, rideable_type)%>%
  summarize(n=n())%>%
  mutate(percentage = n*100/sum(n))
view(ridetype_per_customer)
```

	member_casual	rideable_type	n	percentage
1	casual	classic_bike	773729	36.503625
2	casual	docked_bike	124254	5.862158
3	casual	electric_bike	1221612	57.634218
4	member	classic_bike	1613939	47.510617
5	member	electric_bike	1783068	52.489383

head(cycli)

```
> head(cycli)
  ride_id rideable_type   started_at   ended_at trip_duration start_station_name start_station_id
1 9340B064F0AEE130 electric_bike 2023-07-23 20:06:14 2023-07-23 20:22:44      990   Kedzie Ave & 110th St      20204
2 D1460EE3CE0D8AF8 classic_bike 2023-07-23 17:05:07 2023-07-23 17:18:37      810 Western Ave & Walton St KA1504000103
3 DF41BE31B895A25E classic_bike 2023-07-23 10:14:53 2023-07-23 10:24:29      576 Western Ave & Walton St KA1504000103
4 9624A293749EF703 electric_bike 2023-07-21 08:27:44 2023-07-21 08:32:40      296 Racine Ave & Randolph St      13155
5 2F68A6A4CDB4C99A classic_bike 2023-07-08 15:46:42 2023-07-08 15:58:08      686   Clark St & Leland Ave TA1309000014
6 9AEE973E6B941A9C classic_bike 2023-07-10 08:44:47 2023-07-10 08:49:41      294 Racine Ave & Randolph St      13155
  end_station_name end_station_id start_lat start_lng end_lat end_lng member_casual date month quarter
1 Public Rack - Racine Ave & 109th Pl      877  41.69241 -87.70091 41.69483 -87.65304 member 7/23/2023 7 Q3
2 Milwaukee Ave & Grand Ave      13033 41.89842 -87.68660 41.89158 -87.64838 member 7/23/2023 7 Q3
3 Damen Ave & Pierce Ave TA1305000041 41.89842 -87.68660 41.90940 -87.67769 member 7/23/2023 7 Q3
4 Clinton St & Madison St TA1305000032 41.88411 -87.65694 41.88275 -87.64119 member 7/21/2023 7 Q3
5 Montrose Harbor TA1308000012 41.96709 -87.66729 41.96398 -87.63818 member 7/8/2023 7 Q3
6 Sangamon St & Lake St TA1306000015 41.88407 -87.65685 41.88578 -87.65102 member 7/10/2023 7 Q3
  day
1 1
2 1
3 1
4 6
5 7
6 2
```

View(cycli)



## TABLEAU

In Tableau, I created a new calculated field (trip duration in minutes) for easier visualization.

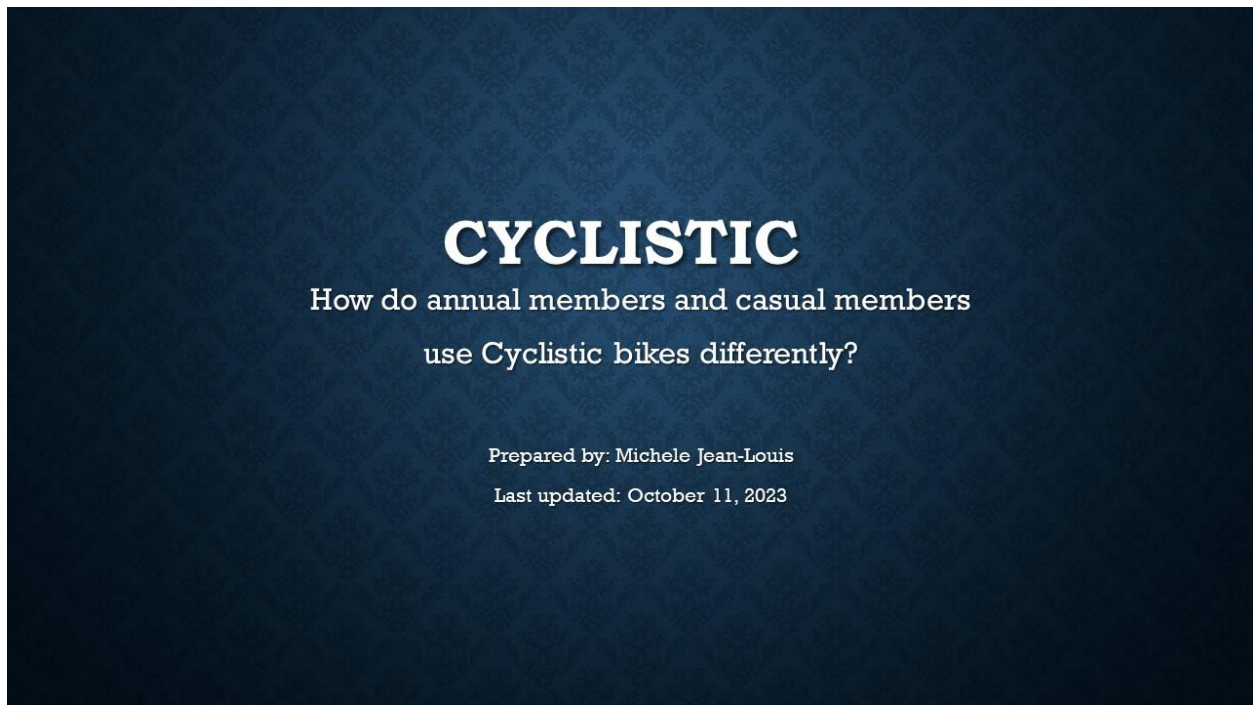
I created different plots in order to quickly view and understand the data.

## Report

You will produce a report with the following deliverables:

1. A clear statement of the business task
2. A description of all data sources used
3. Documentation of any cleaning or manipulation of data
4. A summary of your analysis
5. Supporting visualizations and key findings
6. Your top three recommendations based on your analysis

Here is the report:





How do annual members and casual riders use Cyclistic bikes differently?

## BUSINESS TASK

Cyclistic is a fictional bike-share company in Chicago. The company wants to maximize the number of annual memberships and therefore wants to understand how do annual members and casual riders use Cyclistic bikes differently?

My insights will help the marketing team design marketing strategies aimed at converting casual riders into annual members.

## Key Stakeholders

- Lily Moren, director of marketing and manager
- Cyclistic executive team

## DATA SOURCE

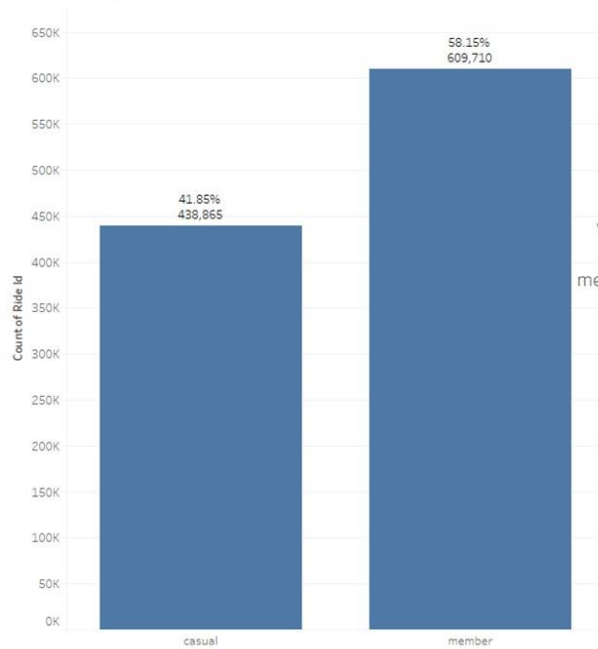
- The data has been made available by Motivate International Inc. under the [divvybikes.com](https://divvybikes.com) data license agreement.
- The data is organized by trip by quarter up to 2020 and then we get monthly data files up to July 2023. For each trip, we have the start and end time, the bike ID, the bike type, the starting location and ending location (with latitude and longitude) and the user type (casual or member).
- There doesn't seem to be any issues with bias or credibility in this data. The data is reliable, original, comprehensive, current and cited.

## DATA CLEANING AND MANIPULATION

- Formatted the `started_at` and `ended_at` columns
- Created a column `trip_duration` by subtracting `started_at` from `ended_at`
- Removed the negative `trip_durations`
- Filtered out duplicate `ride_id`
- Removed the entries with no station info
- Created a calculated field for `trip_durations` in minutes



No of Rides per Member vs Casual



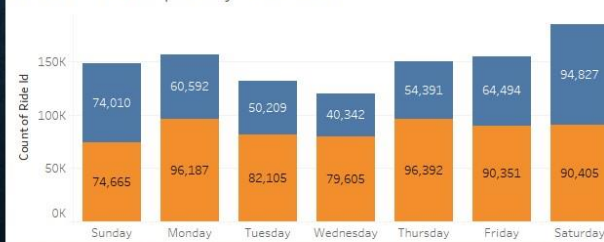
We can clearly that there are more members (subscribers).

Number of rides per day

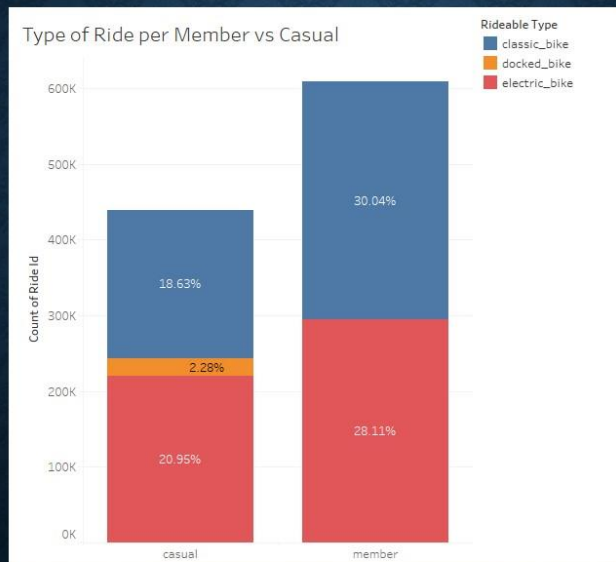


Even though there are more member rides, the difference is not huge.

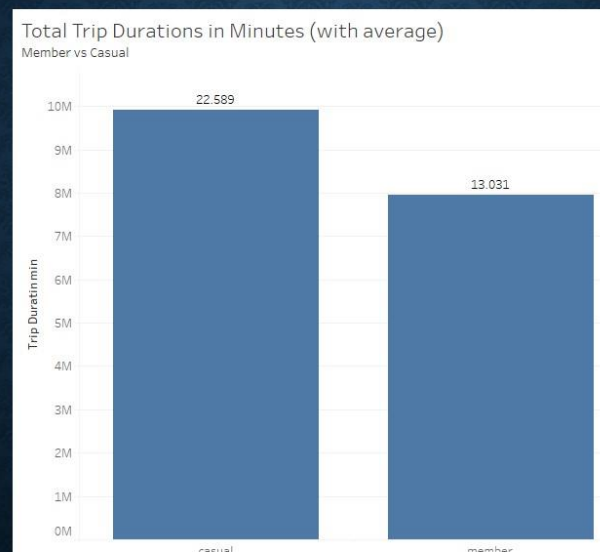
Number of rides per Day of the Week



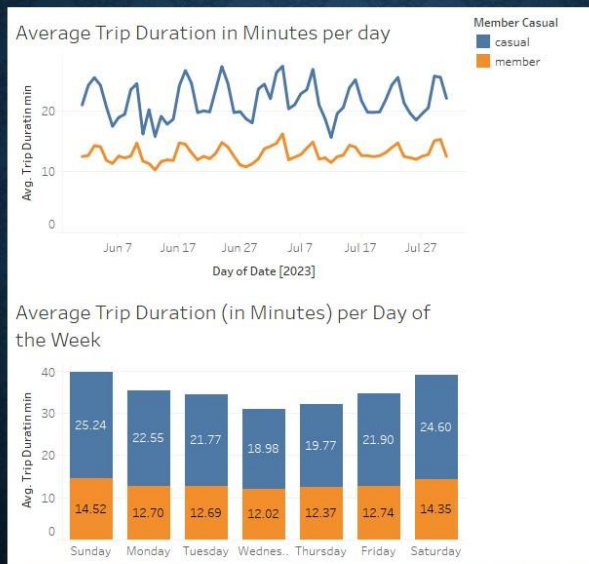
Number of member ride is uniform Monday through Saturday. Number of casual rides increases on weekends.



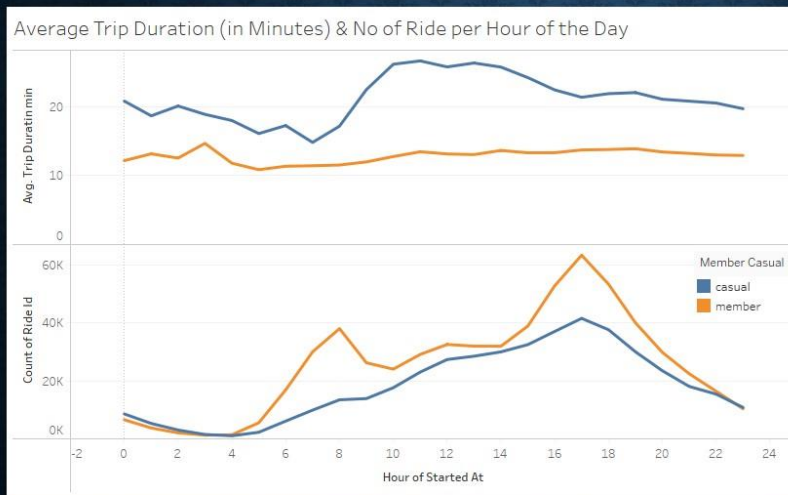
Members and casuals use the classic bike and the electric almost as much. Docked bike is rarely used and only by casual riders.



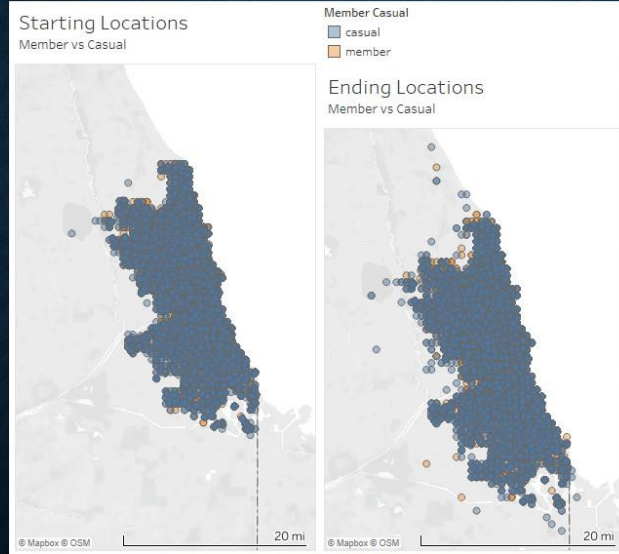
Casual riders tend to ride longer than members.



Whether by date or day of the week, casual rides duration are longer than member rides duration.



- The average trip duration is uniform for members throughout the data, but for casual riders the length of trips increase between 9AM and 5 PM.
- There is a peak in the number of rides for members at 8AM and 5PM which would indicate commute to and from work.
- For casual riders, the number of rides increases linearly from 5AM to 5PM and then decreases.



There doesn't seem to be a big distinction between starting and ending locations.

## Recommendations

Cyclistic should get rid of the docked bikes as it is not popular among riders.

In order to attract casual members to become members, Cyclistic should:

- offer discount for longer rides;
- offer discount for weekend rides;
- offer discounted prices during rush hour.

**Cyclistic can create marketing campaign geared towards weekend riders and commuters.**



## REFERENCES

- Tableau Dashboard:  
[https://public.tableau.com/app/profile/michele.jean.louis/viz/Cyclistic\\_16961906044630/Cyclistic?publish=yes](https://public.tableau.com/app/profile/michele.jean.louis/viz/Cyclistic_16961906044630/Cyclistic?publish=yes)
- GitHub: <https://github.com/michelejl/Cyclistic>
- LinkedIn: <https://www.linkedin.com/in/michelejeanolouis>



## Links

- Tableau Dashboard:  
[https://public.tableau.com/app/profile/michele.jean.louis/viz/Cyclistic\\_16961906044630/Cyclistic?publish=yes](https://public.tableau.com/app/profile/michele.jean.louis/viz/Cyclistic_16961906044630/Cyclistic?publish=yes)
- GitHub: <https://github.com/michelejl/Cyclistic>
- LinkedIn: <https://www.linkedin.com/in/michelejeanlouis>