Case_Study1

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Ask Phase

• Business task is to understand how annual members and casual riders use Cyclistic bikes differently

Prepare Phase

• To analyze the yearly trips from 2022 data has been downloaded from this link and has been made available by Motivate International Inc. under this licence.

Process Phase

Data will contain millions of rows and to process faster I used R.

Importing data to R

- Loading libraries
- Importing the cyclist data of 2022

```
jan_2022 <- read.csv("202201-divvy-tripdata.csv")
feb_2022 <- read.csv("202202-divvy-tripdata.csv")
mar_2022 <- read.csv("202203-divvy-tripdata.csv")
apr_2022 <- read.csv("202204-divvy-tripdata.csv")
may_2022 <- read.csv("202205-divvy-tripdata.csv")
jun_2022 <- read.csv("202206-divvy-tripdata.csv")
jul_2022 <- read.csv("202207-divvy-tripdata.csv")
aug_2022 <- read.csv("202208-divvy-tripdata.csv")
sep_2022 <- read.csv("202208-divvy-tripdata.csv")
oct_2022 <- read.csv("202209-divvy-publictripdata.csv")
nov_2022 <- read.csv("202211-divvy-tripdata.csv")
dec_2022 <- read.csv("202211-divvy-tripdata.csv")</pre>
```

- Comparing column names of each data to check if they match perfectly before joining them into a data frame.
- Creating the data frame with the monthly data.
- Dropping columns which will not be used
- Checking the new data frame.

Analyze Phase

• To further analyze the data adding date, weekday, month, and a ride length column.

```
#Adding a ride length column to analyze the duration of the rides in seconds
yearly_trips$ride_length <- difftime(yearly_trips$ended_at,yearly_trips$started_at)
yearly_trips$date <- as.Date(yearly_trips$started_at)
yearly_trips$month <- format(as.Date(yearly_trips$date), "%m")
yearly_trips$day_of_week <- format(as.Date(yearly_trips$date), "%A")</pre>
```

• Checking the created column

```
str(yearly_trips)
```

```
5667717 obs. of 13 variables:
## 'data.frame':
## $ ride id
                              "C2F7DD78E82EC875" "A6CF8980A652D272" "BD0F91DFF741C66D" "CBB80ED4191054
                              "electric_bike" "electric_bike" "classic_bike" "classic_bike" ...
## $ rideable_type
                       : chr
## $ started at
                       : chr
                              "2022-01-13 11:59:47" "2022-01-10 08:41:56" "2022-01-25 04:53:40" "2022-
                       : chr "2022-01-13 12:02:44" "2022-01-10 08:46:17" "2022-01-25 04:58:01" "2022-
## $ ended_at
## $ start_station_name: chr "Glenwood Ave & Touhy Ave" "Glenwood Ave & Touhy Ave" "Sheffield Ave & F
                              "525" "525" "TA1306000016" "KA1504000151" ...
## $ start_station_id : chr
                             "Clark St & Touhy Ave" "Clark St & Touhy Ave" "Greenview Ave & Fullerton
## $ end_station_name : chr
                              "RP-007" "RP-007" "TA1307000001" "TA1309000021" ...
## $ end_station_id
                       : chr
## $ member_casual
                       : chr
                              "casual" "casual" "member" "casual" ...
##
                       : 'difftime' num 177 261 261 896 ...
   $ ride_length
    ..- attr(*, "units")= chr "secs"
##
##
                       : Date, format: "2022-01-13" "2022-01-10" ...
   $ date
                              "01" "01" "01" "01" ...
## $ month
                       : chr
## $ day_of_week
                              "Thursday" "Monday" "Tuesday" "Tuesday" ...
```

head(yearly_trips, 10)

```
##
              ride_id rideable_type
                                             started_at
                                                                    ended_at
## 1 C2F7DD78E82EC875 electric bike 2022-01-13 11:59:47 2022-01-13 12:02:44
## 2 A6CF8980A652D272 electric bike 2022-01-10 08:41:56 2022-01-10 08:46:17
## 3 BD0F91DFF741C66D classic_bike 2022-01-25 04:53:40 2022-01-25 04:58:01
## 4 CBB80ED419105406 classic_bike 2022-01-04 00:18:04 2022-01-04 00:33:00
## 5 DDC963BFDDA51EEA classic_bike 2022-01-20 01:31:10 2022-01-20 01:37:12
## 6 A39C6F6CC0586C0B classic_bike 2022-01-11 18:48:09 2022-01-11 18:51:31
## 7 BDC4AB637EDF981B classic_bike 2022-01-30 18:32:52 2022-01-30 18:49:26
## 8 81751A3186E59A6B classic_bike 2022-01-22 12:20:02 2022-01-22 12:32:06
## 9 154222B86A338ABD electric_bike 2022-01-17 07:34:41 2022-01-17 08:00:08
## 10 72DC25B2DD467EEF classic_bike 2022-01-28 15:27:53 2022-01-28 15:35:16
##
                start_station_name start_station_id
                                                                  end_station_name
## 1
          Glenwood Ave & Touhy Ave
                                                 525
                                                              Clark St & Touhy Ave
## 2
          Glenwood Ave & Touhy Ave
                                                 525
                                                             Clark St & Touhy Ave
## 3 Sheffield Ave & Fullerton Ave
                                       TA1306000016 Greenview Ave & Fullerton Ave
                                       KA1504000151
## 4
          Clark St & Bryn Mawr Ave
                                                        Paulina St & Montrose Ave
## 5
       Michigan Ave & Jackson Blvd
                                       TA1309000002
                                                           State St & Randolph St
## 6
             Wood St & Chicago Ave
                                                 637
                                                          Honore St & Division St
       Oakley Ave & Irving Park Rd
                                                           Broadway & Sheridan Rd
## 7
                                       KA1504000158
## 8 Sheffield Ave & Fullerton Ave
                                       TA1306000016
                                                         Damen Ave & Clybourn Ave
```

```
## 9
               Racine Ave & 15th St
                                                 13304 Clinton St & Washington Blvd
##
          LaSalle St & Jackson Blvd
                                         TA1309000004 Clinton St & Washington Blvd
##
      end station id member casual ride length
                                                       date month day of week
              RP-007
## 1
                                       177 secs 2022-01-13
                                                                     Thursday
                             casual
##
  2
              RP-007
                             casual
                                       261 secs 2022-01-10
                                                                       Monday
## 3
        TA1307000001
                                       261 secs 2022-01-25
                                                               01
                             member
                                                                      Tuesday
## 4
        TA1309000021
                             casual
                                       896 secs 2022-01-04
                                                                      Tuesday
## 5
        TA1305000029
                             member
                                       362 secs 2022-01-20
                                                               01
                                                                     Thursday
## 6
        TA1305000034
                             member
                                       202 secs 2022-01-11
                                                               01
                                                                      Tuesday
## 7
                                                               01
               13323
                             member
                                       994 secs 2022-01-30
                                                                       Sunday
## 8
               13271
                             member
                                       724 secs 2022-01-22
                                                               01
                                                                     Saturday
## 9
              WL-012
                                      1527 secs 2022-01-17
                                                               01
                                                                       Monday
                             member
## 10
              WL-012
                             member
                                       443 secs 2022-01-28
                                                               01
                                                                       Friday
tail(yearly_trips, 10)
##
                    ride_id rideable_type
                                                     started_at
                                                                            ended at
## 5667708 EB7999FF9DBC0535 electric bike 2022-12-21 19:08:04 2022-12-21 19:17:14
## 5667709 08BE55EE693263E5 electric_bike 2022-12-06 09:02:21 2022-12-06 09:06:51
## 5667710 05AD87788BCBF206 electric_bike 2022-12-06 17:08:45 2022-12-06 17:14:43
                              classic bike 2022-12-03 08:50:08 2022-12-03 08:54:17
## 5667711 AFF5772FD4185626
                              classic bike 2022-12-07 06:52:45 2022-12-07 06:56:36
## 5667712 7BDEDE9860418B53
## 5667713 43ABEE85B6E15DCA
                              classic bike 2022-12-05 06:51:04 2022-12-05 06:54:48
## 5667714 F041C89A3D1F0270 electric_bike 2022-12-14 17:06:28 2022-12-14 17:19:27
## 5667715 A2BECB88430BE156
                              classic_bike 2022-12-08 16:27:47 2022-12-08 16:32:20
## 5667716 37B392960E566F58
                              classic_bike 2022-12-28 09:37:38 2022-12-28 09:41:34
                             classic_bike 2022-12-09 00:27:25 2022-12-09 00:35:28
## 5667717 2DD1587210BA45AE
                      start_station_name start_station_id
                                                                    end_station_name
## 5667708
            Michigan Ave & Washington St
                                                      13001 Peoria St & Jackson Blvd
## 5667709
                     Morgan St & Polk St
                                              TA1307000130
                                                               Green St & Madison St
## 5667710
                   Wells St & Hubbard St
                                              TA1307000151
                                                               Green St & Madison St
                                                      13409 Peoria St & Jackson Blvd
## 5667711 Sangamon St & Washington Blvd
## 5667712 Sangamon St & Washington Blvd
                                                      13409 Peoria St & Jackson Blvd
## 5667713 Sangamon St & Washington Blvd
                                                      13409 Peoria St & Jackson Blvd
## 5667714
                 Bernard St & Elston Ave
                                                      18016
                                                              Seeley Ave & Roscoe St
## 5667715
               Wacker Dr & Washington St
                                              KA1503000072
                                                               Green St & Madison St
## 5667716 Sangamon St & Washington Blvd
                                                      13409 Peoria St & Jackson Blvd
            Southport Ave & Waveland Ave
                                                              Seeley Ave & Roscoe St
                                                      13235
           end station id member casual ride length
                                                            date month day of week
                                                                    12
## 5667708
                     13158
                                  member
                                            550 secs 2022-12-21
                                                                          Wednesday
## 5667709
             TA1307000120
                                  member
                                            270 secs 2022-12-06
                                                                    12
                                                                           Tuesday
## 5667710
             TA1307000120
                                  member
                                            358 secs 2022-12-06
                                                                    12
                                                                           Tuesday
## 5667711
                    13158
                                  member
                                            249 secs 2022-12-03
                                                                    12
                                                                           Saturday
## 5667712
                                            231 secs 2022-12-07
                                                                    12
                    13158
                                  member
                                                                          Wednesday
## 5667713
                    13158
                                  member
                                            224 secs 2022-12-05
                                                                    12
                                                                            Monday
## 5667714
                     13144
                                  member
                                            779 secs 2022-12-14
                                                                    12
                                                                          Wednesday
## 5667715
             TA1307000120
                                  member
                                            273 secs 2022-12-08
                                                                    12
                                                                          Thursday
                                                                    12
## 5667716
                     13158
                                  member
                                            236 secs 2022-12-28
                                                                          Wednesday
## 5667717
                                            483 secs 2022-12-09
                                                                    12
                     13144
                                                                             Friday
                                  casual
```

ride_id rideable_type started_at ended_at

summary(yearly_trips)

```
Length: 5667717
                        Length: 5667717
                                           Length: 5667717
                                                               Length: 5667717
    Class : character
##
                        Class :character
                                            Class : character
                                                               Class : character
##
    Mode :character
                        Mode :character
                                            Mode :character
                                                               Mode :character
##
##
##
##
    start_station_name start_station_id
                                            end station name
                                                                end station id
##
    Length: 5667717
                        Length: 5667717
                                            Length: 5667717
                                                               Length: 5667717
##
    Class : character
                        Class : character
                                            Class : character
                                                                Class : character
    Mode :character
##
                        Mode :character
                                            Mode :character
                                                               Mode :character
##
##
##
    member_casual
##
                        ride_length
                                                date
                                                                    month
    Length:5667717
                        Length: 5667717
                                                  :2022-01-01
##
                                          Min.
                                                                 Length: 5667717
##
    Class : character
                        Class : difftime
                                          1st Qu.:2022-05-28
                                                                 Class : character
    Mode :character
##
                        Mode :numeric
                                          Median :2022-07-22
                                                                 Mode : character
##
                                                  :2022-07-19
##
                                          3rd Qu.:2022-09-16
##
                                          Max.
                                                  :2022-12-31
##
    day_of_week
   Length: 5667717
##
   Class : character
##
    Mode : character
##
##
##
##
```

• Converting c(ride_length) to numeric so calculations can be executed.

```
yearly_trips$ride_length <- as.numeric(as.character(yearly_trips$ride_length))
is.numeric(yearly_trips$ride_length) # To check the class of column</pre>
```

[1] TRUE

summary(yearly_trips)

```
##
                        rideable_type
                                             started_at
                                                                  ended_at
      ride_id
##
    Length: 5667717
                        Length: 5667717
                                            Length: 5667717
                                                                Length: 5667717
##
    Class : character
                        Class : character
                                            Class : character
                                                                Class : character
    Mode :character
                        Mode :character
                                            Mode :character
                                                                Mode :character
##
##
##
##
    start_station_name start_station_id
                                            end_station_name
                                                                end_station_id
##
    Length: 5667717
                        Length: 5667717
                                                                Length: 5667717
                                            Length: 5667717
##
    Class :character
                        Class : character
                                            Class : character
                                                                Class : character
##
    Mode :character
                        Mode :character
                                            Mode :character
                                                                Mode :character
##
##
##
    member_casual
                         ride_length
                                                date
                                                                    month
```

```
Length: 5667717
                        Min.
                                :-621201
                                           Min.
                                                   :2022-01-01
                                                                  Length: 5667717
##
                                           1st Qu.:2022-05-28
##
    Class : character
                        1st Qu.:
                                     349
                                                                  Class : character
##
    Mode :character
                        Median:
                                     617
                                           Median :2022-07-22
                                                                  Mode :character
##
                                    1167
                                                   :2022-07-19
                        Mean
                                           Mean
##
                        3rd Qu.:
                                    1108
                                           3rd Qu.:2022-09-16
##
                        Max.
                                :2483235
                                                   :2022-12-31
                                           Max.
##
    day_of_week
##
    Length: 5667717
##
    Class : character
##
    Mode :character
##
##
##
```

After checking summary, c(ride_length) has some negative values and has to be excluded.

```
yearly_trips_v2 <- subset(yearly_trips, yearly_trips$ride_length >0)
summary(yearly_trips_v2)
```

```
##
      ride_id
                        rideable_type
                                             started_at
                                                                   ended_at
##
    Length: 5667186
                        Length: 5667186
                                            Length: 5667186
                                                                Length: 5667186
                                            Class :character
                                                                Class : character
    Class : character
                        Class : character
##
    Mode :character
                        Mode : character
                                            Mode :character
                                                                Mode :character
##
##
##
##
    start_station_name start_station_id
                                            end_station_name
                                                                end_station_id
##
    Length: 5667186
                        Length: 5667186
                                            Length: 5667186
                                                                Length: 5667186
    Class :character
                                            Class :character
                                                                Class : character
##
                        Class : character
##
    Mode :character
                        Mode :character
                                            Mode :character
                                                                Mode :character
##
##
##
    member_casual
##
                         ride_length
                                                date
                                                                    month
##
    Length:5667186
                                                   :2022-01-01
                                                                 Length: 5667186
                        Min.
                                       1
                                           Min.
##
    Class :character
                        1st Qu.:
                                     349
                                           1st Qu.:2022-05-28
                                                                 Class : character
##
    Mode :character
                                                                 Mode : character
                        Median:
                                     617
                                           Median :2022-07-22
##
                        Mean
                                    1167
                                           Mean
                                                   :2022-07-19
##
                        3rd Qu.:
                                    1108
                                           3rd Qu.:2022-09-16
##
                        Max.
                               :2483235
                                           Max.
                                                   :2022-12-31
##
    day_of_week
##
   Length: 5667186
##
    Class : character
##
    Mode : character
##
##
##
```

Organizing Data

• Reordering and dropping the columns to understand data easier

• Converting c(ride_length) to minutes

```
yearly_trips_v3$ride_length <- yearly_trips_v3$ride_length /60</pre>
```

Analyzing the data To understand how the member and casuals use bikes differently checking:

- Ride duration
- Number of rides

Ride duration

• First a descriptive analysis on ride duration.

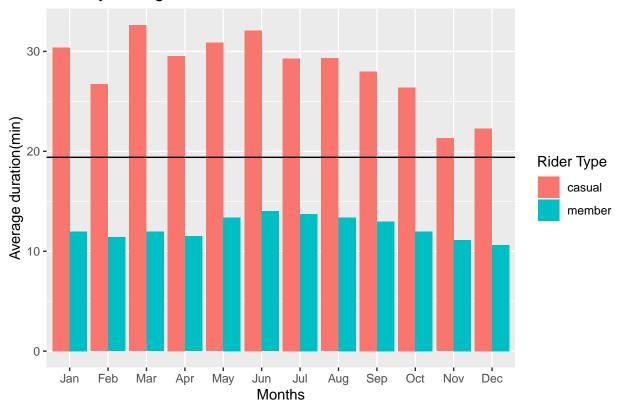
```
yearly_trips_v3 %>%
  summarise(min(ride_length), mean(ride_length), max(ride_length))

## min(ride_length) mean(ride_length) max(ride_length)
## 1 0.01666667 19.44743 41387.25
```

We can see that average ride length is 19.4 minutes per rider.

• Comparing members and casual users monthly average ride duration.

Monthly average ride duration in minutes

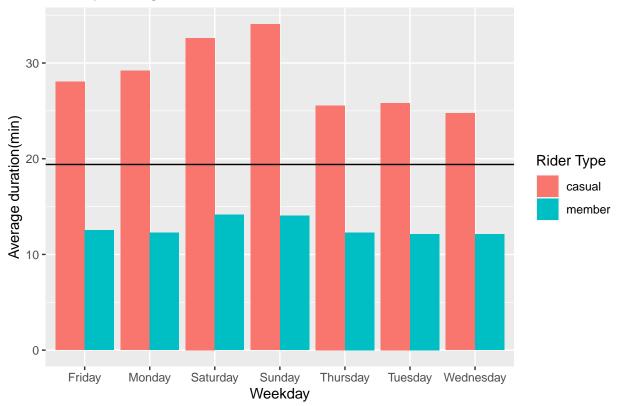


The plot shows that casuals tends to ride longer than members, and members ride duration is below average ride duration.

• If we look at weekly average ride duration

```
yearly_trips_v3 %>%
  group_by(member_casual, day_of_week) %>%
  summarise(number_of_rides = n(), average_duration=mean(ride_length)) %>%
  arrange(member_casual,day_of_week) %>%
  ggplot(aes(x=day_of_week, y=average_duration, fill= member_casual))+
  geom_col(position = "dodge")+
  geom_hline(yintercept = 19.4)+
  xlab("Weekday")+
  ylab("Average duration(min)")+
  labs(title = "Weekly average ride duration in minutes", fill ="Rider Type")
```

Weekly average ride duration in minutes

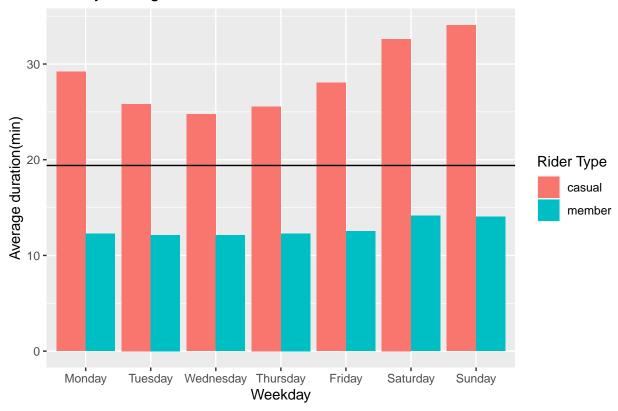


Days aren't ordered to fix it

After fixing it

```
yearly_trips_v3 %>%
  group_by(member_casual, day_of_week) %>%
  summarise(number_of_rides = n(), average_duration=mean(ride_length)) %>%
  arrange(member_casual,day_of_week) %>%
  ggplot(aes(x=day_of_week, y=average_duration, fill= member_casual))+
  geom_col(position = "dodge")+
  geom_hline(yintercept = 19.4)+
  xlab("Weekday")+
  ylab("Average duration(min)")+
  labs(title = "Weekly average ride duration in minutes", fill ="Rider Type")
```





Number of rides

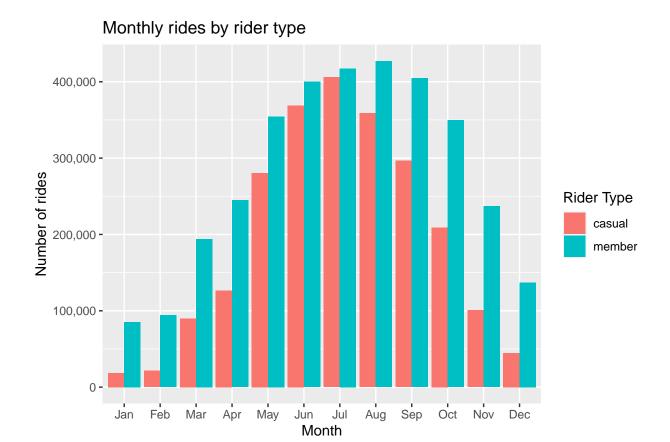
• Lets look at yearly trips.

```
yearly_trips_v3 %>%
summarise(number_of_rides = n())
```

```
## number_of_rides
## 1 5667186
```

This year total of 5.667.186 trips made by our members and casuals.

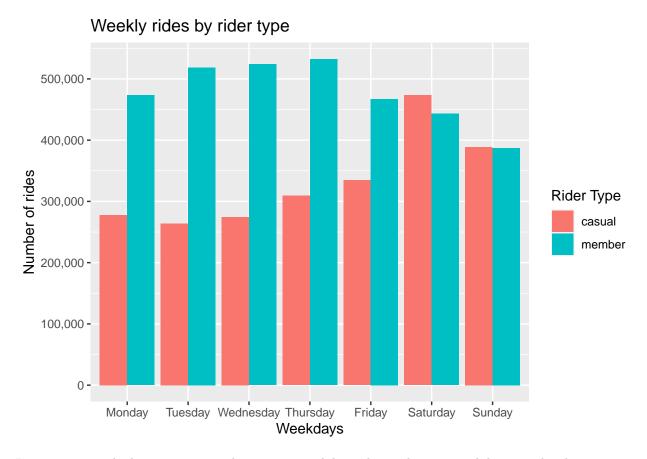
• If we look at our monthly trips.



From the plot we can see that casuals tends to rent more bike in summer.

• If we look at weekly trips.

```
yearly_trips_v3 %>%
  group_by(day_of_week, member_casual) %>%
  summarise(rider_count = n()) %>%
  ggplot(aes(x=day_of_week,y=rider_count, fill=member_casual))+
  geom_col(position = "dodge")+
  xlab("Weekdays")+
  ylab("Number of rides")+
  scale_y_continuous(labels = comma, breaks = seq(0,500000, by =100000))+
  labs(title="Weekly rides by rider type", fill= "Rider Type")
```



In contrast to ride duration our members rent more bike and casual rent more bike at weekends.

Share Phase

After the analysis:

- Casuals ride longer than members.
- Members rent more bike than casuals.
- Casuals tend to rent more bike in summer and weekends.

Recommendations

- A discount campaign can be launched for membership in the summer since the casual usage rate increases.
- Discount coupons can be issued according to the length of their trips.