

# Data Description & Data Analysis I

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```
screen_data = read_xlsx("C:\\Users\\igomez\\Downloads\\620W22-Project2-Data (1).xlsx", sheet = 1)
baseline_data = read_xlsx("C:\\Users\\igomez\\Downloads\\620W22-Project2-Data (1).xlsx", sheet = 2)
```

## BASELINE DATA

```
baseline_data = baseline_data %>% mutate(
  Workmate = as.factor(workmate),
  Academic = as.factor(academic),
  Non.Academic = as.factor(non.academic),
  Pets = as.factor(pets),
  Sex = as.factor(sex),
  Degree = as.factor(degree),
  Job = as.factor(job),
  Age = age,
  Course.Hours = course.hours,
  Siblings = siblings,
  Apps = apps,
  Devices = devices,
  Procrastination = procrastination
)

table1::table1(~ Workmate + Academic + Non.Academic + Pets + + Age + Course.Hours + Degree + Job + S
```

	Overall
	(N=32)
<b>Workmate</b>	
0	21 (65.6%)
1	9 (28.1%)
2	2 (6.3%)
<b>Academic</b>	
0	9 (28.1%)
1	9 (28.1%)
2	14 (43.8%)
<b>Non.Academic</b>	
0	11 (34.4%)
1	10 (31.3%)
2	11 (34.4%)
<b>Pets</b>	
0	29 (90.6%)
1	3 (9.4%)
<b>Age</b>	
Mean (SD)	23.4 (2.05)
Median [Min, Max]	23.0 [21.0, 30.0]
<b>Course.Hours</b>	
Mean (SD)	13.0 (1.72)
Median [Min, Max]	13.0 [9.00, 17.0]
<b>Degree</b>	
0	14 (43.8%)
1	18 (56.3%)
<b>Job</b>	
0	16 (50.0%)
1	16 (50.0%)
<b>Siblings</b>	
Mean (SD)	0.781 (1.01)
Median [Min, Max]	0 [0, 3.00]
<b>Apps</b>	
Mean (SD)	5.19 (5.37)
Median [Min, Max]	4.00 [1.00, 32.0]
<b>Devices</b>	
Mean (SD)	2.31 (0.965)
Median [Min, Max]	2.00 [1.00, 6.00]
<b>Procrastination</b>	
Mean (SD)	35.5 (13.0)
Median [Min, Max]	34.5 [12.0, 68.0]

STEP 1: Making first time pickup variable

```
screen_data$Pickup.1st = strptime(screen_data$Pickup.1st, format = "%H:%M")

screen_data = screen_data %>% mutate(Pickup.1st.minute=(hour(Pickup.1st)*60+minute(Pickup.1st)))

#NEED TO SHIFT WAKE-UP TIME, SO VARIABLE ARE ASSOCIATED WITH NEXT DAY.
```

```

screen_data$Pickup.1st.minute = c(screen_data$Pickup.1st.minute[-1],NA)

screen_data = screen_data%>% mutate(Pickup.1st.minute = ifelse(Time == 30,NA,Pickup.1st.minute))

screen_data_complete =
  screen_data %>% filter(is.na(Pickup.1st.minute) == FALSE) %>% select("ID","Time","Day","Tot.Scr.Time")

```

## STEP 2: SANITY CHECK

```

screen_data_complete[as.numeric(screen_data_complete$Tot.Scr.Time) < as.numeric(screen_data_complete$Tot.Scr.Time)]

## Warning in `[.tbl_df`(screen_data_complete,
## as.numeric(screen_data_complete$Tot.Scr.Time) < : NAs introduced by coercion

## Warning in `[.tbl_df`(screen_data_complete,
## as.numeric(screen_data_complete$Tot.Scr.Time) < : NAs introduced by coercion

## # A tibble: 1 x 9
##       ID Time Day   Tot.Scr.Time Tot.Soc.Time Pickups Pickup.1st
##   <dbl> <dbl> <chr> <chr>         <chr>         <chr> <dtm>
## 1    NA   NA <NA>  <NA>         <NA>         <NA>  NA
## # ... with 2 more variables: Pickup.1st.minute <dbl>, Imputed <dbl>

table(screen_data_complete$Day)

```

```

##
##      Fri    Friday      Mon    Monday      Sat    Saturday      Sun    Sunday
##      8      118      8      118      8      119      8      119
##      Thu    Thursday    Tue    Tuesday    Wed    Wednesday
##      8      120      10    148      8      120

```

Day is written differently, need to update to make sure day is uniformed.

STEP 1: Figure out the dates for the ones written in number. There appears to be one user (ID # 10) who inputed numbers instead of the day. So wil need to insert the correct days. Given that all 34 users collected the data during the same dates, we can simply assume that users 10 data is also collected on the same dates (and hence days), as the other users. I manually fixed this on excel.

```

library(dplyr)
screen_data_complete = screen_data_complete %>%
  mutate(day = recode(Day,
    "Friday" = "Fri",
    "Monday" = "Mon",
    "Saturday" = "Sat",
    "Sunday" = "Sun",
    "Thursday" = "Thu",
    "Tuesday" = "Tue",
    "Wednesday" = "Wed"))
#Factor and relevel days
screen_data_complete$day = factor(screen_data_complete$day, levels=c("Sun", "Mon", "Tue", "Wed", "Thu", "Fri", "Sat"))

#Create binary weekend vs no weekend d
screen_data_complete = screen_data_complete %>%
  mutate(if_weekend = day %in% c("Sun", "Sat","Fri"))

```

MAKE NUMERIC VARIABLES, NUMERIC

```

screen_data_complete = screen_data_complete %>% mutate(
  Tot.Scr.Time = as.numeric(Tot.Scr.Time),
  Tot.Soc.Time = as.numeric(Tot.Soc.Time),
  Pickups = as.numeric(Pickups),
  ID = as.factor(ID)
)

## Warning in mask$eval_all_mutate(quo): NAs introduced by coercion
## Warning in mask$eval_all_mutate(quo): NAs introduced by coercion
## Warning in mask$eval_all_mutate(quo): NAs introduced by coercion
table(screen_data_complete$day)

##
## Sun Mon Tue Wed Thu Fri Sat
## 127 126 158 128 128 126 127
#table(screen_data_complete$Pickup.1st)

table(screen_data_complete$Time)

##
## 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23 24 25 26
## 32 32 32 32 32 32 32 32 32 32 31 32 32 32 32 32 32 32 32 32 32 32 32 31 31
## 27 28 29
## 31 30 30

MAKE WAKEUP TIME

# ggplot(screen_data_complete, aes(x = Time, y = Tot.Scr.Time,
#                                   color = if_weekend)) +
#   geom_line(aes(color = as.factor(screen_data_complete$ID))) +
#   geom_point() +
#   labs(x = "", y = "Total Screen Time (min)", caption = "(a) total screen time" ) +
#   # ylim(15,702) +
#   # scale_color_manual(labels = c("weekdays", "weekends"), values =
#   #   c("black","red")) +
#   theme_minimal() +
#   theme(axis.text.x = element_text(angle = 60, hjust = 1),
#         axis.title.y = element_text(size = 8, hjust = 1),
#         plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9),
#         legend.title = element_blank())

# https://stackoverflow.com/questions/60436663/spaghetti-plot-using-ggplot-in-r
scr_time_plot = ggplot(screen_data_complete, aes(Time, Tot.Scr.Time, color = ID))+
  geom_line() +
  labs(x = "Day", y = "Total Screen Time (min)", caption = "(a) total screen time" ) +
  geom_line(data = screen_data_complete, aes(Time, y= Tot.Scr.Time), size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9),
        legend.position = "none")

```

```

soc_time_plot = ggplot(screen_data_complete, aes(Time, Tot.Soc.Time, color = ID))+
  geom_line() +
  labs(x = "Day", y = "Total Social Time (min)", caption = "(b) total social time" ) +
  geom_line(data = screen_data_complete, aes(Time, y = Tot.Soc.Time), size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5, vjust = 0.1, size=9),
        legend.position = "none")

pickup_plot = ggplot(screen_data_complete, aes(Time, Pickups, color = ID))+
  geom_line() +
  labs(x = "Day", y = "Total Number of Pickups", caption = "(c) total pickups" ) +
  geom_line(data = screen_data_complete, aes(Time, y = Pickups), size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5, vjust = 0.1, size=9),
        legend.position = "none")

wakeup_plot = ggplot(screen_data_complete, aes(Time, Pickup.1st.minute, color = ID))+
  geom_line() +
  labs(x = "Day", y = "Wake-Up Time", caption = "(d) wake up time" ) +
  geom_line(data = screen_data_complete, aes(Time, y = Pickup.1st.minute), size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5, vjust = 0.1, size=9),
        legend.position = "none")

grid.arrange(scr_time_plot, soc_time_plot, pickup_plot, wakeup_plot, ncol = 2, nrow = 2)

```

## Warning: Removed 1 row(s) containing missing values (geom\_path).

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## Warning: Removed 1 row(s) containing missing values (geom\_path).

Lots of data, means harder to see patterns. May be useful to calculate mean.

```

screen_data_complete = screen_data_complete %>% group_by(Time) %>% mutate(
  Avg.Tot.Scr.Time = mean(Tot.Scr.Time),
  Avg.Tot.Soc.Time = mean(Tot.Soc.Time),
  Avg.Pickups = mean(Pickups),
  Avg.Pickup.1st.minute = mean(Pickup.1st.minute))

# ggplot(screen_data_complete, aes(x = Time, y = Tot.Scr.Time,
#                                   color = if_weekend)) +
#   geom_line(aes(color = as.factor(screen_data_complete$ID))) +
#   geom_point() +
#   labs(x = "", y = "Total Screen Time (min)", caption = "(a) total screen time" ) +
#   # ylim(15,702) +

```

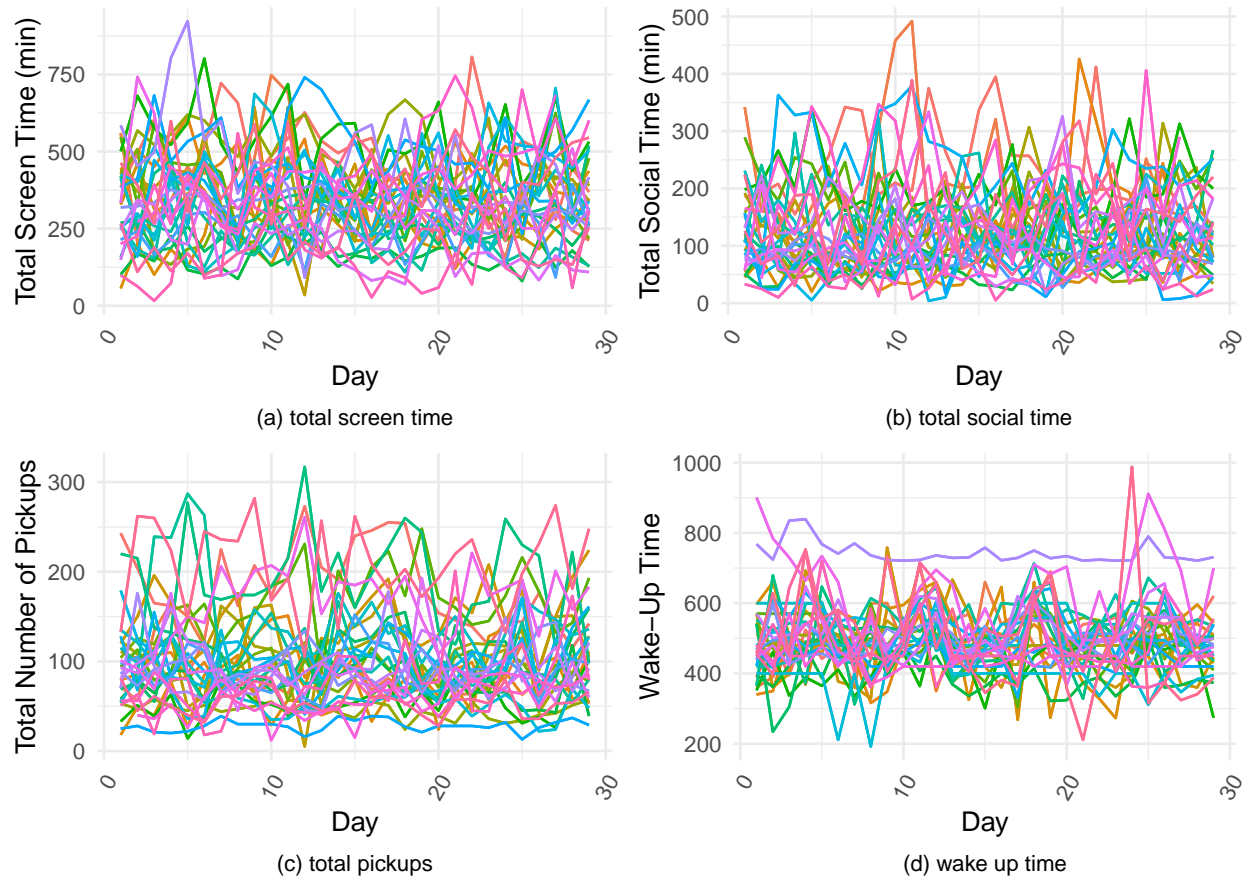


Figure 1: Spaghetti Plot (a) - (d) total screen time vs day, social screen time vs day, number of pickups vs day, wakeup time vs day

```

#       # scale_color_manual(labels = c("weekdays", "weekends"), values =
#       #                               c("black","red")) +
#       theme_minimal() +
#       theme(axis.text.x = element_text(angle = 60, hjust = 1),
#             axis.title.y = element_text(size = 8, hjust = 1),
#             plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9),
#             legend.title = element_blank())

# https://stackoverflow.com/questions/60436663/spaghetti-plot-using-ggplot-in-r
avg_scr_time_plot = ggplot(screen_data_complete, aes(Time, Avg.Tot.Scr.Time))+
  geom_line() +
  labs(x = "Day",y = "Total Screen Time (min)", caption = "(a) total screen time" ) +
  geom_line(data = screen_data_complete, aes(Time, y= Avg.Tot.Scr.Time),size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9))

avg_soc_time_plot = ggplot(screen_data_complete, aes(Time, Avg.Tot.Soc.Time))+
  geom_line() +
  labs(x = "Day",y = "Total Social Time (min)", caption = "(b) total social time" ) +
  geom_line(data = screen_data_complete, aes(Time, y= Avg.Tot.Soc.Time),size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9))

avg_pickup_plot = ggplot(screen_data_complete, aes(Time, Avg.Pickups))+
  geom_line() +
  labs(x = "Day",y = "Total Number of Pickups", caption = "(c) total pickups" ) +
  geom_line(data = screen_data_complete, aes(Time, y= Avg.Pickups),size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9))

avg_wakeup_plot = ggplot(screen_data_complete, aes(Time, Avg.Pickup.1st.minute))+
  geom_line() +
  labs(x = "Day",y = "Wake-Up Time", caption = "(d) wake up time" ) +
  geom_line(data = screen_data_complete, aes(Time, y= Avg.Pickup.1st.minute),size = 0.5) +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 60, hjust = 1),
        plot.caption = element_text(hjust=0.5,vjust = 0.1, size=9))

grid.arrange(avg_scr_time_plot,avg_soc_time_plot,avg_pickup_plot,avg_wakeup_plot, ncol = 2, nrow = 2)

## Warning: Removed 32 row(s) containing missing values (geom_path).
## Warning: Removed 32 row(s) containing missing values (geom_path).
## Warning: Removed 32 row(s) containing missing values (geom_path).
## Warning: Removed 32 row(s) containing missing values (geom_path).
## Warning: Removed 32 row(s) containing missing values (geom_path).

```

```
## Warning: Removed 32 row(s) containing missing values (geom_path).
```

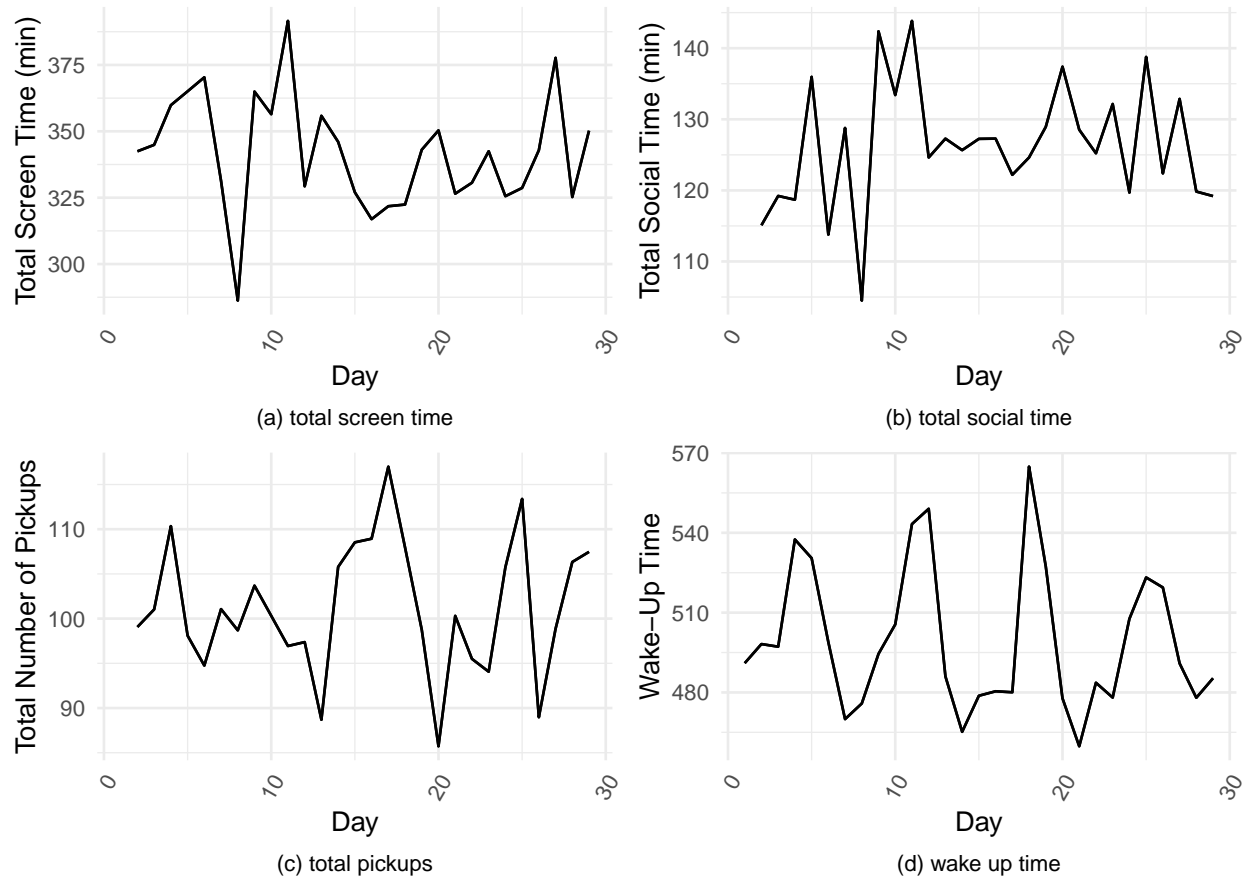


Figure 2: Spaghetti Plot (a) - (d) total screen time vs day, social screen time vs day, number of pickups vs day, wakeup time vs day

## ATTEMPT AT ANALYSIS LLM

```
model1 = lm(Pickup.1st.minute ~ Tot.Scr.Time, screen_data_complete)
```

```
#BAR PLOTS OF EVERYTHING
```

```
# Overview of the variables
```

```
par(mfrow = c(2,4))
```

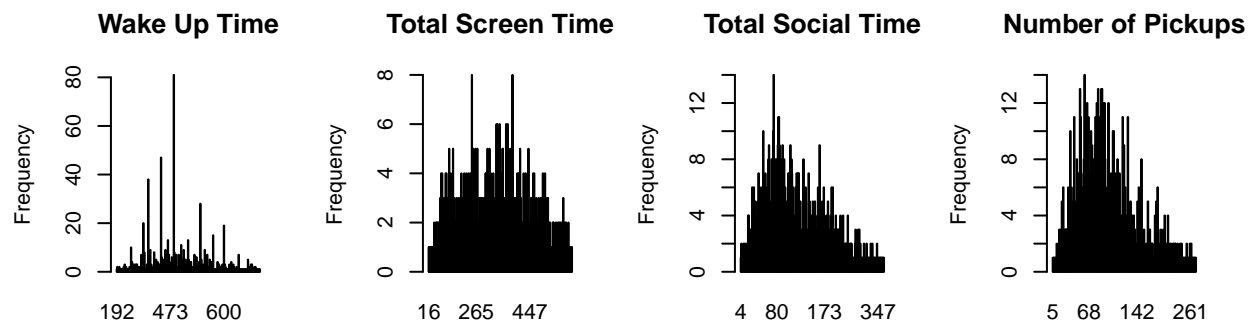
```
barplot(table(screen_data_complete$Pickup.1st.minute), ylab = "Frequency", main = "Wake Up Time")
```

```
barplot(table(screen_data_complete$Tot.Scr.Time), ylab = "Frequency", main = "Total Screen Time")
```

```
barplot(table(screen_data_complete$Tot.Soc.Time), ylab = "Frequency", main = "Total Social Time")
```

```
barplot(table(screen_data_complete$Pickups), ylab = "Frequency", main = "Number of Pickups")
```



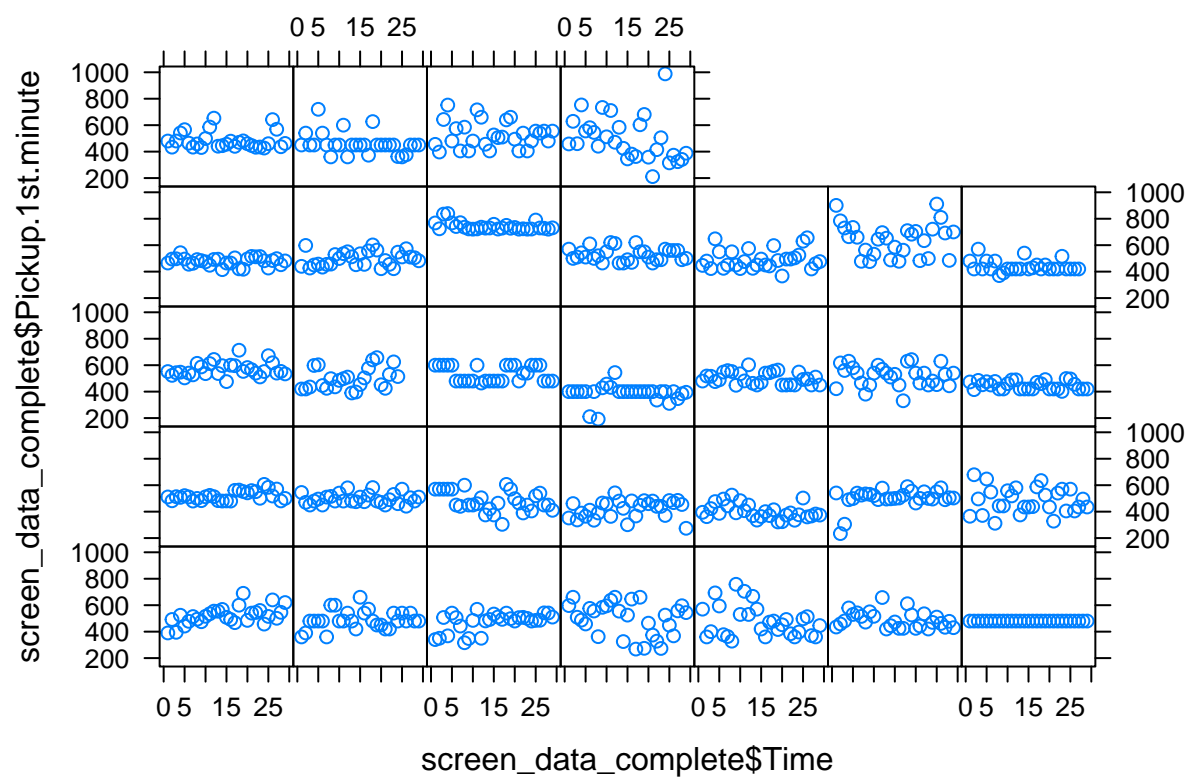


The visual below allows us to see the first pickup time over time by each individual

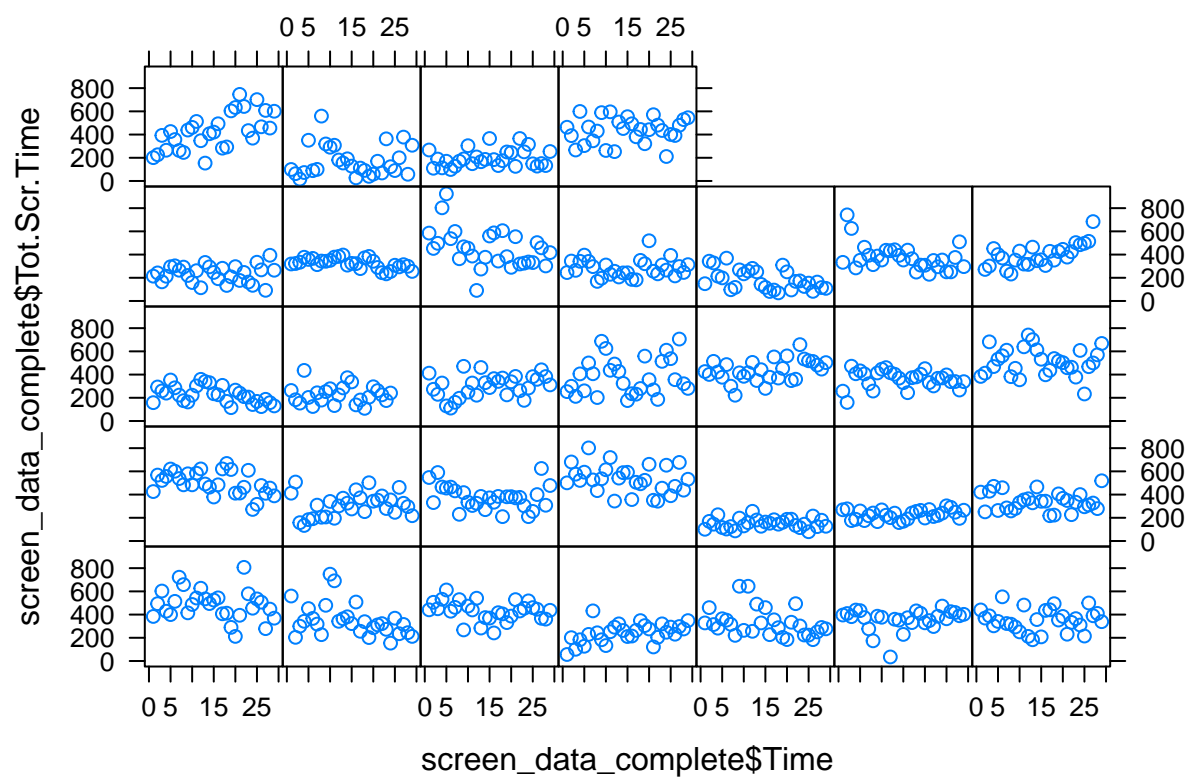
```
library(lattice)
```

```
## Warning: package 'lattice' was built under R version 4.0.5
```

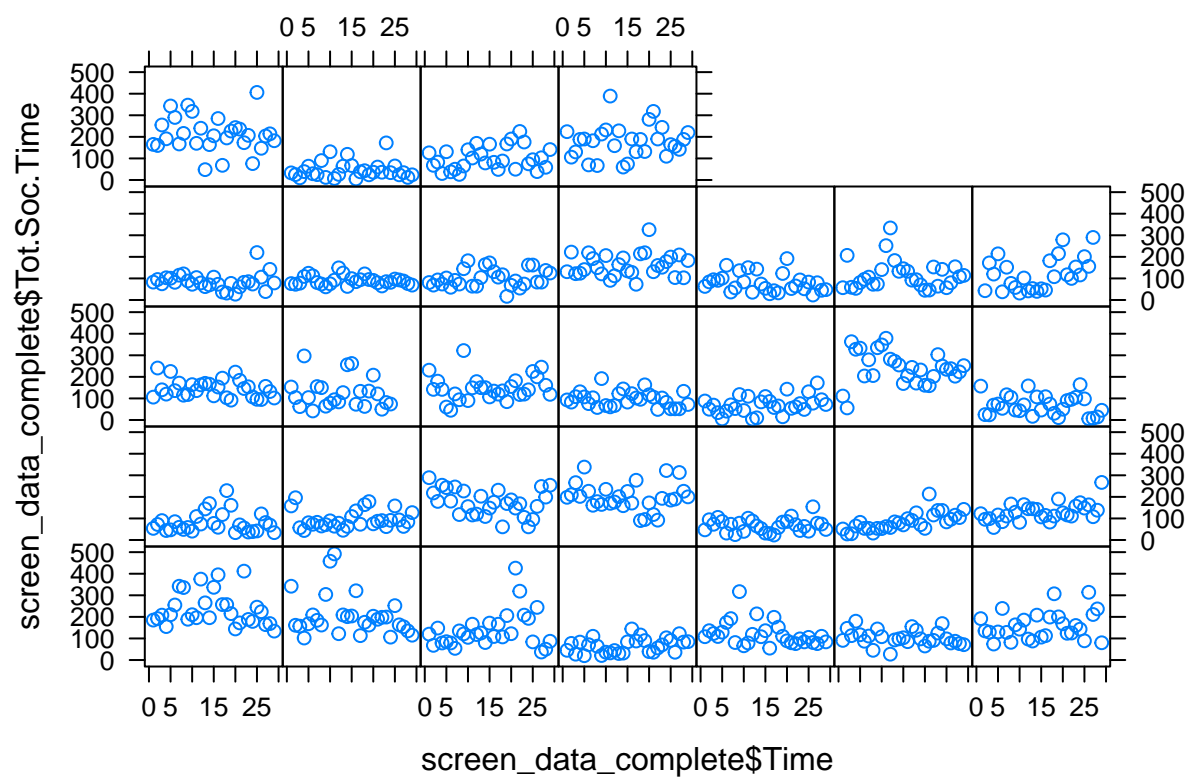
```
xyplot(screen_data_complete$Pickup.1st.minute ~ screen_data_complete$Time | screen_data_complete$ID, str
```



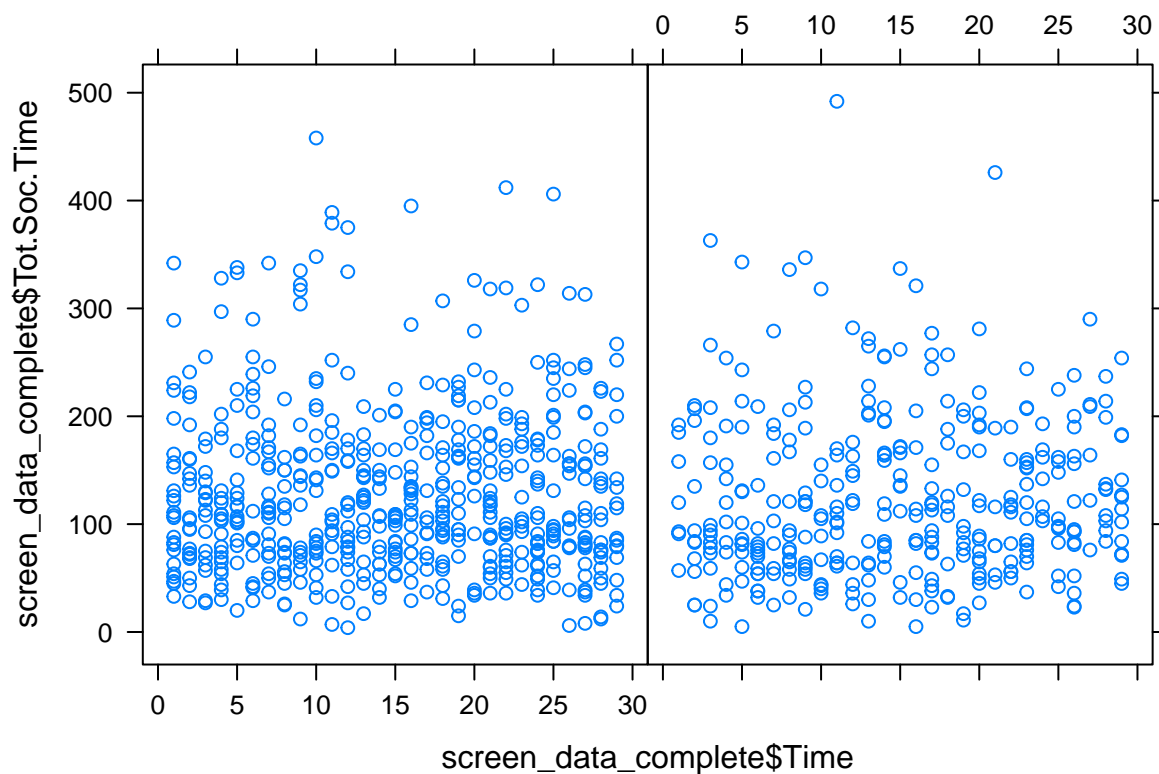
```
xyplot(screen_data_complete$Tot.Scr.Time ~ screen_data_complete$Time | screen_data_complete$ID, strip=FA)
```



```
xyplot(screen_data_complete$Tot.Scr.Time ~ screen_data_complete$Time | screen_data_complete$ID, strip=FALSE)
```



```
xyplot(screen_data_complete$Tot.Soc.Time ~ screen_data_complete$Time | baseline_data$sex, strip=FALSE)
```



```
mean(screen_data_complete$Pickup.1st.minute)
```

```
## [1] 499.2304
```

```
var(screen_data_complete$Pickup.1st.minute)
```

```
## [1] 9562.578
```

```
with(screen_data_complete, tapply(Pickup.1st.minute, list(subject = ID), mean))
```

```
## subject
##      1      2      3      4      5      6      7      8
## 520.6552 488.2759 472.6552 496.9655 478.0690 488.1071 480.0000 519.6552
##      9     10     11     12     13     14     15     16
## 497.5172 479.2069 421.0690 399.8966 503.1034 483.0690 567.8276 497.4583
##     17     18     19     20     21     22     23     24
## 533.2759 387.5172 501.2414 519.3448 447.4828 477.4138 497.2069 743.1724
##     25     26     27     28     29     30     31     32
## 528.1034 492.0345 643.4483 439.8148 483.0690 459.2759 526.3448 498.3103
```

```
with(screen_data_complete, tapply(Pickup.1st.minute, list(subject = ID), var))
```

```
## subject
##      1      2      3      4      5      6      7
## 4322.7340 4814.7783 5053.1626 15878.1773 14041.5665 3823.7288 0.0000
##      8      9     10     11     12     13     14
## 1259.8768 1489.3300 6004.9557 4195.9236 2975.1675 5199.3103 9305.7808
##     15     16     17     18     19     20     21
## 2650.2192 6509.6504 3496.9212 4122.2586 2054.6182 6235.8768 965.9015
```

```
##          22          23          24          25          26          27          28
##  975.3227 2907.1700  999.5764 2411.7389 5311.1773 15481.2562 1984.4644
##          29          30          31          32
## 3932.2808 6560.9926 9585.7340 27879.8645
```

```
library(lme4)
```

```
## Warning: package 'lme4' was built under R version 4.0.5
```

```
## Loading required package: Matrix
```

```
## Warning: package 'Matrix' was built under R version 4.0.4
```

```
mmod <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + (1|ID),screen_data_complete)
```

```
summary(mmod)
```

```
## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + (1 | ID)
## Data: screen_data_complete
##
## REML criterion at convergence: 10652.4
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.7770 -0.5486 -0.0522  0.5066  6.4398
##
## Random effects:
##  Groups   Name                Variance Std.Dev.
##  ID       (Intercept)    3978      63.07
##  Residual                    5715      75.60
## Number of obs: 919, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  503.44918   14.06448   35.796
## Tot.Scr.Time -0.01291    0.02404   -0.537
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Scr.Tim -0.583
```

```
Overall:
```

```
soc_lmm <- lmer(Pickup.1st.minute ~ Tot.Soc.Time + (1|ID),screen_data_complete)
```

```
summary(soc_lmm)
```

```
## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Soc.Time + (1 | ID)
## Data: screen_data_complete
##
## REML criterion at convergence: 10651.3
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.8338 -0.5474 -0.0508  0.4972  6.4915
##
```

```

## Random effects:
##   Groups   Name              Variance Std.Dev.
##   ID       (Intercept) 3956      62.89
##   Residual              5717      75.61
## Number of obs: 919, groups: ID, 32
##
## Fixed effects:
##               Estimate Std. Error t value
## (Intercept)  496.80227   12.68237  39.173
## Tot.Soc.Time    0.01773    0.04404   0.403
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Soc.Tim -0.439

pickups_lmm <- lmer(Pickup.1st.minute ~ Pickups + (1|ID),screen_data_complete)

summary(pickups_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Pickups + (1 | ID)
##   Data: screen_data_complete
##
## REML criterion at convergence: 10645.4
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.7767 -0.5620 -0.0331  0.4978  6.3446
##
## Random effects:
##   Groups   Name              Variance Std.Dev.
##   ID       (Intercept) 4284      65.45
##   Residual              5670      75.30
## Number of obs: 919, groups: ID, 32
##
## Fixed effects:
##               Estimate Std. Error t value
## (Intercept)  516.03637   14.01198  36.828
## Pickups      -0.16863    0.07444  -2.265
##
## Correlation of Fixed Effects:
##              (Intr)
## Pickups -0.535

lmm <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1|ID),screen_data_complete)

summary(lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1 |
##   ID)
##   Data: screen_data_complete
##
## REML criterion at convergence: 10654.1
##

```

```
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.8242 -0.5631 -0.0381  0.5072  6.3135
##
## Random effects:
##   Groups   Name            Variance Std.Dev.
##    ID      (Intercept) 4308      65.64
##   Residual              5675      75.33
## Number of obs: 919, groups:  ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  518.13865   16.08946   32.204
## Tot.Scr.Time -0.02273    0.02734   -0.831
## Tot.Soc.Time  0.04908    0.05032    0.975
## Pickups      -0.17410    0.07496   -2.322
##
## Correlation of Fixed Effects:
##              (Intr) Tt.Scr.T Tt.Sc.Tm
## Tot.Scr.Tim -0.389
## Tot.Soc.Tim -0.074 -0.476
## Pickups     -0.429 -0.005  -0.097
```

School-Days:

```
weekday_data = screen_data_complete %>% filter(if_weekend == 0)
soc_weekday_lmm <- lmer(Pickup.1st.minute ~ Tot.Soc.Time + (1|ID),weekday_data)

summary(soc_weekday_lmm)
```

```
## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Soc.Time + (1 | ID)
##   Data: weekday_data
##
## REML criterion at convergence: 6217
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.8158 -0.4433 -0.0040  0.4601  7.0918
##
## Random effects:
##   Groups   Name            Variance Std.Dev.
##    ID      (Intercept) 3523      59.35
##   Residual              5196      72.08
## Number of obs: 539, groups:  ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  478.34139   13.04665   36.66
## Tot.Soc.Time  0.04452    0.05707    0.78
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Soc.Tim -0.545
```



```

mmod2 <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + (1|ID), weekday_data)

summary(mmod2)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + (1 | ID)
## Data: weekday_data
##
## REML criterion at convergence: 6218.5
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.6872 -0.4455 -0.0062  0.4871  7.0055
##
## Random effects:
## Groups Name Variance Std.Dev.
## ID      (Intercept) 3562     59.68
## Residual          5196     72.08
## Number of obs: 539, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept) 489.66264   15.11421  32.397
## Tot.Scr.Time -0.01733    0.03110  -0.557
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Scr.Tim -0.686

weekday_pickups_lmm <- lmer(Pickup.1st.minute ~ Pickups + (1|ID), weekday_data)

summary(weekday_pickups_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Pickups + (1 | ID)
## Data: weekday_data
##
## REML criterion at convergence: 6203.5
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.7143 -0.4511 -0.0410  0.4863  6.8120
##
## Random effects:
## Groups Name Variance Std.Dev.
## ID      (Intercept) 4247     65.17
## Residual          5018     70.84
## Number of obs: 539, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept) 521.9787    15.7378  33.167
## Pickups      -0.3714     0.1002  -3.707
##

```

```

## Correlation of Fixed Effects:
##      (Intr)
## Pickups -0.653
weekday_lmm <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1|ID),weekday_data)

summary(weekday_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1 |
##      ID)
##      Data: weekday_data
##
## REML criterion at convergence: 6209.4
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.8295 -0.4655 -0.0529  0.4811  6.7527
##
## Random effects:
##   Groups   Name      Variance Std.Dev.
##   ID       (Intercept) 4352     65.97
##   Residual                5003     70.73
## Number of obs: 539, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  525.38322   18.80722  27.935
## Tot.Scr.Time  -0.04422    0.03542  -1.249
## Tot.Soc.Time   0.10280    0.06515   1.578
## Pickups       -0.38566    0.10058  -3.834
##
## Correlation of Fixed Effects:
##              (Intr) Tt.Scr.T Tt.Sc.Tm
## Tot.Scr.Tim -0.427
## Tot.Soc.Tim -0.075 -0.495
## Pickups     -0.527  0.022  -0.083

Non-School Days:

weekend_data = screen_data_complete %>% filter(if_weekend == 1)
soc_weekend_lmm <- lmer(Pickup.1st.minute ~ Tot.Soc.Time + (1|ID),weekend_data)

summary(soc_weekend_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Soc.Time + (1 | ID)
##      Data: weekend_data
##
## REML criterion at convergence: 4421.2
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.2213 -0.5734 -0.0414  0.5996  3.1361
##
## Random effects:

```

```

## Groups   Name            Variance Std.Dev.
## ID       (Intercept) 4835      69.54
## Residual                5458      73.88
## Number of obs: 380, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  526.26886   15.25458  34.499
## Tot.Soc.Time -0.04219    0.06356  -0.664
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Soc.Tim -0.537
mmod3 <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + (1|ID),weekend_data)

summary(mmod3)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + (1 | ID)
## Data: weekend_data
##
## REML criterion at convergence: 4422.6
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.2229 -0.5685 -0.0506  0.6059  3.1611
##
## Random effects:
## Groups   Name            Variance Std.Dev.
## ID       (Intercept) 4796      69.26
## Residual                5465      73.93
## Number of obs: 380, groups: ID, 32
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)  526.70415   17.75467  29.666
## Tot.Scr.Time -0.01669    0.03489  -0.478
##
## Correlation of Fixed Effects:
##              (Intr)
## Tot.Scr.Tim -0.692
weekend_pickups_lmm <- lmer(Pickup.1st.minute ~ Pickups + (1|ID), weekend_data)

summary(weekend_pickups_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Pickups + (1 | ID)
## Data: weekend_data
##
## REML criterion at convergence: 4418.5
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max

```

```

## -3.2721 -0.5640 -0.0486  0.5934  3.1189
##
## Random effects:
##   Groups   Name                Variance Std.Dev.
##   ID        (Intercept) 4554         67.48
##   Residual                    5459         73.88
## Number of obs: 380, groups:  ID, 32
##
## Fixed effects:
##               Estimate Std. Error t value
## (Intercept) 505.7923    16.1727  31.274
## Pickups      0.1531     0.1043   1.468
##
## Correlation of Fixed Effects:
##          (Intr)
## Pickups -0.633
weekend_lmm <- lmer(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1|ID),weekend_data)
summary(weekend_lmm)

## Linear mixed model fit by REML ['lmerMod']
## Formula: Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups + (1 |
##      ID)
##      Data: weekend_data
##
## REML criterion at convergence: 4425.9
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -3.2542 -0.5583 -0.0511  0.5855  3.1465
##
## Random effects:
##   Groups   Name                Variance Std.Dev.
##   ID        (Intercept) 4587         67.73
##   Residual                    5473         73.98
## Number of obs: 380, groups:  ID, 32
##
## Fixed effects:
##               Estimate Std. Error t value
## (Intercept) 513.898015  19.887540  25.840
## Tot.Scr.Time -0.008723   0.039301  -0.222
## Tot.Soc.Time -0.051266   0.072368  -0.708
## Pickups      0.169185   0.105917   1.597
##
## Correlation of Fixed Effects:
##          (Intr) Tt.Scr.T Tt.Sc.Tm
## Tot.Scr.Tim -0.475
## Tot.Soc.Tim -0.079 -0.456
## Pickups     -0.447 -0.014  -0.141

```

## SIMPLE LINEAR ANALYSIS

Overall:

```

soc_lmm <- lm(Pickup.1st.minute ~ Tot.Soc.Time,screen_data_complete)

summary(soc_lmm)

##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Soc.Time, data = screen_data_complete)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -304.50  -55.81  -16.74   46.44  489.41
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  494.17315     6.27707   78.727  <2e-16 ***
## Tot.Soc.Time    0.04015     0.04257    0.943   0.346
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 97.85 on 917 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.0009693, Adjusted R-squared:  -0.0001201
## F-statistic: 0.8897 on 1 and 917 DF,  p-value: 0.3458

pickups_lmm <- lm(Pickup.1st.minute ~ Pickups,screen_data_complete)

summary(pickups_lmm)

##
## Call:
## lm(formula = Pickup.1st.minute ~ Pickups, data = screen_data_complete)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -310.40  -56.98  -13.66   47.21  482.97
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  480.46447     6.85909   70.05  < 2e-16 ***
## Pickups       0.18608     0.06003    3.10  0.00199 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 97.38 on 917 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.01037, Adjusted R-squared:  0.009292
## F-statistic: 9.61 on 1 and 917 DF,  p-value: 0.001994

m1 <- lm(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups,screen_data_complete)

summary(m1)

##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time +

```

```
##      Pickups, data = screen_data_complete)
##
## Residuals:
##      Min        1Q    Median        3Q        Max
## -312.92   -57.08   -13.30    47.60   484.93
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  475.829394  10.060834  47.295 < 2e-16 ***
## Tot.Scr.Time    0.015640   0.024832   0.630  0.52896
## Tot.Soc.Time   -0.005534   0.048859  -0.113  0.90984
## Pickups        0.186005   0.062164   2.992  0.00284 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 97.47 on 915 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.01084,    Adjusted R-squared:  0.007594
## F-statistic: 3.342 on 3 and 915 DF,  p-value: 0.01877
```

School-Days:

```
weekday_data = screen_data_complete %>% filter(if_weekend == 0)
soc_weekday_lm <- lm(Pickup.1st.minute ~ Tot.Soc.Time, weekday_data)

summary(soc_weekday_lm)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Soc.Time, data = weekday_data)
##
## Residuals:
##      Min        1Q    Median        3Q        Max
## -289.50   -52.63    -5.11    42.12   504.48
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  479.24538    7.87073  60.890 <2e-16 ***
## Tot.Soc.Time    0.03888    0.05436   0.715   0.475
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 92.93 on 537 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.0009518,    Adjusted R-squared:  -0.0009086
## F-statistic: 0.5116 on 1 and 537 DF,  p-value: 0.4747
```

```
lmod2 <- lm(Pickup.1st.minute ~ Tot.Scr.Time, weekday_data)

summary(lmod2)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Scr.Time, data = weekday_data)
##
## Residuals:
```

```
##      Min      1Q  Median      3Q      Max
## -287.74 -55.04   -5.73   44.18  507.97
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  473.04821    10.32075   45.835  <2e-16 ***
## Tot.Scr.Time    0.03311     0.02852    1.161    0.246
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 92.86 on 537 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.002503, Adjusted R-squared:  0.0006456
## F-statistic: 1.348 on 1 and 537 DF, p-value: 0.2462
```

```
weekday_pickups_lm <- lm(Pickup.1st.minute ~ Pickups, weekday_data)
```

```
summary(weekday_pickups_lm)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Pickups, data = weekday_data)
##
## Residuals:
##      Min      1Q  Median      3Q      Max
## -288.69 -53.39   -5.19   41.09  501.64
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  476.09924     9.01908   52.788  <2e-16 ***
## Pickups        0.07774     0.07861    0.989    0.323
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 92.89 on 537 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.001818, Adjusted R-squared: -4.094e-05
## F-statistic: 0.978 on 1 and 537 DF, p-value: 0.3231
```

```
weekday_lm <- lm(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups, weekday_data)
```

```
summary(weekday_lm)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time +
##      Pickups, data = weekday_data)
##
## Residuals:
##      Min      1Q  Median      3Q      Max
## -288.40 -53.90   -6.16   42.66  505.63
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  4.669e+02  1.259e+01  37.070  <2e-16 ***
```

```
## Tot.Scr.Time 3.045e-02 3.239e-02 0.940 0.347
## Tot.Soc.Time 3.591e-05 6.320e-02 0.001 1.000
## Pickups      6.884e-02 8.107e-02 0.849 0.396
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 92.97 on 535 degrees of freedom
## (1 observation deleted due to missingness)
## Multiple R-squared:  0.003913, Adjusted R-squared:  -0.001672
## F-statistic: 0.7006 on 3 and 535 DF, p-value: 0.552
```

Non-School Days:

```
weekend_data = screen_data_complete %>% filter(if_weekend == 1)
soc_weekend_lm <- lm(Pickup.1st.minute ~ Tot.Soc.Time, weekend_data)

summary(soc_weekend_lm)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Soc.Time, data = weekend_data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -308.34  -67.75  -20.43   57.36  392.17
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  517.31735     9.93082  52.092  <2e-16 ***
## Tot.Soc.Time    0.02662     0.06569   0.405   0.686
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 100.8 on 378 degrees of freedom
## Multiple R-squared:  0.0004343, Adjusted R-squared:  -0.00221
## F-statistic: 0.1642 on 1 and 378 DF, p-value: 0.6855
```

```
lmod3 <- lm(Pickup.1st.minute ~ Tot.Scr.Time, weekend_data)

summary(lmod3)
```

```
##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Scr.Time, data = weekend_data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -306.83  -66.60  -22.37   58.05  388.22
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)  527.76895    13.21815  39.928  <2e-16 ***
## Tot.Scr.Time  -0.01988     0.03446  -0.577   0.564
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
```



```
## Residual standard error: 100.8 on 378 degrees of freedom
## Multiple R-squared:  0.0008794, Adjusted R-squared:  -0.001764
## F-statistic: 0.3327 on 1 and 378 DF,  p-value: 0.5644

weekend_pickups_lm <- lm(Pickup.1st.minute ~ Pickups, weekend_data)

summary(weekend_pickups_lm)

##
## Call:
## lm(formula = Pickup.1st.minute ~ Pickups, data = weekend_data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -300.48  -60.72  -17.97   55.46  358.76
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 487.35823   10.13521  48.086 < 2e-16 ***
## Pickups      0.33969    0.08922   3.807 0.000164 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 98.99 on 378 degrees of freedom
## Multiple R-squared:  0.03693, Adjusted R-squared:  0.03438
## F-statistic: 14.5 on 1 and 378 DF,  p-value: 0.0001639

weekend_lm <- lm(Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time + Pickups, weekend_data)

summary(weekend_lm)

##
## Call:
## lm(formula = Pickup.1st.minute ~ Tot.Scr.Time + Tot.Soc.Time +
##     Pickups, data = weekend_data)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -300.07  -64.44  -16.28   55.68  354.49
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) 494.29459   15.84995  31.186 < 2e-16 ***
## Tot.Scr.Time -0.01161    0.03739  -0.311 0.756322
## Tot.Soc.Time -0.02973    0.07376  -0.403 0.687107
## Pickups      0.34986    0.09340   3.746 0.000208 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 99.2 on 376 degrees of freedom
## Multiple R-squared:  0.03807, Adjusted R-squared:  0.03039
## F-statistic:  4.96 on 3 and 376 DF,  p-value: 0.002181
```