

```
# Clear working space
```

```
rm(list = ls())
```

```
# Install packages for the people use the packages first time
```

```
# Load packages
```

```
library(tidyverse)
```

```
library(readxl)
```

```
library(lubridate)
```

```
library(plotly)
```

```
library(ggpubr)
```

```
#1. Load the excel files and name the column head
```

```
#1.1 Make a function to read all Excel spreadsheets
```

```
LA_read <- function(x){  
  dat <- read_excel(x, col_names = FALSE, skip = 4)  
  names(dat) <- c("Treatment", "Plate", "Location", "Time",  
    "err%", "Distance", "Velocity", "Turn_angle",  
    "Angular_Velocity")  
  return(dat)  
}
```

```
#1.2 List all file names with .xlsx in the folder
```

```
file_vec <- list.files(pattern = ".xlsx$")
```

```
file_vec
```

```
#1.3 Use the LA_read function to load the PFOA excel
```

```
##### spreadsheets for analysis and use map_dfr to combine
```

```
##### all dataframes
```

```
dat_all <- map_dfr(file_vec,  
  LA_read, .id = "Parent")
```

```
# Check treatment names
```

```
unique(dat_all$Treatment)
```

```
#2. Clean up data
```

```
##2-1. Define light and dark cycles
```

```
dat_all2 <- dat_all %>%
```

```
  # Manipulate the time index
```

```
  separate(Time, into = c("Start", "End"), sep = "-") %>%
```

```
  mutate(End = hms(End)) %>%
```

```
  mutate(Sec = as.numeric(End - hms("00:00:00"))) %>%
```

```
  select(-End) %>%
```

```
  group_by(Parent, Location, Treatment) %>%
```

```
  mutate(CycleN = (Sec %/% 30 - 1) %/% 6) %>%
```

```

mutate(Cycle = ifelse(CycleN %% 2 == 0, "Light", "Dark"))

# Replace "Start" to "0:00:00"
dat_all3 <- dat_all2 %>%
  ungroup() %>%
  mutate(Start = recode(Start, "Start" = "0:00:00"))

#3. Assign sample ID
dat_all4 <- dat_all3 %>%
  mutate(Sample_ID =
    group_indices(., Parent, Treatment,
      Plate, Location))

#4. Separate dark and light data
# Filter light data
dat_light <- dat_all4 %>%
  filter(Cycle == "Light")

# Filter dark data
dat_Dark <- dat_all4 %>%
  filter(Cycle == "Dark")

#5. Quality control: Use outlier methods to remove the abnormal data
# 5-1. Remove the outliers from light cycle
# Filter control light data
dat_light_control <- dat_light %>%
  filter(Treatment == "control")

# Calculate the IQR of light cycles in control data
light_q25 <- quantile(dat_light_control$Distance, 0.25)
light_q75 <- quantile(dat_light_control$Distance, 0.75)
IQR <- light_q75 - light_q25
upper_L <- light_q75 + IQR
upper_L_C <- light_q75 + 1.5*IQR

# Starting from the third data points, remove the series that have
# two serial data points larger than upper bound in the light cycles
dat_C_light <- dat_light %>%
  group_by(Sample_ID) %>%
  filter(!any((Distance[3:24] > upper_L_C) &
    (lead(Distance[3:24]) > upper_L_C))) %>%

```

```

ungroup()

# Check how many data series are removed
n_distinct(dat_light$Sample_ID)-n_distinct(dat_C_light$Sample_ID)

# After removing the light data series, remove the associated dark series
dat_C_Dark <- dat_Dark %>%
  semi_join(dat_C_light, by = c("Sample_ID"))

# Make a new data from the list that has completed the first QC step
dat_C <- bind_rows(dat_C_light, dat_C_Dark)

# 5-2. Remove the abnormal data from dark cycle:
# Calculate the median distance of light cycles
Dark_upper <- median(dat_C_light$Distance)

# Remove dark cycle data series if two serial data points are lower
# than the median of light cycles
dat_C2_Dark <- dat_C_Dark %>%
  group_by(Sample_ID) %>%
  filter(!any((Distance < Dark_upper) &
    (lead(Distance) < Dark_upper))) %>%
  ungroup()

# After removing the dark data series, remove the associated light series
dat_C2_light <- dat_C_light %>%
  semi_join(dat_C2_Dark, by = c("Sample_ID"))

# Make a new data from that have completed the 2nd QC step
dat_C2 <- bind_rows(dat_C2_light, dat_C2_Dark)

# Check how many data series are removed at the 2nd QC step
n_distinct(dat_C_light$Sample_ID)-n_distinct(dat_C2$Sample_ID)

# 5-3. Figure which data series have similar light and dark mean distance
dat_filter <- dat_C2 %>%
  group_by(Sample_ID, Cycle) %>%
  summarize(mean_dis = mean(Distance)) %>%
  spread(Cycle, mean_dis) %>%
  mutate(Ratio = Light/Dark) %>%
  filter(Ratio > 0.9)

# Remove the data series that have similar light and dark mean distance
dat_C3 <- dat_C2 %>%

```

```

anti_join(dat_filter, by = "Sample_ID")

# Check how many data series are removed at the 3rd QC step
n_distinct(dat_C2$Sample_ID)-n_distinct(dat_C3$Sample_ID)

# Check how many data series are removed from all QC step
n_distinct(dat_light$Sample_ID)-n_distinct(dat_C3$Sample_ID)

# 5-4. Record which samples were removed by comparing the new and
##### old data sheets
remove_list <- dat_all4 %>%
  anti_join(dat_C3, by = c("Sample_ID"))

# Save the remove list into a data frame
remove_list_save <- remove_list %>%
  distinct(Parent, Treatment, Location, Plate, Sample_ID)

# Save the datasheet into a csv file
write.csv(remove_list, "Initial-remove_list.csv", row.names = FALSE)

## 6. Plot the behavior plots after QC
# Calculate the statistics of each treatment
dat_C3_Combine <- dat_C3 %>%
  group_by(Start, Treatment) %>%
  summarise(N = n(),
            Mean_Distance = mean(Distance),
            SD_Distance = sd(Distance),
            SE = SD_Distance/N) %>%
  ungroup() %>%
  mutate(Start = as.numeric(hms(Start))/60)

# Define the shade region in a different dataframe
rect_C3 <- data.frame(
  xstart = c(3, 9, 15, 21),
  xend = c(6, 12, 18, 24)
)

# Plot
Combine <- ggplot() +
  geom_rect(data = rect_C3, aes(xmin = xstart, xmax = xend,
                              ymin = -Inf, ymax = Inf),
            alpha = 0.2) +
  geom_line(data = dat_C3_Combine,
            aes(x = Start, y = Mean_Distance,

```

```

      group = Treatment), size = 0.8) +
geom_point(data = dat_C3_Combine,
  aes(x = Start, y = Mean_Distance,
    fill = Treatment), shape = 21, color = "black",
    size = 5) +
scale_fill_brewer(type = "seq", palette = "Oranges", direction = 1) +
scale_x_continuous(breaks = seq(0, 24, by = 3)) +
theme_classic() +
theme(legend.position = "none",
  axis.title = element_text(size = 16),
  axis.text = element_text(size = 16)) +
xlab("Time (min)") +
ylab("Distance moved (cm)")

```

#7. Summarize the distance data after and before QC:

After QC

```

Summary_Distance <- dat_C3 %>%
  group_by(Treatment, Cycle) %>%
  summarise(
    N = n()/24,
    mean = mean(Distance, na.rm = TRUE),
    sd = sd(Distance, na.rm = TRUE),
    CV = sd/mean,
    se = sd/(N^0.5)
  )

```

#8. Run ANOVA and Tukey pairwise to compare the distance

#8-1. After QC- dark data

```

dat_C3_Dark <- dat_C3 %>%
  filter(Cycle == "Dark")

```

Run ANOVA

```

Dark.aov <- aov(Distance ~ Treatment, data = dat_C3_Dark)

```

Check ANOVA results

```

summary(Dark.aov)

```

Check Tukey pairwise results

```

TukeyHSD(Dark.aov)

```

#8-2. After QC- light data

```

dat_C3_Light <- dat_C3 %>%

```

```

filter(Cycle == "Light")

# Run ANOVA
Light.aov <- aov(Distance ~ Treatment, data = dat_C3_Light)

# Check ANOVA results
summary(Light.aov)

# Check Tukey pairwise results
TukeyHSD(Light.aov)

#9. Plot bar plot
#9-1 (1) Define the significant treatment in a dataframe: ex. 70ng/L and 7ng/L
#### were significant different from control;
#### (2) Recode the treatment label
Summary_Distance_text <- Summary_Distance %>%
  mutate(Sig = ifelse(Treatment %in% c("70ng/L", "7ng/L"),
    "****", NA)) %>%
  ungroup() %>%
  mutate(Treatment = recode(Treatment,
    "control" = 0,
    "7ng/L" = 7,
    "70ng/L" = 70,
    "700ng/L" = 700)) %>%
  mutate(Treatment = factor(Treatment))

#9-2. Make the bar plot
barplot <-
ggplot(Summary_Distance_text, aes(x = Cycle,
  y = mean,
  fill = Treatment)) +
  geom_col(position = "dodge", colour = "black") +
  annotate(xmin = 0.5, xmax = 1.5, ymin = -Inf, ymax = Inf,
    alpha = 0.2, geom = 'rect') +
  geom_errorbar(aes(ymax = mean + se,
    ymin = mean - se),
    position = position_dodge(.9),
    width = 0.2) +
  geom_text(aes(y = mean + se + 0.3, label = Sig),
    position = position_dodge(.9),
    size = 6) +
  scale_fill_brewer(name = "PFOA \nconcentration (ng/L)",
    type = "seq",

```

```
      palette = "Oranges", direction = 1) +  
xlab("") +  
ylab("Distance moved (cm)") +  
theme_classic() +  
theme(panel.grid = element_blank(),  
      axis.title = element_text(size = 16),  
      axis.text = element_text(size = 16))
```

#10. Combine the two figures with one row (nrow = 1)
figure <- ggarrange(Combine, barplot, nrow = 1)

#11. Save the figure.
Check the png file, modify the height and width if needed
ggsave("example.png", figure, height = 6, width = 16)