

Behavioral Tolerance, Vigor, and resilience

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Contents

1	Introduction	1
1.1	Overall summary	1
1.2	Quick experimental summary	1
1.3	Load in packages needed for analysis	1
1.4	Load in dataframe	1
1.5	Calculate metrics needed for further analyses	2
1.6	Description of data, structure, and type	19

1 Introduction

1.1 Overall summary

1.2 Quick experimental summary

1.3 Load in packages needed for analysis

```
# Clear the working environment
rm(list = ls())
# Visualization
library(ggplot2)
library(visreg)
source("http://highstat.com/Books/BGS/GAMM/RCodeP2/HighstatLibV6.R")
# (generalized) Linear mixed modeling
library(lme4)
library(glmmTMB)
library(lmodel2)
# Statistical analysis reporting and model validation
library(performance)
library(car)
library(lmtest)
library(DHARMA)
# Data wrangling
library(dplyr)
```

```
library(plyr)
library(tidyverse)
library(tidylog)
```

1.4 Load in dataframe

```
# Loading in data set
IndBehav <- read_csv("VIEBehavior_20210913_V2.csv", col_types = cols(fishID = col_character(),
  Infection = col_character(), InfDate = col_character(), BehavGroup = col_character(),
  dayofinf = col_character(), CountDay = col_character(), Behavdate = col_character(),
  TOD = col_character(), Duration = col_double(), Velocity = col_double(), Distance = col_double()))

# Filtering Data set so we can perform our analysis
IndBehav1 <- IndBehav %>%
  # Removing columns we dont need
select(-c(Blind.ID, InfLength, LateLength, dayofinf, Countintial, Notes, InfWeight))
```

```
## select: dropped 7 variables (Blind.ID, InfWeight, InfLength, LateLength, dayofinf, ...)
```

1.5 Calculate metrics needed for further analyses

1.5.1 Calculating all body condition metrics

```
##### This code is just to examine how many fish cleared their infection
##### (13)##### IndBehavRec<- IndBehav1 %>% filter(Recov==1)%>% filter(Fish==1)

##### This code is just to examine how many fish died during their infection
##### (2)##### IndBehavDead<- IndBehav1 %>% filter(Died==1)%>% filter(Fish==1)

FemaleOnly <- IndBehav1 %>%
  filter(Sex == "F")
```

```
## filter: removed 541 rows (49%), 564 rows remaining
```

```
MaleOnly <- IndBehav1 %>%
  filter(Sex == "M")
```

```
## filter: removed 565 rows (51%), 540 rows remaining
```

```
# Calculating SMI metrics Preinfection SMI#####
```

```
# PreinfectionSMI for females To calculate the SMI we take the OLS slope
lmodel2(log(as.numeric(PreWeight) + 1) ~ log(as.numeric(PreLength) + 1), data = FemaleOnly)
```

```
## RMA was not requested: it will not be computed.
```

```
## No permutation test will be performed
```

```
##
## Model II regression
##
## Call: lmodel2(formula = log(as.numeric(PreWeight) + 1) ~
## log(as.numeric(PreLength) + 1), data = FemaleOnly)
##
## n = 564    r = 0.9103118    r-square = 0.8286675
## Parametric P-values:    2-tailed = 1.890218e-217    1-tailed = 9.451089e-218
## Angle between the two OLS regression lines = 4.099607 degrees
##
## Regression results
##   Method Intercept      Slope Angle (degrees) P-perm (1-tailed)
## 1    OLS -1.114762 0.4206982      22.81640      NA
## 2     MA -1.155627 0.4341311      23.46717      NA
## 3    SMA -1.240856 0.4621474      24.80390      NA
##
## Confidence intervals
##   Method 2.5%-Intercept 97.5%-Intercept 2.5%-Slope 97.5%-Slope
## 1    OLS      -1.163000      -1.066525  0.4048487  0.4365478
## 2     MA      -1.205686      -1.106162  0.4178711  0.4505866
## 3    SMA      -1.289899      -1.193466  0.4465696  0.4782687
##
## Eigenvalues: 0.009625885 0.0002518475
##
## H statistic used for computing C.I. of MA: 0.0001893902

# Take the median length from summary
summary(FemaleOnly$PreLength)

##   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##  16.60  18.40   20.20   20.03  21.20   24.20

# Adding PreSMI to Dataframe
FemaleOnly <- FemaleOnly %>%
  group_by(fishID) %>%
  mutate(PreSMI = PreWeight * ((20.2/PreLength)^0.4206982))

## group_by: one grouping variable (fishID)

## mutate (grouped): new variable 'PreSMI' (double) with 47 unique values and 0% NA

# PreinfectionSMI for males
lmodel2(log(as.numeric(PreWeight) + 1) ~ log(as.numeric(PreLength) + 1), data = MaleOnly)

## RMA was not requested: it will not be computed.

## No permutation test will be performed

##
## Model II regression
##
```

```
## Call: lmodel2(formula = log(as.numeric(PreWeight) + 1) ~
## log(as.numeric(PreLength) + 1), data = MaleOnly)
##
## n = 540    r = 0.7784225    r-square = 0.6059415
## Parametric P-values:    2-tailed = 7.086423e-111    1-tailed = 3.543211e-111
## Angle between the two OLS regression lines = 6.76859 degrees
##
## Regression results
##   Method Intercept      Slope Angle (degrees) P-perm (1-tailed)
## 1    OLS -0.4620565 0.1938185      10.96898      NA
## 2     MA -0.4750867 0.1984879      11.22660      NA
## 3    SMA -0.6160126 0.2489888      13.98170      NA
##
## Confidence intervals
##   Method 2.5%-Intercept 97.5%-Intercept 2.5%-Slope 97.5%-Slope
## 1    OLS      -0.4990055      -0.4251076 0.1805813 0.2070557
## 2     MA      -0.5130172      -0.4373522 0.1849657 0.2120803
## 3    SMA      -0.6539329      -0.5800547 0.2361033 0.2625776
##
## Eigenvalues: 0.00431447 9.773707e-05
##
## H statistic used for computing C.I. of MA: 0.0001701002
```

```
# Take the median length from summary
summary(MaleOnly$PreLength)
```

```
##   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##  13.70  14.50   15.30   15.32   16.00   18.50
```

```
# Adding PreSMI to Dataframe
MaleOnly <- MaleOnly %>%
  group_by(fishID) %>%
  mutate(PreSMI = PreWeight * ((15.3/PreLength)^0.1938185))
```

```
## group_by: one grouping variable (fishID)
```

```
## mutate (grouped): new variable 'PreSMI' (double) with 44 unique values and 0% NA
```

```
##### Late Infection SMI####
```

```
# Late infection SMI for females Take OLS slope from this model
lmodel2(log(as.numeric(LateWeight) + 1) ~ log(as.numeric(PreLength) + 1), data = FemaleOnly)
```

```
## RMA was not requested: it will not be computed.
```

```
## No permutation test will be performed
```

```
##
```

```
## Model II regression
```

```
##
```

```
## Call: lmodel2(formula = log(as.numeric(LateWeight) + 1) ~
```

```
## log(as.numeric(PreLength) + 1), data = FemaleOnly)
##
## n = 516    r = -0.127178    r-square = 0.01617424
## Parametric P-values:    2-tailed = 0.003807557    1-tailed = 0.001903778
## Angle between the two OLS regression lines = 57.58662 degrees
##
## Regression results
##   Method Intercept      Slope Angle (degrees) P-perm (1-tailed)
## 1    OLS   2.033718 -0.5976124    -30.86306          NA
## 2     MA 107.560934 -35.3034151    -88.37748          NA
## 3    SMA  14.504560 -4.6990243    -77.98610          NA
##
## Confidence intervals
##   Method 2.5%-Intercept 97.5%-Intercept 2.5%-Slope 97.5%-Slope
## 1    OLS      0.8050897      3.262347    -1.001497    -0.1937279
## 2     MA     64.2522935     331.105245   -108.822693   -21.0600644
## 3    SMA     13.3291795     15.785299     -5.120234    -4.3124649
##
## Eigenvalues: 0.1896132 0.008435402
##
## H statistic used for computing C.I. of MA: 0.0003658854
```

```
# Take the median length from summary
summary(FemaleOnly$PreLength)
```

```
##   Min. 1st Qu.  Median    Mean 3rd Qu.    Max.
##  16.60  18.40   20.20   20.03  21.20   24.20
```

```
# Adding PreSMI to Dataframe
FemaleOnly <- FemaleOnly %>%
  group_by(fishID) %>%
  mutate(LateSMI = PreWeight * ((20.1/PreLength)^-0.5976124))
```

```
## group_by: one grouping variable (fishID)
```

```
## mutate (grouped): new variable 'LateSMI' (double) with 47 unique values and 0% NA
```

```
# Late Infection SMI for males Take OLS slope from this model
lmodel2(log(as.numeric(LateWeight) + 1) ~ log(as.numeric(PreLength) + 1), data = MaleOnly)
```

```
## RMA was not requested: it will not be computed.
```

```
## No permutation test will be performed
```

```
##
## Model II regression
##
## Call: lmodel2(formula = log(as.numeric(LateWeight) + 1) ~
## log(as.numeric(PreLength) + 1), data = MaleOnly)
##
## n = 456    r = -0.06095677    r-square = 0.003715728
```

```
## Parametric P-values: 2-tailed = 0.1938354 1-tailed = 0.09691771
## Angle between the two OLS regression lines = 64.27059 degrees
##
## Regression results
## Method Intercept Slope Angle (degrees) P-perm (1-tailed)
## 1 OLS 1.492739 -0.472241 -25.27860 NA
## 2 MA 348.385697 -124.982883 -89.54158 NA
## 3 SMA 21.760991 -7.747145 -82.64494 NA
##
## Confidence intervals
## Method 2.5%-Intercept 97.5%-Intercept 2.5%-Slope 97.5%-Slope
## 1 OLS -0.4947141 3.480193 -1.185443 0.2409615
## 2 MA 138.8775568 -682.296809 244.961036 -49.7839131
## 3 SMA 19.8652425 23.839279 -8.493107 -7.0667022
##
## Eigenvalues: 0.204658 0.003396832
##
## H statistic used for computing C.I. of MA: 0.0001459962
```

```
# Take the median length from summary
summary(MaleOnly$PreLength)
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 13.70 14.50 15.30 15.32 16.00 18.50
```

```
# Adding PreSMI to Dataframe
MaleOnly <- MaleOnly %>%
  group_by(fishID) %>%
  mutate(LateSMI = PreWeight * ((15.3/PreLength)^-0.472241))
```

```
## group_by: one grouping variable (fishID)
```

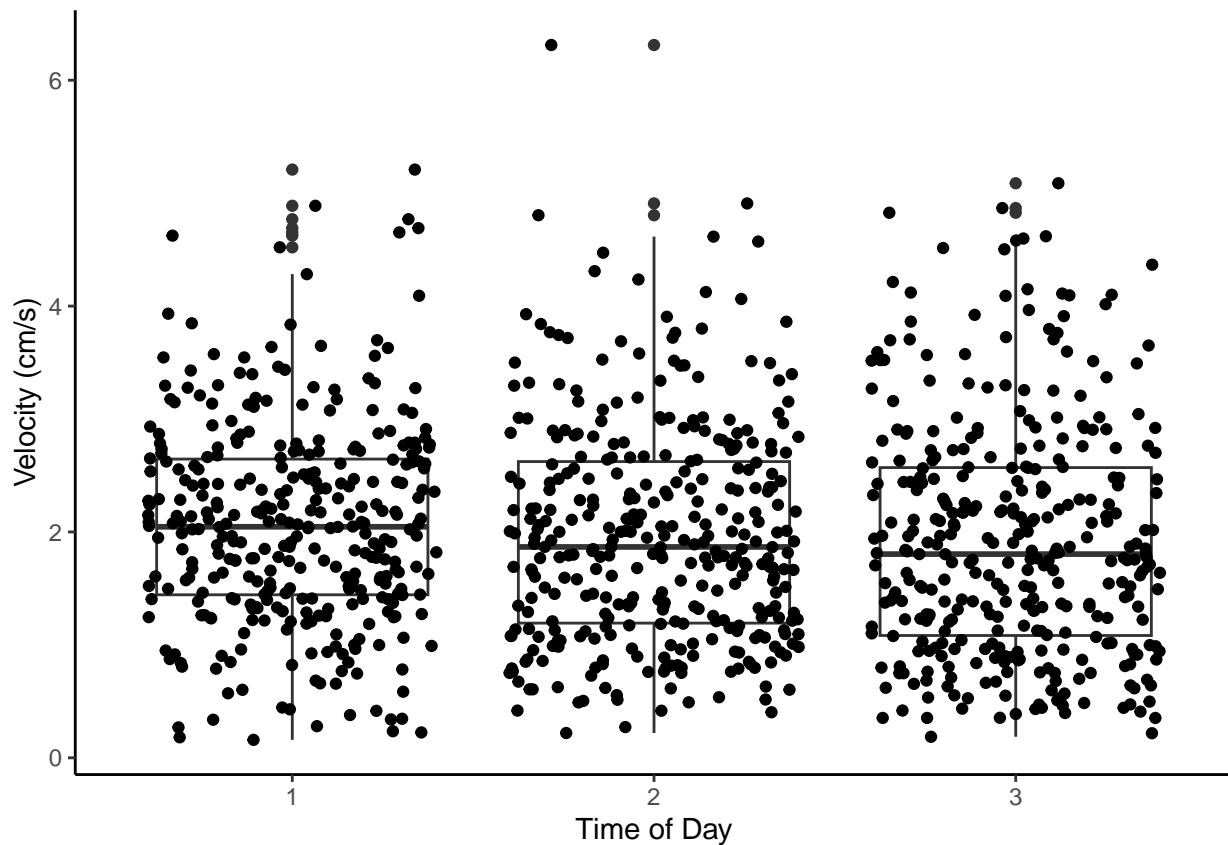
```
## mutate (grouped): new variable 'LateSMI' (double) with 44 unique values and 0% NA
```

```
#####
# Bringing the male and female dataframes together to create our overall
# dataframe
IndBehav2 <- rbind(FemaleOnly, MaleOnly)
# View(IndBehav2)
```

1.5.2 Checking that fish velocity is not different at different times of day.

We recorded the velocity of the fish at 3 time periods over the course of the day. Once in the morning between 0900-1100, once in the afternoon 1200-1400, 1500-1700. Therefore we wanted to confirm that there is no consistent Time of day effect before we collapse the behavioral measurements into means for each day.

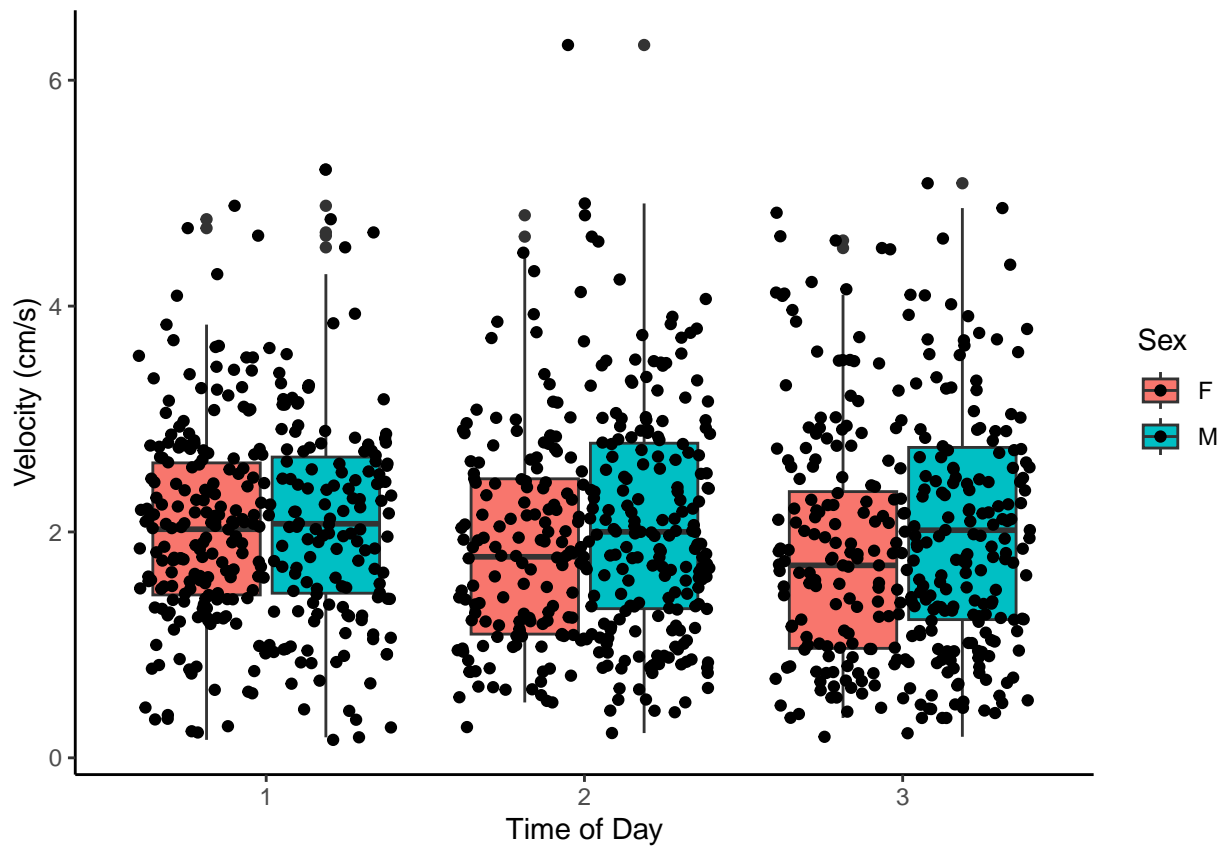
```
##### First visually look at the TOD effect for behavior#####
ggplot(IndBehav2, aes(TOD, Velocity)) + geom_boxplot() + geom_jitter() + xlab("Time of Day") +
  ylab("Velocity (cm/s)") + theme_classic()
```



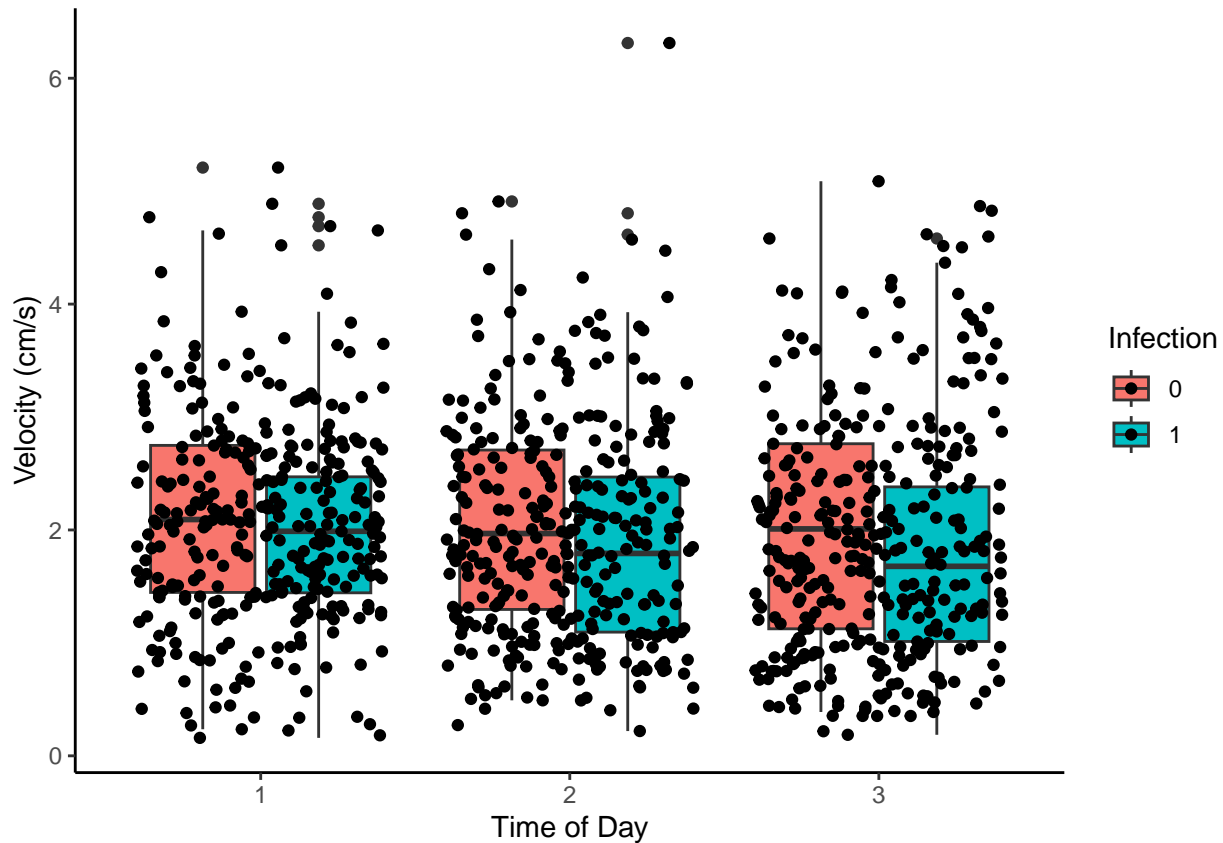
```
#### Verify that this is not statistically significant####
anova(lm(Velocity ~ TOD, IndBehav2))
```

```
## Analysis of Variance Table
##
## Response: Velocity
##           Df Sum Sq Mean Sq F value Pr(>F)
## TOD         2   3.34  1.67073   1.7383 0.1763
## Residuals 1017 977.45  0.96111
```

```
##### Lets also confirm this does not change by sex#####
ggplot(IndBehav2, aes(TOD, Velocity, fill = Sex)) + geom_boxplot() + geom_jitter() +
  xlab("Time of Day") + ylab("Velocity (cm/s)") + theme_classic()
```



```
##### Lets also confirm this does not change by Infection Status#####
ggplot(IndBehav2, aes(TOD, Velocity, fill = Infection)) + geom_boxplot() + geom_jitter() +
  xlab("Time of Day") + ylab("Velocity (cm/s)") + theme_classic()
```

Visually there does not seem to be a distinguished pattern overall and an anova confirms it. It also does not seem to visually differ by sex or infection status. Therefore we can collapse the three different time points within a day to a mean velocity and variance of velocity across each time point, Before, Early, Late, and Later.

1.5.3 Calculating the behavioral tolerance metrics needed for analyses

We are calculating behavioral tolerance through two metrics. First is a measure of behavioral tolerance using linear mixed models using slope random effects for fishID. This allows us to extract each individuals change in activity with parasite burden and therefore allow us to calculate the tolerance (fishID slope) for each individual. This also allows us to use the random effect intercept for fishID as a measure of behavioral vigor. The second way we could calculate these metrics are a measure of change in behavior between two points of behavior (often referred to as point tolerance, CITATION FOR THIS). This is calculated in the second half of the code as the change in behavior between pre-infection and early, late, and later points of infection.

```
# Calculating the behavioral tolerance metrics were interested in for our
# analysis

# Random slope from random effects model Random effects model with random slope
# for each fish by worm burden prior to measuring its activity. This slope is
# the tolerance an individual has to changing its behavior as infection
# increases. The slope of the behavior is the individuals behavioral vigor, or
# its pre-infection behavior#####
BehavTolLM <- lmer(Velocity ~ (Wormbf | fishID), IndBehav2)
summary(BehavTolLM)
```

```
## Linear mixed model fit by REML ['lmerMod']
## Formula: Velocity ~ (Wormbf | fishID)
## Data: IndBehav2
##
## REML criterion at convergence: 1363
##
## Scaled residuals:
##      Min       1Q   Median       3Q      Max
## -2.7511 -0.6468 -0.0308  0.5698  4.3071
##
## Random effects:
## Groups   Name                Variance Std.Dev. Corr
## fishID   (Intercept)  3.172e-01 0.563247
##          Wormbf      9.477e-06 0.003078 -0.17
## Residual                    5.781e-01 0.760314
## Number of obs: 541, groups: fishID, 48
##
## Fixed effects:
##              Estimate Std. Error t value
## (Intercept)   1.8515      0.0876   21.14
## optimizer (nloptwrap) convergence code: 0 (OK)
## Model failed to converge with max|grad| = 0.345298 (tol = 0.002, component 1)
## Model is nearly unidentifiable: very large eigenvalue
## - Rescale variables?
```

```
##### Extracting the intercept and slope from the linear mixed model####
```

```
betaTol <- data.frame(coef(BehavTolLM)$fishID)
```

```
##### Renaming the slope and intercept to align with our metrics#####
```

```
betaTol <- betaTol %>%
  rename(BehavTol = Wormbf, BehavVig = X.Intercept.)
```

```
## rename: renamed 2 variables (BehavTol, BehavVig)
```

```
##### Creating a fishID column for combination with future dataframe####
```

```
betaTol <- cbind(fishID = rownames(betaTol), betaTol)
```

```
# Calculating the mean and variance in velocity per day, per fish
```

```
# We need to split the dataframes into the different time periods to calculate
# averages since mutate isnt splitting by TrialTime.
```

```
##### creating a dataframe to calculate the mean and variance of velocity for
##### before measurements.####
```

```
InBehavBefore <- IndBehav2 %>%
  drop_na(Velocity) %>%
  filter(TrialTime == "Before") %>%
  select(-c(InfDiff, Fish, Behavdate, Duration, Distance, comp3, Totworm, rate05,
    rate012, rate512, rate1216, rate18end, TOD, day, linf, maxlinf, maxworm,
    peakday, Ddate, Rdate, CountDay)) %>%
  mutate(AvgVel = mean(Velocity), VarVel = var(Velocity)) %>%
  distinct(fishID, .keep_all = TRUE)
```

```
## drop_na (grouped): removed 84 rows (8%), 1,020 rows remaining
```

```
## filter (grouped): removed 750 rows (74%), 270 rows remaining

## select: dropped 21 variables (Fish, CountDay, day, Totworm, comp3, ...)

## mutate (grouped): new variable 'AvgVel' (double) with 91 unique values and 0% NA

##               new variable 'VarVel' (double) with 91 unique values and 0% NA

## distinct (grouped): removed 179 rows (66%), 91 rows remaining
```

```
##### creating a dataframe to calculate the mean and variance of velocity for
##### early measurements. #####
```

```
InBehavEarly <- IndBehav2 %>%
  drop_na(Velocity) %>%
  filter(TrialTime == "Early") %>%
  select(-c(InfDiff, Fish, Behavdate, Duration, Distance, comp3, Totworm, rate05,
            rate012, rate512, rate1216, rate18end, TOD, day, linf, maxlinf, maxworm,
            peakday, Ddate, Rdate, CountDay)) %>%
  mutate(AvgVel = mean(Velocity), VarVel = var(Velocity)) %>%
  distinct(fishID, .keep_all = TRUE)
```

```
## drop_na (grouped): removed 84 rows (8%), 1,020 rows remaining

## filter (grouped): removed 760 rows (75%), 260 rows remaining

## select: dropped 21 variables (Fish, CountDay, day, Totworm, comp3, ...)

## mutate (grouped): new variable 'AvgVel' (double) with 87 unique values and 0% NA

##               new variable 'VarVel' (double) with 87 unique values and 0% NA

## distinct (grouped): removed 173 rows (67%), 87 rows remaining
```

```
##### creating a dataframe to calculate the mean and variance of velocity for
##### Late measurements. #####
```

```
InBehavLate <- IndBehav2 %>%
  drop_na(Velocity) %>%
  filter(TrialTime == "Late") %>%
  select(-c(InfDiff, Fish, Behavdate, Duration, Distance, comp3, Totworm, rate05,
            rate012, rate512, rate1216, rate18end, TOD, day, linf, maxlinf, maxworm,
            peakday, Ddate, Rdate, CountDay)) %>%
  mutate(AvgVel = mean(Velocity), VarVel = var(Velocity)) %>%
  distinct(fishID, .keep_all = TRUE)
```

```
## drop_na (grouped): removed 84 rows (8%), 1,020 rows remaining

## filter (grouped): removed 761 rows (75%), 259 rows remaining
```

```
## select: dropped 21 variables (Fish, CountDay, day, Totworm, comp3, ...)

## mutate (grouped): new variable 'AvgVel' (double) with 87 unique values and 0% NA

##               new variable 'VarVel' (double) with 87 unique values and 0% NA

## distinct (grouped): removed 172 rows (66%), 87 rows remaining
```

```
##### creating a dataframe to calculate the mean and variance of velocity for
##### Later measurements.#####
```

```
InBehavLater <- IndBehav2 %>%
  drop_na(Velocity) %>%
  filter(TrialTime == "Later") %>%
  select(-c(InfDiff, Fish, Behavdate, Duration, Distance, comp3, Totworm, rate05,
    rate012, rate512, rate1216, rate18end, TOD, day, linf, maxlinf, maxworm,
    peakday, Ddate, Rdate, CountDay)) %>%
  mutate(AvgVel = mean(Velocity), VarVel = var(Velocity)) %>%
  distinct(fishID, .keep_all = TRUE)
```

```
## drop_na (grouped): removed 84 rows (8%), 1,020 rows remaining

## filter (grouped): removed 789 rows (77%), 231 rows remaining

## select: dropped 21 variables (Fish, CountDay, day, Totworm, comp3, ...)

## mutate (grouped): new variable 'AvgVel' (double) with 79 unique values and 0% NA

##               new variable 'VarVel' (double) with 79 unique values and 0% NA

## distinct (grouped): removed 152 rows (66%), 79 rows remaining
```

```
##### Adding these dataframes together to create one large one#####
```

```
IndBehav3 <- rbind(IndBehavBefore, IndBehavEarly, IndBehavLate, IndBehavLater)
```

```
##### Pivoting wider so I can subtract velocity changes between periods to get
##### change in behavior#####
```

```
IndBehav4 <- IndBehav3 %>%
  group_by(TrialTime, fishID, add = TRUE) %>%
  select(-Velocity) %>%
  pivot_wider(names_from = TrialTime, values_from = c(Wormbf, Ratebf, AvgVel, VarVel))
```

```
## group_by: 2 grouping variables (fishID, TrialTime)
```

```
## select: dropped one variable (Velocity)
```

```
## pivot_wider: reorganized (Wormbf, TrialTime, Ratebf, AvgVel, VarVel) into (Wormbf_Before, Wormbf_Ear
```

```
##### subset down to infected individuals only and calculate point tolerance
##### metrics for each timeframe. #####
IndBehav4Inf <- IndBehav4 %>%
  group_by(fishID) %>%
  filter(Infection == 1) %>%
  mutate(EChBe = AvgVel_Early - AvgVel_Before, LChBe = AvgVel_Late - AvgVel_Before,
         LtrChBe = AvgVel_Later - AvgVel_Before, ERatebf = (Wormbf_Early - Wormbf_Before)/6,
         LRatebf = (Wormbf_Late - Wormbf_Early)/6, LtrRatebf = (Wormbf_Later - Wormbf_Late)/6) %>%
  pivot_longer(cols = starts_with("Wormbf"), names_to = "TrialTime", names_prefix = "Wormbf_",
               values_to = "Wormbf") %>%
  select(-c(AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later, Ratebf_Before,
            Ratebf_Early, Ratebf_Late, Ratebf_Later)) %>%
  filter(fishID != 44)
```

```
## group_by: one grouping variable (fishID)
```

```
## filter (grouped): removed 38 rows (39%), 59 rows remaining
```

```
## mutate (grouped): new variable 'EChBe' (double) with 47 unique values and 22% NA
```

```
## new variable 'LChBe' (double) with 44 unique values and 27% NA
```

```
## new variable 'LtrChBe' (double) with 37 unique values and 39% NA
```

```
## new variable 'ERatebf' (double) with 23 unique values and 25% NA
```

```
## new variable 'LRatebf' (double) with 39 unique values and 25% NA
```

```
## new variable 'LtrRatebf' (double) with 37 unique values and 32% NA
```

```
## pivot_longer: reorganized (Wormbf_Before, Wormbf_Early, Wormbf_Late, Wormbf_Later) into (TrialTime, Wormbf_)
```

```
## select: dropped 8 variables (Ratebf_Before, Ratebf_Early, Ratebf_Late, Ratebf_Later, AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later)
```

```
## filter (grouped): removed 4 rows (2%), 232 rows remaining
```

```
##### Make two dataframes with pivot longer for wormbf and velocity then merge
##### them together on fishID and TrialTime#####
IndBehav4InfV <- IndBehav4 %>%
  filter(Infection == 1) %>%
  pivot_longer(cols = starts_with("AvgVel"), names_to = "TrialTime", names_prefix = "AvgVel_",
               values_to = "AvgVel") %>%
  select(fishID, AvgVel, TrialTime) %>%
  filter(fishID != 44)
```

```
## filter (grouped): removed 38 rows (39%), 59 rows remaining
```

```
## pivot_longer: reorganized (AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later) into (TrialTime, AvgVel_)
```

```
## select: dropped 25 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)
```

```
## filter (grouped): removed 4 rows (2%), 232 rows remaining
```

```
##### Making the growth rate columns into one column for infected
##### individuals#####
IndBehavGRInf <- IndBehav4 %>%
  filter(Infection == 1) %>%
  pivot_longer(cols = starts_with("Ratebf"), names_to = "TrialTime", names_prefix = "Ratebf_",
    values_to = "Ratebf") %>%
  select(fishID, TrialTime, Ratebf)

## filter (grouped): removed 38 rows (39%), 59 rows remaining

## pivot_longer: reorganized (Ratebf_Before, Ratebf_Early, Ratebf_Late, Ratebf_Later) into (TrialTime, Ratebf)

## select: dropped 25 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

##### Making the new growth rate columns into one column for infected
##### individuals#####
IndBehavNGRInf <- IndBehav4Inf %>%
  select(fishID, ERatebf, LRatebf, LtrRatebf) %>%
  rename(NRatebf_Early = ERatebf, NRatebf_Late = LRatebf, NRatebf_Later = LtrRatebf) %>%
  add_column(NRatebf_Before = 0) %>%
  pivot_longer(cols = starts_with("NRatebf"), names_to = "TrialTime", names_prefix = "NRatebf_",
    values_to = "NRatebf") %>%
  select(fishID, TrialTime, NRatebf) %>%
  distinct(fishID, TrialTime, .keep_all = TRUE)

## select: dropped 22 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

## rename: renamed 3 variables (NRatebf_Early, NRatebf_Late, NRatebf_Later)

## pivot_longer: reorganized (NRatebf_Early, NRatebf_Late, NRatebf_Later, NRatebf_Before) into (TrialTime, NRatebf)

## select: no changes

## distinct (grouped): removed 720 rows (78%), 208 rows remaining

##### Making the Variance columns into one column for infected individuals#####
IndBehavVarInf <- IndBehav4Inf %>%
  select(-TrialTime) %>%
  pivot_longer(cols = starts_with("VarVel"), names_to = "TrialTime", names_prefix = "VarVel_",
    values_to = "VarVel") %>%
  select(fishID, TrialTime, VarVel) %>%
  distinct(fishID, TrialTime, .keep_all = TRUE)

## select: dropped one variable (TrialTime)

## pivot_longer: reorganized (VarVel_Before, VarVel_Early, VarVel_Late, VarVel_Later) into (TrialTime, VarVel)

## select: dropped 20 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

## distinct (grouped): removed 720 rows (78%), 208 rows remaining
```

```

##### Merging the tolerance and vigor metrics #####
IndBehav4Inf1 <- merge(IndBehav4Inf, betaTol, by.x = "fishID", by.y = "fishID")

##### Merge the two dataframes together based on the fishID and TrialTime to
##### get all variables we want into one dataframe#####
IndBehav5Inf <- merge(IndBehav4InfV, IndBehav4Inf1, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Inf2 <- merge(IndBehav5Inf, IndBehavGRInf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Inf3 <- merge(IndBehav5Inf2, IndBehavNGRInf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Inf4 <- merge(IndBehav5Inf3, IndBehavVarInf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
# Subset down to uninfected individuals and calculate their point tolerance
# metrics Creating a dataframe for calculating the tolerance metrics and then
# pivot longer by Wormbf#####
IndBehav4Unf <- IndBehav4 %>%
  filter(Infection == 0) %>%
  mutate(EChBe = AvgVel_Early - AvgVel_Before, LChBe = AvgVel_Late - AvgVel_Before,
    LtrChBe = AvgVel_Later - AvgVel_Before, NRatebf_Early = (Wormbf_Early - Wormbf_Before)/5,
    NRatebf_Late = (Wormbf_Late - Wormbf_Early)/5, NRatebf_Later = (Wormbf_Later -
    Wormbf_Late)/5, ) %>%
  group_by(fishID) %>%
  pivot_longer(cols = starts_with(c("Wormbf")), names_to = "TrialTime", names_prefix = c("Wormbf_"),
    values_to = "Wormbf") %>%
  select(-c(AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later, Ratebf_Before,
    Ratebf_Early, Ratebf_Late, Ratebf_Later))

```

filter (grouped): removed 59 rows (61%), 38 rows remaining

mutate (grouped): new variable 'EChBe' (double) with 38 unique values and 0% NA

new variable 'LChBe' (double) with 38 unique values and 0% NA

new variable 'LtrChBe' (double) with 38 unique values and 3% NA

new variable 'NRatebf_Early' (double) with one unique value and 100% NA

new variable 'NRatebf_Late' (double) with one unique value and 100% NA

new variable 'NRatebf_Later' (double) with one unique value and 100% NA

group_by: one grouping variable (fishID)

pivot_longer: reorganized (Wormbf_Before, Wormbf_Early, Wormbf_Late, Wormbf_Later) into (TrialTime, Wormbf)

select: dropped 8 variables (Ratebf_Before, Ratebf_Early, Ratebf_Late, Ratebf_Later, AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later)

```

##### Creating a second dataframe where we pivot longer for velocity#####
IndBehav4UnfV <- IndBehav4 %>%
  filter(Infection == 0) %>%
  pivot_longer(cols = starts_with("AvgVel"), names_to = "TrialTime", names_prefix = "AvgVel_",
    values_to = "AvgVel") %>%
  select(fishID, TrialTime, AvgVel)

```

```

## filter (grouped): removed 59 rows (61%), 38 rows remaining

## pivot_longer: reorganized (AvgVel_Before, AvgVel_Early, AvgVel_Late, AvgVel_Later) into (TrialTime, AvgVel)

## select: dropped 25 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

##### Making the growth rate columns into one column for uninfected individuals#####
IndBehavGRUnf <- IndBehav4 %>%
  filter(Infection == 0) %>%
  pivot_longer(cols = starts_with("Ratebf"), names_to = "TrialTime", names_prefix = "Ratebf_",
    values_to = "Ratebf") %>%
  select(fishID, TrialTime, Ratebf)

## filter (grouped): removed 59 rows (61%), 38 rows remaining

## pivot_longer: reorganized (Ratebf_Before, Ratebf_Early, Ratebf_Late, Ratebf_Later) into (TrialTime, Ratebf)

## select: dropped 25 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

##### Making the new growth rate columns into one column for infected individuals#####
IndBehavNGRUnf <- IndBehav4Unf %>%
  select(-TrialTime) %>%
  add_column(NRatebf_Before = 0) %>%
  pivot_longer(cols = starts_with("NRatebf"), names_to = "TrialTime", names_prefix = "NRatebf_",
    values_to = "NRatebf") %>%
  select(fishID, TrialTime, NRatebf) %>%
  distinct(fishID, TrialTime, .keep_all = TRUE)

## select: dropped one variable (TrialTime)

## pivot_longer: reorganized (NRatebf_Early, NRatebf_Late, NRatebf_Later, NRatebf_Before) into (TrialTime, NRatebf)

## select: dropped 21 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

## distinct (grouped): removed 456 rows (75%), 152 rows remaining

##### Making the Variance columns into one column for infected individuals#####
IndBehavVarUnf <- IndBehav4Unf %>%
  select(-TrialTime) %>%
  pivot_longer(cols = starts_with("VarVel"), names_to = "TrialTime", names_prefix = "VarVel_",
    values_to = "VarVel") %>%
  select(fishID, TrialTime, VarVel) %>%
  distinct(fishID, TrialTime, .keep_all = TRUE)

## select: dropped one variable (TrialTime)

## pivot_longer: reorganized (VarVel_Before, VarVel_Early, VarVel_Late, VarVel_Later) into (TrialTime, VarVel)

## select: dropped 20 variables (Sex, PreWeight, PreLength, Treatment, Infection, ...)

## distinct (grouped): removed 456 rows (75%), 152 rows remaining

```



```
##### Merge the different datasets together#####
IndBehav5Unf <- merge(IndBehav4UnfV, IndBehav4Unf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Unf2 <- merge(IndBehav5Unf, IndBehavGRUnf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Unf3 <- merge(IndBehav5Unf2, IndBehavNGRUnf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
IndBehav5Unf4 <- merge(IndBehav5Unf3, IndBehavVarUnf, by.x = c("fishID", "TrialTime"),
  by.y = c("fishID", "TrialTime"), all = TRUE)
```

```
# Creating the BehavTol and BehavVig columns for the uninfected and calculating
# the metric for uninfected individual so we can combine these dataframes
# together
```

```
IndBehav5Unf4 <- IndBehav5Unf4 %>%
  group_by(fishID) %>%
  add_column(BehavTol = 0, BehavVig = 0)
```

```
## group_by: one grouping variable (fishID)
```

```
# Rbinding our infected and uninfected dataframes together into one overall
# dataframe
```

```
IndBehav5 <- rbind(IndBehav5Unf4, IndBehav5Inf4)
```

```
## Pivot longer for Change in behavior
```

```
IndBehav5ChBe <- IndBehav5 %>%
  select(-TrialTime) %>%
  rename(ChBehav_Early = EChBe, ChBehav_Late = LChBe, ChBehav_Later = LtrChBe) %>%
  add_column(ChBehav_Before = 0) %>%
  pivot_longer(cols = starts_with("ChBehav"), names_to = "TrialTime", names_prefix = "ChBehav_",
    values_to = "ChBehav") %>%
  select(fishID, TrialTime, ChBehav) %>%
  distinct(fishID, TrialTime, .keep_all = TRUE)
```

```
## select: dropped one variable (TrialTime)
```

```
## rename: renamed 3 variables (ChBehav_Early, ChBehav_Late, ChBehav_Later)
```

```
## pivot_longer: reorganized (ChBehav_Early, ChBehav_Late, ChBehav_Later, ChBehav_Before) into (TrialTime, ChBehav)
```

```
## select: dropped 30 variables (AvgVel, Sex, PreWeight, PreLength, Treatment, ...)
```

```
## distinct (grouped): removed 1,764 rows (83%), 364 rows remaining
```

```
# Merge dataframes together for one large dataframe
```

```
IndBehav6 <- merge(IndBehav5, IndBehav5ChBe, by.x = c("fishID", "TrialTime"), by.y = c("fishID",
  "TrialTime"), all = TRUE)
```

```
# Removing some of the columns we dont want in the dataframe
```

```
IndBehav6 <- IndBehav6 %>%
  select(-c(ERatebf, LRatebf, LtrRatebf, NRatebf_Early, NRatebf_Late, NRatebf_Later,
    VarVel_Before, VarVel_Early, VarVel_Late, VarVel_Later))
```

```
## select: dropped 10 variables (VarVel_Before, VarVel_Early, VarVel_Late, VarVel_Later, NRatebf_Early,
```

```
# Create a point tolerance metric for each timepoint
IndBehav6 <- IndBehav6 %>%
  mutate(PTol = ChBehav/Wormbf) %>%
  select(-c(EChBe, LChBe, LtrChBe))
```

```
## mutate: new variable 'PTol' (double) with 109 unique values and 77% NA
```

```
## select: dropped 3 variables (EChBe, LChBe, LtrChBe)
```

```
# Remove dataframes used for data wrangling and managing rm(c(IndBehav,
# IndBehav1,IndBehav2,IndBehav3,IndBehav3Inf1,IndBehav4,IndBehav4Inf,IndBehav4Inf1,IndBehav4InfV,IndBeh

# Setting some characters as factors
IndBehav6$TrialTime <- as.factor(IndBehav6$TrialTime)
IndBehav6$Sex <- as.factor(IndBehav6$Sex)
IndBehav6$Infection <- as.factor(IndBehav6$Infection)
IndBehav6$Recov <- as.factor(IndBehav6$Recov)
IndBehav6$Died <- as.factor(IndBehav6$Died)
IndBehav6$Treatment <- as.factor(IndBehav6$Treatment)
IndBehav6$RecovPeriod <- as.factor(IndBehav6$RecovPeriod)

# Getting a summary of the entire dataframe
summary(IndBehav6)
```

```
##      fishID          TrialTime      AvgVel      Sex      PreWeight
## Length:532      Before:133      Min.   :0.2942      F    :236      Min.   :0.0570
## Class :character Early :133      1st Qu.:1.4216      M    :272      1st Qu.:0.0780
## Mode  :character Late  :133      Median :1.9069      NA's: 24      Median :0.1000
##                                     Later :133      Mean   :2.0266                                     Mean   :0.1305
##                                     3rd Qu.:2.5410                                     3rd Qu.:0.1890
##                                     Max.   :4.7609                                     Max.   :0.3380
##                                     NA's   :117                                     NA's   :24
##      PreLength      Treatment      Infection      LateWeight      wormJump
## Min.   :13.70      UNTOUCHED:200      0    :152      Min.   : 0.0480      Min.   :0.000
## 1st Qu.:15.30      VIE      :308      1    :356      1st Qu.: 0.0840      1st Qu.:2.000
## Median :16.90      NA's      : 24      NA's: 24      Median : 0.1330      Median :2.000
## Mean   :17.61                                     Mean   : 0.4772      Mean   :1.953
## 3rd Qu.:20.20                                     3rd Qu.: 0.1720      3rd Qu.:2.000
## Max.   :24.20                                     Max.   :19.6000      Max.   :3.000
## NA's   :24                                     NA's   :52          NA's   :192
##      AUC2      RecovPeriod      Died      Recov      PreSMI
## Min.   : 4.0      Early: 40      0    :372      0    :152      Min.   :0.05737
## 1st Qu.:179.5      Inf :232      1    : 4      1    :208      1st Qu.:0.07812
## Median :658.5      Late :64      NA's:156      NA's:172      Median :0.10225
## Mean   :890.7      Later: 4                                     Mean   :0.13003
## 3rd Qu.:1489.0      NA's :192                                     3rd Qu.:0.18900
## Max.   :3758.5                                     Max.   :0.31326
## NA's   :168                                     NA's   :24
##      LateSMI      Wormbf      Ratebf      NRatebf
## Min.   :0.05611      Min.   : 0.00      Min.   : -1.24245      Min.   : -12.000
```

```

## 1st Qu.:0.07824 1st Qu.: 0.00 1st Qu.: 0.00000 1st Qu.: 0.000
## Median :0.09961 Median : 8.00 Median : 0.06508 Median : 0.000
## Mean :0.13174 Mean : 48.23 Mean : 0.06632 Mean : 4.175
## 3rd Qu.:0.18956 3rd Qu.: 46.00 3rd Qu.: 0.24799 3rd Qu.: 2.333
## Max. :0.37766 Max. :876.00 Max. : 0.97296 Max. :121.167
## NA's :24 NA's :279 NA's :274 NA's :260
## VarVel BehavTol BehavVig ChBehav
## Min. :0.00014 Min. : -0.002021 Min. :0.000 Min. : -2.5747
## 1st Qu.:0.09218 1st Qu.: -0.000026 1st Qu.:0.000 1st Qu.: 0.0000
## Median :0.23328 Median : 0.000000 Median :1.653 Median : 0.0000
## Mean :0.45376 Mean : 0.000307 Mean :1.387 Mean : 0.2969
## 3rd Qu.:0.48482 3rd Qu.: 0.000223 3rd Qu.:2.015 3rd Qu.: 0.5729
## Max. :5.25127 Max. : 0.004335 Max. :3.037 Max. : 3.2250
## NA's :141 NA's :24 NA's :24 NA's :154
## PTol
## Min. : -Inf
## 1st Qu.: -0.0039
## Median : 0.0056
## Mean : NaN
## 3rd Qu.: 0.0256
## Max. : Inf
## NA's :408

```

Now we have to decided how best to calculate whether an individual has recovered. In the experiment only had 13 fish recover from infection totally, therefore we are thinking of another metric that indicates a fish is in recovery during infection.

1.6 Description of data, structure, and type

fishID: The individual ID of each fish used in the trial.

TrialTime: The point of infection where each behavior trial happened. Early - early infection (6 days), Late - late in infection (12 days), Later - later in infection (18 days)

AvgVel: The average velocity from three separate behavioral trials of each fish for each of the Trial Times. (*cm/s*)

Sex: The sex of the individual. F - female, M - male

PreWeight: The weight of the individual prior to their fist behavior trial and pre-infection. (*grams*)

PreLength: The length of the individual prior to their first behavior trial and pre-infection (*mm*)

Treatment: What treatment the fish received prior to their first behavior and pre-infection. VIE - visible implant elastomer implant, UNTOUCHED - control individual, received no injection nor implant (*mm*)

Infection: Whether or not the individual was infected with *Gyrodactylus turnbulli*. 1 - infected, 0 - uninfected

LateWeight: The weight of the individual after their final behavior trial and after infection. (*grams*)

wormJump: The number of worms that jumped from the donor fish to the trial fish during manual infections.

AUC2: The area under the curve of infection over the total infection trajectory for each individual.

RecovPeriod: The time frame in which an individual started recovering from infection. This is calculated by looking at the growth rate of the worms between each count and see when the worm growth rate was decreasing overall.

Recov: Whether or not the individual recovered from infection during the experimental trial. 1 - recovered, 0 - did not recover

Died: Whether or not the individual Died from infection during the experimental trial. 1 - Died, 0 - did not died

PreSMI: The body condition of the individual prior to their first behavioral trial and pre infection. (*mm/g*)

LateSMI: The body condition of the individual after to their last behavioral trial and after infection. (mm/g)

Wormbf: The number of worms on the fish prior to each trial.

Ratebf: The rate of growth of worms on the fish prior to each trial from the worm count immediately prior to the trial.

NRatebf: The rate of growth of worms on the fish prior to each trial calculated as the change in worms between each time point. (For Example, From before to early).

VarVel: The variance in velocity from the separate behavioral trials during each time point. ($(cm/s)^2$)

BehavTol: The behavioral tolerance of each individual calculated as the slope of a random effect model where fishID is the random effect term.

BehavVig: The behavioral Vigor of each individual calculated as the intercept of a random effect model where fishID is the random effect term

ChBehav: The change in behavior between trial times. (cm/s)

PTol: Point tolerance metric calculated by dividing the change in behavior between time points by the worms on the fish before the trial ($cm/s/worms$)

```
pairs(~AvgVel + TrialTime + Sex + Treatment + Infection + LateWeight + AUC2 + Recov +
      Died + PreSMI + LateSMI + Wormbf + Ratebf + NRatebf + VarVel + BehavTol + BehavVig +
      ChBehav + PTol, lower.panel = panel.smooth, diag.panel = panel.hist, upper.panel = panel.cor,
      data = IndBehav6)
```

