# Photographic\_Bleaching

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#### Loading in required libraries.

#### Reading in quality controlled color data.

```
Protocol for ImageJ Bleaching Score Analysis found here.
```

```
Data <- read.csv("RAnalysis/data/color_score/color_score_colonies.csv", header=T, sep=",", na.string="N.Data <-na.omit(Data) # removing all rows with NA values

Data$$P.Time.ID <- paste0(Data$ColonyID, "_",Data$Photo_date, "_", Data$treatment)# generating a groupi

#make photo.date a factor

Data$Photo_date = as.factor(Data$Photo_date)

Normalize coral color to color standards.

Data$Red.Norm.Coral <- Data$Red_coral/Data$Red_standard #normalize to standard

Data$Green.Norm.Coral <- Data$Green_coral/Data$Green_standard #normalize to standard
```

# Principal components analysis to reduce color score to single value representing the majority of the variance

Data\$Blue\_Norm.Coral <- Data\$Blue\_coral/Data\$Blue\_standard #normalize to standard

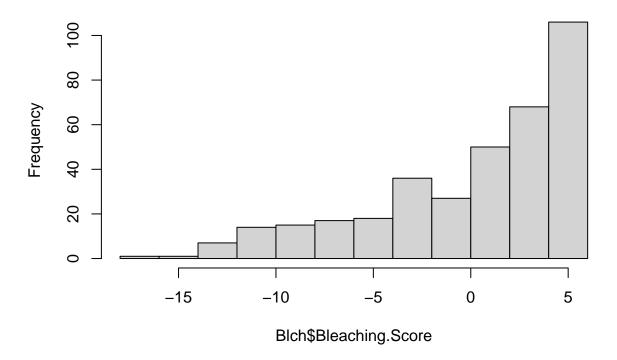
```
score <- Data %>% select("ColonyID", "treatment", "genotype", "tank.num", "Photo_date", "Period", "SP.Timestand "period", "SP.Timestand", "Period", "SP.Timestand", "Period", "SP.Timestand", "Period", "Period", "Period", "SP.Timestand", "Period", "Peri
blch.scor <- score %>% select("Red.Norm.Coral", "Green.Norm.Coral", "Blue.Norm.Coral") #subset datafram
blch.scor <- as.matrix(blch.scor) #create matrix</pre>
rownames(blch.scor) <- score$SP.Time.ID #name columns in matrix
dist <- vegdist(blch.scor, method="euclidean") #calculate distance matrix of color scores
PCA.color <- princomp(dist) #run principal components analysis
PCA.color # view variance explained by PCs
## Call:
## princomp(x = dist)
##
## Standard deviations:
                                Comp. 1
                                                                                Comp.2
                                                                                                                                Comp.3
                                                                                                                                                                                Comp.4
                                                                                                                                                                                                                               Comp.5
                                                                                                                                                                                                                                                                               Comp.6
## 5.040370e+00 3.306822e+00 6.296869e-01 5.337312e-01 3.758244e-01 2.117522e-01
                                Comp.7
                                                                                Comp.8
                                                                                                                                Comp.9
                                                                                                                                                                           Comp.10
                                                                                                                                                                                                                            Comp.11
                                                                                                                                                                                                                                                                            Comp.12
```

```
## 1.812661e-01 1.544898e-01 1.362027e-01 1.070146e-01 9.772188e-02 8.181071e-02
                                                                             Comp.18
##
        Comp.13
                      Comp.14
                                   Comp.15
                                                 Comp.16
                                                               Comp.17
  6.827680e-02 6.508467e-02 5.400698e-02 5.220087e-02 4.725283e-02 4.153029e-02
##
        Comp.19
                      Comp.20
                                   Comp.21
                                                 Comp.22
                                                               Comp.23
                                                                             Comp.24
   3.932913e-02 3.553545e-02 3.306034e-02 3.219140e-02 3.067941e-02 2.818712e-02
                                                                             Comp.30
##
        Comp.25
                      Comp.26
                                   Comp.27
                                                 Comp.28
                                                               Comp.29
## 2.698527e-02 2.634908e-02 2.330911e-02 2.203884e-02 2.137489e-02 2.000187e-02
##
        Comp.31
                      Comp.32
                                    Comp.33
                                                 Comp.34
                                                               Comp.35
                                                                             Comp.36
##
  1.883881e-02 1.852883e-02 1.703958e-02 1.699736e-02 1.642819e-02 1.575175e-02
##
        Comp.37
                      Comp.38
                                   Comp.39
                                                 Comp.40
                                                               Comp.41
                                                                             Comp.42
   1.537211e-02 1.488427e-02 1.454332e-02 1.396422e-02 1.306331e-02 1.302957e-02
                                   Comp.45
                                                                             Comp.48
##
        Comp.43
                      Comp.44
                                                 Comp.46
                                                               Comp.47
##
   1.228816e-02 1.220449e-02 1.198772e-02 1.139009e-02 1.099507e-02 1.057572e-02
                                                                             Comp.54
##
        Comp.49
                      Comp.50
                                   Comp.51
                                                 Comp.52
                                                               Comp.53
   1.049092e-02 1.008653e-02 9.945285e-03 9.297230e-03 9.081710e-03 8.973942e-03
##
##
        Comp.55
                      Comp.56
                                    Comp.57
                                                 Comp.58
                                                               Comp.59
                                                                             Comp.60
  8.768489e-03 8.591405e-03 8.531593e-03 8.458304e-03 8.166522e-03 8.037005e-03
##
        Comp.61
                      Comp.62
                                   Comp.63
                                                 Comp.64
                                                               Comp.65
                                                                             Comp.66
##
   7.979337e-03 7.599793e-03 7.446989e-03 7.361667e-03 7.280099e-03 6.939759e-03
        Comp.67
                      Comp.68
                                   Comp.69
                                                 Comp.70
                                                               Comp.71
                                                                             Comp.72
  6.800597e-03 6.745095e-03 6.720598e-03 6.506867e-03 6.367152e-03 6.292722e-03
##
                                                                             Comp.78
        Comp.73
                      Comp.74
                                   Comp.75
                                                 Comp.76
                                                               Comp.77
## 6.129784e-03 5.991344e-03 5.855249e-03 5.724118e-03 5.613223e-03 5.475701e-03
        Comp.79
                      Comp.80
                                   Comp.81
                                                 Comp.82
                                                               Comp.83
                                                                             Comp.84
## 5.444411e-03 5.388912e-03 5.247951e-03 5.126000e-03 5.075080e-03 4.998606e-03
        Comp.85
                      Comp.86
                                   Comp.87
                                                 Comp.88
                                                               Comp.89
                                                                             Comp.90
##
   4.967835e-03 4.925400e-03 4.852873e-03 4.727579e-03 4.661009e-03
                                                                       4.600950e-03
                                                                             Comp.96
        Comp.91
                      Comp.92
                                   Comp.93
                                                 Comp.94
                                                               Comp.95
   4.532901e-03 4.474108e-03 4.396819e-03 4.370409e-03 4.319429e-03 4.269467e-03
##
##
        Comp.97
                      Comp.98
                                   Comp.99
                                                Comp. 100
                                                              Comp. 101
                                                                            Comp. 102
##
   4.193292e-03 4.121796e-03 4.042199e-03 3.998163e-03 3.983063e-03 3.921581e-03
##
       Comp. 103
                     Comp. 104
                                  Comp. 105
                                                Comp. 106
                                                              Comp. 107
                                                                            Comp. 108
   3.764474e-03 3.725028e-03 3.703014e-03 3.643476e-03 3.630929e-03 3.599729e-03
##
##
       Comp. 109
                     Comp. 110
                                  Comp.111
                                                Comp.112
                                                              Comp.113
                                                                            Comp.114
   3.566891e-03 3.542023e-03 3.499211e-03 3.459244e-03 3.430081e-03
                                                                       3.406180e-03
##
                                                                            Comp. 120
##
       Comp. 115
                     Comp. 116
                                  Comp. 117
                                                Comp.118
                                                              Comp. 119
##
  3.361524e-03 3.311071e-03 3.267090e-03 3.217164e-03 3.182113e-03 3.153394e-03
##
                                                Comp. 124
                                                                            Comp. 126
       Comp. 121
                     Comp. 122
                                  Comp. 123
                                                              Comp. 125
  3.146543e-03 3.112188e-03 3.089537e-03 3.080890e-03 3.040322e-03 3.030106e-03
                                                                            Comp. 132
##
       Comp. 127
                     Comp. 128
                                  Comp. 129
                                                Comp. 130
                                                              Comp. 131
  2.997647e-03 2.942041e-03 2.936099e-03 2.921836e-03 2.889546e-03 2.880024e-03
       Comp. 133
                     Comp. 134
                                  Comp. 135
                                                Comp. 136
                                                              Comp. 137
                                                                            Comp. 138
##
   2.850648e-03 2.840361e-03 2.820965e-03 2.796074e-03 2.781437e-03
##
                                                                       2.767353e-03
                                                                            Comp. 144
##
       Comp. 139
                     Comp. 140
                                  Comp. 141
                                                Comp. 142
                                                              Comp. 143
   2.735785e-03 2.727107e-03 2.687316e-03 2.667828e-03 2.613706e-03 2.610851e-03
##
                     Comp. 146
                                  Comp. 147
                                                Comp. 148
                                                              Comp. 149
                                                                            Comp. 150
##
       Comp. 145
   2.577644e-03 2.572855e-03 2.563944e-03 2.529950e-03 2.522256e-03 2.466497e-03
##
                                  Comp. 153
                                                                            Comp. 156
##
       Comp. 151
                     Comp. 152
                                                Comp. 154
                                                              Comp. 155
   2.458810e-03 2.446376e-03 2.438397e-03 2.432264e-03 2.379843e-03
                                                                       2.355003e-03
##
       Comp. 157
                     Comp. 158
                                  Comp. 159
                                                Comp. 160
                                                              Comp. 161
                                                                            Comp. 162
                                                                       2.236039e-03
   2.351984e-03 2.321596e-03 2.313964e-03 2.267328e-03 2.248315e-03
##
##
       Comp. 163
                     Comp. 164
                                  Comp. 165
                                                Comp. 166
                                                              Comp. 167
                                                                            Comp. 168
## 2.232273e-03 2.218878e-03 2.210994e-03 2.192774e-03 2.188296e-03 2.170932e-03
##
       Comp. 169
                     Comp. 170
                                  Comp. 171
                                                Comp. 172
                                                              Comp. 173
                                                                            Comp. 174
```

```
## 2.164422e-03 2.153464e-03 2.147608e-03 2.138137e-03 2.119747e-03 2.086855e-03
##
                                                                             Comp. 180
       Comp. 175
                     Comp. 176
                                   Comp. 177
                                                 Comp. 178
                                                               Comp. 179
   2.078267e-03 2.055368e-03 2.052496e-03 2.037647e-03 2.027434e-03 2.016227e-03
##
##
                     Comp. 182
                                   Comp. 183
                                                 Comp. 184
                                                               Comp. 185
                                                                            Comp. 186
       Comp. 181
##
   2.004572e-03 1.996323e-03 1.987405e-03 1.975862e-03 1.968571e-03 1.942219e-03
                                   Comp. 189
                                                                            Comp. 192
##
       Comp. 187
                     Comp. 188
                                                 Comp. 190
                                                               Comp. 191
   1.934869e-03 1.928502e-03 1.903305e-03 1.892318e-03 1.890959e-03 1.867471e-03
##
       Comp. 193
                     Comp. 194
                                   Comp. 195
                                                 Comp. 196
                                                               Comp. 197
                                                                             Comp. 198
##
   1.861338e-03 1.843773e-03 1.831365e-03 1.805497e-03 1.802637e-03 1.796445e-03
                                                                             Comp.204
##
       Comp. 199
                     Comp. 200
                                   Comp. 201
                                                 Comp.202
                                                               Comp. 203
   1.795585e-03
                1.790345e-03 1.780135e-03 1.778613e-03 1.769049e-03 1.745935e-03
                                   Comp. 207
                                                               Comp. 209
                                                                             Comp.210
##
       Comp. 205
                     Comp. 206
                                                 Comp.208
##
   1.739519e-03 1.738177e-03 1.733474e-03 1.696171e-03 1.692757e-03 1.689824e-03
                                                                             Comp.216
##
       Comp. 211
                     Comp. 212
                                   Comp. 213
                                                 Comp.214
                                                               Comp.215
   1.679662e-03 1.647476e-03 1.645162e-03 1.638211e-03 1.634599e-03 1.632511e-03
##
##
       Comp. 217
                     Comp.218
                                   Comp.219
                                                 Comp.220
                                                               Comp.221
                                                                             Comp.222
   1.605194e-03 1.590512e-03 1.587403e-03 1.579092e-03 1.561203e-03 1.560652e-03
##
##
       Comp. 223
                     Comp. 224
                                   Comp. 225
                                                 Comp. 226
                                                               Comp. 227
                                                                             Comp. 228
   1.552243e-03 1.548076e-03 1.534876e-03 1.511510e-03 1.510421e-03 1.504090e-03
##
       Comp.229
                     Comp. 230
                                   Comp. 231
                                                 Comp.232
                                                               Comp. 233
                                                                            Comp. 234
##
   1.497023e-03 1.471733e-03 1.460790e-03 1.459040e-03 1.438332e-03 1.434750e-03
##
       Comp. 235
                     Comp. 236
                                   Comp. 237
                                                 Comp.238
                                                               Comp. 239
                                                                             Comp. 240
  1.431662e-03 1.426657e-03 1.416576e-03 1.400149e-03 1.385721e-03 1.379393e-03
##
##
       Comp. 241
                     Comp. 242
                                   Comp. 243
                                                 Comp. 244
                                                               Comp. 245
                                                                             Comp. 246
##
  1.378433e-03 1.364944e-03 1.356076e-03 1.350963e-03 1.348725e-03 1.346166e-03
       Comp. 247
                     Comp. 248
                                   Comp. 249
                                                 Comp. 250
                                                               Comp.251
                                                                            Comp. 252
##
   1.335511e-03
                 1.325887e-03 1.322489e-03 1.306292e-03 1.299885e-03
                                                                        1.285714e-03
##
       Comp. 253
                     Comp. 254
                                   Comp. 255
                                                 Comp. 256
                                                               Comp. 257
                                                                             Comp. 258
##
   1.274988e-03 1.274121e-03 1.268601e-03 1.260367e-03 1.258837e-03 1.240127e-03
##
       Comp. 259
                     Comp. 260
                                   Comp.261
                                                 Comp.262
                                                               Comp. 263
                                                                             Comp. 264
##
   1.229763e-03 1.219684e-03 1.216119e-03 1.207773e-03 1.206569e-03 1.200264e-03
##
       Comp. 265
                     Comp. 266
                                   Comp. 267
                                                 Comp.268
                                                               Comp. 269
                                                                             Comp.270
##
   1.199622e-03 1.181125e-03 1.180401e-03 1.177765e-03 1.165386e-03 1.159399e-03
##
       Comp.271
                     Comp.272
                                   Comp. 273
                                                 Comp.274
                                                               Comp.275
                                                                            Comp.276
   1.147381e-03
                1.142688e-03 1.138843e-03 1.129466e-03 1.121793e-03
                                                                        1.111056e-03
##
       Comp. 277
                     Comp. 278
                                   Comp. 279
                                                 Comp. 280
                                                               Comp.281
                                                                            Comp. 282
##
   1.101618e-03 1.095006e-03 1.094192e-03 1.090142e-03 1.085116e-03 1.083873e-03
##
       Comp.283
                                                 Comp.286
                                                               Comp.287
                                                                            Comp.288
                     Comp. 284
                                   Comp. 285
   1.080091e-03 1.069979e-03 1.063533e-03 1.055453e-03 1.051244e-03 1.045130e-03
##
                                                                             Comp.294
##
       Comp. 289
                     Comp. 290
                                   Comp. 291
                                                 Comp.292
                                                               Comp.293
  1.037905e-03 1.019941e-03 1.009762e-03 1.008179e-03 1.006411e-03 9.872284e-04
##
                     Comp. 296
                                   Comp. 297
                                                 Comp.298
                                                               Comp. 299
                                                                            Comp.300
       Comp. 295
   9.831612e-04 9.816839e-04 9.792276e-04 9.720337e-04 9.578819e-04 9.517944e-04
##
                                                                             Comp.306
##
       Comp.301
                     Comp.302
                                   Comp.303
                                                 Comp.304
                                                               Comp.305
   9.484399e-04 9.445668e-04 9.389836e-04 9.273165e-04 9.268288e-04 9.264108e-04
##
                     Comp.308
                                   Comp.309
                                                                             Comp.312
##
       Comp. 307
                                                 Comp.310
                                                               Comp.311
   8.940274e-04 8.926646e-04 8.893836e-04 8.713891e-04 8.672677e-04 8.527217e-04
##
                                   Comp.315
                                                                             Comp.318
##
       Comp.313
                     Comp. 314
                                                 Comp.316
                                                               Comp.317
##
   8.467582e-04 8.326001e-04 8.182166e-04 8.068463e-04 7.886184e-04
                                                                        7.827531e-04
##
       Comp.319
                     Comp.320
                                   Comp.321
                                                 Comp.322
                                                               Comp.323
                                                                            Comp.324
   7.785282e-04 7.619267e-04 7.569728e-04 7.478286e-04 7.431940e-04
                                                                        7.342221e-04
##
##
       Comp.325
                     Comp.326
                                   Comp.327
                                                 Comp.328
                                                               Comp.329
                                                                            Comp.330
##
  7.030908e-04 6.963579e-04 6.761963e-04 6.754651e-04 6.693085e-04 6.644328e-04
##
       Comp.331
                     Comp.332
                                   Comp.333
                                                 Comp.334
                                                               Comp.335
                                                                            Comp.336
```

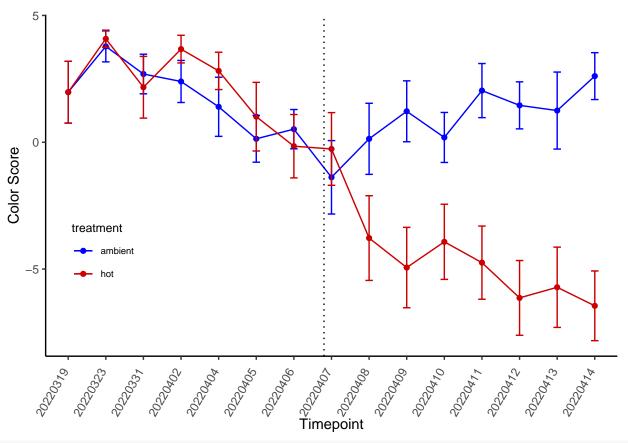
```
## 6.606586e-04 6.578559e-04 6.304369e-04 6.232563e-04 6.058417e-04 5.855124e-04
##
       Comp.337
                    Comp.338
                                  Comp.339
                                               Comp.340
                                                             Comp.341
                                                                          Comp.342
## 5.768542e-04 5.700406e-04 5.510442e-04 5.172550e-04 4.893665e-04 4.883332e-04
                    Comp.344
       Comp. 343
                                  Comp.345
                                               Comp.346
                                                             Comp.347
                                                                          Comp.348
##
  4.864131e-04 4.811739e-04 3.905283e-04 3.267504e-04 3.186541e-04 5.277737e-08
##
       Comp. 349
                    Comp.350
                                  Comp.351
                                               Comp.352
                                                             Comp.353
                                                                          Comp.354
## 2.861649e-08 2.100271e-08 1.005172e-08 7.346569e-09 3.453043e-09 0.000000e+00
##
       Comp.355
                    Comp.356
                                  Comp.357
                                               Comp.358
                                                             Comp.359
                                                                          Comp.360
## 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00
##
        variables and 360 observations.
Blch <- as.data.frame(-PCA.color$scores[,1]) #extract PC1</pre>
Blch$SP.Time.ID <- rownames(blch.scor) # add the sample names to the bleahcing score
Blch <- left_join(Blch, Data, by="SP.Time.ID") #make a dataframe of PC1 and experiment factors
colnames(Blch) #view column names
    [1] "-PCA.color$scores[, 1]" "SP.Time.ID"
                                                            "ColonyID"
    [4] "treatment"
                                  "genotype"
                                                            "tank.num"
       "ExperimentalDay"
                                  "Period"
                                                            "Photo_date"
    [7]
                                  "Red_standard"
       "Photo_ID"
                                                            "Green_standard"
  [10]
        "Blue_standard"
                                  "Red_coral"
                                                            "Green_coral"
  [13]
                                  "Tech"
                                                            "Notes"
##
  [16]
       "Blue_coral"
## [19] "Red.Norm.Coral"
                                  "Green.Norm.Coral"
                                                            "Blue.Norm.Coral"
names(Blch)[1] <- "Bleaching.Score" #name column
hist(Blch$Bleaching.Score)
```

## Histogram of Blch\$Bleaching.Score



#### Plot data for outliers and Write out Color Score dataframe

```
Blch.meanse <- Blch %>% group_by(treatment, Photo_date) %>% #group data by factors
  summarise(mean = mean(Bleaching.Score), #calculate mean by group
            sem = std.error(Bleaching.Score)) #calculate sem by group
## `summarise()` has grouped output by 'treatment'. You can override using the `.groups` argument.
# Assign labels to use for figure
#species.names <- list(
# 'Mcapitata'="Montipora capitata",
# 'Pacuta'="Pocillopora acuta")
#species_labeller <- function(variable, value){</pre>
# return(species.names[value])}
cols <- c( "blue", "red3") #set colors</pre>
pdf("RAnalysis/output/color_score/colorscore_with_outliers_colonies.pdf")
Blch_plot1 <- ggplot(Blch.meanse, aes(x=Photo_date, y = mean, group = treatment, color = treatment)) +
  geom_line() + geom_point() + #plot points and lines
  #facet_grid(~Species, scales = "free", labeller = species_labeller) + #facet by Species
  geom_errorbar(aes(ymin=mean-sem, ymax=mean+sem), width=.2) + #plot sem error bars
  scale_color_manual(values = cols) + #color points
  xlab("Timepoint") + #label x axis
  ylab("Color Score") + # label y axis
  theme_classic() + #set theme
  theme(legend.position = c(0.1,0.3)) + #set legend position
  theme(legend.text = element_text(size = 7)) + #set legend text size
  theme(legend.title = element_text(size = 9)) + #set legend text title size
  geom_vline(xintercept = c(7.8), colour="black", linetype="dotted") + #add vertical line
  theme(plot.title = element text(face = 'bold.italic', size = 12, hjust = 0)) + #set font
  \#scale\_x\_discrete(breaks = c("Week1", "Week2", "Week4", "Week6", "Week8", "Week12", "Week16"), labels
  theme(axis.text.x = element_text(angle = 60, vjust = 1.2, hjust = 1.3)) + #Set the text angle
  theme(panel.border = element_blank(), #set theme
  panel.grid.major = element_blank(), #set theme
  panel.grid.minor = element_blank(), #set theme
  # Change axis line
  axis.line = element_line(colour = "black"))
Blch_plot1 #view plot
dev.off()
## pdf
##
    2
Blch_plot1
```

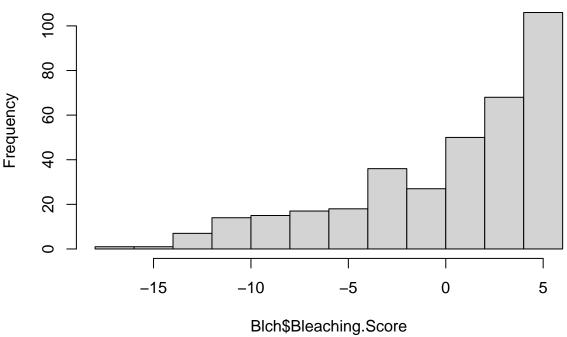


write.table(Blch, file = "RAnalysis/output/color\_score/color\_score\_colony\_output.csv", append = FALSE,

# **Detect and Remove Outliers**

hist(Blch\$Bleaching.Score) #view data distribution

## Histogram of Blch\$Bleaching.Score



```
Blch$group <- pasteO(Blch$treatment,"_", Blch$Photo_date)

#identify outliers
outlier.plot <- ggbetweenstats(Blch,group, Bleaching.Score, outlier.tagging = TRUE)

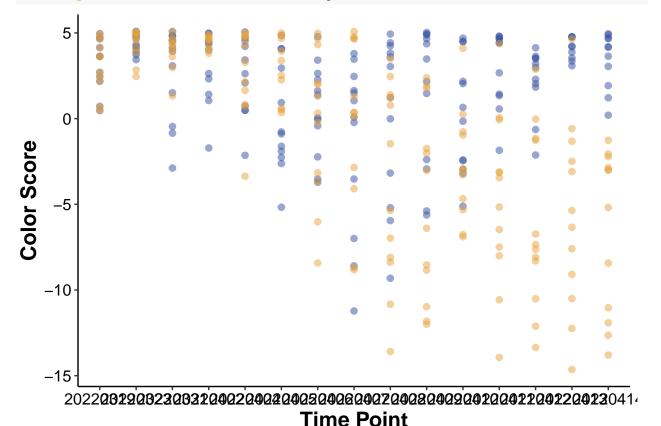
## Warning: Number of labels is greater than default palette color count.
## Try using another color `palette` (and/or `package`).

##
outlier.plot</pre>
```

## Warning: ggrepel: 1 unlabeled data points (too many overlaps). Consider
## increasing max.overlaps
## Warning: ggrepel: 11 unlabeled data points (too many overlaps). Consider
## increasing max.overlaps

```
F_{\text{Welch}}(29, 117.36) = 7.27, p = 2.78e - 15, \widehat{\omega_{\text{p}}^2} = 0.55, \text{Cl}_{95\%}[0.38, 1.00], n_{\text{obs}} = 360
                                                                                  \widehat{\mu}_{\text{mean}} = 4.08 \ \widehat{\mu}_{\text{mean}} = 3.6 \ \widehat{\mu}_{\text{mean}} = 2.81
                \widehat{\mu}_{mean} = 3.78 \ \widehat{\mu}_{mean} = 2.69
                                                                                                                                  \widehat{\mu}_{mean} = 1.01
                                       \widehat{\mu}_{mean} = 2.40
                                                                                                           \widehat{\mu}_{mean} = -0.16
                                                                                      \widehat{\mu}_{mean} = 2.17
                                                                   -1.094603516<del>60126</del> 👗
                                                                                                                                 \widehat{\mu}_{mean} = -3.93
Bleaching.Score
              -2.72050128046416
                                                                                                           \widehat{\mu}_{mean} = -3.78
                                                                                                                                  1/11 #
                                             \widehat{\mu}_{mean} = -1.38 3.3391632483357
                                                                                          -4.62664102586026
                                                                                                                                 \widehat{\mu}_{mean} = -5.72
                                                                                            \widehat{\mu}_{\text{mean}} = -4.94
              -4.14606645687592
                                         -6.88764352075808
                                                                                                      -5.1912
                                                                       -5.85949676919138
              -9.40051492198118
                                                                                                      -8.2809634445854
                                                                                                                                \widehat{\mu}_{mean} = -6.45
                                           -7.50821128734243
                                                                            -10.5769733402921
                                                                                                            -10.8221390077526
             -10.5769733402921
                                             -10.3945658951831
    -15 -
                                                                                                           -16.8701476593952
                                                                  <u>| 2300219(1)218(1)137(1)137(1)137(1)137(1)127(1)127(1)127(1)127(1)127(1)127(1)127(1)127(1)127(1)127(1)127(1)2</u>
        group
                                                        log_e(BF_{01}) = -40.36, \widehat{R}^2 posterior = 0.32, Cl_{95\%}^{HDI} [0.25, 0.39], r_{Cauchy}^{JZS} = 0.71
                                                     Pairwise test: Games-Howell test, Comparisons shown: only significant
```

```
# Visualize data following outlier removal
r_plot<-data %>%
    ggplot(., aes(x = Photo_date, y = Bleaching.Score, colour=treatment)) +
    geom_point(aes(fill=treatment, group=interaction(treatment, Photo_date)), pch = 21, size=2, alpha=0
    xlab("Time Point") +
    scale_fill_manual(name="treatment", values=c("#3450A3","#E9A33D"))+
    scale_color_manual(name="treatment", values=c("#3450A3","#E9A33D"))+
    ylab("Color Score") +
    theme_classic() +
    theme(legend.position="none",
        axis.title=element_text(face="bold", size=16),
        axis.text=element_text(size=12, color="black"),
    legend.title=element_text(face="bold", size=14),
    legend.text=element_text(size=12)); r_plot
```

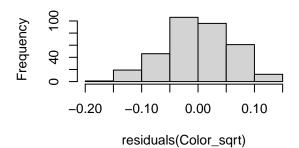


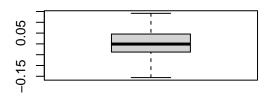
## Testing Transformations

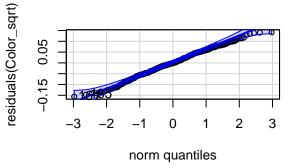
```
#Our random factor is `(1|PLUG.ID)` because fragments were repeatedly measured
Color_sqrt <- lmer(((Bleaching.Score+500)^(1/2)) ~ treatment*Photo_date + (1|ColonyID), na.action=na.om
par(mfrow = c(2, 2))
hist(residuals(Color_sqrt)) #view distribution
boxplot(residuals(Color_sqrt)) #view distribution
qqPlot(residuals(Color_sqrt)) #view qq</pre>
```

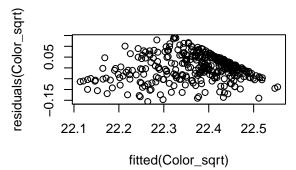
## [1] 161 185

#### Histogram of residuals(Color\_sqrt)







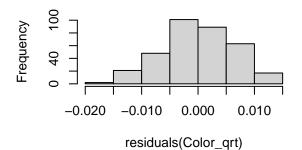


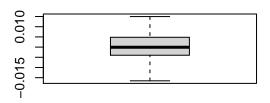
```
Color_qrt <- lmer(((Bleaching.Score+500)^(1/4)) ~ treatment*Photo_date + (1|ColonyID), na.action=na.omi
par(mfrow = c(2, 2))
hist(residuals(Color_qrt))#view distribution
boxplot(residuals(Color_qrt))#view distribution
qqPlot(residuals(Color_qrt))#view qq</pre>
```

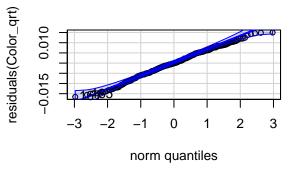
## [1] 161 185

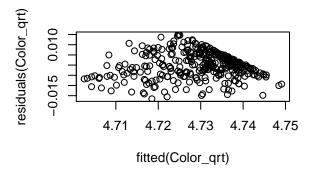
plot(fitted(Color\_qrt), residuals(Color\_qrt))#view variance

## **Histogram of residuals(Color\_qrt)**





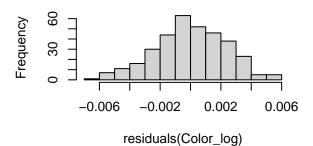


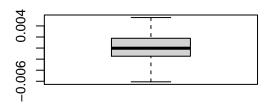


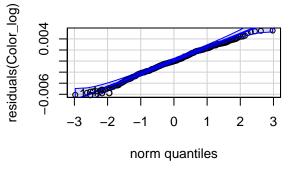
Color\_log <- lmer(log10((Bleaching.Score+500)) ~ treatment\*Photo\_date + (1|ColonyID), na.action=na.omit par(mfrow = c(2, 2)) hist(residuals(Color\_log)) #view distribution boxplot(residuals(Color\_log)) #view distribution qqPlot(residuals(Color\_log)) #view qq

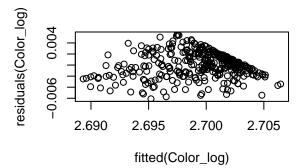
## [1] 161 185
plot(fitted(Color\_log), residuals(Color\_log))#view variance

## Histogram of residuals(Color\_log)





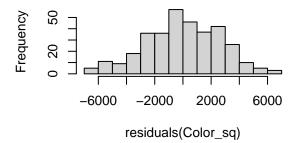


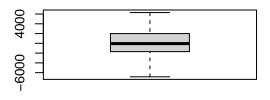


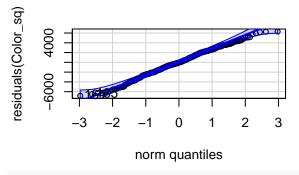
```
Color_sq <- lmer(((Bleaching.Score+500)^2) ~ treatment*Photo_date + (1|ColonyID), na.action=na.omit, da
par(mfrow = c(2, 2))
hist(residuals(Color_sq))#view distribution
boxplot(residuals(Color_sq))#view distribution
qqPlot(residuals(Color_sq))#view qq</pre>
```

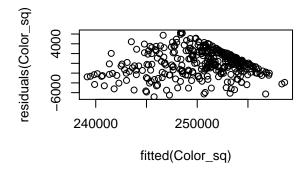
## [1] 161 185
plot(fitted(Color\_sq), residuals(Color\_sq))#view variance

### Histogram of residuals(Color\_sq)









#The data transformation chosen was

# Analyze Color Score using Mixed effect modeling and Plot data

```
Color_sq <- lmer(((Bleaching.Score+500)^2) ~ treatment*Photo_date + (1|ColonyID), na.action=na.omit, da
## significance of model
Anova(Color_sq, ddf="lme4", type='III') # Type III Wald chisquare tests
## Analysis of Deviance Table (Type III Wald chisquare tests)
##
## Response: ((Bleaching.Score + 500)^2)
##
                             Chisq Df Pr(>Chisq)
## (Intercept)
                        57019.0892 1
                                      < 2.2e-16 ***
## treatment
                            0.0555
                                   1
                                          0.8137
                           52.9417 14
                                      1.946e-06 ***
## Photo_date
## treatment:Photo_date
                          172.3781 14
                                       < 2.2e-16 ***
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
Blch.meanse <- data %>% group_by(treatment, Photo_date) %>% #group data by factors
  summarise(mean = mean(Bleaching.Score), #calculate mean by group
            sem = std.error(Bleaching.Score)) #calculate sem by group
## `summarise()` has grouped output by 'treatment'. You can override using the `.groups` argument.
pdf("RAnalysis/output/color_score/colorscore_without_outliers_colonies.pdf")
Blch_plot2 <- ggplot(Blch.meanse, aes(x=Photo_date, y = mean, group = treatment, color = treatment)) +
```

```
geom_line() + geom_point() + #plot points and lines
  #facet_grid(~Species, scales = "free", labeller = species_labeller) + #facet by Species
  geom_errorbar(aes(ymin=mean-sem, ymax=mean+sem), width=.2) + #plot sem error bars
  scale_color_manual(values = cols) + #color points
  xlab("Timepoint") + #label x axis
  ylab("Color Score") + # label y axis
  theme_classic() + #set theme
  theme(legend.position = c(0.1,0.3)) + #set legend position
  theme(legend.text = element_text(size = 7)) + #set legend text size
  theme(legend.title = element_text(size = 9)) + #set legend text title size
  geom_vline(xintercept = c(7.8), colour="black", linetype="dotted") + #add vertical line
  theme(plot.title = element_text(face = 'bold.italic', size = 12, hjust = 0)) + #set font
  \#scale\_x\_discrete(breaks = c("Week1", "Week2", "Week4", "Week6", "Week8", "Week12", "Week16"), labels
  theme(axis.text.x = element_text(angle = 60, vjust = 1.2, hjust = 1.3)) + #Set the text angle
  theme(panel.border = element_blank(), #set theme
  panel.grid.major = element_blank(), #set theme
  panel.grid.minor = element_blank(), #set theme
  # Change axis line
  axis.line = element_line(colour = "black"))
Blch_plot2 #view plot
dev.off()
## pdf
```

## pai ## 2

Blch\_plot2

