## EDA

## Paul K. Yu

2024-09-23

## Load libraries

```
library(ggplot2)
library(tidyverse)
```

We want to do an exploratory data analysis on the damage data.

```
head(metadata_prep)
```

```
##
                                      X.SampleID
                                                  Date_100 Date_200
                                                                        Date 300
## 1 16925_PostMedieval_ChelseaOldChurch_OCU00 1800_1900 1800_2000 1600_1900
           16969_Medieval_BermondseyAbbey_BA84
                                                       <NA>
                                                                 <NA>
## 3
              16937_Medieval_StMaryGraces_MIN86 1400_1500 1400_1600 1300_1600
## 4
              16939_Medieval_StMaryGraces_MIN86 1400_1500 1400_1600 1300_1600
## 5
              16948_Medieval_StMaryGraces_MIN86 1300_1400 1200_1400 1300_1600
           16900_PostMedieval_CrossBones_REW92
                                                       <NA>
                                                                 <NA> 1600 1900
     BlackDeath_PrePost EarlyDate LateDate MedievalPostMedieval
##
                                                                             Cemetry
## 1
                    Post
                              1836
                                        <NA>
                                                      PostMedieval ChelseaOldChurch
## 2
                  Across
                              1066
                                        1540
                                                          Medieval
                                                                    BermondseyAbbey
## 3
                              1400
                                        1538
                                                                        StMaryGraces
                    Post.
                                                          Medieval
## 4
                    Post
                              1400
                                        1538
                                                          Medieval
                                                                        StMaryGraces
## 5
                    Post
                              1350
                                        1400
                                                          Medieval
                                                                        StMaryGraces
## 6
                    Post
                              1598
                                        1853
                                                      PostMedieval
                                                                          CrossBones
##
     MaxillaMandible BuccalLingual SubSupragingival
                                                         Tooth Tooth_Simplified
## 1
            Mandible Interproximal
                                                Supra
                                                        Canine
                                                                          Canine
## 2
            Mandible
                                                         Molar
                                                                           Molar
                            Lingual
                                                Supra
## 3
            Mandible
                                                Supra
                                                         Molar
                                                                           Molar
                            Lingual
## 4
            Mandible Interproximal
                                                Supra
                                                         Molar
                                                                           Molar
## 5
            Mandible
                            Lingual
                                                Supra
                                                         Molar
                                                                           Molar
## 6
            Mandible Interproximal
                                                Supra Incisor
                                                                         Incisor
     BlackDeath_1346_1353 DeltaD_mean DeltaD_mean_methano DeltaD_mean_por
##
## 1
                            0.03159436
                                                0.033232946
                                                                 0.007384087
                      Post
## 2
                            0.04112947
                    Across
                                                0.056094304
                                                                 0.061636551
## 3
                      Post
                            0.03960263
                                                0.054139003
                                                                 0.053491125
## 4
                            0.04259754
                                                0.056497442
                                                                 0.067990389
                      Post.
## 5
                    Across
                            0.04002394
                                                0.009694423
                                                                 0.052791102
## 6
                            0.01938508
                                                0.016877111
                                                                 0.002777638
                      Post
##
     DeltaD_mean_strep
## 1
           0.006438698
## 2
           0.002875072
## 3
           0.038610533
## 4
           0.001558243
```

```
## 5 0.003304606
## 6 0.003928007
```

## Structure of the data

```
str(metadata_prep)
## 'data.frame':
                  126 obs. of 19 variables:
   $ X.SampleID
                      : chr
                               "16925_PostMedieval_ChelseaOldChurch_OCUOO" "16969_Medieval_Bermondsey.
## $ Date_100
                               "1800_1900" NA "1400_1500" "1400_1500" ...
                        : chr
## $ Date 200
                        : chr
                               "1800_2000" NA "1400_1600" "1400_1600" ...
## $ Date_300
                               "1600_1900" NA "1300_1600" "1300_1600" ...
                        : chr
   $ BlackDeath_PrePost : chr
                               "Post" "Across" "Post" "Post" ...
                               "1836" "1066" "1400" "1400" ...
## $ EarlyDate
                        : chr
## $ LateDate
                        : chr
                               NA "1540" "1538" "1538" ...
                               "PostMedieval" "Medieval" "Medieval" ...
## $ MedievalPostMedieval: chr
##
   $ Cemetry
                       : chr
                               "ChelseaOldChurch" "BermondseyAbbey" "StMaryGraces" "StMaryGraces" ...
                               "Mandible" "Mandible" "Mandible" ...
## $ MaxillaMandible : chr
                      : chr
                               "Interproximal" "Lingual" "Interproximal" ...
## $ BuccalLingual
                               "Supra" "Supra" "Supra" "Supra" ...
## $ SubSupragingival
                        : chr
                               "Canine" "Molar" "Molar" ...
## $ Tooth
                        : chr
## $ Tooth_Simplified
                        : chr
                               "Canine" "Molar" "Molar" "Molar" ...
## $ BlackDeath_1346_1353: chr
                               "Post" "Across" "Post" "Post" ...
## $ DeltaD mean
                        : num
                               0.0316 0.0411 0.0396 0.0426 0.04 ...
                               0.03323 0.05609 0.05414 0.0565 0.00969 ...
## $ DeltaD_mean_methano : num
## $ DeltaD_mean_por
                        : num
                               0.00738 0.06164 0.05349 0.06799 0.05279 ...
## $ DeltaD_mean_strep
                        : num
                               0.00644 0.00288 0.03861 0.00156 0.0033 ...
```

#### Summary of the data

## summary(metadata\_prep)

```
##
    X.SampleID
                        Date_100
                                          Date_200
                                                             Date_300
  Length: 126
                      Length: 126
                                                           Length: 126
                                        Length: 126
  Class :character
                      Class :character
                                        Class :character
                                                           Class :character
##
## Mode :character Mode :character
                                        Mode :character
                                                           Mode :character
##
##
##
##
## BlackDeath_PrePost EarlyDate
                                                           MedievalPostMedieval
                                          LateDate
## Length:126
                    Length: 126
                                        Length: 126
                                                           Length: 126
   Class :character
                      Class :character
                                        Class : character
                                                           Class : character
## Mode :character Mode :character
                                        Mode :character
                                                           Mode :character
##
##
##
##
     Cemetry
                      MaxillaMandible
                                        BuccalLingual
                                                           SubSupragingival
##
##
   Length: 126
                      Length: 126
                                        Length: 126
                                                           Length: 126
   Class :character
                      Class :character
                                        Class :character
                                                           Class : character
##
  Mode :character Mode :character
                                        Mode : character
                                                           Mode :character
##
##
```

```
##
##
##
      Tooth
                      Tooth Simplified
                                        BlackDeath 1346 1353 DeltaD mean
  Length: 126
                      Length:126
                                        Length: 126
                                                                    :0.001263
##
                                                             Min.
##
   Class : character
                      Class :character
                                        Class :character
                                                             1st Qu.:0.025439
   Mode :character Mode :character Mode :character
                                                             Median :0.032291
##
##
                                                             Mean :0.032399
##
                                                             3rd Qu.:0.039823
##
                                                             Max.
                                                                    :0.051045
##
                                                             NA's
                                                                    :5
## DeltaD_mean_methano DeltaD_mean_por
                                          DeltaD_mean_strep
## Min.
          :0.002018
                              :0.000574
                                          Min.
                                                :0.001347
                       Min.
##
  1st Qu.:0.015111
                       1st Qu.:0.012232
                                          1st Qu.:0.006117
                       Median :0.054815
## Median :0.036106
                                          Median :0.039205
## Mean
          :0.034821
                                               :0.034599
                       Mean
                             :0.045910
                                          Mean
## 3rd Qu.:0.048835
                       3rd Qu.:0.067990
                                          3rd Qu.:0.054557
## Max.
                              :0.095906
          :0.213169
                       Max.
                                          Max.
                                                :0.076097
## NA's
          :11
                       NA's
                              :5
                                          NA's
                                                 :6
```

## From the mapDamage website

DeltaD, the cytosine deamination probability in double strand context.

DeltaS, the cytosine deamination probability in single strand context.

```
DeltaD_mean <- metadata_prep$DeltaD_mean</pre>
DeltaD_mean_methano <- metadata_prep$DeltaD_mean_methano</pre>
DeltaD_mean_por <- metadata_prep$DeltaD_mean_por</pre>
DeltaD_mean_strep <- metadata_prep$DeltaD_mean_strep</pre>
# For DeltaD mean:
# Get NA indices
na_indices <- which(is.na(DeltaD_mean))</pre>
# Calculate mean
mean_value <- mean(DeltaD_mean, na.rm = TRUE)</pre>
# Impute NA values with the calculated mean
DeltaD_mean[na_indices] <- mean_value</pre>
# Recheck NA (should be zero)
sum(is.na(DeltaD_mean))
## [1] 0
# For DeltaD_mean_methano:
# Get NA indices
na_indices <- which(is.na(DeltaD_mean_methano))</pre>
# Calculate mean
mean_value <- mean(DeltaD_mean_methano, na.rm = TRUE)</pre>
# Impute NA values with the calculated mean
DeltaD_mean_methano[na_indices] <- mean_value</pre>
```

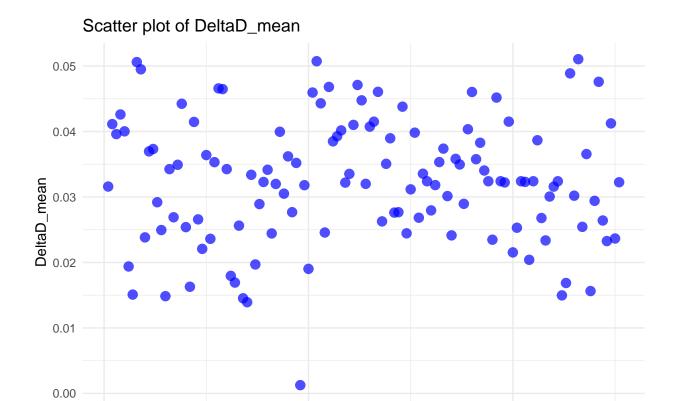
```
# Recheck NA (should be zero)
sum(is.na(DeltaD_mean_methano))
## [1] 0
# For DeltaD_mean_por:
# Get NA indices
na_indices <- which(is.na(DeltaD_mean_por))</pre>
# Calculate mean
mean_value <- mean(DeltaD_mean_por, na.rm = TRUE)</pre>
# Impute NA values with the calculated mean
DeltaD_mean_por[na_indices] <- mean_value</pre>
# Recheck NA (should be zero)
sum(is.na(DeltaD_mean_por))
## [1] 0
# For DeltaD_mean_strep:
# Get NA indices
na_indices <- which(is.na(DeltaD_mean_strep))</pre>
# Calculate mean
mean_value <- mean(DeltaD_mean_strep, na.rm = TRUE)</pre>
# Impute NA values with the calculated mean
DeltaD_mean_strep[na_indices] <- mean_value</pre>
# Recheck NA (should be zero)
sum(is.na(DeltaD_mean_strep))
```

## **##** [1] 0

# Plots for DeltaD\_mean

```
index <- which(!is.na(DeltaD_mean))

ggplot(data.frame(DeltaD_mean), aes(x = index, y = DeltaD_mean)) +
    geom_point(color = "blue", size = 3, alpha = 0.7) +
    theme_minimal() +
    ggtitle(paste("Scatter plot of DeltaD_mean"))</pre>
```

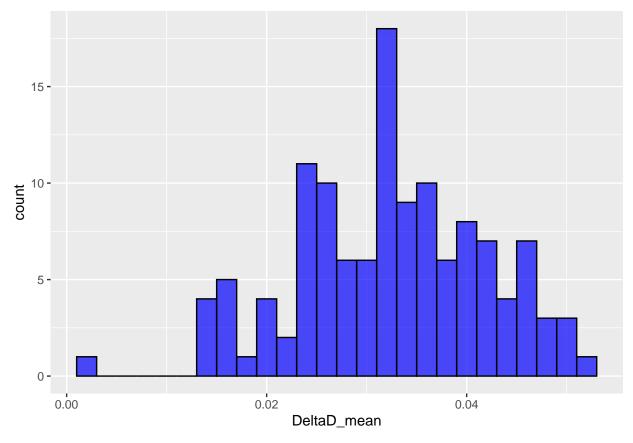


```
ggplot(data.frame(DeltaD_mean), aes(x = DeltaD_mean)) +
   geom_histogram(binwidth = 0.002, fill = "blue", color = "black", alpha = 0.7)
```

index

100

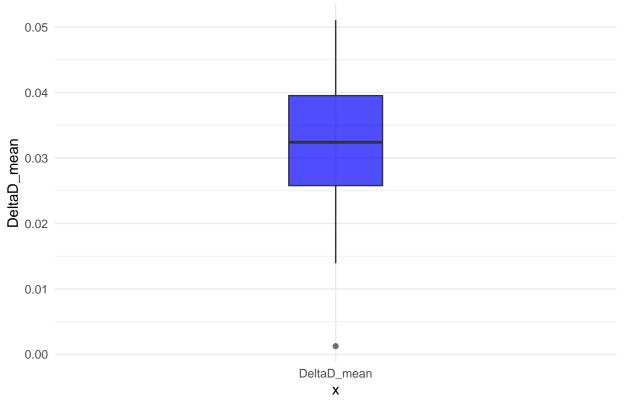
50



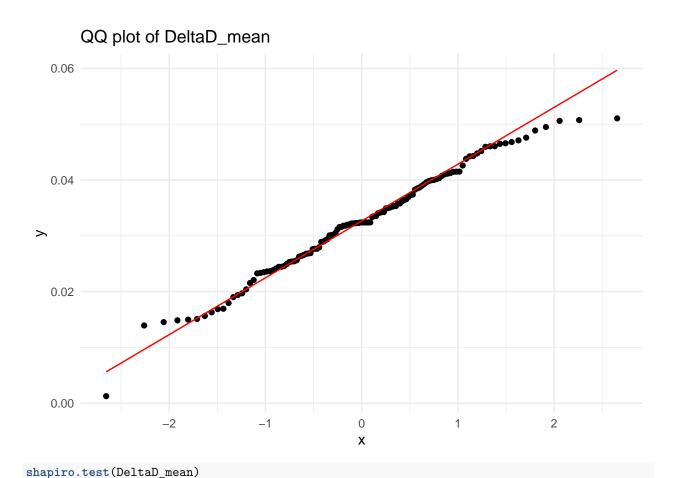
```
theme_minimal() +
  ggtitle(paste("Histogram of DeltaD_mean"))

ggplot(data.frame(DeltaD_mean), aes(x = "DeltaD_mean", y = DeltaD_mean)) +
  geom_boxplot(fill = "blue", alpha = 0.7, width = 0.2) +
  theme_minimal() +
  ggtitle(paste("Box plot of DeltaD_mean"))
```





```
ggplot(data.frame(DeltaD_mean), aes(sample = DeltaD_mean)) +
    geom_qq() +
    geom_qq_line(color = "red") +
    theme_minimal() +
    ggtitle(paste("QQ plot of DeltaD_mean"))
```

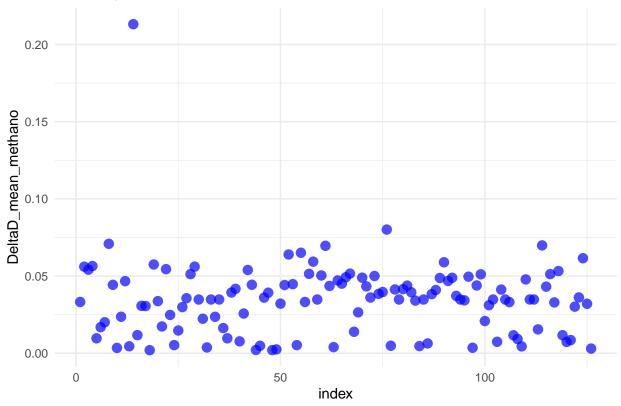


# Plots for DeltaD\_mean\_methano

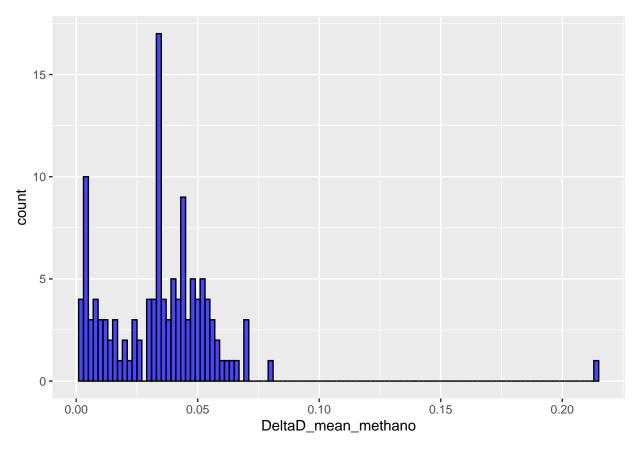
```
index <- which(!is.na(DeltaD_mean_methano))

ggplot(data.frame(DeltaD_mean_methano), aes(x = index, y = DeltaD_mean_methano)) +
    geom_point(color = "blue", size = 3, alpha = 0.7) +
    theme_minimal() +
    ggtitle(paste("Scatter plot of DeltaD_mean_methano"))</pre>
```





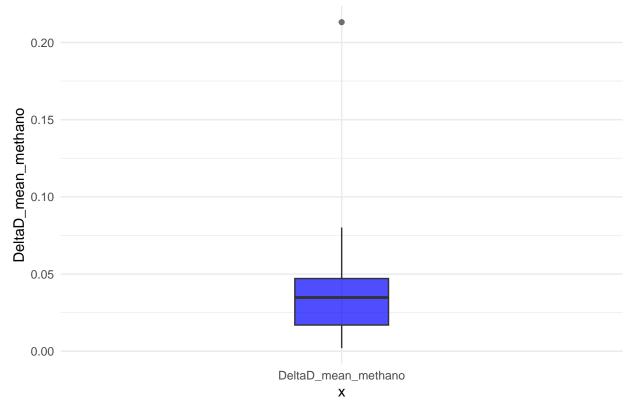
```
ggplot(data.frame(DeltaD_mean_methano), aes(x = DeltaD_mean_methano)) +
   geom_histogram(binwidth = 0.002, fill = "blue", color = "black", alpha = 0.7)
```



```
theme_minimal() +
    ggtitle(paste("Histogram of DeltaD_mean_methano"))

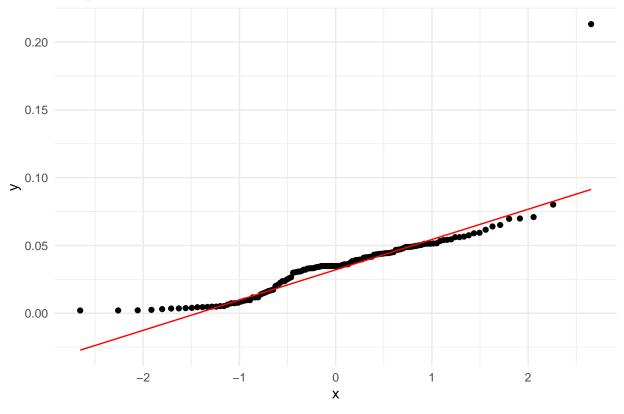
ggplot(data.frame(DeltaD_mean), aes(x = "DeltaD_mean_methano", y = DeltaD_mean_methano)) +
    geom_boxplot(fill = "blue", alpha = 0.7, width = 0.2) +
    theme_minimal() +
    ggtitle(paste("Box plot of DeltaD_mean_methano"))
```

# Box plot of DeltaD\_mean\_methano



```
ggplot(data.frame(DeltaD_mean_methano), aes(sample = DeltaD_mean_methano)) +
    geom_qq() +
    geom_qq_line(color = "red") +
    theme_minimal() +
    ggtitle(paste("QQ plot of DeltaD_mean_methano"))
```

# QQ plot of DeltaD\_mean\_methano

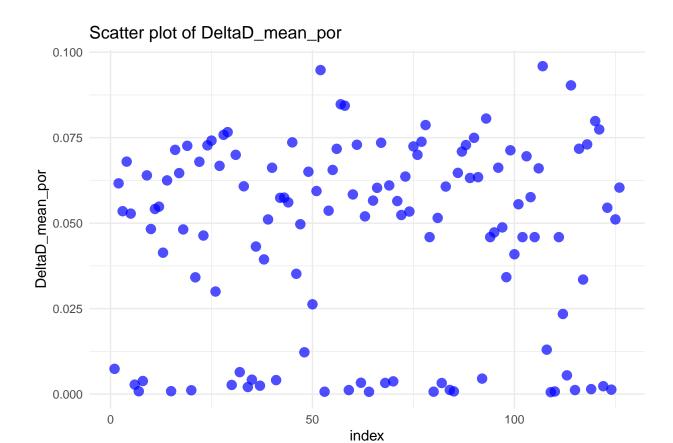


shapiro.test(DeltaD\_mean\_methano)

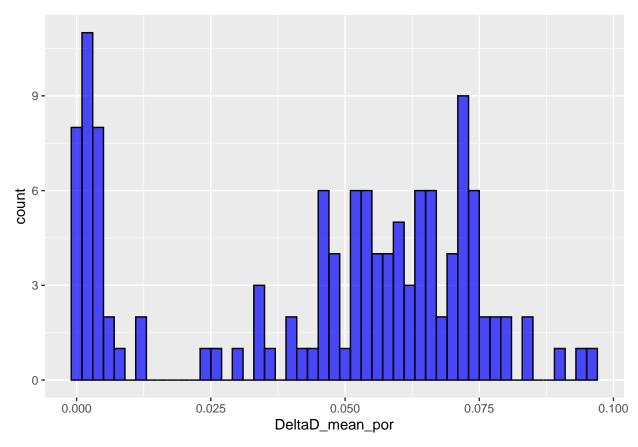
## Plots for DeltaD\_mean\_por

```
index <- which(!is.na(DeltaD_mean_por))

ggplot(data.frame(DeltaD_mean_por), aes(x = index, y = DeltaD_mean_por)) +
    geom_point(color = "blue", size = 3, alpha = 0.7) +
    theme_minimal() +
    ggtitle(paste("Scatter plot of DeltaD_mean_por"))</pre>
```

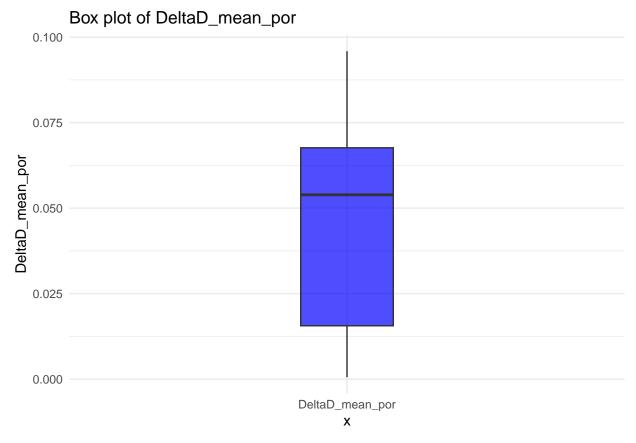


```
ggplot(data.frame(DeltaD_mean_por), aes(x = DeltaD_mean_por)) +
   geom_histogram(binwidth = 0.002, fill = "blue", color = "black", alpha = 0.7)
```



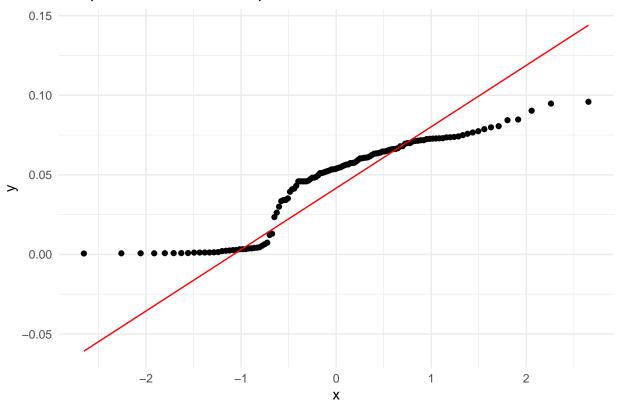
```
theme_minimal() +
  ggtitle(paste("Histogram of DeltaD_mean_por"))

ggplot(data.frame(DeltaD_mean), aes(x = "DeltaD_mean_por", y = DeltaD_mean_por") +
  geom_boxplot(fill = "blue", alpha = 0.7, width = 0.2) +
  theme_minimal() +
  ggtitle(paste("Box plot of DeltaD_mean_por"))
```



```
ggplot(data.frame(DeltaD_mean_por), aes(sample = DeltaD_mean_por)) +
    geom_qq() +
    geom_qq_line(color = "red") +
    theme_minimal() +
    ggtitle(paste("QQ plot of DeltaD_mean_por"))
```



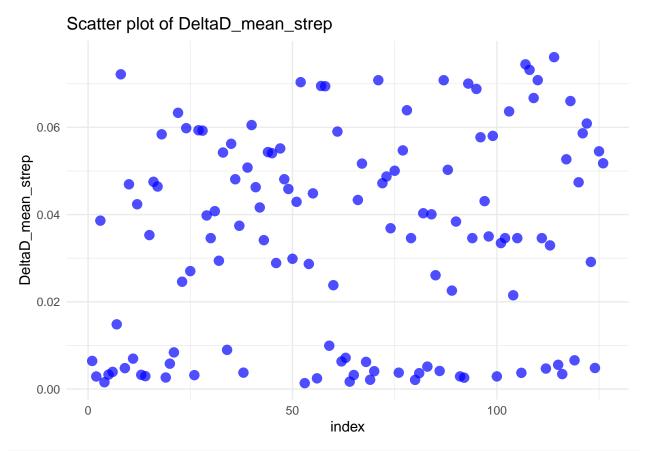


shapiro.test(DeltaD\_mean\_por)

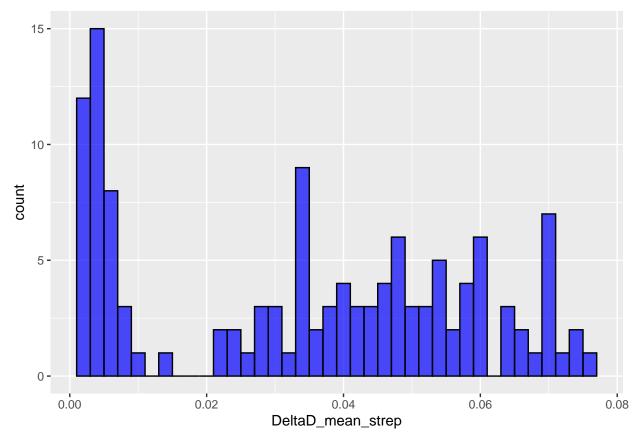
## Plots for DeltaD\_mean\_strep

```
index <- which(!is.na(DeltaD_mean_strep))

ggplot(data.frame(DeltaD_mean_strep), aes(x = index, y = DeltaD_mean_strep)) +
    geom_point(color = "blue", size = 3, alpha = 0.7) +
    theme_minimal() +
    ggtitle(paste("Scatter plot of DeltaD_mean_strep"))</pre>
```



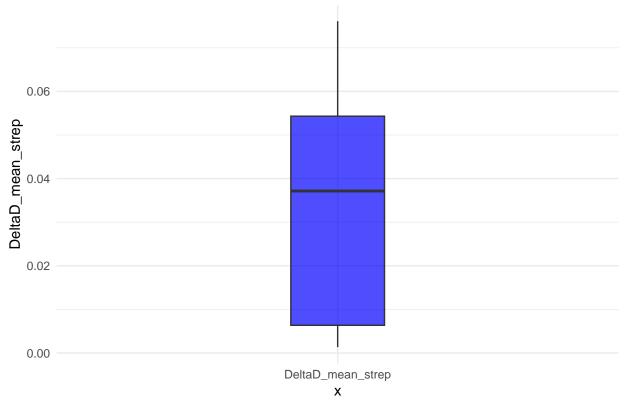
```
ggplot(data.frame(DeltaD_mean_strep), aes(x = DeltaD_mean_strep)) +
   geom_histogram(binwidth = 0.002, fill = "blue", color = "black", alpha = 0.7)
```



```
theme_minimal() +
    ggtitle(paste("Histogram of DeltaD_mean_strep"))

ggplot(data.frame(DeltaD_mean), aes(x = "DeltaD_mean_strep", y = DeltaD_mean_strep)) +
    geom_boxplot(fill = "blue", alpha = 0.7, width = 0.2) +
    theme_minimal() +
    ggtitle(paste("Box plot of DeltaD_mean_strep"))
```





```
ggplot(data.frame(DeltaD_mean_strep), aes(sample = DeltaD_mean_strep)) +
    geom_qq() +
    geom_qq_line(color = "red") +
    theme_minimal() +
    ggtitle(paste("QQ plot of DeltaD_mean_strep"))
```

