Data importation

- 1. Endpoint dataframe
 - A. Exploration of data

Exploration tables using the rstatix, janitor and skimr packages

Data visualization

B. Normality hypothesis and outlier detection

Boxplots after outlier detection

Violin and sina plots after outlier detection

Exploration statistics for the variables after outlier detection

2. Exploration of the timeseries data

Number of data observations per day for the traits of the timeseries datasets

- A. Exploration of the timeseries dataframe
- B. Exploration of the S_timeseries dataframe
- C. Exploration of the T_timeseries dataframe

4PMI Data Analysis

Elise

2024-06-09

Set the right working directory.

setwd("C:/Users/elise/Documents/Mémoire/Main/Data/Templates/4PMI")

Data importation

Import the data sets extracted from the Data Preparation R Markdown.

```
list.files()
```

```
## [1] "endpoint.txt" "plant_info.txt"
```

```
plant_info <- read.table("plant_info.txt", header = TRUE, sep = "\t")
endpoint <- read.table("endpoint.txt", header = TRUE, sep = "\t")</pre>
```

Convert the columns to factor and date formats.

```
# plant_info
plant_info <- lapply(plant_info, factor)

# endpoint
matching_cols <- intersect(names(endpoint), names(plant_info))
endpoint[, matching_cols] <- lapply(endpoint[, matching_cols], factor)
endpoint$Date <- date(endpoint$Date)
endpoint$Timestamp <- NA</pre>
```

Collect the variables of every data template and print the names of the variables. This serves as a double check.

```
platform <- "4PMI"

# endpoint

df <- endpoint[,colSums(is.na(endpoint))<nrow(endpoint)]

genotype_index <- which(colnames(df) == "Genotype")

variables <- colnames(df[, c(3:(genotype_index - 1))]) # We remove the 3 first columns
that are "Unit.ID" and "Date" etc

print(paste(platform, ": The variables for endpoint are", paste(variables, collapse =
    ", "), sep = " "))</pre>
```

```
\#\# [1] "4PMI : The variables for endpoint are DW_shoot_g, DW_root_g, Leaf_number, DW_se ed_g"
```

Add a column Plant type with three levels, H L and T. This variable is useful to test for heterosis effects.

```
endpoint$Plant_type <- substr(endpoint$Genotype, nchar(as.character(endpoint$Genotyp
e)), nchar(as.character(endpoint$Genotype)))</pre>
```

1. Endpoint dataframe

A. Exploration of data

Exploration tables using the rstatix, janitor and skimr packages

```
endpoint %>%
count(Genotype)
```

```
##
      Genotype n
## 1
           10H 10
## 2
           10L 10
## 3
           11H 10
## 4
           11L 10
## 5
           12H 10
## 6
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## 10
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## 30
            8H 10
## 31
            8L 10
            9H 10
## 32
## 33
            9L 10
```

```
endpoint %>%
  tabyl(Genotype, Column) %>%
  adorn_totals("row") %>%
  adorn_percentages("row") %>%
  adorn_pct_formatting() %>%
  adorn_ns() %>%
  adorn_ns() %>%
  adorn_title("combined")
```

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  adorn_totals("row") %>%
  adorn_percentages("row") %>%
  adorn_pct_formatting() %>%
  adorn_ns() %>%
  adorn_title("combined")
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##
```

```
## Warning: Using an external vector in selections was deprecated in tidyselect 1.1.0.
## i Please use `all_of()` or `any_of()` instead.
##
    # Was:
##
     data %>% select(variables)
##
##
     # Now:
##
     data %>% select(all_of(variables))
##
## See <https://tidyselect.r-lib.org/reference/faq-external-vector.html>.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
```

```
## # A tibble: 4 × 10
                           variable n
                                                                                                                                                  min
                                                                                                                                                                                      max median
                                                                                                                                                                                                                                                                    igr
##
                           <fct> <dbl> 
## 1 DW_shoot_g 325 0.006 0.638 0.224 0.153 0.241 0.121 0.007 0.013
                                                                                                              324 0.005 0.431 0.173 0.11 0.179 0.086 0.005 0.009
## 2 DW_root_g
## 3 Leaf_number
                                                                                                               319 1
                                                                                                                                                                          6
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                                                                                                                                                                                                                                                        1
                                                                                                                                                                                                                                                                                           4.33 0.692 0.039 0.076
## 4 DW_seed_g
                                                                                                               330 0.01 0.222 0.036 0.027 0.043 0.027 0.002 0.003
```

```
skim(endpoint[variables])
```

Data summary

Name	endpoint[variables]
Number of rows	330
Number of columns	4
Column type frequency:	
numeric	4
Group variables	None

Variable type: numeric

skim_variable	n_missing	complete_rate	mean	sd	p0	p25	p50	p75	p100	hist
DW_shoot_g	5	0.98	0.24	0.12	0.01	0.16	0.22	0.31	0.64	_==
DW_root_g	6	0.98	0.18	0.09	0.01	0.12	0.17	0.23	0.43	_===_
Leaf_number	11	0.97	4.33	0.69	1.00	4.00	4.00	5.00	6.00	
DW_seed_g	0	1.00	0.04	0.03	0.01	0.02	0.04	0.05	0.22	

Data visualization

Using several functions that are located in the functions.R script

Boxplots

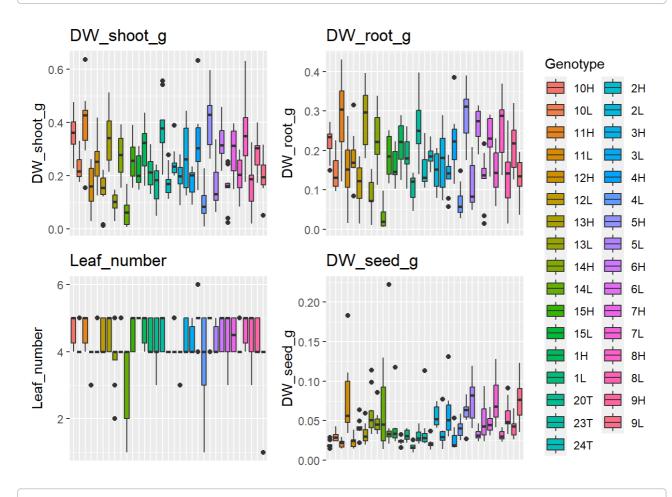
```
create_boxplots(endpoint, variables, "Genotype")
```

```
## Warning: `aes_string()` was deprecated in ggplot2 3.0.0.
## i Please use tidy evaluation idioms with `aes()`.
## i See also `vignette("ggplot2-in-packages")` for more information.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
```

```
## Warning: Removed 5 rows containing non-finite values (`stat_boxplot()`).
```

Warning: Removed 6 rows containing non-finite values (`stat_boxplot()`).

Warning: Removed 11 rows containing non-finite values (`stat_boxplot()`).

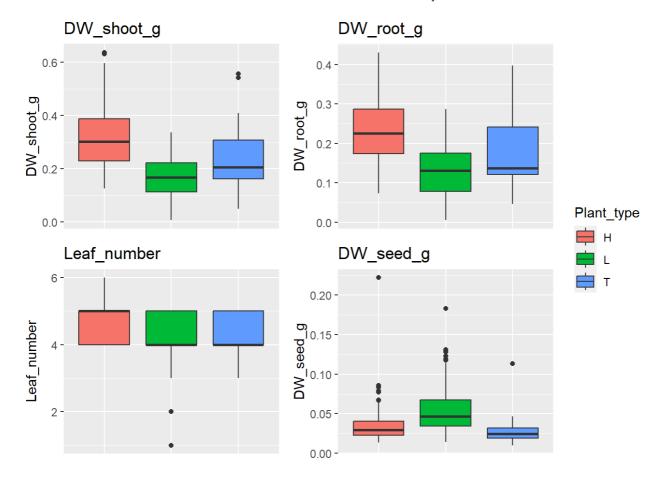


create_boxplots(endpoint, variables, "Plant_type")

Warning: Removed 5 rows containing non-finite values (`stat_boxplot()`).

Warning: Removed 6 rows containing non-finite values (`stat_boxplot()`).

Warning: Removed 11 rows containing non-finite values (`stat_boxplot()`).



Correlation plots

```
for (i in 1:(length(variables) - 1)) {
  for (j in (i + 1):length(variables)) {
    calculate_correlation_plot(endpoint, variables[i], variables[j])
  }
}
```

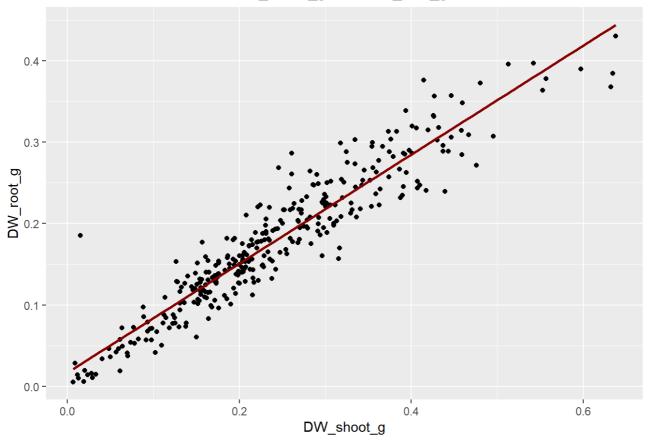
```
## `geom_smooth()` using formula = 'y ~ x'
```

```
## Warning: Removed 6 rows containing non-finite values (`stat_smooth()`).
```

```
## Warning: Removed 6 rows containing missing values (`geom_point()`).
```

```
## Warning: Removed 330 rows containing missing values (`geom_text()`).
```

Correlation Plot between DW_shoot_g and DW_root_g

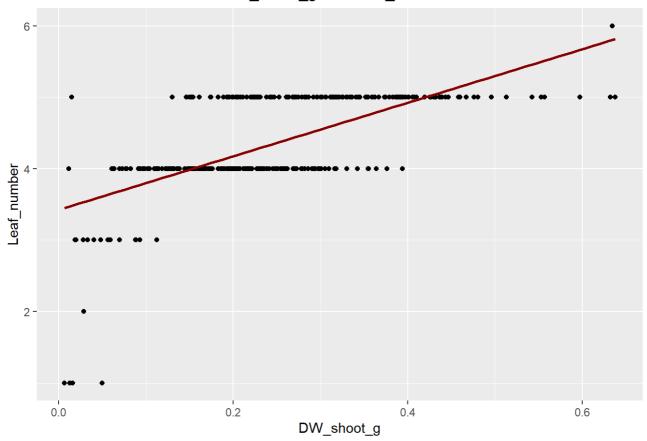


$geom_smooth()$ using formula = 'y ~ x'

Warning: Removed 11 rows containing non-finite values (`stat_smooth()`).

Warning: Removed 11 rows containing missing values (`geom_point()`).

Correlation Plot between DW_shoot_g and Leaf_number

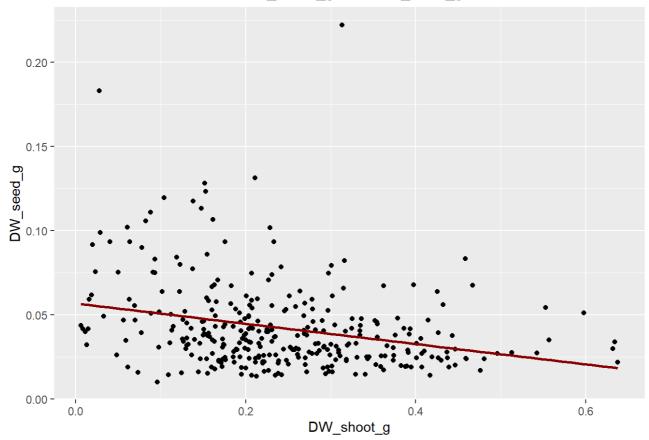


`geom_smooth()` using formula = 'y ~ x'

Warning: Removed 5 rows containing non-finite values (`stat_smooth()`).

Warning: Removed 5 rows containing missing values (`geom_point()`).

Correlation Plot between DW_shoot_g and DW_seed_g

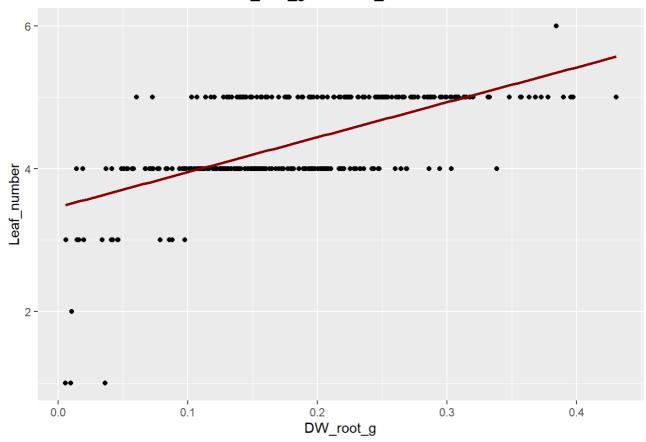


$geom_smooth()$ using formula = 'y ~ x'

Warning: Removed 12 rows containing non-finite values (`stat_smooth()`).

Warning: Removed 12 rows containing missing values (`geom_point()`).

Correlation Plot between DW_root_g and Leaf_number

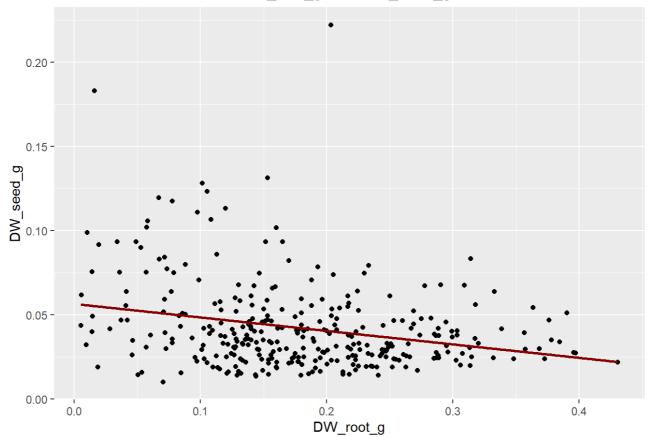


`geom_smooth()` using formula = 'y ~ x'

Warning: Removed 6 rows containing non-finite values (`stat_smooth()`).

Warning: Removed 6 rows containing missing values (`geom_point()`).

Correlation Plot between DW_root_g and DW_seed_g

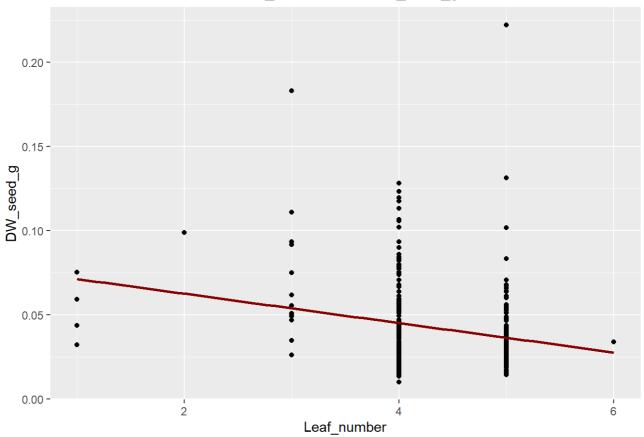


$geom_smooth()$ using formula = 'y ~ x'

Warning: Removed 11 rows containing non-finite values (`stat_smooth()`).

Warning: Removed 11 rows containing missing values (`geom_point()`).

Correlation Plot between Leaf_number and DW_seed_g



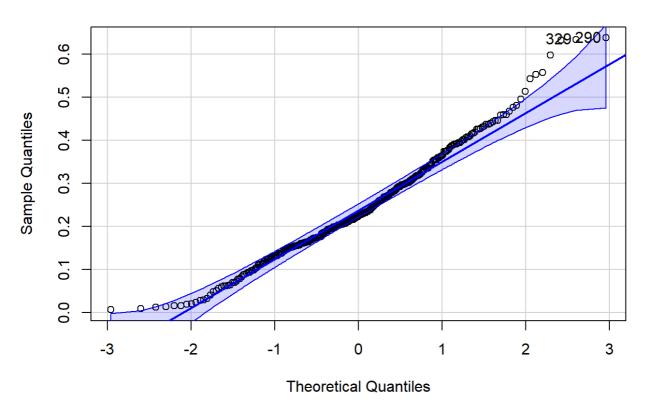
B. Normality hypothesis and outlier detection

Test for normality hypothesis and plot density histogram. The red curve is the normal distribution, the blue dotted curve is the data density curve.

```
normality_results <- normality_test_histogram(endpoint)</pre>
```

```
## Warning: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0.
## i Please use `linewidth` instead.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
```

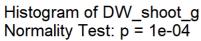
QQ Plot of DW_shoot_g

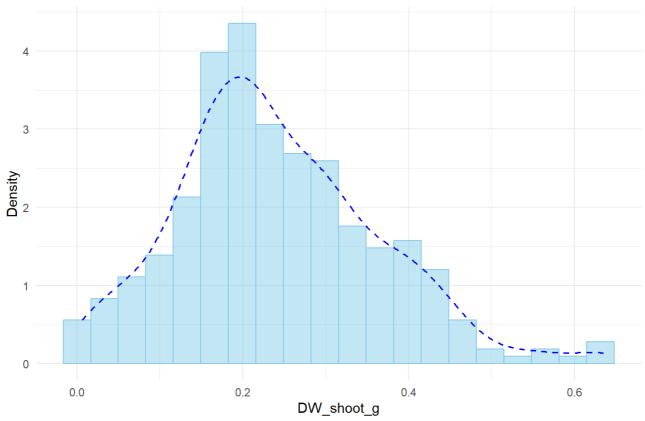


```
## Warning: The dot-dot notation (`..density..`) was deprecated in ggplot2 3.4.0.
## i Please use `after_stat(density)` instead.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.
```

```
## Warning: Removed 5 rows containing non-finite values (`stat_bin()`).
```

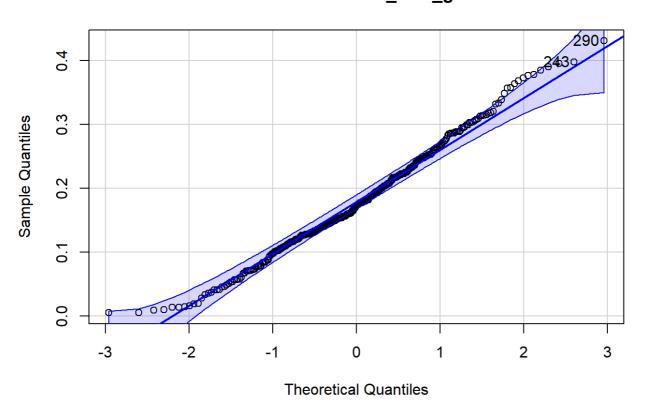
```
## Warning: Removed 5 rows containing non-finite values (`stat_density()`).
```





[1] 290 329

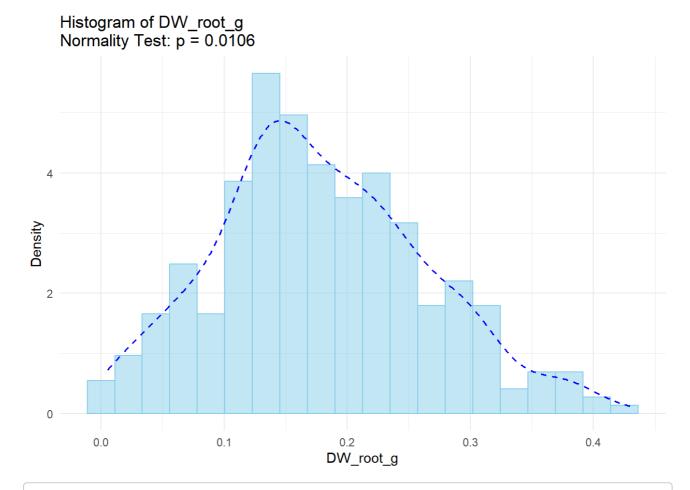
QQ Plot of DW_root_g



Warning: Removed 6 rows containing non-finite values (`stat_bin()`).

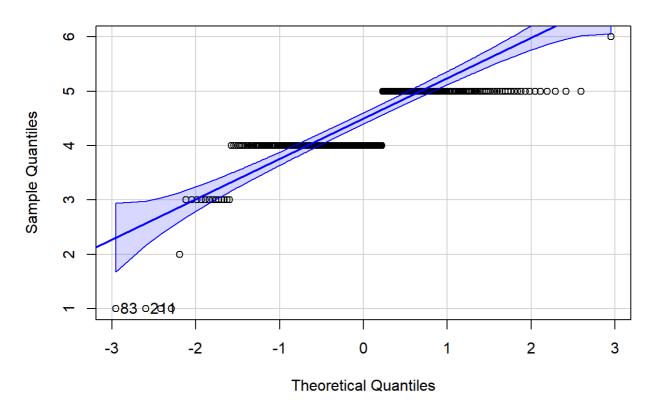
Warning: Removed 6 rows containing non-finite values (`stat_density()`).

Warning: Removed 101 rows containing missing values (`geom_function()`).



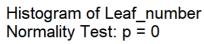
[1] 290 243

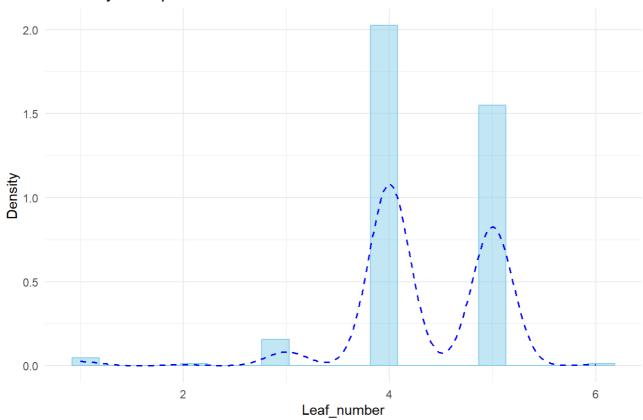
QQ Plot of Leaf_number



Warning: Removed 11 rows containing non-finite values (`stat_bin()`).

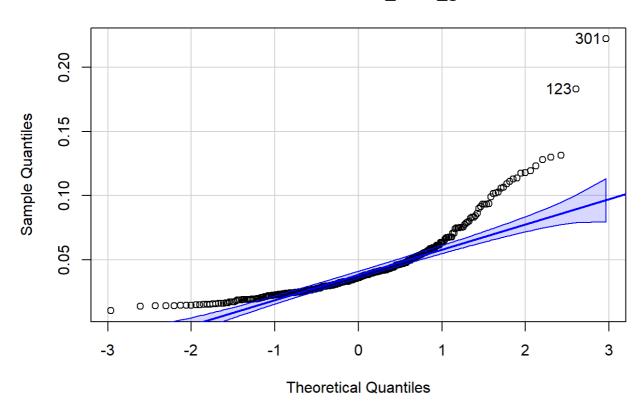
Warning: Removed 11 rows containing non-finite values (`stat_density()`).

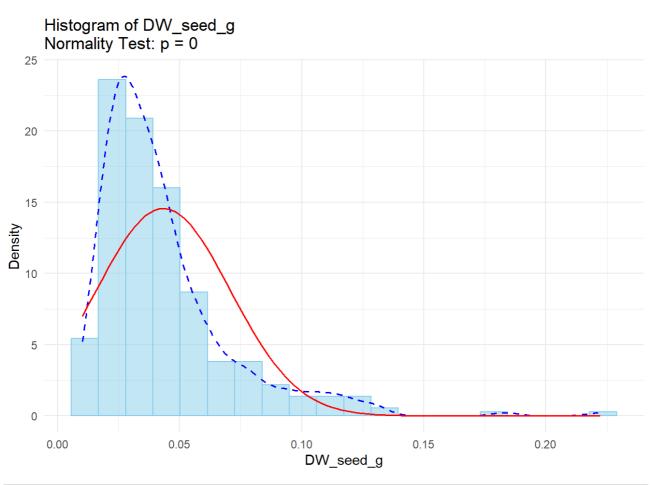




[1] 83 211

QQ Plot of DW_seed_g





Remove the outliers, replacing them with NULL values and normality visual verification.

The function detect_replace_ouliers_by_genotype checks for outlying values, using the Tukey method.

[1] 301 123

Then run the function on all variables of the dataset.

```
endpoint_clean <- endpoint
# Run the function on the dataset for all the variables
endpoint_clean <- detect_replace_outliers_by_genotype(endpoint_clean)</pre>
```

Boxplots after outlier detection

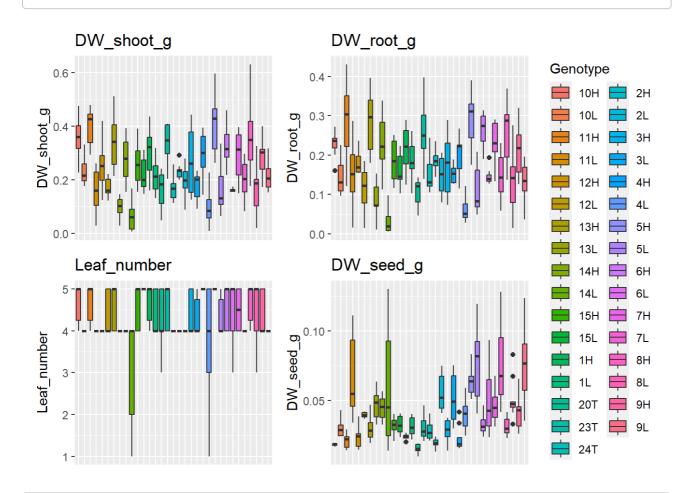
```
create_boxplots(endpoint_clean, variables, "Genotype")
```

```
## Warning: Removed 19 rows containing non-finite values (`stat_boxplot()`).
```

```
## Warning: Removed 16 rows containing non-finite values (`stat_boxplot()`).
```

Warning: Removed 30 rows containing non-finite values (`stat_boxplot()`).

Warning: Removed 23 rows containing non-finite values (`stat_boxplot()`).



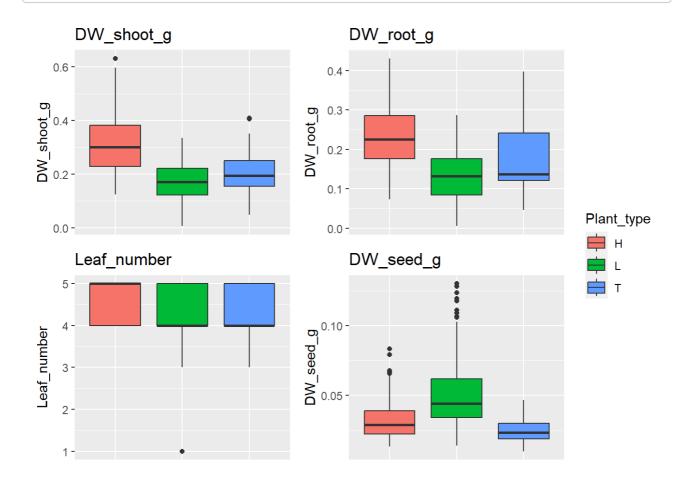
create_boxplots(endpoint_clean, variables, "Plant_type")

```
## Warning: Removed 19 rows containing non-finite values (`stat_boxplot()`).
```

Warning: Removed 16 rows containing non-finite values (`stat_boxplot()`).

```
## Warning: Removed 30 rows containing non-finite values (`stat_boxplot()`).
```

Warning: Removed 23 rows containing non-finite values (`stat_boxplot()`).



Violin and sina plots after outlier detection

```
create_violin_plots(endpoint_clean, variables, "Genotype")

## Warning: The `size` argument of `element_line()` is deprecated as of ggplot2 3.4.0.
## i Please use the `linewidth` argument instead.
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_lifecycle_warnings()` to see where this warning was
## generated.

## Warning: Removed 19 rows containing non-finite values (`stat_ydensity()`).

## Warning: Removed 19 rows containing non-finite values (`stat_sina()`).

## Warning: Removed 16 rows containing non-finite values (`stat_ydensity()`).

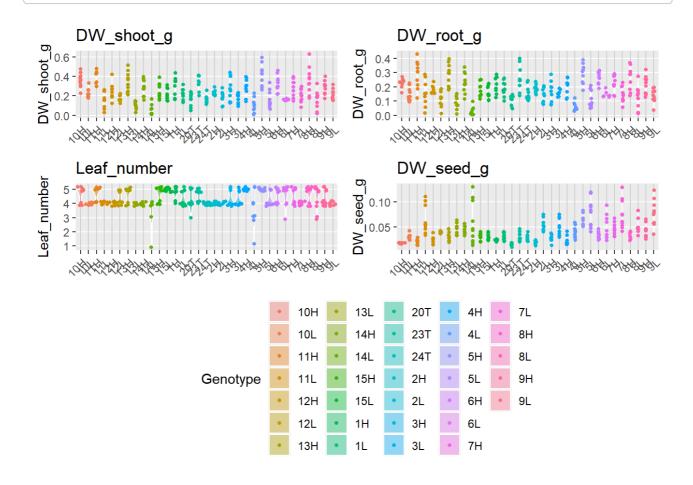
## Warning: Removed 16 rows containing non-finite values (`stat_sina()`).

## Warning: Removed 30 rows containing non-finite values (`stat_sina()`).
```

```
## Warning: Removed 30 rows containing non-finite values (`stat_sina()`).
```

```
## Warning: Removed 23 rows containing non-finite values (`stat_ydensity()`).
```

Warning: Removed 23 rows containing non-finite values (`stat_sina()`).



```
create_violin_plots(endpoint_clean, variables, "Plant_type")
```

Warning: Removed 19 rows containing non-finite values (`stat_ydensity()`).

Warning: Removed 19 rows containing non-finite values (`stat_sina()`).

Warning: Removed 16 rows containing non-finite values (`stat ydensity()`).

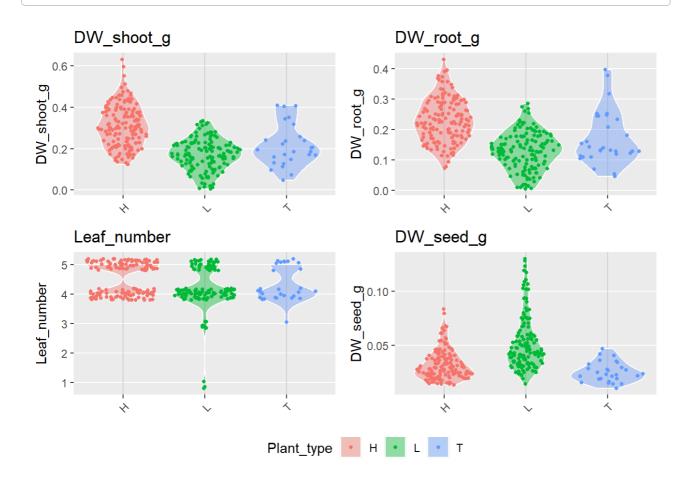
Warning: Removed 16 rows containing non-finite values (`stat_sina()`).

Warning: Removed 30 rows containing non-finite values (`stat ydensity()`).

Warning: Removed 30 rows containing non-finite values (`stat sina()`).

Warning: Removed 23 rows containing non-finite values (`stat_ydensity()`).

Warning: Removed 23 rows containing non-finite values (`stat_sina()`).



Exploration statistics for the variables after outlier detection

skim(endpoint_clean[variables])

Data summary

•	
Name	endpoint_clean[variables]
Number of rows	330
Number of columns	4
Column type frequency:	
numeric	4
Group variables	None

Variable type: numeric

skim_variable	n_missing	complete_rate	mean	sd	p0	p25	p50	p75	p100	hist
DW_shoot_g	19	0.94	0.24	0.11	0.01	0.16	0.22	0.31	0.63	_==
DW_root_g	16	0.95	0.18	0.08	0.01	0.13	0.17	0.23	0.43	

skim_variable	n_missing	complete_rate	mean	sd	p0	p25	p50	p75	p100	hist
Leaf_number	30	0.91	4.35	0.63	1.00	4.00	4.00	5.00	5.00	
DW_seed_g	23	0.93	0.04	0.02	0.01	0.02	0.04	0.05	0.13	

```
## Summary for: DW_shoot_g
## # A tibble: 33 × 4
##
      Genotype mean std.dev n missing
##
      <fct>
               <dbl>
                        <dbl> <int>
##
   1 5H
              0.414 0.112
   2 11H
              0.399 0.0675
                                      2
##
   3 10H
##
              0.361 0.0726
                                      0
   4 8H
              0.360 0.138
##
##
   5 13H
              0.343 0.101
                                      0
   6 23T
              0.335 0.0785
                                      2
##
   7 6H
              0.327 0.0814
##
                                      0
##
   8 1H
              0.302 0.0915
                                      0
## 9 7H
              0.291 0.0916
                                      0
## 10 9H
              0.287 0.0678
                                      0
## 11 4H
              0.286 0.0901
                                      1
## 12 14H
              0.279 0.0809
                                      0
## 13 3H
              0.269 0.121
                                      0
## 14 15H
              0.256 0.0768
                                      0
## 15 12H
              0.250 0.0811
                                      0
## 16 10L
              0.238 0.0562
                                      0
## 17 2H
              0.232 0.0278
                                      1
## 18 15L
              0.216 0.0597
                                      1
## 19 9L
              0.216 0.0558
                                      1
## 20 1L
              0.211 0.0599
## 21 7L
              0.202 0.0689
## 22 2L
              0.189 0.0610
                                      0
## 23 3L
              0.178 0.0509
                                      2
## 24 12L
              0.172 0.0340
## 25 24T
              0.166 0.0433
                                      1
## 26 20T
                                      0
              0.165 0.0700
## 27 5L
              0.162 0.0884
## 28 6L
              0.161 0.00741
                                      4
## 29 8L
              0.161 0.0929
## 30 11L
              0.159 0.0817
                                      0
## 31 13L
              0.0993 0.0379
                                      1
## 32 4L
              0.0972 0.0712
                                      0
## 33 14L
              0.0638 0.0591
                                      3
##
## Summary for: DW_root_g
## # A tibble: 33 × 4
##
      Genotype
                mean std.dev n_missing
##
      <fct>
               <dbl>
                      <dbl>
                                 <int>
##
  1 5H
              0.294
                       0.0664
                                      0
   2 11H
              0.287
                                      0
##
                       0.0945
   3 13H
##
              0.285
                       0.0773
                                      0
##
   4 6H
              0.266
                       0.0416
                                      0
##
   5 8H
              0.260
                       0.0810
                                      0
   6 23T
               0.259
##
                       0.0849
                                      0
##
   7 14H
              0.229
                       0.0706
                                      0
##
   8 7H
               0.228
                       0.0580
                                      0
##
   9 10H
               0.228
                                      1
                       0.0324
## 10 1H
               0.215
                       0.0549
                                      0
## 11 9H
               0.211
                       0.0632
                                      0
## 12 4H
               0.202
                       0.0556
                                      1
```

## 13 1L	0.188	0.0516	0
## 14 2H	0.187	0.0272	0
## 15 15H	0.185	0.0516	0
## 16 12H	0.180	0.0296	2
## 17 3H	0.177	0.0802	0
## 18 15L	0.157	0.0428	1
## 19 24T	0.154	0.0502	0
## 20 11L		0.0861	0
## 21 3L		0.0235	2
## 22 2L	0.148	0.0473	0
		0.0231	3
		0.0542	0
## 25 10L		0.0475	0
## 26 9L		0.0487	0
## 27 8L		0.0788	0
## 28 12L		0.0550	0
## 29 5L		0.0596	0
		0.0356	0
## 31 13L	0.0846	0.0452	1
## 32 4L	0.0615	0.0299	2
## 33 14L	0.0321	0.0334	3
##			
## Summary for	: Leaf_n	umber	
## # A tibble:	33 × 4		
## Genotype	mean s	td.dev n_mis	sing
## <fct></fct>		_	int>
## 1 15L	5	0	1
## 2 4H	5	0	3
## 3 5H	5	0	1
## 4 10H	4.7	0.483	0
## 4 10H ## 5 11H			
		0.483	0
## 6 1H	4.7	0.483	0
## 7 8H	4.7	0.483	0
## 8 13H	4.67	0.5	1
## 9 23T	4.67	0.5	1
## 10 15H	4.6	0.516	0
## 11 6H	4.6	0.516	0
## 12 6L	4.56	0.726	1
## 13 7H	4.5	0.527	0
## 14 12L	4.4	0.516	0
## 15 1L	4.4	0.516	0
## 16 8L	4.4	0.843	0
## 17 9H	4.4	0.516	0
## 18 3H	4.33	0.5	1
## 19 20T	4.3	0.675	0
## 20 3L	4.3	0.483	0
## 21 5L	4.3	0.483	0
	4.3		
## 22 10L	4	0	2
## 23 11L		0	2
## 24 12H	4	0	1
## 25 13L	4	0	5
## 26 14H	4	0	1
## 27 24T	4	0	0
## 28 2H	4	0	1
## 29 2L	4	0	2
## 30 7L	4	0	2

```
## 31 9L
## 32 4L
                3.67
                       1.32
                                      1
## 33 14L
                       1.41
##
## Summary for: DW_seed_g
## # A tibble: 33 × 4
##
      Genotype
                 mean std.dev n missing
                <dbl>
                        <dbl>
##
               0.0781 0.0282
   2 9L
               0.0766 0.0263
##
   3 7L
               0.0748 0.0283
   4 11L
               0.0655 0.0288
##
   5 5H
               0.0651 0.0108
   6 14L
               0.0581 0.0416
   7 2L
               0.0558 0.0130
##
   8 81
               0.0514 0.0148
               0.0507 0.0170
                                       1
   9 3L
## 10 6L
               0.0500 0.0229
               0.0474 0.0110
## 11 13L
                                       2
## 12 7H
               0.0460 0.0120
  13 14H
               0.0447 0.00784
                                       1
               0.0425 0.0131
## 14 9H
                                       a
## 15 4L
               0.0406 0.0110
## 16 12L
               0.0398 0.00204
                                       3
               0.0330 0.00698
## 17 6H
                                       0
## 18 15L
               0.0326 0.00645
                                       1
## 19 8H
               0.0315 0.00627
                                       0
               0.0314 0.00665
## 20 15H
               0.0312 0.00687
## 21 1L
## 22 23T
               0.0309 0.00855
## 23 13H
               0.0306 0.00873
## 24 10L
               0.0298 0.00576
## 25 3H
               0.0287 0.00737
## 26 24T
               0.0283 0.00651
                                       1
## 27 1H
               0.0241 0.00194
## 28 12H
               0.0234 0.00722
## 29 4H
               0.0227 0.00914
                                       1
## 30 11H
               0.0212 0.00498
## 31 2H
               0.0192 0.00365
                                       1
                                       3
## 32 10H
               0.0184 0.00102
## 33 20T
               0.0158 0.00291
                                       1
```

2. Exploration of the timeseries data

In this part, we look at the timeseries, S_timeseries and T_timeseries datasets, also using several functions, located in the functions.R script.

Number of data observations per day for the traits of the timeseries datasets

```
print(paste0("No data for", platform))
```

[1] "No data for4PMI"

A. Exploration of the timeseries dataframe

Scatter plots by Genotype

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatterplots for all genotypes by Plant type (Hybride, Line, EPPN20_T) with smooth line.

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatter plots for all genotypes by water treatment

print(paste0("No data for", platform))

[1] "No data for4PMI"

B. Exploration of the S_timeseries dataframe

Scatter plots by Genotype

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatterplots for all genotypes by Plant type (Hybride, Line, EPPN20_T) with smooth line.

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatter plots for all genotypes by water treatment

print(paste0("No data for", platform))

[1] "No data for4PMI"

C. Exploration of the T_timeseries dataframe

Scatter plots by Genotype

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatterplots for all genotypes by Plant type (Hybride, Line, EPPN20_T) with smooth line.

print(paste0("No data for", platform))

[1] "No data for4PMI"

Scatter plots for all genotypes by water treatment

print(paste0("No data for", platform))

[1] "No data for4PMI"