## 3.Repeated\_Measures\_ANOVAs

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```
library(here)
library(tidyverse)
library(rstatix)
library(nlme)
library(emmeans)
library(multcomp)
```

## Does communities' NE, CE and SE change over time

```
#Net effect, CE, SE
NE_data<-read.csv(here("data", "NE_data.csv"), sep=";")</pre>
str(NE_data)
## 'data.frame':
                   132 obs. of 8 variables:
## $ Polyculture: chr "JOB1LmSp" "JOB1LmWc" "JOB1LmLt" "JOB1SpWc" ...
## $ Block
            : int 1 1 1 1 1 1 1 1 1 1 ...
## $ Composition: chr "LmSp" "LmWc" "LmLt" "SpWc" ...
                : int 0000000000...
## $ Days
## $ RYT
                : num 1 1 1 1 1 ...
## $ NE
                : num -1.093 -0.226 -2.291 -0.327 -0.186 ...
## $ CE
                : num 0 0 0 0 0 ...
## $ SE
                      -1.093 -0.226 -2.291 -0.327 -0.186 ...
                : num
NE_data<-NE_data[, -1]</pre>
NE_data<-NE_data %>%
 mutate(across(c("Composition", "Block", "Days"),
               as.factor)) #transform Composition, Block, Days as factor
```

## Do we have outliers in the data?

```
NE data %>%
  group_by(Days) %>%
  identify_outliers(NE)
## # A tibble: 1 x 9
                                                   SE is.outlier is.extreme
   Days Block Composition
                                     NE
                                            CE
                              RYT
     <fct> <fct> <fct>
                         <dbl> <dbl> <dbl> <dbl> <dbl> <lgl>
                                                                 <1g1>
## 1 0
                             1.04 2.70 3.23 -0.533 TRUE
                                                                FALSE
                 LmSpWc
NE data %>%
  group_by(Days) %>%
  identify_outliers(CE)
```

```
## [1] Days
                  Block
                              Composition RYT
                                                      NE
                                                                   CE
## [7] SE
                  is.outlier is.extreme
## <0 rows> (or 0-length row.names)
NE_data %>%
  group_by(Days) %>%
 identify_outliers(SE)
## # A tibble: 5 x 9
## Days Block Composition RYT
                                      NE
                                              CE
                                                       SE is.outlier is.extreme
    <fct> <fct> <fct>
                             <dbl>
                                   <dbl>
                                          <dbl>
                                                    <dbl> <lgl>
                                                                     <lgl>
## 1 0
          1
                LmLt
                             1
                                   -2.29
                                            0
                                                   -2.29 TRUE
                                                                     FALSE
## 2 20
                SpLt
                             1.15 247.
                                           64.3
                                                   183.
                                                         TRUE
                                                                    FALSE
## 3 40
                                                                    FALSE
          2
                WcLt
                             1.50 855.
                                          251.
                                                   604.
                                                          TRUE
## 4 40
          3
                WcLt
                              1.24 884.
                                          274.
                                                   611.
                                                          TRUE
                                                                    FALSE
## 5 60
                             2.29 898.
                                         2435. -1537.
                                                                    FALSE
                LmSpLt
                                                         TRUE
No extreme outliers
Test normality assumption
NE_data %>%
  group_by(Composition, Days) %>%
  shapiro_test(NE) %>%
  ungroup()
## # A tibble: 44 x 5
##
      Composition Days variable statistic
      <fct>
                 <fct> <chr>
                                     <dbl> <dbl>
                                     0.779 0.0653
## 1 LmLt
                        NE
##
   2 LmLt
                 20
                        NE
                                     0.975 0.699
## 3 LmLt
                       NE
                 40
                                    0.971 0.676
## 4 LmLt
                 60
                       NE
                                    0.938 0.518
                 0
## 5 LmSp
                       NE
                                    1.00 0.961
## 6 LmSp
                 20
                       NE
                                    0.967 0.650
## 7 LmSp
                       NE
                 40
                                    0.999 0.932
## 8 LmSp
                 60
                       NE
                                    0.890 0.353
## 9 LmSpLt
                       NE
                                    0.990 0.807
                 0
## 10 LmSpLt
                 20
                       NE
                                    0.912 0.424
## # i 34 more rows
NE data[NE data$CE!=0,] %>%
 group_by(Composition, Days) %>%
  shapiro_test(CE)
## # A tibble: 38 x 5
     Composition Days variable statistic
                 <fct> <chr>
##
      <fct>
                                             <dbl>
                                     <dbl>
                        CE
##
   1 LmLt
                 20
                                     0.886 0.344
## 2 LmLt
                 40
                        CE
                                    0.992 0.827
## 3 LmLt
                 60
                        CE
                                     0.860 0.268
                        CE
## 4 LmSp
                 20
                                     1.00 0.965
## 5 LmSp
                 40
                        CE
                                    0.999 0.957
## 6 LmSp
                 60
                        CE
                                    0.811 0.141
## 7 LmSpLt
                 0
                        CE
                                    0.873 0.304
```

0.961 0.620

CE

20

## 8 LmSpLt

```
CE
## 9 LmSpLt
                 40
                                   0.997 0.889
## 10 LmSpLt
                       CF.
                                   0.754 0.00857
                 60
## # i 28 more rows
NE data %>%
 group_by(Composition, Days) %>%
 shapiro_test(SE)
## # A tibble: 44 x 5
     Composition Days variable statistic
##
     <fct>
                <fct> <chr>
                                    <dbl> <dbl>
## 1 LmLt
                 0
                       SE
                                   0.779 0.0653
## 2 LmLt
                 20
                       SE
                                   0.923 0.461
## 3 LmLt
                                   1.00 0.973
                 40
                       SE
## 4 LmLt
                 60
                       SE
                                   0.791 0.0924
## 5 LmSp
                       SE
                                   1.00 0.961
                 0
## 6 LmSp
                 20
                       SE
                                   0.904 0.399
## 7 LmSp
                 40
                       SE
                                   0.781 0.0698
## 8 LmSp
                 60
                       SE
                                   0.950 0.571
## 9 LmSpLt
                       SE
                                   0.999 0.937
                 0
                                   0.896 0.372
## 10 LmSpLt
                 20
                       SE
## # i 34 more rows
#All response vars follow a normal distribution when considered by every level of the factor Days
Test
#Compute many repeated measures ANOVAs, one per different Composition for NE, CE and SE seperately
NE_Anova <- NE_data %>%
 group_by(Composition) %>%
 anova test(dv = NE, wid = Block, within = Days) %>%
 adjust pvalue(method="fdr") %>%
 add_significance("p.adj") %>%
 get_anova_table()
data.frame(NE_Anova)
##
     Composition Effect DFn DFd
                                            p p..05
                                    F
                                                       ges
                                                                p.adj
## 1
            LmLt
                          3
                              6 87.501 2.42e-05
                                                   * 0.977 0.000133100
                   Days
## 2
                             6 0.359 7.85e-01
                                                     0.120 0.785000000
            LmSp
                   Days
                          3
## 3
         LmSpLt
                   Days
                          3
                             6 38.394 2.61e-04
                                                   * 0.919 0.000797500
                                                     0.300 0.477400000
## 4
          LmSpWc
                   Days
                          3 6 1.056 4.34e-01
## 5
        LmSpWcLt
                   Days
                          3
                            6 8.597 1.40e-02
                                                   * 0.776 0.019250000
## 6
            LmWc
                          3 6 2.179 1.91e-01
                                                     0.494 0.233444444
                   Days
## 7
          LmWcLt
                          3 6 16.994 2.00e-03
                                                   * 0.856 0.004400000
                   Days
                          3 6 36.975 2.90e-04
## 8
                   Days
                                                   * 0.930 0.000797500
            SpLt
## 9
            SpWc
                   Days
                          3 6 9.208 1.20e-02
                                                  * 0.798 0.018857143
## 10
          SpWcLt
                   Days
                          3 6 13.346 5.00e-03
                                                 * 0.839 0.009166667
## 11
            WcLt
                   Days
                          3 6 95.060 1.90e-05
                                                 * 0.973 0.000133100
     p.adj.signif
##
## 1
              ***
## 2
## 3
              ***
## 4
               ns
## 5
               *
## 6
               ns
```

```
## 7
## 8
## 9
## 10
## 11
result<-anova_test(data=NE_data[NE_data$Composition=="LmLt", ], dv = NE, wid = Block, within = Days)
CE Anova <- NE data %>%
  group_by(Composition) %>%
  anova_test(dv = CE, wid = Block, within = Days) %>%
  adjust_pvalue(method="fdr") %>%
  add_significance("p.adj") %>%
  get_anova_table()
data.frame(CE_Anova)
                                                  p p..05
##
      Composition Effect DFn DFd
                                                             ges
                                                                       p.adj
                                6 172.461 3.28e-06
## 1
             LmLt
                    Days
                            3
                                                        * 0.978 0.000036080
## 2
             LmSp
                    Days
                            3
                                6
                                    0.966 4.68e-01
                                                           0.245 0.468000000
## 3
           LmSpLt
                            3
                                6
                                  15.609 3.00e-03
                                                        * 0.850 0.006600000
                    Days
## 4
           LmSpWc
                    Days
                            3
                                    1.430 3.24e-01
                                                           0.397 0.356400000
                                6 22.448 1.00e-03
                                                        * 0.871 0.002750000
## 5
         LmSpWcLt
                    Days
                            3
## 6
             LmWc
                    Days
                            3
                                6
                                   2.220 1.87e-01
                                                           0.500 0.228555556
## 7
           {\tt LmWcLt}
                    Days
                            3
                                6 6.028 3.00e-02
                                                        * 0.665 0.041250000
## 8
                                6 62.179 6.54e-05
                                                        * 0.962 0.000359700
             SpLt
                    Days
                            3
                                6 12.104 6.00e-03
## 9
             SpWc
                    Days
                            3
                                                        * 0.832 0.011000000
## 10
           SpWcLt
                    Days
                            3
                                    9.463 1.10e-02
                                                        * 0.811 0.017285714
                                6 31.134 4.70e-04
                                                        * 0.893 0.001723333
## 11
             WcLt
                    Days
                            3
##
      p.adj.signif
## 1
              ***
## 2
                ns
## 3
                **
## 4
                ns
## 5
## 6
                ns
## 7
## 8
## 9
## 10
## 11
SE_Anova <- NE_data %>%
  group_by(Composition) %>%
  anova_test(dv = SE, wid = Block, within = Days) %>%
  adjust_pvalue(method="fdr") %>%
  add_significance("p.adj") %>%
  get_anova_table()
data.frame(SE_Anova)
      Composition Effect DFn DFd
##
                                         F
                                                  p p..05
                                                             ges
                                                                       p.adj
             {\tt LmLt}
## 1
                    Days
                            3
                                6
                                   31.466 4.56e-04
                                                        * 0.892 0.002508000
## 2
             LmSp
                    Days
                            3
                                6
                                    6.452 2.60e-02
                                                        * 0.742 0.057200000
## 3
           LmSpLt
                    Days
                            3
                                6
                                    9.996 9.00e-03
                                                        * 0.799 0.024750000
## 4
           LmSpWc
                    Days
                            3
                                6
                                    0.229 8.73e-01
                                                          0.074 0.873000000
```

0.284 0.632500000

0.986 4.60e-01

## 5

LmSpWcLt

3

Days

6

```
## 6
            LmWc
                   Days
                         3 6 0.252 8.57e-01
                                                      0.098 0.873000000
## 7
          LmWcLt
                  Days
                         3 6 1.897 2.31e-01
                                                      0.400 0.363000000
            SpLt
                   Days
## 8
                         3 6 21.095 1.00e-03
                                                    * 0.894 0.003666667
                                                      0.162 0.873000000
## 9
            SpWc
                   Days
                         3 6 0.435 7.36e-01
## 10
          SpWcLt
                   Days
                         3 6 3.158 1.07e-01
                                                      0.547 0.196166667
## 11
                   Days
                         3 6 145.264 5.45e-06
                                                   * 0.986 0.000059950
            WcLt
##
     p.adj.signif
## 1
## 2
               ns
## 3
                *
## 4
               ns
## 5
## 6
               ns
## 7
## 8
               **
## 9
               ns
## 10
               ns
## 11
```

Plot the relative contribution of species to the average biomass on day 60 of the experiment

```
Biom_data<-read.csv(here("data", "Relativebiomass_data.csv"), sep=";")</pre>
#info on data
#individual mass : in mq
\#mean LA = mean leaf area : in mq
#mean SLA = mean specific leaf area : in mm2/mg
#initial relbiomass : in mg
#final relbiomass: in mg
#Mean biomass per species data
Plot_species <- Biom_data [Biom_data $Days == 60,] %>%
  group_by(Mixture, Species) %>%
  mutate(mean_fin_relbiomass=mean(Final_relbiomass)) %>%
  mutate(standard_error=sd(Final_relbiomass)/sqrt(n())) %% #calculates standard error in biomass of e
  dplyr::select(., 3:5, 11, 12) %>%
  ungroup() %>%
  unique()
Plot_species$Mixture<-fct_relevel(Plot_species$Mixture, c("Lm", "Sp", "Wc", "Lt", "LmSp", "LmWc", "LmLt
#Total biomass & standard error data
Errorbar_data_totalbiom<-Biom_data[Biom_data$Days==60,] %>%
  group_by(Block, Mixture) %>%
  mutate(tot_biomass_per_blockmix=sum(Final_relbiomass)) %>%
  ungroup() %>%
  dplyr::select(., 2, 3, 11) %>%
  unique() %>%
  group_by(Mixture) %>%
  mutate(mean_tot_biomass=mean(tot_biomass_per_blockmix)) %>%
  mutate(sd_tot_biomass=sd(tot_biomass_per_blockmix)/sqrt(n())) %>%
  dplyr::select(., 2, 4, 5) %>%
  unique() %>%
  ungroup
```

```
#Significance in net effect data
Plotdat_fin<-merge(Plot_species, Errorbar_data_totalbiom, by="Mixture") %>%
    unique()
Plotdat fin$mean errorbar sum<-Plotdat fin$mean tot biomass+Plotdat fin$sd tot biomass
p<-ggplot(data=Plotdat_fin, aes(fill=Species, y=mean_fin_relbiomass, x=Mixture)) +
        geom_bar(position="stack", stat="identity", colour="black") +
        scale_fill_manual(values=alpha(c("#2D3184", "#32AAB5", "#B3E7C5", "#F3F1E4"), 0.7)) +
        theme classic() +
        theme(text=element_text(size=15), axis.text.x = element_text(size = 13, angle = 60, hjust=1), panel
        labs(x="Mixture", y="Average biomass (mg)", pch=8) +
        scale_y_continuous(limits=c(0, 3600), breaks=seq(0, 3600, by=400)) +
        geom_errorbar(aes(x=Mixture, ymin=mean_tot_biomass-sd_tot_biomass, ymax=mean_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_biomass+sd_tot_
## 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: 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.
    # Add stars based on significance levels; LmLt, SpWc, SpLt, WcLt, LmSpLt, SpWcLt, LmWcLt, LmSpWcLt
    #annotate(
        #"text",
        \#x = c(7, 8, 9, 10, 12, 13, 14, 15), \#x-coordinates where stars should be placed
        #y = c(3105.0551, 2668.9939, 2656.2304, 3251.6792, 2981.5882, 2668.1739, 3191.0420, 2887.1803),
        #label = c("***", "*", "***", "***", "***", "**", "**"), # significance labels
        #size = 6, # adjust the size of the stars
        #color = "black" # color of the stars
    #)
р
```

