# Single Year Models

### Advyth Ramachandran

2024-05-19

```
library(tidyverse)
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
## v dplyr
              1.1.2
                       v readr
                                    2.1.4
## v forcats 1.0.0
                                   1.5.0
                       v stringr
## v ggplot2 3.4.2
                     v tibble
                                    3.2.1
## v lubridate 1.9.2
                                    1.3.0
                        v tidyr
## v purrr
              1.0.2
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
## i Use the conflicted package (<a href="http://conflicted.r-lib.org/">http://conflicted.r-lib.org/</a>) to force all conflicts to become error
library(ggpubr)
library(cowplot)
## Attaching package: 'cowplot'
## The following object is masked from 'package:ggpubr':
##
       get_legend
##
## The following object is masked from 'package:lubridate':
##
##
       stamp
library(lme4)
## Loading required package: Matrix
## Attaching package: 'Matrix'
## The following objects are masked from 'package:tidyr':
##
##
       expand, pack, unpack
library(glmmTMB)
```

```
## Warning in checkDepPackageVersion(dep_pkg = "TMB"): Package version inconsistency detected.
## glmmTMB was built with TMB version 1.9.6
## Current TMB version is 1.9.10
## Please re-install glmmTMB from source or restore original 'TMB' package (see '?reinstalling' for mor
library(car)
## Loading required package: carData
##
## Attaching package: 'car'
## The following object is masked from 'package:dplyr':
##
##
       recode
##
## The following object is masked from 'package:purrr':
##
##
       some
library(emmeans)
library(stringr)
library(performance)
library(purrr)
library(gridExtra)
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
# options(scipen = 999)
analysis_df <- read.csv("analyses_manuscript/processed_data/analysis_variables.csv") %>%
  mutate(year = as.factor(year)) %>%
  mutate(log_shannon_native = log(shannon_native + 1)) %>%
 mutate(shannon_native_backtransform = exp(log_shannon_native)-1)
analysis_2022_df <- analysis_df %>%
 filter(year == "2022")
analysis_2023_df <- analysis_df %>%
  filter(year == "2023")
```

### Function to test models

First, a function to test the model and return the test itself.

```
test_single_year_model <- function(fitted_model) {</pre>
  model_results <- list()</pre>
  chisqAnova <- car::Anova(fitted_model)</pre>
  print(chisqAnova)
  model_results[["chisquare_test"]] <- chisqAnova</pre>
  # Extract p-value for the treatment*year interaction term
  pval <- chisqAnova$'Pr(>Chisq)'[1]
  pval.r <- ifelse(</pre>
    pval < 0.001,
    "< 0.001",
    round(pval, digits = 3)
  # Assess significance of p-value
  significance <- ifelse(pval < 0.05,
                         "*".
                         "N.S.")
  pval_signif <- paste(pval.r, significance, sep = " ")</pre>
  print(pval_signif)
  model_results[["significance"]] <- pval_signif</pre>
  return(model_results)
}
```

Now, a function to save the results to the global environment (every time this function is called, it will also save the results to a list in the global environment).

```
# Initialize a list to store all model results
single_year_results_list <- list()

save_model_results <- function(fitted_model, year) {

model_results <- test_single_year_model(fitted_model = fitted_model)

# Every time this function is called, it will add the results to the list of
# results in the global environment

model_name <- deparse(substitute(fitted_model))
model_name_with_year <- paste(model_name, year, sep = "_")
single_year_results_list[[model_name_with_year]] <<- model_results
}</pre>
```

### Function to plot models

```
plot_single_year_model <- function(fitted_model, year, response_variable, response_name, dataset) {
    # Test the model</pre>
```

```
model_results <- test_single_year_model(fitted_model = fitted_model)</pre>
significance <- model_results[['significance']]</pre>
# Calculate position for text label
# rv_vec <- analysis_df[[response_variable]]</pre>
# label_position_x <- 'unraked'</pre>
\# label_position_y \leftarrow max(rv_vec) + (max(rv_vec) * 0.05)
# Format label
significance_label <- paste("p-value:", significance, sep = " ")</pre>
# Plot title
# plot_title <- paste(year, sep = " ")</pre>
plot_title <- significance_label</pre>
# Make plot
model_plot <- dataset %>%
  ggplot(aes_string(
    x = "treatment",
    y = response_variable,
   fill = "treatment",
    color = "treatment",
    group = "treatment"
  )) +
  geom_jitter(
               alpha = 0.3,
               shape = 16,
               width = 0.3,
              height = 0,
               size = 3
               ) +
  geom_boxplot(color = "black", alpha = 0.4, outlier.shape = NA) +
  scale_fill_manual(values = c("antiquewhite4", "darkgoldenrod2")) +
  scale_color_manual(
    values = c("antiquewhite4", "darkgoldenrod2"),
    guide = guide_legend(override.aes = list(alpha = 1))
  ) +
labs(title = plot_title) +
theme_pubr() +
theme(legend.position = "none",
      plot.title = element_text(size = 12)) +
ylab(response_name)
\# geom\_text(aes(x = label\_position\_x,
                y = label_position_y),
# label = significance_label,
# hjust = 1,
# vjust = 1,
# size = 3,
# color = "black")
return(model_plot)
```

## Individual year models

### Species richness

```
## boundary (singular) fit: see help('isSingular')
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: sprich
             Chisq Df Pr(>Chisq)
## treatment 3.9326 1 0.04736 *
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "0.047 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: sprich
##
             Chisq Df Pr(>Chisq)
## treatment 3.9326 1
                         0.04736 *
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "0.047 *"
## 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.
```

```
p_sprich_2023 <- fit_sprich(dataset = analysis_2023_df, year = "2023")</pre>
## boundary (singular) fit: see help('isSingular')
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: sprich
             Chisq Df Pr(>Chisq)
## treatment 13.83 1 0.0002002 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: sprich
             Chisq Df Pr(>Chisq)
## treatment 13.83 1 0.0002002 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "< 0.001 *"
Native species richness
fit_sprich_native <- function(dataset, year) {</pre>
  sprich native fm <- glmer(sprich native ~ treatment + (1 | block),
                     family = "poisson",
                     data = dataset)
  save_model_results(sprich_native_fm, year)
  p <- plot_single_year_model(</pre>
   fitted_model = sprich_native_fm,
    year = year,
    response_variable = "sprich_native",
    response_name = "Native species richness",
    dataset = dataset
  return(p)
}
p_sprich_native_2022 <- fit_sprich_native(dataset = analysis_2022_df, year = "2022")</pre>
## boundary (singular) fit: see help('isSingular')
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: sprich_native
              Chisq Df Pr(>Chisq)
##
```

```
## treatment 3.3589 1 0.06684 .
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## [1] "0.067 N.S."
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: sprich_native
##
              Chisq Df Pr(>Chisq)
## treatment 3.3589 1 0.06684 .
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "0.067 N.S."
p_sprich_native_2023 <- fit_sprich_native(dataset = analysis_2023_df, year = "2023")
## boundary (singular) fit: see help('isSingular')
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: sprich_native
              Chisq Df Pr(>Chisq)
## treatment 6.0138 1
                       0.01419 *
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "0.014 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: sprich_native
##
              Chisq Df Pr(>Chisq)
## treatment 6.0138 1 0.01419 *
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "0.014 *"
fit_shannon <- function(dataset, year) {</pre>
  shannon_fm <- lmer(shannon ~ treatment + (1|block),</pre>
                   data = dataset)
  save_model_results(shannon_fm, year)
  p <- plot_single_year_model(</pre>
   fitted_model = shannon_fm,
    year = year,
    response_variable = "shannon",
   response_name = "Shannon diversity",
    dataset = dataset
  )
 return(p)
}
```

```
p_shannon_2022 <- fit_shannon(dataset = analysis_2022_df, year = "2022")</pre>
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: shannon
              Chisq Df Pr(>Chisq)
##
## treatment 52.844 1 3.611e-13 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: shannon
              Chisq Df Pr(>Chisq)
##
## treatment 52.844 1 3.611e-13 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
p_shannon_2023 <- fit_shannon(dataset = analysis_2023_df, year = "2023")</pre>
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: shannon
              Chisq Df Pr(>Chisq)
## treatment 61.635 1 4.135e-15 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: shannon
              Chisq Df Pr(>Chisq)
## treatment 61.635 1 4.135e-15 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
Shannon Native
fit_shannon_native <- function(dataset, year) {</pre>
```

```
fitted_model = shnat_fm,
   year = year,
   response_variable = "shannon_native",
   response_name = "Native Shannon diversity",
   dataset = dataset
  )
 return(p)
p_shannon_native_2022 <- fit_shannon_native(dataset = analysis_2022_df, year = "2022")
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: log_shannon_native
              Chisq Df Pr(>Chisq)
## treatment 0.1228 1
                            0.726
## [1] "0.726 N.S."
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: log_shannon_native
              Chisq Df Pr(>Chisq)
## treatment 0.1228 1
                            0.726
## [1] "0.726 N.S."
p_shannon_native_2023 <- fit_shannon_native(dataset = analysis_2023_df, year = "2023")
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: log_shannon_native
              Chisq Df Pr(>Chisq)
## treatment 0.5301 1
                           0.4666
## [1] "0.467 N.S."
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: log_shannon_native
              Chisq Df Pr(>Chisq)
## treatment 0.5301 1
                           0.4666
## [1] "0.467 N.S."
Exotic forb
fit_exotic_forb <- function(dataset, year) {</pre>
 ef_fm <- glmmTMB(exotic_forb ~ treatment + (1|block),</pre>
                        ziformula=~1,
                        data = dataset,
                        family= beta_family()
                   )
```

```
save_model_results(ef_fm, year)
  p <- plot_single_year_model(</pre>
   fitted_model = ef_fm,
    year = year,
    response_variable = "exotic_forb",
   response_name = "Exotic forb abundance",
    dataset = dataset
  )
  return(p)
}
p_exotic_forb_2022 <- fit_exotic_forb(dataset = analysis_2022_df, year = "2022")</pre>
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: exotic_forb
              Chisq Df Pr(>Chisq)
## treatment 95.107 1 < 2.2e-16 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
## [1] "< 0.001 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: exotic_forb
              Chisq Df Pr(>Chisq)
## treatment 95.107 1 < 2.2e-16 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "< 0.001 *"
p_exotic_forb_2023 <- fit_exotic_forb(dataset = analysis_2023_df, year = "2023")</pre>
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: exotic_forb
              Chisq Df Pr(>Chisq)
## treatment 18.816 1 1.439e-05 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "< 0.001 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
## Response: exotic_forb
              Chisq Df Pr(>Chisq)
## treatment 18.816 1 1.439e-05 ***
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## [1] "< 0.001 *"
```

#### Native forb

```
fit_native_forb <- function(dataset, year) {</pre>
  nf_fm <- glmmTMB(native_forb ~ treatment + (1|block),</pre>
                        ziformula=~1,
                        data = dataset,
                        family= beta_family()
)
  save model results(nf fm, year)
  p <- plot_single_year_model(</pre>
   fitted_model = nf_fm,
   year = year,
   response_variable = "native_forb",
   response_name = "Native forb abundance",
    dataset = dataset
  return(p)
}
p_native_forb_2022 <- fit_native_forb(dataset = analysis_2022_df, year = "2022")
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: native_forb
##
              Chisq Df Pr(>Chisq)
## treatment 6.2402 1
                          0.01249 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## [1] "0.012 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: native_forb
              Chisq Df Pr(>Chisq)
##
## treatment 6.2402 1
                         0.01249 *
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## [1] "0.012 *"
p_native_forb_2023 <- fit_native_forb(dataset = analysis_2023_df, year = "2023")
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: native_forb
              Chisq Df Pr(>Chisq)
## treatment 6.5744 1
                          0.01035 *
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
```

```
## [1] "0.01 *"
## Analysis of Deviance Table (Type II Wald chisquare tests)
##
## Response: native_forb
## Chisq Df Pr(>Chisq)
## treatment 6.5744 1 0.01035 *
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## [1] "0.01 *"
```

### Format and export plots

```
arrange_plots <- function(title, plots_list, ymin, ymax) {
  plots_adjusted_list <- list()
    for (plot_name in names(plots_list)) {
     plot <- plots_list[[plot_name]]
     plot_adj <- plot + ylim(min = ymin, max = ymax)

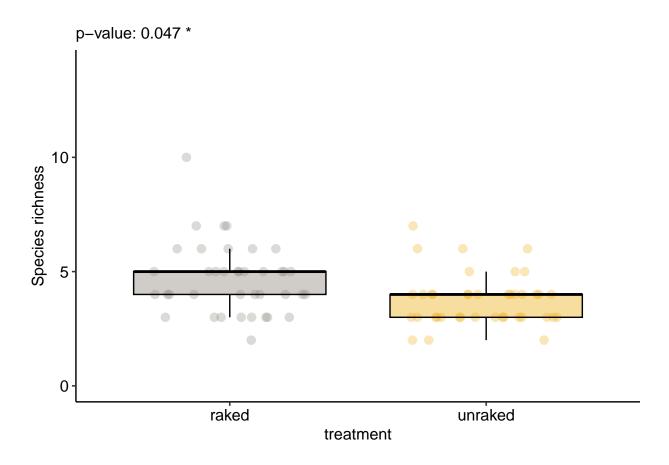
     plots_adjusted_list[[plot_name]] <- plot_adj
}
return(plots_adjusted_list)
}</pre>
```

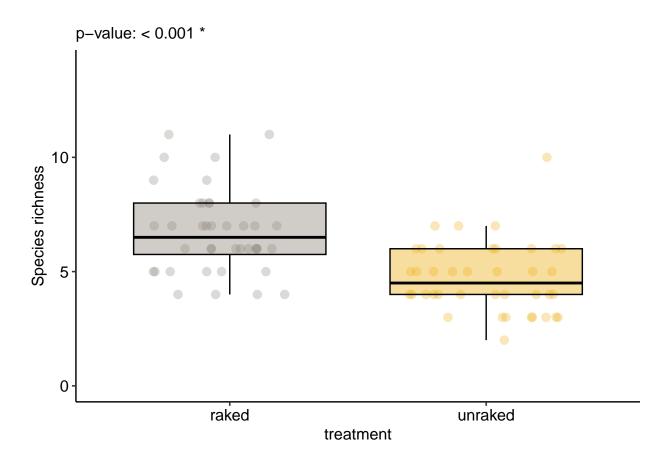
```
sprich_as_unit_plots <- list(
    p_sprich_2022 = p_sprich_2022,
    p_sprich_2023 = p_sprich_2023,
    p_sprich_native_2022 = p_sprich_native_2022,
    p_sprich_native_2023 = p_sprich_native_2023)

sprich_as_unit_plots_adj <- arrange_plots(
    title = "Species richness",
    plots_list = sprich_as_unit_plots, ymin = 0, ymax = 14)

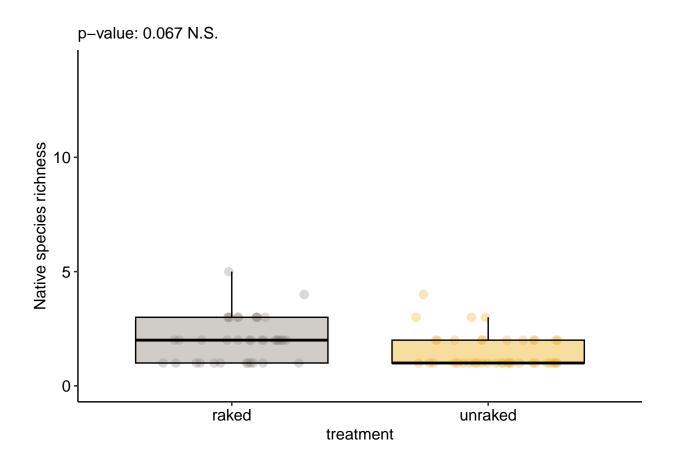
sprich_as_unit_plots_adj</pre>
```

## \$p\_sprich\_2022

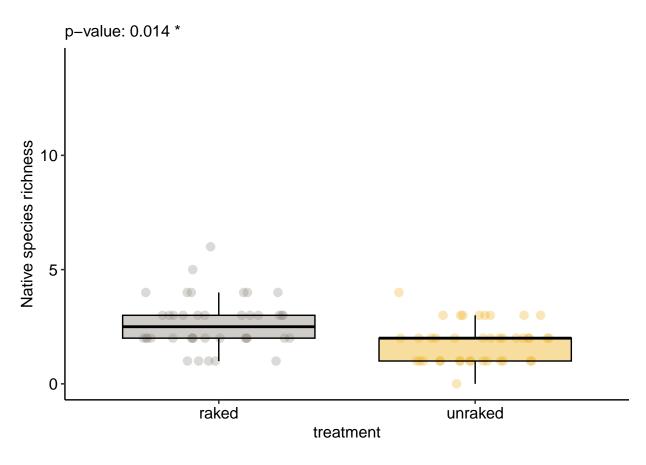




##
## \$p\_sprich\_native\_2022



##
## \$p\_sprich\_native\_2023

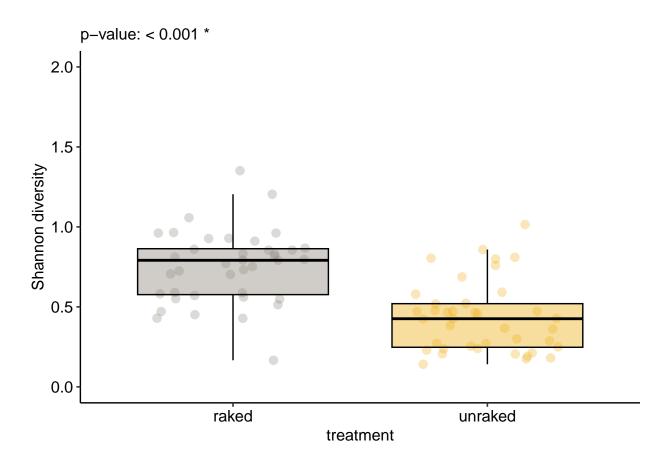


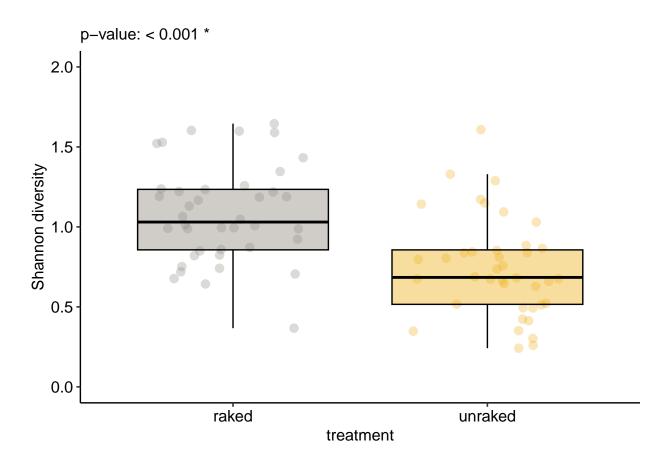
```
shannon_as_unit_plots <- list(
    p_shannon_2022 = p_shannon_2022,
    p_shannon_2023= p_shannon_2023,
    p_shannon_native_2022 = p_shannon_native_2022,
    p_shannon_native_2023 = p_shannon_native_2023)

shannon_as_unit_plots_adj <- arrange_plots(
    title = "Shannon diversity",
    plots_list = shannon_as_unit_plots, ymin = 0, ymax = 2)

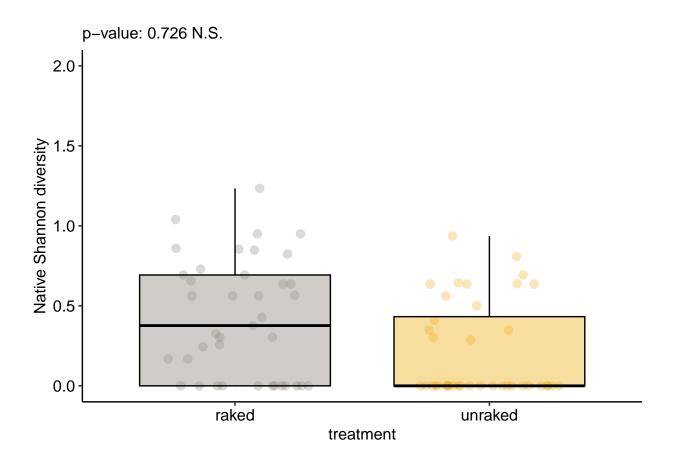
shannon_as_unit_plots_adj</pre>
```

## \$p\_shannon\_2022

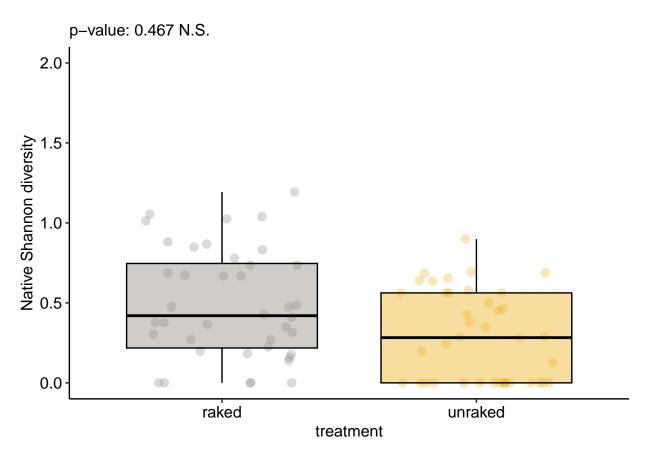




##
## \$p\_shannon\_native\_2022



##
## \$p\_shannon\_native\_2023

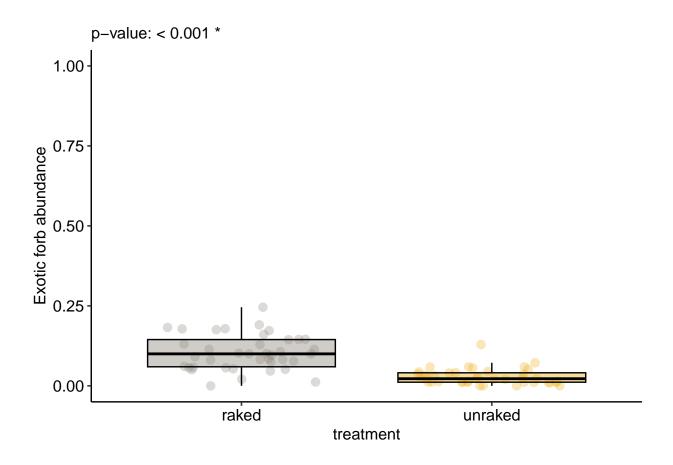


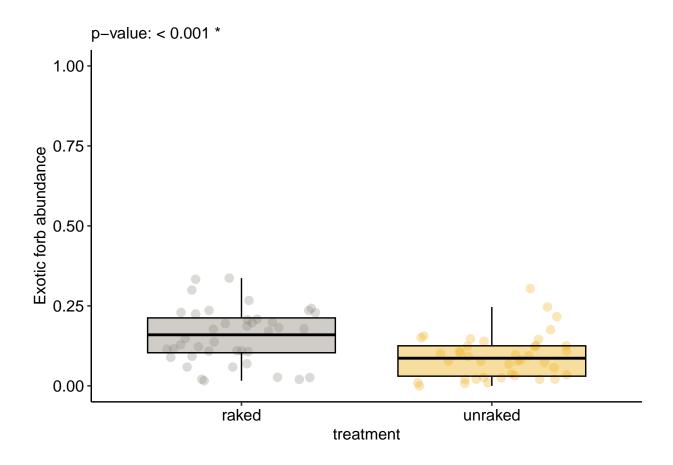
```
abundance_as_unit_plots <- list(
    p_exotic_forb_2022 = p_exotic_forb_2022,
    p_exotic_forb_2023 = p_exotic_forb_2023,
    p_native_forb_2022 = p_native_forb_2022,
    p_native_forb_2023 = p_native_forb_2023)

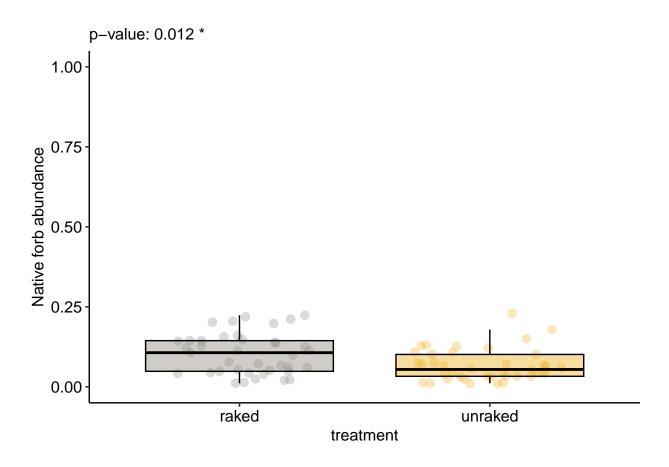
abundance_as_unit_plots_adj <- arrange_plots(
    title = "Abundance",
    plots_list = abundance_as_unit_plots, ymin = 0, ymax = 1)

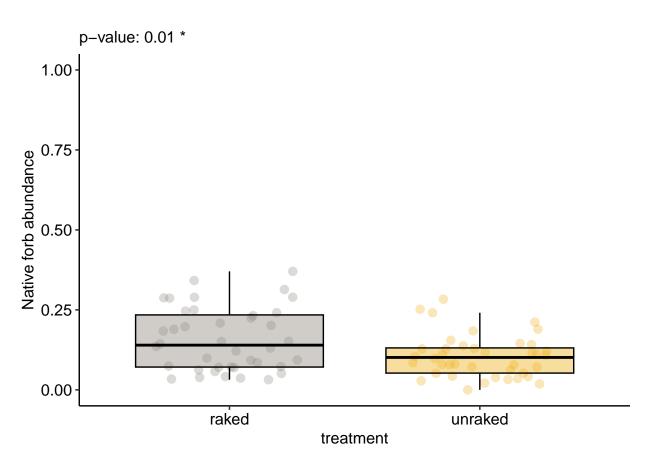
abundance_as_unit_plots_adj</pre>
```

## \$p\_exotic\_forb\_2022

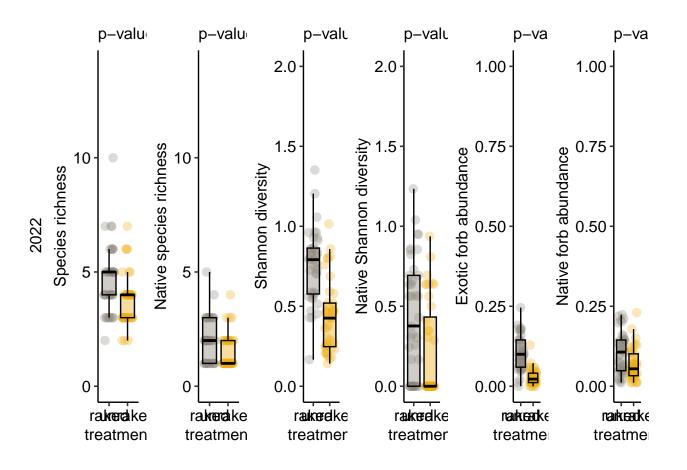




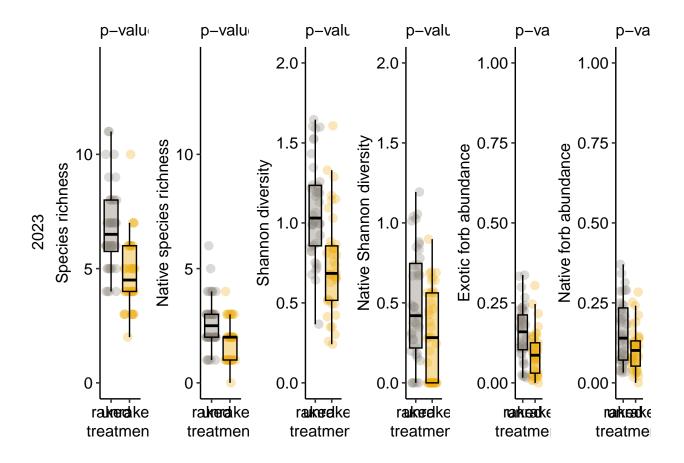




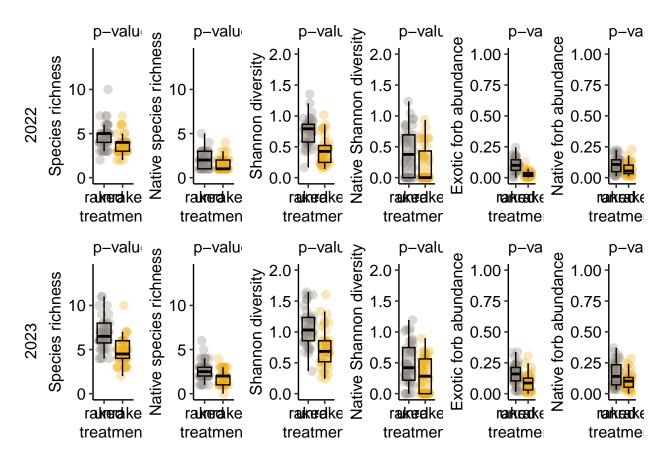
```
plots_by_unit_list <- list(sprich_as_unit_plots_adj,</pre>
shannon_as_unit_plots_adj,
abundance_as_unit_plots_adj)
all_plots_list <- purrr::flatten(plots_by_unit_list)</pre>
names(all_plots_list)
    [1] "p_sprich_2022"
                                                          "p_sprich_native_2022"
                                 "p_sprich_2023"
    [4] "p_sprich_native_2023"
                                 "p_shannon_2022"
                                                          "p_shannon_2023"
##
    [7] "p_shannon_native_2022" "p_shannon_native_2023"
                                                          "p_exotic_forb_2022"
## [10] "p_exotic_forb_2023"
                                 "p_native_forb_2022"
                                                          "p_native_forb_2023"
order_plots_for_2022 <- c(
  "p_sprich_2022", "p_sprich_native_2022", "p_shannon_2022", "p_shannon_native_2022", "p_exotic_forb_20
order_plots_for_2023 <- c(
  "p_sprich_2023", "p_sprich_native_2023", "p_shannon_2023", "p_shannon_native_2023", "p_exotic_forb_20
plots_for_2022 <- all_plots_list[order_plots_for_2022]</pre>
plots_for_2023 <- all_plots_list[order_plots_for_2023]</pre>
```



plots\_combined\_2023 <- grid.arrange(grobs = plots\_for\_2023, ncol = 6, nrow = 1, left = "2023")</pre>



arranged\_single\_year\_model\_plots <- grid.arrange(plots\_combined\_2022, plots\_combined\_2023)</pre>



arranged\_single\_year\_model\_plots

Save the results as a table.

```
# Save table of significance.

all_results_df <- data.frame(
  model = character(),
  predictor = character(),
  Chisq = numeric(),
  Df = numeric(),
  p_value = numeric()
)</pre>
```

```
for (model_name in names(single_year_results_list)) {
  anova table <- single year results list[[model name]][['chisquare test']]</pre>
  anova_table_formatted <- anova_table %>%
   rownames_to_column("predictor") %>%
   rename("p_value" = `Pr(>Chisq)`) %>%
   mutate(model = model name) %>%
   mutate(p value f = case when(
      p_value < 0.001 ~ "< 0.001",</pre>
      p_value > 0.001 ~ paste(
        signif(p_value, digits = 2))
   )) %>%
   mutate(significance = case_when(
      p_value < 0.05 ~ "*",</pre>
      p_value > 0.05 ~ "N.S."
   ))
  all_results_df <- bind_rows(all_results_df, anova_table_formatted)</pre>
}
all results df
                                                          p_value p_value_f
##
                      model predictor
                                            Chisq Df
## 1
             sprich_fm_2022 treatment 3.9325957 1 4.735879e-02
                                                                      0.047
## 2
                                                                    < 0.001
             sprich_fm_2023 treatment 13.8296244 1 2.001554e-04
## 3
      sprich native fm 2022 treatment 3.3589343 1 6.684131e-02
                                                                      0.067
      sprich_native_fm_2023 treatment 6.0137589 1 1.419476e-02
                                                                      0.014
## 4
## 5
            shannon fm 2022 treatment 52.8441063 1 3.611006e-13
                                                                    < 0.001
## 6
            shannon_fm_2023 treatment 61.6346404 1 4.134800e-15
                                                                    < 0.001
## 7
              shnat fm 2022 treatment 0.1228404 1 7.259741e-01
                                                                       0.73
              shnat_fm_2023 treatment 0.5300717 1 4.665767e-01
## 8
                                                                       0.47
## 9
                 ef fm 2022 treatment 95.1067629 1 1.803894e-22
                                                                    < 0.001
## 10
                 ef_fm_2023 treatment 18.8160958 1 1.439472e-05
                                                                    < 0.001
## 11
                 nf_fm_2022 treatment 6.2402313 1 1.248802e-02
                                                                      0.012
## 12
                 nf_fm_2023 treatment 6.5744425 1 1.034534e-02
                                                                       0.01
##
      significance
## 1
## 2
## 3
              N.S.
## 4
## 5
## 6
## 7
              N.S.
## 8
              N.S.
## 9
## 10
## 11
## 12
```

```
write.csv(
  all_results_df,
  file = "analyses_manuscript/stats_results/single_year_model_results.csv",
  row.names = FALSE
)
```