## Statistical Analysis Report

BiomCare ApS

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| Customer | SEGES |
| :--- | :--- |
| Customer ID | DA00201-19 |
| Project | Differences between bacetria and fungi in plowed and unplowed clay and sand samples |
| Sample type | Soil |
| Number of samples | 24 samples |
| Type of data | Sequencing of fungi (ITS2) |

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## Introduction to the biostatistical analysis

## Objective

The project objective was to identify differences in the fungal microbiome between plowed and unplowed soil samples. To meet this goal, 24 samples were collected: 12 from clay-type soil and 12 from sand-type soil. For each soil type, 6 plowed and 6 unplowed samples were collected.

## Analysis

In this report, biostatistical analyses are performed and the results presented, building on the data generated and evaluated in the 2 prior reports (Report 1: Quality filtering and data processing, Report 2: Microbiome profiling). Through the biostatistical analysis we compare the microbiome profiles between plowed and unplowed samples for each soil type (sand and clay). We refer to the status of plowed/unplowed, as the testing condition. The different statistical analysis approaches were selected to respect the study design with small sample numbers and highly diverse communities with interventions expected to have notable effect on the microbiome.

A number of analyses were performed, as shortly introduced here:

1. The report initiates with a visual evaluation of the fungal community composition and a statistical analysis to evaluate if differences are statistically significant (using Permutational Multivariate Analysis of Variance (ADONIS)).
2. This is followed by an analysis of variance, in which we evaluate if the homogeneity of the fungal communities within the subgroups differ. If the testing condition disrupts the fungal community in a non-specific manner and thereby makes samples more or less alike, this will be reflected by a difference in the distance between the samples within each subgroup.
3. Alpha-diversity is a measure of the within-sample diversity and we evaluate whether the alpha-diversity differ between testing conditions using four different measures of alpha-diversity.
4. Finally, we compare the abundance of single taxa between the testing conditions. This allows us to identify indicator organisms that may be of interest for further testing. We compare the abundance of organisms classified at 5 taxonomic levels; phylum, class, order, family and genus.

## Differences in community composition (beta-diversity)

## Visualization by ordination

As descripted in Report 2, beta-diversity is a measure of how similar or dissimilar the fungal community is between each pair of samples. The measures are useful for statistical analysis and visualization of the overall fungal microbiome community.
Here we evaluate the microbiome communities using the Bray-Curtis and Jaccard beta-diversity measures, where each sample is a point and the distance between the points increases with increasing dissimilarity in the microbiome community. In the two plots of Figure 1, all 24 samples are included and colored by soil type and by soil status. We see a clear separation of the clay and sand samples, highlighting that the fungal composition between the two soil types are highly distinct. Comparing the plowed and unplowed samples shows a strong seperation along the second axis (NMDS2) for clay samples, however no clear seperation for the sand samples.
In Report 2, we evaluated the summary statistics of the beta-diversity measures and saw that the microbiome profiles in the soil samples at the level of sequences are highly diverse with close to maximum possible distance between all samples (mean close to 1 ). Therefore, we initiate the evaluation of microbiome communities at the higher taxonomic level of genera, where the mean beta diversity decreases, indicating a possible structure in the dataset.


Figure 1: Visualization of the fungal community in the $\mathbf{2 4}$ soil samples. Ordination plots using A) Bray distance and B) Jaccard disance and relative abundance. The plots were made using Non-metric Multi-dimensional Scaling (NMDS) and beta-diversity at the genera level. Samples are coloured by soil type (clay or sand) and by status (plowed or unplowed).

## Permutational Multivariate Analysis of Variance

To evaluate if the observed differences between the microbiome composition of plowed and unplowed samples is statistically significant, we perform an analysis named Permutational Multivariate Analysis of Variance (ADONIS). ADONIS partitions sums of squares of a multivariate data set, and is analogous to MANOVA (multivariate analysis of variance) using beta-diversity measures. It partitions distance matrices among sources of variation and fits linear models to the distance matrices using a permutation test with pseudo-F ratios and can therefore be considered as a "permutational manova".

For the analysis we use Bray-Curtis and Jaccard beta-diversity measures and perform the analysis for relative abundances, at the five taxonomic levels genus to phylum.

## Adonis for relative abundance data

Comparison of plowed and unplowed clay samples showed a significant difference using both Bray-Curtis (variance explained R2=0.16, p-value $=0.033$ ) and Jaccard (variance explained $\mathrm{R} 2=0.13$, p -value $=0.024$ ) at genera level. For sand, the comparisons were not significant however showed a notable variation explained by the testing condition (Bray-Curtis R2 $=0.12$, p-value $=0.204$; Jaccard R2 $=0.12$, p-value $=0.147$ ). These results support the observations from the NMDS plot (Figure 1), but also indicate that there are trending differences in sand that may be evident at other dimensions than the first two axis highlighted in Figure 1. The differences obsrved are noteworthy considering the small number of samples and highly diverse communities that are in all soil samples. The patterns were also evident at the higher taxonomic level of family (see details in summary statistics below).

|  |  | Bray |  | Jaccard |  |
| :--- | :--- | :--- | :--- | :--- | :--- |
| Taxa level | Soil type | R2 | p | R 2 | p |
| Phylum | Clay | 0.0694 | 0.489 | 0.067 | 0.623 |
|  | Sand | 0.0858 | 0.52 | 0.0889 | 0.5 |
| Class | Clay | 0.1471 | 0.087 | 0.1199 | 0.126 |
|  | Sand | 0.133 | 0.256 | 0.1281 | 0.258 |
| Order | Clay | 0.1404 | 0.089 | 0.1151 | 0.154 |
|  | Sand | 0.0999 | 0.468 | 0.1024 | 0.429 |
| Family | Clay | 0.1425 | 0.07 | 0.1226 | 0.056 |
|  | Sand | 0.0912 | 0.572 | 0.0974 | 0.486 |
| Genus | Clay | 0.1551 | 0.033 | 0.1338 | 0.024 |
|  | Sand | 0.1225 | 0.204 | 0.1213 | 0.147 |

## Multivariate homogeneity of group dispersions (variances)

The multivariate analysis of variance found in this section, is used to evaluate if there is a difference in the homogeneity of the fungal communities between the plowed and unplowed samples. If plowing disrupts the fungal community in a non-specific manner (e.g. a random disturbance more than a specific directional shift), this will be reflected by a difference in the mean distance of the samples within each subgroup.

For each subgroup, we calculated the average distance of group members to the group centroid in the multivariate space of the fungal community. To test if the dispersions (variances) of the groups are different, the distances of group members to the group centroid are subject to an analysis of variance (ANOVA). The approach is a multivariate analogue of Levene's test for homogeneity of variances if the distances between group members and group centroids is the Euclidean distance. However, as Euclidean distance is not an appropriate measure for microbiome data, we use Bray-Curtis dissimilarities.

The analysis for sand and clay using the relative abundance data show no significant differences in variance between

```
groups ( }\textrm{p}\mathrm{ -value > 0.05).
```

- For clay samples, the analysis again supports a clear shift in the fungal communities between plowed and unplowed samples (see PCoA plots), however we see no support for a difference in variance from the boxplots (see boxplots of the distance to centroid).
- For sand samples, the analysis again do not supports a shift in the fungal communities between plowed and unplowed samples (see PCoA plots), but the boxplot indicate a trending increased dispersion of the unplowed samples (see boxplots of the distance to centroid).

The detailed results of the statistical analysis and illustrations of the results (PCoA and boxplots), can be seen below.

## Clay, with relative abundance

```
# Analysis of Variance Table
##
## Response: Distances
## Df Sum Sq Mean Sq F value Pr(>F)
## Groups 1 0.005728 0.0057275 1.3086 0.2793
## Residuals 10 0.043767 0.0043767
```



Figure 2: Visualization of the analysis of dispersion for clay samples. The left panel show a PCoA plot over plowed and unplowed clay samples based on relative abundance data, and the right panel show the distance to centroid for these categories.

## Sand, with relative abundance

```
## Analysis of Variance Table
##
## Response: Distances
## Df Sum Sq Mean Sq F value Pr(>F)
## Groups 1 0.0021092 0.0021092 0.6389 0.4447
## Residuals 9 0.0297137 0.0033015
```



Figure 3: Visualization of the analysis of dispersion for sand samples. The left panel show a PCoA plot over plowed and unplowed sand samples based on relative abundance data and the right panel show the distance to centroid for these categories.

## Differences in alpha-diversity

As described in Report 2, alpha diversity is a measure of the diversity within (or complexity) within one microbiome community. We used a Wilcoxon rank sum test to evaluate the direction and potential significance of a change, and visualized the data using two boxplots (one for clay and one for sand). The analysis was performed for three measures of alpha diversity: observed species, Chao1, Inverse Simpson and Shannon. See Report 2 for introduction to the different tupes of alpha diversity. The statistical analysis did not find a significant difference ( $p$-value $<0.05$ ) between plowed and unplowed clay or sand samples. Visual inspection indicated a consistent higher diversity in the unplowed samples, and the statistical analysis indicated that the difference was biggest for the sand samples. The lacking ability to detect a significant difference is probably due to the low power and high microbiome complexity of soil samples.

## Clay samples

```
## Clay - Observed taxa
```

```
## Warning in wilcox.test.default(x = c(126L, 176L, 189L, 143L, 176L, 267L), :
## cannot compute exact p-value with ties
```

```
##
## Wilcoxon rank sum test with continuity correction
##
## data: ps.sub.relab_clay$Observed by ps.sub.relab_clay$group4
## W = 16, p-value = 0.8099
## alternative hypothesis: true location shift is not equal to 0
```

```
## Clay - Chao1
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_clay$Chao1 by ps.sub.relab_clay$group4
## W = 15, p-value = 0.6991
## alternative hypothesis: true location shift is not equal to 0
```

```
## Clay - Shannon
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_clay$Shannon by ps.sub.relab_clay$group4
## W = 17, p-value = 0.9372
## alternative hypothesis: true location shift is not equal to 0
```

```
## Clay - Inverse Simpson
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_clay$InvSimpson by ps.sub.relab_clay$group4
## W = 19, p-value = 0.9372
## alternative hypothesis: true location shift is not equal to 0
```


## Sand samples

```
## Sand - Observed taxa
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_sand$Observed by ps.sub.relab_sand$group4
## W = 7, p-value = 0.1775
## alternative hypothesis: true location shift is not equal to 0
```

```
## Sand - Chao1
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_sand$Chao1 by ps.sub.relab_sand$group4
## W = 8, p-value = 0.2468
## alternative hypothesis: true location shift is not equal to 0
```

```
## Clay - Shannon
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_sand$Shannon by ps.sub.relab_sand$group4
## W = 8, p-value = 0.2468
## alternative hypothesis: true location shift is not equal to 0
```

```
## Sand - Inverse Simpson
```

```
##
## Wilcoxon rank sum test
##
## data: ps.sub.relab_sand$InvSimpson by ps.sub.relab_sand$group4
## W = 12, p-value = 0.6623
## alternative hypothesis: true location shift is not equal to 0
```



Figure 4: Alpha diversity metrics across clay and sand samples. Values of alpha-diversity for all combinations of plowed, unplowed, clay and sand samples are illustrated for observed species, Chao1, Shannon and Inverse Simpson.

## Differential abundance of single taxa

We now move from the evaluation of overall microbiome diversity and composition, to evaluate if there is a difference in the abundance of specific taxa between plowed and unplowed samples. This analysis provides the first insight into potential indicator organisms, and a first peek at the functional differences imposed by reducing plowing activities. We first evaluate the direction and potential significance of a change in each taxon specifically within each soil type (using Wilcoxon rank sum test) and then perform a joined analysis across soil types looking for taxa that associate with plowing independent of soil type (using linear regression with soil type as a confounder and square root transformed taxa abundance). Below are the results for the top associated genera to phyla, while supplementary documents provide tables of summary statistics for all tested taxa. The difference in location information should be understood as the
median of all possible differences between the abundances in one sample group compared to another (here plowed/unplowed) within one type (sand/clay). Note that if the abundance data consists mostly of zeroes, the approximation that R calculates for this data will be close to 0 .

Boxplots are used to visualize the top 6 associated taxa (selected as taxa with lowest p-value in the linear regression). The boxplots show a clear difference in the abundance of a number of single organisms despite the low number of samples analyzed in this pilot project. The Wilcoxon rank sum test is used in the analysis within soil type as it is robust despite the small number of samples, non-normal distribution and inflation of zero values. However, the model is less sensitive than a parametric model and therefore provides a conservative estimate of significance.

It is further worth noting that many top associated fungi correspond between soil and sand, despite the clear differences in the overall microbiome composition observed in the Figure 1. This indicates that it is possible to identify indicator species for tillage-associated soil conditions across soil types and geography.

## Relative abundance



Figure 5: Overview over single taxa relative abundance tests.

## Phylum Sand

## Table 1

Table of top indicator phyla

## Taxa

Mean abundance
Difference_in_location p_value
CI_1 Cl_2

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | ---: | :--- | :--- | :--- | :--- |
| ASV525 | p__Mucoromycota | 0.068 | 0.061 | $3.89 \mathrm{e}-03$ | -0.444 | -0.017 |
| ASV3 | p__Mortierellomycota | 18.344 | -1.871 | $8.23 \mathrm{e}-02$ | -5.885 | 5.044 |
| ASV216 | p__Zoopagomycota | 0.256 | 0.244 | $1.67 \mathrm{e}-01$ | -0.459 | 0.147 |
| ASV53 | p__Aphelidiomycota | 0.973 | 0.392 | $1.70 \mathrm{e}-01$ | -1.420 | 0.204 |
| ASV26 | p__Chytridiomycota | 7.794 | 2.596 | $4.29 \mathrm{e}-01$ | -8.022 | 3.426 |
| ASV433 | p__Blastocladiomycota | 0.083 | 0.000 | $4.86 \mathrm{e}-01$ | -0.490 | 0.000 |
| ASV1 | p__Ascomycota | 54.290 | -2.892 | $5.37 \mathrm{e}-01$ | -5.580 | 11.087 |
| ASV128 | p__Rozellomycota | 0.655 | -0.086 | $6.62 \mathrm{e}-01$ | -0.944 | 0.963 |
| ASV8 | p__Basidiomycota | 13.393 | 0.553 | $9.31 \mathrm{e}-01$ | -10.455 | 3.189 |
| ASV218 | p__Glomeromycota | 0.238 | -0.007 | $1.00 \mathrm{e}+00$ | -0.539 | 0.270 |

Phylum Clay
Table 2

Table of top indicator phyla

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| ASV53 | p__Aphelidiomycota | 0.773 | 1.462 | $2.63 \mathrm{e}-02$ | -2.599 | 0.000 |
| ASV218 | p__Glomeromycota | 3.817 | 2.447 | $9.31 \mathrm{e}-02$ | -6.180 | 0.440 |
| ASV2949 | p__Kickxellomycota | 0.014 | 0.005 | $1.82 \mathrm{e}-01$ | -0.043 | 0.000 |
| ASV849 | p__Olpidiomycota | 0.081 | -0.107 | $2.80 \mathrm{e}-01$ | -0.025 | 0.180 |
| ASV525 | p__Mucoromycota | 0.263 | 0.150 | $3.78 \mathrm{e}-01$ | -0.429 | 0.270 |
| ASV1 | p__Ascomycota | 49.429 | 2.495 | $4.85 \mathrm{e}-01$ | -13.249 | 19.435 |
| ASV128 | p__Rozellomycota | 0.089 | 0.000 | $5.99 \mathrm{e}-01$ | 0.000 | 0.231 |
| ASV216 | p__Zoopagomycota | 0.287 | 0.000 | $6.55 \mathrm{e}-01$ | -0.479 | 0.809 |
| ASV3 | p__Mortierellomycota | 12.749 | 2.355 | $9.37 \mathrm{e}-01$ | -7.545 | 6.654 |
| ASV8 | p__Basidiomycota | 14.392 | 0.462 | $9.37 \mathrm{e}-01$ | -5.601 | 5.455 |

Phylum Combined
Table 3

Table of top indicator phyla

|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | ---: | ---: | ---: | ---: | ---: |
| ASV53 | p_Aphelidiomycota | 0.869 | 0.669 | $2.98 \mathrm{e}-03$ | 0.198 |
| ASV218 | p__Glomeromycota | 2.106 | 0.404 | $6.61 \mathrm{e}-02$ | 0.208 |



Figure 6: The top phyla with deviating relative abundance between plowed and unplowed samples. The six organisms with the lowest $p$-values in the linear regression were selected, as the most interesting potential indicator organisms.

## Class Sand

Table 4

Table of top indicator classes

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| ASV1 | C__Sordariomycetes | 25.304 | -3.927 | $5.19 \mathrm{e}-02$ | -0.434 | 6.170 |
| ASV3 | c__Mortierellomycetes | 18.329 | -1.926 | $8.23 \mathrm{e}-02$ | -5.918 | 5.153 |
| ASV19 | c__Dothideomycetes | 6.338 | 1.752 | $8.23 \mathrm{e}-02$ | -11.262 | 2.417 |
| ASV53 | C__Aphelidiomycetes | 0.833 | 0.347 | $1.20 \mathrm{e}-01$ | -1.170 | 0.221 |
| ASV216 | c__Zoopagomycetes | 0.256 | 0.244 | $1.67 \mathrm{e}-01$ | -0.459 | 0.147 |
| ASV11 | c__Saccharomycetes | 5.398 | -1.888 | $1.77 \mathrm{e}-01$ | -3.145 | 4.001 |
| ASV26 | c__Lobulomycetes | 1.793 | 0.600 | $2.47 \mathrm{e}-01$ | -6.460 | 7.415 |
| ASV85 | c__Rhizophydiomycetes | 2.495 | 0.611 | $2.47 \mathrm{e}-01$ | -4.391 | 0.599 |
| ASV34 | c__Rhizophlyctidomycetes | 0.133 | 0.034 | $3.11 \mathrm{e}-01$ | -0.728 | 0.106 |
| ASV285 | c__Microbotryomycetes | 0.287 | -0.031 | $4.29 \mathrm{e}-01$ | -0.134 | 0.177 |

## Class Clay

Table 5

Table of top indicator classes

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| ASV13 | C__Eurotiomycetes | 5.545 | 3.940 | $4.11 \mathrm{e}-02$ | -14.573 | -0.184 |
| ASV12 | C__Pezizomycetes | 6.703 | 2.922 | $6.49 \mathrm{e}-02$ | -9.177 | 0.194 |
| ASV11 | c__Saccharomycetes | 0.288 | -0.265 | $6.51 \mathrm{e}-02$ | -0.019 | 0.487 |
| ASV580 | c__Cystobasidiomycetes | 0.169 | -0.079 | $8.98 \mathrm{e}-02$ | 0.000 | 1.393 |
| ASV218 | C__Glomeromycetes | 3.732 | 2.408 | $9.31 \mathrm{e}-02$ | -6.180 | 0.343 |
| ASV85 | C__Rhizophydiomycetes | 4.479 | 2.171 | $1.32 \mathrm{e}-01$ | -7.940 | 0.330 |
| ASV44 | c__Laboulbeniomycetes | 0.354 | -0.003 | $1.82 \mathrm{e}-01$ | 0.000 | 3.341 |
| ASV2949 | c__Kickxellomycetes | 0.014 | 0.005 | $1.82 \mathrm{e}-01$ | -0.043 | 0.000 |
| ASV285 | C__Microbotryomycetes | 0.273 | -0.053 | $2.80 \mathrm{e}-01$ | -0.075 | 2.243 |
| ASV849 | c__Olpidiomycetes | 0.081 | -0.107 | $2.80 \mathrm{e}-01$ | -0.025 | 0.180 |

## Class Combined

Table 6

Table of top indicator classes

|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | ---: | ---: | ---: | ---: | ---: |
| ASV85 | c__Rhizophydiomycetes | 3.530 | 0.520 | $3.56 \mathrm{e}-02$ | 0.231 |


|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | :---: | :---: | :---: | :---: | ---: |
| ASV1 | c__Sordariomycetes | 25.558 | -0.575 | $4.66 \mathrm{e}-02$ | 0.271 |
| ASV11 | c__Saccharomycetes | 2.732 | -0.315 | $5.10 \mathrm{e}-02$ | 0.152 |
| ASV218 | c__Glomeromycetes | 2.055 | 0.407 | $6.76 \mathrm{e}-02$ | 0.210 |
| ASV13 | C__Eurotiomycetes | 5.736 | 0.500 | $8.90 \mathrm{e}-02$ | 0.280 |
| ASV12 | c__Pezizomycetes | 5.061 | 0.371 | $9.51 \mathrm{e}-02$ | 0.212 |
| ASV44 | c__Laboulbeniomycetes | 0.189 | -0.232 | $1.77 \mathrm{e}-01$ | 0.166 |
| ASV580 | c__Cystobasidiomycetes | 0.095 | -0.151 | $1.93 \mathrm{e}-01$ | 0.112 |
| ASV285 | c__Microbotryomycetes | 0.279 | -0.171 | $2.13 \mathrm{e}-01$ | 0.133 |
| ASV849 | c__Olpidiomycetes | 0.042 | -0.075 | $2.29 \mathrm{e}-01$ | 0.060 |



## Order Sand

Table 7

Table of top indicator orders

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| ASV3 | o__Mortierellales | 18.329 | -1.926 | $8.23 \mathrm{e}-02$ | -5.918 | 5.153 |
| ASV19 | o__Pleosporales | 5.347 | 1.602 | $8.23 \mathrm{e}-02$ | -11.038 | 2.849 |
| ASV1200 | o__Sebacinales | 0.016 | -0.036 | $1.04 \mathrm{e}-01$ | 0.000 | 0.088 |
| ASV53 | o__GS16 | 0.833 | 0.347 | $1.20 \mathrm{e}-01$ | -1.170 | 0.221 |
| ASV10 | o__Sordariales | 7.126 | -2.283 | $1.26 \mathrm{e}-01$ | -0.375 | 4.665 |
| ASV33 | o__Onygenales | 0.554 | 0.222 | $1.26 \mathrm{e}-01$ | -1.914 | 0.118 |
| ASV77 | o__Tremellales | 1.006 | -0.264 | $1.26 \mathrm{e}-01$ | -0.047 | 0.948 |
| ASV247 | o__Myrmecridiales | 0.221 | -0.093 | $1.26 \mathrm{e}-01$ | -0.066 | 0.253 |
| ASV216 | o__Zoopagales | 0.256 | 0.244 | $1.67 \mathrm{e}-01$ | -0.459 | 0.147 |
| ASV11 | o__Saccharomycetales | 5.398 | -1.888 | $1.77 \mathrm{e}-01$ | -3.145 | 4.001 |

## Order Clay

Table 8

Table of top indicator orders

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| ASV78 | o__Magnaporthales | 0.200 | -0.128 | $2.78 \mathrm{e}-03$ | 0.053 | 0.863 |
| ASV39 | o__Agaricales | 4.245 | 3.358 | $1.52 \mathrm{e}-02$ | -6.375 | -0.754 |
| ASV12 | o__Pezizales | 6.703 | 2.922 | $6.49 \mathrm{e}-02$ | -9.177 | 0.194 |
| ASV11 | o__Saccharomycetales | 0.288 | -0.265 | $6.51 \mathrm{e}-02$ | -0.019 | 0.487 |
| ASV218 | o__Glomerales | 3.422 | 2.393 | $9.31 \mathrm{e}-02$ | -5.947 | 0.527 |
| ASV33 | o__Onygenales | 1.851 | 0.492 | $1.26 \mathrm{e}-01$ | -12.182 | 0.101 |
| ASV85 | o__Rhizophydiales | 4.479 | 2.171 | $1.32 \mathrm{e}-01$ | -7.940 | 0.330 |
| ASV44 | o__Pyxidiophorales | 0.354 | -0.003 | $1.82 \mathrm{e}-01$ | 0.000 | 3.341 |
| ASV2949 | o__Kickxellales | 0.014 | 0.005 | $1.82 \mathrm{e}-01$ | -0.043 | 0.000 |
| ASV77 | o__Tremellales | 0.156 | 0.123 | $2.00 \mathrm{e}-01$ | -1.019 | 0.005 |

## Order Combined

Table 9

Table of top indicator orders

|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: |
| ASV78 | o__Magnaporthales | 0.512 | -0.359 | $7.00 \mathrm{e}-03$ | 0.119 |
| ASV39 | o__Agaricales | 4.711 | 0.671 | $2.51 \mathrm{e}-02$ | 0.277 |
| ASV1200 | o__Sebacinales | 0.028 | -0.139 | $3.29 \mathrm{e}-02$ | 0.061 |
| ASV85 | o__Rhizophydiales | 3.530 | 0.520 | $3.56 \mathrm{e}-02$ | 0.231 |
| ASV10 | o__Sordariales | 9.691 | -0.518 | $4.48 \mathrm{e}-02$ | 0.242 |
| ASV33 | o__Onygenales | 1.231 | 0.663 | $4.76 \mathrm{e}-02$ | 0.314 |
| ASV11 | o__Saccharomycetales | 2.732 | -0.315 | $5.10 \mathrm{e}-02$ | 0.152 |
| ASV574 | o__Corticiales | 0.080 | 0.165 | $7.58 \mathrm{e}-02$ | 0.088 |
| ASV218 | o__Glomerales | 1.874 | 0.395 | $8.28 \mathrm{e}-02$ | 0.216 |
| ASV12 | o__Pezizales | 5.061 | 0.371 | $9.51 \mathrm{e}-02$ | 0.212 |

A
o__Magnaporthales

B o_Agaricales
C o__Sebacinales



D

E ${ }_{30-}^{0}$-_Sordariales
F o__Onygenales



Figure 8: The top orders with deviating relative abundance between plowed and unplowed samples. The six organisms with the lowest $p$-values in the linear regression were selected, as the most interesting potential indicator organisms.

## Family Sand

Table 10

Table of top indicator families

|  | Taxa | Mean <br> abundance | Difference_in_location | p_value | CI_1 | Cl_2 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| ASV61 | f__Cucurbitariaceae | 0.096 | -0.147 | $\begin{aligned} & 2.77 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.000 | 0.301 |
| ASV242 | f__Leptosphaeriaceae | 0.129 | -0.106 | $\begin{aligned} & 3.53 e- \\ & 02 \end{aligned}$ | 0.008 | 0.339 |
| ASV1916 | f__Pleurotaceae | 0.022 | -0.058 | $\begin{aligned} & 4.46 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.000 | 0.067 |
| ASV40 | f__Strophariaceae | 0.621 | 0.017 | $\begin{aligned} & 4.84 e- \\ & 02 \end{aligned}$ | -6.725 | 0.000 |
| ASV543 | f__Xylariales_fam_Incertae_sedis | 0.037 | 0.092 | $\begin{aligned} & 4.84 \mathrm{e}- \\ & 02 \end{aligned}$ | -0.213 | 0.000 |
| ASV1640 | f__Lentitheciaceae | 0.012 | 0.017 | $\begin{aligned} & 4.84 e- \\ & 02 \end{aligned}$ | -0.061 | 0.000 |
| ASV9 | f__Phaeosphaeriaceae | 2.800 | 1.262 | $\begin{aligned} & 5.19 \mathrm{e}- \\ & 02 \end{aligned}$ | -11.321 | 2.023 |
| ASV3 | f__Mortierellaceae | 18.329 | -1.926 | $\begin{aligned} & 8.23 e- \\ & 02 \end{aligned}$ | -5.918 | 5.153 |
| ASV1200 | f__Serendipitaceae | 0.016 | -0.036 | $\begin{aligned} & 1.04 e- \\ & 01 \end{aligned}$ | 0.000 | 0.088 |
| ASV247 | f__Myrmecridiaceae | 0.221 | -0.093 | $\begin{aligned} & 1.26 \mathrm{e}- \\ & 01 \end{aligned}$ | -0.066 | 0.253 |

## Family Clay

Table 11
Table of top indicator families

|  | Taxa | Mean <br> abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |  |
| :--- | :--- | ---: | :--- | :--- | :--- | :--- | :--- |
| ASV78 | f__Magnaporthaceae | 0.200 | -0.128 | $2.78 \mathrm{e}-$ <br> 03 | 0.053 | 0.863 |  |
| ASV61 | f__Cucurbitariaceae |  |  | -1.242 | $4.33 \mathrm{e}-$ | 0.469 | 1.870 |
| ASV863 | f__Entolomataceae |  | 0.232 | 0.092 | $1.01 \mathrm{e}-$ | -0.130 | -0.050 |


|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| ASV217 | f__Clavariaceae | 0.640 | 0.717 | $\begin{aligned} & 2.50 \mathrm{e}- \\ & 02 \end{aligned}$ | -2.346 | 0.000 |
| ASV62 | f__Hypocreales_fam_Incertae_sedis | 1.522 | -0.701 | $\begin{aligned} & 6.37 e- \\ & 02 \end{aligned}$ | -0.298 | 10.563 |
| ASV10 | f__Lasiosphaeriaceae | 7.611 | -4.534 | $\begin{aligned} & 6.49 \mathrm{e}- \\ & 02 \end{aligned}$ | -0.004 | 22.494 |
| ASV37 | f__Pyronemataceae | 2.569 | 1.088 | $\begin{aligned} & 6.49 \mathrm{e}- \\ & 02 \end{aligned}$ | -3.711 | 1.136 |
| ASV311 | f__Bulleribasidiaceae | 0.035 | 0.062 | $\begin{aligned} & 8.98 \mathrm{e}- \\ & 02 \end{aligned}$ | -0.098 | 0.000 |
| ASV218 | f__Glomeraceae | 2.468 | 1.517 | $\begin{aligned} & 9.31 \mathrm{e}- \\ & 02 \end{aligned}$ | -3.191 | 0.296 |
| ASV516 | f__Sordariaceae | 0.115 | 0.126 | $\begin{aligned} & 1.04 \mathrm{e}- \\ & 01 \end{aligned}$ | -0.425 | 0.000 |

## Family Combined

Table 12
Table of top indicator families

|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :---: | :---: | :---: | :---: | :---: | :---: |
| ASV61 | f__Cucurbitariaceae | 0.689 | -0.492 | $\begin{aligned} & 3.18 \mathrm{e}- \\ & 04 \end{aligned}$ | 0.113 |
| ASV78 | f__Magnaporthaceae | 0.512 | -0.359 | $\begin{aligned} & 7.00 \mathrm{e}- \\ & 03 \end{aligned}$ | 0.119 |
| ASV1916 | f__Pleurotaceae | 0.013 | -0.097 | $\begin{aligned} & 1.26 e- \\ & 02 \end{aligned}$ | 0.035 |
| ASV217 | f__Clavariaceae | 0.334 | 0.417 | $\begin{aligned} & 1.91 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.163 |
| ASV85 | f__Rhizophydiales_fam_Incertae_sedis | 1.574 | 0.602 | $\begin{aligned} & 2.42 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.247 |
| ASV10 | f__Lasiosphaeriaceae | 5.263 | -0.711 | $\begin{aligned} & 2.55 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.295 |
| ASV1200 | f__Serendipitaceae | 0.028 | -0.139 | $\begin{aligned} & 3.29 e- \\ & 02 \end{aligned}$ | 0.061 |
| ASV60 | f__Hypocreaceae | 0.753 | -0.283 | $\begin{aligned} & 3.83 e- \\ & 02 \end{aligned}$ | 0.127 |
| ASV12 | f__Ascobolaceae | 2.144 | 0.547 | $\begin{aligned} & 4.40 \mathrm{e}- \\ & 02 \end{aligned}$ | 0.255 |



Figure 9: The top families with deviating relative abundance between plowed and unplowed samples. The six organisms with the lowest $p$-values in the linear regression were selected, as the most interesting potential indicator organisms.

## Genus Sand

Table 13

Table of top indicator genera

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | ---: | :--- | :--- | :--- | :--- |
| ASV203 | g__Cladorrhinum | 0.176 | 0.313 | $5.49 \mathrm{e}-03$ | -0.800 | -0.082 |
| ASV154 | g__Acremonium | 0.145 | -0.266 | $7.55 \mathrm{e}-03$ | 0.074 | 0.444 |
| ASV11 | g__Nadsonia | 4.472 | -2.416 | $8.66 \mathrm{e}-03$ | 0.392 | 3.645 |
| ASV665 | g__Septoria | 0.045 | 0.061 | $1.50 \mathrm{e}-02$ | -0.245 | 0.000 |


|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | ---: | :--- | :--- | :--- | :--- |
| ASV644 | g__Plenodomus | 0.100 | -0.093 | $2.22 \mathrm{e}-02$ | 0.011 | 0.189 |
| ASV61 | g__Pyrenochaetopsis | 0.096 | -0.147 | $2.77 \mathrm{e}-02$ | 0.000 | 0.301 |
| ASV114 | g__Waitea | 0.329 | -0.146 | $4.46 \mathrm{e}-02$ | 0.000 | 1.850 |
| ASV543 | g__Fusidium | 0.037 | 0.092 | $4.84 \mathrm{e}-02$ | -0.213 | 0.000 |
| ASV9 | g__Parastagonospora | 1.641 | 0.800 | $5.19 \mathrm{e}-02$ | -11.261 | 1.288 |
| ASV3 | g__Mortierella | 18.329 | -1.926 | $8.23 \mathrm{e}-02$ | -5.918 | 5.153 |

## Genus Clay

Table 14

Table of top indicator genera

|  | Taxa | Mean abundance | Difference_in_location | p_value | Cl_1 | Cl_2 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| ASV103 | g__Apodus | 0.909 | -1.696 | $3.66 \mathrm{e}-03$ | 0.191 | 3.283 |
| ASV154 | g__Acremonium | 0.227 | -0.237 | $3.66 \mathrm{e}-03$ | 0.124 | 1.549 |
| ASV61 | g__Pyrenochaetopsis | 0.952 | -1.153 | $4.33 \mathrm{e}-03$ | 0.487 | 1.677 |
| ASV120 | g__Spizellomyces | 0.632 | -0.990 | $1.24 \mathrm{e}-02$ | 0.124 | 1.566 |
| ASV217 | g__Clavaria | 0.631 | 0.728 | $1.67 \mathrm{e}-02$ | -2.346 | 0.000 |
| ASV18 | g__Zopfiella | 0.199 | -0.277 | $2.84 \mathrm{e}-02$ | 0.000 | 0.719 |
| ASV124 | g__Gibberella | 0.266 | 0.142 | $2.84 \mathrm{e}-02$ | -1.053 | 0.000 |
| ASV557 | g__Gaeumannomyces | 0.184 | -0.093 | $2.84 \mathrm{e}-02$ | 0.000 | 0.863 |
| ASV58 | g__Chaetomium | 1.943 | 1.970 | $4.11 \mathrm{e}-02$ | -5.480 | -0.086 |
| ASV1936 | g__Entoloma | 0.024 | 0.053 | $7.40 \mathrm{e}-02$ | -0.092 | 0.000 |

## Genus Combined

Table 15

Table of top indicator genera

|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | :---: | :---: | :---: | :---: | :---: |
| ASV154 | g__Acremonium | 0.187 | -0.495 | $6.62 \mathrm{e}-06$ | 0.082 |
| ASV61 | g__Pyrenochaetopsis | 0.542 | -0.501 | $1.67 \mathrm{e}-04$ | 0.109 |
| ASV103 | g__Apodus | 0.647 | -0.640 | $2.04 \mathrm{e}-03$ | 0.181 |
| ASV203 | g__Cladorrhinum | 0.084 | 0.261 | $2.72 \mathrm{e}-03$ | 0.076 |
| ASV18 | g__Zopfiella | 1.269 | -0.412 | $5.13 \mathrm{e}-03$ | 0.131 |
| ASV11 | g__Nadsonia | 2.139 | -0.262 | $1.14 \mathrm{e}-02$ | 0.094 |


|  | Taxa | Mean abundance | Difference in location | p_value | SE |
| :--- | :--- | ---: | ---: | ---: | ---: | ---: |
| ASV557 | g__Gaeumannomyces | 0.125 | -0.308 | $1.57 \mathrm{e}-02$ | 0.117 |
| ASV217 | g__Clavaria | 0.329 | 0.439 | $1.58 \mathrm{e}-02$ | 0.166 |
| ASV644 | g__Plenodomus | 0.048 | -0.103 | $2.04 \mathrm{e}-02$ | 0.041 |
| ASV2060 | g__Udeniozyma | 0.015 | -0.107 | $2.25 \mathrm{e}-02$ | 0.043 |



Figure 10: The top genera with deviating relative abundance between plowed and unplowed samples. The six organisms with the lowest p-values in the linear regression were selected, as the most interesting potential indicator organisms.

## Version information

Table 16: Software and package versions.
version
version

| readx | 1.3.1 |
| :---: | :---: |
| backports | 1.1.5 |
| igraph | 1.2.4.2 |
| lazyeval | 0.2.2 |
| splines | 3.6.1 |
| usethis | 1.5.1 |
| digest | 0.6.23 |
| foreach | 1.4.7 |
| htmitools | 0.4.0 |
| memoise | 1.1.0 |
| cluster | 2.1.0 |
| remotes | 2.1.0 |
| openxlsx | 4.1.3 |
| recipes | 0.1.7 |
| Biostrings | 2.54.0 |
| modelr | 0.1.5 |
| gower | 0.2.1 |
| prettyunits | 1.0.2 |
| colorspace | 1.4-1 |
| rvest | 0.3.5 |
| rrcov | 1.4-9 |
| haven | 2.2.0 |
| xfun | 0.11 |
| callr | 3.3.2 |
| crayon | 1.3.4 |
| jsonlite | 1.6 |
| zeallot | 0.1.0 |
| survival | 2.44-1.1 |
| iterators | 1.0.12 |
| ape | 5.3 |

version

| glue | 1.3.1 |
| :---: | :---: |
| gtable | 0.3.0 |
| ipred | 0.9-9 |
| zlibbioc | 1.32 .0 |
| XVector | 0.26.0 |
| webshot | 0.5.2 |
| pkgbuild | 1.0.6 |
| Rhdf5lib | 1.8.0 |
| BiocGenerics | 0.32.0 |
| DEoptimR | 1.0-8 |
| abind | 1.4-5 |
| mvtnorm | 1.0-11 |
| DBI | 1.0.0 |
| Rcpp | 1.0.3 |
| viridisLite | 0.3.0 |
| foreign | 0.8-71 |
| stats4 | 3.6.1 |
| lava | 1.6.6 |
| prodlim | 2019.11.13 |
| httr | 1.4.1 |
| ellipsis | 0.3.0 |
| farver | 2.0.1 |
| pkgconfig | 2.0.3 |
| nnet | 7.3-12 |
| dbplyr | 1.4.2 |
| labeling | 0.3 |
| tidyselect | 0.2.5 |
| rlang | 0.4.2 |
| reshape2 | 1.4.3 |
| munsell | 0.5.0 |

version

| cellranger | 1.1.0 |
| :---: | :---: |
| tools | 3.6.1 |
| cli | 1.1.0 |
| generics | 0.0.2 |
| ade4 | 1.7-13 |
| devtools | 2.2.1 |
| broom | 0.5.2 |
| evaluate | 0.14 |
| biomformat | 1.14 .0 |
| yaml | 2.2.0 |
| ModelMetrics | 1.2.2 |
| processx | 3.4.1 |
| fs | 1.3.1 |
| zip | 2.0.4 |
| robustbase | 0.93-5 |
| nlme | 3.1-140 |
| xml2 | 1.2.2 |
| compiler | 3.6.1 |
| rstudioapi | 0.10 |
| curl | 4.3 |
| testthat | 2.3.1 |
| ggsignif | 0.6.0 |
| reprex | 0.3.0 |
| pcaPP | 1.9-73 |
| stringi | 1.4.3 |
| highr | 0.8 |
| ps | 1.3.0 |
| desc | 1.2.0 |
| nloptr | 1.2.1 |
| multtest | 2.42 .0 |

version

| vctrs | 0.2.0 |
| :---: | :---: |
| pillar | 1.4.2 |
| lifecycle | 0.1.0 |
| cowplot | 1.0.0 |
| R6 | 2.4.1 |
| rio | 0.5.16 |
| IRanges | 2.20.1 |
| sessioninfo | 1.1.1 |
| codetools | 0.2-16 |
| pkgload | 1.0.2 |
| boot | 1.3-22 |
| MASS | 7.3-51.4 |
| assertthat | 0.2.1 |
| rhdf5 | 2.30 .1 |
| rprojroot | 1.3-2 |
| withr | 2.1.2 |
| S4Vectors | 0.24 .1 |
| mgcv | 1.8-28 |
| parallel | 3.6.1 |
| hms | 0.5.2 |
| rpart | 4.1-15 |
| timeDate | 3043.102 |
| class | 7.3-15 |
| minqa | 1.2.4 |
| rmarkdown | 1.18 |
| Biobase | 2.46 .0 |
| lubridate | 1.7.4 |

