deseq2_analysis.R

arisely

Thu Oct 26 11:01:45 2017

```
## R script for publication: "Active migration associated with repeatable and specific changes
to gut microbiota in migratory shorebirds"
# Alice Risely, David Waite, Beata Ujvari, Bethany Hoye, & Marcel Klaassen
##R version 3.4.1
##workflows:
#https://f1000research.com/articles/5-1492/v1
#http://deneflab.github.io/MicrobeMiseq/demos/mothur_2_phyloseq.html
#DESeq2
#https://www.bioconductor.org/packages/devel/bioc/vignettes/phyloseq/inst/doc/phyloseq-mixture
-models.html
##good threads on data transformation
#https://github.com/joey711/phyloseq/issues/492
#https://github.com/joey711/phyloseg/issues/283
#To download phyloseq and DESeq2 from bioconductor run following two lines:
#source('http://bioconductor.org/biocLite.R')
#biocLite('phyloseq')
#biocLite("DESeq2")
#It might mess up some other packages, so packages may need reinstalling (either from CRAN or
Bioconductor) as errors come up when loading phyloseq and DESeq2 into library
#I had to reinstall ~10 packages
##setwd() somewhere and download all github files to this location
library(phyloseq)
library(DESeq2)
## Loading required package: S4Vectors
## Loading required package: stats4
## Loading required package: BiocGenerics
## Loading required package: parallel
```

Attaching package: 'BiocGenerics'

```
## The following objects are masked from 'package:parallel':
##
       clusterApply, clusterApplyLB, clusterCall, clusterEvalQ,
##
##
       clusterExport, clusterMap, parApply, parCapply, parLapply,
       parLapplyLB, parRapply, parSapply, parSapplyLB
##
## The following objects are masked from 'package:stats':
##
       IQR, mad, sd, var, xtabs
##
## The following objects are masked from 'package:base':
##
##
       anyDuplicated, append, as.data.frame, cbind, colMeans,
       colnames, colSums, do.call, duplicated, eval, evalq, Filter,
##
       Find, get, grep, grepl, intersect, is.unsorted, lapply,
##
##
       lengths, Map, mapply, match, mget, order, paste, pmax,
       pmax.int, pmin, pmin.int, Position, rank, rbind, Reduce,
##
       rowMeans, rownames, rowSums, sapply, setdiff, sort, table,
##
       tapply, union, unique, unsplit, which, which.max, which.min
##
##
## Attaching package: 'S4Vectors'
## The following object is masked from 'package:base':
##
##
       expand.grid
## Loading required package: IRanges
## Attaching package: 'IRanges'
## The following object is masked from 'package:phyloseq':
##
##
       distance
## Loading required package: GenomicRanges
## Loading required package: GenomeInfoDb
## Loading required package: SummarizedExperiment
## Loading required package: Biobase
```

```
## Welcome to Bioconductor
##
       Vignettes contain introductory material; view with
##
       'browseVignettes()'. To cite Bioconductor, see
##
       'citation("Biobase")', and for packages 'citation("pkgname")'.
##
##
## Attaching package: 'Biobase'
## The following object is masked from 'package:phyloseq':
##
##
       sampleNames
## Loading required package: DelayedArray
## Loading required package: matrixStats
## Warning: package 'matrixStats' was built under R version 3.4.2
## Attaching package: 'matrixStats'
## The following objects are masked from 'package:Biobase':
##
##
      anyMissing, rowMedians
## Attaching package: 'DelayedArray'
## The following objects are masked from 'package:matrixStats':
##
##
       colMaxs, colMins, colRanges, rowMaxs, rowMins, rowRanges
## The following object is masked from 'package:base':
##
##
      apply
##other packages you may need, althoguh I think a few are included with the phyloseq package s
o you may not need to load them
library(ggplot2)
## Warning: package 'ggplot2' was built under R version 3.4.2
library(vegan)
```

```
## Warning: package 'vegan' was built under R version 3.4.2
## Loading required package: permute
## Warning: package 'permute' was built under R version 3.4.2
## Loading required package: lattice
## This is vegan 2.4-4
library(dplyr)
## Warning: package 'dplyr' was built under R version 3.4.2
## Attaching package: 'dplyr'
## The following object is masked from 'package:matrixStats':
##
##
       count
## The following object is masked from 'package:Biobase':
##
##
       combine
## The following objects are masked from 'package:GenomicRanges':
##
##
       intersect, setdiff, union
## The following object is masked from 'package:GenomeInfoDb':
##
       intersect
##
## The following objects are masked from 'package: IRanges':
##
##
       collapse, desc, intersect, setdiff, slice, union
## The following objects are masked from 'package:S4Vectors':
##
##
       first, intersect, rename, setdiff, setequal, union
## The following objects are masked from 'package:BiocGenerics':
##
```

```
##
       combine, intersect, setdiff, union
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(scales)
## Warning: package 'scales' was built under R version 3.4.2
library(grid)
library(reshape2)
## Warning: package 'reshape2' was built under R version 3.4.2
library(ape)
library(gridExtra)
## Warning: package 'gridExtra' was built under R version 3.4.2
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
## The following object is masked from 'package:Biobase':
##
##
       combine
## The following object is masked from 'package:BiocGenerics':
##
       combine
##
library(ade4)
## Warning: package 'ade4' was built under R version 3.4.2
##
```

```
## Attaching package: 'ade4'
## The following object is masked from 'package:GenomicRanges':
##
##
       score
## The following object is masked from 'package: IRanges':
##
##
       score
## The following object is masked from 'package:BiocGenerics':
##
##
       score
library(plyr)
## Warning: package 'plyr' was built under R version 3.4.2
## You have loaded plyr after dplyr - this is likely to cause problems.
## If you need functions from both plyr and dplyr, please load plyr first, then dplyr:
## library(plyr); library(dplyr)
## Attaching package: 'plyr'
## The following objects are masked from 'package:dplyr':
##
##
       arrange, count, desc, failwith, id, mutate, rename, summarise,
       summarize
##
## The following object is masked from 'package:matrixStats':
##
##
       count
## The following object is masked from 'package: IRanges':
##
##
       desc
## The following object is masked from 'package:S4Vectors':
##
##
       rename
```

```
library(tidyr)
## Warning: package 'tidyr' was built under R version 3.4.2
##
## Attaching package: 'tidyr'
## The following object is masked from 'package:reshape2':
##
##
       smiths
## The following object is masked from 'package:S4Vectors':
##
##
       expand
library(data.table)
##
## Attaching package: 'data.table'
## The following objects are masked from 'package:reshape2':
##
##
       dcast, melt
## The following objects are masked from 'package:dplyr':
##
##
       between, first, last
## The following object is masked from 'package:SummarizedExperiment':
##
##
       shift
## The following object is masked from 'package:GenomicRanges':
##
       shift
##
## The following object is masked from 'package: IRanges':
##
       shift
##
## The following objects are masked from 'package:S4Vectors':
##
##
       first, second
```

```
library(stringr)
```

```
## Warning: package 'stringr' was built under R version 3.4.2
```

```
source("miseqR.R")
theme_set(theme_bw())
############### ONLY OTUS WITH OVER 10 SEQUENCES (AND WITH PHYLO TREE) ############################
setwd("C:\\Users\\arisely\\Dropbox\\PhD\\Microbiome\\CHAPTER 3 - PHYSIOLOGY\\ANALYSIS\\R\\Phyl
oseq analysis")
# Assign variables for imported data
sharedfile = "shorebird.microbiome.shared"
taxfile = "shorebird.microbiome.taxonomy"
##import mothur shared and tax files
mothur_data <- import_mothur(mothur_shared_file = sharedfile,</pre>
                            mothur_constaxonomy_file = taxfile)
##import metadata
map <- read.csv("shorebird.metadata.csv", header=T, row.names=1)</pre>
##make meta data into phyloseg format
map <- sample_data(map)</pre>
str(map)
```

```
## 'data.frame':
                   188 obs. of 21 variables:
## Formal class 'sample_data' [package "phyloseq"] with 4 slots
   ..@ .Data :List of 21
##
   ....$ : Factor w/ 180 levels "8546", "8548",..: 1 2 3 4 5 6 7 8 9 10 ...
##
    ....$ : Factor w/ 6 levels "Curlew sandpiper",..: 4 4 4 4 4 4 4 4 4 4 ...
##
    ....$ : Factor w/ 5 levels "", "Broome", "Flinders", ...: 2 2 2 2 2 2 2 2 2 2 ...
##
    ....$ : Factor w/ 7 levels "","August","December",..: 2 2 2 2 2 2 2 2 2 2 ...
##
    ....$ : Factor w/ 6 levels "", "Adult", "Juvenile", ...: 5 5 2 5 5 5 5 5 2 ...
##
    ....$ : Factor w/ 4 levels "","one","three",...: 4 4 4 4 4 4 4 4 4 4 ...
##
##
    .. ..$ : Factor w/ 161 levels "","3611876","3648481",...: 20 21 10 22 23 11 12 13 14 15 ..
##
    ....$ : Factor w/ 3 levels "bird", "env", "neg": 1 1 1 1 1 1 1 1 1 1 ...
    ...$ : Factor w/ 3 levels "na", "No", "Yes": 2 2 2 2 2 2 2 2 2 2 ...
##
     .. ..$ : Factor w/ 2 levels "No", "Yes": 1 1 1 1 1 1 1 1 1 1 ...
##
    ....$ : int NA ...
##
    ....$ : Factor w/ 2 levels "No", "Yes": 1 1 1 1 1 1 1 1 1 1 ...
##
##
    ....$ : Factor w/ 2 levels "No", "Yes": 1 1 1 1 1 1 1 1 1 1 ...
##
    ....$ : int NA NA NA NA NA NA NA NA NA ...
     ....$ : num NA NA NA NA NA NA NA NA NA ...
##
```

```
....$ : num NA NA NA NA NA NA NA NA NA ...
    ....$ : Factor w/ 3 levels "", "sink", "source": 1 1 1 1 1 1 1 1 1 1 ...
     ....$ : Factor w/ 4 levels "", "env", "qut", ...: 1 1 1 1 1 1 1 1 1 1 ...
##
     ....$ : Factor w/ 10 levels "1/04/2017","1/10/2016",...: 6 6 6 6 6 6 6 6 6 6 ...
##
    ....$: int 2 2 2 2 2 2 2 2 2 2 ...
##
     ....$ : Factor w/ 9 levels "", "Broome-curlewsand-adult",..: 5 5 4 5 5 5 5 5 5 4 ...
##
##
               : chr "Group" "species" "site" "month" ...
##
     ..@ row.names: chr "8546" "8548" "8549" "8551" ...
     ..@ .S3Class : chr "data.frame"
##
```

head(map)

```
species
                               site month
                                                 age group bird id type
       Group
## 8546 8546 Red-necked stint Broome August Second year two 3674227 bird
## 8548 8548 Red-necked stint Broome August Second year two 3674229 bird
## 8549 8549 Red-necked stint Broome August
                                               Adult two 3671906 bird
## 8551 8551 Red-necked stint Broome August Second year two 3674231 bird
## 8552 8552 Red-necked stint Broome August Second year
                                                       two 3674232 bird
## 8556 8556 Red-necked stint Broome August Second year
                                                       two 3674214 bird
       Recap recap_delete Recap_num replicate remove_replicate weight wing
## 8546
         No
                      No
                               NA
                                         No
                                                         No
                                                                NA
                                                                    NA
## 8548
         No
                      No
                               NA
                                         No
                                                         No
                                                                NA
                                                                    NA
## 8549
                               NA
                                        No
                                                                NA NA
                      No
## 8551
         No
                      No
                               NA
                                        No
                                                         No
                                                                NA NA
## 8552
        No
                      No
                               NA
                                        No
                                                         No
                                                               NA NA
## 8556
                               NA
                                                               NA NA
        No
                      Nο
                                        No
                                                         No
  hb SourceSink Env
                             Date Plate
##
                                                migration
## 8546 NA
                       22/08/2015 2
                                          Broome-stint-SY
## 8548 NA
                        22/08/2015
                                     2
                                          Broome-stint-SY
## 8549 NA
                        22/08/2015
                                     2 Broome-stint-adult
                                        Broome-stint-SY
## 8551 NA
                        22/08/2015
                                     2
## 8552 NA
                        22/08/2015
                                     2 Broome-stint-SY
## 8556 NA
                        22/08/2015
                                     2
                                          Broome-stint-SY
```

tail(map)

```
Group species site month age group bird_id type Recap
##
      Flind_env
                  env Flinders March na
## F1
                                                     na env
                                                               Nο
                   env Flinders March na
## F2
     Flind env
                                                     na env
                                                               No
                                   na na
                           na
## Neg
          Neg1
                  neg
                                                     na neg
                                                               na
## Neg2
           Neg2
                   neg
                                                               No
                                                         neg
        WTP env
                   env
                            WTP December na
                                                               No
## WTP1
                                                     na env
                            WTP December na
## WTP2
        WTP env
                   env
                                                     na env
##
      recap_delete Recap_num replicate remove_replicate weight wing hb
                No
                        NA
## F1
                                 Yes
                                                 No
                                                        NA
                                                            NA NA
## F2
                Nο
                        NA
                                 Yes
                                                 No
                                                        NA NA NA
                         NA
                                                        NA NA NA
## Neg
                No
                                 No
                                                 No
                        NA
                                 No
                                                 No
                                                        NA NA NA
## Neg2
                No
                                                        NA NA NA
## WTP1
                No
                        NA
                                 No
                                                 No
                                                        NA NA NA
## WTP2
                No
                        NA
                                  No
                                                 No
##
      SourceSink Env
                       Date Plate migration
```

```
## F1 sink env 11/03/2016 1
## F2 sink env 11/03/2016 1
## Neg sink neg 1/10/2016 1
## Neg2 1/04/2017 2
## WTP1 sink env 29/12/2015 1
## WTP2 sink env 29/12/2015 1
```

```
##merge the metadata into the phyloseq object
moth_merge <- merge_phyloseq(mothur_data, map)

##import phylogenetic tree

tree<-read.tree("shorebird.microbiome.tree")

##make tree into phyloseq format

tree<-phy_tree(tree)

##merge tree into current phyloseq object so all object now contained in moth_merge

moth_merge <-merge_phyloseq(moth_merge, tree)

moth_merge</pre>
```

```
## phyloseq-class experiment-level object
## otu_table() OTU Table: [ 8791 taxa and 188 samples ]
## sample_data() Sample Data: [ 188 samples by 21 sample variables ]
## tax_table() Taxonomy Table: [ 8791 taxa by 6 taxonomic ranks ]
## phy_tree() Phylogenetic Tree: [ 8791 tips and 8789 internal nodes ]
```

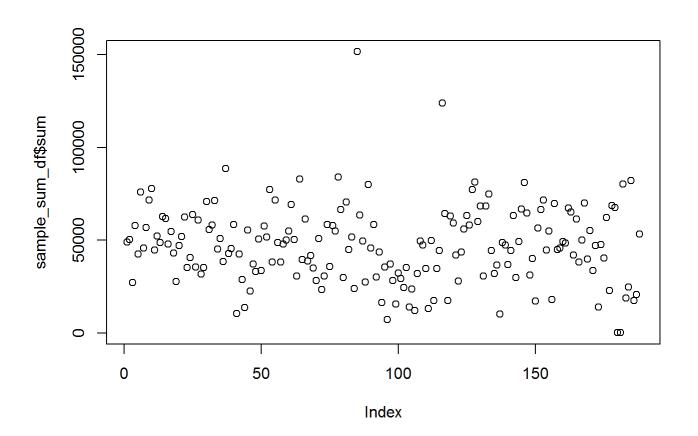
```
##everything looks fie and no errors!

##rename columns to relevant taxonomic group

colnames(tax_table(moth_merge))
```

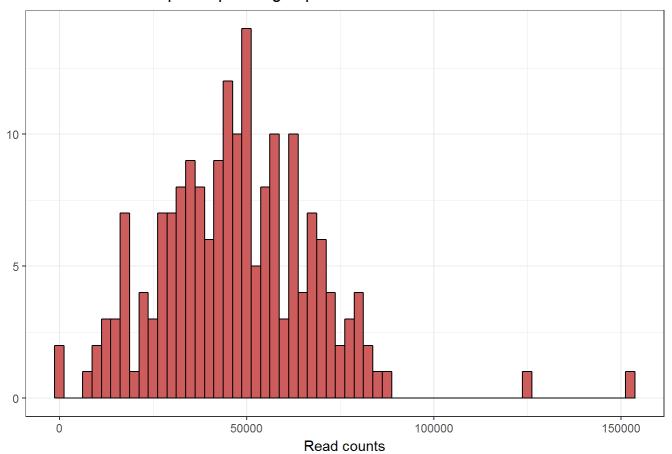
```
## [1] "Rank1" "Rank2" "Rank3" "Rank4" "Rank5" "Rank6"
```

```
## phyloseq-class experiment-level object
## otu_table() OTU Table: [ 8791 taxa and 188 samples ]
## sample_data() Sample Data: [ 188 samples by 21 sample variables ]
## tax_table() Taxonomy Table: [ 8791 taxa by 6 taxonomic ranks ]
## phy_tree() Phylogenetic Tree: [ 8791 tips and 8789 internal nodes ]
```



```
ggplot(sample_sum_df, aes(x = sum)) +
  geom_histogram(color = "black", fill = "indianred", binwidth = 2500) +
  ggtitle("Distribution of sample sequencing depth") +
  xlab("Read counts") +
  ylab("Frequency")+
  theme(axis.title.y = element_blank())
```

Distribution of sample sequencing depth



```
## phy_tree() Phylogenetic Tree: [ 97 tips and 96 internal nodes ]
```

```
## 97 OTUs which have over 1 reads
## we should get rid of these
badtaxa<-taxa_names(neg_control)</pre>
alltaxa<-taxa_names(data_all)</pre>
alltaxa1 <- alltaxa[!(alltaxa %in% badtaxa)]</pre>
data_all = prune_taxa(alltaxa1, data_all)
##get rid of negative control altogether
data_all<-data_all%>%subset_samples(species!="Neg")
#delete replicates
data_all<-data_all%>%subset_samples(remove_replicate=="No")
## just birds
birds<-data all%>%subset samples(type=="bird")
birds <- prune_taxa(taxa_sums(birds) > 0, birds)
## data has more samples than we need. We are going to prune the dataset to just the relevant
samples for this analysis
## for migration analysis (migrant/resident comparison)
migration<-birds%>%subset_samples(species=="Red-necked stint"|species=="Curlew sandpiper")
migration<-migration%>%subset_samples(month=="August"|month=="September")
migration <- prune_taxa(taxa_sums(migration) > 0, migration)
migration
## phyloseq-class experiment-level object
## otu_table() OTU Table:
                                [ 5262 taxa and 77 samples ]
## sample_data() Sample Data:
                                [ 77 samples by 21 sample variables ]
## tax_table() Taxonomy Table:
                                [ 5262 taxa by 6 taxonomic ranks ]
## phy_tree() Phylogenetic Tree: [ 5262 tips and 5260 internal nodes ]
## 77 samples, 5262 OTUs
## Will do this analysis first (for Fig2 and Table S3) before rarefying data
## Analyse differential abundances between migrants and residents for each group
```

```
## subset RNS (Red-necked stint) in Broome
rns_br<-migration%>%subset_samples(species=="Red-necked stint")
rns_br<-rns_br%>%subset_samples(site=="Broome")
rns_br <- prune_taxa(taxa_sums(rns_br) > 0, rns_br)
############################
##the following analysis is from the Phyloseq-DESeq2 vignette, linked at top of script.
diagdds = phyloseq_to_deseq2(rns_br, ~ age)
## converting counts to integer mode
# calculate geometric means prior to estimate size factors
gm_mean = function(x, na.rm=TRUE){
  exp(sum(log(x[x > 0]), na.rm=na.rm) / length(x))
geoMeans = apply(counts(diagdds), 1, gm_mean)
diagdds = estimateSizeFactors(diagdds, geoMeans = geoMeans)
diagdds = DESeq(diagdds, fitType="local")
## using pre-existing size factors
## estimating dispersions
## gene-wise dispersion estimates
## mean-dispersion relationship
## final dispersion estimates
## fitting model and testing
## -- replacing outliers and refitting for 985 genes
## -- DESeq argument 'minReplicatesForReplace' = 7
## -- original counts are preserved in counts(dds)
## estimating dispersions
## fitting model and testing
#diagdds = DESeq(diagdds, fitType="parametric")
res = results(diagdds, cooksCutoff = FALSE)
```

```
alpha = 0.01
sigtab = res[which(res$padj < alpha), ]
sigtab_rns.br = cbind(as(sigtab, "data.frame"), as(tax_table(rns_br)[rownames(sigtab), ], "mat
rix"))
head(sigtab_rns.br)</pre>
```

```
baseMean log2FoldChange lfcSE
##
                                                   stat
                                                              pvalue
## Otu000765
              8.943807 6.451209 1.473355 4.378585 1.194523e-05
## Otu000279 12.561703
                            6.487397 1.733635 3.742078 1.825051e-04
## Otu000053 448.890074
                            4.714085 1.207552 3.903836 9.468006e-05
## Otu000013 1452.245588 -10.263594 1.174882 -8.735852 2.418274e-18
## Otu000117 43.826023
                           -8.519601 1.381634 -6.166322 6.989664e-10
## Otu000009 451.397495
                          -11.616548 1.627590 -7.137267 9.520456e-13
##
                    padj Kingdom
                                         Phylum
## Otu000765 5.492657e-04 Bacteria Proteobacteria Gammaproteobacteria
## Otu000279 4.994002e-03 Bacteria Proteobacteria Gammaproteobacteria
## Otu000053 3.562337e-03 Bacteria Bacteroidetes Sphingobacteriia
## Otu000013 3.639502e-16 Bacteria Actinobacteria
                                                   Actinobacteria
## Otu000117 5.259722e-08 Bacteria Actinobacteria
                                                   Actinobacteria
## Otu000009 9.552191e-11 Bacteria Actinobacteria
                                                    Actinobacteria
                        Order
                                                     Family
## Otu000765 Pseudomonadales
                                             Moraxellaceae
## Otu000279
              Pseudomonadales
                                               Moraxellaceae
## Otu000053 Sphingobacteriales
                                           Chitinophagaceae
## Otu000013 Corynebacteriales
                                         Corynebacteriaceae
## Otu000117 Corynebacteriales
                                         Corynebacteriaceae
## Otu000009 Corynebacteriales Corynebacteriales_unclassified
##
                                     Genus
## Otu000765
                             Acinetobacter
## Otu000279
                             Acinetobacter
## Otu000053
                             Vibrionimonas
## Otu000013 Corynebacteriaceae unclassified
## Otu000117 Corynebacteriaceae unclassified
## Otu000009 Corynebacteriales unclassified
```

```
diagdds = phyloseq_to_deseq2(rns_vic, ~ age)
## converting counts to integer mode
# calculate geometric means prior to estimate size factors
gm_mean = function(x, na.rm=TRUE){
 \exp(\text{sum}(\log(x[x > 0]), \text{na.rm=na.rm}) / \text{length}(x))
geoMeans = apply(counts(diagdds), 1, gm_mean)
diagdds = estimateSizeFactors(diagdds, geoMeans = geoMeans)
diagdds = DESeq(diagdds, fitType="local")
## using pre-existing size factors
## estimating dispersions
## gene-wise dispersion estimates
## mean-dispersion relationship
## final dispersion estimates
## fitting model and testing
## -- replacing outliers and refitting for 1034 genes
## -- DESeq argument 'minReplicatesForReplace' = 7
## -- original counts are preserved in counts(dds)
## estimating dispersions
## fitting model and testing
#diagdds = DESeq(diagdds, fitType="parametric")
res = results(diagdds, cooksCutoff = FALSE)
alpha = 0.01
sigtab = res[which(res$padj < alpha), ]</pre>
sigtab_rns.vic = cbind(as(sigtab, "data.frame"), as(tax_table(rns_vic)[rownames(sigtab), ], "m
atrix"))
head(sigtab_rns.vic)
##
               baseMean log2FoldChange
                                            lfcSE
                                                                  pvalue
                                                       stat
## Otu000013 310.74839
                            -7.603356 0.9299704 -8.175912 2.936371e-16
              11.77106
## Otu000117
                             -6.999681 1.2864956 -5.440890 5.301508e-08
                             -9.169087 0.9653096 -9.498597 2.127372e-21
## Otu000009 6020.41474
```

```
## Otu000575
             17.49598
                            -7.299684 1.2980066 -5.623765 1.868398e-08
                            -7.131328 1.6612481 -4.292753 1.764711e-05
## Otu000265 12.17622
## Otu000757 13.11934
                            -6.617123 1.3422332 -4.929936 8.225670e-07
##
                    padj Kingdom
                                          Phylum
                                                          Class
## Otu000013 1.642900e-13 Bacteria Actinobacteria Actinobacteria
## Otu000117 1.483097e-05 Bacteria Actinobacteria Actinobacteria
## Otu000009 2.380529e-18 Bacteria Actinobacteria Actinobacteria
## Otu000575 6.969125e-06 Bacteria Actinobacteria Actinobacteria
## Otu000265 2.194124e-03 Bacteria Actinobacteria Actinobacteria
## Otu000757 1.534087e-04 Bacteria Actinobacteria Actinobacteria
                        Order
                                                      Family
##
## Otu000013 Corynebacteriales
                                          Corynebacteriaceae
## Otu000117 Corynebacteriales
                                          Corynebacteriaceae
## Otu000009 Corynebacteriales Corynebacteriales_unclassified
## Otu000575 Corynebacteriales
                                          Corynebacteriaceae
## Otu000265 Corynebacteriales
                                          Corynebacteriaceae
## Otu000757 Corynebacteriales
                                          Corynebacteriaceae
##
                                      Genus
## Otu000013 Corynebacteriaceae_unclassified
## Otu000117 Corynebacteriaceae unclassified
## Otu000009 Corynebacteriales_unclassified
## Otu000575 Corynebacteriaceae_unclassified
## Otu000265 Corynebacteriaceae_unclassified
## Otu000757
                            Corynebacterium
```

```
## converting counts to integer mode
```

```
# calculate geometric means prior to estimate size factors
gm_mean = function(x, na.rm=TRUE){
  exp(sum(log(x[x > 0]), na.rm=na.rm) / length(x))
}
geoMeans = apply(counts(diagdds), 1, gm_mean)
diagdds = estimateSizeFactors(diagdds, geoMeans = geoMeans)
diagdds = DESeq(diagdds, fitType="local")
```

```
## using pre-existing size factors
```

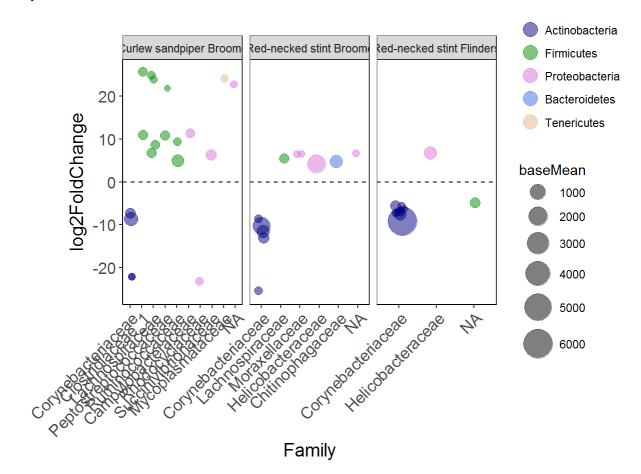
```
## estimating dispersions
## gene-wise dispersion estimates
## mean-dispersion relationship
## final dispersion estimates
## fitting model and testing
## -- replacing outliers and refitting for 509 genes
## -- DESeq argument 'minReplicatesForReplace' = 7
## -- original counts are preserved in counts(dds)
## estimating dispersions
## fitting model and testing
#diagdds = DESeq(diagdds, fitType="parametric")
res = results(diagdds, cooksCutoff = FALSE)
alpha = 0.01
sigtab = res[which(res$padj < alpha), ]</pre>
sigtab_cs = cbind(as(sigtab, "data.frame"), as(tax_table(cs)[rownames(sigtab), ], "matrix"))
head(sigtab_cs)
             baseMean log2FoldChange
                                         lfcSE
                                                    stat
                                                               pvalue
## Otu000319 36.83220 -23.122692 3.172221 -7.289117 3.119939e-13
## Otu000017 211.66346
                           6.298750 1.498019 4.204720 2.614058e-05
## Otu000023 648.40735
                          -8.741014 1.963501 -4.451749 8.517358e-06
## Otu000134 17.35786
                          -22.100447 3.161498 -6.990498 2.739122e-12
## Otu000157 17.97271
                          -22.155554 3.172759 -6.983056 2.888269e-12
## Otu000028 177.39850
                           -7.319617 2.008101 -3.645044 2.673464e-04
##
                     padj Kingdom
                                           Phylum
## Otu000319 1.164777e-11 Bacteria Proteobacteria Betaproteobacteria
## Otu000017 4.182493e-04 Bacteria Proteobacteria Gammaproteobacteria
## Otu000023 1.467606e-04 Bacteria Actinobacteria
                                                     Actinobacteria
## Otu000134 7.188580e-11 Bacteria Actinobacteria
                                                      Actinobacteria
## Otu000157 7.188580e-11 Bacteria Actinobacteria
                                                      Actinobacteria
## Otu000028 3.522682e-03 Bacteria Actinobacteria
                                                      Actinobacteria
                         Order
                                            Family
## Otu000319
                Rhodocyclales
                                   Rhodocyclaceae
## Otu000017
                Aeromonadales Succinivibrionaceae
## Otu000023 Corynebacteriales Corynebacteriaceae
## Otu000134 Corynebacteriales Corynebacteriaceae
## Otu000157 Corynebacteriales Corynebacteriaceae
## Otu000028 Corynebacteriales Corynebacteriaceae
```

```
## Otu000319 Methyloversatilis
## Otu000017 Succinivibrionaceae_unclassified
## Otu000023 Corynebacteriaceae_unclassified
## Otu000134 Corynebacteriaceae_unclassified
## Otu000157 Corynebacterium
## Otu000028 <NA>
```

##	Otu000118	Otu000028
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000009	Otu000013
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000117	Otu000011
##	Corynebacteriaceae	Helicobacteraceae
##	Otu000053	Otu000106
##	Chitinophagaceae	Lachnospiraceae
##	Otu000765	Otu000279
##	Moraxellaceae	Moraxellaceae
##	Otu000358	Otu000009
##	Gammaproteobacteria uncl.	Corynebacteriaceae
##	Otu000013	Otu000575
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000265	Otu000117
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000757	Otu000769
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000136	Otu000028
##	Corynebacteriaceae	Corynebacteriaceae
##	Otu000020	Otu000006
##	Enterococcaceae	Helicobacteraceae
##	Otu000319	Otu000157
##	Rhodocyclaceae	Corynebacteriaceae
##	Otu000134	Otu000023

```
##
          Corynebacteriaceae
                                     Corynebacteriaceae
                                              Otu000044
##
                   Otu000028
##
          Corynebacteriaceae
                                        Ruminococcaceae
                   Otu000017
                                              Otu000070
##
##
         Succinivibrionaceae
                                        Lachnospiraceae
                   Otu000124
                                              Otu000126
##
             Lachnospiraceae
                                        Ruminococcaceae
##
                                              Otu000208
##
                   Otu000227
##
       Peptostreptococcaceae
                                       Clostridiaceae 1
##
                   Otu000078
                                              Otu000628
##
          Campylobacteraceae
                                  Peptostreptococcaceae
##
                   Otu000358
                                              Otu000343
## Gammaproteobacteria uncl.
                                        Lachnospiraceae
##
                   Otu000094
                                              Otu000316
##
            Mycoplasmataceae
                                        Lachnospiraceae
                   Otu000183
##
##
            Clostridiaceae_1
## 15 Levels: Chitinophagaceae ... Succinivibrionaceae
```

```
deseq2$Family<-factor(deseq2$Family, levels = c("Corynebacteriaceae",
                                                  "Clostridiaceae_1", "Lachnospiraceae", "Peptos
treptococcaceae", "Ruminococcaceae",
                                                   "Moraxellaceae",
                                                   "Campylobacteraceae" ,
                                                   "Helicobacteraceae" ,
                                                   "Rhodocyclaceae"
                                                   "Gammaproteobacteria uncl.",
                                                   "Succinivibrionaceae",
                                                   "Chitinophagaceae",
                                                   "Mycoplasmataceae"))
deseq2$Phylum<-factor(deseq2$Phylum, levels = c("Actinobacteria", "Firmicutes", "Proteobacteria
", "Bacteroidetes", "Tenericutes"))
#Figure 2
ggplot(deseq2, aes(x=Family, y=log2FoldChange, color=Phylum)) +
 geom jitter(aes(size = baseMean), width = 0.2, alpha = 0.5)+ scale size(range = c(2,10))+
 theme(axis.text.x = element_text(angle = 45, hjust = 1))+
 geom_hline(yintercept = 0, linetype = 2)+facet_grid(.~Group, scales = "free")+ylim(-26,26)+
 scale_color_manual(values = c("navyblue","green4","orchid","royalblue","burlywood"))+
 theme( axis.text = element_text(size=12), axis.title=element_text(size=14))+
 theme(plot.margin=unit(c(0.5,1,1,2), "cm"))+guides(color = guide_legend(override.aes = list(s
ize=5)))+
  theme(panel.grid.major = element_blank(), panel.grid.minor = element_blank(),
        panel.background = element blank(), axis.line = element line(colour = "black"))
```

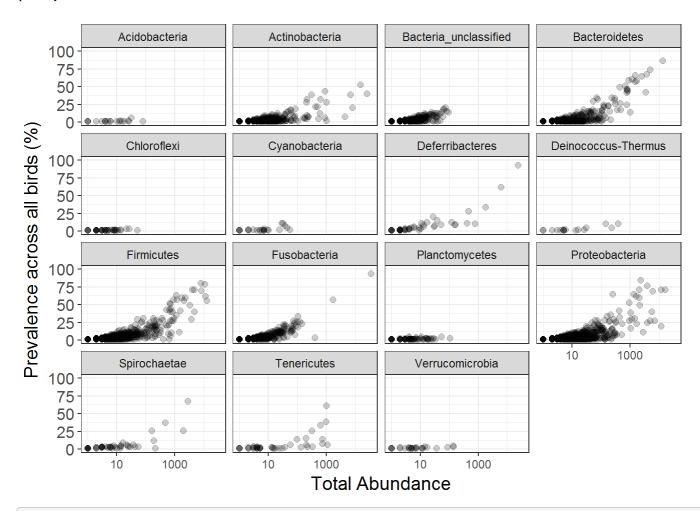


...

```
migration
```

```
## phyloseq-class experiment-level object
## otu_table() OTU Table: [ 4406 taxa and 77 samples ]
## sample_data() Sample Data: [ 77 samples by 21 sample variables ]
## tax_table() Taxonomy Table: [ 4406 taxa by 6 taxonomic ranks ]
## phy_tree() Phylogenetic Tree: [ 4406 tips and 4404 internal nodes ]
```

```
migration2 <- migration1 %>%
 scale_reads(n=5815) ##scale to smallest library size
#migration1 = unrarefied
#migration = rarefied
#migration2 = scaled
#using rarefied data, but can test with others - makes no difference
#######
##prevance whole group
prev0 = apply(X = otu_table(migration),
             MARGIN = ifelse(taxa_are_rows(migration), yes = 1, no = 2),
             FUN = function(x) \{sum(x > 0)\})
prevdf = data.frame(Prevalence = prev0,
                  TotalAbundance = taxa_sums(migration),
                  tax_table(migration))
keepPhyla = table(prevdf$Phylum)[(table(prevdf$Phylum) > 10)]
prevdf1 = subset(prevdf, Phylum %in% names(keepPhyla))
prevdf1$Prevalence<-(prevdf1$Prevalence/77)*100</pre>
prevdf$Prevalence<-(prevdf$Prevalence/77)*100</pre>
ggplot(prevdf1, aes(TotalAbundance, Prevalence)) +
 geom_point(size = 2, alpha = 0.2) +
 scale_x_log10() +
 xlab("Total Abundance") + ylab("Prevalence across all birds (%)")+
 facet wrap(~Phylum)+theme bw() +
 theme( axis.text.y = element_text(size=12), axis.title=element_text(size=14))+ylim(c(0,100)
```



mean(prevdf\$Prevalence)

[1] 4.638008

```
#write.csv(prevdf, "prevalence_all_samples.csv")
##table S2
#Subset each group seperately to get top 10 OTUs
# b = broome, f = flinders, a = adult/migrants, sy = second year/resident
curlew.b<-migration%>%subset_samples(species=="Curlew sandpiper"& site=="Broome")
curlew.b<- prune_taxa(taxa_sums(curlew.b) > 0, curlew.b)
curlew.b.a<-curlew.b%>%subset_samples(age=="Adult")
curlew.b.a<- prune_taxa(taxa_sums(curlew.b.a) > 0, curlew.b.a)
curlew.b.sy<-curlew.b%>%subset_samples(age=="Second year")
curlew.b.sy<- prune_taxa(taxa_sums(curlew.b.sy) > 0, curlew.b.sy)
stint.b<-migration%>%subset_samples(site=="Broome" & species=="Red-necked stint")
stint.b<- prune_taxa(taxa_sums(stint.b) > 0, stint.b)
stint.b.a<-stint.b%>%subset_samples(age=="Adult")
stint.b.a<- prune_taxa(taxa_sums(stint.b.a) > 0, stint.b.a)
stint.b.sy<-stint.b%>%subset samples(age=="Second year")
```

```
stint.b.sy<- prune taxa(taxa sums(stint.b.sy) > 0, stint.b.sy)
stint.f<-migration%>%subset samples(month=="September")
stint.f<-stint.f%>%subset_samples(species=="Red-necked stint")
stint.f<- prune_taxa(taxa_sums(stint.f) > 0, stint.f)
stint.f.sy<-stint.f%>%subset_samples(age=="Second year")
stint.f.sy<- prune taxa(taxa sums(stint.f.sy) > 0, stint.f.sy)
stint.f.a<-stint.f%>%subset_samples(age=="Adult")
stint.f.a<- prune_taxa(taxa_sums(stint.f.a) > 0, stint.f.a)
####### TABLE S2A)
# broome curlew sand migrants
prev0 = apply(X = otu_table(curlew.b.a),
              MARGIN = ifelse(taxa_are_rows(curlew.b.a), yes = 1, no = 2),
              FUN = function(x) \{sum(x > 0)\})
prevdf = data.frame(Prevalence = prev0,
                    TotalAbundance = taxa_sums(curlew.b.a),
                    tax_table(curlew.b.a))
prevdf$RelAbund<-prevdf$TotalAbundance/sum(prevdf$TotalAbundance)</pre>
prevdf$RelPrev<-prevdf$Prevalence/12</pre>
prevdf<-prevdf[order(-prevdf$RelAbund),]</pre>
head(prevdf)
```

```
Prevalence TotalAbundance Kingdom
                                                       Phylum
## Otu000023
                   9
                                7688 Bacteria Actinobacteria
                                5928 Bacteria Proteobacteria
## Otu000027
                    8
## Otu000002
                   11
                                4683 Bacteria Fusobacteria
## Otu000058
                    4
                                4295 Bacteria Actinobacteria
## Otu000010
                   10
                                3326 Bacteria Deferribacteres
## Otu000028
                     7
                                2829 Bacteria Actinobacteria
##
                          Class
                                           Order
                                                              Family
## Otu000023
                Actinobacteria Corynebacteriales Corynebacteriaceae
## Otu000027 Gammaproteobacteria
                                  Aeromonadales Succinivibrionaceae
## Otu000002
                Fusobacteriia Fusobacteriales Fusobacteriaceae
## Otu000058
                 Actinobacteria Corynebacteriales Corynebacteriaceae
## Otu000010
                Deferribacteres Deferribacterales Deferribacteraceae
## Otu000028
                 Actinobacteria Corynebacteriales Corynebacteriaceae
##
                                     Genus RelAbund RelPrev
## Otu000023 Corynebacteriaceae_unclassified 0.11017484 0.7500000
## Otu000027
                         Anaerobiospirillum 0.08495271 0.6666667
## Otu000002
                             Cetobacterium 0.06711092 0.9166667
## Otu000058 Corynebacteriaceae_unclassified 0.06155059 0.3333333
## Otu000010
                            Mucispirillum 0.04766409 0.8333333
## Otu000028
                                       <NA> 0.04054170 0.5833333
```

```
#write.csv(prevdf, "curlew.b.a.csv")
```

```
Prevalence TotalAbundance Kingdom
                                                    Phylum
## Otu000002
                              4223 Bacteria
                5
                                              Fusobacteria
                              3457 Bacteria Deferribacteres
## Otu000010
                   5
                   6
                              2711 Bacteria Firmicutes
## Otu000018
## Otu000016
                  6
                              2427 Bacteria Bacteroidetes
                                               Firmicutes
## Otu000034
                   6
                              2238 Bacteria
## Otu000008
                              1973 Bacteria
                                               Firmicutes
##
                      Class
                                       Order
                                                         Family
## Otu000002 Fusobacteriia Fusobacteriales Fusobacteriaceae
## Otu000010 Deferribacteres Deferribacterales Deferribacteraceae
               Clostridia Clostridiales
                                               Lachnospiraceae
## Otu000018
## Otu000016
                Bacteroidia
                               Bacteroidales
                                                 Bacteroidaceae
## Otu000034 Erysipelotrichia Erysipelotrichales Erysipelotrichaceae
## Otu000008
             Bacilli Lactobacillales
                                                Enterococcaceae
                                     Genus RelAbund RelPrev
## Otu000002
                             Cetobacterium 0.12103755 0.8333333
## Otu000010
                             Mucispirillum 0.09908283 0.8333333
## Otu000018
                              Tyzzerella_3 0.07770135 1.0000000
## Otu000016
                               Bacteroides 0.06956148 1.0000000
## Otu000034 Erysipelotrichaceae_unclassified 0.06414445 1.0000000
## Otu000008
                             Catellicoccus 0.05654915 0.8333333
```

```
prevdf$RelAbund<-prevdf$TotalAbundance/sum(prevdf$TotalAbundance)
prevdf$RelPrev<-prevdf$Prevalence/13
prevdf<-prevdf[order(-prevdf$RelAbund),]
head(prevdf)</pre>
```

```
Prevalence TotalAbundance Kingdom
                                                        Phylum
##
## Otu000013
                    11
                                 8616 Bacteria Actinobacteria
## Otu000002
                    13
                                 7614 Bacteria Fusobacteria
## Otu000017
                    12
                                 5778 Bacteria Proteobacteria
## Otu000009
                     6
                                 5195 Bacteria Actinobacteria
## Otu000010
                    13
                                 3510 Bacteria Deferribacteres
## Otu000016
                    12
                                 3106 Bacteria Bacteroidetes
                          Class
                                            Order
##
                 Actinobacteria Corynebacteriales
## Otu000013
## Otu000002
                  Fusobacteriia Fusobacteriales
## Otu000017 Gammaproteobacteria
                                   Aeromonadales
## Otu000009
                 Actinobacteria Corynebacteriales
## Otu000010
                Deferribacteres Deferribacterales
## Otu000016
                    Bacteroidia
                                    Bacteroidales
##
                                    Family
                                                                      Genus
## Otu000013
                        Corynebacteriaceae Corynebacteriaceae_unclassified
## Otu000002
                          Fusobacteriaceae
                                                              Cetobacterium
## Otu000017
                       Succinivibrionaceae Succinivibrionaceae_unclassified
## Otu000009 Corynebacteriales_unclassified Corynebacteriales_unclassified
## Otu000010
                        Deferribacteraceae
                                                              Mucispirillum
## Otu000016
                            Bacteroidaceae
                                                                Bacteroides
              RelAbund
                        RelPrev
##
## Otu000013 0.11397579 0.8461538
## Otu000002 0.10072095 1.0000000
## Otu000017 0.07643363 0.9230769
## Otu000009 0.06872148 0.4615385
## Otu000010 0.04643164 1.0000000
## Otu000016 0.04108737 0.9230769
```

head(prevdf)

```
Prevalence TotalAbundance Kingdom
                                                     Phylum
##
                  16
                               9725 Bacteria Deferribacteres
## Otu000010
                               7912 Bacteria Proteobacteria
## Otu000011
                   15
## Otu000020
                   10
                               5754 Bacteria
                                                Firmicutes
## Otu000002
                   15
                               4614 Bacteria Fusobacteria
## Otu000018
                   9
                               4421 Bacteria
                                                Firmicutes
## Otu000036
                   15
                               4284 Bacteria Proteobacteria
                           Class
                                          Order
##
                                                             Family
## Otu000010 Deferribacteres Deferribacterales Deferribacteraceae
## Otu000011 Epsilonproteobacteria Campylobacterales Helicobacteraceae
## Otu000020
                         Bacilli Lactobacillales
                                                    Enterococcaceae
                   Fusobacteria Fusobacteriales Fusobacteriaceae
## Otu000002
## Otu000018
                      Clostridia Clostridiales
                                                    Lachnospiraceae
## Otu000036 Alphaproteobacteria
                                    Rhizobiales Methylobacteriaceae
##
                      Genus RelAbund RelPrev
## Otu000010 Mucispirillum 0.10452494 1.0000
## Otu000011
              Helicobacter 0.08503869 0.9375
## Otu000020 Catellicoccus 0.06184437 0.6250
## Otu000002
             Cetobacterium 0.04959157 0.9375
## Otu000018
              Tyzzerella_3 0.04751720 0.5625
## Otu000036 Methylobacterium 0.04604471 0.9375
```

```
##
            Prevalence TotalAbundance Kingdom
                                                     Phylum
## Otu000009
                              19124 Bacteria Actinobacteria
                  14
## Otu000002
                   14
                               6743 Bacteria Fusobacteria
## Otu000011
                   13
                               5365 Bacteria Proteobacteria
## Otu000020
                   10
                                4261 Bacteria
                                                Firmicutes
## Otu000013
                   14
                                3865 Bacteria Actinobacteria
## Otu000014
                   15
                                2560 Bacteria
                                               Firmicutes
```

```
##
                             Class
                                              Order
## Otu000009
                   Actinobacteria Corynebacteriales
## Otu000002
                    Fusobacteriia
                                   Fusobacteriales
## Otu000011 Epsilonproteobacteria Campylobacterales
## Otu000020
                          Bacilli
                                   Lactobacillales
## Otu000013
                   Actinobacteria Corynebacteriales
## Otu000014
                          Bacilli Lactobacillales
                                    Family
##
                                                                      Genus
## Otu000009 Corynebacteriales unclassified Corynebacteriales unclassified
                          Fusobacteriaceae
## Otu000002
                                                             Cetobacterium
## Otu000011
                        Helicobacteraceae
                                                              Helicobacter
## Otu000020
                           Enterococcaceae
                                                              Catellicoccus
## Otu000013
                        Corynebacteriaceae Corynebacteriaceae_unclassified
## Otu000014
                           Enterococcaceae
                                                             Catellicoccus
             RelAbund RelPrev
##
## Otu000009 0.21924907 0.9333333
## Otu000002 0.07730582 0.9333333
## Otu000011 0.06150760 0.8666667
## Otu000020 0.04885067 0.6666667
## Otu000013 0.04431069 0.9333333
## Otu000014 0.02934938 1.0000000
```

```
Prevalence TotalAbundance Kingdom
## Otu000006
                    7
                              11596 Bacteria Proteobacteria
## Otu000002
                   14
                               6271 Bacteria Fusobacteria
## Otu000008
                   15
                                4866 Bacteria
                                               Firmicutes
## Otu000031
                   8
                                4102 Bacteria
                                               Firmicutes
## Otu000039
                    3
                                3774 Bacteria Proteobacteria
                                               Firmicutes
                   13
                                2963 Bacteria
## Otu000014
                           Class
                                             Order
                                                               Family
## Otu000006 Epsilonproteobacteria Campylobacterales Helicobacteraceae
                  Fusobacteriia Fusobacteriales Fusobacteriaceae
## Otu000002
## Otu000008
                         Bacilli
                                   Lactobacillales
                                                      Enterococcaceae
## Otu000031
               Erysipelotrichia Erysipelotrichales Erysipelotrichaceae
## Otu000039 Gammaproteobacteria Enterobacteriales Enterobacteriaceae
```

```
## Otu000014 Bacilli Lactobacillales Enterococcaceae
## Otu000006 Helicobacteraceae_unclassified 0.13294354 0.4666667
## Otu000002 Cetobacterium 0.07189453 0.9333333
## Otu000008 Catellicoccus 0.05578676 1.0000000
## Otu000031 Erysipelotrichaceae_unclassified 0.04702780 0.5333333
## Otu000039 Escherichia-Shigella 0.04326741 0.2000000
## Otu000014 Catellicoccus 0.03396962 0.8666667
```

```
#write.csv(prevdf, "stint.f.sy.csv")
#Figure 1)
############ migration
migration_phylum <- migration %>%
 tax_glom(taxrank = "Phylum") %>%
                                            # agglomerate at phylum level
 transform\_sample\_counts(function(x) \{x/sum(x)\}) \ \text{%>\%} \ \# \ Transform \ to \ rel. \ abundance
 psmelt() %>%
                                            # Melt to long format
                                            # Sort data frame alphabetically by phy
 arrange(Phylum)
lum
                                            # Filter out low abundance taxa
#filter(Abundance > 0.05) %>%
head(migration_phylum)
```

```
OTU Sample Abundance Group
                                           species
                                                       site
                                                               month
##
## 1 Otu000944 8680 0.016852966 8680 Red-necked stint Flinders September
## 2 Otu000944 8607 0.004815133 8607 Red-necked stint Broome
## 3 Otu000944 8667 0.004815133 8667 Red-necked stint Flinders September
## 4 Otu000944 8639 0.003955288 8639 Red-necked stint Flinders September
## 5 Otu000944 8560 0.003439381 8560 Red-necked stint Broome
                                                             August
## 6 Otu000944 8566 0.002063629 8566 Red-necked stint Broome
          age group bird_id type Recap_recap_delete Recap_num replicate
        Adult three 3685834 bird No
## 1
                                             No
## 2
         Adult
               two 3678451 bird No
                                             No
                                                       NA
                                                                No
## 3 Second year three 3686272 bird
                                 No
                                             No
                                                      NA
                                                               No
        Adult three 3686361 bird Yes
                                                        1
                                                               Yes
## 4
                                            Yes
         Adult two 3674218 bird No
                                                               No
## 5
                                             No
                                                       NA
## 6 Second year two 3674234 bird
                                 No
                                             No
                                                       NA
                                                               Nο
   remove_replicate weight wing hb SourceSink Env
                                                   Date Plate
## 1
                      29 NA NA source gut 20/09/2015
                      NA NA NA
                                              29/08/2015
## 2
                No
## 3
               No
                      28 NA NA
                                   source gut 20/09/2015
## 4
                       31 NA NA
                                   source gut 20/09/2015
                No
                                                            1
## 5
                No
                      NA NA NA
                                              22/08/2015
                                                            2
                      NA NA NA
                                              22/08/2015
## 6
                No
             migration Kingdom
                                    Phylum
##
## 1 Flinders-stint-adult Bacteria Acidobacteria
```

```
## 2 Broome-stint-adult Bacteria Acidobacteria
## 3 Flinders-stint-SY Bacteria Acidobacteria
## 4 Flinders-stint-adult Bacteria Acidobacteria
## 5 Broome-stint-adult Bacteria Acidobacteria
## 6 Broome-stint-SY Bacteria Acidobacteria
```

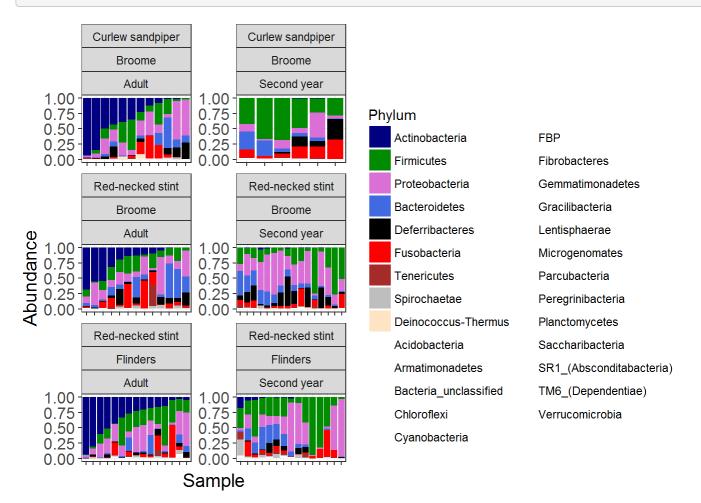
```
## [1] Acidobacteria
                                Actinobacteria
## [3] Armatimonadetes
                                Bacteria_unclassified
## [5] Bacteroidetes
                                Chloroflexi
## [7] Cyanobacteria
                                Deferribacteres
## [9] Deinococcus-Thermus
                                FBP
## [11] Fibrobacteres
                                Firmicutes
## [13] Fusobacteria
                               Gemmatimonadetes
## [15] Gracilibacteria
                                Lentisphaerae
## [17] Microgenomates
                               Parcubacteria
## [19] Peregrinibacteria
                                Planctomycetes
## [21] Proteobacteria
                                Saccharibacteria
## [23] Spirochaetae
                                SR1_(Absconditabacteria)
## [25] Tenericutes
                                TM6_(Dependentiae)
## [27] Verrucomicrobia
## 27 Levels: Acidobacteria Actinobacteria ... Verrucomicrobia
```

```
migration_phylum$Phylum<-factor(migration_phylum$Phylum)
unique(migration_phylum$Phylum)
```

```
## [1] Acidobacteria
                                Actinobacteria
## [3] Armatimonadetes
                                Bacteria_unclassified
## [5] Bacteroidetes
                                Chloroflexi
## [7] Cyanobacteria
                                Deferribacteres
## [9] Deinococcus-Thermus
                               FBP
## [11] Fibrobacteres
                                Firmicutes
## [13] Fusobacteria
                                Gemmatimonadetes
## [15] Gracilibacteria
                                Lentisphaerae
## [17] Microgenomates
                                Parcubacteria
## [19] Peregrinibacteria
                                Planctomycetes
## [21] Proteobacteria
                                Saccharibacteria
## [23] Spirochaetae
                                SR1 (Absconditabacteria)
## [25] Tenericutes
                                TM6_(Dependentiae)
## [27] Verrucomicrobia
## 27 Levels: Acidobacteria Actinobacteria ... Verrucomicrobia
```

```
"Proteobacteria",
                                                                                                                                                                 "Bacteroidetes",
                                                                                                                                                                 "Deferribacteres",
                                                                                                                                                                 "Fusobacteria",
                                                                                                                                                                 "Tenericutes",
                                                                                                                                                                 "Spirochaetae",
                                                                                                                                                                 "Deinococcus-Thermus",
                                                                                                                                                                 "Acidobacteria",
                                                                                                                                                                 "Armatimonadetes",
                                                                                                                                                                 "Bacteria_unclassified",
                                                                                                                                                                 "Chloroflexi",
                                                                                                                                                                 "Cyanobacteria",
                                                                                                                                                                 "FBP",
                                                                                                                                                                 "Fibrobacteres",
                                                                                                                                                                 "Gemmatimonadetes",
                                                                                                                                                                 "Gracilibacteria",
                                                                                                                                                                 "Ignavibacteriae",
                                                                                                                                                                "Lentisphaerae",
                                                                                                                                                                 "Microgenomates",
                                                                                                                                                                 "Parcubacteria",
                                                                                                                                                                 "Peregrinibacteria",
                                                                                                                                                                 "Planctomycetes",
                                                                                                                                                                 "Saccharibacteria",
                                                                                                                                                                 "SR1_(Absconditabacteria)",
                                                                                                                                                                 "TM6_(Dependentiae)",
                                                                                                                                                                 "Verrucomicrobia"))
unique(migration_phylum$Sample)
## [1] "8680" "8607" "8667" "8639" "8560" "8566" "8645" "8662" "8558" "8559"
## [11] "8610" "8632" "8628" "8563" "8581" "8671" "8549" "8552" "8548" "8660"
## [21] "8601" "8604" "8546" "8605" "8612" "8658" "8556" "8570" "8551" "8659"
## [31] "8657" "8646" "8665" "8629" "8655" "8627" "8633" "8609" "8616" "8649"
## [41] "8589" "8606" "8586" "8575" "8644" "8557" "8571" "8677" "8672" "8663"
## [51] "8630" "8689" "8565" "8569" "8615" "8564" "8590" "8561" "8682" "8583"
## [61] "8634" "8683" "8685" "8588" "8675" "8674" "8613" "8626" "8688" "8686"
## [71] "8578" "8625" "8573" "8618" "8684" "8679" "8638"
colors <- c("navyblue", "green4", "orchid", "royalblue", "black", "red", "brown", "grey", "bisque",
                             "white", "wh
hite",
                             "white", "white", "white", "white", "white", "white", "white")
names(colors) <- levels(migration_phylum$Phylum)</pre>
colScale <- scale_fill_manual(name = "Phylum", values = colors)</pre>
```

```
migration phylum$Sample<-factor(migration phylum$Sample, level = c("8682", "8629", "8615", "86
85", "8610", "8662", "8560", "8607", "8671", "8589", "8657", "8573", "8625", "8627", "8639", "
8549", "8645", "8632", "8660", "8649", "8601",
                                                                    "8658", "8638", "8646", "86
34", "8606", "8612", "8581", "8618", "8609", "8628", "8672", "8605", "8689", "8659", "8616", "
8626", "8604", "8569", "8677", "8588", "8675",
                                                                   "8551", "8613", "8546", "86
83", "8590", "8557", "8558", "8674", "8559", "8680", "8630", "8563", "8586", "8556", "8561", "
8644", "8667", "8566", "8665", "8633", "8564",
                                                                    "8583", "8575", "8571", "85
65", "8578", "8570", "8684", "8688", "8655", "8552", "8548", "8679", "8663", "8686"))
##Figure 1a
ggplot(migration_phylum, aes(x = Sample, y = Abundance, fill = Phylum)) +
 geom_bar(stat = "identity") +
 theme(axis.text.x = element_blank(), axis.text.y = element_text(size=12), axis.title=element
text(size=14))+
  facet wrap(species~site~age, scales="free", nrow=3, ncol=2)+colScale
```



```
psmelt() %>%  # Melt to long format
    # Filter out low abundance taxa
arrange(Family)  # Sort data frame alphabetically by fam
ily
# head(migration_family)
```

```
##
           OTU Sample
                        Abundance Group
                                                 species
                                                            site month
## 1 Otu000437
                 8558 0.003439381 8558 Red-necked stint Broome August
## 2 Otu000437
                8563 0.002407567 8563 Red-necked stint Broome August
## 3 Otu000437
                8552 0.001031814 8552 Red-necked stint Broome August
                 8564 0.001031814 8564 Red-necked stint Broome August
## 4 Otu000437
## 5 Otu000437
                 8556 0.00000000 8556 Red-necked stint Broome August
## 6 Otu000437
                 8583 0.000000000 8583 Curlew sandpiper Broome August
             age group bird_id type Recap recap_delete Recap_num replicate
## 1 Second year
                 two 3674216 bird
                                       No
                                                    No
                                                              NA
## 2 Second year
                 two 3674221 bird
                                       No
                                                    No
                                                              NA
                                                                         No
## 3 Second year
                 two 3674232 bird
                                       No
                                                    No
                                                              NA
                                                                         No
## 4 Second year
                 two 3674222 bird
                                      No
                                                    No
                                                              NA
                                                                         No
                  two 3674214 bird
## 5 Second year
                                       No
                                                    No
                                                              NA
                                                                         No
## 6 Second year
                   one 4267072 bird
                                       No
                                                    No
                                                              NA
                                                                         No
    remove_replicate weight wing hb SourceSink Env
                                                          Date Plate
## 1
                          NA
                               NA NA
                                                    22/08/2015
                                                    22/08/2015
## 2
                   No
                          NA
                               NA NA
## 3
                   No
                          NA
                               NA NA
                                                    22/08/2015
## 4
                   No
                          NA
                               NA NA
                                                    22/08/2015
                                                                    2
                          NA
                                                    22/08/2015
                                                                    2
## 5
                               NA NA
                   No
                                                    22/08/2015
## 6
                   Nο
                          NA
                               NA NA
                                                                    2
##
               migration Kingdom
                                           Phylum
                                                                 Class
         Broome-stint-SY Bacteria Proteobacteria Deltaproteobacteria
## 1
## 2
          Broome-stint-SY Bacteria Proteobacteria Deltaproteobacteria
## 3
          Broome-stint-SY Bacteria Proteobacteria Deltaproteobacteria
          Broome-stint-SY Bacteria Proteobacteria Deltaproteobacteria
## 4
## 5
          Broome-stint-SY Bacteria Proteobacteria Deltaproteobacteria
## 6 Broome-curlewsand-SY Bacteria Proteobacteria Deltaproteobacteria
##
             Order
                      Family
## 1 Oligoflexales 0319-6G20
## 2 Oligoflexales 0319-6G20
## 3 Oligoflexales 0319-6G20
## 4 Oligoflexales 0319-6G20
## 5 Oligoflexales 0319-6G20
## 6 Oligoflexales 0319-6G20
```

```
migration_family$Family<-factor(migration_family$Family)
#broome_phylum$Order<-factor(broome_phylum$Order)
unique(migration_family$Family)</pre>
```

```
## [1] 0319-6G20 Acetobacteraceae

## [3] Acidaminococcaceae Acidimicrobiaceae

## [5] Acidimicrobiales_unclassified Acidobacteriaceae_(Subgroup_1)

## [7] Actinobacteria_unclassified Actinomycetaceae

## [9] Aeromonadaceae Aeromonadales_unclassified
```

##		Alcaligenaceae	Alphaproteobacteria_unclassified
##		Alteromonadaceae	Anaerolineaceae
##		Anaeroplasmataceae	Anaplasmataceae
##		Archangiaceae	Ardenticatenales_fa
##		Arenicellaceae	Armatimonadales_unclassified
##		Aurantimonadaceae	Bacillaceae
##	[23]	Bacilli_unclassified	Bacteria_unclassified
##	[25]	Bacteriovoracaceae	Bacteroidaceae
##	[27]	Bacteroidales_S24-7_group	Bacteroidales_unclassified
##	[29]	Bacteroidetes_unclassified	BD2-11_terrestrial_group_fa
##	[31]	BD7-8_marine_group_fa	Bdellovibrionaceae
##	[33]	Beijerinckiaceae	Bifidobacteriaceae
##	[35]	Blastocatellaceae_(Subgroup_4)	Brachyspiraceae
##	[37]	Bradymonadaceae	Bradyrhizobiaceae
##	[39]	Brevibacteriaceae	Brucellaceae
##	[41]	Burkholderiaceae	Burkholderiales_unclassified
##	[43]	Caldilineaceae	Campylobacteraceae
##	[45]	Campylobacterales_unclassified	Cardiobacteriaceae
##	[47]	Carnobacteriaceae	Caulobacteraceae
##	[49]	Cellulomonadaceae	Cellvibrionaceae
##	[51]	Cellvibrionales_unclassified	Chitinophagaceae
##	[53]	Chloroflexaceae	Chloroflexi_unclassified
##	[55]	Chromatiaceae	Clostridia_unclassified
##	[57]	Clostridiaceae_1	Clostridiaceae_4
##	[59]	Clostridiales_unclassified	Clostridiales_vadinBB60_group
##	[61]	Comamonadaceae	Coriobacteriaceae
##	[63]	Corynebacteriaceae	Corynebacteriales_unclassified
##	[65]	Coxiellaceae	Cryomorphaceae
##	[67]	CS-B046_fa	Cyanobacteria_unclassified
##	[69]	Cyclobacteriaceae	Cytophagaceae
##	[71]	Cytophagales_unclassified	d142_fa
##	[73]	DA111	DBS1
##	[75]	Deferribacteraceae	Deinococcaceae
##		Deltaproteobacteria_unclassified	Dermabacteraceae
##	[79]	Dermacoccaceae	Dermatophilaceae
##	[81]	Desulfobacteraceae	Desulfobulbaceae
##		Desulfovibrionaceae	Desulfovibrionales_unclassified
##	[85]	Desulfuromonadaceae	DEV007
##		Dietziaceae	Ectothiorhodospiraceae
##		Eel-36e1D6	Elev-16S-1332
##		Enterobacteriaceae	Enterococcaceae
##		Entomoplasmatales_Incertae_Sedis	Epsilonproteobacteria_unclassified
##		Erysipelotrichaceae	Erythrobacteraceae
##		Eubacteriaceae	Euzebyaceae
##		EV818SWSAP88	Family_XI
		Family_XII	Family_XIII
		FamilyI	FamilyII
		FBP_fa	FD035
		Firmicutes_unclassified	Flammeovirgaceae
		Flavobacteriaceae	Flavobacteriales_unclassified
		Fusobacteriaceae	Fusobacteriales_unclassified
		Gammaproteobacteria_unclassified	Gastranaerophilales_fa
		Gemmatimonadaceae	Geodermatophilaceae
##			
##		Gitt-GS-136_fa	Gracilibacteria_fa

1			
		Granulosicoccaceae	Hahellaceae
		Halanaerobiales_unclassified	Haliangiaceae
		Halieaceae	Halomonadaceae
		Helicobacteraceae	Herpetosiphonaceae
		HOC36_fa	Holosporaceae
		Hydrogenophilaceae	Hyphomicrobiaceae
		Hyphomonadaceae	Intrasporangiaceae
		JG30-KF-CM45_fa	JG34-KF-361
		JTB255_marine_benthic_group	KD4-96_fa
##	[137]	KF-JG30-B3	Kineosporiaceae
##	[139]	Lachnospiraceae	Lactobacillaceae
		Lactobacillales_unclassified	LD29
##	[143]	Legionellaceae	Lentisphaeraceae
##	[145]	Leptospiraceae	Leptotrichiaceae
##	[147]	Leuconostocaceae	Listeriaceae
##	[149]	Longimicrobiaceae	Methylobacteriaceae
##	[151]	Methylophilaceae	MgMjR-022
##	[153]	Microbacteriaceae	Micrococcaceae
##	[155]	Micrococcales_unclassified	Microgenomates_unclassified
##	[157]	Milano-WF1B-44_fa	Mollicutes_unclassified
##	[159]	Moraxellaceae	MSB-1E8
##	[161]	Mycobacteriaceae	Mycoplasmataceae
##	[163]	NB1-n_fa	Neisseriaceae
##	[165]	Nitriliruptoraceae	Nitrosomonadaceae
##	[167]	Nocardiaceae	Nocardioidaceae
##	[169]	NS9_marine_group	Obscuribacterales_fa
##	[171]	Oceanospirillaceae	Oceanospirillales_unclassified
##	[173]	Oligoflexaceae	OM1_clade
##	[175]	OM182_clade	OM190_fa
##	[177]	Oxalobacteraceae	Paenibacillaceae
##	[179]	Parcubacteria_fa	Parvularculaceae
##	[181]	Pasteurellaceae	PeM15_fa
##	[183]	Peptostreptococcaceae	Peregrinibacteria_fa
		Phycisphaeraceae	Phyllobacteriaceae
		Pla3_lineage_fa	Planctomycetaceae
		Planococcaceae	Porphyromonadaceae
##	[191]	Prevotellaceae	Propionibacteriaceae
		Proteobacteria_unclassified	Pseudoalteromonadaceae
		Pseudomonadaceae	Pseudonocardiaceae
		Psychromonadaceae	Puniceicoccaceae
		PYR10d3_fa	Rhizobiaceae
		Rhizobiales_Incertae_Sedis	Rhizobiales_unclassified
		Rhodobacteraceae	Rhodobiaceae
		Rhodocyclaceae	Rhodospirillaceae
		Rhodospirillales_Incertae_Sedis	Rhodospirillales_unclassified
		Rhodothermaceae	Rickettsiaceae
		Rickettsiales_Incertae_Sedis	Rickettsiales_unclassified
		Rikenellaceae	Rs-D42
		Rubritaleaceae	Ruminococcaceae
		S0134_terrestrial_group_fa	S085_fa
		Saccharibacteria_fa	Sandaracinaceae
		Saprospiraceae	SAR116_clade
		SAR324_clade(Marine_group_B)_fa	Shewanellaceae
		Solibacteraceae_(Subgroup_3)	Solirubrobacteraceae
""	[[[[[[[[[[[[[[[[[[[[borrbacteraceae_(bubgroup_3)	DOTIT ADT ODGCCCT ACCAC

```
## [227] Sphingobacteriaceae
                                            Sphingobacteriales_unclassified
## [229] Sphingomonadaceae
                                            Sphingomonadales_unclassified
## [231] Spirochaetaceae
                                            Spirochaetales unclassified
## [233] Spongiibacteraceae
                                            SR1_(Absconditabacteria)_fa
## [235] Staphylococcaceae
                                            Streptococcaceae
## [237] Streptomycetaceae
                                            Subgroup_21_fa
## [239] Subgroup_22_fa
                                            Subgroup_23_fa
## [241] Subgroup_6_fa
                                            Subgroup_7_fa
## [243] Succinivibrionaceae
                                            Surface 1
## [245] Sva0071 fa
                                            Sva0725
## [247] Sva0996_marine_group
                                            Sva1033
## [249] Syntrophaceae
                                            T9d
## [251] Tepidisphaeraceae
                                            Thermoactinomycetaceae
## [253] Thiotrichaceae
                                            TM6 (Dependentiae) fa
## [255] TRA3-20_fa
                                            Trueperaceae
## [257] uncultured
                                            uncultured fa
## [259] Unknown_Family
                                            Veillonellaceae
## [261] Verrucomicrobia fa
                                            Verrucomicrobia unclassified
                                            Verrucomicrobiales_unclassified
## [263] Verrucomicrobiaceae
## [265] Vibrionaceae
## [267] Xanthobacteraceae
                                            Xanthomonadaceae
## [269] Xanthomonadales_Incertae_Sedis
                                           Xanthomonadales_unclassified
## 270 Levels: 0319-6G20 Acetobacteraceae ... Xanthomonadales_unclassified
```

```
#write.csv(migration_family, "family.csv")
##all common Corynebacteriales_unclassified are genus Corynebacterium (we ran sequences throug
h ARB):
migration_family$Family[migration_family$Family=="Corynebacteriales_unclassified"]<-"Corynebac
teriaceae"
########plot
migration_family$Family<-factor(migration_family$Family, level = c("Corynebacteriaceae",
                                                                    "Acidaminococcaceae", "Clost
ridiaceae_1", "Clostridiales_unclassified" , "Enterococcaceae" , "Erysipelotrichaceae" , "Firmic
utes_unclassified" , "Lachnospiraceae" , "Peptostreptococcaceae" , "Ruminococcaceae" , "Staphy
lococcaceae",
                                                                    "Comamonadaceae", "Desulfov
ibrionaceae", "Enterobacteriaceae", "Gammaproteobacteria_unclassified", "Helicobacteraceae"
"Methylobacteriaceae" , "Oxalobacteraceae" , "Rhizobiales_unclassified" , "Rhodobacteraceae",
"Sphingomonadaceae", "Succinivibrionaceae",
                                                                    "Bacteroidaceae" , "Bactero
idales_unclassified" , "Chitinophagaceae" , "Flavobacteriaceae", "Porphyromonadaceae", "Rikenellac
eae",
                                                                    "Deferribacteraceae" ,
                                                                    "Fusobacteriaceae",
                                                                    "Anaeroplasmataceae", "Myco
plasmataceae",
                                                                    "Brachyspiraceae" ,
                                                                    "Deinococcaceae",
```

```
"0319-6G20",
                                                                      "Acetobacteraceae",
                                                                      "Acidimicrobiaceae",
                                                                     "Acidimicrobiales_unclassif
ied",
                                                                     "Acidobacteriaceae_(Subgrou
p_1)",
                                                                     "Actinobacteria unclassifie
d",
                                                                     "Actinomycetaceae",
                                                                     "Aeromonadaceae",
                                                                     "Aeromonadales unclassified
                                                                     "Alcaligenaceae",
                                                                     "Alphaproteobacteria_unclas
sified",
                                                                     "Alteromonadaceae",
                                                                     "Anaerolineaceae",
                                                                     "Anaplasmataceae",
                                                                     "Ardenticatenales_fa",
                                                                     "Arenicellaceae",
                                                                      "Armatimonadales_unclassifi
ed",
                                                                     "Aurantimonadaceae",
                                                                     "Bacillaceae",
                                                                     "Bacilli_unclassified",
                                                                     "Bacteria_unclassified",
                                                                     "Bacteriovoracaceae",
                                                                     "Bacteroidales_S24-7_group"
                                                                      "Bacteroidetes unclassified
                                                                     "Bartonellaceae",
                                                                     "BD2-11_terrestrial_group_f
a",
                                                                      "BD7-8_marine_group_fa",
                                                                     "Bdellovibrionaceae",
                                                                     "Beijerinckiaceae",
                                                                     "Bifidobacteriaceae",
                                                                     "Blastocatellaceae_(Subgrou
p_4)",
                                                                     "Bradymonadaceae",
                                                                     "Bradymonadales_fa",
                                                                      "Bradyrhizobiaceae",
                                                                     "Brevibacteriaceae",
                                                                      "Brucellaceae",
                                                                     "Burkholderiaceae",
                                                                      "Burkholderiales_unclassifi
ed",
```

```
"Caldilineaceae",
                                                                     "Campylobacteraceae",
                                                                     "Campylobacterales_unclassi
fied",
                                                                     "Cardiobacteriaceae",
                                                                     "Carnobacteriaceae",
                                                                     "Caulobacteraceae",
                                                                     "Cellulomonadaceae",
                                                                     "Cellvibrionaceae",
                                                                     "Cellvibrionales_unclassifi
ed",
                                                                     "Chloroflexaceae",
                                                                     "Chloroflexi_unclassified",
                                                                     "Chromatiaceae",
                                                                     "Clostridia_unclassified",
                                                                     "Clostridiaceae 4",
                                                                     "Clostridiales_vadinBB60_gr
oup",
                                                                     "Coriobacteriaceae",
                                                                     "Coxiellaceae",
                                                                     "Cryomorphaceae",
                                                                     "CS-B046 fa",
                                                                     "Cyanobacteria_unclassified
                                                                     "Cyclobacteriaceae",
                                                                     "Cytophagaceae",
                                                                     "Cytophagales_unclassified"
                                                                     "d142_fa",
                                                                     "DA111",
                                                                     "DBS1",
                                                                     "Deltaproteobacteria_unclas
sified",
                                                                     "Dermabacteraceae",
                                                                     "Dermacoccaceae",
                                                                     "Dermatophilaceae",
                                                                     "Desulfobacteraceae",
                                                                     "Desulfobulbaceae",
                                                                     "Desulfovibrionales_unclass
ified",
                                                                     "Desulfuromonadaceae",
                                                                     "Desulfuromonadales_unclass
ified",
                                                                     "DEV007",
```

```
"Dietziaceae",
                                                                      "Eel-36e1D6",
                                                                      "Elev-16S-1332",
                                                                      "Entomoplasmatales_Incertae
_Sedis",
                                                                      "Epsilonproteobacteria_uncl
assified",
                                                                      "Erythrobacteraceae",
                                                                     "Eubacteriaceae",
                                                                     "Euzebyaceae",
                                                                     "Family_XI",
                                                                     "Family_XII",
                                                                     "Family_XIII",
                                                                     "FamilyI",
                                                                     "FamilyII",
                                                                      "FBP_fa",
                                                                     "FD035",
                                                                      "Flammeovirgaceae",
                                                                      "Flavobacteriales_unclassif
ied",
                                                                      "Fusobacteriales_unclassifi
ed",
                                                                      "Gastranaerophilales_fa",
                                                                      "Gemmatimonadaceae",
                                                                      "Geodermatophilaceae",
                                                                     "Gitt-GS-136_fa",
                                                                      "Gracilibacteria_fa",
                                                                      "Granulosicoccaceae",
                                                                      "Hahellaceae",
                                                                     "Halanaerobiales_unclassifi
ed",
                                                                      "Haliangiaceae",
                                                                     "Halieaceae",
                                                                      "Halomonadaceae",
                                                                      "Herpetosiphonaceae",
                                                                      "HOC36_fa",
                                                                      "Holosporaceae",
                                                                      "Hydrogenophilaceae",
                                                                     "Hyphomicrobiaceae",
                                                                      "Hyphomonadaceae",
                                                                      "Iamiaceae",
                                                                      "Intrasporangiaceae",
                                                                      "JG30-KF-CM45_fa",
                                                                      "JG34-KF-361",
                                                                      "JTB255_marine_benthic_grou
```

```
p",
                                                                      "KD4-96_fa",
                                                                      "KF-JG30-B3",
                                                                      "Kineosporiaceae",
                                                                     "Lactobacillaceae",
                                                                     "Lactobacillales_unclassifi
ed",
                                                                     "LD29",
                                                                     "Legionellaceae",
                                                                     "Lentisphaeraceae",
                                                                      "Leptospiraceae",
                                                                     "Leptotrichiaceae",
                                                                      "Leuconostocaceae",
                                                                     "Listeriaceae",
                                                                     "Longimicrobiaceae",
                                                                     "Methylophilaceae",
                                                                      "MgMjR-022",
                                                                     "Microbacteriaceae",
                                                                      "Micrococcaceae",
                                                                      "Micrococcales_unclassified
                                                                      "Microgenomates_unclassifie
d",
                                                                      "Milano-WF1B-44_fa",
                                                                     "Mollicutes_unclassified",
                                                                     "Moraxellaceae",
                                                                      "MSB-1E8",
                                                                     "Mycobacteriaceae",
                                                                      "NB1-n_fa",
                                                                     "Neisseriaceae",
                                                                     "Nitriliruptoraceae",
                                                                     "Nitrosomonadaceae",
                                                                      "Nocardiaceae",
                                                                     "Nocardioidaceae",
                                                                      "NS9_marine_group",
                                                                      "Obscuribacterales_fa",
                                                                      "Oceanospirillaceae",
                                                                      "Oceanospirillales_unclassi
fied",
                                                                      "Oligoflexaceae",
                                                                     "OM1_clade",
                                                                      "OM182_clade",
                                                                      "OM190_fa",
                                                                     "Paenibacillaceae",
                                                                      "Parcubacteria_fa",
                                                                      "Parvularculaceae",
                                                                     "Pasteurellaceae",
                                                                      "PeM15_fa",
```

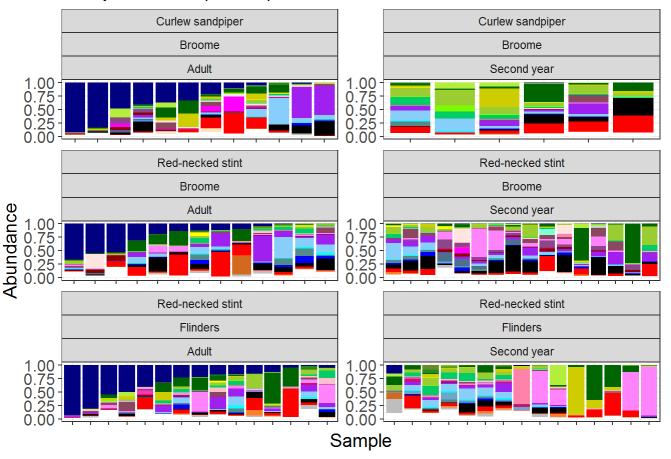
```
"Peregrinibacteria_fa",
                                                                     "Phycisphaeraceae",
                                                                     "Phyllobacteriaceae",
                                                                     "Pla3_lineage_fa",
                                                                     "Planctomycetaceae",
                                                                     "Planococcaceae",
                                                                     "Prevotellaceae",
                                                                     "Propionibacteriaceae",
                                                                     "Proteobacteria_unclassifie
d",
                                                                     "Pseudoalteromonadaceae",
                                                                     "Pseudomonadaceae",
                                                                     "Pseudonocardiaceae",
                                                                     "Psychromonadaceae",
                                                                     "Puniceicoccaceae",
                                                                     "PYR10d3_fa",
                                                                     "Rhizobiaceae",
                                                                     "Rhizobiales_Incertae_Sedis
                                                                     "Rhodobiaceae",
                                                                     "Rhodocyclaceae",
                                                                     "Rhodospirillaceae",
                                                                     "Rhodospirillales_Incertae_
Sedis",
                                                                     "Rhodospirillales_unclassif
ied",
                                                                     "Rhodothermaceae",
                                                                     "Rickettsiaceae",
                                                                     "Rickettsiales_Incertae_Sed
is",
                                                                     "Rickettsiales unclassified
                                                                     "Rs-D42",
                                                                     "Rubritaleaceae",
                                                                     "S0134_terrestrial_group_fa
                                                                     "S085_fa",
                                                                     "Saccharibacteria fa",
                                                                     "Sandaracinaceae",
                                                                     "Saprospiraceae",
                                                                     "SAR116_clade",
                                                                     "SAR324_clade(Marine_group_
B)_fa",
                                                                     "Shewanellaceae",
                                                                     "Solibacteraceae_(Subgroup_
3)",
                                                                     "Solirubrobacteraceae",
                                                                     "Sphingobacteriaceae",
```

```
"Sphingobacteriales_unclass
ified",
                                                                      "Sphingomonadales_unclassif
ied",
                                                                      "Spirochaetaceae",
                                                                      "Spirochaetales_unclassifie
d",
                                                                      "Spongiibacteraceae",
                                                                      "SR-FBR-L83",
                                                                      "SR1_(Absconditabacteria)_f
a",
                                                                      "Streptococcaceae",
                                                                      "Streptomycetaceae",
                                                                      "Subgroup_21_fa",
                                                                      "Subgroup_22_fa",
                                                                      "Subgroup_23_fa",
                                                                      "Subgroup_6_fa",
                                                                      "Subgroup_7_fa",
                                                                      "Surface_1",
                                                                      "Sva0071_fa",
                                                                      "Sva0725",
                                                                      "Sva0996_marine_group",
                                                                      "Sva1033",
                                                                      "Syntrophaceae",
                                                                      "T9d",
                                                                      "Tepidisphaeraceae",
                                                                      "Thermoactinomycetaceae",
                                                                      "Thiotrichaceae",
                                                                      "TM146",
                                                                      "TM6_(Dependentiae)_fa",
                                                                      "TRA3-20_fa",
                                                                      "Trueperaceae",
                                                                      "uncultured",
                                                                      "uncultured_fa",
                                                                      "Unknown_Family",
                                                                      "Veillonellaceae",
                                                                      "Verrucomicrobia_fa",
                                                                      "Verrucomicrobia_unclassifi
ed",
                                                                      "Verrucomicrobiaceae",
                                                                      "Verrucomicrobiales_unclass
ified",
                                                                      "Vibrionaceae",
                                                                      "X35_fa",
                                                                      "Xanthobacteraceae",
                                                                      "Xanthomonadaceae",
                                                                      "Xanthomonadales_Incertae_S
edis",
                                                                      "Xanthomonadales_unclassifi
ed"))
```

```
##only families that make up more than 5% total abundance are coloured. The rest are coloured
white
colors <- c("navy",</pre>
                     "olivedrab4", "olivedrab2", "forestgreen", "darkgreen", "yellow3", "yellow1", "yellowgre
en", "lawngreen", "springgreen3", "aquamarine",
                     "mistyrose", "pink", "palevioletred1", "palevioletred4", "orchid1", "orchid4", "maroon
1", "magenta", "deeppink3", "red4", "purple",
                     "lightskyblue", "cyan", "skyblue4", "skyblue3", "darkslategray4", "blue",
                     "black",
                     "red",
                     "chocolate1", "chocolate",
                     "grey",
                     "bisque",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                      "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white", "white, "white
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white", "white",
                     "white", "white", "white", "white", "white", "white", "white", "white", "white")
names(colors) <- levels(migration family$Family)</pre>
colScale <- scale fill manual(name = "Family", values = colors)</pre>
migration_family$Sample<-factor(migration_family$Sample, level = c("8682", "8629", "8615", "86
85", "8610", "8662", "8560", "8607", "8671", "8589", "8657", "8573", "8625", "8627", "8639", "
```

```
8549", "8645", "8632", "8660", "8649", "8601",
                                                                    "8658", "8638", "8646", "86
34", "8606", "8612", "8581", "8618", "8609", "8628", "8672", "8605", "8689", "8659", "8616", "
8626", "8604", "8569", "8677", "8588", "8675",
                                                                   "8551", "8613", "8546", "86
83", "8590", "8557", "8558", "8674", "8559", "8680", "8630", "8563", "8586", "8556", "8561", "
8644", "8667", "8566", "8665", "8633", "8564",
                                                                   "8583", "8575", "8571", "85
65", "8578", "8570", "8684", "8688", "8655", "8552", "8548", "8679", "8663", "8686"))
ggplot(migration_family, aes(x = Sample, y = Abundance, fill = Family)) +
 #Fig 1b)
 geom bar(stat = "identity", position="fill") +
 theme(axis.text.x = element_blank(), axis.text.y = element_text(size=12), axis.title=element
text(size=14))+
 ggtitle("Family abundance per sample")+facet_wrap(species~site~age, scales="free", nrow=3, n
col=2)+colScale + theme(legend.position="none")
```

Family abundance per sample



```
##Figure S4)

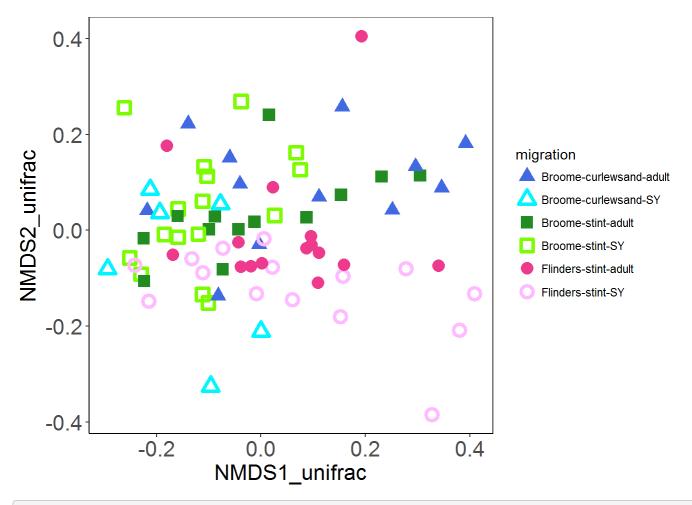
set.seed(1)

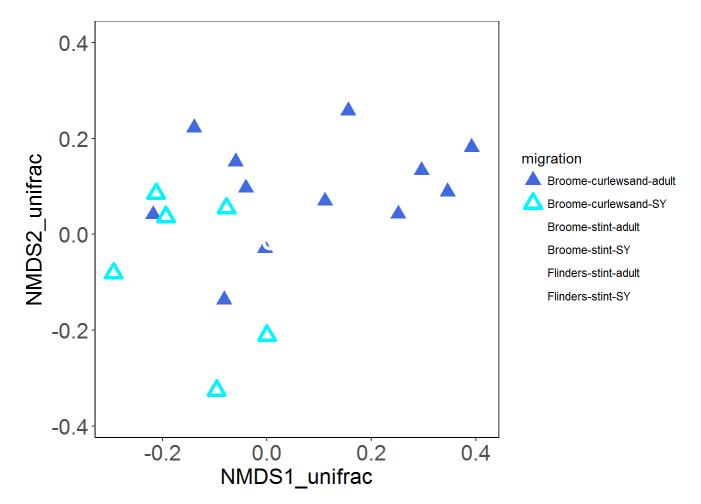
migration_unifrac <- ordinate(
   physeq = migration,
   method = "NMDS",
   distance = "unifrac"
)</pre>
```

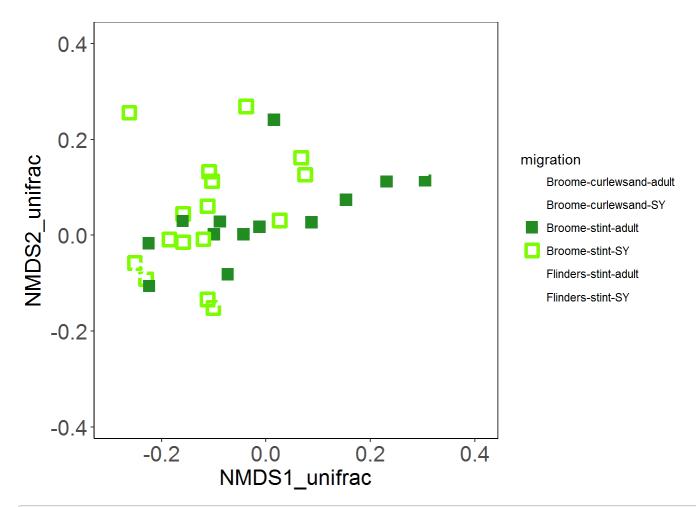
```
## Warning in UniFrac(physeq, ...): Randomly assigning root as -- Otu000566 -- ## in the phylogenetic tree in the data you provided.
```

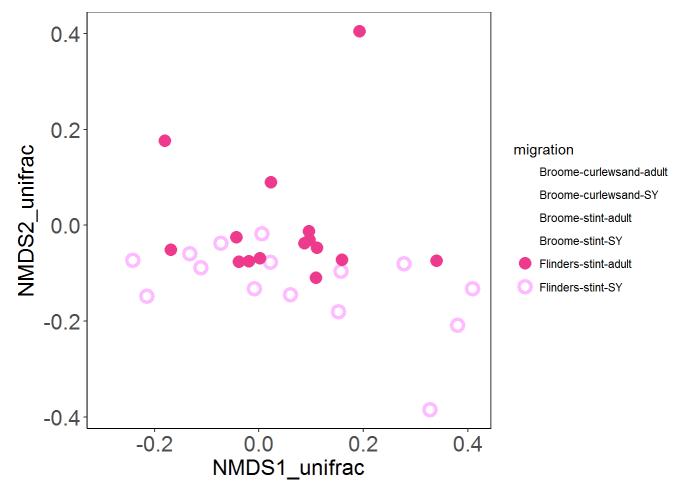
```
## Run 0 stress 0.2178487
## Run 1 stress 0.2322504
## Run 2 stress 0.2155708
## ... New best solution
## ... Procrustes: rmse 0.06628759 max resid 0.2890222
## Run 3 stress 0.2271085
## Run 4 stress 0.2286939
## Run 5 stress 0.2196326
## Run 6 stress 0.2349434
## Run 7 stress 0.2226841
## Run 8 stress 0.2133707
## ... New best solution
## ... Procrustes: rmse 0.02225117 max resid 0.1186602
## Run 9 stress 0.2190638
## Run 10 stress 0.2108544
## ... New best solution
## ... Procrustes: rmse 0.06605822 max resid 0.2885335
## Run 11 stress 0.2209799
## Run 12 stress 0.2172837
## Run 13 stress 0.22129
## Run 14 stress 0.2105399
## ... New best solution
## ... Procrustes: rmse 0.02824563 max resid 0.1835601
## Run 15 stress 0.2231375
## Run 16 stress 0.2185725
## Run 17 stress 0.2123678
## Run 18 stress 0.2131853
## Run 19 stress 0.2172729
## Run 20 stress 0.2181311
## *** No convergence -- monoMDS stopping criteria:
       20: stress ratio > sratmax
```

```
## add unifrac ordination axes to dataframe and plot
unifrac<-data.frame(migration_unifrac$points)
sample_data(migration)$NMDS1_unifrac<-unifrac$MDS1
sample_data(migration)$NMDS2_unifrac<-unifrac$MDS2
migration.df<-data.frame(sample_data(migration))</pre>
```









```
## Warning in UniFrac(physeq, ...): Randomly assigning root as -- Otu004229 --
## in the phylogenetic tree in the data you provided.
```

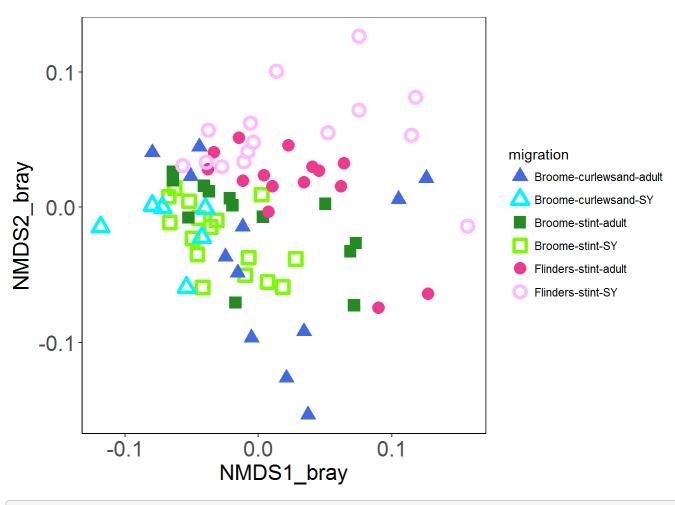
```
# make a data frame from the sample_data
sampledf <- data.frame(sample_data(migration))

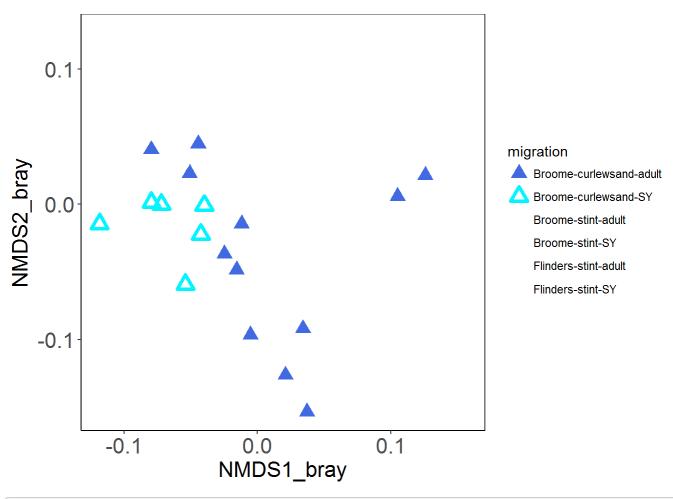
# Adonis test
adonis(migration_unifrac ~ site+species+age, data = sampledf)</pre>
```

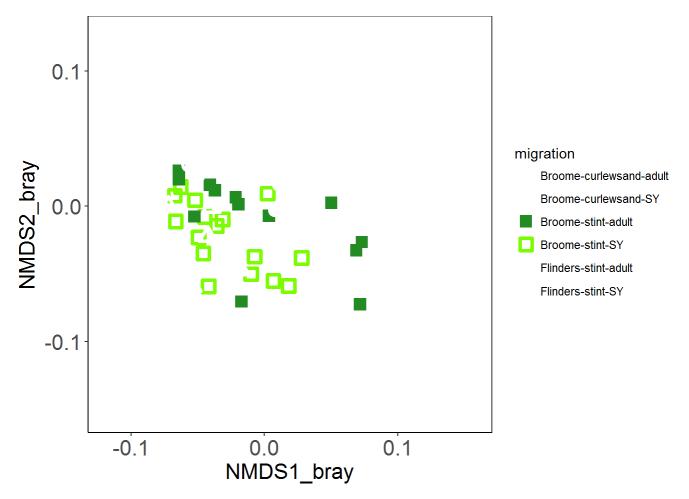
```
##
## Call:
## adonis(formula = migration_unifrac ~ site + species + age, data = sampledf)
##
## Permutation: free
## Number of permutations: 999
##
## Terms added sequentially (first to last)
##
## Df SumsOfSqs MeanSqs F.Model R2 Pr(>F)
```

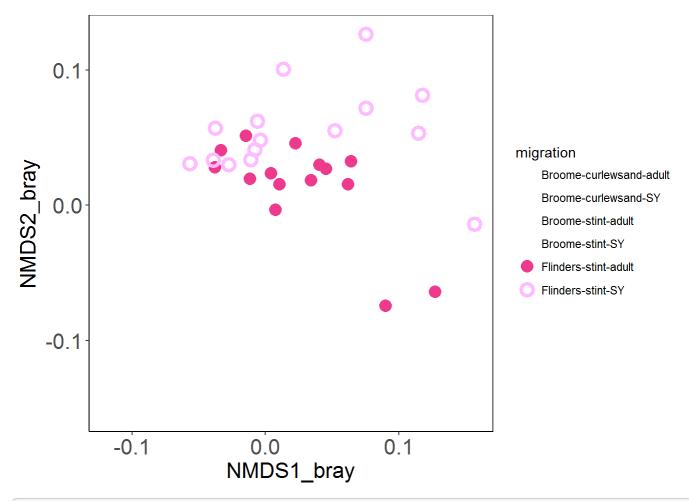
```
## Square root transformation
## Wisconsin double standardization
## Run 0 stress 0.2453602
## Run 1 stress 0.2607537
## Run 2 stress 0.255154
## Run 3 stress 0.2561769
## Run 4 stress 0.2518526
## Run 5 stress 0.2718302
## Run 6 stress 0.2533695
## Run 7 stress 0.2584876
## Run 8 stress 0.2453605
## ... Procrustes: rmse 0.0003253219 max resid 0.002527825
## ... Similar to previous best
## Run 9 stress 0.261244
## Run 10 stress 0.2517643
## Run 11 stress 0.2439716
## ... New best solution
## ... Procrustes: rmse 0.04242624 max resid 0.3241008
## Run 12 stress 0.2649426
## Run 13 stress 0.2657925
## Run 14 stress 0.2448462
## Run 15 stress 0.243968
## ... New best solution
## ... Procrustes: rmse 0.0320396 max resid 0.2619141
## Run 16 stress 0.26698
## Run 17 stress 0.2443094
## ... Procrustes: rmse 0.04255965 max resid 0.2075804
## Run 18 stress 0.2705507
## Run 19 stress 0.2493743
## Run 20 stress 0.2500642
## *** No convergence -- monoMDS stopping criteria:
```

20: stress ratio > sratmax





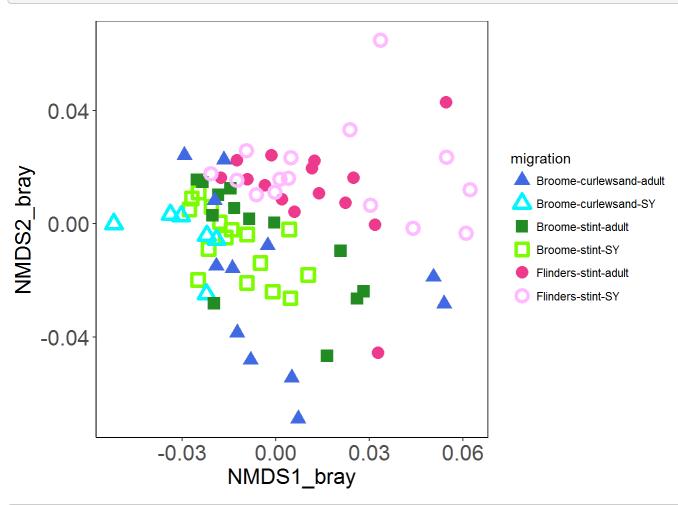




```
##
## Call:
## adonis(formula = migration_bray ~ site + species + age, data = sampledf)
##
## Permutation: free
## Number of permutations: 999
##
## Terms added sequentially (first to last)
##
             Df SumsOfSqs MeanSqs F.Model
##
                   1.1939 1.19392 3.4024 0.04114 0.001 ***
## site
## species
             1
                   0.9877 0.98765 2.8146 0.03403 0.001 ***
```

```
## Square root transformation
## Wisconsin double standardization
## Run 0 stress 0.2434372
## Run 1 stress 0.2520435
## Run 2 stress 0.2505532
## Run 3 stress 0.2414003
## ... New best solution
## ... Procrustes: rmse 0.05723422 max resid 0.3325888
## Run 4 stress 0.2407164
## ... New best solution
## ... Procrustes: rmse 0.04558418 max resid 0.3847929
## Run 5 stress 0.2636338
## Run 6 stress 0.2525901
## Run 7 stress 0.2554168
## Run 8 stress 0.2445606
## Run 9 stress 0.2592545
## Run 10 stress 0.2590405
## Run 11 stress 0.2401147
## ... New best solution
## ... Procrustes: rmse 0.04837525 max resid 0.3577633
## Run 12 stress 0.2539493
## Run 13 stress 0.248226
## Run 14 stress 0.2423354
## Run 15 stress 0.2504476
## Run 16 stress 0.2600155
## Run 17 stress 0.2488418
## Run 18 stress 0.2526451
## Run 19 stress 0.240373
## ... Procrustes: rmse 0.03543252 max resid 0.2868491
## Run 20 stress 0.2567804
## *** No convergence -- monoMDS stopping criteria:
```

20: stress ratio > sratmax



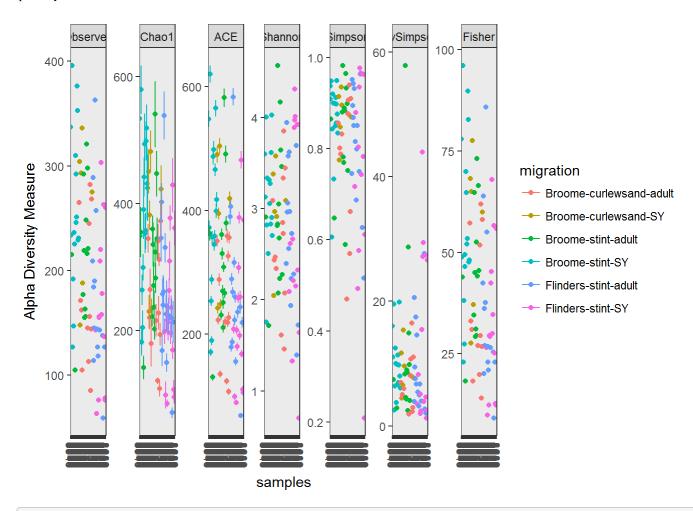
```
##stats
migration_bray <- phyloseq::distance(migration1, method = "bray")
#migration_bray <- phyloseq::distance(migration1, method = "unifrac")</pre>
```

```
# make a data frame from the sample_data
sampledf <- data.frame(sample_data(migration1))

# Adonis test
adonis(migration_bray ~ site+species+age, data = sampledf)</pre>
```

```
##
## Call:
## adonis(formula = migration_bray ~ site + species + age, data = sampledf)
## Permutation: free
## Number of permutations: 999
## Terms added sequentially (first to last)
##
##
          Df SumsOfSqs MeanSqs F.Model R2 Pr(>F)
## site
           1 1.0202 1.02019 2.8284 0.03539 0.001 ***
           1
                0.9369 0.93687 2.5974 0.03250 0.001 ***
## species
           1
                0.5401 0.54012 1.4974 0.01874 0.042 *
## age
## Residuals 73 26.3305 0.36069
                                      0.91338
## Total 76 28.8277
                                       1.00000
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
## Warning: Removed 385 rows containing missing values (geom_errorbar).
```



```
min_lib <- min(sample_sums(migration))</pre>
# Initialize matrices to store richness and evenness estimates
nsamp = nsamples(migration)
trials = 100
richness <- matrix(nrow = nsamp, ncol = trials)</pre>
row.names(richness) <- sample_names(migration)</pre>
evenness <- matrix(nrow = nsamp, ncol = trials)</pre>
row.names(evenness) <- sample_names(migration)</pre>
###
set.seed(3)
for (i in 1:100) {
  # Subsample
  r <- rarefy_even_depth(migration, sample.size = min_lib, verbose = FALSE, replace = TRUE)
  # Calculate richness
  rich <- as.numeric(as.matrix(estimate_richness(r, measures = "Observed")))</pre>
  richness[ ,i] <- rich</pre>
  # Calculate evenness
```

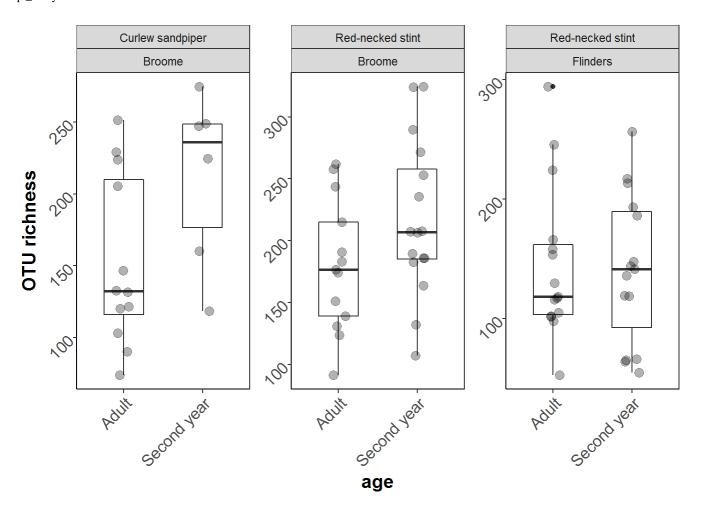
```
even <- as.numeric(as.matrix(estimate_richness(r, measures = "InvSimpson")))</pre>
  evenness[ ,i] <- even
SampleID <- row.names(richness)</pre>
mean <- apply(richness, 1, mean)</pre>
sd <- apply(richness, 1, sd)</pre>
measure <- rep("Richness", nsamp)</pre>
rich stats <- data.frame(SampleID, mean, sd, measure)
SampleID <- row.names(evenness)</pre>
mean <- apply(evenness, 1, mean)</pre>
sd <- apply(evenness, 1, sd)</pre>
measure <- rep("Inverse Simpson", nsamp)</pre>
even_stats <- data.frame(SampleID, mean, sd, measure)</pre>
s <- data.frame(sample_data(migration))</pre>
alphadiv_rich_observed <- merge(rich_stats, s, by = "row.names")
alphadiv_even_inverse <- merge(even_stats, s, by = "row.names")</pre>
#summary stats
tapply(alphadiv_rich_observed$mean, alphadiv_rich_observed$migration, summary)
```

```
## $`Broome-curlewsand-adult`
    Min. 1st Qu. Median
##
                         Mean 3rd Qu.
    74.05 116.02 132.22 152.53 210.12 251.35
##
##
## $`Broome-curlewsand-SY`
   Min. 1st Qu. Median Mean 3rd Qu.
                                        Max.
    118.6 176.5 236.0 212.4 248.5
                                        274.6
##
##
## $`Broome-stint-adult`
   Min. 1st Qu. Median
                         Mean 3rd Qu.
##
                                        Max.
##
    91.52 139.22 176.77 179.97 215.02 262.04
##
## $`Broome-stint-SY`
##
   Min. 1st Qu. Median Mean 3rd Qu.
                                        Max.
##
   107.2 185.0 206.9 216.7 257.8
                                        324.4
##
## $`Flinders-stint-adult`
                         Mean 3rd Qu.
##
    Min. 1st Qu. Median
                                        Max.
    52.94 103.52 118.65 145.55 162.16 294.01
##
##
## $`Flinders-stint-SY`
  Min. 1st Qu. Median Mean 3rd Qu.
##
                                        Max.
   54.81 92.65 141.46 141.66 189.76 256.55
##
```

```
unique(alphadiv_rich_observed$migration)
```

```
## [1] Broome-stint-SY Broome-stint-adult Broome-curlewsand-adult
```

```
## [4] Broome-curlewsand-SY Flinders-stint-adult
                                                      Flinders-stint-SY
## 6 Levels: Broome-curlewsand-adult ... Flinders-stint-SY
group1a<-subset(alphadiv_rich_observed, migration=="Broome-curlewsand-adult")
sd(group1a$mean)
## [1] 59.45963
group1b<-subset(alphadiv_rich_observed, migration=="Broome-curlewsand-SY")
sd(group1b$mean)
## [1] 60.1231
group2a<-subset(alphadiv_rich_observed, migration=="Broome-stint-adult")</pre>
sd(group2a$mean)
## [1] 53.34191
group2b<-subset(alphadiv_rich_observed, migration=="Broome-stint-SY")
sd(group2b$mean)
## [1] 62.84926
group3a<-subset(alphadiv_rich_observed, migration=="Flinders-stint-adult")
sd(group3a$mean)
## [1] 64.27512
group3b<-subset(alphadiv_rich_observed, migration=="Flinders-stint-SY")
sd(group3b$mean)
## [1] 62.57409
##observed richness
ggplot(alphadiv\_rich\_observed, aes(x = age, y = mean)) + geom\_boxplot(width=0.5) +
 geom_jitter(width=0.1, alpha = 0.3, size=3)+ylab("OTU richness")+
 theme(axis.text=element_text(size=12, angle=45, hjust=1), axis.title=element_text(size=14,fa
ce="bold"))+
 theme(panel.grid.major = element_blank(), panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.line = element_line(colour = "black"))+
  facet_wrap(species~site, scales="free", nrow=1, ncol=3)
```



```
set.seed(3)
for (i in 1:100) {
  # Subsample
 r <- rarefy_even_depth(migration, sample.size = min_lib, verbose = FALSE, replace = TRUE)
 # Calculate richness
 rich <- as.numeric(as.matrix(estimate_richness(r, measures = "Shannon")))</pre>
 richness[ ,i] <- rich</pre>
 # Calculate evenness
 even <- as.numeric(as.matrix(estimate_richness(r, measures = "InvSimpson")))</pre>
 evenness[ ,i] <- even
SampleID <- row.names(richness)</pre>
mean <- apply(richness, 1, mean)</pre>
sd <- apply(richness, 1, sd)</pre>
measure <- rep("Richness", nsamp)</pre>
rich_stats <- data.frame(SampleID, mean, sd, measure)</pre>
SampleID <- row.names(evenness)</pre>
mean <- apply(evenness, 1, mean)</pre>
sd <- apply(evenness, 1, sd)</pre>
```

```
measure <- rep("Inverse Simpson", nsamp)
even_stats <- data.frame(SampleID, mean, sd, measure)

s <- data.frame(sample_data(migration))

alphadiv_rich_observed <- merge(rich_stats, s, by = "row.names")
alphadiv_even_inverse <- merge(even_stats, s, by = "row.names")

#summary stats

tapply(alphadiv_rich_observed$mean, alphadiv_rich_observed$migration, summary)</pre>
```

```
## $`Broome-curlewsand-adult`
   Min. 1st Qu. Median Mean 3rd Qu.
##
                                       Max.
  1.449 2.263 2.585 2.624 3.128
                                       3.824
##
##
## $`Broome-curlewsand-SY`
   Min. 1st Qu. Median Mean 3rd Qu.
##
                                       Max.
    2.032 2.908 3.000 2.971 3.279
##
                                       3.545
##
## $`Broome-stint-adult`
  Min. 1st Qu. Median Mean 3rd Qu.
                                       Max.
   1.708 2.257 2.814 2.936 3.433
                                       4.546
##
##
## $`Broome-stint-SY`
##
   Min. 1st Qu. Median
                         Mean 3rd Qu.
                                       Max.
   1.744 2.803 3.176 3.112 3.381
                                       3.990
##
##
## $`Flinders-stint-adult`
   Min. 1st Qu. Median
                         Mean 3rd Qu.
##
                                       Max.
##
  1.392 2.244 2.717 2.723 3.307
                                       3.918
##
## $`Flinders-stint-SY`
##
   Min. 1st Qu. Median Mean 3rd Qu.
                                       Max.
## 0.6943 2.1060 2.6075 2.7683 3.8974 4.2952
```

```
unique(alphadiv_rich_observed$migration)
```

```
## [1] Broome-stint-SY Broome-stint-adult Broome-curlewsand-adult
## [4] Broome-curlewsand-SY Flinders-stint-adult Flinders-stint-SY
## 6 Levels: Broome-curlewsand-adult ... Flinders-stint-SY
```

```
groupla<-subset(alphadiv_rich_observed, migration=="Broome-curlewsand-adult")
sd(groupla$mean)</pre>
```

```
## [1] 0.720232
```

```
group1b<-subset(alphadiv_rich_observed, migration=="Broome-curlewsand-SY")
sd(group1b$mean)</pre>
```

[1] 0.5237586

```
group2a<-subset(alphadiv_rich_observed, migration=="Broome-stint-adult")
sd(group2a$mean)
## [1] 0.8243023
group2b<-subset(alphadiv_rich_observed, migration=="Broome-stint-SY")
sd(group2b$mean)
## [1] 0.5628283
group3a<-subset(alphadiv_rich_observed, migration=="Flinders-stint-adult")</pre>
sd(group3a$mean)
## [1] 0.7589452
group3b<-subset(alphadiv_rich_observed, migration=="Flinders-stint-SY")
sd(group3b$mean)
## [1] 1.137082
##observed richness
ggplot(alphadiv\_rich\_observed, aes(x = age, y = mean)) + geom\_boxplot(width=0.5) +
  geom_jitter(width=0.1, alpha = 0.3, size=3)+ylab("Shannon Index")+
  theme(axis.text=element_text(size=12, angle=45, hjust=1), axis.title=element_text(size=14,fa
ce="bold"))+
  theme(panel.grid.major = element_blank(), panel.grid.minor = element_blank(),
        panel.background = element_blank(), axis.line = element_line(colour = "black"))+
  facet_wrap(species~site, scales="free", nrow=1, ncol=3)
```

