Main_Figure_6

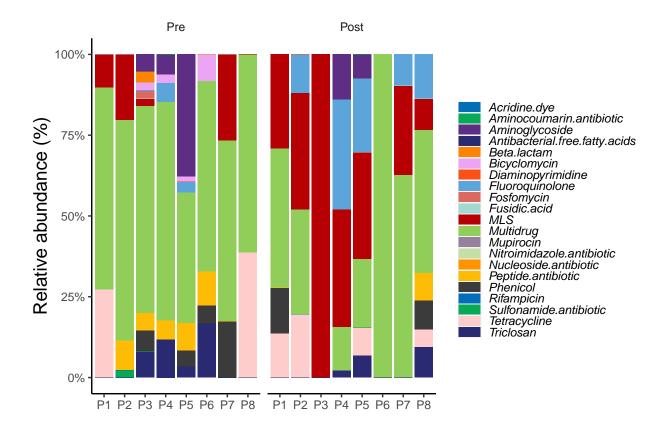
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```
#Knitr setup
knitr::opts chunk$set(echo = TRUE)
#Load required R packages
# Load required R packages
if (!require("pacman")) install.packages("pacman")
pacman::p_load(ggplot2, tidyverse, vegan, vcd, knitr,funrar,pheatmap,colorspace,ggpubr,RColorBrewer, re
#Load and wrangle taxonomic data
MasterANDGK <-read.csv(".../Data/R_input_files/MetaDataWsnfResults_GK_final_R2.csv")</pre>
cohort<-subset(MasterANDGK, is.na(SC_AMR_alt) == FALSE & SC_AMR_alt !=0)</pre>
cohort<-tail(cohort, n =16)</pre>
cohort <- cohort %>% #clinical variables + amr families
  as tibble() %>%
  select(-48:-373,-395:-714)
cohort$PseuDOM<-ifelse(cohort$DomBactOth_short == "Pseudomonas", "Pseudomonas", "other")</pre>
cohort$HaemDOM<-ifelse(cohort$DomBactOth_short == "Haemophilus", "Haemophilus", "other")</pre>
cohort$FEVfactor<-cut(cohort$FEV1, breaks=c(0, 30, 50, 70, Inf))</pre>
cohort$AetiologyN3<-ifelse(cohort$Aetiology_short == "postTB", "postInfect", cohort$Aetiology_short)</pre>
#set levels
cohort$ExacerbatorState <- factor(cohort$ExacerbatorState, levels=c("NonEx", "Exacerbator", "FreqEx"))</pre>
cohort$Country <- factor(cohort$Country, levels=c("SG", "KL", "DD", "MI"))</pre>
cohort$Aetiology_short <- factor(cohort$Aetiology_short, levels=c("idiopathic", "postInfect", "postTB",</pre>
cohort$DomBactOth_short <- factor(cohort$DomBactOth_short, levels=c("Pseudomonas", "Haemophilus", "Stre
cohort$SampleID <- factor(cohort$SampleID, levels = cohort$SampleID[order(cohort$SC_V)])</pre>
cohort$FEVfactor<-fct_rev(cohort$FEVfactor)</pre>
cohort <- cohort %>%
  gather (Resistome, RPKM, Acridine.dye, Aminocoumarin.antibiotic, Aminoglycoside, Antibacterial.free.fatty
cohort$PseuDOM <- factor(cohort$PseuDOM, levels = c("Pseudomonas", "other"))</pre>
cohort$HaemDOM <- factor(cohort$HaemDOM, levels = c("Haemophilus", "other"))</pre>
cohort$AetiologyN3 <- factor(cohort$AetiologyN3, levels = c("idiopathic", "postInfect", "other"))</pre>
# cohortMT<-subset(cohort, Matching == "Matched") #Matched data</pre>
# cohortPR<-subset(cohort, Paired == "Pair")</pre>
# cohortTR<-subset(cohort, Trio != "NonTrio")</pre>
# cohortUM<-subset(cohort, Matching == "UnMatched")</pre>
# cohort$CTRL<-ifelse(is.na(cohort$Age), "CTRL", "PATIENT")</pre>
cohort$ReadsNonHuman <- factor(cohort$ReadsNonHuman, levels=c("Pre", "Post"))</pre>
cohort$ReadsTrimmed <- factor(cohort$ReadsTrimmed, levels = c("P1", "P2", "P3", "P4", "P5", "P6", "P7",
```

#Figure 6A

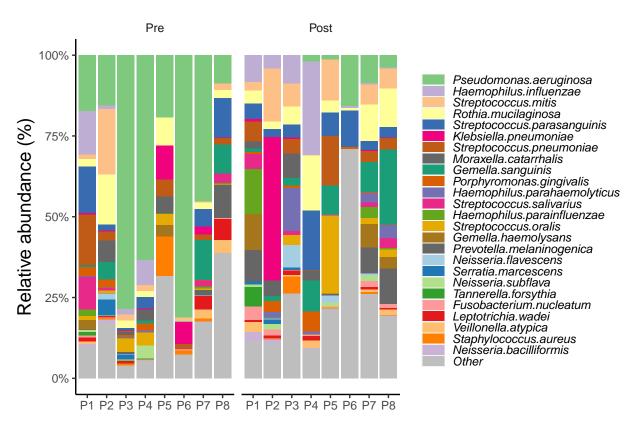
```
AMR_GK<-ggplot(data=cohort,aes(x=ReadsTrimmed, y=RPKM, fill=Resistome))+
  geom_bar(aes(), stat="identity", position = "fill") +
  scale_fill_manual(values = c("#026EB8","#06A955","#5D2E83","#2A2A73","#fc8403","#EBA5F3","#fc5017","#
  scale_y_continuous(labels = scales::percent)+
  \#scale\_x\_discrete(labels = c('Non-diseased', 'Bronchiectasis')) +
  theme(legend.position="right",
        #axis.text=element_blank(),
        #axis.title=element blank(),
        axis.title=element_text(size=14),
        #axis.text.x = element_blank(),
        \#axis.text.x = element\_text(angle = 90),
       panel.background = element_rect(fill = NA),
        axis.line = element line(size = 0.5, colour = "black"),
       legend.title = element_blank(),
        legend.text = element_text(face = "italic", size = 9),
        legend.key.height = unit(1.5, "mm"))+
  guides(fill=guide_legend(ncol=1), size = .1)+
  xlab("")+
  ylab("Relative abundance (%)")+
  facet_wrap(~cohort$ReadsNonHuman, scales="free_x")+
  theme(
   strip.background = element_rect(
      color="white", fill="white", size=1, linetype="solid"),
    \#strip.text.x = element\_blank()
  )
AMR_GK
```



#Figure 6B

```
MasterGK <-read.csv("../Data/R_input_files/GK_master_Taxa25_R2.csv") # Top 25 taxa
AMRGK <- MasterGK %>%
  as tibble() %>%
  select(1:50)
AMR cols<-colnames(AMRGK[14:39])
AMRGK <- AMRGK %>%
  gather (AMR, RPKM, AMR_cols, -SampleSeqNo, -SputumSampleNo, -TypeSamples, -TypeSamplesA, -TypeSamplesB
AMRGK$AMR <- factor(AMRGK$AMR, levels = AMR_cols )</pre>
AMRGK$TypeSamples <- factor(AMRGK$TypeSamples , levels = c("Pre", "Post"))
AMRGK<-AMRGK[is.na(AMRGK$TypeSamples) != TRUE, , drop = FALSE]
n <- 56
qual_col_pals = brewer.pal.info[brewer.pal.info$category == 'qual',]
col_vector = unlist(mapply(brewer.pal, qual_col_pals$maxcolors, rownames(qual_col_pals)))
col vector spec<-replace(col vector, 26, "grey") #</pre>
TAXA_GK<-ggplot(data=AMRGK,aes(x=SputumSampleNo
, y=RPKM, fill=AMR))+
  scale_fill_manual(values = col_vector_spec) +
  geom bar(aes(), stat="identity", position = 'fill')+
  scale_y_continuous(labels = scales::percent)+
  \#scale\_x\_discrete(labels = c('IP', 'PI', 'PTB', "other")) +
```

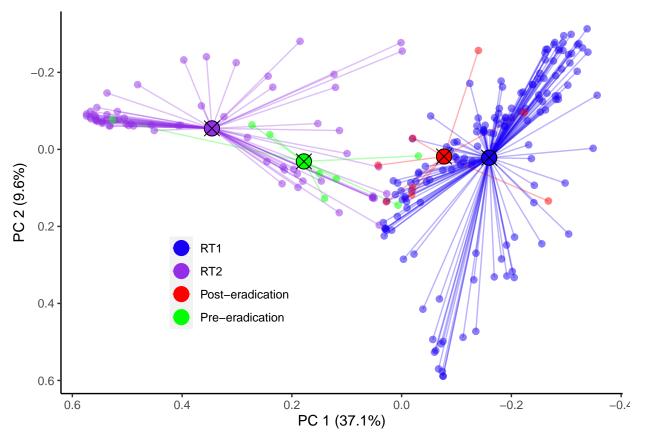
```
theme(legend.position="right",
        #axis.text=element_blank(),
        #axis.title=element_blank(),
        axis.title=element_text(size=14),
        #axis.text.x = element_blank(),
        \#axis.text.x = element_text(angle = 90),
        panel.background = element_rect(fill = NA),
        axis.line = element line(size = 0.5, colour = "black"),
        legend.title = element blank(),
        legend.text = element_text(face = "italic", size = 9),
        legend.key.height = unit(1.5, "mm"))+
  guides(fill=guide_legend(ncol=1), size = .1)+
  xlab("")+
  ylab("Relative abundance (%)")+
  facet_wrap(~AMRGK$TypeSamples, scales="free_x")+
  scale_x_discrete(labels = c("P1","P2","P3","P4","P5","P6","P7","P8")) +
  theme(
    strip.background = element_rect(
      color="white", fill="white", size=1, linetype="solid"),
    #strip.text.x = element_blank()
TAXA_GK
```



#Figure 6C

```
Master <-read.csv(".../Data/R_input_files/MetaDataWsnfResults_GK_final_R2.csv") %>%
   #Master <-read.csv("R_input_files/MetaDataWsnfResults_3.5temp_TJ.csv") %>% # v 3.3 includes raw read
   as_tibble()
AMR_diversity <- Master %>%
   subset(is.na(SC_AMR_alt)==FALSE) %>%
   as_tibble() %>%
   select(1:1,395:673) #for genes
#select(1:1,374:394) #for amr drug class
NAMES_list <- AMR_diversity$SampleID</pre>
main_data <- AMR_diversity[AMR_diversity$SampleID %in% NAMES_list, ]
AMR_diversity <- as.matrix (AMR_diversity)
rownames(AMR_diversity) <- AMR_diversity[,1]</pre>
AMR_diversity = as.data.frame(subset(AMR_diversity, select = -c(SampleID) ))
AMR_diversity[] <- lapply(AMR_diversity, as.numeric)</pre>
AMR_diversity<-AMR_diversity[row.names(AMR_diversity)] != "TBS672", , drop = FALSE]
isZero <- base::rowSums(AMR_diversity) == 0</pre>
AMR_diversity<-AMR_diversity[!isZero,]
MasterVIZ = Master
MasterVIZ <- MasterVIZ[ MasterVIZ$SampleID %in% row.names(AMR_diversity), ]
diversiytty<-as.data.frame(diversity(AMR_diversity, index = "shannon"))</pre>
vegdist(AMR_diversity, "bray")-> Mbiome_PCoA
as.matrix(Mbiome_PCoA)->Mbiome_PCoA
BrayCurtMbiome=cmdscale(Mbiome_PCoA)
#ordiplot (BrayCurtMbiome, display = 'species', type = 'text')
BCords <-scores (BrayCurtMbiome)
BCords<-(as.data.frame(t(BCords)))</pre>
BCords <- as.data.frame(t(BCords))
MasterVIZ$Dim1<-BCords$Dim1
MasterVIZ$Dim2<-BCords$Dim2
MasterVIZ$Country <- factor(MasterVIZ$Country, levels = c("SG", "KL", "DD", "MI"))</pre>
MasterVIZ$Aetiology_short<- factor(MasterVIZ$Aetiology_short, levels=c("idiopathic", "postInfect", "
MasterVIZ$PrePost<-ifelse(MasterVIZ$ReadsNonHuman == "Pre", "Pre", NA)
MasterVIZ$PrePost<-ifelse(MasterVIZ$ReadsNonHuman == "Post", "Post", MasterVIZ$PrePost)</pre>
MasterVIZ$PrePost<-ifelse(is.na(MasterVIZ$PrePost) == TRUE, MasterVIZ$SC_AMR_alt, MasterVIZ$PrePost)
gg <- data.frame(cluster=factor(MasterVIZ$PrePost), x=MasterVIZ$Dim1, y=MasterVIZ$Dim2, grp=MasterVIZ$S
# calculate group centroid locations
centroids <- aggregate(cbind(x,y)~cluster,data=gg,mean)</pre>
# merge centroid locations into ggplot dataframe
gg <- merge(gg,centroids,by="cluster",suffixes=c("",".centroid"))</pre>
# generate star plot...
PA_erd_PCA<-ggplot(gg) +
   #scale_col_manual(values=c(16, 16, 16, 16))+
   scale_linetype_identity() +
   geom_segment(aes(x=x.centroid, y=y.centroid, xend=x, yend=y, colour = cluster),alpha = 0.3)+
```

```
geom_point(aes(x=x,y=y, colour = cluster), size = 2, alpha = 0.5) + #can add ",shape = shape" in aes
  \#geom\_point(aes(x=x,y=y, colour = cluster, shape = shape), size = 2) +
  geom_point(data=centroids, aes(x=x, y=y, color=cluster), size=5) +
  geom_point(data=centroids, aes(x=x, y=y, color=cluster), size=5, shape = 13, colour = "black") +
  scale_colour_manual(values = c("#1800F5","#932DE7", "red", "green"), labels = c("RT1", "RT2", "Post-ender the colour_manual (values = c("#1800F5","#932DE7", "red", "green"), labels = c("#1800F5", "#932DE7")
  labs(colour="",
        x = "PC 1 (37.1\%)", y = "PC 2 (9.6\%)")+
  theme(legend.position=c(0.3,0.3),
         legend.title = element_blank(),
         axis.line = element_line(size = 0.5, colour = "black"),
         panel.background = element_rect(fill = NA),
  )+
  scale_y_reverse()+
  scale_x_reverse()+
  guides(colour = guide_legend(reverse = FALSE))
PA_erd_PCA
```



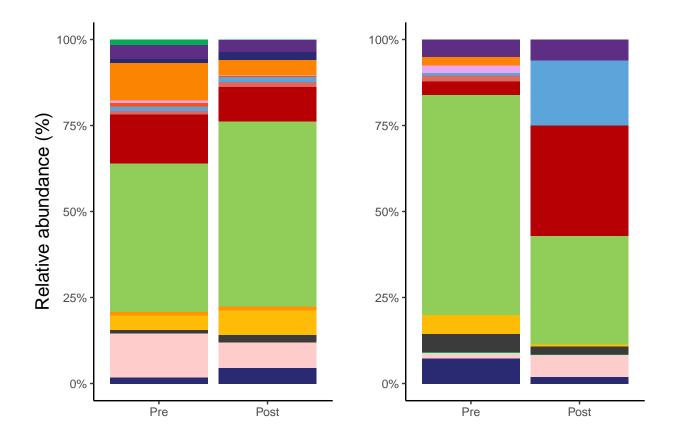
```
# checkEig<-capscale(AMR_diversity ~1)
# Eig <-eigenvals(checkEig)
# print(Eig[1:2] / sum(Eig))

Adonis_ERD<-tail(AMR_diversity, 16)
Adonis_ERD_meta<-tail(MasterVIZ, 16)

adonis2(Adonis_ERD~ReadsNonHuman , data = Adonis_ERD_meta, method = "bray",permutations=9999, strata = ...</pre>
```

```
## Permutation test for adonis under reduced model
## Terms added sequentially (first to last)
## Blocks: strata
## Permutation: free
## Number of permutations: 255
## adonis2(formula = Adonis ERD ~ ReadsNonHuman, data = Adonis ERD meta, permutations = 9999, method =
##
                 Df SumOfSqs
                                  R2
                                          F Pr(>F)
## ReadsNonHuman 1 0.6139 0.09332 1.4409 0.01562 *
## Residual
               14
                     5.9643 0.90668
## Total
                15 6.5782 1.00000
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
#Figure 6D
##Longitudinal AMR data Exacerbation cohort ####
MasterLT <-read.csv("../Data/R_input_files//LT_master_combined_8.0.csv")</pre>
AMRLT <- MasterLT %>%
  as_tibble() %>%
 select(-14:-230)
AMR cols<-colnames(AMRLT[14:34])
AMRLT <- AMRLT %>%
  gather(AMR, RPKM, AMR_cols, -SampleSeqNo, -SputumSampleNo, -TypeSamplesA, -TypeSamplesA, -TypeSamplesB
AMRLT$TmToNxtEx <- factor(AMRLT$TmToNxtEx , levels = c("MoreThan12w", "LessThan12w"))
AMRLT$Exacerbations <- factor(AMRLT$Exacerbations , levels = c("NFE", "FE"))
relapse.labs <- c(
  LessThan12w = "<12 w",
  `MoreThan12w` = ">12 w")
AMRLT$FEV170<-ifelse(AMRLT$FEV1 >70, ">70", "<70")
AMRLTctrols<-subset(AMRLT, is.na(TypeSamplesB))</pre>
#drop the controls stable
AMRLT<-subset(AMRLT, is.na(Severity) != TRUE)</pre>
Fig6D_L<-ggplot(data=AMRLT[which(AMRLT$TypeSamplesB == "BSL" | AMRLT$TypeSamplesB == "P")
,],aes(x=TypeSamplesB, y=RPKM, fill=AMR))+
  geom_bar(aes(), stat="identity", position="fill") +
  scale_fill_manual(values = c("#026EB8","#06A955","#5D2E83","#2A2A73","#fc8403","#EBA5F3","#fc5017","#
  scale y continuous(labels = scales::percent)+
  scale_x_discrete(labels = c('Pre', 'Post'))+
    theme(legend.position="right",
        #axis.text=element_blank(),
        #axis.title=element_blank(),
        axis.title=element_text(size=14),
        #axis.text.x = element_blank(),
        \#axis.text.x = element\_text(angle = 90),
        panel.background = element_rect(fill = NA),
        axis.line = element_line(size = 0.5, colour = "black"),
        legend.title = element_blank(),
        legend.text = element_text(face = "italic", size = 9),
        legend.key.height = unit(1.5, "mm"))+
  guides(fill=guide_legend(ncol=1), size = .1)+
  xlab("")+
  ylab("Relative abundance (%)")+
```

```
theme(
   strip.background = element_rect(
     color="white", fill="white", size=1, linetype="solid"),
   strip.text.x = element_blank(),
   #legend.text=element_text(size=8)
   legend.position="none"
#Plottina
Fig6D_R<-ggplot(data=cohort,aes(x=ReadsNonHuman, y=RPKM, fill=Resistome))+
 geom_bar(aes(), stat="identity", position = "fill") +
 scale fill manual(values = c("#026EB8","#06A955","#5D2E83","#2A2A73","#fc8403","#EBA5F3","#fc5017","#
 scale_y_continuous(labels = scales::percent)+
 #scale_x_discrete(labels = c('Non-diseased', 'Bronchiectasis'))+
 theme(legend.position="right",
       #axis.text=element_blank(),
       #axis.title=element_blank(),
       axis.title=element_text(size=14),
       #axis.text.x = element_blank(),
       #axis.text.x = element_text(angle = 90),
       panel.background = element_rect(fill = NA),
       axis.line = element_line(size = 0.5, colour = "black"),
       legend.title = element_blank(),
       legend.text = element_text(face = "italic", size = 9),
       legend.key.height = unit(1.5, "mm"))+
 guides(fill=guide_legend(ncol=1), size = .1)+
 xlab("")+
 ylab("")+
 #facet_wrap(~cohort$ReadsNonHuman, scales="free_x")+
 theme(
   strip.background = element_rect(
     color="white", fill="white", size=1, linetype="solid"),
   #strip.text.x = element_blank()
 )
Fig6D<-ggarrange(Fig6D_L,Fig6D_R,</pre>
                  font.label = list(size = 5),
                  common.legend = TRUE, nrow = 1, legend = "none") #this one
Fig6D
```



Permutation test for adonis under reduced model ## Terms added sequentially (first to last) ## Blocks: strata ## Permutation: free ## Number of permutations: 255 ## ## adonis2(formula = Adonis_ERD ~ ReadsNonHuman, data = Adonis_ERD_meta, permutations = 9999, method = Df SumOfSqs F Pr(>F) R2 0.6139 0.09332 1.4409 0.01562 * ## ReadsNonHuman 1 5.9643 0.90668 ## Residual 14 ## Total 15 6.5782 1.00000 ## ---## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1

adonis2(Adonis_ERD~ReadsNonHuman , data = Adonis_ERD_meta, method = "bray",permutations=9999, strata = .