## Vgenes clinical and microbiome

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## Contents

```
############## Set up workspace
rm(list = ls())
library(edgeR)
library(EDASeq)
library(DESeq2)
library(knitr)
library(tidyverse)
library(magrittr)
library(stats)
library(readxl)
library(openxlsx)
# multiple testing
library(mutoss)
options(stringsAsFactors = F)
options(dplyr.width = Inf)
getwd()
## [1] "/home/guanshim/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataRaw/Vgenes"
## not in function
"%nin%" <- Negate("%in%")
# ####### clean memory ############### rm(list =
\# ls()) qc() is(dds) slotNames(dds)
# remapping Hi-seq2 with moderate threshold rna-seq cnts data
# ################
cnts_raw <- read_excel("HIV_Infected_vs_Uninfected_relaxed_mapping_geneCounts.xlsx")</pre>
head(cnts_raw)
## # A tibble: 6 x 35
##
            Gene_ID
                                                          Symbol
                                                                                   Length `138` `178` `255` `278` `361` `404`
            <chr>>
                                                          <chr>
                                                                                      <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
## 1 ENSG00000275877.1 5_8S_rRNA
                                                                                          152
                                                                                                               0
                                                                                                                              0
                                                                                                                                             0
                                                                                                                                                             0
                                                                                                                                                                            1
                                                                                           151
                                                                                                                              0
                                                                                                                                             0
                                                                                                                                                             0
                                                                                                                                                                            0
## 2 ENSG00000283274.1 5_8S_rRNA
                                                                                                               0
                                                                                                                                                                                           0
## 3 ENSG00000212595.1 5S_rRNA
                                                                                           112
                                                                                                               0
                                                                                                                              0
                                                                                                                                             0
                                                                                                                                                             0
                                                                                                                                                                            0
                                                                                                                                                                                           0
## 4 ENSG00000274059.1 5S_rRNA
                                                                                             84
                                                                                                                              0
                                                                                                                                              0
                                                                                                                                                             1
                                                                                                                                                                            1
                                                                                                                                                                                           0
## 5 ENSG00000274408.1 5S_rRNA
                                                                                           123
                                                                                                               0
                                                                                                                              0
                                                                                                                                              0
                                                                                                                                                             0
                                                                                                                                                                            0
                                                                                                                                                                                           0
## 6 ENSG00000274663.1 5S_rRNA
                                                                                             87
                                                                                                               0
                                                                                                                              0
                                                                                                                                              0
             `493` `582` `708` `716` `914` `947` `972` `124` `132` `154` `188`
##
            <dbl> 
## 1
                                                                                                                 0
                      0
                                     0
                                                     0
                                                                    0
                                                                                   0
                                                                                                  0
                                                                                                                                 0
                                                                                                                                                1
                                                                                                                                                               2
## 2
                      0
                                     0
                                                     1
                                                                    1
                                                                                   0
                                                                                                  0
                                                                                                                 0
                                                                                                                                 0
                                                                                                                                                0
                                                                                                                                                                1
                                                                                                                                                                                              0
                      2
                                     0
                                                                                   0
                                                                                                  0
                                                                                                                 0
                                                                                                                                                2
                                                                                                                                                                                             0
## 3
                                                     0
                                                                    0
                                                                                                                                 0
                                                                                                                                                               0
                                                                                                                                                                               0
                                     0
                                                                 10
                                                                                   0
                                                                                                  0
                                                                                                                                                0
                                                                                                                                                                                              0
## 5
                      0
                                     0
                                                     0
                                                                    0
                                                                                                  0
                                                                                                                 0
                                                                                                                                                0
                                                                                                                                                                                             0
                                                                                   1
                                                                                                                                                               0
```

```
0
##
           `307`
                       `391`
                              `428`
                                    `594`
                                          `622`
                                                       `683`
                                                             `819`
     `286`
                 `323`
                                                `648`
                                                                   `825`
                                                                          `839`
                             <dbl>
                                                       <dbl>
     <dbl> <dbl> <dbl> <dbl> <dbl>
                                    <dbl> <dbl> <dbl>
                                                             <dbl> <dbl>
## 1
         Ω
               0
                            0
                                  2
                                        0
                                                     0
                                                                       0
                     0
                                              1
                                                           0
                                                                 0
## 2
         0
               0
                     0
                            0
                                  0
                                        0
                                              0
                                                           0
                                                                 1
                                                                              1
## 3
         0
               0
                            0
                                  0
                                        0
                                              3
                                                    0
                                                           0
                                                                             0
                     0
                                                                 0
                                  0
                                        0
                                                           0
               0
                     0
                            0
                                        0
## 5
         0
               0
                     0
                            0
                                  0
                                              0
                                                    0
                                                           0
                                                                 0
                                                                             0
## 6
         0
               0
                            0
                                  0
                                        0
##
     `965`
           `998`
     <dbl> <dbl>
## 1
         0
## 2
         0
               0
## 3
         0
               0
## 4
         0
               1
## 5
         0
               0
## 6
         0
               1
vgenes <- read_excel("/home/guanshim/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vgenes/
head(vgenes)
## # A tibble: 6 x 3
##
       Num Vsymbols Type
     <dbl> <chr>
## 1
         1 IGHV1-18 heavy
         2 IGHV1-2 heavy
## 2
## 3
         3 IGHV1-24 heavy
         4 IGHV1-3 heavy
## 5
         5 IGHV1-45 heavy
         6 IGHV1-46 heavy
###### clinical and microbiome data ########
clin_micro <- read_excel("/home/guanshim/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vge.</pre>
head(clin_micro)
## # A tibble: 6 x 80
                              Age HIV
##
                    Gender
                                          pid id1
                                                        `CD4 count (cells/ul)`
##
                    <chr> <dbl> <chr> <dbl> <chr>
                                                                          <dbl>
     <dbl> <chr>
         1 MIHIV138 M
                               29 no
                                          138 MIHIV138
                                                                           728
                                          178 MIHIV178
## 2
         2 MIHIV178 M
                               33 no
                                                                           736
         3 MIHIV255 M
                                                                           588
                               34 no
                                          255 MIHIV255
         4 MIHIV278 M
                               23 no
                                          278 MIHIV278
                                                                           532
         5 MIHIV361 F
                               33 no
                                          361 MIHIV361
                                                                           720
         6 MIHIV404 F
                                          404 MIHIV404
                                                                           1071
## 6
                               29 no
```

<dbl> <chr>

0.182 MIHIV138

`IL-6 (pg/ml)` `CRP (mg/ml)` `iFABP (pg/ml)` `sCD27 (U/ml)`

<dbl>

1863.

2363.

1517.

2800.

5352.

547.

<dbl>

36.2

43.2

29.3

32.5

27.5

37.4

<dbl>

0.25

0.65

0.7

0.44

3.36

12.4

##

##

## ##

## 1

id2

## 1 MIHIV138

## 2 MIHIV178

## 3 MIHIV255

## 4 MIHIV278

## 5 MIHIV361

## 6 MIHIV404

<chr>

<dbl>

2.16

0.51

0.69

0.73

0.19

1.35

<dbl>

1633.

`CD14 (ng/ml)` `LPS (pg/ml)` `LTA $\n(OD)$ ` id3

<dbl>

9.52

```
9.80
## 2
              2073.
                                         0.381 MIHIV178
## 3
              1605.
                             14.5
                                         0.104 MIHIV255
## 4
              2146.
                              7.45
                                         0.120 MIHIV278
## 5
                              8.68
              1940.
                                          0.162 MIHIV361
## 6
              1184.
                              9.70
                                         0.192 MIHIV404
##
     `CD38+ HLA-DR+ CD4 T cells (% of CD4 T cells)`
## 1
                                                1.18
## 2
                                                0.828
## 3
                                                0.896
## 4
                                                0.764
## 5
                                                0.637
## 6
                                                0.510
##
     `CD38+ HLA-DR+ CD8 T cells (% of CD8 T cells)` id4
##
                                                <dbl> <chr>
## 1
                                                2.32 MIHIV138
## 2
                                                1.59 MIHIV178
## 3
                                                1.61 MIHIV255
## 4
                                                1.77 MIHIV278
## 5
                                                0.772 MIHIV361
## 6
                                                1.75 MIHIV404
     `CD4 T cells (% viable)` `CD8 T cells (% viable)` id5
                                                   <dbl> <chr>
##
                         <dbl>
## 1
                          35.5
                                                   12.4 MIHIV138
## 2
                          35.7
                                                   15.9 MIHIV178
## 3
                          34.3
                                                    6.79 MIHIV255
## 4
                          27.5
                                                   16.1 MIHIV278
## 5
                          34.7
                                                   18.1 MIHIV361
## 6
                          27.1
                                                    4.08 MIHIV404
     `Tissue HIV RNA (per CD4 T cell)` `Plasma VL` id6
                                                               Actinobacteria
##
                                  <dbl>
                                               <dbl> <chr>
                                                                        <dbl>
## 1
                                     NA
                                                  NA MIHIV138
                                                                      0.00829
## 2
                                     NA
                                                  NA MIHIV178
                                                                      0.0330
## 3
                                     NA
                                                  NA MIHIV255
                                                                      0.00864
## 4
                                      NA
                                                  NA MIHIV278
                                                                      0.00924
## 5
                                     NA
                                                  NA MIHIV361
                                                                      0.00361
                                     NA
                                                  NA MIHIV404
##
    Bacteroidetes Cyanobacteria Firmicutes Fusobacteria Proteobacteria
##
             <dbl>
                            <dbl>
                                        <dbl>
                                                     <dbl>
                                                                     <dbl>
             0.282
## 1
                        0.000316
                                       0.577
                                                                   0.00732
                                                0
## 2
             0.509
                        0
                                       0.394
                                                0
                                                                   0.0236
## 3
             0.343
                        0
                                       0.544
                                                0.00000840
                                                                   0.0831
## 4
             0.224
                                       0.720
                                                                   0.0193
## 5
             0.192
                        0.0000461
                                       0.743
                                                0
                                                                   0.0453
             0.323
                        0.00285
                                        0.334
                                                0.0000828
                                                                   0.223
     Spirochaetes Tenericutes Verrucomicrobia id7
                                                         Prevotellaceae
##
            <dbl>
                         <dbl>
                                          <dbl> <chr>
                                                                   <dbl>
## 1
        0
                     0
                                       0
                                                MIHIV138
                                                               0.0000264
## 2
        0
                     0
                                       0
                                                MIHIV178
                                                               0.000300
## 3
        0.00190
                     0.0000168
                                       0.00364 MIHIV255
                                                               0.000126
## 4
                     0.00414
                                       0.00924 MIHIV278
        0
                                                               0.00163
## 5
                                       0.000221 MIHIV361
                                                               0.000157
## 6
        0.0000166
                     0
                                       0.0413
                                                MIHIV404
                                                               0.0000828
   Bacteroidaceae Rikenellaceae Porphyromonadaceae Lachnospiraceae
```

```
##
            <dbl>
                      <dbl>
                                         <dbl>
                                                        <dbl>
                     0.0124
## 1
            0.227
                                        0.0329
                                                        0.239
## 2
            0.468
                      0.00252
                                       0.0232
                                                        0.304
## 3
            0.209
                       0.0150
                                        0.0307
                                                        0.374
## 4
            0.174
                       0.0155
                                        0.0203
                                                        0.216
## 5
                       0.0312
                                        0.00193
                                                        0.488
            0.145
            0.256
                       0.0110
                                        0.0471
   Christensenellaceae Ruminococcaceae Xanthomonadaceae Moraxellaceae
##
                 <dbl>
                             <dbl>
                                              <dbl>
                                                           <dbl>
## 1
              0
                             0.123
                                         0.00105
                                                        0.000626
## 2
             0
                             0.0491
                                         0.0000364
                                                        0.00679
## 3
             0.0111
                             0.111
                                         0.00000840
                                                        0.00499
             0.152
                             0.293
                                         0.0000739
                                                        0.00466
## 5
             0.000267
                             0.187
                                         0.000129
                                                        0.00112
## 6
             0.0119
                             0.102
                                         0.000927
                                                        0.0424
## Brucellaceae Rhodospirillaceae id8
                                        Bacteroides Barnesiella
##
          <dbl>
                          <dbl> <chr>
                                             <dbl>
                                                        <dbl>
                                             0.227
## 1
       0
                        0.000185 MIHIV138
                                                    0.0117
## 2
       0.0000545
                        0
                                MIHIV178
                                            0.468
                                                   0.0000182
                                                   0.00223
## 3
                        0.00386 MIHIV255
                                             0.209
                                                    0.0104
## 4
      0
                        Ω
                                MIHIV278
                                             0.174
## 5
                        0.000101 MIHIV361
                                             0.145
                        0.00520 MIHIV404
## 6
     0
                                             0.256
                                                   0
## Prevotella Alistipes Blautia Coprococcus Thalassospira Acinetobacter
##
        <dbl> <dbl> <dbl> <dbl> <dbl>
                                                            <dbl>
## 1 0.0000264 0.0124 0.0350
                              0.00876
                                             0.000185
                                                          0.000626
## 2 0.000291
               0.00252 0.0452
                               0.0205
                                             0
                                                          0.00679
## 3 0.000126
              0.0150 0.0419
                               0.00238
                                             0.00386
                                                          0.00499
## 4 0.00155
             0.0154 0.0733 0.0205
                                             0
                                                          0.00466
## 5 0.000147 0.0312 0.0612
                              0.0279
                                             0.000101
                                                          0.000627
## 6 0.0000662 0.0110 0.0275 0.000977
                                             0.00520
                                                          0.0393
##
    id9
            `P. copri` `P. stercorea` `P. oris`
##
    <chr>>
               <dbl> <dbl> <dbl>
## 1 MIHIV138 0.0000221
                          0 0
## 2 MIHIV178 0.000188
                          0.0000659 0.00000942
## 3 MIHIV255 0.0000898
                          0.0000539 0
## 4 MIHIV278 0.000921
                         0.000537 0.0000768
## 5 MIHIV361 0.0000935 0.0000374 0.0000187
## 6 MIHIV404 0.0000528 0.0000176 0.0000176
    `Acidaminococcus\nintestini` `Acinetobacter\njunii`
##
##
                        <dbl>
## 1
                                         0.000251
                    0
## 2
                                          0.00107
                    Ω
## 3
                    0.00000898
                                         0.00444
## 4
                                         0.00130
## 5
                                         0.0000374
                    0
                    0.0651
## 6
                                          0.00772
    <dbl> <chr>
                                                             <dbl>
## 1
                            0
                                   MIHIV138
                                                         0
## 2
                           0
                                   MIHIV178
                                                         0.104
## 3
                           0
                                   MIHIV255
                                                         0.0351
## 4
                           0
                                   MIHIV278
                                                         0.0291
## 5
                           0
                                   MIHIV361
                                                         0.0000374
```

```
0.000123 MIHIV404
## 6
                                                                   0.00799
     `Bacteroides\nthetaiotaomicron` `Bacteroides\ndorei`
##
                                <dbl>
## 1
                              0.00584
                                                   0.000450
## 2
                              0.0160
                                                   0.000320
## 3
                              0.00600
                                                   0.00668
## 4
                              0.00883
                                                   0.00791
## 5
                              0.00713
                                                   0.000355
## 6
                              0.0607
                                                   0.00827
     `Bacteroides\nacidifaciens` `Barnesiella\nintestinihominis`
                            <dbl>
                        0.000111
                                                        0.0128
## 1
## 2
                        0.0000942
                                                        0.00000942
## 3
                        0.000108
                                                        0.00379
## 4
                                                        0.0104
## 5
                        0.00160
                                                        0.00000935
## 6
                        0.0000704
     `Blautia\nluti` `Blautia\nglucerasei` `Blautia\nschinkii`
##
                                      <dbl>
               <dbl>
                                                           <dbl>
## 1
            0.0125
                                  0.0171
                                                       0.000177
## 2
            0.0210
                                  0.000443
                                                       0.000122
## 3
            0.00568
                                  0.0000180
## 4
            0.0214
                                  0
                                                       0.0139
## 5
            0.0335
                                  0.0187
                                                       0.00433
## 6
            0.000880
                                  0.000862
                                                       0.0000176
     `Ruminococcus\nbromii` `Clostridium\nsaccharogumia` ids1
                                                                    iga_smu
##
                      <dbl>
                                                     <dbl> <chr>
                                                                      <dbl>
## 1
                 0.00000738
                                                   0.00739 138_IgA
                                                                       24.3
## 2
                 0.0000188
                                                                       24.9
                                                           178_IgA
                                                   0.00941 255_IgA
                 0.00217
                                                                       23.2
## 4
                 0.0625
                                                   0.00376 278_IgA
                                                                       24.7
## 5
                 0.0124
                                                   0.00639 361_IgA
                                                                       22.3
## 6
                 0
                                                   0.00174 404_IgA
                                                                       18.8
##
     ids2
            igk_smu ids3
                            igl_smu
     <chr>
              <dbl> <chr>
                              <dbl>
## 1 138 VK
            10.9 138_V
                              18.1
## 2 178 VK
             11.2 178 V
                              13.6
## 3 255_VK
              11.3 255_V
                              15
## 4 278_VK
              15.5 278 V
## 5 361_VK
               9.22 361_V
## 6 404 VK
              14.2 404_V
sample_size <- length(clin_micro$pid)</pre>
sample_size
## [1] 32
# global regular expression test all ids in the clin micro
idtest <- 1:sample_size</pre>
for (i in 1:sample_size) {
    idtest[i] <- (grep1(clin_microspid[i], clin_microsID[i],</pre>
        fixed = T) == T)
}
idtest
```

```
ids <- paste("id", as.character(1:10), sep = "")</pre>
for (i in ids) {
    idtest[i] <- sum(clin_micro$ID != clin_micro[, colnames(clin_micro) ==</pre>
}
idtest
##
##
      1
                                  1
                                        1
                                                                                     1
            1
                  1
                       1
                             1
                                              1
                                                   1
                                                         1
                                                                    1
                                                                               1
##
##
                                                                               1
                                                                                     1
      1
            1
                  1
                       1
                             1
                                  1
                                        1
                                              1
                                                   1
                                                         1
                                                               1
                                                                    1
                                                                          1
##
               id1
                     id2
                           id3
                                id4
                                      id5
                                           id6
                                                 id7
                                                      id8
                                                            id9 id10
##
                  0
                       0
                             0
                                  0
                                        0
                                             0
                                                         0
                                                              0
            1
                                                   0
for (i in 1:sample_size) {
    idtest[i] <- (grep1(clin_micro$pid[i], clin_micro$ids1[i],</pre>
         fixed = T) == F
}
idtest
##
##
                                                                               0
                                                                                     0
##
                                                               0
                                                                    0
                                                                               0
                                                                                     0
##
      0
                  0
                       0
                             0
                                  0
                                        0
                                              0
                                                   0
                                                         0
##
               id1
                     id2
                           id3
                                id4
                                      id5
                                           id6
                                                 id7
                                                       id8
                                                            id9 id10
##
                  0
                       0
                             0
                                  0
                                        0
                                             0
                                                   0
                                                         0
                                                               0
for (i in 1:sample_size) {
    idtest[i] <- (grep1(clin_micro$pid[i], clin_micro$ids2[i],</pre>
         fixed = T) == T)
}
idtest
##
##
            1
                       1
                                        1
                                                                               1
                                                                                     1
##
##
                                        1
                                                   1
                                                                               1
                                                                                     1
##
                     id2
                           id3
                                      id5
                                           id6
                                                       id8
               id1
                                id4
                                                 id7
                                                            id9 id10
##
            1
                  0
                       0
                             0
                                  0
                                        0
                                             0
                                                   0
                                                         0
                                                              0
for (i in 1:sample_size) {
    idtest[i] <- (grep1(clin_micro$pid[i], clin_micro$ids3[i],</pre>
         fixed = T) == F
}
idtest
##
##
      0
            0
                       0
                             0
                                  0
                                        0
                                              0
                                                   0
                                                         0
                                                                    0
                                                                               0
                                                                                     0
##
##
      0
            0
                  0
                       0
                             0
                                  0
                                        0
                                             0
                                                   0
                                                         0
                                                               0
                                                                    0
                                                                          0
                                                                               0
                                                                                     0
##
               id1
                     id2
                          id3
                                id4
                                     id5
                                           id6
                                                 id7
                                                      id8
                                                            id9 id10
##
                       0
                             0
                                  0
                                        0
                                             0
                                                   0
                                                         0
                                                              0
## test the ids between rna-seq and clin microbiome data
sum(colnames(cnts_raw)[-c(1:3)] != clin_micro$pid)
```

## [1] 0

```
# The values are relative abundance (%) of total bacteria for
# everything except the species which is % of classified
# species.
## filter to guarantee cnts larger than 1
cnts_fsym <- cnts_raw[rowSums(as.matrix(cnts_raw[, -c(1:3)])) >=
        (3 * ncol(cnts_raw[, 1:32])), ]
## processing of rnaseq data
cnts <- cnts_fsym %>% dplyr::select(-c(Symbol, Length)) %>% tibble::column_to_rownames("Gene_ID")
cnts <- as.matrix(cnts)</pre>
dim(cnts)
## [1] 22950
                               32
pheno <- data.frame(pid = colnames(cnts), txt = as.factor(c(rep("Control",</pre>
       13), rep("HIV", 19))))
pheno$txt %<>% relevel("Control")
## create EDAseq set
set <- newSeqExpressionSet(as.matrix(cnts), phenoData = data.frame(condition = as.factor(phenostxt),</pre>
       row.names = colnames(cnts)))
## deseq2 and rlog transfer now using deseq2
register(MulticoreParam(6))
dds <- DESeqDataSetFromMatrix(countData = counts(set), colData = pData(set),</pre>
       design = ~condition)
dds <- estimateSizeFactors(dds)</pre>
## normalization factors
sizeFactors(dds)
                 138
                                     178
                                                        255
                                                                           278
                                                                                               361
                                                                                                                  404
                                                                                                                                      493
## 0.2899319 0.3711273 1.2003938 1.2960354 1.4202606 2.2946684 0.7927622
                 582
                                     708
                                                       716
                                                                           914
                                                                                               947
                                                                                                                  972
                                                                                                                                      124
## 1.9049499 1.1110458 3.6075976 1.9497161 0.6619582 2.3450261 0.8412778
##
                 132
                                     154
                                                        188
                                                                           217
                                                                                               286
                                                                                                                  307
                                                                                                                                      323
## 1.1734326 1.1096548 1.3694388 0.9045053 0.4993808 1.1438402 1.0644692
                 391
                                     428
                                                       594
                                                                           622
                                                                                               648
                                                                                                                  683
                                                                                                                                      819
## 0.7256593 0.3921047 3.8447311 0.8909101 1.1798187 0.3615224 0.8283123
                 825
                                    839
                                                       965
## 0.6102792 0.8476626 0.2287530 5.6680177
## The more the size factors differ, the more residual
## dependence of the variance on the mean will be found in the
## transformed data. rlog is a transformation which can
## perform better in these cases.
rld <- rlog(dds, blind = FALSE, fitType = "parametric")</pre>
cnts_rld <- assay(rld)</pre>
apply(cnts_rld, 2, function(x) sum(x < 0))
## 138 178 255 278 361 404 493 582 708 716 914 947 972 124 132 154 188 217
                         6
                                5
                                        8
                                                7
                                                        5
                                                               8
                                                                       7
                                                                               5
                                                                                      7
                                                                                               4
                                                                                                      7
                                                                                                              5
## 286 307 323 391 428 594 622 648 683 819 825 839 965 998
                5
                      5
                                6
                                        5
                                               7
                                                       3
                                                               4
                                                                       5
                                                                               5
                                                                                      5
# ## check previous rlg data rlgold <-
\# read_excel('/home/guanshim/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/rlog_counts_linery_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_newequents_linery_new
# apply(as.matrix(rlgold[,-c(1,2)]), 2, function(x)
\# sum(is.negative(x)) ) all old rlg data are positive check
```

```
sum(row.names(cnts_rld) != cnts_fsym$Gene_ID)
## [1] 0
sum(colnames(cnts_rld) != clin_micro$pid)
## [1] 0
cnts_rld <- data.frame(cnts_rld) %>% mutate(Symbol = cnts_fsym$Symbol,
    Gene_ID = cnts_fsym$Gene_ID) %>% select(Gene_ID, Symbol,
    everything())
head(cnts_rld)
##
                                                                      X278
                        Symbol
                                      X138
                                                 X178
                                                           X255
                Gene_ID
## 1 ENSG00000121410.11
                           A1BG
                                0.9218465
                                           0.8982751
                                                       1.374822
                                                                 0.7730521
## 2 ENSG00000148584.14
                           A1CF 10.7326097 10.4811489 10.050048 10.0838572
## 3 ENSG0000175899.14
                            A2M
                                8.7590456 9.2356528
                                                      8.990610
                                                                8.7061008
                                                                 2.5572829
     ENSG00000245105.2 A2M-AS1
                                 2.1718831
                                           2.4985553
                                                       2.528179
## 5
     ENSG00000256069.7
                          A2MP1
                                 3.1709332
                                           2.7190405
                                                       3.420555
                                                                 2.9725446
                                           5.8452511
## 6 ENSG00000128274.15
                        A4GALT
                                5.5740961
                                                      5.812887
                                                                 5.3565739
##
          X361
                      X404
                                 X493
                                           X582
                                                      X708
     0.8772874
                0.9542712 0.8209856
                                      1.137988
                                                0.9174279
## 1
                                                            0.9597596
## 2 10.1223148 10.3899083 10.1302396 10.222859 10.6826256 10.3355567
     8.9890544 9.4153848 8.8831654
                                                9.1304922 9.2201583
                                      9.117000
     2.2262910 2.5536075 2.3561461
                                       2.777252
                                                 2.7037227
## 5
     2.4344203 3.1943482 2.7585830
                                       3.510831
                                                 2.9818064
                                                            3.1012041
## 6
     5.5212010
                5.8307100
                            6.0103033
                                       5.928460
                                                 5.4522342
                                                            5.8318119
##
          X914
                    X947
                               X972
                                         X124
                                                   X132
                                                              X154
                                                                       X188
## 1
     0.830085 1.159988 0.9494604
                                    1.523047 1.713261 0.9176396 1.081492
## 2 10.774477 10.691444 10.1328353 10.728724 10.364683 10.4760866 9.927583
               8.787015
                         9.3338557
                                    8.875865
                                              8.852791
                                                        8.8135271 9.424338
     8.877407
## 4
     2.462705
              2.156712
                         2.3717436
                                    2.536439
                                              2.901440
                                                         2.6379854 2.240370
     2.638628
                         2.7779538
                                              3.616373
## 5
               3.651664
                                    3.491803
                                                         2.9030043 3.756288
## 6
     5.096413
               6.230956
                         5.8505945 5.222058 5.191497
                                                         5.2614205 6.353300
##
          X217
                     X286
                                X307
                                          X323
                                                    X391
                                                              X428
                                                                        X594
## 1
     1.082601
               0.8684428
                          0.9125299
                                    1.641480
                                               1.136863 0.8928487
                                                                    1.140776
## 2 10.332484 10.9002168 10.8988107 10.321640 10.489439 9.8612794 10.572791
     8.959707
               8.6556830
                          8.5542820
                                     8.753593
                                               8.727761 9.1364957
              2.6678741
                                     2.244829
                                               2.870334 3.4887474
## 4
     2.590536
                          2.4775904
                                                                    2.660160
     3.245546
               3.4231317
                           3.6759583
                                     3.643448
                                                3.211979 4.1587073
                                                                    3.292236
## 6
     5.673697
                5.7907523
                          5.1139903 5.812934 5.549143 6.4103179
                                                                    5.465872
##
          X622
                    X648
                              X683
                                        X819
                                                   X825
                                                              X839
                                                                         X965
## 1
     1.086267
               1.302032
                        1.120638 1.225776 0.8478239
                                                         0.9645089
                                                                    0.9483397
## 2 10.243346 10.554936 10.746234 10.450992 10.6781577 10.0359557 10.1247191
               8.977503
                         9.049802
                                    8.891078
                                              9.4709639
     9.211606
                                                         9.4833828
                                                                    9.1624353
## 4
     2.311453
               2.384131
                         2.507590
                                    2.543641
                                              2.1798084
                                                         2.3304179
                                                                    2.6619391
## 5
     3.391421
               3.156013
                         3.494951
                                    3.728348
                                              3.1059110
                                                         4.4432686
                                                                    3.0702721
## 6
     5.781281
               5.905446 4.999706
                                   5.829825
                                              5.6728592 5.4911450
                                                                    6.0455417
##
         X998
## 1 1.263315
## 2 9.646036
## 3 9.843177
## 4 2.688318
## 5 3.983223
```

Table 1: 45 V genes in the RNAseq data

Vsymbols	Type
IGHV1-18	heavy
IGHV1-2	heavy
IGHV1-24	heavy
IGHV1-3	heavy
IGHV3-15	heavy
IGHV3-21	heavy
IGHV3-23	heavy
IGHV3-30	heavy
IGHV3-33	heavy
IGHV3-48	heavy
IGHV3-49	heavy
IGHV3-53	heavy
IGHV3-7	heavy
IGHV3-72	heavy
IGHV3-73	heavy
IGHV3-74	heavy
IGHV4-34	heavy
IGHV4-39	heavy
IGHV4-59	heavy
IGHV7-81	heavy
IGKV1-39	lightK
IGKV1-5	lightK
IGKV1D-39	lightK
IGKV2-28	lightK
IGKV2D-28	lightK
IGKV3-11	lightK
IGKV3-15	lightK
IGKV3-20	lightK
IGKV4-1	lightK
IGLV1-40	lightL
IGLV1-44	lightL
IGLV1-47	lightL
IGLV2-11	lightL
IGLV2-14	lightL

Vsymbols	Type
IGLV2-23	lightL
IGLV2-8	lightL
IGLV3-1	lightL
IGLV3-10	lightL
IGLV3-19	lightL
IGLV3-21	lightL
IGLV3-25	lightL
IGLV3-9	lightL
IGLV4-69	lightL
IGLV5-48	lightL
IGLV6-57	lightL

```
write.xlsx(vgenes_rld, "~/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vgenes/vgenes_rld..
    sheetName = "Vgenes")
vgenes_rnaseq <- vgenes_rld %>% select(-Num, -Gene_ID, -Type) %>%
   tibble::column to rownames("Vsymbols") %>% t(.)
vgenes_rnaseq <- data.frame(vgenes_rnaseq)</pre>
vgenes_rnaseq$HIV <- clin_micro$HIV</pre>
vgenes_rnaseq$ID <- clin_micro$ID</pre>
dim(vgenes_rnaseq)
## [1] 32 47
write.xlsx(vgenes_rnaseq, "~/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vgenes_rnaseq,"
    sheetName = "vgenes linear regression")
paste("There are 45 V genes left")
## [1] "There are 45 V genes left"
################ miseq data ################ test id
id_matrix <- matrix(NA, sample_size, 3)</pre>
for (i in c("ids1", "ids2", "ids3")) {
   k <- which(c("ids1", "ids2", "ids3") %in% i)
   for (j in 1:sample_size) {
        id_matrix[j, k] <- unlist(strsplit(as.character(clin_micro[j,</pre>
            colnames(clin_micro) == i]), "_", fixed = T))[1]
   }
}
id_matrix <- as.matrix(id_matrix)</pre>
apply(id_matrix, 2, function(x) sum(x != clin_micro$pid))
## [1] 0 0 0
miseq <- clin_micro %>% select(ID, HIV, iga_smu, igk_smu, igl_smu)
head(miseq)
## # A tibble: 6 x 5
            HIV iga_smu igk_smu igl_smu
     <chr>
              <chr>
                      <dbl>
                              <dbl> <dbl>
## 1 MIHIV138 no
                       24.3
                              10.9
                                       18.1
## 2 MIHIV178 no
                       24.9 11.2
                                       13.6
## 3 MIHIV255 no
                       23.2 11.3
                                       15
                              15.5
## 4 MIHIV278 no
                       24.7
                                       NA
## 5 MIHIV361 no
                       22.3
                             9.22
                                       NA
```

```
## 6 MIHIV404 no
                      18.8
                             14.2
                                      NA
write.xlsx(miseq, "~/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vgenes/miseq.xlsx",
    sheetName = "miseq linear regression")
Xs <- clin_micro %>% select(-c(ids, "pid", "num", "ids1", "ids2",
    "ids3", "iga_smu", "igk_smu", "igl_smu"))
Xs[Xs$HIV == "yes", 19:62] \leftarrow Xs[Xs$HIV == "yes", 19:62]/100
clinical names <- colnames(Xs)[5:18]
dim(Xs)
## [1] 32 62
# classes of microbiome
phylum <- colnames(Xs)[1:9 + 18]
phylum
## [1] "Actinobacteria"
                        "Bacteroidetes"
                                          "Cyanobacteria"
                                                            "Firmicutes"
## [5] "Fusobacteria"
                        "Proteobacteria"
                                          "Spirochaetes"
                                                            "Tenericutes"
## [9] "Verrucomicrobia"
family < colnames(Xs)[10:20 + 18]
genus <- colnames(Xs)[21:28 + 18]
species <- colnames(Xs)[29:44 + 18]
write.xlsx(Xs, "~/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/Vgenes/clin_microbiome.xls.
   sheetName = "clinical and microbiome")
# for(i in 1:n_clinical) { ## number of clinical virable j =
# c(6:18)[i] cliname = base::colnames(clinical order)[j] ##
# linear regression lin_res_isgs = gene_IFNReg(isgs.05.lin,
# clinical_order[,j], clinical_names[i]) lin_res_genesbeta =
# gene_IFNReg(genesbeta.05.lin, clinical_order[,j],
# clinical_names[i]) ## save data
# write.xlsx(lin_res_isqs$results,
# paste('~/Documents/qitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/isqs_',
# cliname, '.xlsx', sep = ''), sheetName= paste('ISGs_',
# cliname, sep = '') ) write.xlsx(lin_res_genesbeta$results,
# paste('~/Documents/gitlab/Cario_RNASeq_Microbiom_Inte/DataProcessed/ifnbeta_',
# cliname, '.xlsx', sep = ''), sheetName= paste('ifnbeta_',
# cliname, sep = '')) ## check basic if(lin_res_isqs$size ==
# lin_res_genesbeta$size){ print('Good') }else stop('sample
# size wrong') if(lin_res_isgs$clinical ==
# lin_res_genesbeta$clinical){ print('Good') }else
# stop('clinical parameter wrong') ## number of genes nisgs =
# nrow(lin_res_isgs$results) ngenesbeta =
# nrow(lin res genesbeta$results) ############# summary
# table ############### ### sig prop isgs.sig.no =
# sum(lin_res_isgs$results$FDR <= 0.05) genesbeta.sig.no =</pre>
# sum(lin_res_genesbeta$results$FDR <= 0.05) if( (isgs.sig.no</pre>
\# \ge 5) \& (genesbeta.sig.no \ge 5) ){ prop.test.sig = }
\# prop.test(x = c(isgs.sig.no, genesbeta.sig.no), n =
# c(nisqs, nqenesbeta), correct = FALSE) siq.p =
# prop.test.sig$p.value }else{ prop.test.sig = prop.test(x =
\# c(isqs.siq.no, qenesbeta.siq.no), n = c(nisqs, nqenesbeta),
# correct = TRUE) sig.p = prop.test.sig$p.value } }
```

# miseq data miseq as the outcome