# RNAhybrid\_complete\_testing\_c\_vs\_nc

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## setup

```
\operatorname{dir}
```

```
# home
setwd("D:/Krueger_Lab/Publications/miR181_paper/Figure2/RNAhybrid")

# work
#setwd("Z:/Personen/Nikita/Publications/miR181_paper/Figure2/RNAhybrid")
```

#### packages

```
source("D:/Krueger_Lab/Publications/miR181_paper_v21022023/Figure_theme/theme_paper.R")
\#source("Z:/Personen/Nikita/Publications/miR181\_paper\_v21022023/Figure\_theme/theme\_paper.R")
library(BSgenome.Mmusculus.UCSC.mm10)
## Loading required package: BSgenome
## Loading required package: BiocGenerics
## Attaching package: 'BiocGenerics'
## The following objects are masked from 'package:stats':
##
       IQR, mad, sd, var, xtabs
##
## The following objects are masked from 'package:base':
##
##
       anyDuplicated, aperm, append, as.data.frame, basename, cbind,
##
       colnames, dirname, do.call, duplicated, eval, evalq, Filter, Find,
       get, grep, grepl, intersect, is.unsorted, lapply, Map, mapply,
##
       match, mget, order, paste, pmax, pmax.int, pmin, pmin.int,
       Position, rank, rbind, Reduce, rownames, sapply, setdiff, sort,
       table, tapply, union, unique, unsplit, which.max, which.min
##
## Loading required package: S4Vectors
## Loading required package: stats4
## Attaching package: 'S4Vectors'
```

```
## The following objects are masked from 'package:base':
##
       expand.grid, I, unname
##
## Loading required package: IRanges
##
## Attaching package: 'IRanges'
## The following object is masked from 'package:grDevices':
##
##
       windows
## Loading required package: GenomeInfoDb
## Loading required package: GenomicRanges
## Loading required package: Biostrings
## Loading required package: XVector
##
## Attaching package: 'Biostrings'
## The following object is masked from 'package:base':
##
##
       strsplit
## Loading required package: rtracklayer
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:Biostrings':
##
       collapse, intersect, setdiff, setequal, union
##
## The following object is masked from 'package:XVector':
##
##
       slice
##
  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(ggplot2)
library(circlize)
## ==============
## circlize version 0.4.15
## CRAN page: https://cran.r-project.org/package=circlize
## Github page: https://github.com/jokergoo/circlize
## Documentation: https://jokergoo.github.io/circlize_book/book/
##
## If you use it in published research, please cite:
## Gu, Z. circlize implements and enhances circular visualization
    in R. Bioinformatics 2014.
##
## This message can be suppressed by:
    suppressPackageStartupMessages(library(circlize))
## ===============
library(ComplexHeatmap)
## Loading required package: grid
## Attaching package: 'grid'
## The following object is masked from 'package:Biostrings':
##
##
      pattern
## ComplexHeatmap version 2.15.2
## Bioconductor page: http://bioconductor.org/packages/ComplexHeatmap/
## Github page: https://github.com/jokergoo/ComplexHeatmap
## Documentation: http://jokergoo.github.io/ComplexHeatmap-reference
## If you use it in published research, please cite either one:
## - Gu, Z. Complex Heatmap Visualization. iMeta 2022.
## - Gu, Z. Complex heatmaps reveal patterns and correlations in multidimensional
##
      genomic data. Bioinformatics 2016.
##
##
## The new InteractiveComplexHeatmap package can directly export static
## complex heatmaps into an interactive Shiny app with zero effort. Have a try!
##
## This message can be suppressed by:
    suppressPackageStartupMessages(library(ComplexHeatmap))
library(seqinr)
```

##

```
## Attaching package: 'seqinr'
## The following object is masked from 'package:dplyr':
##
##
       count
## The following object is masked from 'package:Biostrings':
##
##
       translate
library(GenomicRanges)
library(stringr)
library(gridExtra)
##
## Attaching package: 'gridExtra'
## The following object is masked from 'package:dplyr':
##
##
       combine
## The following object is masked from 'package:BiocGenerics':
##
##
       combine
data
#home
f2bs <- readRDS("D:/Krueger_Lab/Publications/miR181_paper/Figure2/MRE_bound_gene_and_bound_region/mir18
#f2bs <- readRDS("Z:/Personen/Nikita/Publications/miR181_paper/Figure2/MRE_bound_gene_and_bound_region/
head(f2bs)
##
                          end width strand scoreSum scoreMean scoreMax
     seqnames
                start
## 1
         chr1 6245651 6245657
                               7
                                        + 9.52553 4.762765 6.00678
## 2
         chr1 6248341 6248347
                                  7
                                         + 92.68921 23.172303 48.76900
## 3
        chr1 6248857 6248863
                                7
                                       + 14.07133 7.035665 7.04425
## 4
        chr1 6248918 6248924
                                 7
                                       + 38.91451 12.971503 20.65080
                                  7
## 5
        chr1 7170481 7170487
                                         + 66.92218 13.384436 25.84490
        chr1 9899605 9899611
                                  7
                                       + 25.15963 6.289907 8.61019
## 6
##
          geneType geneName
                                         geneID region BS_ID
                                                                      mir IP
## 1 protein_coding    Rb1cc1 ENSMUSG00000025907
                                                  cds
                                                           5 mmu-miR-181a-5p
## 2 protein_coding Rb1cc1 ENSMUSG00000025907
                                                   cds
                                                           8 mmu-miR-181a-5p
## 3 protein_coding Rb1cc1 ENSMUSG00000025907
                                                  cds
                                                          10 mmu-miR-181a-5p
## 4 protein_coding
                    Rb1cc1 ENSMUSG00000025907
                                                  cds
                                                          11 mmu-miR-181a-5p
## 5 protein_coding
                     Pcmtd1 ENSMUSG00000051285
                                                  utr3
                                                          19 mmu-miR-181a-5p
                        Sgk3 ENSMUSG00000025915
## 6 protein_coding
                                                 utr3
                                                          23 mmu-miR-181a-5p
    n_mir181 n_mir181a n_mir181b n_mir181c n_mir181d
                                                                    set WT KO
## 1
                                0
                                          0
                                                    0 ago_bs_mir181_chi
           1
                     1
## 2
            5
                     5
                                0
                                          0
                                                    0 ago_bs_mir181_chi
           6
                     6
## 3
                                0
                                          0
                                                    0 ago_bs_mir181_chi
                                                                        1
## 4
            6
                     6
                                0
                                          0
                                                    0 ago_bs_mir181_chi
## 5
            4
                      4
                                0
                                          0
                                                    0 ago_bs_mir181_chi 1 1
## 6
                      1
                                0
                                          0
                                                    O ago_bs_mir181_chi NA NA
##
               geneID.2 geneName.1 region.1 counts.bs.1_KO counts.bs.2_KO
## 1 ENSMUSG00000025907
                            Rb1cc1
                                        cds
```

```
## 2 ENSMUSG00000025907
                           Rb1cc1
                                       cds
                                                       28
                                                                       32
## 3 ENSMUSG00000025907
                           Rb1cc1
                                       cds
                                                       13
                                                                       11
## 4 ENSMUSG00000025907
                           Rb1cc1
                                       cds
                                                       15
                                                                       15
## 5 ENSMUSG00000051285
                                                                       22
                           Pcmtd1
                                      utr3
                                                       12
                  <NA>
                             <NA>
                                       <NA>
                                                                      NA
##
     counts.bs.3 KO counts.bs.4 WT counts.bs.5 WT counts.bs.6 WT
                 3
                                3
## 2
                27
                                              41
                               46
                                                              20
## 3
                 4
                               22
                                              13
                                                              12
## 4
                10
                               33
                                              20
                                                              18
## 5
                14
                               16
                                              20
                                                              9
## 6
                NA
                               NA
                                              NA
                                                             NA
              geneID.1 counts.bg.1_KO counts.bg.2_KO counts.bg.3_KO
## 1 ENSMUSG00000025907
                                 1609
                                                1973
                                                               1250
## 2 ENSMUSG00000025907
                                 1609
                                                1973
                                                               1250
## 3 ENSMUSG00000025907
                                 1609
                                                1973
                                                                1250
## 4 ENSMUSG00000025907
                                 1609
                                                1973
                                                                1250
## 5 ENSMUSG00000051285
                                 1355
                                                 1706
                                                                1064
                  <NA>
                                   NA
                                                  NA
                                                                 NΑ
##
     counts.bg.4_WT counts.bg.5_WT counts.bg.6_WT resBs.baseMean
## 1
              2638
                             2231
                                            1352
                                                       92.10645
## 2
              2638
                             2231
                                            1352
                                                       281.53271
## 3
              2638
                             2231
                                                      145.51107
                                            1352
## 4
              2638
                             2231
                                            1352
                                                      186.74162
                                                      151.36245
## 5
              1654
                             1348
                                             755
                NA
                               NA
                                              NA
     resBs.log2FoldChange resBs.lfcSE resBs.stat resBs.pvalue resBs.padj
              ## 1
## 2
                          0.2351157 1.35874137
               0.2749428
                                                   0.2437557 0.6729889
              -0.1805519
                          0.3623758 0.25017050
                                                   0.6169550 0.8961239
                          0.3062717 0.73169661
## 4
              -0.2606282
                                                   0.3923338 0.7868678
## 5
               0.1466485
                           0.3122905 0.22052922
                                                   0.6386370 0.9013566
## 6
                      NA
                                  NA
                                             NA
                                                          NA
    resBg.baseMean resBg.log2FoldChange resBg.lfcSE resBg.stat resBg.pvalue
## 1
                NA
                                     NA
                                                 NA
                                                            NA
                                                                         NA
## 2
                NA
                                     NA
                                                 NA
                                                            NA
                                                                         NA
## 3
                NA
                                     NA
                                                 NA
                                                            NA
                                                                         NA
## 4
                NΑ
                                     NΔ
                                                 NΑ
                                                            NA
                                                                         NΔ
## 5
                NA
                                     NA
                                                 NA
                                                            NA
                                                                         NA
                NA
                                     NA
                                                 NA
## 6
    resBg.padj tpm.counts.bg.1_KO tpm.counts.bg.2_KO tpm.counts.bg.3_KO
                                            117.9980
## 1
            NA
                         133.7259
                                                               129.8669
## 2
            NA
                         133.7259
                                            117.9980
                                                               129.8669
## 3
            NA
                         133.7259
                                            117.9980
                                                               129.8669
## 4
                         133.7259
                                            117.9980
                                                               129.8669
## 5
                         248.6210
                                            225.2505
                                                                244.0445
            NA
            NA
                               NA
                                                  NA
                                                                     NA
     tpm.counts.bg.4_WT tpm.counts.bg.5_WT tpm.counts.bg.6_WT
## 1
              139.8635
                                146.2855
                                                    163.5360
## 2
                                 146.2855
              139.8635
                                                    163.5360
## 3
              139.8635
                                 146.2855
                                                    163.5360
## 4
              139.8635
                                 146.2855
                                                    163.5360
## 5
              193.5994
                                 195.1330
                                                    201.6149
## 6
                    NA
                                       NA
                                                          NA
```

```
##
                       BS_ID.1 tpm_support_KO tpm_support_WT tpm_supported down
## 1 ENSMUSG00000025907.bs5
                                              3
                                                               3
                                                                           TRUE FALSE
## 2 ENSMUSG00000025907.bs8
                                                               3
                                                                           TRUE FALSE
                                              3
                                              3
                                                               3
## 3 ENSMUSG00000025907.bs10
                                                                           TRUE FALSE
## 4 ENSMUSG00000025907.bs11
                                              3
                                                               3
                                                                           TRUE FALSE
## 5 ENSMUSG00000051285.bs4
                                              3
                                                               3
                                                                           TRUE FALSE
## 6
                                             NA
                          <NA>
                                                              NA
                                                                             NA
#colours
farbeneg <- "#b4b4b4"</pre>
farbe1 <- "#0073C2FF"
farbe2 <- "#EFC000FF"</pre>
farbe3 <- "#CD534CFF"</pre>
farbe4 <- "#7AA6DCFF"</pre>
farbe5 <- "#868686FF"
farbe6 <- "#003C67FF"</pre>
farbe7 <- "#8F7700FF"</pre>
farbe8 <- "#3B3B3BFF"</pre>
farbe9 <- "#A73030FF"</pre>
farbe10 <- "#4A6990FF"
farbe11 <- "#FF6F00FF"</pre>
farbe12 <- "#C71000FF"
farbe13 <- "#008EA0FF"</pre>
farbe14 <- "#8A4198FF"
farbe15 <- "#5A9599FF"
farbe16 <- "#FF6348FF"</pre>
RNApcol <- "#b56504"
RNAncol <- "#027d73"
RPFpcol <- "#c4c404"
RPFncol <- "#8d0391"
```

## Get DNA sequences

chr1 6248316 6248397

## 2

```
#resize ranges
f2bsLA <- f2bs
f2bsLA$start <- f2bsLA$start -25
f2bsLA$end <- f2bsLA$end + 50
f2bsLA$n_mir181a <- as.numeric(f2bsLA$n_mir181a)</pre>
df181A <- mutate(f2bsLA, Sequence = as.character(getSeq(BSgenome.Mmusculus.UCSC.mm10, seqnames, start,
df181A$rownum <- rownames(df181A)
df181A <- df181A[as.numeric(df181A$n_mir181a) > 0,]
#and turn T into Us
df181A$Sequence <- gsub('T', 'U', df181A$Sequence)
head(df181A)
     seqnames
                          end width strand scoreSum scoreMean scoreMax
## 1
         chr1 6245626 6245707
                                  7
                                       + 9.52553 4.762765 6.00678
```

+ 92.68921 23.172303 48.76900

7

```
+ 14.07133 7.035665 7.04425
## 3
         chr1 6248832 6248913
         chr1 6248893 6248974
                                   7
                                          + 38.91451 12.971503 20.65080
         chr1 7170456 7170537
## 5
                                   7
                                          + 66.92218 13.384436 25.84490
## 6
         chr1 9899580 9899661
                                          + 25.15963 6.289907 8.61019
                                          geneID region BS_ID
           geneType geneName
                                                                        mir IP
## 1 protein coding
                      Rb1cc1 ENSMUSG00000025907
                                                    cds
                                                             5 mmu-miR-181a-5p
## 2 protein_coding
                      Rb1cc1 ENSMUSG00000025907
                                                    cds
                                                             8 mmu-miR-181a-5p
## 3 protein_coding
                                                            10 mmu-miR-181a-5p
                      Rb1cc1 ENSMUSG00000025907
                                                     cds
## 4 protein_coding
                     Rb1cc1 ENSMUSG00000025907
                                                    cds
                                                            11 mmu-miR-181a-5p
## 5 protein_coding
                      Pcmtd1 ENSMUSG00000051285
                                                   utr3
                                                            19 mmu-miR-181a-5p
## 6 protein_coding
                        Sgk3 ENSMUSG00000025915
                                                   utr3
                                                            23 mmu-miR-181a-5p
    n_mir181 n_mir181a n_mir181b n_mir181c n_mir181d
                                                                      set WT KO
## 1
            1
                      1
                                 0
                                           0
                                                      0 ago_bs_mir181_chi 1
            5
                      5
## 2
                                 0
                                           0
                                                      0 ago_bs_mir181_chi
## 3
            6
                      6
                                 0
                                           0
                                                      0 ago_bs_mir181_chi
## 4
            6
                      6
                                 0
                                           0
                                                      0 ago_bs_mir181_chi
## 5
            4
                      4
                                 0
                                           0
                                                      0 ago_bs_mir181_chi 1
## 6
                      1
                                 0
                                           0
                                                      O ago bs mir181 chi NA NA
               geneID.2 geneName.1 region.1 counts.bs.1_KO counts.bs.2_KO
## 1 ENSMUSG00000025907
                            Rb1cc1
                                         cds
## 2 ENSMUSG00000025907
                            Rb1cc1
                                         cds
                                                          28
                                                                         32
## 3 ENSMUSG00000025907
                                         cds
                                                          13
                             Rb1cc1
                                                                         11
## 4 ENSMUSG00000025907
                            Rb1cc1
                                         cds
                                                          15
                                                                         15
## 5 ENSMUSG00000051285
                                                          12
                             Pcmtd1
                                        utr3
## 6
                                        <NA>
                   <NA>
                               <NA>
     counts.bs.3_KO counts.bs.4_WT counts.bs.5_WT counts.bs.6_WT
## 1
                  3
                                  3
                                                10
## 2
                 27
                                                                20
                                 46
                                                41
## 3
                                 22
                                                13
                                                                12
                  4
                 10
                                 33
                                                20
                                                                18
## 5
                 14
                                 16
                                                20
                                                                 9
## 6
                 NA
                                 NA
                                                NA
               geneID.1 counts.bg.1_KO counts.bg.2_KO counts.bg.3_KO
## 1 ENSMUSG00000025907
                                   1609
                                                  1973
## 2 ENSMUSG00000025907
                                   1609
                                                   1973
                                                                  1250
## 3 ENSMUSG00000025907
                                   1609
                                                   1973
                                                                  1250
## 4 ENSMUSG00000025907
                                   1609
                                                   1973
                                                                  1250
## 5 ENSMUSG00000051285
                                   1355
                                                   1706
                                                                  1064
## 6
                   <NA>
                                     NA
                                                    NA
##
     counts.bg.4_WT counts.bg.5_WT counts.bg.6_WT resBs.baseMean
                               2231
                                              1352
               2638
                                                          92.10645
## 2
               2638
                               2231
                                              1352
                                                         281.53271
## 3
                                                         145.51107
               2638
                               2231
                                              1352
## 4
                               2231
               2638
                                              1352
                                                         186.74162
                                               755
                                                         151.36245
               1654
                               1348
## 6
                                                NA
                 NA
                                 NA
                                                                NA
     resBs.log2FoldChange resBs.lfcSE resBs.stat resBs.pvalue resBs.padj
## 1
                            0.5923673 0.03419066
                                                     0.8533018 0.9652601
               -0.1093039
## 2
                0.2749428
                             0.2351157 1.35874137
                                                      0.2437557 0.6729889
## 3
               -0.1805519
                             0.3623758 0.25017050
                                                      0.6169550 0.8961239
## 4
               -0.2606282
                             0.3062717 0.73169661
                                                      0.3923338
                                                                 0.7868678
                             0.3122905 0.22052922
                                                      0.6386370
## 5
                0.1466485
                                                                 0.9013566
## 6
                                    NΑ
                                               NΑ
## resBg.baseMean resBg.log2FoldChange resBg.lfcSE resBg.stat resBg.pvalue
```

```
## 1
               NA
                                   NA
                                              NA
                                                        NA
                                                                    NA
               NΑ
                                   NΑ
                                              NΑ
                                                        NΑ
                                                                    NΑ
## 3
               NA
                                   NA
                                              NA
                                                        NA
                                                                    NA
## 4
               NA
                                   NΔ
                                              NΔ
                                                        NA
                                                                    NA
## 5
               NA
                                   NA
                                              NA
                                                        NA
                                                                    NA
##
  6
               NA
                                   NA
                                              NA
                                                        NA
                                                                    NA
    resBg.padj tpm.counts.bg.1_KO tpm.counts.bg.2_KO tpm.counts.bg.3_KO
##
                        133.7259
## 1
            NΑ
                                         117.9980
                                                           129.8669
##
  2
            NA
                        133.7259
                                         117.9980
                                                           129.8669
## 3
            NA
                        133.7259
                                         117.9980
                                                           129.8669
            NA
                        133.7259
                                         117.9980
                                                           129.8669
## 5
            NA
                        248.6210
                                         225.2505
                                                           244.0445
##
            NA
                             NA
                                               NA
                                                                 NA
##
    tpm.counts.bg.4_WT tpm.counts.bg.5_WT tpm.counts.bg.6_WT
## 1
              139.8635
                               146.2855
                                                 163.5360
## 2
              139.8635
                               146.2855
                                                 163.5360
## 3
              139.8635
                               146.2855
                                                 163.5360
## 4
              139.8635
                               146.2855
                                                 163.5360
## 5
              193.5994
                               195.1330
                                                 201.6149
##
##
                   BS_ID.1 tpm_support_KO tpm_support_WT tpm_supported down
## 1
     ENSMUSG00000025907.bs5
                                       3
                                                     3
                                                               TRUE FALSE
                                       3
## 2
     ENSMUSG00000025907.bs8
                                                     3
                                                               TRUE FALSE
## 3 ENSMUSG00000025907.bs10
                                       3
                                                     3
                                                               TRUE FALSE
                                       3
                                                     3
## 4 ENSMUSG00000025907.bs11
                                                               TRUE FALSE
     ENSMUSG00000051285.bs4
                                       3
                                                     3
                                                               TRUE FALSE
## 6
                      <NA>
                                      NA
                                                    NA
                                                                 NA
                                                                      NA
                                                                         Sequence
## 2 CAAGAAUAGAAAGUACAACAGGCAUUACAACCACUACCUCACCAAAAACUCCUCCACUAACUGUUCAGGACACCUUAUG
## 3 UACAAAAAGAACAGUGUGACUUAGCAAAUUAUUUAAAAUGUACAGCUGUAGAAAUAAGAAAUAUUAUUGAAAAAGUAAAAUG
## 4 UAUUAUUGAAAAAGUAAAAUGUUCUCUAGAAAUAACACUAAAGGAAAAGCAUCAGCAAGAACUCCAAUCUUUAAAAAUUGAG
## 5 GGAAAAUUUCUGCUUCUCAUAGAGAUUUUUAAGAGCUAGUGAAUGUUAAAGUAGGAAGUGGCUACUUGACACAACUAGUU
##
    rownum
## 1
         1
## 2
         2
## 3
         3
## 4
         4
## 5
         5
## 6
         6
```

#### find seed

```
#find both seeds
seed1 <- df181A %>% filter(str_detect(Sequence, "GAAUGU"))
seed2 <- df181A %>% filter(str_detect(Sequence, "GAUUGU"))

#remove NAs in gene name
seed1 <- seed1[!is.na(seed1$geneName),]
seed2 <- seed2[!is.na(seed2$geneName),]</pre>
```

#### head(seed1)

```
##
                                 end width strand scoreSum scoreMean scoreMax
      seqnames
                    start
                                                + 66.92218 13.384436
## 5
          chr1
                  7170456
                            7170537
                                         7
                                                                        25.8449
## 7
                                         7
          chr1
                  9899846
                            9899927
                                                 + 20.67430 6.891433
                                                                        11.2987
## 22
          chr1
                43570279
                           43570360
                                         7
                                                 + 55.09962 13.774905
                                                                        21.7788
## 31
          chr1
                58754246
                           58754327
                                         7
                                                 + 21.46580 10.732900
                                                                        15.0257
                                                 + 56.80659 18.935530
## 51
          chr1 85849941
                           85850022
                                         7
                                                                        31.2761
## 86
          chr1 119528130 119528211
                                                 + 19.78365 9.891825
                                                                        12.0423
                                            geneID region BS_ID
##
            geneType geneName
                                                                           mir IP
      protein coding Pcmtd1 ENSMUSG00000051285
## 5
                                                      utr3
                                                              19 mmu-miR-181a-5p
## 7
      protein_coding
                          Sgk3 ENSMUSG00000025915
                                                              24 mmu-miR-181a-5p
                                                      utr3
## 22 protein coding
                          Nck2 ENSMUSG00000066877
                                                      utr3
                                                              97 mmu-miR-181b-5p
## 31 protein_coding
                         Cflar ENSMUSG00000026031
                                                             130 mmu-miR-181a-5p
                                                      utr3
## 51 protein coding
                         Cab39 ENSMUSG00000036707
                                                             209 mmu-miR-181a-5p
                                                      utr3
## 86 protein_coding Tmem185b ENSMUSG00000098923
                                                             320 mmu-miR-181a-5p
                                                      utr3
      n_mir181 n_mir181a n_mir181b n_mir181c n_mir181d
                                                                         set WT KO
## 5
                        4
                                   0
                                             0
                                                        0 ago_bs_mir181_chi 1 1
##
  7
             1
                        1
                                   0
                                             0
                                                        O ago_bs_mir181_chi NA NA
## 22
             2
                                             0
                                                        0 ago_bs_mir181_chi
                                   1
                        1
           170
                                             2
## 31
                      163
                                   5
                                                        0 ago_bs_mir181_chi
## 51
           326
                      297
                                  29
                                                        0 ago_bs_mir181_chi
                                             0
## 86
                        7
                                   0
                                             0
                                                        O ago_bs_mir181_chi NA NA
##
                 geneID.2 geneName.1 region.1 counts.bs.1_KO counts.bs.2_KO
      ENSMUSG00000051285
                              Pcmtd1
                                          utr3
                                                            12
## 7
                                                                            NA
                     <NA>
                                 <NA>
                                          <NA>
                                                            NA
## 22 ENSMUSG00000066877
                                 Nck2
                                                            11
                                                                            15
                                          utr3
## 31 ENSMUSG00000026031
                               Cflar
                                          utr3
                                                             6
                                                                            14
                               Cab39
## 51 ENSMUSG00000036707
                                                             2
                                                                             2
                                          utr3
## 86
                     <NA>
                                 <NA>
                                          <NA>
                                                            NA
                                                                            NA
##
      counts.bs.3_KO counts.bs.4_WT counts.bs.5_WT counts.bs.6_WT
## 5
                                   16
                                                   20
                   14
## 7
                   NA
                                  NA
                                                                   NA
                                                   NA
## 22
                   10
                                   20
                                                   21
                                                                   12
## 31
                                   24
                                                   23
                                                                   10
                   11
## 51
                    3
                                   85
                                                   50
                                                                   32
## 86
                                  NA
                                                   NA
                   NA
                 geneID.1 counts.bg.1_KO counts.bg.2_KO counts.bg.3_KO
##
                                     1355
                                                     1706
      ENSMUSG00000051285
                                                                     1064
                     <NA>
                                       NA
                                                       NA
                                                                       NA
## 22 ENSMUSG00000066877
                                     5026
                                                     7988
                                                                     4386
## 31 ENSMUSG00000026031
                                     1371
                                                     1785
                                                                     1002
## 51 ENSMUSG00000036707
                                                     2091
                                     1606
                                                                     1226
## 86
                                                       NA
                                                                       NA
                     <NA>
                                       NA
##
      counts.bg.4 WT counts.bg.5 WT counts.bg.6 WT resBs.baseMean
## 5
                 1654
                                 1348
                                                 755
                                                            151.3625
## 7
                   NA
                                  NA
                                                   NA
                                                            300.8802
## 22
                 8478
                                 6584
                                                 3537
## 31
                 2308
                                 1960
                                                 1040
                                                            148.2842
## 51
                 2802
                                                 1406
                                                            234.7085
                                 2422
## 86
                                   NA
##
      resBs.log2FoldChange resBs.lfcSE resBs.stat resBs.pvalue resBs.padj
## 5
                  0.1466485
                              0.3122905
                                           0.2205292 6.386370e-01 9.013566e-01
## 7
                                                   NA
                         NA
                                      NA
                                                                NA
                                                                              NA
```

```
0.6723828 4.122221e-01 8.000076e-01
## 22
                -0.2719827
                              0.3328411
## 31
                -0.3288789
                              0.3315817
                                          1.0018062 3.168738e-01 7.352453e-01
                -3.9344782
                              0.5635927 107.5785787 3.324592e-25 1.174121e-21
## 51
## 86
                        NA
                                     NA
                                                  MΔ
                                                               NΔ
##
      resBg.baseMean resBg.log2FoldChange resBg.lfcSE resBg.stat resBg.pvalue
                                        NA
## 5
                  NA
                                                     NA
                                                                 NΑ
## 7
                                        NA
                  NA
                                                     NΑ
                                                                 NA
## 22
                  NA
                                        NA
                                                     NA
                                                                 NA
                                                                              NΑ
## 31
                  NΔ
                                        NA
                                                     NA
                                                                 NΔ
                                        NA
                                                     NA
                                                                 NΑ
                                                                              NA
## 51
                  NΑ
##
  86
                  NA
                                        NA
                                                     NA
                                                                 NA
                                                                              NA
      resBg.padj tpm.counts.bg.1_KO tpm.counts.bg.2_KO tpm.counts.bg.3_KO
##
                            248,6210
                                                225,2505
## 5
              NA
## 7
              NA
                                  NA
                                                      NA
                                                                          NA
## 22
              NA
                           1377.3876
                                               1575.2874
                                                                   1502.5578
## 31
              NA
                            132.1224
                                                123.7842
                                                                    120.7079
## 51
              NA
                            277.0625
                                                259.5818
                                                                    264.3940
##
  86
              NA
                                  NA
                                                                          NA
                                                      NA
##
      tpm.counts.bg.4_WT tpm.counts.bg.5_WT tpm.counts.bg.6_WT
## 5
                193.5994
                                    195.1330
## 7
                      NΔ
                                           NΔ
## 22
               1482.1666
                                   1423.5269
                                                       1410.7365
## 31
                141.8877
                                    149.0175
                                                        145.8645
                308.3687
                                    329.6465
                                                        353.0162
## 51
## 86
                      NΑ
                                          NΑ
##
                      BS_ID.1 tpm_support_KO tpm_support_WT tpm_supported down
## 5
       ENSMUSG00000051285.bs4
                                                                        TRUE FALSE
                                            3
                                                            3
##
                          <NA>
                                           NA
                                                           NA
                                                                          NA
                                                                                NA
                                                                        TRUE FALSE
## 22 ENSMUSG00000066877.bs31
                                            3
                                                            3
  31
       ENSMUSG00000026031.bs4
                                            3
                                                            3
                                                                        TRUE FALSE
## 51
       ENSMUSG00000036707.bs4
                                            3
                                                            3
                                                                        TRUE TRUE
## 86
                          <NA>
                                           NA
                                                           NA
                                                                          NA
                                                                                NA
##
      GGAAAAUUUCUGCUUCUCAUAGAGAUUUUUAAGAGCUAGUGAAUGUUAAAGUAGGAAGUGGCUACUUGACACAACUAGUU
## 5
      GGCAAGUCUGGGUUGGUGGAAUGUGUGUCACCUACACAUUCUAACAGAAGGUAACAAUAAGUUAGCAGUGACAUAUUCAGU
## 22 AUAUAUUAUUUGCUUUACAGGGAAAUUUUUCAGGGUUUACAAAAGAAUAUGUGAUUAGUAGUAACAGAAUGUUUAUGAAGAA
## 31 UGGGUGUAUAGUGUAUAGUGGUUCAAGAUUUGACACUGAAUGUAACUUGAGACUUACCUGAGUUUGUCAUGCGACUGGGUAA
## 51 UGUAUAUAAUUCUUAGAAUGCUCAUUUCUUUUAAAUCGUUUAAUUUGUACAGCAGAGGAAUGUUAUUGUAGUAGUAGUAUGUAAC
## 86 UGCAUAUAUUAGUAUUUAUAUGAAUGUUUUAGCAGUGUUAUCUGUGUUGAUUGUAGUUCUUGGCAGUAAUGUAUUGUGUUAA
      rownum
##
## 5
           5
           7
## 7
          22
## 22
## 31
          31
## 51
          51
## 86
          86
head(seed2)
##
                                 end width strand
                                                    scoreSum scoreMean scoreMax
       segnames
                    start
## 28
                 58402990
                                         7
                                                    38.09626 12.698753 17.08590
           chr1
                           58403071
## 66
                 87792332 87792413
                                         7
                                                 + 60.80440 15.201100 16.81080
                                         7
                                                 + 102.33322 20.466644 40.96150
## 84
           chr1 118464515 118464596
## 86
           chr1 119528130 119528211
                                         7
                                                    19.78365 9.891825 12.04230
```

11.83646 5.918230 6.29952

7

chr1 127775116 127775197

## 92

```
## 159
           chr1 155173974 155174055
                                                      24.74386 12.371930 15.64410
              geneType geneName
                                              geneID region BS_ID
##
                                                                              mir IP
##
  28
       protein coding
                            Bzw1 ENSMUSG00000051223
                                                        utr3
                                                                124 mmu-miR-181a-5p
       protein_coding
                       Atg1611 ENSMUSG00000026289
                                                                244 mmu-miR-181a-5p
                                                        utr3
##
       protein coding
                         Clasp1 ENSMUSG00000064302
                                                         cds
                                                                313 mmu-miR-181a-5p
   86
       protein coding Tmem185b ENSMUSG00000098923
                                                                320 mmu-miR-181a-5p
##
                                                        utr3
       protein coding
                          Ccnt2 ENSMUSG00000026349
                                                                347 mmu-miR-181a-5p
   92
                                                         cds
  159 protein coding
                            Stx6 ENSMUSG00000026470
                                                         cds
                                                                568 mmu-miR-181a-5p
##
       n_mir181 n_mir181a n_mir181b n_mir181c n_mir181d
                                                                            set WT KO
  28
##
               1
                          1
                                    0
                                               0
                                                          0 ago_bs_mir181_chi
                                                                                1 1
   66
               1
                          1
                                    0
                                               0
                                                          0 ago_bs_mir181_chi
               2
                                               0
   84
                          1
                                    1
                                                          0 ago_bs_mir181_chi
##
               7
                                    0
##
   86
                                               0
                                                          O ago_bs_mir181_chi NA NA
                                    0
                                               0
                                                          0 ago_bs_mir181_chi
##
   92
               1
                          1
##
   159
                          2
                                    1
                                               0
                                                          0 ago_bs_mir181_chi
##
                  geneID.2 geneName.1 region.1 counts.bs.1_KO counts.bs.2_KO
       ENSMUSG00000051223
                                                                9
##
                                  Bzw1
                                            utr3
                                                                                8
   28
                                                                8
                                                                                9
       ENSMUSG00000026289
                               Atg1611
                                            utr3
       ENSMUSG00000064302
                                                               25
                                                                               26
##
   84
                                Clasp1
                                             cds
##
   86
                       <NA>
                                  <NA>
                                            <NA>
                                                               NA
                                                                               NA
##
   92
       ENSMUSG00000026349
                                 Ccnt2
                                             cds
                                                                1
                                                                                2
   159 ENSMUSG00000026470
                                  Stx6
                                                                3
                                                                                9
                                             cds
       counts.bs.3_KO counts.bs.4_WT counts.bs.5_WT counts.bs.6_WT
##
                     5
                                                     10
##
  28
                                    17
                                                                      7
   66
                     5
                                                     21
##
                                    12
   84
                    15
                                    29
                                                     25
                                                                     12
##
   86
                    NA
                                    NA
                                                     NA
                                                                     NA
                                     7
                                                      5
                                                                      5
##
   92
                     1
                     5
                                                      6
##
   159
                                    13
                                                                      1
##
                  geneID.1 counts.bg.1_KO counts.bg.2_KO counts.bg.3_KO
##
   28
       ENSMUSG00000051223
                                        392
                                                        541
                                                                        311
##
   66
       ENSMUSG00000026289
                                        681
                                                        904
                                                                        531
##
       ENSMUSG00000064302
                                       2675
                                                       3791
                                                                       2111
##
   86
                      <NA>
                                         NA
                                                         NA
                                                                         NA
##
       ENSMUSG00000026349
                                       2418
                                                       3235
                                                                       1941
##
   159 ENSMUSG00000026470
                                       1807
                                                       2526
                                                                       1509
##
       counts.bg.4 WT counts.bg.5 WT counts.bg.6 WT resBs.baseMean
## 28
                   645
                                   475
                                                    255
                                                               72.76455
##
   66
                  1154
                                   864
                                                    513
                                                               93.58266
  84
                  4231
                                  3547
                                                   1802
                                                              249.76110
##
   86
                    NA
                                    NA
                                                     NA
                                                                     NA
## 92
                  3490
                                  3011
                                                   1706
                                                              112.28672
                                                              107.75352
##
   159
                  2744
                                  2338
                                                   1416
##
       resBs.log2FoldChange resBs.lfcSE resBs.stat resBs.pvalue resBs.padj
##
  28
                  -0.2079555
                                0.4169909 0.25053210
                                                         0.61670066 0.8961239
  66
                  -0.4108259
                                0.3967434 1.09496574
                                                         0.29537357
                                                                      0.7198473
##
##
   84
                   0.3513764
                                0.2635197 1.77460129
                                                         0.18281366
                                                                      0.6019152
##
   86
                           NA
                                        NA
                                                                  NA
                                                                              NA
##
  92
                  -1.7732438
                                0.8054955 5.99595457
                                                         0.01433872
                                                                      0.1776151
##
   159
                   0.1372395
                                0.4873718 0.07919813
                                                         0.77838704
                                                                      0.9438527
##
       resBg.baseMean resBg.log2FoldChange resBg.lfcSE resBg.stat resBg.pvalue
## 28
                    NA
                                           NA
                                                        NA
                                                                    NA
## 66
                    NA
                                           NA
                                                        NA
                                                                    NA
                                                                                  NA
## 84
                    NA
                                           NA
                                                        NA
                                                                    NA
                                                                                  NA
```

```
## 86
                   NA
                                        NA
                                                    NA
                                                                NA
                                                                             NA
##
  92
                   NΑ
                                        NΑ
                                                    NΑ
                                                               NΑ
                                                                             NΑ
##
  159
                   NA
                                        NA
                                                    NA
                                                               NA
                                                                             NA
##
       resBg.padj
                  tpm.counts.bg.1_KO tpm.counts.bg.2_KO tpm.counts.bg.3_KO
##
   28
               NA
                           118.66953
                                               117.8524
                                                                  117.69078
  66
               NA
                            86.35598
                                                82.4901
                                                                  84.17221
##
                           149.51095
                                               152.4723
                                                                  147.49128
##
  84
               NA
## 86
               NA
                                  NA
                                                     NA
                                                                         NA
##
  92
               NA
                           239.13690
                                               230.2251
                                                                  239.96324
                           207.40555
                                               208.6333
                                                                  216.51119
##
  159
               NA
##
       tpm.counts.bg.4_WT tpm.counts.bg.5_WT tpm.counts.bg.6_WT
   28
##
                124.56121
                                   113.44594
                                                      112.34934
##
   66
                 93.35145
                                    86.43731
                                                       94.67598
                150.85586
                                                      146.58218
##
  84
                                   156.40571
##
  86
                       NΑ
                                          NA
                                                             NA
##
  92
                220.18395
                                   234.93257
                                                      245.55370
  159
                200.91681
                                                      236.53894
##
                                   211.71368
##
                       BS_ID.1 tpm_support_KO
                                              tpm_support_WT tpm_supported down
##
  28
        ENSMUSG00000051223.bs3
                                                                       TRUE FALSE
                                            3
                                                           3
                                            3
                                                           3
##
   66
        ENSMUSG00000026289.bs7
                                                                       TRUE FALSE
##
  84
       ENSMUSG00000064302.bs14
                                            3
                                                           3
                                                                       TRUE FALSE
  86
                                           NA
                                                          NA
##
                                                                         NΑ
                                                                               NA
  92
        ENSMUSG00000026349.bs2
                                            3
                                                           3
                                                                       TRUE FALSE
##
       ENSMUSG00000026470.bs6
                                            3
                                                           3
                                                                       TRUE FALSE
##
  159
##
                                                                                  Sequence
##
  28
       AAAAAGAGGAGCUUGUAGCAGAGCAAGCCAUCAAGCACUUGAAGGUACUGGGAUUGUGAAGCUGUCACAGUUGGGGUGGGGU
##
   66
       CUUUCGUUUCCAGCUCUGGGGCCCAGACUCUAACACUAAGCAAGAUUGUGCCACAUAUAUGUAACCUACUGGGAGAUCCCAA
##
   84
##
      UGCAUAUAUUAGUAUUUAUAUGAAUGUUUUAGCAGUGUUAUCUGUGUUGAUUGUAGUUCUUGGCAGUAAUGUAUUGUGUUAA
   86
       AAACACUGCGAUUGUUUAUAUGCACAGGUUUUAUAUGCACCAUUCCUUCACCAAAUUCAACAGAAAUGUAAGUACUGUUUUA
  92
   159 CCUUGACUACAGAGAGGUACAGAAAGCAGUCAACACUGCCCAAGGAUUGUUUCAGAGAUGGACAGAGCUCCUUCAGGGCCCC
##
##
       rownum
##
  28
           28
  66
           66
##
##
  84
           84
##
  86
           86
## 92
           92
## 159
          159
```

#### Write to .fasta

this is deactivated for now because we only need it once right now just remove the eval if needed

```
candgeneNameAc <- as.list(seed1$geneName)
candrnameAc <- as.list(seed1$rownum)
condgeneSeqAc <- as.list(seed1$Sequence)

candgeneNameAnc <- as.list(seed2$geneName)
candrnameAnc <- as.list(seed2$rownum)
condgeneSeqAnc <- as.list(seed2$sequence)

#change to output directory</pre>
```

```
setwd("D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/fastafiles_complete/Ac")
for (i in 1:length(candgeneNameAc)) {
  write.fasta(condgeneSeqAc[i],candrnameAc[i],paste(candrnameAc[i], candgeneNameAc[i], "miR_181a", 'fas
}
setwd("D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/fastafiles_complete/Anc")
for (i in 1:length(candgeneNameAnc)) {
  write.fasta(condgeneSeqAnc[i],candrnameAnc[i],paste(candrnameAnc[i], candgeneNameAnc[i], "miR_181a",
}
Personalized Reader <- function(lambda){
read.table(lambda, sep = ":") %>% select(V1, V5, V6, V7, V10, V11)}
#remove NA file...I just dont get it....where is it coming from?
#File lists
reslistAc0 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAc1 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAc2 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAc3 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAc4 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAc5 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/r
reslistAnc0 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/
reslistAnc1 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/
reslistAnc2 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/
reslistAnc3 <- list.files(path = "D:/Krueger Lab/Publications/miR181 paper nongithub/Figure2/RNAhybrid/
reslistAnc4 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/
reslistAnc5 <- list.files(path = "D:/Krueger_Lab/Publications/miR181_paper_nongithub/Figure2/RNAhybrid/
#import
myfilelistAc0 <- lapply(reslistAc0, Personalized_Reader)</pre>
myfilelistAc1 <- lapply(reslistAc1, Personalized_Reader)</pre>
myfilelistAc2 <- lapply(reslistAc2, Personalized_Reader)</pre>
myfilelistAc3 <- lapply(reslistAc3, Personalized_Reader)</pre>
myfilelistAc4 <- lapply(reslistAc4, Personalized_Reader)</pre>
myfilelistAc5 <- lapply(reslistAc5, Personalized_Reader)</pre>
myfilelistAnc0 <- lapply(reslistAnc0, Personalized_Reader)</pre>
myfilelistAnc1 <- lapply(reslistAnc1, Personalized_Reader)</pre>
myfilelistAnc2 <- lapply(reslistAnc2, Personalized_Reader)</pre>
myfilelistAnc3 <- lapply(reslistAnc3, Personalized_Reader)</pre>
myfilelistAnc4 <- lapply(reslistAnc4, Personalized_Reader)</pre>
myfilelistAnc5 <- lapply(reslistAnc5, Personalized_Reader)</pre>
resframeAc0 <- bind_rows(myfilelistAc0)</pre>
resframeAc1 <- bind_rows(myfilelistAc1)</pre>
resframeAc2 <- bind_rows(myfilelistAc2)</pre>
resframeAc3 <- bind_rows(myfilelistAc3)</pre>
```

```
resframeAc4 <- bind_rows(myfilelistAc4)</pre>
resframeAc5 <- bind_rows(myfilelistAc5)</pre>
resframeAnc0 <- bind_rows(myfilelistAnc0)</pre>
resframeAnc1 <- bind_rows(myfilelistAnc1)</pre>
resframeAnc2 <- bind_rows(myfilelistAnc2)</pre>
resframeAnc3 <- bind_rows(myfilelistAnc3)</pre>
resframeAnc4 <- bind rows(myfilelistAnc4)</pre>
resframeAnc5 <- bind_rows(myfilelistAnc5)</pre>
#colnames
colnames(resframeAc0) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding</pre>
colnames(resframeAc1) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding</pre>
colnames(resframeAc2) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding
colnames(resframeAc3) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding</pre>
colnames(resframeAc4) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding
colnames(resframeAc5) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding
colnames(resframeAnc1) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding_bases", "non_binding_bases, "non_bind_bases, "non_bind_bases, "non_bind_bases, "non_bind_b
colnames(resframeAnc2) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding_bases")</pre>
colnames(resframeAnc3) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding_bases")</pre>
colnames(resframeAnc4) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding_bases", "non_binding_bases, "non_bind_bases, "non_bind_bases,
colnames(resframeAnc5) <- c("rownumber", "mfs", "pvalue", "start_position", "binding_bases", "non_binding_bases", "non_binding_bases, "non_bind_bases, "non_bind_bases, "non_bind_bases, 
resframeAc0[is.na(resframeAc0$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAc1[is.na(resframeAc1$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAc2[is.na(resframeAc2$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAc3[is.na(resframeAc3$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAc4[is.na(resframeAc4$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAc5[is.na(resframeAc5$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAnc0[is.na(resframeAnc0$non_binding_bases), "non_binding_bases"] <- "
resframeAnc1[is.na(resframeAnc1$non_binding_bases), "non_binding_bases"] <- "
resframeAnc2[is.na(resframeAnc2$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAnc3[is.na(resframeAnc3$non_binding_bases),"non_binding_bases"] <- "
resframeAnc4[is.na(resframeAnc4$non_binding_bases),"non_binding_bases"] <- "</pre>
resframeAnc5[is.na(resframeAnc5$non_binding_bases), "non_binding_bases"] <- "
```

#### merge with original df

```
# make seperate objects for each mature mirna just to see if they are much different
seed1$rownumber <- as.character(seed1$rownum)
seed2$rownumber <- as.character(seed2$rownum)

resframeAc0$rownumber <- as.character(resframeAc0$rownumber)
resframeAc1$rownumber <- as.character(resframeAc1$rownumber)
resframeAc2$rownumber <- as.character(resframeAc2$rownumber)
resframeAc3$rownumber <- as.character(resframeAc3$rownumber)
resframeAc4$rownumber <- as.character(resframeAc4$rownumber)</pre>
```

```
resframeAc5$rownumber <- as.character(resframeAc5$rownumber)</pre>
resframeAncO$rownumber <- as.character(resframeAncO$rownumber)</pre>
resframeAnc1$rownumber <- as.character(resframeAnc1$rownumber)</pre>
resframeAnc2$rownumber <- as.character(resframeAnc2$rownumber)</pre>
resframeAnc3$rownumber <- as.character(resframeAnc3$rownumber)</pre>
resframeAnc4$rownumber <- as.character(resframeAnc4$rownumber)</pre>
resframeAnc5$rownumber <- as.character(resframeAnc5$rownumber)
bsseqHAc0 <- left_join(seed1, resframeAc0, by="rownumber")</pre>
bsseqHAc1 <- left_join(seed1, resframeAc1, by="rownumber")</pre>
bsseqHAc2 <- left_join(seed1, resframeAc2, by="rownumber")</pre>
bsseqHAc3 <- left_join(seed1, resframeAc3, by="rownumber")</pre>
bsseqHAc4 <- left_join(seed1, resframeAc4, by="rownumber")</pre>
bsseqHAc5 <- left_join(seed1, resframeAc5, by="rownumber")</pre>
bsseqHAnc0 <- left_join(seed2, resframeAnc0, by="rownumber")</pre>
bsseqHAnc1 <- left_join(seed2, resframeAnc1, by="rownumber")</pre>
bsseqHAnc2 <- left_join(seed2, resframeAnc2, by="rownumber")</pre>
bsseqHAnc3 <- left join(seed2, resframeAnc3, by="rownumber")</pre>
bsseqHAnc4 <- left_join(seed2, resframeAnc4, by="rownumber")</pre>
bsseqHAnc5 <- left_join(seed2, resframeAnc5, by="rownumber")</pre>
```

## Process data (remove gaps)

Due to the loops in the mRNA there are additional spaces in the mirna. We only want the binding and non binding bases of hte mirna in te correct order. For that we will remove all gaps that origin in the mRNA loops.

```
#binding and non binding bases as characters in a list
Alistbbc0 <- strsplit(resframeAcO$binding_bases,"")</pre>
Alistbbc1 <- strsplit(resframeAc1$binding_bases,"")</pre>
Alistbbc2 <- strsplit(resframeAc2$binding_bases,"")</pre>
Alistbbc3 <- strsplit(resframeAc3$binding_bases,"")</pre>
Alistbbc4 <- strsplit(resframeAc4$binding bases,"")</pre>
Alistbbc5 <- strsplit(resframeAc5$binding_bases,"")</pre>
Alistbbnc0 <- strsplit(resframeAncO$binding_bases,"")</pre>
Alistbbnc1 <- strsplit(resframeAnc1$binding bases,"")</pre>
Alistbbnc2 <- strsplit(resframeAnc2$binding bases,"")</pre>
Alistbbnc3 <- strsplit(resframeAnc3$binding bases,"")</pre>
Alistbbnc4 <- strsplit(resframeAnc4$binding bases,"")</pre>
Alistbbnc5 <- strsplit(resframeAnc5$binding_bases,"")</pre>
Alistnbc0 <- strsplit(resframeAcO$non_binding_bases,"")</pre>
Alistnbc1 <- strsplit(resframeAc1$non_binding_bases,"")</pre>
Alistnbc2 <- strsplit(resframeAc2$non_binding_bases,"")</pre>
Alistnbc3 <- strsplit(resframeAc3$non_binding_bases,"")</pre>
Alistnbc4 <- strsplit(resframeAc4$non_binding_bases,"")</pre>
Alistnbc5 <- strsplit(resframeAc5$non_binding_bases,"")</pre>
```

```
Alistnbnc0 <- strsplit(resframeAnc0$non_binding_bases,"")</pre>
Alistnbnc1 <- strsplit(resframeAnc1$non_binding_bases,"")</pre>
Alistnbnc2 <- strsplit(resframeAnc2$non_binding_bases,"")</pre>
Alistnbnc3 <- strsplit(resframeAnc3$non binding bases,"")</pre>
Alistnbnc4 <- strsplit(resframeAnc4$non_binding_bases,"")</pre>
Alistnbnc5 <- strsplit(resframeAnc5$non_binding_bases,"")</pre>
#combine the two lists
Alistc0 <- Map(cbind, Alistbbc0, Alistnbc0)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistc1 <- Map(cbind, Alistbbc1, Alistnbc1)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistc2 <- Map(cbind, Alistbbc2, Alistnbc2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistc3 <- Map(cbind, Alistbbc3, Alistnbc3)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistc4 <- Map(cbind, Alistbbc4, Alistnbc4)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistc5 <- Map(cbind, Alistbbc5, Alistnbc5)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
```

```
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
## Warning in cbind(...): number of rows of result is not a multiple of vector
## length (arg 2)
Alistnc0 <- Map(cbind, Alistbbnc0, Alistnbnc0)
Alistnc1 <- Map(cbind, Alistbbnc1, Alistnbnc1)</pre>
Alistnc2 <- Map(cbind, Alistbbnc2, Alistnbnc2)</pre>
Alistnc3 <- Map(cbind, Alistbbnc3, Alistnbnc3)
Alistnc4 <- Map(cbind, Alistbbnc4, Alistnbnc4)
Alistnc5 <- Map(cbind, Alistbbnc5, Alistnbnc5)
Alistc0 <- lapply(Alistc0, as.data.frame)</pre>
Alistc1 <- lapply(Alistc1, as.data.frame)</pre>
Alistc2 <- lapply(Alistc2, as.data.frame)
Alistc3 <- lapply(Alistc3, as.data.frame)</pre>
Alistc4 <- lapply(Alistc4, as.data.frame)
Alistc5 <- lapply(Alistc5, as.data.frame)</pre>
Alistnc0 <- lapply(Alistnc0, as.data.frame)</pre>
Alistnc1 <- lapply(Alistnc1, as.data.frame)</pre>
Alistnc2 <- lapply(Alistnc2, as.data.frame)</pre>
Alistnc3 <- lapply(Alistnc3, as.data.frame)
Alistnc4 <- lapply(Alistnc4, as.data.frame)</pre>
Alistnc5 <- lapply(Alistnc5, as.data.frame)</pre>
#remove all empty rows (mRNA loops)
AlistOcO <- lapply(AlistcO, function(x){
 x[!(x[,1] == " " & x[,2] == " "),]
})
AlistOc1 <- lapply(Alistc1, function(x){
 x[!(x[,1] == " " \& x[,2] == " "),]
AlistOc2 <- lapply(Alistc2, function(x){
 x[!(x[,1] == " " & x[,2] == " "),]
AlistOc3 <- lapply(Alistc3, function(x){
 x[!(x[,1] == " " \& x[,2] == " "),]
AlistOc4 <- lapply(Alistc4, function(x){
 x[!(x[,1] == " " & x[,2] == " "),]
AlistOc5 <- lapply(Alistc5, function(x){
 x[!(x[,1] == " " \& x[,2] == " "),]
})
AlistOncO <- lapply(AlistncO, function(x){
 x[!(x[,1] == " " \& x[,2] == " "),]
})
AlistOnc1 <- lapply(Alistnc1, function(x){
 x[!(x[,1] == " " \& x[,2] == " "),]
AlistOnc2 <- lapply(Alistnc2, function(x){
```

```
x[!(x[,1] == " " & x[,2] == " "),]
})
AlistOnc3 <- lapply(Alistnc3, function(x){
  x[!(x[,1] == " " \& x[,2] == " "),]
})
AlistOnc4 <- lapply(Alistnc4, function(x){
 x[!(x[,1] == " " & x[,2] == " "),]
AlistOnc5 <- lapply(Alistnc5, function(x){
  x[!(x[,1] == " " & x[,2] == " "),]
})
#rewrite as characters
AlistFc0 <- lapply(AlistOc0, function(x){
 paste(x[,1], collapse = '')
})
AlistFc1 <- lapply(AlistOc1, function(x){
  paste(x[,1], collapse = '')
AlistFc2 <- lapply(AlistOc2, function(x){
  paste(x[,1], collapse = '')
AlistFc3 <- lapply(AlistOc3, function(x){
  paste(x[,1], collapse = '')
AlistFc4 <- lapply(AlistOc4, function(x){
  paste(x[,1], collapse = '')
})
AlistFc5 <- lapply(AlistOc5, function(x){
 paste(x[,1], collapse = '')
AlistFnc0 <- lapply(AlistOnc0, function(x){
  paste(x[,1], collapse = '')
})
AlistFnc1 <- lapply(AlistOnc1, function(x){
 paste(x[,1], collapse = '')
AlistFnc2 <- lapply(AlistOnc2, function(x){
 paste(x[,1], collapse = '')
AlistFnc3 <- lapply(AlistOnc3, function(x){
  paste(x[,1], collapse = '')
AlistFnc4 <- lapply(AlistOnc4, function(x){
 paste(x[,1], collapse = '')
AlistFnc5 <- lapply(AlistOnc5, function(x){
  paste(x[,1], collapse = '')
})
#Attach lists back onto original data.frame as new column
```

```
resframeAcO$binding_nospace <-unlist(AlistFc0)
resframeAc1$binding_nospace <-unlist(AlistFc1)
resframeAc2$binding_nospace <-unlist(AlistFc2)
resframeAc3$binding_nospace <-unlist(AlistFc3)
resframeAc4$binding_nospace <-unlist(AlistFc4)
resframeAc5$binding_nospace <-unlist(AlistFc5)

resframeAnc0$binding_nospace <-unlist(AlistFnc0)
resframeAnc1$binding_nospace <-unlist(AlistFnc1)
resframeAnc2$binding_nospace <-unlist(AlistFnc2)
resframeAnc3$binding_nospace <-unlist(AlistFnc3)
resframeAnc4$binding_nospace <-unlist(AlistFnc4)
resframeAnc5$binding_nospace <-unlist(AlistFnc5)</pre>
```

## Transform into Numbers

#### add 0s

replace all gaps with 0 and all letters with 1

```
#0
resframeAcO$binding_nospace <- chartr(" ", "0", resframeAcO$binding_nospace)</pre>
resframeAc1$binding_nospace <- chartr(" ", "0", resframeAc1$binding_nospace)</pre>
resframeAc2$binding_nospace <- chartr(" ", "0", resframeAc2$binding_nospace)</pre>
resframeAc3$binding_nospace <- chartr(" ", "0", resframeAc3$binding_nospace) resframeAc4$binding_nospace <- chartr(" ", "0", resframeAc4$binding_nospace)
resframeAc5$binding_nospace <- chartr(" ", "0", resframeAc5$binding_nospace)
resframeAncO$binding_nospace <- chartr(" ", "0", resframeAncO$binding_nospace)</pre>
resframeAnc1$binding_nospace <- chartr(" ", "0", resframeAnc1$binding_nospace)</pre>
resframeAnc2$binding_nospace <- chartr(" ", "0", resframeAnc2$binding_nospace)
resframeAnc3$binding_nospace <- chartr(" ", "0", resframeAnc3$binding_nospace)
resframeAnc4$binding_nospace <- chartr(" ", "0", resframeAnc4$binding_nospace)
resframeAnc5$binding_nospace <- chartr(" ", "0", resframeAnc5$binding_nospace)
#1
resframeAcO$binding nospace <- mgsub::mgsub(resframeAcO$binding nospace, c("A", "U", "C", "G"), c(rep("
resframeAc1$binding_nospace <- mgsub::mgsub(resframeAc1$binding_nospace, c("A", "U", "C", "G"), c(rep("
resframeAc2$binding_nospace <- mgsub::mgsub(resframeAc2$binding_nospace, c("A", "U", "C", "G"), c(rep("
resframeAc3$binding_nospace <- mgsub::mgsub(resframeAc3$binding_nospace, c("A", "U", "C", "G"), c(rep("
resframeAc4$binding_nospace <- mgsub::mgsub(resframeAc4$binding_nospace, c("A", "U", "C", "G"), c(rep("
resframeAc5$binding_nospace <- mgsub::mgsub(resframeAc5$binding_nospace, c("A", "U", "C", "G"), c(rep("
resframeAncO$binding_nospace <- mgsub::mgsub(resframeAncO$binding_nospace, c("A", "U", "C", "G"), c(rep
resframeAnc1$binding_nospace <- mgsub::mgsub(resframeAnc1$binding_nospace, c("A", "U", "C", "G"), c(rep
resframeAnc2$binding_nospace <- mgsub::mgsub(resframeAnc2$binding_nospace, c("A", "U", "C", "G"), c(rep
resframeAnc3$binding_nospace <- mgsub::mgsub(resframeAnc3$binding_nospace, c("A", "U", "C", "G"), c(rep
resframeAnc4$binding_nospace <- mgsub::mgsub(resframeAnc4$binding_nospace, c("A", "U", "C", "G"), c(rep
resframeAnc5$binding_nospace <- mgsub::mgsub(resframeAnc5$binding_nospace, c("A", "U", "C", "G"), c(rep
```

#### seperate into columns

for each base make 1 column so it can be added and also put into a heatmap

```
#for the heatmap with every binding site
heatframeAcO <- do.call(rbind.data.frame, strsplit(resframeAcO$binding_nospace,""))
heatframeAc1 <- do.call(rbind.data.frame, strsplit(resframeAc1$binding_nospace,""))
heatframeAc2 <- do.call(rbind.data.frame, strsplit(resframeAc2$binding_nospace,""))
heatframeAc3 <- do.call(rbind.data.frame, strsplit(resframeAc3$binding_nospace,""))
heatframeAc4 <- do.call(rbind.data.frame, strsplit(resframeAc4$binding_nospace,""))
heatframeAc5 <- do.call(rbind.data.frame, strsplit(resframeAc5$binding_nospace,""))
heatframeAnc0 <- do.call(rbind.data.frame, strsplit(resframeAnc0$binding_nospace,""))
heatframeAnc1 <- do.call(rbind.data.frame, strsplit(resframeAnc1$binding_nospace,""))
heatframeAnc2 <- do.call(rbind.data.frame, strsplit(resframeAnc2$binding_nospace,""))
heatframeAnc3 <- do.call(rbind.data.frame, strsplit(resframeAnc3$binding_nospace,""))
heatframeAnc4 <- do.call(rbind.data.frame, strsplit(resframeAnc4$binding nospace,""))
heatframeAnc5 <- do.call(rbind.data.frame, strsplit(resframeAnc5$binding_nospace,""))
heatframeAc0 <- sapply( heatframeAc0, as.numeric )</pre>
heatframeAc1 <- sapply( heatframeAc1, as.numeric )</pre>
heatframeAc2 <- sapply( heatframeAc2, as.numeric )</pre>
heatframeAc3 <- sapply( heatframeAc3, as.numeric )</pre>
heatframeAc4 <- sapply( heatframeAc4, as.numeric )</pre>
heatframeAc5 <- sapply( heatframeAc5, as.numeric )</pre>
heatframeAnc0 <- sapply( heatframeAnc0, as.numeric )</pre>
heatframeAnc1 <- sapply( heatframeAnc1, as.numeric )</pre>
heatframeAnc2 <- sapply( heatframeAnc2, as.numeric )</pre>
heatframeAnc3 <- sapply( heatframeAnc3, as.numeric )</pre>
heatframeAnc4 <- sapply( heatframeAnc4, as.numeric )</pre>
heatframeAnc5 <- sapply( heatframeAnc5, as.numeric )</pre>
colnames(heatframeAc0) <- c(23:1)</pre>
colnames(heatframeAc1) <- c(23:1)</pre>
colnames(heatframeAc2) <- c(23:1)</pre>
colnames(heatframeAc3) <- c(23:1)</pre>
colnames(heatframeAc4) <- c(23:1)</pre>
colnames(heatframeAc5) <- c(23:1)</pre>
colnames(heatframeAnc0) <- c(23:1)</pre>
colnames(heatframeAnc1) <- c(23:1)</pre>
colnames(heatframeAnc2) <- c(23:1)</pre>
colnames(heatframeAnc3) <- c(23:1)</pre>
colnames(heatframeAnc4) <- c(23:1)</pre>
colnames(heatframeAnc5) <- c(23:1)</pre>
rownames(heatframeAc0) <- resframeAc0[,1]</pre>
rownames(heatframeAc1) <- resframeAc1[,1]</pre>
rownames(heatframeAc2) <- resframeAc2[,1]</pre>
rownames(heatframeAc3) <- resframeAc3[,1]</pre>
rownames(heatframeAc4) <- resframeAc4[,1]</pre>
rownames(heatframeAc5) <- resframeAc5[,1]</pre>
```

```
rownames(heatframeAnc0) <- resframeAnc0[,1]</pre>
rownames(heatframeAnc1) <- resframeAnc1[,1]</pre>
rownames(heatframeAnc2) <- resframeAnc2[,1]</pre>
rownames(heatframeAnc3) <- resframeAnc3[,1]</pre>
rownames(heatframeAnc4) <- resframeAnc4[,1]</pre>
rownames(heatframeAnc5) <- resframeAnc5[,1]</pre>
#reverse column order
heatframeAc0 <-heatframeAc0[,23:1]
heatframeAc1 <-heatframeAc1[,23:1]
heatframeAc2 <-heatframeAc2[,23:1]
heatframeAc3 <-heatframeAc3[,23:1]
heatframeAc4 <-heatframeAc4[,23:1]
heatframeAc5 <-heatframeAc5[,23:1]
heatframeAnc0 <-heatframeAnc0[,23:1]
heatframeAnc1 <-heatframeAnc1[,23:1]
heatframeAnc2 <-heatframeAnc2[,23:1]
heatframeAnc3 <-heatframeAnc3[,23:1]
heatframeAnc4 <-heatframeAnc4[,23:1]
heatframeAnc5 <-heatframeAnc5[,23:1]
```

## Heatmap

```
Colours
hmcols1 <- c("white", "black")
```

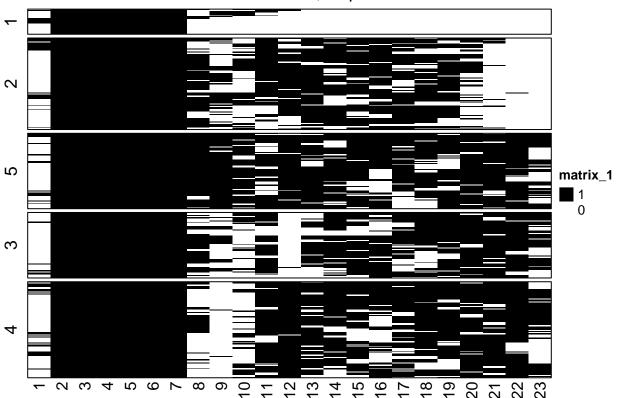
#### Heatmap of all the single reads

make heatmap without column clustering but with row clustering

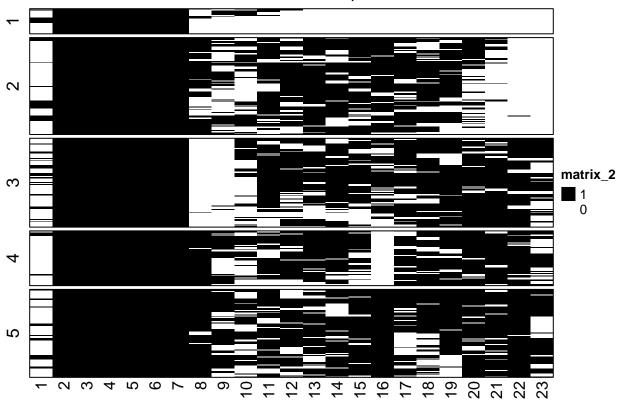
```
HMAcO <- Heatmap(heatframeAcO, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, show
set.seed(123)
HMAc1 <- Heatmap(heatframeAc1, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, show
set.seed(123)
HMAc2 <- Heatmap(heatframeAc2, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, show
set.seed(123)
HMAc3 <- Heatmap(heatframeAc3, cluster columns = F, col = hmcols1, row km = 5, show row names = F, show
set.seed(123)
HMAc4 <- Heatmap(heatframeAc4, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, show
set.seed(123)
HMAc5 <- Heatmap(heatframeAc5, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, show
set.seed(123)
HMAnc0 <- Heatmap(heatframeAnc0, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, sh
set.seed(123)
HMAnc1 <- Heatmap(heatframeAnc1, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, sh
set.seed(123)
HMAnc2 <- Heatmap(heatframeAnc2, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, sh
set.seed(123)
```

HMAnc3 <- Heatmap(heatframeAnc3, cluster\_columns = F, col = hmcols1, row\_km = 5, show\_row\_names = F, sh

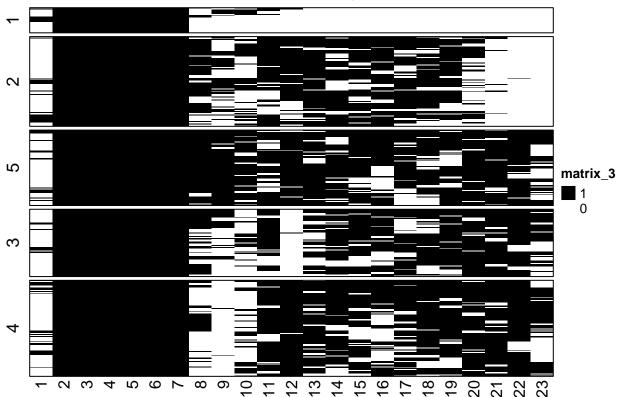
```
set.seed(123)
HMAnc4 <- Heatmap(heatframeAnc4, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, sh
set.seed(123)
HMAnc5 <- Heatmap(heatframeAnc5, cluster_columns = F, col = hmcols1, row_km = 5, show_row_names = F, sh
# canonical seed, loop=0
HMAc0</pre>
```



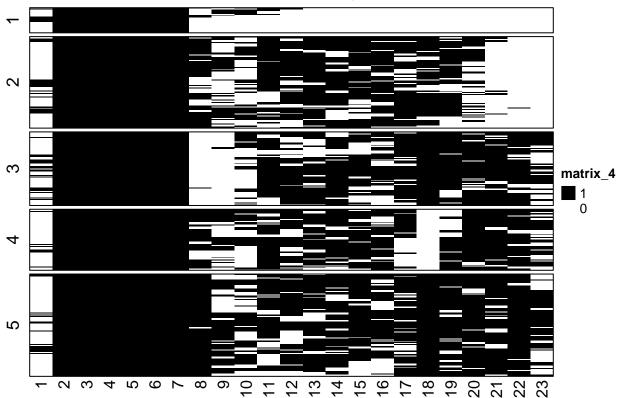
canonical seed, loop=1



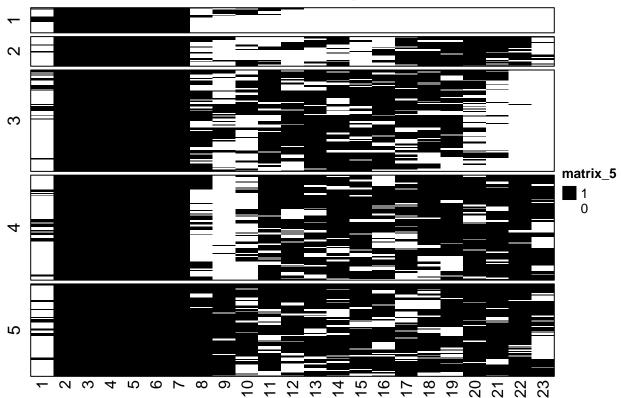
canonical seed, loop=2



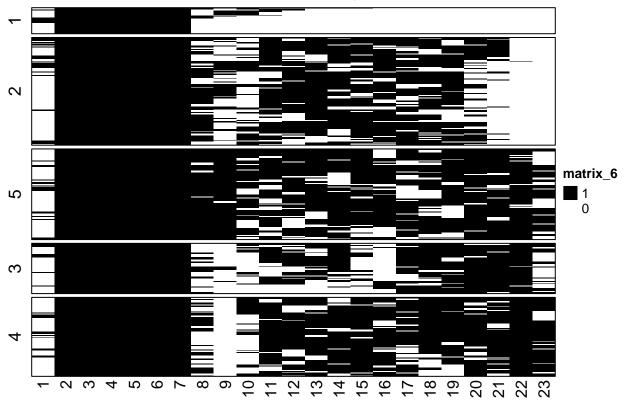
canonical seed, loop=3



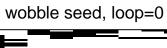
canonical seed, loop=4

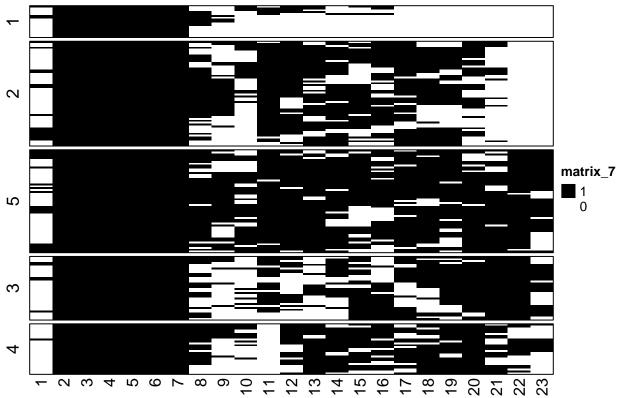


canonical seed, loop=5

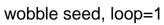


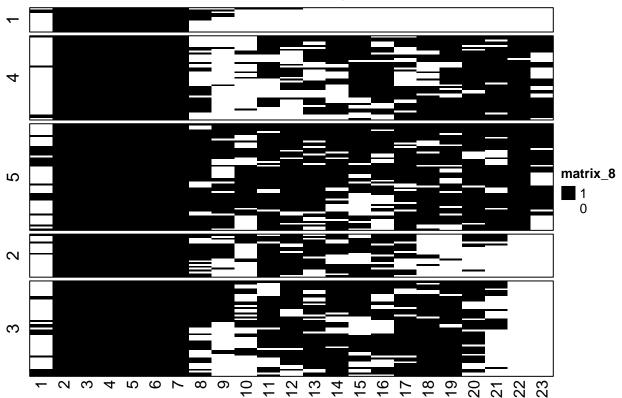
# wobble seed, loop=0
HMAncO





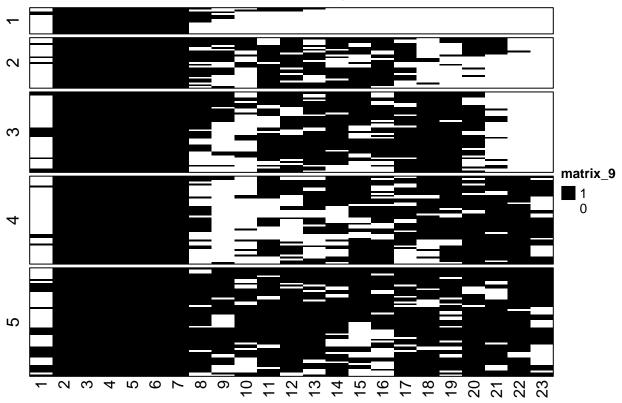
# wobble seed, loop=1 HMAnc1



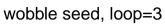


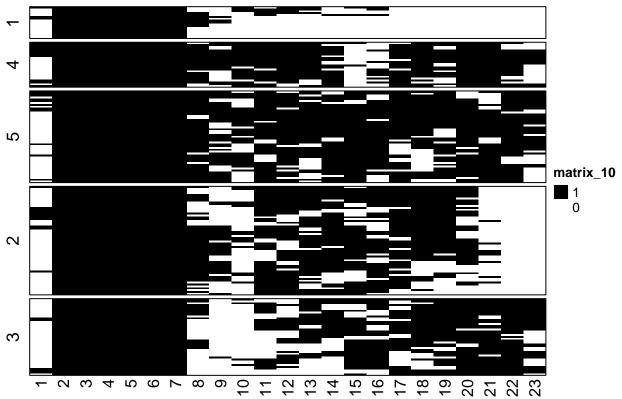
# wobble seed, loop=2
HMAnc2



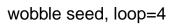


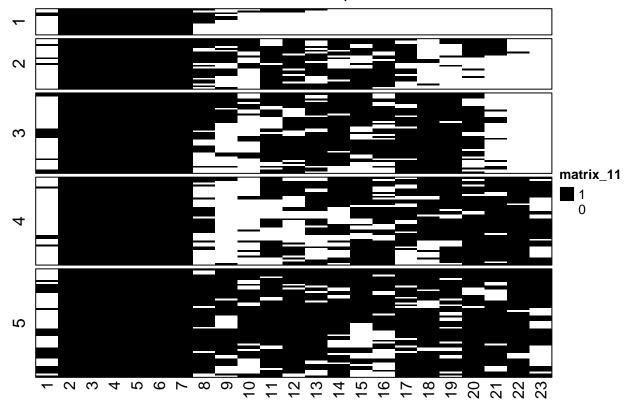
# wobble seed, loop=3
HMAnc3





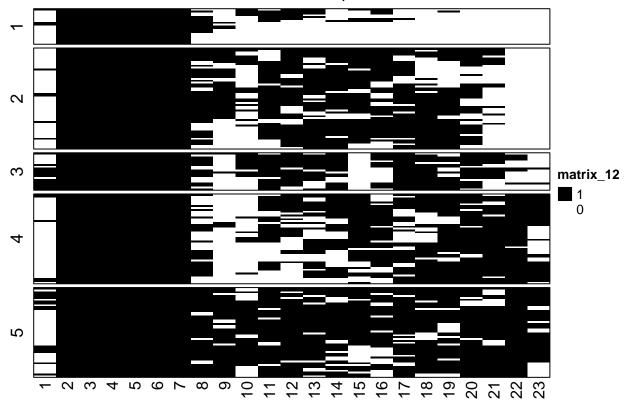
# wobble seed, loop=4
HMAnc4





# wobble seed, loop=5
HMAnc5

## wobble seed, loop=5



## session info

```
sessionInfo()
```

```
## R version 4.2.3 (2023-03-15 ucrt)
## Platform: x86 64-w64-mingw32/x64 (64-bit)
## Running under: Windows 10 x64 (build 19045)
## Matrix products: default
##
## locale:
## [1] LC_COLLATE=German_Germany.utf8 LC_CTYPE=German_Germany.utf8
## [3] LC_MONETARY=German_Germany.utf8 LC_NUMERIC=C
## [5] LC_TIME=German_Germany.utf8
##
## attached base packages:
## [1] grid
                 stats4
                                     graphics grDevices utils
                                                                   datasets
                           stats
## [8] methods
                 base
##
## other attached packages:
  [1] gridExtra_2.3
                                           stringr_1.5.0
##
## [3] seqinr_4.2-30
                                           ComplexHeatmap_2.15.2
## [5] circlize_0.4.15
                                           ggplot2_3.4.2
                                           BSgenome.Mmusculus.UCSC.mm10_1.4.3
## [7] dplyr_1.1.1
## [9] BSgenome_1.66.3
                                           rtracklayer_1.58.0
```

```
## [11] Biostrings_2.66.0
                                           XVector_0.38.0
                                           GenomeInfoDb_1.34.9
## [13] GenomicRanges_1.50.2
## [15] IRanges 2.32.0
                                           S4Vectors_0.36.2
## [17] BiocGenerics_0.44.0
## loaded via a namespace (and not attached):
## [1] MatrixGenerics 1.10.0
                                    Biobase 2.58.0
## [3] foreach_1.5.2
                                    highr_0.10
## [5] GenomeInfoDbData_1.2.9
                                    Rsamtools_2.14.0
## [7] yaml_2.3.7
                                    pillar_1.9.0
## [9] lattice_0.20-45
                                    glue_1.6.2
## [11] digest_0.6.31
                                    RColorBrewer_1.1-3
                                    htmltools_0.5.4
## [13] colorspace_2.1-0
                                    XML_3.99-0.14
## [15] Matrix_1.5-3
## [17] pkgconfig_2.0.3
                                    GetoptLong_1.0.5
## [19] magick_2.7.4
                                    zlibbioc_1.44.0
## [21] scales_1.2.1
                                    BiocParallel_1.32.6
## [23] tibble 3.2.1
                                    generics 0.1.3
## [25] withr_2.5.0
                                    SummarizedExperiment_1.28.0
## [27] cli_3.6.0
                                    magrittr_2.0.3
## [29] crayon_1.5.2
                                    evaluate_0.20
## [31] fansi_1.0.4
                                    doParallel_1.0.17
## [33] MASS_7.3-58.2
                                    Cairo_1.6-0
## [35] tools 4.2.3
                                    GlobalOptions_0.1.2
## [37] BiocIO 1.8.0
                                    lifecycle_1.0.3
## [39] matrixStats_0.63.0
                                    mgsub_1.7.3
## [41] munsell_0.5.0
                                    cluster_2.1.4
## [43] DelayedArray_0.23.2
                                    ade4_1.7-22
## [45] compiler_4.2.3
                                    rlang_1.1.0
## [47] RCurl_1.98-1.12
                                    iterators_1.0.14
## [49] rstudioapi_0.14
                                    rjson_0.2.21
## [51] bitops_1.0-7
                                    rmarkdown_2.21
## [53] restfulr_0.0.15
                                    gtable_0.3.3
## [55] codetools_0.2-19
                                    R6_2.5.1
## [57] GenomicAlignments_1.34.1
                                    knitr_1.42
## [59] fastmap_1.1.1
                                    utf8_1.2.3
## [61] clue_0.3-64
                                    shape 1.4.6
## [63] stringi_1.7.12
                                    parallel_4.2.3
## [65] Rcpp_1.0.10
                                    vctrs_0.6.1
## [67] png_0.1-8
                                    tidyselect_1.2.0
## [69] xfun 0.37
```