WGCNA

Ximing Ran

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1. Read the count data

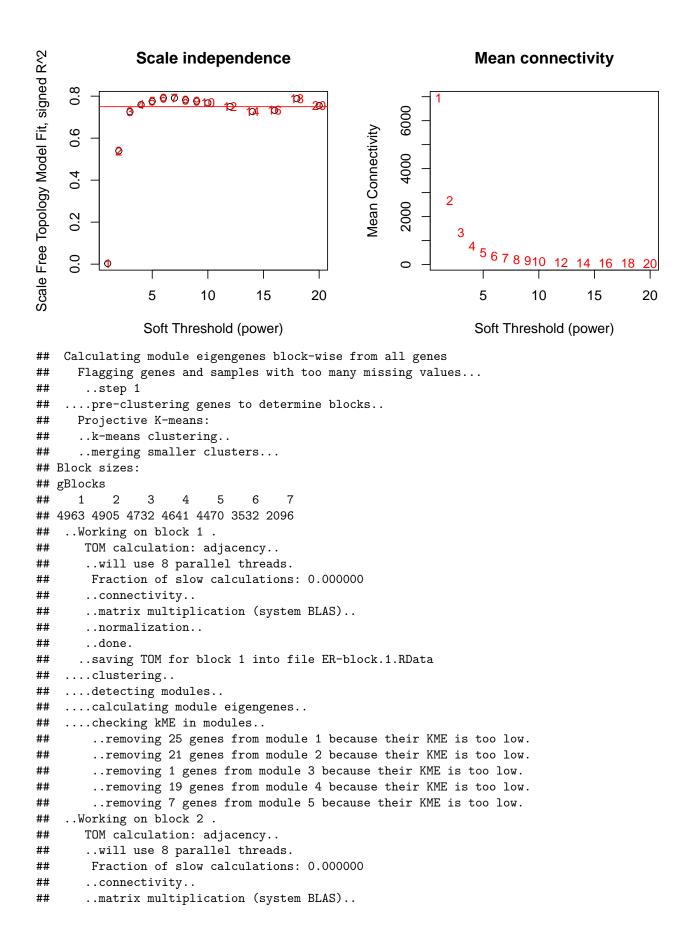
In this section, we will read the clean count data from the synaptosomes_miRNARNA folder. The data is stored in the format of .csv. We will read the data and filter the columns based on the condition list. The final table will be stored in results/02-DEG-Vehicle/DESeq2_results.csv.

2. Normalization to RPKMs

[1] 41057

2. WGCNA analysis

```
## Allowing multi-threading with up to 8 threads.
## pickSoftThreshold: will use block size 1524.
    pickSoftThreshold: calculating connectivity for given powers...
##
      ..working on genes 1 through 1524 of 29339
##
      ..working on genes 1525 through 3048 of 29339
##
      ..working on genes 3049 through 4572 of 29339
##
      ..working on genes 4573 through 6096 of 29339
##
      ..working on genes 6097 through 7620 of 29339
##
      ..working on genes 7621 through 9144 of 29339
##
      ..working on genes 9145 through 10668 of 29339
##
      ..working on genes 10669 through 12192 of 29339
##
      ..working on genes 12193 through 13716 of 29339
##
      ..working on genes 13717 through 15240 of 29339
##
      ..working on genes 15241 through 16764 of 29339
##
      ..working on genes 16765 through 18288 of 29339
##
      ..working on genes 18289 through 19812 of 29339
##
      ..working on genes 19813 through 21336 of 29339
##
      ..working on genes 21337 through 22860 of 29339
##
      ..working on genes 22861 through 24384 of 29339
##
      ..working on genes 24385 through 25908 of 29339
##
      ..working on genes 25909 through 27432 of 29339
##
      ..working on genes 27433 through 28956 of 29339
##
      ..working on genes 28957 through 29339 of 29339
##
                       slope truncated.R.sq mean.k. median.k. max.k.
      Power SFT.R.sq
## 1
          1
            0.00307 -0.0914
                                       0.384
                                              6940.0
                                                        6850.00
                                                                 10300
## 2
          2
             0.53900 -0.9810
                                       0.684
                                              2660.0
                                                        2400.00
                                                                  5480
## 3
            0.72600 -1.2300
                                       0.841
                                               1320.0
                                                        1060.00
                                                                  3530
## 4
          4
             0.75900 -1.3200
                                       0.889
                                                767.0
                                                         561.00
                                                                  2520
## 5
                                       0.920
                                                495.0
          5
             0.77600 - 1.3700
                                                         346.00
                                                                  1910
## 6
          6
            0.79100 -1.4100
                                       0.946
                                                344.0
                                                         249.00
                                                                  1500
## 7
          7
             0.79100 -1.4600
                                       0.961
                                                253.0
                                                         181.00
                                                                  1220
             0.78200 -1.4900
                                       0.962
                                                194.0
                                                         131.00
                                                                  1020
## 8
          8
## 9
          9
             0.77600 -1.5100
                                       0.966
                                                153.0
                                                          97.00
                                                                    861
                                                                   740
## 10
         10 0.76800 -1.5300
                                       0.963
                                                125.0
                                                          73.10
## 11
         12 0.75100 -1.5300
                                       0.949
                                                88.3
                                                          43.50
                                                                   564
                                                          27.20
                                                                    445
## 12
         14 0.72700 -1.4800
                                       0.918
                                                 66.9
## 13
         16 0.73200 -1.3800
                                       0.883
                                                 53.4
                                                          17.50
                                                                    361
## 14
         18 0.78800 -1.1700
                                       0.843
                                                 44.4
                                                          11.70
                                                                    299
## 15
         20 0.75500 -1.1400
                                       0.758
                                                 38.1
                                                           8.07
                                                                    267
```



```
##
       ..normalization..
##
       ..done.
##
      ..saving TOM for block 2 into file ER-block.2.RData
##
    ....clustering..
##
    ....detecting modules..
##
    ....calculating module eigengenes..
    ....checking kME in modules..
##
        ..removing 25 genes from module 1 because their KME is too low.
##
        ..removing 26 genes from module 2 because their KME is too low.
##
        ..removing 9 genes from module 3 because their KME is too low.
##
        ..removing 60 genes from module 4 because their KME is too low.
##
        ..removing 20 genes from module 5 because their KME is too low.
##
        ..removing 13 genes from module 6 because their KME is too low.
##
        ..removing 2 genes from module 7 because their KME is too low.
##
        ..removing 1 genes from module 9 because their KME is too low.
##
        ..removing 2 genes from module 10 because their KME is too low.
##
    ..Working on block 3 .
##
       TOM calculation: adjacency...
##
       ..will use 8 parallel threads.
##
        Fraction of slow calculations: 0.000000
##
       ..connectivity..
##
       ..matrix multiplication (system BLAS)..
##
       ..normalization..
##
       ..done.
##
      ..saving TOM for block 3 into file ER-block.3.RData
   ....clustering..
##
    ....detecting modules..
##
    ....calculating module eigengenes..
##
    ....checking kME in modules..
##
        ..removing 52 genes from module 1 because their KME is too low.
##
        ..removing 21 genes from module 2 because their KME is too low.
##
        ..removing 8 genes from module 3 because their KME is too low.
##
        ..removing 22 genes from module 4 because their KME is too low.
##
        ..removing 12 genes from module 5 because their KME is too low.
##
        ..removing 1 genes from module 6 because their KME is too low.
##
    ..Working on block 4 .
##
       TOM calculation: adjacency...
##
       ..will use 8 parallel threads.
##
        Fraction of slow calculations: 0.000000
##
       ..connectivity..
       ..matrix multiplication (system BLAS)..
##
##
       ..normalization..
##
       ..done.
##
      ..saving TOM for block 4 into file ER-block.4.RData
    ....clustering..
    ....detecting modules..
##
##
    ....calculating module eigengenes..
##
    ....checking kME in modules..
##
        ..removing 1 genes from module 1 because their KME is too low.
##
        ..removing 4 genes from module 2 because their KME is too low.
##
        ..removing 17 genes from module 3 because their KME is too low.
##
        ..removing 15 genes from module 4 because their KME is too low.
##
        ..removing 6 genes from module 5 because their KME is too low.
    ..Working on block 5 .
```

```
##
       TOM calculation: adjacency...
##
       ..will use 8 parallel threads.
       Fraction of slow calculations: 0.000000
##
##
       ..connectivity..
##
       ..matrix multiplication (system BLAS)..
##
       ..normalization..
##
      ..saving TOM for block 5 into file ER-block.5.RData
##
##
    ....clustering..
##
    ....detecting modules..
    ....calculating module eigengenes..
    ....checking kME in modules..
##
##
        ..removing 18 genes from module 1 because their KME is too low.
##
        ..removing 8 genes from module 2 because their KME is too low.
##
        ..removing 32 genes from module 3 because their KME is too low.
##
        ..removing 25 genes from module 4 because their KME is too low.
##
        ..removing 10 genes from module 5 because their KME is too low.
##
        ..removing 22 genes from module 6 because their KME is too low.
##
        ..removing 7 genes from module 7 because their KME is too low.
##
        ..removing 4 genes from module 9 because their KME is too low.
##
    ..Working on block 6 .
##
       TOM calculation: adjacency..
##
       ..will use 8 parallel threads.
        Fraction of slow calculations: 0.000000
##
##
       ..connectivity..
##
       ..matrix multiplication (system BLAS)..
##
       ..normalization..
##
       ..done.
##
      ..saving TOM for block 6 into file ER-block.6.RData
    ....clustering..
##
    ....detecting modules..
##
    ....calculating module eigengenes..
##
    ....checking kME in modules..
##
        ..removing 13 genes from module 1 because their KME is too low.
##
        ..removing 14 genes from module 2 because their KME is too low.
##
        ..removing 8 genes from module 3 because their KME is too low.
##
        ..removing 10 genes from module 4 because their KME is too low.
##
        ..removing 5 genes from module 5 because their KME is too low.
##
        ..removing 11 genes from module 6 because their KME is too low.
##
    ..Working on block 7 .
       TOM calculation: adjacency...
##
##
       ..will use 8 parallel threads.
        Fraction of slow calculations: 0.000000
##
##
       ..connectivity..
       ..matrix multiplication (system BLAS)..
##
##
       ..normalization..
##
       ..done.
##
      ...saving TOM for block 7 into file ER-block.7.RData
##
   ....clustering..
##
    ....detecting modules..
##
    ....calculating module eigengenes..
##
   ....checking kME in modules..
##
        ..removing 28 genes from module 1 because their KME is too low.
##
        ..removing 22 genes from module 2 because their KME is too low.
```

```
..removing 15 genes from module 3 because their KME is too low.
##
##
        ..removing 7 genes from module 4 because their KME is too low.
     ..reassigning 23 genes from module 1 to modules with higher KME.
##
##
     ..reassigning 1 genes from module 2 to modules with higher KME.
##
     ..reassigning 4 genes from module 3 to modules with higher KME.
##
     ..reassigning 8 genes from module 4 to modules with higher KME.
##
     ..reassigning 6 genes from module 7 to modules with higher KME.
##
     ..reassigning 5 genes from module 8 to modules with higher KME.
##
     ..reassigning 1 genes from module 9 to modules with higher KME.
##
     ..reassigning 2 genes from module 10 to modules with higher KME.
##
     ..reassigning 2 genes from module 17 to modules with higher KME.
##
     ..reassigning 16 genes from module 18 to modules with higher KME.
##
     ..reassigning 1 genes from module 19 to modules with higher KME.
##
     ..reassigning 1 genes from module 20 to modules with higher KME.
##
     ..reassigning 3 genes from module 21 to modules with higher KME.
##
     ..reassigning 1 genes from module 22 to modules with higher KME.
##
     ..reassigning 10 genes from module 24 to modules with higher KME.
##
     ..reassigning 1 genes from module 25 to modules with higher KME.
##
     ..reassigning 1 genes from module 26 to modules with higher KME.
##
     ..reassigning 2 genes from module 27 to modules with higher KME.
##
     ..reassigning 1 genes from module 28 to modules with higher KME.
##
     ..reassigning 1 genes from module 29 to modules with higher KME.
##
     ..reassigning 4 genes from module 30 to modules with higher KME.
     ..reassigning 4 genes from module 32 to modules with higher KME.
##
##
     ..reassigning 2 genes from module 33 to modules with higher KME.
##
     ..reassigning 2 genes from module 35 to modules with higher KME.
##
     ..reassigning 1 genes from module 37 to modules with higher KME.
##
     ..reassigning 3 genes from module 39 to modules with higher KME.
##
     ..reassigning 1 genes from module 40 to modules with higher KME.
##
     ..reassigning 2 genes from module 41 to modules with higher KME.
##
     ..reassigning 1 genes from module 42 to modules with higher KME.
##
     ..reassigning 4 genes from module 45 to modules with higher KME.
##
     ..reassigning 1 genes from module 46 to modules with higher KME.
##
     ..reassigning 1 genes from module 47 to modules with higher KME.
##
    ..merging modules that are too close..
##
        mergeCloseModules: Merging modules whose distance is less than 0.15
##
          Calculating new MEs...
##
  pdf
##
     2
## pdf
##
## mergedColors
##
             black
                               blue
                                              brown
                                                                cyan
                                                                            darkgreen
##
               863
                               2131
                                               1892
                                                                 713
                                                                                  578
##
          darkgrey
                        darkmagenta
                                     darkolivegreen
                                                          darkorange
                                                                         darkorange2
##
               559
                                393
                                                 422
                                                                 530
##
           darkred
                     darkturquoise
                                        floralwhite
                                                               green
                                                                          greenyellow
##
               585
                                565
                                                  90
                                                                1014
                                                                                  797
##
              grey
                             grey60
                                              ivory
                                                           lightcyan
                                                                           lightcyan1
##
               649
                                645
                                                 113
                                                                 675
                                                                                  130
                                        lightyellow
##
        lightgreen lightsteelblue1
                                                             magenta
                                                                       mediumpurple3
##
               619
                                                 596
                                                                                  132
                                131
                                                                 817
```

```
##
      midnightblue
                                          orangered4
                             orange
                                                       paleturquoise
                                                                                 pink
##
                                                                                  862
               709
                                553
                                                 138
                                                                  461
                                                           royalblue
##
             plum1
                             purple
                                                 red
                                                                          saddlebrown
                                                                                   484
##
               221
                                812
                                                 872
                                                                  588
##
            salmon
                            sienna3
                                             skyblue
                                                            skyblue3
                                                                            steelblue
                                365
##
               713
                                                 493
                                                                                   477
                                                                  243
                                                                               yellow
##
               tan
                          turquoise
                                              violet
                                                               white
##
               794
                               2269
                                                 445
                                                                  503
                                                                                 1299
##
       yellowgreen
##
               336
## [1] 46
   [1] 20
##
          1
   # A tibble: 46 x 6
##
      module
                    estimate1 estimate2 statistic p.value
                                                               p.adj
##
      <chr>
                         <dbl>
                                   <dbl>
                                              <dbl>
                                                       <dbl>
                                                                <dbl>
                                               5.01 0.000267 0.00613
##
    1 MEdarkgreen
                        0.171
                                 -0.171
    2 MEskyblue3
                       -0.166
                                  0.166
                                              -4.70 0.000198 0.00613
    3 MElightcyan
                       -0.137
                                              -3.29 0.00622
                                                             0.0945
##
                                  0.137
##
    4 MEsienna3
                        0.135
                                 -0.135
                                               3.21 0.0103
                                                             0.0945
##
    5 MEturquoise
                        0.130
                                 -0.130
                                               3.03 0.00963
                                                             0.0945
    6 MEyellowgreen
                                 -0.119
                                               2.67 0.0167
                                                             0.128
                        0.119
##
    7 MEmagenta
                       -0.105
                                  0.105
                                              -2.25 0.0428
                                                             0.281
##
    8 MEyellow
                                               2.23 0.0522
                                                             0.300
                        0.104
                                 -0.104
    9 MEgrey
                       -0.0955
                                  0.0955
                                              -2.00 0.0672
                                                             0.343
                                              -1.91 0.0878
## 10 MEdarkorange2
                       -0.0918
                                  0.0918
                                                             0.362
## # i 36 more rows
##
                 module
                                  cor
                                            p.value
## 1
            MEdarkgreen 0.763017163 9.120366e-05 0.004092132
## 2
             MEskyblue3 -0.742397164 1.779188e-04 0.004092132
##
  3
            MElightcyan -0.612752771 4.073717e-03 0.055855466
## 4
              MEsienna3
                         0.603338127 4.856997e-03 0.055855466
## 5
                         0.580705603 7.258383e-03 0.066777122
            MEturquoise
## 6
          MEyellowgreen 0.532385610 1.567041e-02 0.120139796
## 7
              MEmagenta -0.468957550 3.699505e-02 0.221308378
## 8
               MEyellow 0.465745322 3.848841e-02 0.221308378
## 9
                 MEgrey -0.426964586 6.044480e-02 0.307464511
## 10
          MEdarkorange2 -0.410764169 7.200601e-02 0.307464511
## 11
               MEpurple -0.404106264 7.720868e-02 0.307464511
## 12
                MEwhite 0.400418465 8.020813e-02 0.307464511
## 13
                 MEblue -0.351588067 1.284804e-01 0.451509231
  14
                MEbrown 0.331529608 1.533101e-01 0.451509231
      MElightsteelblue1 -0.326398022 1.601630e-01 0.451509231
  15
               MEgrey60 -0.308872567 1.851531e-01 0.451509231
## 16
               MEsalmon 0.268686387 2.520224e-01 0.451509231
## 17
## 18
          MEsaddlebrown -0.262116510 2.642497e-01 0.451509231
## 19
        MEpaleturquoise -0.261004985 2.663547e-01 0.451509231
## 20
            MEroyalblue 0.258636733 2.708748e-01 0.451509231
## 21
        MEdarkturquoise -0.254673912 2.785449e-01 0.451509231
## 22
                 MEpink 0.253740020 2.803719e-01 0.451509231
## 23
          MEgreenyellow
                         0.251552001 2.846815e-01 0.451509231
## 24
                  MEtan
                          0.250041560 2.876803e-01 0.451509231
## 25
                  MEred 0.249998292 2.877665e-01 0.451509231
```

```
## 26
          MEdarkmagenta 0.247208029 2.933582e-01 0.451509231
## 27
           MEdarkorange 0.245654117 2.965009e-01 0.451509231
## 28
         MEmidnightblue -0.241168271 3.056882e-01 0.451509231
## 29
                 MEcyan 0.240228923 3.076336e-01 0.451509231
## 30
               MEorange 0.235415353 3.177199e-01 0.451509231
## 31
               MEviolet -0.232832509 3.232126e-01 0.451509231
## 32
            MEsteelblue 0.227845329 3.339771e-01 0.451509231
## 33
           MElightgreen -0.225589372 3.389150e-01 0.451509231
## 34
       MEdarkolivegreen -0.222356168 3.460660e-01 0.451509231
## 35
              MEskyblue -0.219662716 3.520897e-01 0.451509231
## 36
          MElightyellow -0.219100348 3.533551e-01 0.451509231
## 37
              MEdarkred -0.213230072 3.667192e-01 0.455921106
## 38
           MEorangered4 -0.177914445 4.529874e-01 0.548353167
## 39
                MEblack 0.172148624 4.679945e-01 0.551993568
## 40
                MEivory 0.158963051 5.032363e-01 0.578721802
## 41
                MEplum1
                         0.134877074 5.707476e-01 0.640350971
## 42
        MEmediumpurple3 0.115053003 6.290875e-01 0.689000637
## 43
             MEdarkgrey -0.084602482 7.228679e-01 0.773300498
## 44
           MElightcyan1 -0.069621440 7.705448e-01 0.793402197
## 45
                MEgreen 0.067876270 7.761543e-01 0.793402197
## 46
          MEfloralwhite 0.001700947 9.943215e-01 0.994321484
```

Module-Trait Correlations (cor, p-value, stars)

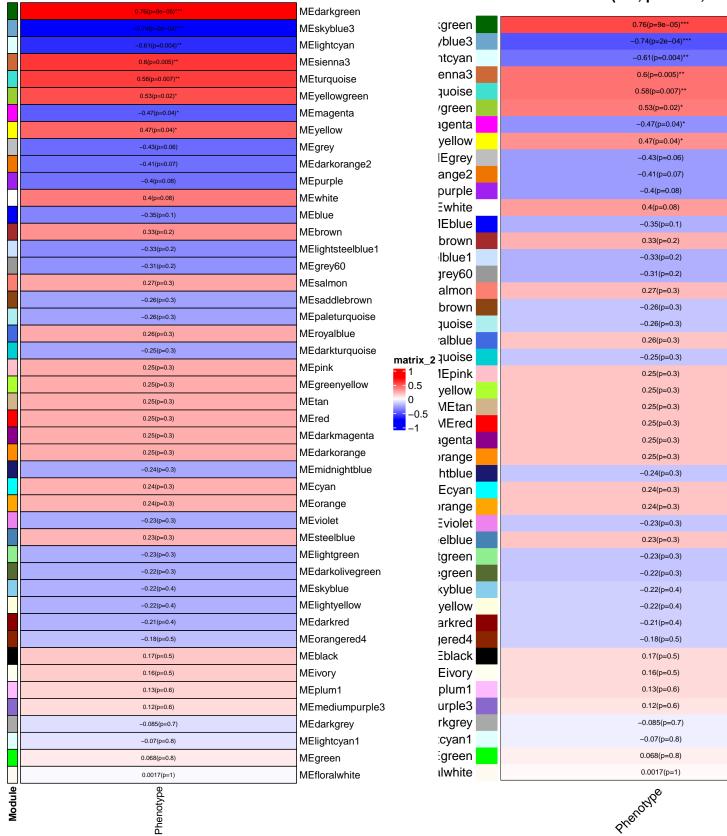
Module-Trait Correlations (cor, p-value, stars)



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Module-Trait Correlations (cor, p-value, stars)

Module-Trait Correl (cor, p-value, sta



```
## pdf
## 2
## pdf
## 2
## pdf
## 2
## [1] "Processing module: MEdarkgreen"
## [1] "Processing module: MElightcyan"
## [1] "Processing module: MEmagenta"
## [1] "Processing module: MEsienna3"
## [1] "Processing module: MEskyblue3"
## [1] "Processing module: MEturquoise"
## [1] "Processing module: MEyellow"
## [1] "Processing module: MEyellowgreen"
```

Session information

```
## R version 4.4.0 (2024-04-24)
## Platform: aarch64-apple-darwin20
## Running under: macOS 15.4
## Matrix products: default
          /Library/Frameworks/R.framework/Versions/4.4-arm64/Resources/lib/libRblas.0.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.4-arm64/Resources/lib/libRlapack.dylib; LAPACK v
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
## time zone: America/New_York
## tzcode source: internal
## attached base packages:
## [1] grid
                  parallel
                            stats4
                                      stats
                                                 graphics grDevices utils
##
  [8] datasets methods
## other attached packages:
## [1] broom_1.0.8
                                    countToFPKM_1.0
## [3] circlize_0.4.16
                                    ComplexHeatmap_2.20.0
## [5] GSEABase_1.66.0
                                    graph_1.82.0
## [7] annotate_1.82.0
                                    XML_3.99-0.18
## [9] extrafont_0.19
                                    ggsignif_0.6.4
## [11] patchwork_1.3.0
                                    decoupleR_2.10.0
## [13] GSVA_1.52.3
                                    BiocParallel_1.38.0
## [15] edgeR_4.2.2
                                    limma_3.60.6
## [17] GenomicFeatures_1.56.0
                                    biomaRt_2.60.1
## [19] gprofiler2_0.2.3
                                    RColorBrewer_1.1-3
## [21] data.table_1.17.2
                                    org.Hs.eg.db_3.19.1
## [23] AnnotationDbi_1.66.0
                                    clusterProfiler_4.12.6
## [25] ggfortify_0.4.17
                                    pheatmap_1.0.12
## [27] EnhancedVolcano_1.22.0
                                    ggrepel_0.9.6
## [29] apeglm_1.26.1
                                    DESeq2_1.44.0
## [31] SummarizedExperiment_1.34.0 Biobase_2.64.0
## [33] MatrixGenerics_1.16.0
                                    matrixStats_1.5.0
## [35] reshape2_1.4.4
                                    Matrix_1.7-3
## [37] Signac_1.14.0
                                    Seurat_5.3.0
## [39] SeuratObject_5.1.0
                                    sp_2.2-0
## [41] WGCNA_1.73
                                    fastcluster_1.3.0
## [43] dynamicTreeCut_1.63-1
                                    rtracklayer_1.64.0
## [45] GenomicRanges_1.56.2
                                    GenomeInfoDb 1.40.1
## [47] IRanges_2.38.1
                                    S4Vectors_0.42.1
## [49] BiocGenerics_0.50.0
                                    knitr_1.50
## [51] lubridate_1.9.4
                                    forcats_1.0.0
## [53] stringr_1.5.1
                                    dplyr_1.1.4
## [55] purrr_1.0.4
                                    readr_2.1.5
## [57] tidyr_1.3.1
                                    tibble_3.2.1
##
  [59] ggplot2_3.5.2
                                    tidyverse_2.0.0
## loaded via a namespace (and not attached):
     [1] SpatialExperiment_1.14.0
                                     R.methodsS3_1.8.2
```

```
##
     [3] dichromat_2.0-0.1
                                     progress_1.2.3
##
     [5] nnet_7.3-20
                                     goftest_1.2-3
##
     [7] HDF5Array 1.32.1
                                     Biostrings_2.72.1
##
                                     spatstat.random_3.3-3
     [9] vctrs_0.6.5
##
    [11] shape_1.4.6.1
                                     digest_0.6.37
##
    [13] png 0.1-8
                                     deldir 2.0-4
##
   [15] parallelly_1.44.0
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