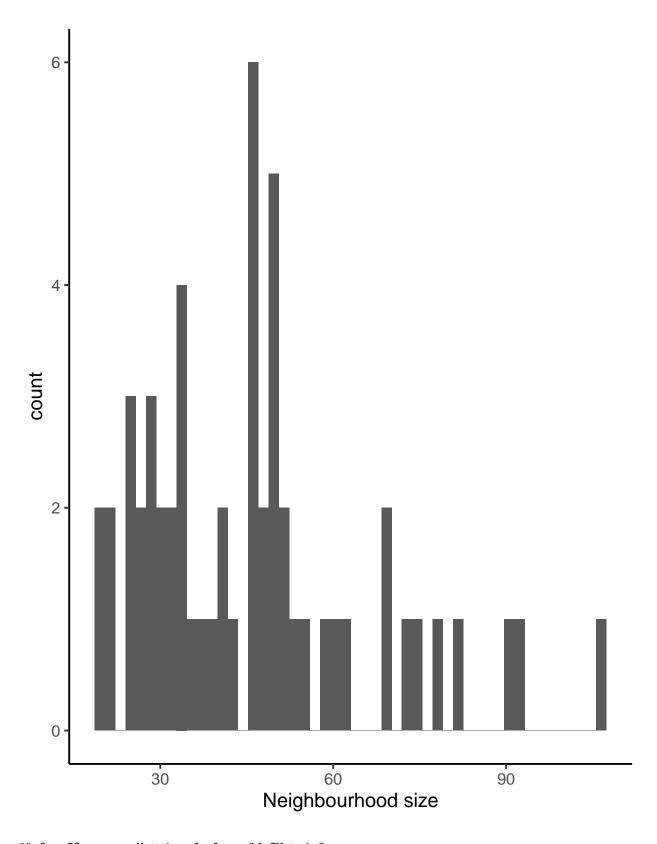
```
## class: Milo
## dim: 58051 774
## metadata(0):
## assays(2): counts logcounts
## rownames(58051): ENSG00000223972 ENSG00000227232 ... ENSG00000277475
    ENSG00000268674
## rowData names(0):
## colnames(774):
##
    lane6963.AAGAGGCA.AAGGAGTA.cDNA190807.D9.594V.d42.L001.GRCh38.hisat2.bam
     lane6963.AAGAGGCA.ACTGCATA.cDNA190807.E9.594V.d42.L001.GRCh38.hisat2.bam
##
##
    lane7048.TCCTGAGC.TATCCTCT.cDNA190921.G4.637R.d42.L001.GRCh38.hisat2.bam
##
##
    lane7048.TCCTGAGC.TCTCTCCG.cDNA190921.A4.637R.d42.L001.GRCh38.hisat2.bam
## colData names(46): lane i5 ... clusters sample
## reducedDimNames(2): PCA UMAP
## altExpNames(0):
## nhoods dimensions(2): 1 1
## nhoodCounts dimensions(2): 1 1
## nhoodDistances dimension(1): 0
## graph names(0):
## nhoodIndex names(1): 0
## nhoodExpression dimension(2): 1 1
## nhoodReducedDim names(0):
## nhoodGraph names(0):
## nhoodAdjacency dimension(2): 1 1
```



6 x 38 sparse Matrix of class "dgCMatrix"
##
1 2 1 . . 4 1 1 . 1 5 1 1 2 . . 3 2 1 . 1 1 1 . .

```
## 2 18 1 7 . . 1 . . 2 2 . 2 3 6 . . . . . . . 1 . . 3 . . 3 2 1 . . 1 . 5 4 1 . .
. . . . . . . 1 . 6 2 1 . 4 1 . . . . . . . . . . 1 1 . 2 2 2 . 5 1 . . 2 3 . .
           phenotype PID
                           age day
                                    sample
## 594V d42 young d42 594V young d42 594V d42
## 545R d42
           old d42 545R
                           old d42 545R d42
## 594V d0
            young d0 594V young d0
                                   594V d0
## 545R d0
             old d0 545R
                           old d0
                                   545R d0
## 562K d42 young d42 562K young d42 562K d42
## 543P d42
            old d42 543P
                           old d42 543P d42
           logFC
                  logCPM
                                   F
                                           PValue
                                                         FDR Nhood SpatialFDR
      1.42200643 15.42574
## 1
                          4.639716292 3.136051e-02 0.172482794
                                                                 1 0.165834384
      0.82013820 15.88891
                          2.023790884 1.550097e-01 0.387524130
                                                                 2 0.378787460
      1.25682776 15.52615
                         3.691965421 5.481856e-02 0.222510645
                                                                3 0.218902305
      2.22569846 15.67237
                          9.789613338 1.780565e-03 0.024482769
                                                                4 0.022791203
     -0.01612801 15.71831 0.001506525 9.690426e-01 0.969042614
## 5
                                                                5 0.969042614
      1.10243913 15.54412
                          2.868094847 9.050906e-02 0.311124881
                                                                 6 0.305725045
                         1.649157993 1.992238e-01 0.456554568
## 7
      0.62355967 16.24616
                                                                7 0.444470382
## 8
      0.73663468 15.39667
                          1.377559067 2.406585e-01 0.483379399
                                                                8 0.476070282
     -0.65892926 15.54236
                          1.184800115 2.765134e-01 0.506941268
                                                                9 0.501351335
## 10 0.69166983 15.77923
                          1.346196348 2.460841e-01 0.483379399
                                                               10 0.476070282
     0.88361732 15.98812
                         2.672282548 1.022684e-01 0.330868503
                                                               11 0.323460651
                          0.246721289 6.194484e-01 0.764180904
      0.31322297 15.44510
                                                               12 0.763103572
      1.95202000 15.40622
                          7.949060290 4.859107e-03 0.043726039
                                                               13 0.043103609
                          1.104871381 2.933278e-01 0.520420270
                                                               14 0.516493659
## 14 -0.60993893 15.81253
## 15 -0.69017507 15.79353
                          1.383403388 2.396637e-01 0.483379399
                                                               15 0.476070282
      0.09183710 16.11418
                          0.032677062 8.565682e-01 0.872430573
                                                               16 0.872761964
                          0.309014013 5.783487e-01 0.764180904
      0.34783652 15.32346
                                                               17 0.763103572
## 18
      0.23913896 16.22247
                         0.238647293 6.252389e-01 0.764180904
                                                               18 0.763103572
                          0.268669294 6.042837e-01 0.764180904
      0.33176305 15.65060
                                                               19 0.763103572
                          2.290176698 1.303547e-01 0.382535224
## 20 0.97332752 15.53156
                                                               20 0.374334542
## 21 -1.23680055 15.54462
                         4.026446562 4.492793e-02 0.205919693
                                                               21 0.202237935
     2.10280976 15.58024
                         8.641443004 3.324071e-03 0.036564785
                                                               22 0.034390042
      0.63309524 15.52637
                          0.981789733 3.218784e-01 0.553228532
                                                               23 0.549239559
## 24
      0.80883516 15.76860
                         1.810301570 1.786261e-01 0.427149409
                                                               24 0.416448014
## 25
      2.48633191 15.69208 11.906552153 5.710978e-04 0.015247513
                                                               25 0.013977424
      0.28775485 15.76364 0.242588267 6.223976e-01 0.764180904
                                                               26 0.763103572
      0.56045887 15.66102 0.757600562 3.841860e-01 0.592510656
                                                               27 0.589829389
## 28 -0.39946336 15.69629
                          0.473825014 4.913134e-01 0.711111448
                                                               28 0.708114437
## 29
      0.94120029 15.38708
                         2.082021469 1.492009e-01 0.387524130
                                                               29 0.378787460
      1.03470902 15.97956
                          3.591871146 5.820836e-02 0.222510645
                                                               30 0.218902305
## 31 -0.25873537 15.48870
                         0.152209748 6.964745e-01 0.813080510
                                                               31 0.813511633
      2.92567253 15.69756 15.508876656 8.496136e-05 0.004672875
                                                               32 0.004140015
## 33 -0.69044727 15.64187
                         1.201653490 2.731248e-01 0.506941268
                                                               33 0.501351335
      1.14347050 15.85454 3.522590042 6.068472e-02 0.222510645
                                                               34 0.218902305
## 35
      0.36311011 15.51534 0.339800686 5.600107e-01 0.764180904
                                                               35 0.763103572
      2.21441237 15.75421 11.203557821 8.316825e-04 0.015247513
                                                               36 0.013977424
## 37
      0.38367463 15.52652 0.393927278 5.303146e-01 0.747879595
                                                               37 0.746332944
      0.18814280\ 15.69912\ 0.091987842\ 7.616969e-01\ 0.854243220
                                                               38 0.854282361
```

39 0.79132857 15.45800 1.531595163 2.160199e-01 0.475243856

39 0.465259264

```
## 40 0.11895473 15.88093 0.045078926 8.318808e-01 0.863272550
                                                                   40 0.864327719
## 41 0.16966869 15.48147 0.079053562 7.786135e-01 0.854243220
                                                                   41 0.856669795
                                                                   42 0.784256457
## 42 -0.27715758 15.65202 0.197865162 6.564982e-01 0.784943489
## 43 0.57568786 15.65923 0.815397455 3.666391e-01 0.592510656
                                                                   43 0.589829389
      0.56926930 15.54910
                          0.794193397 3.729434e-01 0.592510656
                                                                   44 0.589829389
## 45 -0.87548745 15.74837 2.268953300 1.321485e-01 0.382535224
                                                                   45 0.374334542
     1.23246413 15.91818 4.656699948 3.105249e-02 0.172482794
                                                                   46 0.165834384
## 47 -1.73812075 15.43002 7.702869353 5.565132e-03 0.043726039
                                                                   47 0.043103609
      0.54684941 15.48238 0.746078848 3.878252e-01 0.592510656
                                                                   48 0.589829389
## 49 0.49805183 15.72313 0.672426934 4.123054e-01 0.612886474
                                                                   49 0.610387953
## 50 -0.13402600 15.33335
                          0.059563813 8.072120e-01 0.854243220
                                                                   50 0.856669795
## 51 -0.22224523 15.77778
                          0.138719160 7.095975e-01 0.813080510
                                                                   51 0.813511633
                                                                   52 0.856669795
## 52
      0.13888488 15.94343
                          0.059289216 8.076481e-01 0.854243220
## 53
      1.44019170 15.94495 6.337048783 1.190252e-02 0.081829811
                                                                   53 0.080038341
## 54 0.86865806 15.77722 2.127091537 1.448737e-01 0.387524130
                                                                   54 0.378787460
## 55 1.45170890 15.65917 4.439528904 3.524142e-02 0.176207088
                                                                   55 0.170716261
##
         logFC
                logCPM
                               F
                                       PValue
                                                      FDR Nhood
                                                                 SpatialFDR
## 32 2.925673 15.69756 15.508877 8.496136e-05 0.004672875
                                                             32 0.004140015
## 25 2.486332 15.69208 11.906552 5.710978e-04 0.015247513
                                                             25 0.013977424
```

36 0.013977424

4 0.022791203

22 0.034390042

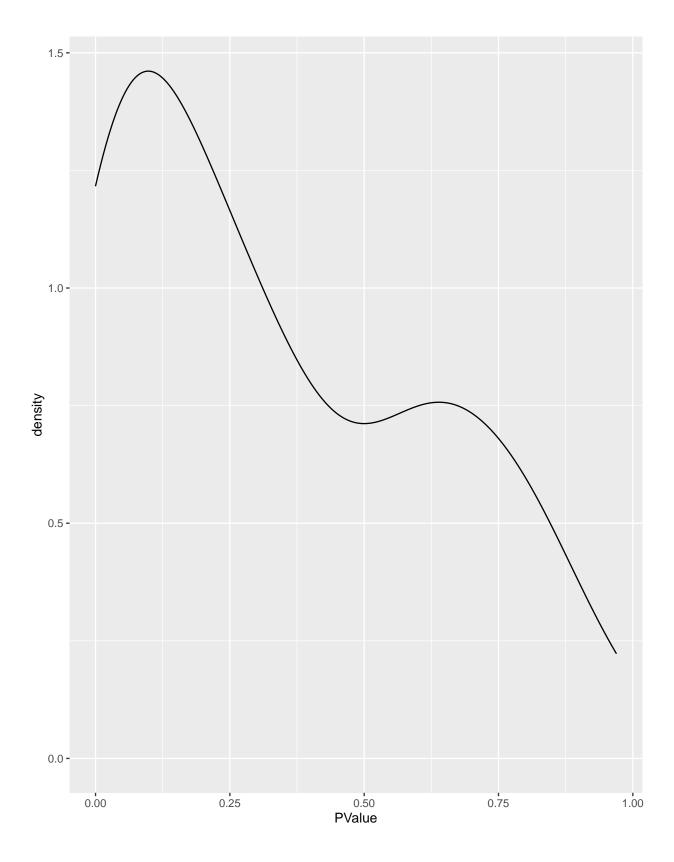
13 0.043103609

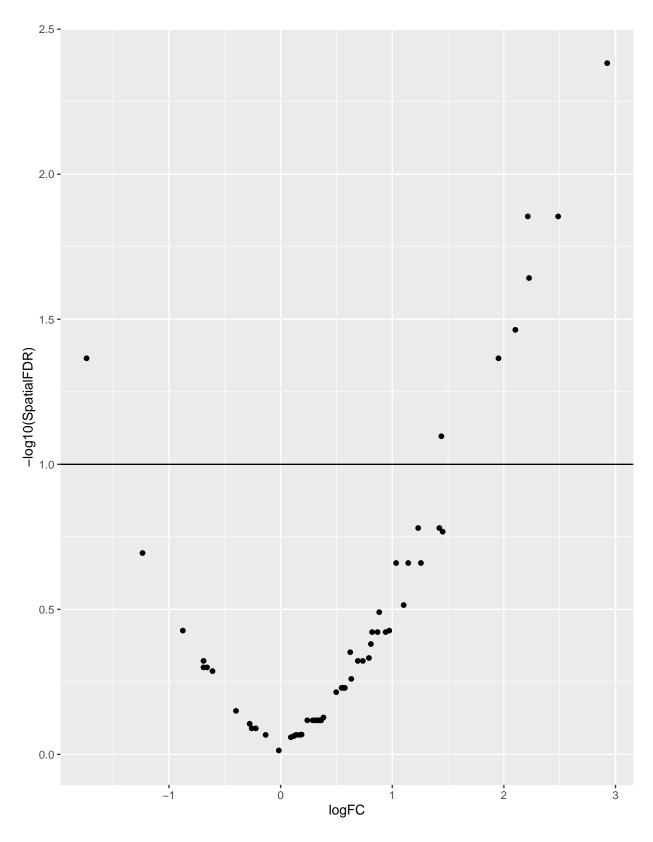
36 2.214412 15.75421 11.203558 8.316825e-04 0.015247513

4 2.225698 15.67237 9.789613 1.780565e-03 0.024482769

22 2.102810 15.58024 8.641443 3.324071e-03 0.036564785

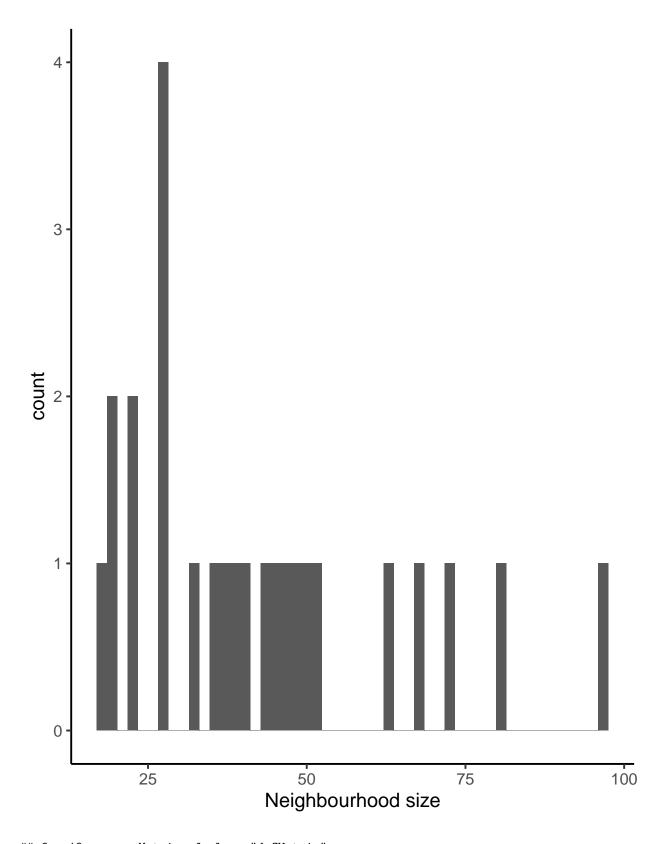
13 1.952020 15.40622 7.949060 4.859107e-03 0.043726039





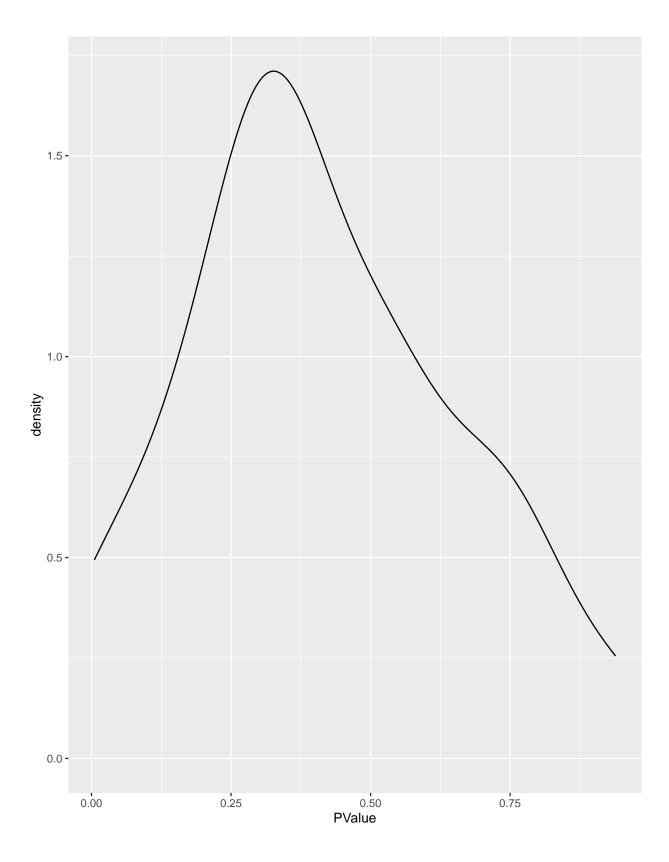
class: Milo ## dim: 58051 347 ## metadata(0):

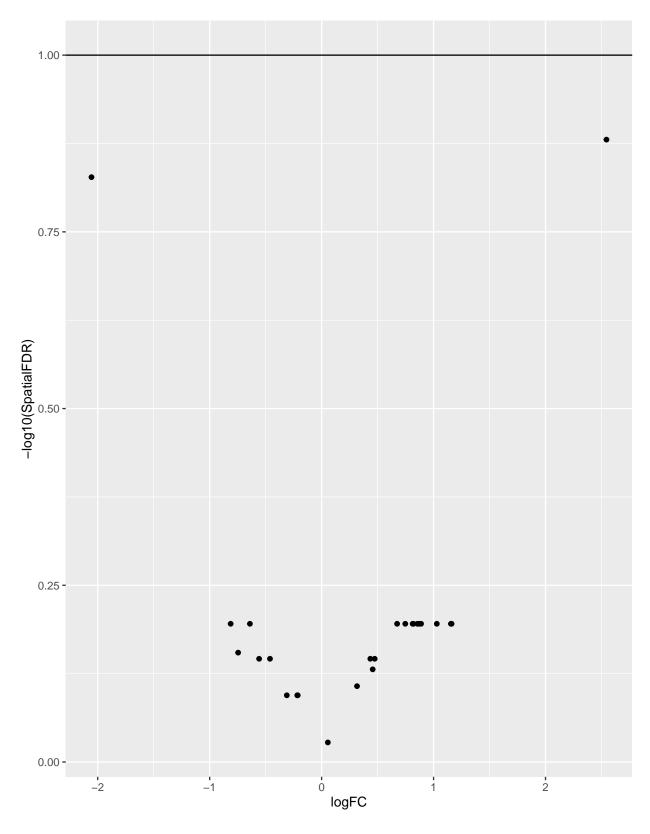
```
## assays(2): counts logcounts
## rownames(58051): ENSG00000223972 ENSG00000227232 ... ENSG00000277475
    ENSG00000268674
## rowData names(0):
## colnames(347):
##
    lane6963.AGGCAGAA.AAGGAGTA.cDNA190807.D3.545R.d42.L001.GRCh38.hisat2.bam
##
    lane6963.AGGCAGAA.ACTGCATA.cDNA190807.E3.545R.d42.L001.GRCh38.hisat2.bam
##
##
    lane7048.TAAGGCGA.GTAAGGAG.cDNA190921.F1.543P.d42.L001.GRCh38.hisat2.bam
##
    lane7048.TAAGGCGA.TATCCTCT.cDNA190921.G1.543P.d42.L001.GRCh38.hisat2.bam
## colData names(46): lane i5 ... clusters sample
## reducedDimNames(2): PCA UMAP
## altExpNames(0):
## nhoods dimensions(2): 1 1
## nhoodCounts dimensions(2): 1 1
## nhoodDistances dimension(1): 0
## graph names(0):
## nhoodIndex names(1): 0
## nhoodExpression dimension(2): 1 1
## nhoodReducedDim names(0):
## nhoodGraph names(0):
## nhoodAdjacency dimension(2): 1 1
```



```
## 6 x 19 sparse Matrix of class "dgCMatrix" ## ## 1 1 . 8 1 6 2 3 . . . . . . 2 . 4 2 3 .
```

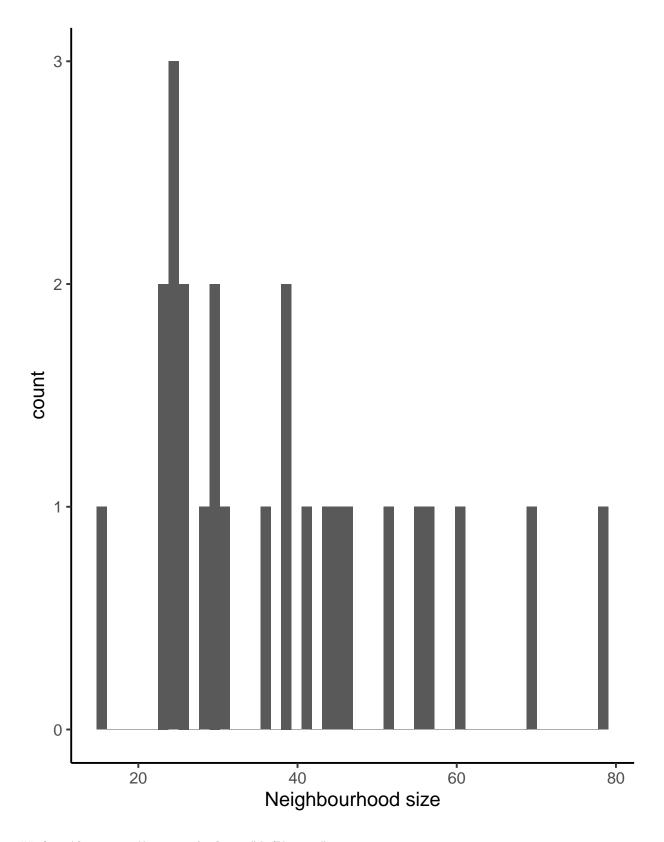
```
## 2 2 1 14 3 12 6 9 2 3 . . . 1 4 . 3 2 1 .
## 3 6 . 8 2 12 5 13 4 4 1 . . 3 8 4 15 1 10 1
## 4 1 . 9 . 12 1 6 . 1 . . . 1 5 . 7 1 7 1
## 5 9 4 6 5 3 5 . 1 10 9 2 1 2 3 2 3 .
## 6 1 . 3 2 8 2 3 1 . . . . . 8 3 4 1 9 .
##
           phenotype PID age day
             old d42 545R old d42 545R d42
## 545R d42
              old d0 545R old d0 545R d0
## 545R d0
## 543P d42
            old d42 543P old d42 543P d42
## 543P d0
             old d0 543P old d0 543P d0
## 520P d42
            old d42 520P old d42 520P d42
## 520P d0
              old d0 520P old d0 520P d0
                                                        FDR Nhood SpatialFDR
##
           logFC
                   logCPM
                                    F
                                           PValue
## 1
      1.15508300 16.08472 1.842254689 0.175407242 0.6523643
                                                              1 0.6374941
      0.67441021\ 16.60508\ 0.925105062\ 0.336685011\ 0.6523643
                                                                2 0.6374941
      1.02913852 17.10194 2.354971797 0.125628214 0.6523643
                                                                   0.6374941
     2.54457684 16.41096 7.773873204 0.005538669 0.1384667
                                                                4 0.1316841
    -0.64043796 17.16574 0.938139754 0.333307574 0.6523643
                                                                5 0.6374941
     0.87158980 16.38952 1.200473905 0.273847471 0.6523643
                                                                6 0.6374941
      0.45620670 16.05041 0.282045320 0.595641190 0.7445515
                                                                7
                                                                   0.7394779
      0.85601965 16.07016 0.995053720 0.319077928 0.6523643
                                                                8 0.6374941
## 9 -0.21745072 16.46159 0.084932192 0.770863677 0.8029830
                                                                9 0.8047100
## 10 0.81347730 16.21101 1.013164715 0.314718590 0.6523643
                                                               10 0.6374941
## 11 -0.46114541 16.50519 0.403782243 0.525484367 0.7204313
                                                               11
                                                                   0.7144220
## 12 0.47423839 16.76038 0.486986526 0.485656241 0.7204313
                                                               12 0.7144220
## 13 -0.55836592 16.02348 0.362344895 0.547527799 0.7204313
                                                               13 0.7144220
## 14 -0.21340434 16.56459 0.091283823 0.762699138 0.8029830
                                                               14 0.8047100
## 15 0.43501076 16.92443 0.441236720 0.506886362 0.7204313
                                                               15 0.7144220
## 16 0.05556532 16.29265 0.006010301 0.938241487 0.9382415
                                                               16 0.9382415
## 17  0.81963700  16.37543  1.081230057  0.299013730  0.6523643
                                                               17 0.6374941
## 18 -0.81251391 16.51875 1.328156494 0.249781256 0.6523643
                                                               18 0.6374941
## 19 -0.31093916 15.98324 0.112366359 0.737631380 0.8029830
                                                               19 0.8047100
## 20 0.31647233 16.68290 0.194981203 0.659027316 0.7845563
                                                               20 0.7811166
## 21 0.88851037 15.87929 0.849651066 0.357174019 0.6523643
                                                               21 0.6374941
## 22 -2.05566948 16.31521 6.419483269 0.011645859 0.1455732
                                                               22 0.1488096
## 23 -0.74578605 15.89027 0.639563959 0.424315490 0.7071925
                                                               23 0.7003203
## 24 1.16094284 16.13823 1.880131943 0.171042717 0.6523643
                                                               24 0.6374941
## 25 0.74738904 16.16277 0.821265230 0.365323993 0.6523643
                                                               25 0.6374941
          logFC
                  logCPM
                                 F
                                        PValue
                                                     FDR Nhood SpatialFDR
      2.5445768 16.41096 7.7738732 0.005538669 0.1384667
                                                             4 0.1316841
## 22 -2.0556695 16.31521 6.4194833 0.011645859 0.1455732
                                                            22 0.1488096
      1.1550830 16.08472 1.8422547 0.175407242 0.6523643
                                                            1 0.6374941
## 1
      0.6744102 16.60508 0.9251051 0.336685011 0.6523643
                                                             2 0.6374941
      1.0291385 17.10194 2.3549718 0.125628214 0.6523643
                                                             3 0.6374941
## 5 -0.6404380 17.16574 0.9381398 0.333307574 0.6523643
                                                            5 0.6374941
```





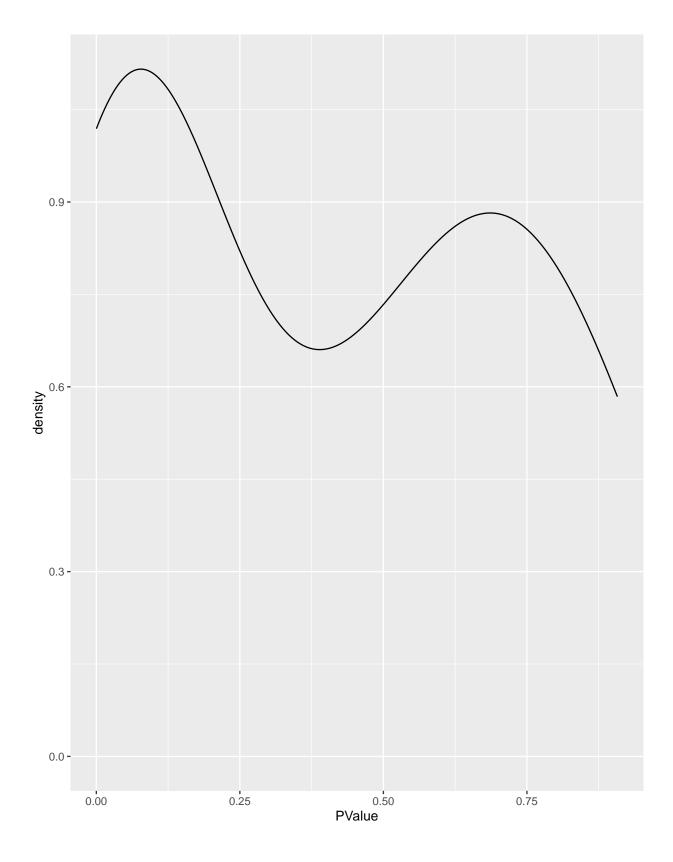
class: Milo ## dim: 58051 427 ## metadata(0):

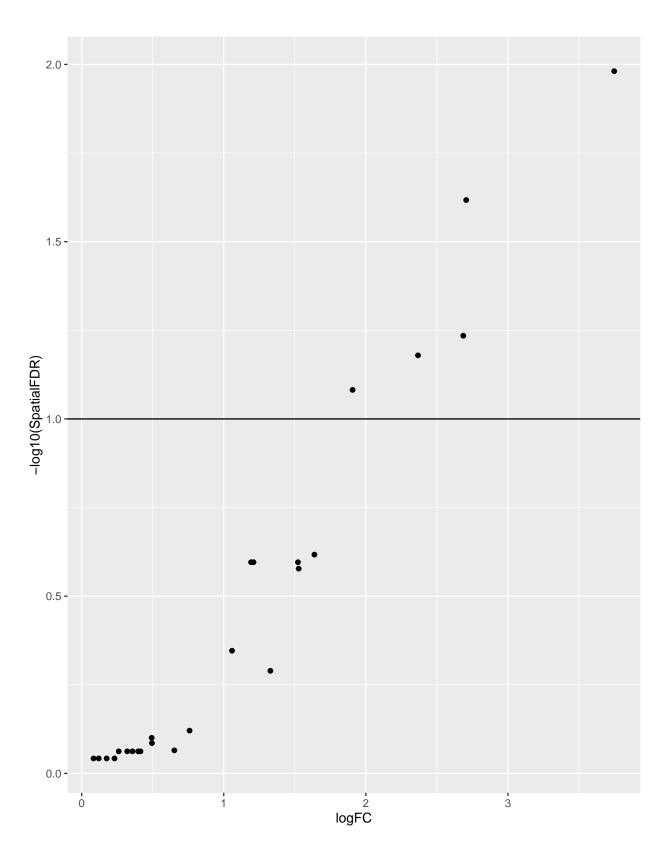
```
## assays(2): counts logcounts
## rownames(58051): ENSG00000223972 ENSG00000227232 ... ENSG00000277475
    ENSG00000268674
## rowData names(0):
## colnames(427):
##
    lane6963.AAGAGGCA.AAGGAGTA.cDNA190807.D9.594V.d42.L001.GRCh38.hisat2.bam
##
    lane6963.AAGAGGCA.ACTGCATA.cDNA190807.E9.594V.d42.L001.GRCh38.hisat2.bam
##
##
    lane7048.TCCTGAGC.TATCCTCT.cDNA190921.G4.637R.d42.L001.GRCh38.hisat2.bam
##
    lane7048.TCCTGAGC.TCTCTCCG.cDNA190921.A4.637R.d42.L001.GRCh38.hisat2.bam
## colData names(46): lane i5 ... clusters sample
## reducedDimNames(2): PCA UMAP
## altExpNames(0):
## nhoods dimensions(2): 1 1
## nhoodCounts dimensions(2): 1 1
## nhoodDistances dimension(1): 0
## graph names(0):
## nhoodIndex names(1): 0
## nhoodExpression dimension(2): 1 1
## nhoodReducedDim names(0):
## nhoodGraph names(0):
## nhoodAdjacency dimension(2): 1 1
```

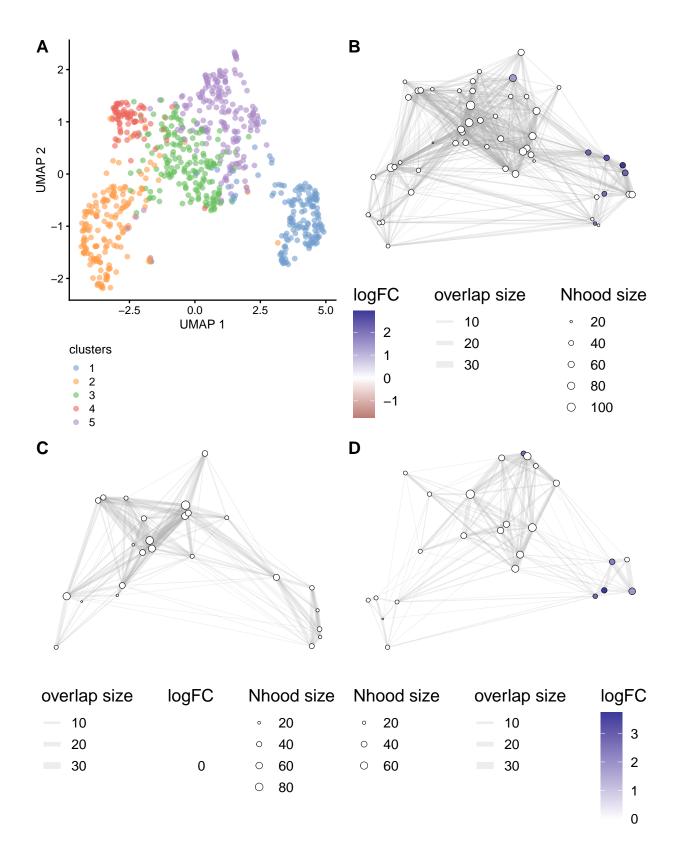


6 x 19 sparse Matrix of class "dgCMatrix"
##
1 5 2 9 10 8 7 3 3 . . 4 4 . 6 2 3 1 11 1

```
## 2 1 3 1 . 8 2 3 . . . . 1 . 2 . 3 . 4 1
## 3 2 1 3 3 10 1 1 . . . . 2 . 4 2 4 . 8 .
## 4 2 5 3 1 17 8 3 2 . . . . . 3 4 . . 8 .
## 6 4 3 1 2 3 5 2 2 4 . 8 11 . 3 3 7 . 11 .
##
           phenotype PID
                            age day
## 594V d42 young d42 594V young d42 594V d42
           young d0 594V young d0
## 594V d0
                                     594V d0
## 562K d42 young d42 562K young d42 562K d42
## 562K d0 young d0 562K young d0
                                     562K d0
## 559G d42 young d42 559G young d42 559G d42
## 559G d0
          young d0 559G young d0 559G d0
##
          logFC
                 logCPM
                                   F
                                           PValue
                                                        FDR Nhood SpatialFDR
## 1
     0.49284949 17.01518 0.57350051 0.4492908982 0.80230518
                                                               1 0.79341956
     1.05836127 16.18792 1.60785738 0.2054874504 0.46701693
                                                                2 0.45078508
     1.52229566 16.35357
                          2.89938355 0.0893445910 0.26232740
                                                                3 0.25362099
    0.08387314 16.62815
                         0.01360434 0.9072133026 0.90721330
                                                                4 0.90721330
    2.68555110 16.16286
                         7.37244618 0.0068929677 0.05744140
                                                                5 0.05824362
    1.19234574 16.83845
                          2.96542390 0.0857897334 0.26232740
                                                                6 0.25362099
     2.70631459 16.21344
                          9.69357856 0.0019741302 0.02467663
                                                                7 0.02412983
## 8 0.17586508 16.09796
                          0.02642172 0.8709519026 0.90721330
                                                                8 0.90721330
## 9 0.49496205 16.58362
                          0.45332184 0.5011276282 0.83521271
                                                                9 0.82142901
## 10 1.63820395 16.46095
                          3.55987869 0.0598734338 0.24947264
                                                               10 0.24140780
## 11 0.12026216 16.37996
                          0.01819920 0.8927513204 0.90721330
                                                               11 0.90721330
## 12 1.90666668 16.78303
                          5.82435552 0.0170215265 0.08510763
                                                               12 0.08281560
## 13 2.36719651 16.46834
                          6.57771682 0.0106687825 0.06667989
                                                               13 0.06616737
## 14 0.39742602 16.15326
                          0.19276601 0.6608475198 0.86654891
                                                               14 0.86649659
## 15 0.26091962 16.21897
                          0.12120733 0.7279010874 0.86654891
                                                               15 0.86649659
## 16 1.20950220 16.71673
                         2.80958774 0.0944378644 0.26232740
                                                              16 0.25362099
## 17 0.23141078 16.13155
                         0.05646653 0.8122850114 0.90721330
                                                              17 0.90721330
## 18 0.32065664 16.51250
                          0.17013965 0.6801957126 0.86654891
                                                               18 0.86649659
## 19 0.65250325 16.07680
                         0.34770098 0.5557307808 0.86654891
                                                               19 0.86102214
## 20 1.52731522 16.39303
                         2.56655315 0.1100364578 0.27509114
                                                               20 0.26446042
## 21 3.74787154 16.33893 12.58967775 0.0004311177 0.01077794
                                                               21 0.01044575
## 22 0.75943155 16.15686 0.71809019 0.3972480238 0.76393851
                                                               22 0.75753897
## 23 0.41425448 16.09301 0.15247374 0.6963781236 0.86654891
                                                               23 0.86649659
## 24 0.35721128 16.54915 0.21656886 0.6419051735 0.86654891
                                                               24 0.86649659
## 25 1.32831324 15.92018 1.32340359 0.2506289913 0.52214373
                                                               25 0.51351180
        logFC
                logCPM
                               F
                                       PValue
                                                    FDR Nhood SpatialFDR
## 21 3.747872 16.33893 12.589678 0.0004311177 0.01077794
                                                           21 0.01044575
## 7 2.706315 16.21344 9.693579 0.0019741302 0.02467663
                                                            7 0.02412983
## 5 2.685551 16.16286 7.372446 0.0068929677 0.05744140
                                                            5 0.05824362
## 13 2.367197 16.46834 6.577717 0.0106687825 0.06667989
                                                           13 0.06616737
## 12 1.906667 16.78303 5.824356 0.0170215265 0.08510763
                                                           12 0.08281560
## 10 1.638204 16.46095 3.559879 0.0598734338 0.24947264
                                                           10 0.24140780
```







FCRL5+ neighborhoods are enriched at day 42 after trivalent influenza vaccination in younger, but not older, individuals (A) UMAP as previously described Cluster 1 is referred to as FCRL5+ (B) MiloR analysis of all cells (both ages) with neighborhoods that are enriched at day 42 compared to day 0 with spatial FDR<0.10, shaded according to their logFC. The MiloR analysis is projected in UMAP embedding, such that cells in (A) have the same position in (B). (C) As in (B), for only individuals aged 67-86yo (zero neighborhoods reach significance threshold). (D) As in (B) for individuals aged 22-36yo. 4 neighborhoods within the FCRL5+ cluster (cluster 1), and a single neighborhood containing CD38intermediate cells are significantly enriched at day 42.

SessionInfo

```
## R version 4.0.4 (2021-02-15)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: CentOS Linux 7 (Core)
##
## Matrix products: default
           /bi/apps/R/4.0.4/lib64/R/lib/libRblas.so
## BLAS:
## LAPACK: /bi/apps/R/4.0.4/lib64/R/lib/libRlapack.so
##
## locale:
   [1] LC_CTYPE=en_GB.UTF-8
##
                                    LC NUMERIC=C
   [3] LC_TIME=en_GB.UTF-8
                                   LC_COLLATE=en_GB.UTF-8
##
    [5] LC_MONETARY=en_GB.UTF-8
                                    LC_MESSAGES=en_GB.UTF-8
##
   [7] LC_PAPER=en_GB.UTF-8
                                    LC NAME=C
##
   [9] LC_ADDRESS=C
                                    LC_TELEPHONE=C
## [11] LC_MEASUREMENT=en_GB.UTF-8 LC_IDENTIFICATION=C
##
## attached base packages:
  [1] parallel
                 stats4
                           stats
                                      graphics grDevices utils
                                                                     datasets
  [8] methods
##
                 base
## other attached packages:
   [1] cowplot_1.1.1
                                     ggplot2_3.3.3
##
   [3] miloR_0.99.18
                                     edgeR_3.32.1
##
##
   [5] limma 3.46.0
                                    SingleCellExperiment 1.12.0
##
   [7] MultiAssayExperiment 1.16.0 SummarizedExperiment 1.20.0
   [9] Biobase_2.50.0
                                     GenomicRanges 1.42.0
## [11] GenomeInfoDb_1.26.7
                                     IRanges_2.24.1
## [13] S4Vectors_0.28.1
                                    BiocGenerics_0.36.1
## [15] MatrixGenerics_1.2.1
                                    matrixStats_0.59.0
## [17] dplyr_1.0.6
##
## loaded via a namespace (and not attached):
   [1] bitops_1.0-7
                                   RColorBrewer_1.1-2
   [3] tools_4.0.4
                                   utf8_1.2.1
##
##
    [5] R6_2.5.0
                                   irlba_2.3.3
##
   [7] vipor_0.4.5
                                   DBI_1.1.1
   [9] colorspace 2.0-1
                                   withr 2.4.2
## [11] tidyselect_1.1.1
                                   gridExtra_2.3
## [13] compiler_4.0.4
                                   BiocNeighbors_1.8.2
## [15] DelayedArray_0.16.3
                                   labeling_0.4.2
## [17] scales_1.1.1
                                   stringr_1.4.0
## [19] digest_0.6.27
                                   rmarkdown 2.14
```

```
## [21] XVector_0.30.0
                                   scater_1.18.6
## [23] pkgconfig_2.0.3
                                   htmltools_0.5.2
## [25] sparseMatrixStats_1.2.1
                                   highr_0.8
## [27] fastmap_1.1.0
                                   rlang_0.4.11
## [29] DelayedMatrixStats_1.12.3 farver_2.1.0
## [31] generics_0.1.0
                                   BiocParallel_1.24.1
                                   RCurl 1.98-1.3
## [33] gtools_3.8.2
## [35] magrittr_2.0.1
                                   BiocSingular_1.6.0
## [37] scuttle_1.0.4
                                   GenomeInfoDbData_1.2.4
## [39] patchwork_1.1.1
                                   Matrix_1.3-3
## [41] Rcpp_1.0.6
                                   ggbeeswarm_0.6.0
## [43] munsell_0.5.0
                                   fansi_0.5.0
## [45] viridis_0.6.1
                                   lifecycle_1.0.0
## [47] stringi_1.6.2
                                   yaml_2.2.1
## [49] ggraph_2.0.5
                                   MASS_7.3-53.1
## [51] zlibbioc_1.36.0
                                   grid_4.0.4
## [53] ggrepel_0.9.1
                                   crayon_1.4.1
## [55] lattice_0.20-41
                                   graphlayouts_0.7.1
                                   splines_4.0.4
## [57] beachmat_2.6.4
## [59] locfit_1.5-9.4
                                   knitr_1.31
## [61] pillar_1.6.1
                                   igraph_1.2.6
## [63] glue_1.4.2
                                   evaluate_0.14
                                   tweenr_1.0.2
## [65] vctrs_0.3.8
## [67] gtable_0.3.0
                                   purrr_0.3.4
## [69] polyclip_1.10-0
                                   tidyr_1.1.3
## [71] assertthat_0.2.1
                                   xfun_0.31
## [73] ggforce_0.3.3
                                   rsvd_1.0.5
## [75] tidygraph_1.2.0
                                   viridisLite_0.4.0
## [77] tibble_3.1.2
                                   beeswarm_0.4.0
## [79] statmod_1.4.36
                                   ellipsis_0.3.2
```