Differential abundance analysis for the 2016-17 cohort

EJC

25/06/2020, based on code from May 2019

Setup

The Babraham compute cluster does not contain a global tex installation, so a local tex is added to \$PATH to allow knitting to pdf.

```
load(file = "../cohort_2016_17/data/SCE_QC_pass_finalised.RData")
library(edgeR)
sce$sample <- factor(paste(sce$phenotype, sce$PID, sep = "_"))
abundances <- table(sce$clusters, sce$sample)
## Make coumne metadata + DGEList
extra.info <- colData(sce)[match(colnames(abundances), sce$sample),
    ]

y.ab <- DGEList(abundances, samples = extra.info)
y.ab</pre>
```

```
## An object of class "DGEList"
## $counts
##
       old d0_520P old d0_526W old d0_536G old d0_541M old d0_543P old d0_544Q
##
##
     1
                  3
                               0
                                            1
                                                                      1
     2
                  1
                               1
                                            1
                                                                      0
                                                                                    6
##
##
     3
                  3
                               1
                                            3
                                                         0
                                                                      1
                                                                                    4
                              10
                                                                     13
                                                                                    0
##
     4
                  1
##
     5
                               1
                                            3
                                                         5
##
##
       old d0_545R old d0_652H old d0_660R old d42_520P old d42_526W old d42_536G
##
     1
                                            1
##
                  0
                               0
                                                          4
                                                                         2
                                                                                       8
     2
                                            1
##
     3
                  2
                               0
                                            5
                                                          4
                                                                         5
                                                                                       4
                               2
                                                                         8
                                                                                       2
##
     4
                  5
                                            1
                                                          1
##
     5
                                                         14
                                                                                      10
##
```

```
old d42_541M old d42_543P old d42_544Q old d42_545R old d42_643Y
##
##
                   7
                                 10
                                                7
                                                               3
     1
                                                               2
                   3
                                  6
                                               13
                                                                             1
##
                   1
                                  3
                                                3
                                                               4
                                                                             1
##
     3
                                                0
                                                                             2
##
     4
                   2
                                 11
                                                               8
##
     5
                  17
                                 17
                                                5
                                                               7
                                                                             2
##
       old d42_652H old d42_660R young d0_501T young d0_559G young d0_562K
##
##
                   0
                                  7
     1
##
     2
                   0
                                  3
                                                 0
                                                                 7
                                                                                 0
                                                                                 2
##
     3
                   0
                                  6
                                                 0
                                                                 4
                                                10
                                                                 0
                                                                                5
##
     4
                    1
                                  1
                                 13
                   0
                                                 0
                                                                 5
                                                                                15
##
     5
##
##
       young d0_568R young d0_594V young d0_602D young d0_622A young d0_627F
##
                     1
                                    8
                                                    0
                                                                   0
##
     2
                   10
                                    3
                                                    1
                                                                   3
                                                                                   0
                                    2
                     1
                                                    0
                                                                   4
                                                                                   0
##
     3
                                                                                   8
##
     4
                     1
                                    1
                                                    0
                                                                   0
                     3
                                    3
                                                    0
                                                                   3
                                                                                   0
##
     5
##
##
       young d0_637R young d42_501T young d42_559G young d42_562K young d42_568R
                                                                       2
##
                     0
                                     0
                                                                                      13
     1
                                                      1
##
     2
                     0
                                     0
                                                     16
                                                                       0
                                                                                       6
                     4
                                                      5
                                                                       3
                                                                                       2
##
     3
                                     1
##
     4
                     0
                                    24
                                                      4
                                                                      7
                                                                                       4
##
     5
                     2
                                     1
                                                     11
                                                                      11
                                                                                       7
##
                        young d42_602D young d42_622A young d42_627F young d42_637R
##
       young d42_594V
                                                       9
                                                                                        3
##
     1
                     21
                                     10
                                                                       12
                      6
                                                       5
                                                                        6
##
     2
                                      4
                                                                                        6
##
     3
                      1
                                      1
                                                       6
                                                                        5
                                                                                        8
                      4
                                      0
                                                       1
                                                                        7
                                                                                        0
##
     4
##
     5
                      4
                                     17
                                                       2
                                                                        4
                                                                                       15
##
##
       young d42_665X
##
                     22
##
     2
                      4
##
     3
                      1
                     11
##
     4
##
     5
                      6
##
## $samples
##
                group lib.size norm.factors
                                                    lane
                                                                i5
                                                                          i7 lib_plate
## old d0_520P
                                             1 lane6967 CGTACTAG AAGGAGTA cDNA190820
                     1
                             16
                                             1 lane7055 CGAGGCTG AAGGAGTA cDNA190910
## old d0_526W
                     1
                             13
## old d0_536G
                               9
                                             1 lane7035 CGTACTAG AAGGAGTA cDNA190919
                     1
## old d0_541M
                     1
                             11
                                             1 lane7043 CGTACTAG AAGGAGTA cDNA190920
                                             1 lane6966 CGTACTAG AAGGAGTA cDNA190819
## old d0_543P
                     1
                             19
                lib_well PID day
## old d0_520P
                       D2 520P
                                 d0
## old d0_526W
                       D8 526W
                                 d0
## old d0_536G
                       D2 536G
                                 d0
## old d0_541M
                       D2 541M d0
```

```
## old d0 543P
                   D2 543P d0
##
                                                                        short.name
## old d0 520P lane6967.CGTACTAG.AAGGAGTA.cDNA190820.D2.520P.d0.L001.GRCh38.hisat2.bam
## old d0_526W lane7055.CGAGGCTG.AAGGAGTA.lib190910.D8.526W.d0.L001.GRCh38.hisat2.bam
## old d0 536G lane7035.CGTACTAG.AAGGAGTA.cDNA190919.D2.536G.d0.L001.GRCh38.hisat2.bam
## old d0 541M lane7043.CGTACTAG.AAGGAGTA.cDNA190920.D2.541M.d0.L001.GRCh38.hisat2.bam
## old d0 543P lane6966.CGTACTAG.AAGGAGTA.cDNA190819.D2.543P.d0.L001.GRCh38.hisat2.bam
                                   fcs name fcs.well
                                                        FSC.A
                                                                 FSC.W FSC.H
D2 85692.48 81804.23 68651
## old d0_526W 526W_d0_INX_526W_d0_001_021.fcs
## old d0_536G 536G_d0_INX_536G_d0_001_014.fcs
                                                D2 57698.40 72770.91 51962
                                                D2 62003.74 73358.55 55392
## old d0_541M 541M_d0_INX_541M_d0_001_014.fcs
SSC.W SSC.H
                                       hA.PE CD21.PE.cy7 CD38.BV421 CD20.BV605
                 SSC.A
## old d0_520P 43590.39 95069.38 30049 3.410988
                                               3.077324 1.3262657
                                                                      2.266734
## old d0_526W 30935.93 88156.23 22998 2.776826
                                                 2.751422 0.9179547
                                                                      2.433115
## old d0_536G 20158.53 70365.34 18775 3.196373
                                                2.894513 1.7420159
                                                                      2.081448
## old d0 541M 23315.03 68973.67 22153 3.135865
                                                1.321624 0.6451803
                                                                      2.735065
## old d0_543P 43282.08 109675.38 25863 3.458933
                                                3.030519 1.2805317
                                                                      2.519604
               CD27.BV711 hA.APC DUMP.APC.ef780 SA.BUV395 CD19.BUV496
## old d0_520P 1.54647852 2.704042
                                  0.5308370 0.6831533
                                                            1.962610
                                   1.0954869 0.7579735
0.6666756 0.2750081
0.6842753 0.2911566
## old d0 526W 1.87768920 2.092450
                                                            1.969199
## old d0_536G 1.78570126 2.478432
                                                            2.191671
## old d0 541M -0.04161669 2.594687
                                                            2.557347
## old d0 543P 2.28214291 2.805983
                                     0.6772747 0.3217367
                                                            2.366766
              IgD.BUV737 CD71.FITC
                                    Time age fcs.XLoc fcs.YLoc phenotype
## old d0_520P 0.8858766 1.337242 26238.3 old
                                                   3
                                                        1 old d0
## old d0_526W 2.2615848 1.242474 21663.0 old
                                                    3
                                                            1
                                                                 old d0
## old d0_536G 0.7497302 1.228306 61989.1 old
                                                    3
                                                                 old d0
                                                            1
## old d0_541M 0.4045954 1.220576 50172.9 old
                                                    3
                                                                 old d0
## old d0_543P
              1.0614616 1.716234 28457.5 old
                                                  3
                                                            1
                                                                 old d0
##
                  sum detected percent_top_50 percent_top_100 percent_top_200
## old d0_520P
               600151
                         3412
                                   34.97936
                                              43.50938
                                                                  53.42639
              658342
                         2268
## old d0_526W
                                   54.97416
                                                   65.72663
                                                                  78.10074
## old d0 536G 595866
                         3827
                                   31.20953
                                                   38.83541
                                                                  49.02629
                         2773
## old d0 541M 511612
                                   40.32314
                                                   49.71951
                                                                  60.95850
## old d0 543P 1616536
                         3229
                                   46.44635
                                                   55.43576
                                                                  66.74407
              percent_top_500 subsets_Mito_sum subsets_Mito_detected
##
## old d0_520P
                    70.47726
                                       80901
                    94.29856
                                                               24
## old d0_526W
                                       67766
## old d0_536G
                                                               27
                    66.55540
                                       60732
## old d0 541M
                    78.97137
                                       43132
                                                               25
## old d0 543P
                    84.77256
                                      174906
##
              subsets_Mito_percent
                                  total qc_fail library clusters
                                                                     sample
## old d0_520P
                       13.480108 600151 FALSE
                                                      С
                                                               5 old d0_520P
## old d0_526W
                        10.293434 658342
                                                      Ε
                                                               4 old d0_526W
                                           FALSE
## old d0 536G
                        10.192224 595866
                                           FALSE
                                                      Η
                                                               5 old d0 536G
                                                               1 old d0_541M
## old d0_541M
                        8.430608 511612
                                           FALSE
                                                      Ι
## old d0_543P
                        10.819802 1616536
                                           FALSE
                                                      В
                                                               4 old d0_543P
## 33 more rows ...
```

Filter out low abundance labels: Skipped as tends to filter # out all labels (we know these are biologically meaningful # clusters, so should not be filtered out on count alone).

```
# keep <- filterByExpr(y.ab, group=y.ab$samples$day0) y.ab <-
# y.ab[keep,] summary(keep)

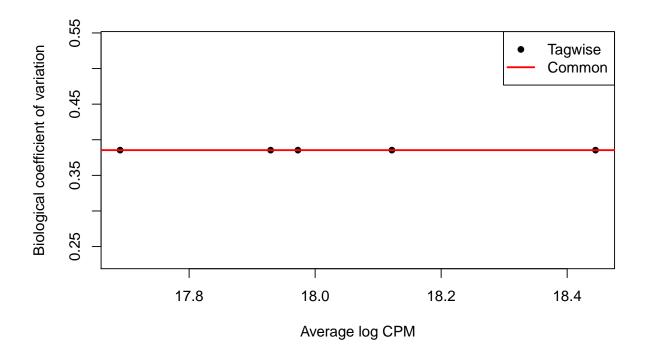
design <- model.matrix(~factor(PID) + factor(day), y.ab$samples)

y.ab <- calcNormFactors(y.ab, method = "TMMwsp") # we need to normalise to 'library' size as day 0 has

y.ab <- estimateDisp(y.ab, design, trend = "none")
summary(y.ab$common.dispersion)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.1485 0.1485 0.1485 0.1485 0.1485 0.1485

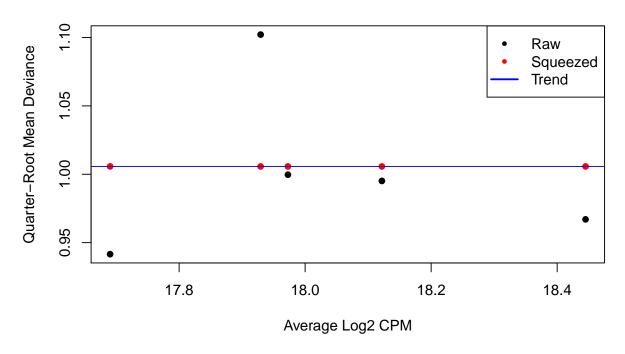
plotBCV(y.ab, cex = 1)</pre>
```



```
fit.ab <- glmQLFit(y.ab, design, robust = TRUE, abundance.trend = FALSE)</pre>
summary(fit.ab$var.prior)
                               Mean 3rd Qu.
##
      Min. 1st Qu. Median
                                                Max.
           1.023
                    1.023
     1.023
                              1.023
                                      1.023
                                               1.023
summary(fit.ab$df.prior)
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                                Max.
##
       Inf
               Inf
                        Inf
                                Inf
                                        Inf
                                                 Inf
```

```
plotQLDisp(fit.ab, cex = 1)
```

y.ab.Y



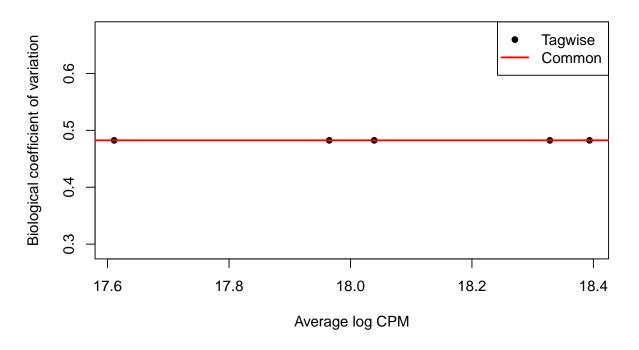
```
res <- glmQLFTest(fit.ab, coef = ncol(design))</pre>
summary(decideTests(res))
##
          factor(day)d42
## Down
                       0
## NotSig
                       4
## Up
topTags(res)
## Coefficient: factor(day)d42
##
          logFC
                 logCPM
                                  F
                                          PValue
## 1 1.3295512 18.12182 11.7861720 0.0009242591 0.004621295
## 5 0.4010776 18.44506 1.6340880 0.2046181757 0.493951410
## 2 0.3154793 17.92936 0.7424337 0.3913066707 0.493951410
## 3 -0.3142525 17.69050 0.7303839 0.3951611278 0.493951410
## 4 -0.1965382 17.97268 0.3026160 0.5836897185 0.583689718
### For young only:
y.ab.Y <- DGEList(abundances[, grepl(colnames(abundances), pattern = "young")],</pre>
    samples = extra.info[grepl(colnames(abundances), pattern = "young"),
        ])
```

```
## An object of class "DGEList"
##
  $counts
##
##
       young d0_501T young d0_559G young d0_562K young d0_568R young d0_594V
##
     1
                    0
                                   0
                                                  1
##
     2
                    0
                                   7
                                                  0
                                                                10
                                                                                3
                    0
                                                  2
##
     3
##
     4
                   10
                                   0
                                                  5
                                                                 1
                                                                                1
##
     5
                    0
                                   5
                                                 15
                                                                 3
##
##
       young d0_602D young d0_622A young d0_627F young d0_637R young d42_501T
##
     1
                                   0
                                                  1
                                                                 0
                                   3
                                                  0
                                                                 0
                                                                                 0
##
     2
                    1
     3
                                   4
                                                  0
                                                                 4
                                                                                 1
##
                    0
##
     4
                    0
                                   0
                                                  8
                                                                 0
                                                                                24
##
     5
                    0
                                   3
                                                  0
                                                                 2
                                                                                 1
##
##
       young d42_559G young d42_562K young d42_568R young d42_594V young d42_602D
##
                                                                                    10
     1
                     1
                                     2
                                                    13
                                                                    21
##
     2
                    16
                                     0
                                                     6
                                                                     6
                                                                                     4
##
     3
                     5
                                     3
                                                     2
                                                                     1
                                                                                     1
##
                     4
                                     7
                                                                                     0
                                                     7
##
     5
                    11
                                                                                    17
                                    11
##
##
       young d42_622A young d42_627F young d42_637R young d42_665X
##
     1
                     9
                                    12
                                                     3
##
     2
                     5
                                     6
                                                     6
                                                                     4
                     6
                                     5
                                                     8
##
     3
                                                                     1
                                     7
                                                     0
##
     4
                     1
                                                                    11
                     2
##
     5
                                     4
                                                    15
                                                                     6
##
##
   $samples
                  group lib.size norm.factors
##
                                                    lane
                                                                i5
                                                                         i7 lib_plate
                                             1 lane7055 CGTACTAG AAGGAGTA cDNA190910
## young d0_501T
                              10
                      1
  young d0 559G
                              16
                                             1 lane6967 CGAGGCTG AAGGAGTA cDNA190820
                      1
                              23
                                             1 lane6966 CGAGGCTG AAGGAGTA cDNA190819
## young d0_562K
                      1
## young d0 568R
                      1
                              16
                                             1 lane7035 CGAGGCTG AAGGAGTA cDNA190919
                               17
                                             1 lane6963 CGAGGCTG AAGGAGTA cDNA190807
## young d0_594V
                      1
##
                  lib_well PID day
## young d0_501T
                        D2 501T
## young d0_559G
                        D8 559G
## young d0_562K
                        D8 562K
## young d0_568R
                        D8 568R
                                  d0
## young d0_594V
                        D8 594V
                                                                                   short.name
## young d0_501T lane7055.CGTACTAG.AAGGAGTA.lib190910.D2.501T.d0.L001.GRCh38.hisat2.bam
## young d0_559G lane6967.CGAGGCTG.AAGGAGTA.cDNA190820.D8.559G.d0.L001.GRCh38.hisat2.bam
## young d0_562K lane6966.CGAGGCTG.AAGGAGTA.cDNA190819.D8.562K.d0.L001.GRCh38.hisat2.bam
## young d0_568R lane7035.CGAGGCTG.AAGGAGTA.cDNA190919.D8.568R.d0.L001.GRCh38.hisat2.bam
## young d0_594V lane6963.CGAGGCTG.AAGGAGTA.cDNA190807.D8.594V.d0.L001.GRCh38.hisat2.bam
##
                                                                  FSC.A
                                                                           FSC.W FSC.H
                                          fcs_name fcs.well
## young d0_501T 501T_d0_INX_637R_d0_001_014.fcs
                                                          D2 83306.88 80588.05 67747
## young d0_559G 559G_d0_INX_559G_d0_001_007.fcs
                                                          D2 133497.59 92261.68 94827
## young d0 562K 562K d0 INX 562K d0 001 020.fcs
                                                          D2 119693.94 86596.55 90584
```

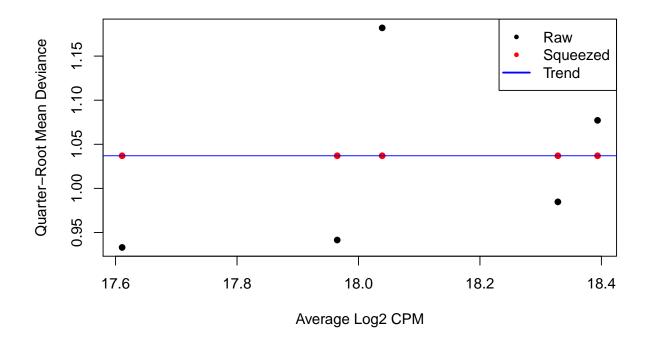
```
## young d0_568R 568R_d0_INX_568R_d0_001_019.fcs
                                                       D2 49146.88 74580.08 43187
## young d0_594V 594V_d0_INX_594V_d0_001_019.fcs
                                                       D2 125202.00 88759.98 92443
                              SSC.W SSC.H
                    SSC.A
                                             hA.PE CD21.PE.cy7 CD38.BV421
## young d0_501T 31408.37 93537.17 22006 2.985005
                                                      3.066182 1.7504292
## young d0 559G 48985.17 100321.62 32000 4.005015
                                                      2.995239
                                                                0.7007657
## young d0 562K 53872.98 98524.33 35835 3.666481
                                                      1.249043 0.7479908
## young d0 568R 16244.47 70242.65 15156 2.946224
                                                      2.449280 0.7234898
## young d0 594V 58338.56 91846.05 41627 2.990319
                                                      1.423069 1.0976290
##
                 CD20.BV605 CD27.BV711
                                       hA.APC DUMP.APC.ef780 SA.BUV395
## young d0_501T
                   2.365504 0.5200183 2.302632
                                                 0.4663553 0.4345870
## young d0_559G
                   2.345368 1.5749396 3.299656
                                                     0.8471232 0.8960040
                   2.607453 1.4252057 3.007837
                                                     1.3674945 1.1612936
## young d0_562K
## young d0_568R
                   2.272444 1.7482492 2.200919
                                                     0.9441139 1.1092720
                                                     1.0837874 0.5235748
## young d0_594V
                   2.817087 0.8190601 2.317705
##
                 CD19.BUV496 IgD.BUV737 CD71.FITC
                                                     Time
                                                            age fcs.XLoc fcs.YLoc
## young d0_501T
                    2.127250 2.9952726 1.253009 30610.0 young
                                                                       3
## young d0_559G
                    2.052803 2.9651542 1.103903 14288.5 young
                                                                       3
                                                                                 1
                    2.402106  0.4256185  1.195688  19598.7 young
## young d0 562K
                    2.684368  0.3721393  1.288887  24872.8 young
## young d0_568R
                                                                       3
                                                                                 1
## young d0 594V
                    2.581955  0.8169065  2.006950  18128.9 young
##
                 phenotype
                               sum detected percent_top_50 percent_top_100
                                       1289
                                                55.76382
## young d0_501T
                young d0 230151
                                                                 70.13526
                  young d0 744364
                                                  26.20600
                                                                  34.31413
## young d0_559G
                                       4440
                                                 43.29512
                                                                  52.36629
## young d0 562K
                  young d0 1206085
                                       3109
                                                                  46.90806
## young d0_568R young d0 617621
                                       3073
                                                  37.70192
## young d0_594V young d0 1112585
                                       3956
                                                  39.66618
                                                                  48.10868
##
                 percent_top_200 percent_top_500 subsets_Mito_sum
## young d0_501T
                        85.38612
                                        98.03216
                                                            39602
                        44.07575
                                        60.29255
                                                            59574
## young d0_559G
## young d0_562K
                        62.34834
                                        78.79751
                                                           149118
## young d0_568R
                        57.60215
                                        74.04590
                                                            72605
## young d0_594V
                        57.27886
                                        71.33127
                                                           133523
                 subsets_Mito_detected subsets_Mito_percent
                                                              total qc_fail
## young d0_501T
                                    24
                                                  17.206964
                                                             230151
                                                                      FALSE
## young d0 559G
                                    27
                                                   8.003342 744364
                                                                      FALSE
                                    28
                                                  12.363805 1206085
                                                                      FALSE
## young d0_562K
## young d0 568R
                                    25
                                                  11.755591 617621
                                                                      FALSE
## young d0_594V
                                    31
                                                  12.001150 1112585
                                                                      FALSE
##
                 library clusters
                                         sample
## young d0_501T
                      Ε
                                4 young d0_501T
                       C
## young d0 559G
                                2 young d0 559G
## young d0_562K
                       В
                                1 young d0_562K
                       Η
## young d0_568R
                                2 young d0_568R
## young d0_594V
                       Α
                                1 young d0_594V
## 14 more rows ...
# Filter out low abundance labels: Skipped as tends to filter
# out all labels (we know these are biologically meaningful
# clusters, so should not be filtered out on count alone).
\# \ keep \leftarrow filterByExpr(y.ab, group=y.ab\$samples\$day0) \ y.ab \leftarrow
# y.ab[keep,] summary(keep)
design.Y <- model.matrix(~factor(PID) + factor(day), y.ab.Y$samples)</pre>
```

```
y.ab.Y <- calcNormFactors(y.ab.Y, method = "TMMwsp") # we need to normalise to 'library'
y.ab.Y <- estimateDisp(y.ab.Y, design.Y, trend = "none")
summary(y.ab.Y$common.dispersion)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.2327 0.2327 0.2327 0.2327 0.2327</pre>
plotBCV(y.ab.Y, cex = 1)
```



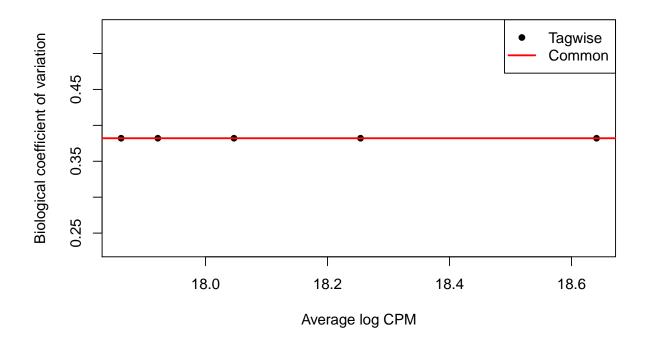
```
fit.ab.Y <- glmQLFit(y.ab.Y, design.Y, robust = TRUE, abundance.trend = FALSE)
summary(fit.ab.Y$var.prior)
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                               Max.
##
     1.156
             1.156
                     1.156
                              1.156
                                      1.156
                                              1.156
summary(fit.ab.Y$df.prior)
                    Median
                               Mean 3rd Qu.
##
      Min. 1st Qu.
                                               Max.
##
       Inf
               Inf
                       Inf
                                Inf
                                        Inf
                                                Inf
plotQLDisp(fit.ab.Y, cex = 1)
```



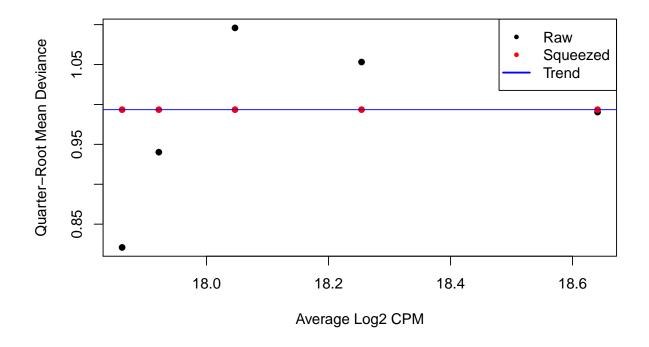
```
res.Y <- glmQLFTest(fit.ab.Y, coef = ncol(design.Y))</pre>
topTags(res.Y)
## Coefficient: factor(day)d42
##
         logFC
                 logCPM
                                        PValue
                                                        FDR.
## 1 2.2284289 18.32834 12.0464710 0.001258523 0.006292617
## 5 0.6367063 18.39367 1.4811103 0.230732762 0.448766548
## 4 0.6321584 17.96500 1.1520643 0.289550211 0.448766548
## 2 0.5319977 18.03903 0.8610411 0.359013238 0.448766548
## 3 0.3841422 17.61078 0.4230476 0.519138914 0.519138914
### For old only:
y.ab.0 <- DGEList(abundances[, grepl(colnames(abundances), pattern = "old")],
    samples = extra.info[grepl(colnames(abundances), pattern = "old"),
       ])
# Filter out low abundance labels: Skipped as tends to filter
# out all labels (we know these are biologically meaningful
# clusters, so should not be filtered out on count alone).
\# keep <- filterByExpr(y.ab, group=y.ab$samples$day0) y.ab <-
# y.ab[keep,] summary(keep)
design.0 <- model.matrix(~factor(PID) + factor(day), y.ab.0$samples)</pre>
y.ab.0 <- calcNormFactors(y.ab.0, method = "TMMwsp") # we need to normalise to 'library' size as day 0
```

```
y.ab.0 <- estimateDisp(y.ab.0, design.0, trend = "none")
summary(y.ab.0$common.dispersion)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.146 0.146 0.146 0.146 0.146
plotBCV(y.ab.0, cex = 1)</pre>
```



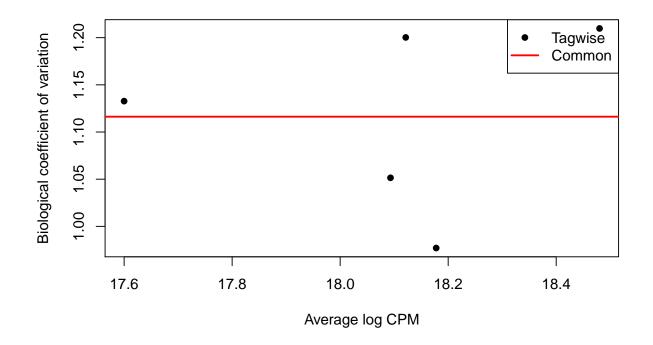
```
fit.ab.0 <- glmQLFit(y.ab.0, design.0, robust = TRUE, abundance.trend = FALSE)</pre>
summary(fit.ab.0$var.prior)
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                               Max.
    0.9741 0.9741 0.9741 0.9741 0.9741 0.9741
summary(fit.ab.0$df.prior)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                               Max.
##
       Inf
               Inf
                       Inf
                                Inf
                                        Inf
                                                Inf
plotQLDisp(fit.ab.0, cex = 1)
```



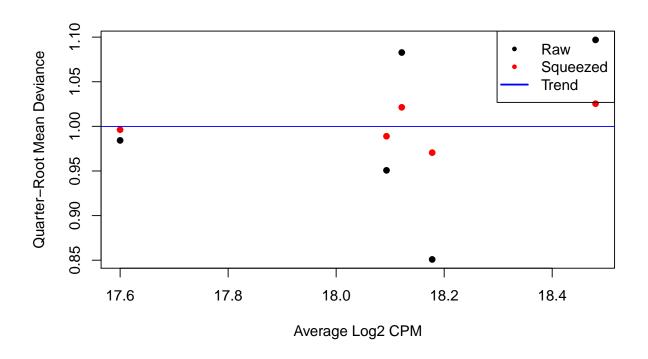
```
res.0 <- glmQLFTest(fit.ab.0, coef = ncol(design.0))
topTags(res.0)
## Coefficient: factor(day)d42
##
          logFC
                  logCPM
                                      PValue
                                                   FDR
## 4 -1.0018592 18.25409 4.1009379 0.0495693 0.1839945
## 1 0.9609018 18.04664 3.3757906 0.0735978 0.1839945
## 2 0.8525457 17.86158 2.3042689 0.1368838 0.2281396
## 5 0.5269001 18.64100 1.5147828 0.2255991 0.2819989
## 3 -0.4617037 17.92177 0.8418151 0.3643774 0.3643774
#################### For day0 only:
y.ab.day0 <- DGEList(abundances[, grepl(colnames(abundances),</pre>
    pattern = "d0")], samples = extra.info[grep1(colnames(abundances),
   pattern = "d0"), ])
# Filter out low abundance labels: Skipped as tends to filter
# out all labels (we know these are biologically meaningful
# clusters, so should not be filtered out on count alone).
\# keep <- filterByExpr(y.ab, group=y.ab$samples$day0) y.ab <-
# y.ab[keep,] summary(keep)
design.day0 <- model.matrix(~factor(age), y.ab.day0$samples)</pre>
y.ab.day0 <- calcNormFactors(y.ab.day0, method = "TMMwsp") # we need to normalise to 'library' size as
```

```
y.ab.day0 <- estimateDisp(y.ab.day0, design.day0, trend = "none")
summary(y.ab.day0$common.dispersion)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 1.246 1.246 1.246 1.246 1.246</pre>
plotBCV(y.ab.day0, cex = 1)
```



```
fit.ab.day0 <- glmQLFit(y.ab.day0, design.day0, robust = TRUE,</pre>
    abundance.trend = FALSE)
summary(fit.ab.day0$var.prior)
      Min. 1st Qu.
                   Median
                              Mean 3rd Qu.
##
                                              Max.
    0.9996 0.9996 0.9996 0.9996 0.9996
summary(fit.ab.day0$df.prior)
##
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                              Max.
##
     51.73
            51.73
                    51.73
                             51.73
                                     51.73
                                             51.73
plotQLDisp(fit.ab.day0, cex = 1)
```



```
res.day0 <- glmQLFTest(fit.ab.day0, coef = ncol(design.day0))</pre>
topTags(res.day0)
## Coefficient: factor(age)young
##
           logFC
                   logCPM
                                    F
                                          PValue
                                                       FDR.
## 2 1.05504998 18.12143 1.254875858 0.2665798 0.8365866
## 4 -0.60994315 18.48028 0.465628118 0.4973325 0.8365866
## 3 -0.39203860 18.09320 0.204852485 0.6522787 0.8365866
## 5 0.34199882 18.17779 0.184059294 0.6692692 0.8365866
     0.05370646 17.59998 0.003350091 0.9540147 0.9540147
####### For day42 only:
y.ab.day42 <- DGEList(abundances[, grepl(colnames(abundances),</pre>
    pattern = "d42")], samples = extra.info[grepl(colnames(abundances),
```

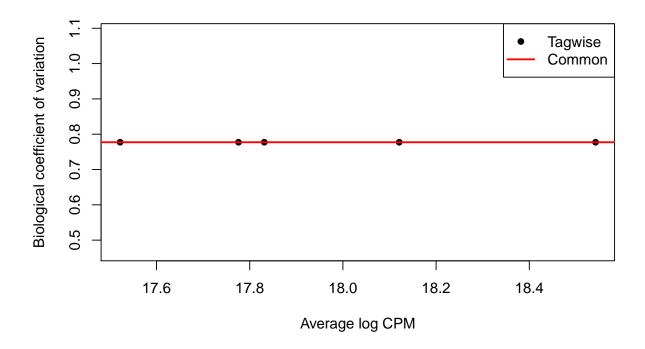
```
# Filter out low abundance labels: Skipped as tends to filter
# out all labels (we know these are biologically meaningful
# clusters, so should not be filtered out on count alone).
# keep <- filterByExpr(y.ab, group=y.ab$samples$day42) y.ab
# <- y.ab[keep,] summary(keep)

design.day42 <- model.matrix(~factor(age), y.ab.day42$samples)
y.ab.day42 <- calcNormFactors(y.ab.day42, method = "TMMwsp") # we need to normalise to 'library' size</pre>
```

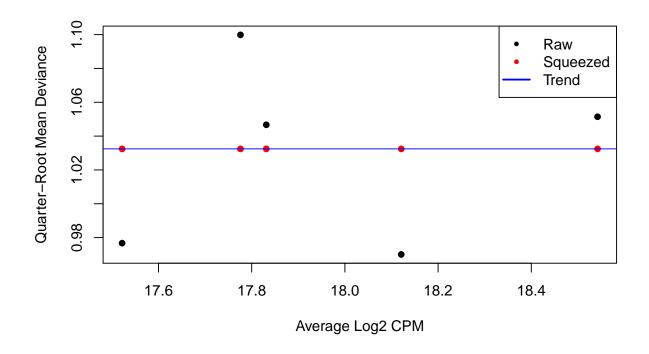
```
y.ab.day42 <- estimateDisp(y.ab.day42, design.day42, trend = "none")
summary(y.ab.day42$common.dispersion)

## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.6041 0.6041 0.6041 0.6041 0.6041

plotBCV(y.ab.day42, cex = 1)</pre>
```



```
fit.ab.day42 <- glmQLFit(y.ab.day42, design.day42, robust = TRUE,</pre>
    abundance.trend = FALSE)
summary(fit.ab.day42$var.prior)
      Min. 1st Qu. Median
                               Mean 3rd Qu.
##
                                                Max.
     1.136
            1.136
##
                     1.136
                              1.136
                                      1.136
                                               1.136
summary(fit.ab.day42$df.prior)
                               Mean 3rd Qu.
##
      Min. 1st Qu. Median
                                                Max.
##
       Inf
               Inf
                        Inf
                                Inf
                                        Inf
                                                 Inf
plotQLDisp(fit.ab.day42, cex = 1)
```



```
res.day42 <- glmQLFTest(fit.ab.day42, coef = ncol(design.day42))
topTags(res.day42)</pre>
```

```
## Coefficient: factor(age)young

## logFC logCPM F PValue FDR

## 5 -0.41303103 18.54218 0.5030789797 0.4799838 0.9899232

## 3 -0.32369681 17.52190 0.2557544107 0.6142885 0.9899232

## 1 0.11550912 18.12089 0.0379828211 0.8459169 0.9899232

## 4 0.05093064 17.77591 0.0068145794 0.9343923 0.9899232

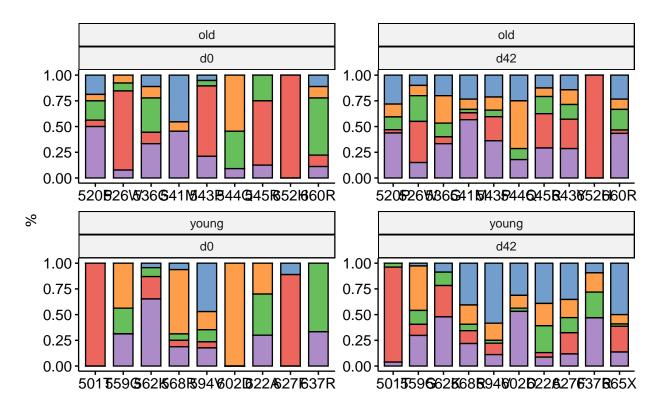
## 2 0.01011668 17.83127 0.0001603992 0.9899232 0.9899232
```

Example plot - proportion of cells at each timepoint by individiual

See figure .Rmd for final version.

```
library(ggpubr)
abundances.percent <- apply(abundances, MARGIN = 1, function(x) {
    x/colSums(abundances)
})

tableau10medium = c("#729ECE", "#FF9E4A", "#67BF5C", "#ED665D",
    "#AD8BC9", "#A8786E", "#ED97CA", "#A2A2A2", "#CDCC5D", "#6DCCDA")</pre>
```



Save important objects

```
save(res, res.0, res.Y, res.day0, res.day42, abundances, abundances.percent,
file = "data/DA_analysis_results.RData")
```