

chp-clustering

Ar

2022-06-07

```
library("flowCore")
library("flowViz")

## Loading required package: lattice

fcsB = read.FCS("../data/Bendall_2011.fcs", truncate_max_range=FALSE)
slotNames(fcsB)

## [1] "exprs"      "parameters" "description"

dim(Biobase::exprs(fcsB))

## [1] 91392      41

markersB = readr::read_csv("../data/Bendall_2011_markers.csv")

## Rows: 10 Columns: 2
## -- Column specification -----
## Delimiter: ","
## chr (2): isotope, marker
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.

mt = match(markersB$isotope, colnames(fcsB))
stopifnot(!any(is.na(mt)))
colnames(fcsB)[mt] = markersB$marker

markersB$marker

## [1] "CD4"      "CD8"      "CD20"     "CD33"     "CD56"     "DNA191" "DNA192" "CD3"
## [9] "CD45RA" "CD3all"

markersB

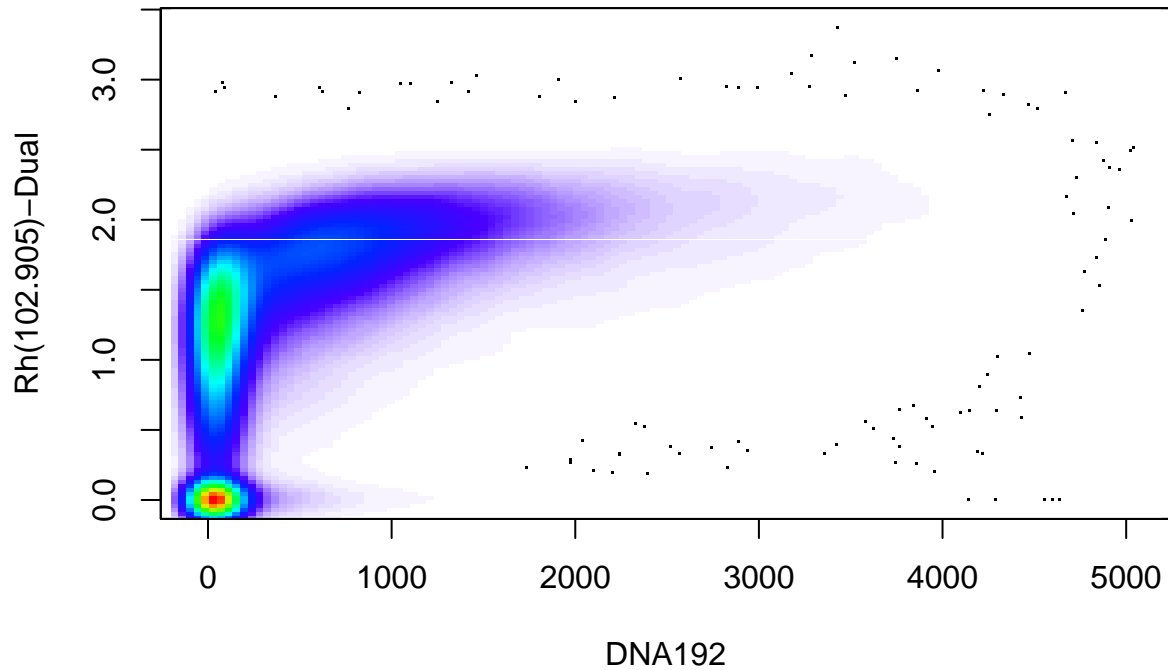
## # A tibble: 10 x 2
##   isotope      marker
##   <chr>      <chr>
## 1 Nd(144.912)-Dual CD4
## 2 Nd(145.913)-Dual CD8
## 3 Sm(146.914)-Dual CD20
## 4 Gd(157.924)-Dual CD33
## 5 Er(169.935)-Dual CD56
## 6 Ir(190.960)-Dual DNA191
## 7 Ir(192.962)-Dual DNA192
## 8 Cd(109.903)-Dual CD3
## 9 La(138.906)-Dual CD45RA
```

```
## 10 Cd(110,111,112,114) CD3a11
match(c(1,2),c(1,1,1,2,2,2,1,1,1,2,2))

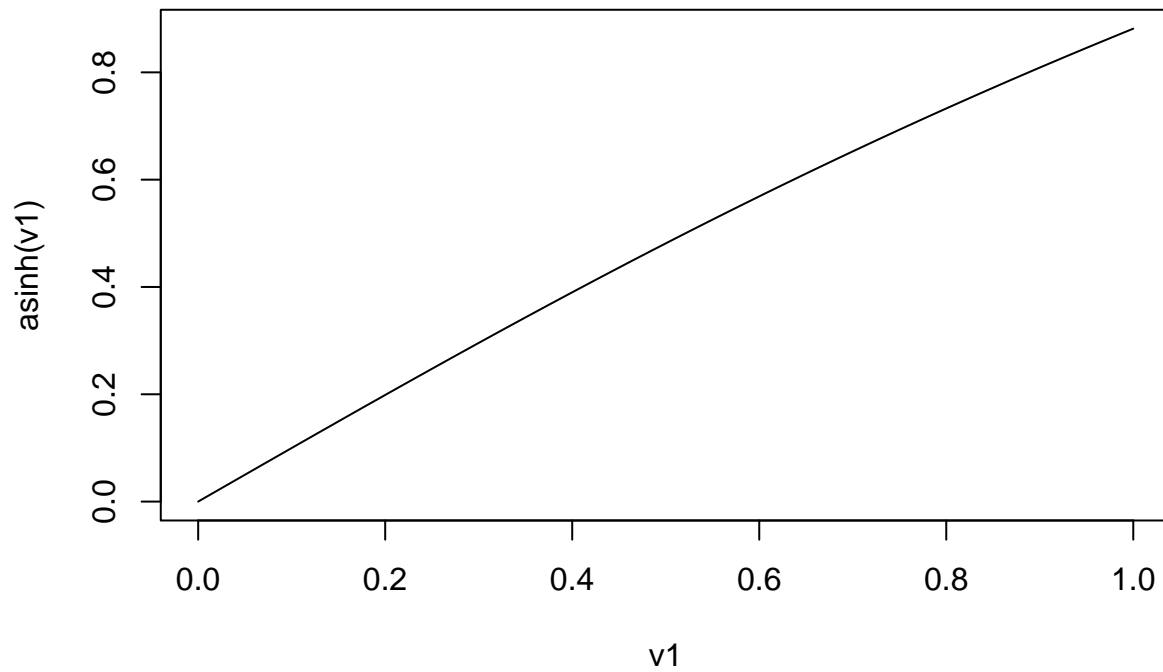
## [1] 1 4
?flowPlot

colnames(fcsB)[4]

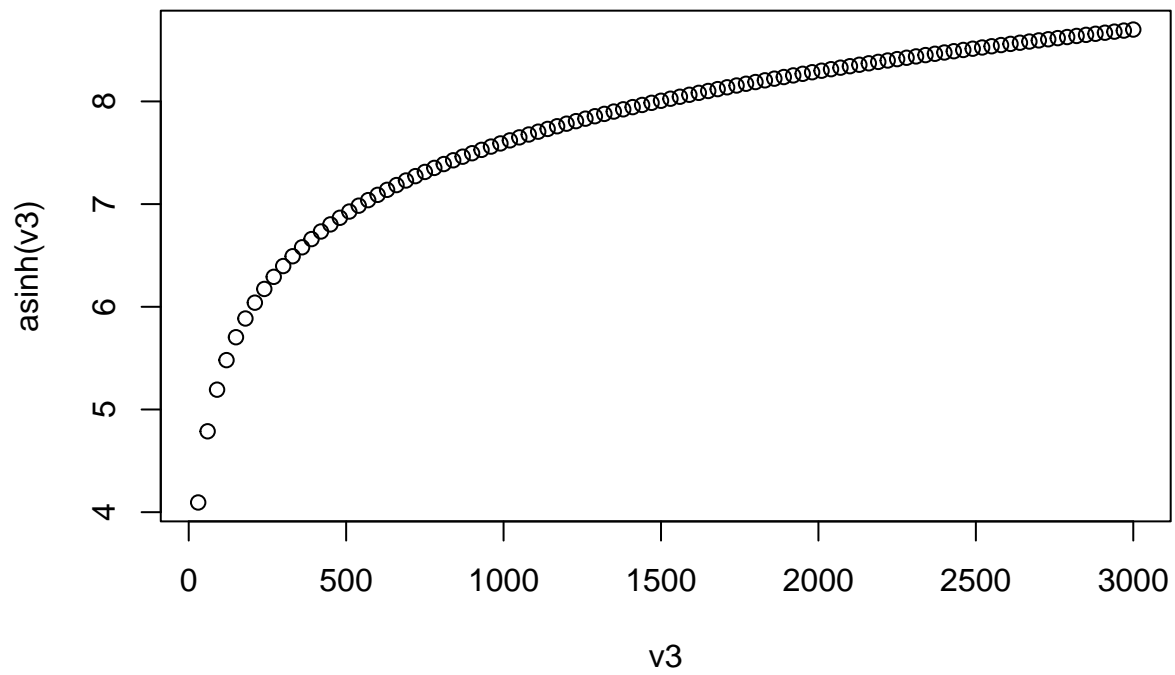
## [1] "DNA192"
flowPlot(fcsB, plotParameters=colnames(fcsB)[4:7], logy=TRUE)
```



```
v1 = seq(0, 1, length.out = 100)
plot(v1, asinh(v1), type = 'l')
```



```
v3 = seq(30, 3000, length = 100)
plot(v3, asinh(v3))
```



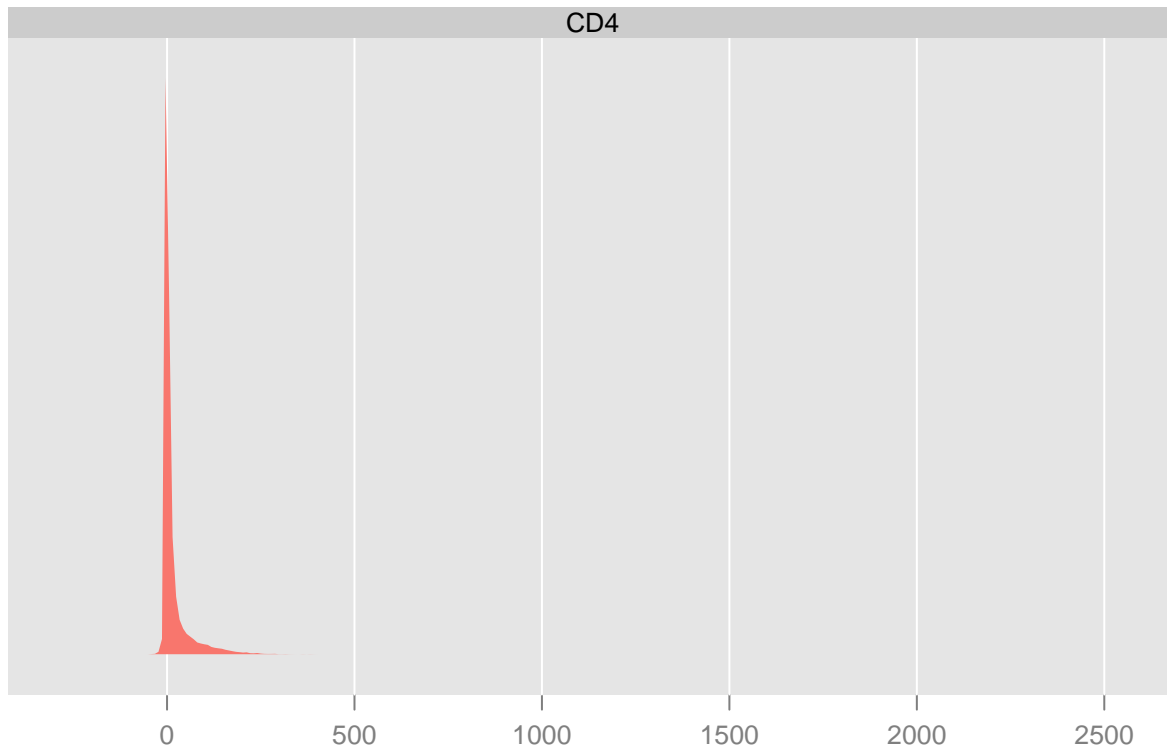
```
asinhtrs = arcsinhTransform(a=0.1, b=1)
fcsBT = transform(fcsB,
                  transformList(colnames(fcsB)[-c(1,2,41)], asinhtrs))
```

```
colnames(fcsB)
```

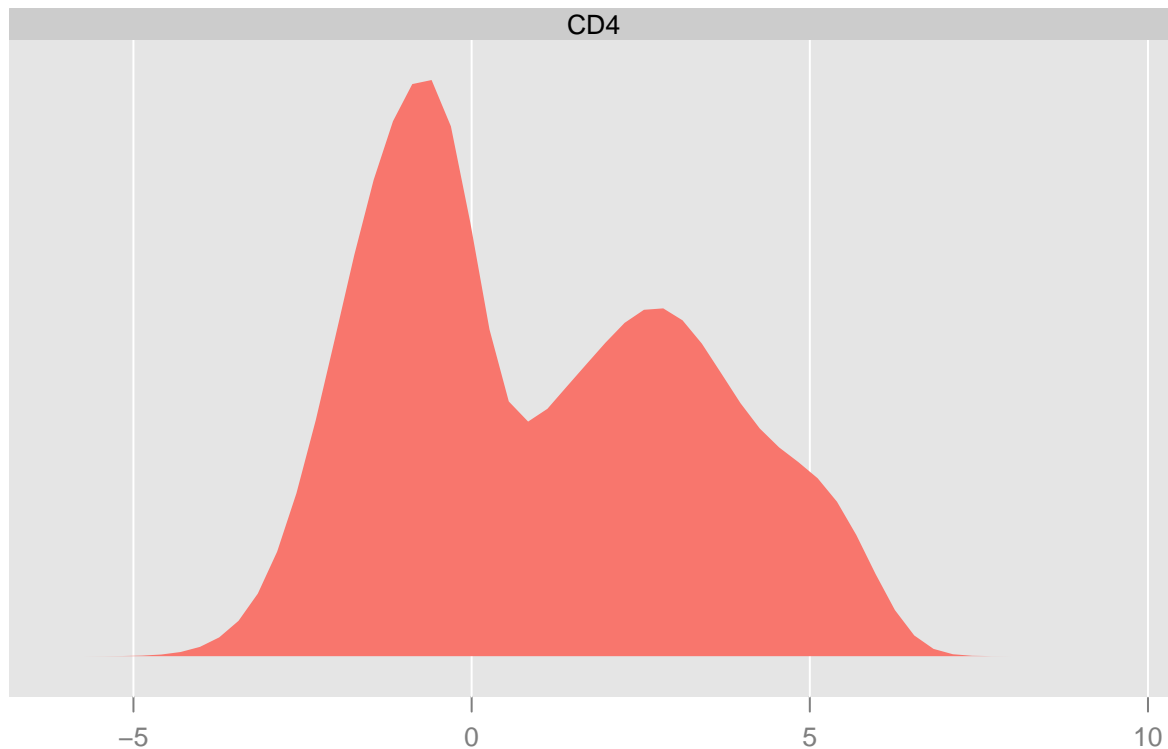
```
## [1] "Time"           "Cell_length"    "DNA191"
## [4] "DNA192"         "Rh(102.905)-Dual" "In(114.903)-Dual"
## [7] "CD3"           "Cd(110.904)-Dual" "Cd(111.902)-Dual"
```

```
## [10] "Cd(113.903)-Dual"      "CD45RA"      "Pr(140.907)-Dual"
## [13] "Nd(141.907)-Dual"      "Nd(143.910)-Dual"  "CD4"
## [16] "CD8"                   "Nd(147.916)-Dual"  "Nd(149.920)-Dual"
## [19] "CD20"                  "Sm(151.919)-Dual"  "Sm(153.922)-Dual"
## [22] "Eu(150.919)-Dual"      "Eu(152.921)-Dual"  "Gd(155.922)-Dual"
## [25] "CD33"                  "Gd(159.927)-Dual"  "Tb(158.925)-Dual"
## [28] "Dy(163.929)-Dual"      "Ho(164.930)-Dual"  "Er(165.930)-Dual"
## [31] "Er(166.932)-Dual"      "Er(167.932)-Dual"  "CD56"
## [34] "Tm(168.934)-Dual"      "Yb(170.936)-Dual"  "Yb(171.936)-Dual"
## [37] "Yb(173.938)-Dual"      "Yb(175.942)-Dual"  "Lu(174.940)-Dual"
## [40] "CD3a11"                "absoluteEventNumber"
```

```
densityplot(~`CD4`, fcsB)
```



```
densityplot(~`CD4`, fcsBT)
```



```
?kmeansFilter
```

```
?filter
```

```
## Help on topic 'filter' was found in the following packages:
```

```
##
```

Package	Library
flowCore	/home/arun/R/x86_64-pc-linux-gnu-library/4.2
stats	/usr/local/lib/R/library

```
##
```

```
##
```

```
## Using the first match ...
```

```
kf = flowCore::kmeansFilter("CD3a11"=c("Pop1", "Pop2"), filterId = "myKmFilter")
fres = flowCore::filter(fcsBT, kf)
```

```
summary(fres)
```

```
## Pop1: 33434 of 91392 events (36.58%)
```

```
## Pop2: 57958 of 91392 events (63.42%)
```

```
fcsBT1 = flowCore::split(fcsBT, fres, population = "Pop1")
```

```
fcsBT2 = flowCore::split(fcsBT, fres, population = "Pop2")
```

```
?flowPeaks
```

```
## No documentation for 'flowPeaks' in specified packages and libraries:
```

```
## you could try '??flowPeaks'
```

```
library("flowPeaks")
```

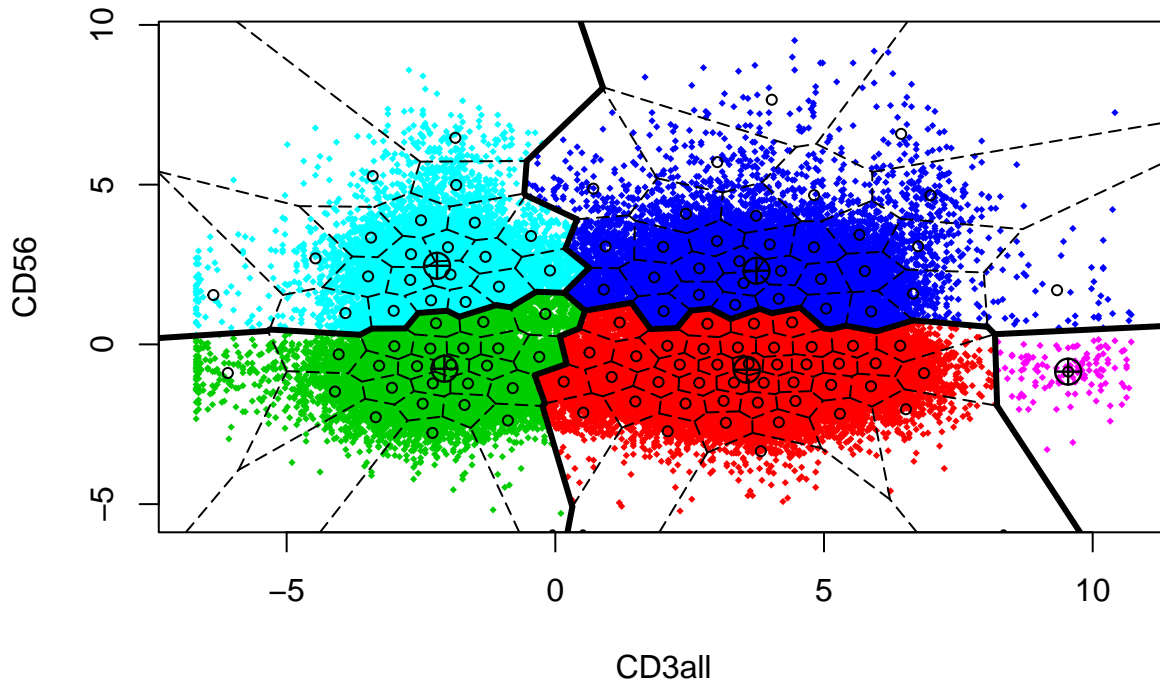
```
fp = flowPeaks(Biobase::exprs(fcsBT)[, c("CD3a11", "CD56")])
```

```
##
```

```
## Starting the flow Peaks analysis...
```

```
##
## Task A: compute kmeans...
## step 0, set the initial seeds, tot.wss=14636.9
## step 1, do the rough EM, tot.wss=10278.9 at 0.265059 sec
## step 2, do the fine transfer of Hartigan-Wong Algorithm
## tot.wss=10221.1 at 0.524185 sec
## ...finished summarization at 0.529 sec
##
## Task B: find peaks...
## finished at 0.603 sec
```

```
plot(fp)
```



```
library("ggcyto")
```

```
## Loading required package: ggplot2
## Loading required package: ncdFlow
## Loading required package: RcppArmadillo
## Loading required package: BH
## Loading required package: flowWorkspace
## As part of improvements to flowWorkspace, some behavior of
## GatingSet objects has changed. For details, please read the section
## titled "The cytoframe and cytoset classes" in the package vignette:
##
## vignette("flowWorkspace-Introduction", "flowWorkspace")
```

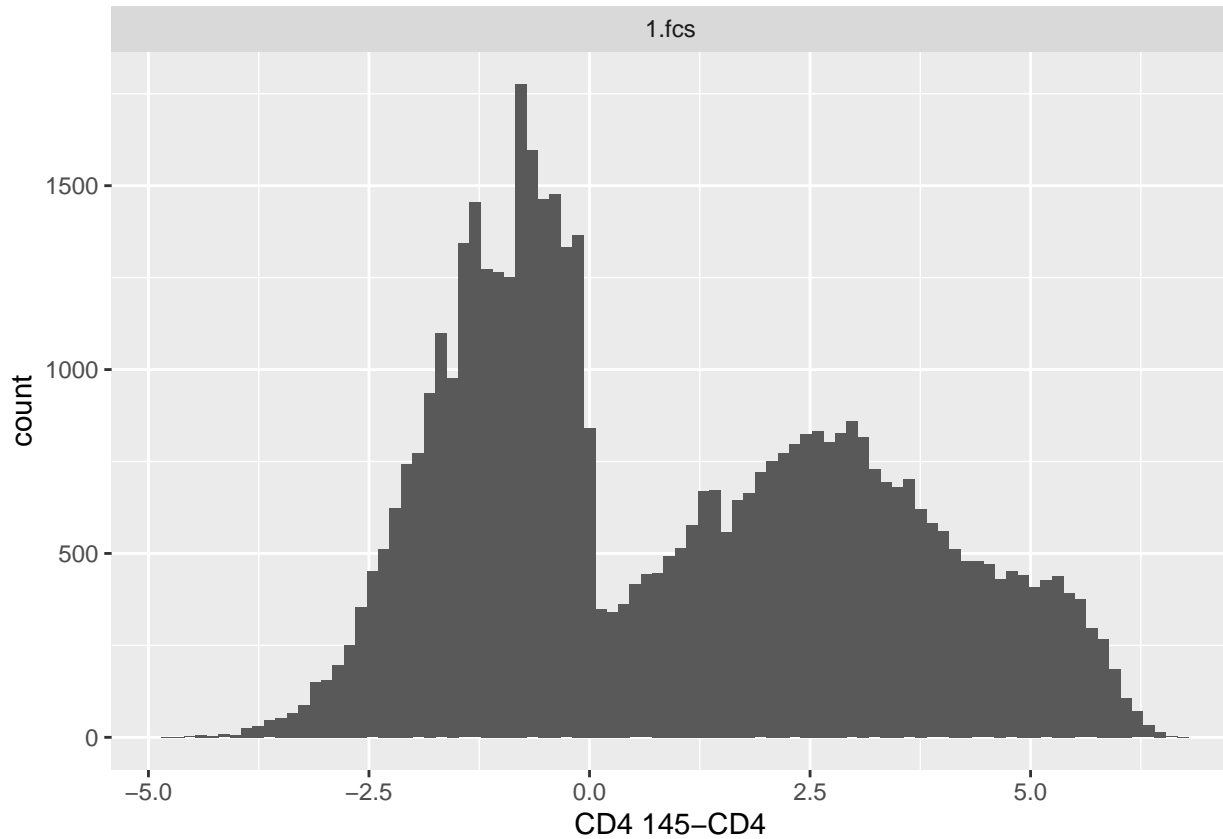
```
library("labeling")
ggcd4cd8 = ggcyto(fcsB, aes(x=CD4, y=CD8))
ggcd4 = ggcyto(fcsB, aes(x=CD4))
ggcd8 = ggcyto(fcsB, aes(x=CD8))
```

```

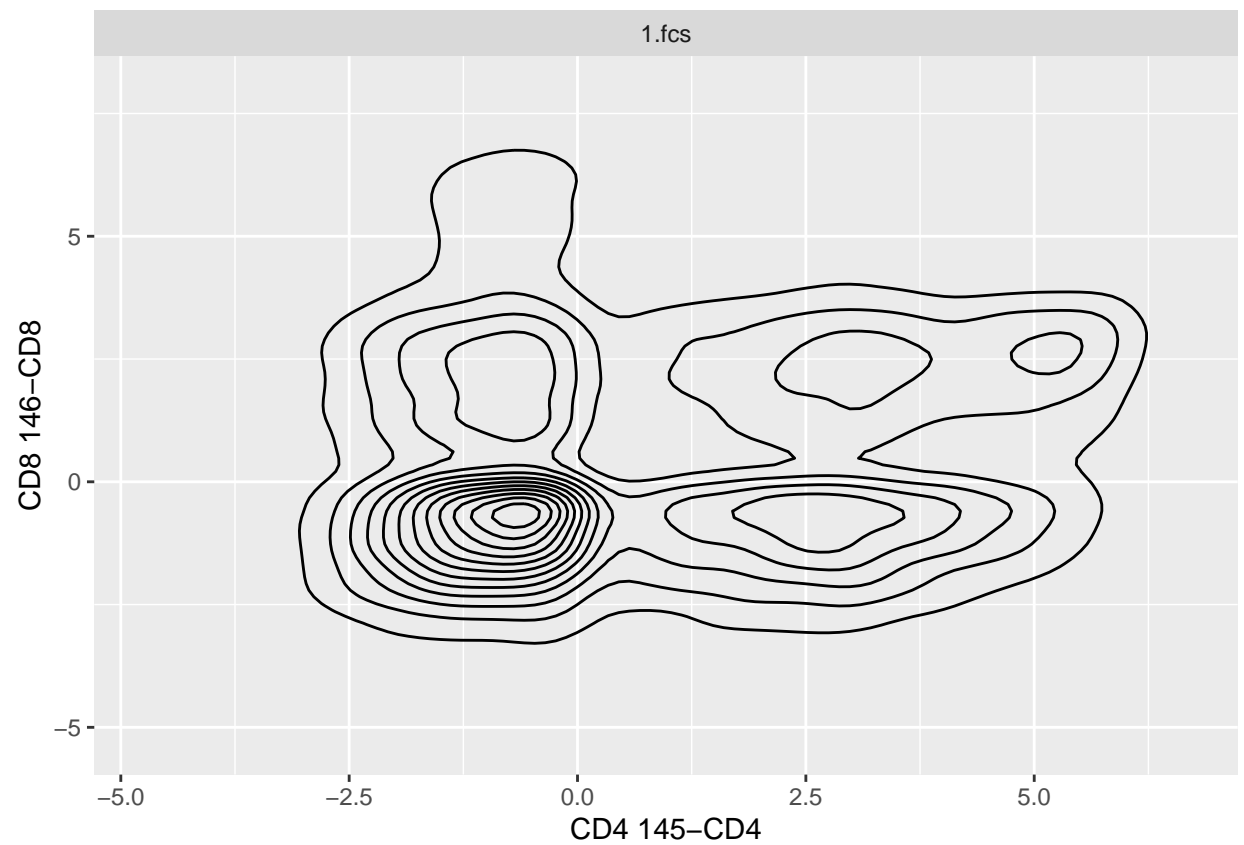
p1 = ggcd4 + geom_histogram(bins=60)
p1b = ggcd8 + geom_histogram(bins=60)
asinhT = arcsinhTransform(a=0, b=1)
trans1 = transformList(colnames(fcsB)[-c(1,2,41)], asinhT)
fcsBT = transform(fcsB, trans1)
p1t = ggcyto(fcsBT, aes(x=CD4))+geom_histogram(bins=90)
p2t = ggcyto(fcsBT, aes(x=CD4, y=CD8))+geom_density2d(colour="black")
p3t = ggcyto(fcsBT, aes(x=CD45RA, y=CD20))+geom_density2d(colour="black")

```

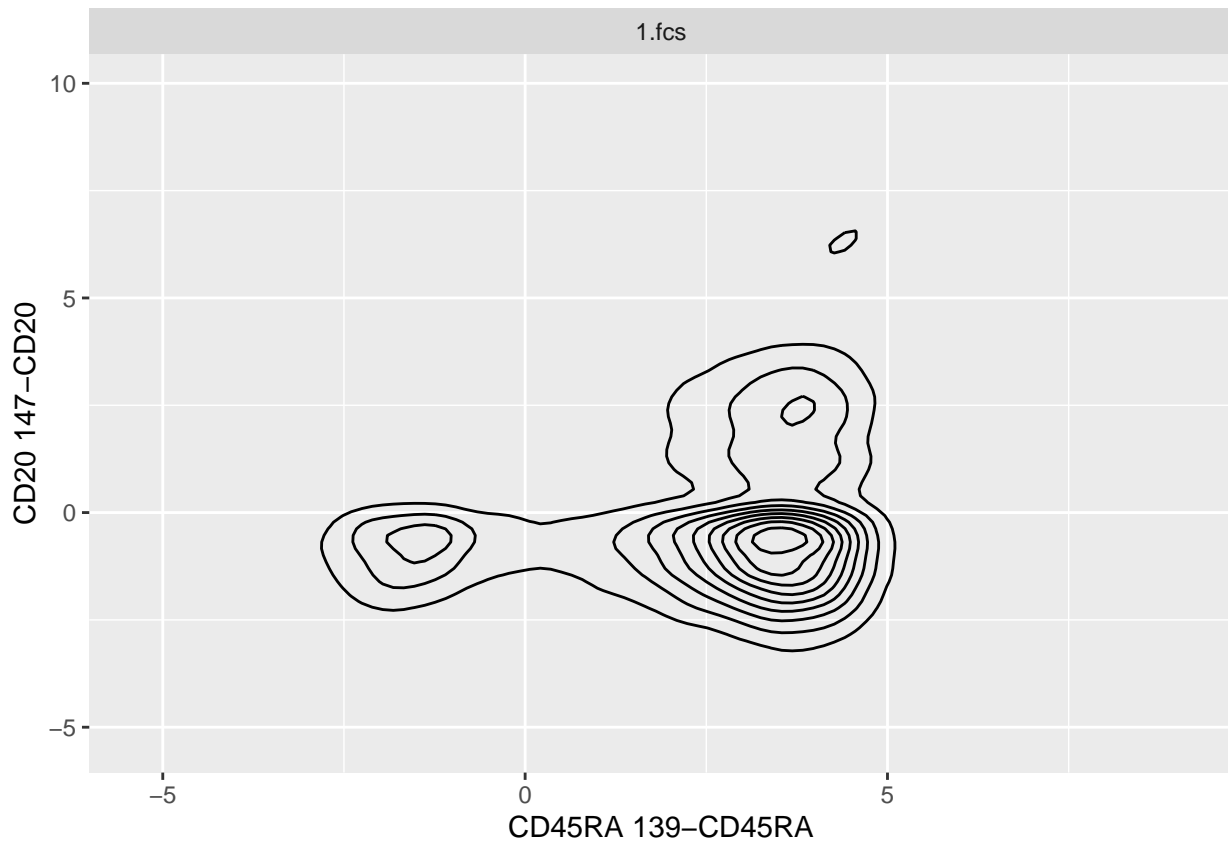
p1t



p2t



p3t



```
?dbscan
```

```
## No documentation for 'dbscan' in specified packages and libraries:
## you could try '??dbscan'
```

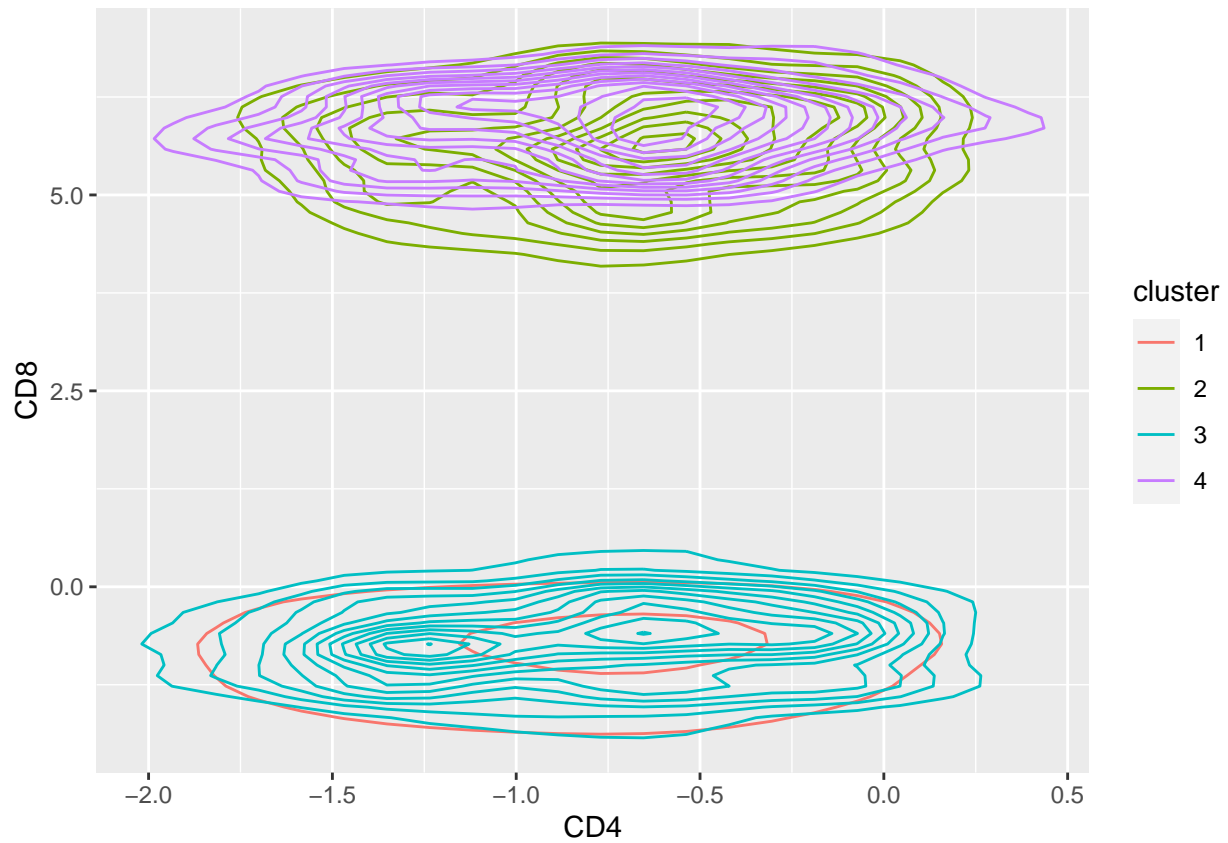
```
library("dbscan")
```

```
mc5 = Biobase::exprs(fcsBT)[,c(15,16,19,33, 40)]
res5 = dbscan::dbscan(mc5, eps=0.95, minPts=100)
mc5df = data.frame(mc5, cluster=as.factor(res5$cluster))
table(mc5df$cluster)
```

```
##
##      0      1      2      3      4
## 58988 31454   330   460   160
```

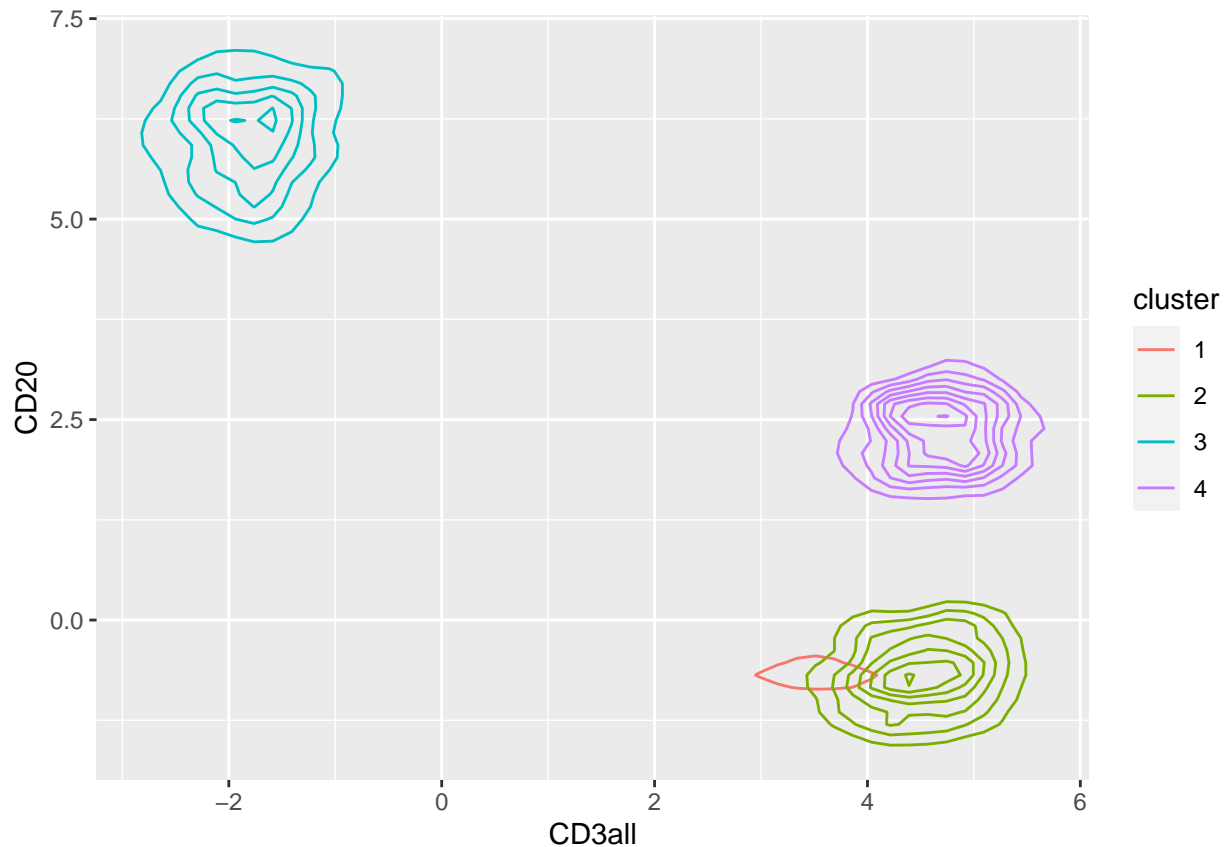
```
ggplot(mc5df, aes(x=CD4, y=CD8, col=cluster))+geom_density2d()
```

```
## Warning: stat_contour(): Zero contours were generated
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
```



```
ggplot(mc5df, aes(x=CD3all, y=CD20, col=cluster))+geom_density2d()
```

```
## Warning: stat_contour(): Zero contours were generated
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
```



```
load("../data/Morder.RData")

dim(Morder)

## [1] 30 156

length(Morder[2,])

## [1] 156

sqrt(sum((Morder[1, ] - Morder[2, ])^2))

## [1] 5.593667

as.matrix(dist(Morder))[2,1]

## [1] 5.593667

mut = read.csv("../data/HIVmutations.csv")
mut[1:3, 10:16]

##   p32I p33F p34Q p35G p43T p46I p46L
## 1    0    1    0    0    0    0    0
## 2    0    1    0    0    0    1    0
## 3    0    1    0    0    0    0    0

library("vegan")

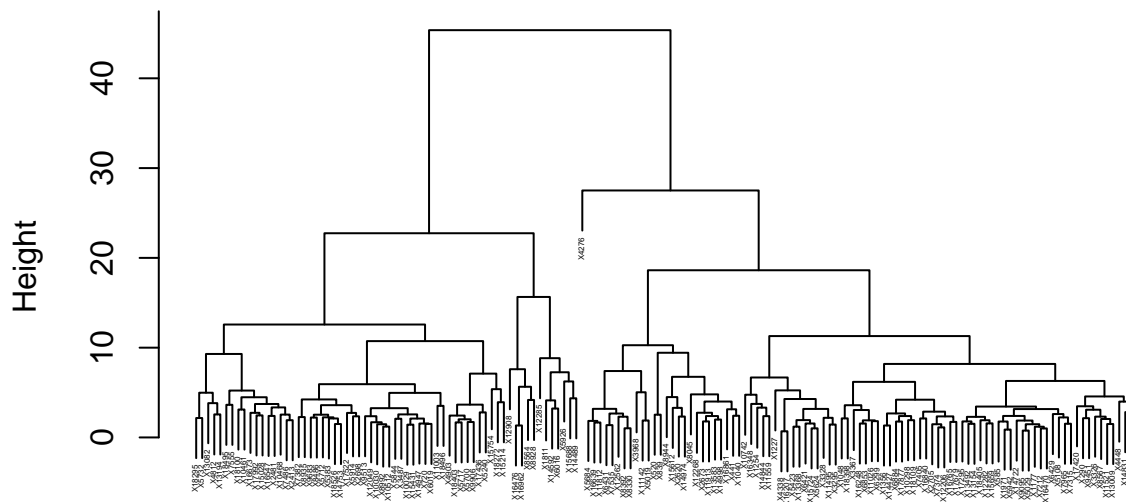
## Loading required package: permute
## This is vegan 2.6-2
```

```
as.matrix(vegdist(mut[,10:16]))[1:3,1:3]
```

```
##           1           2           3
## 1 0.0000000 0.3333333 0.0000000
## 2 0.3333333 0.0000000 0.3333333
## 3 0.0000000 0.3333333 0.0000000
```

```
D = dist(t(Morder))
gene_clust = hclust(d = D)
plot(gene_clust, cex=0.25)
```

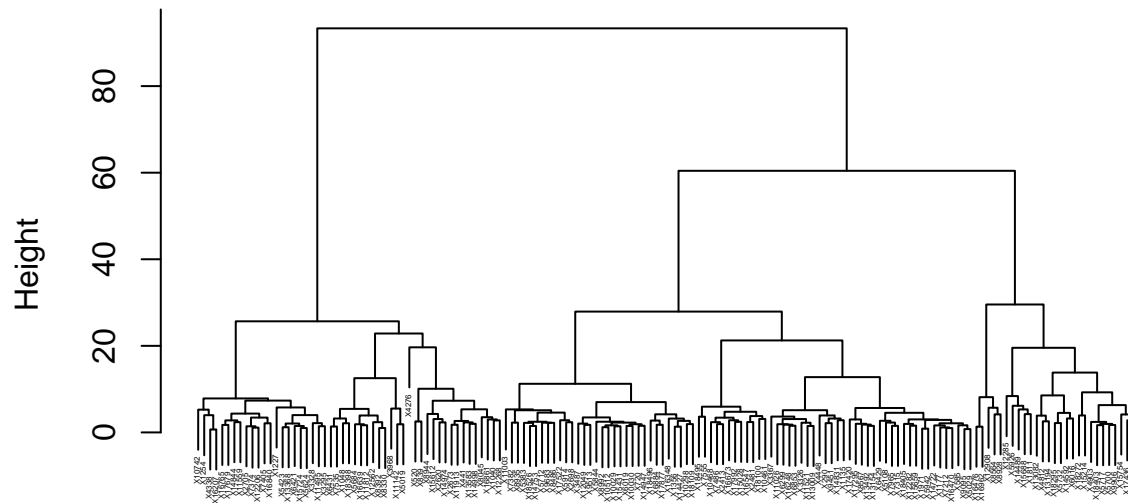
Cluster Dendrogram



D
hclust (*, "complete")

```
gene_clust = hclust(d = D, method="ward.D2")
plot(gene_clust, cex=0.25)
```

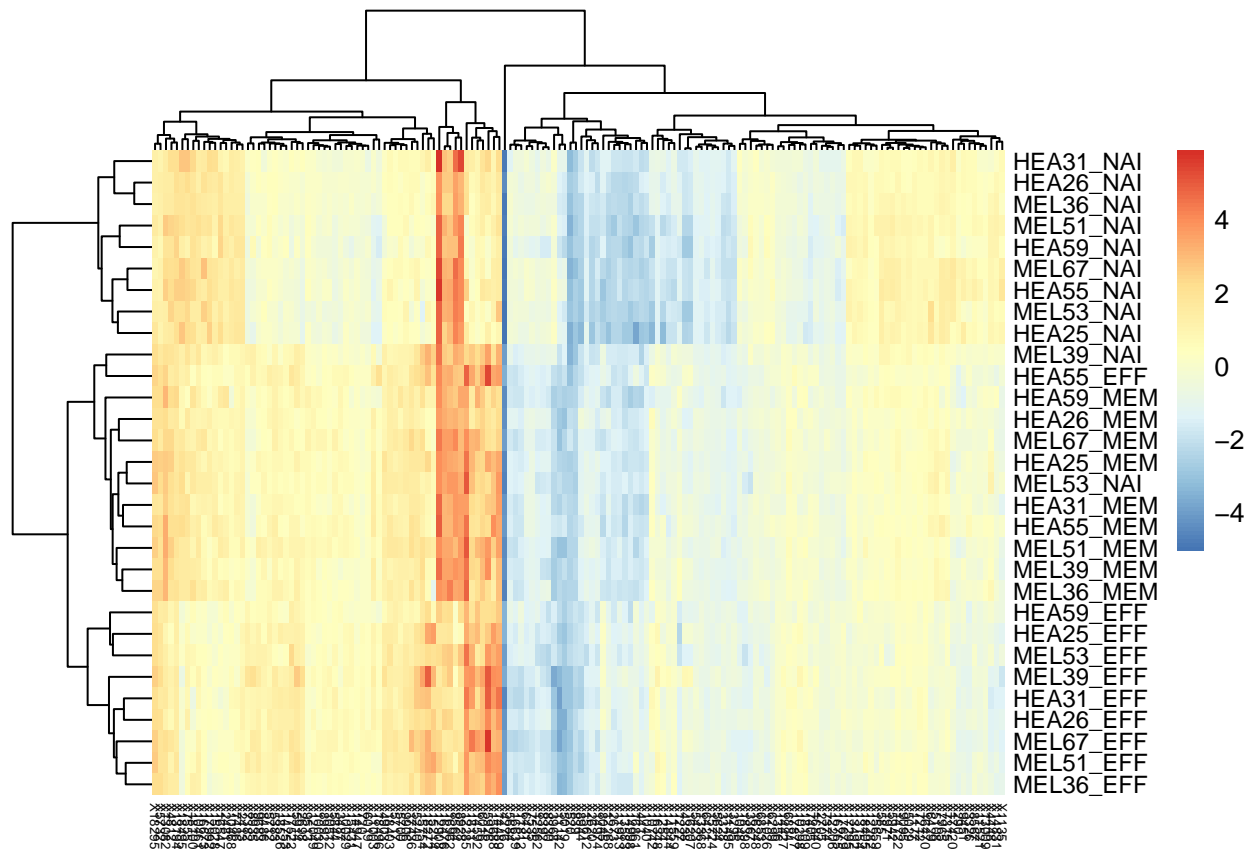
Cluster Dendrogram



D
hclust (*, "ward.D2")

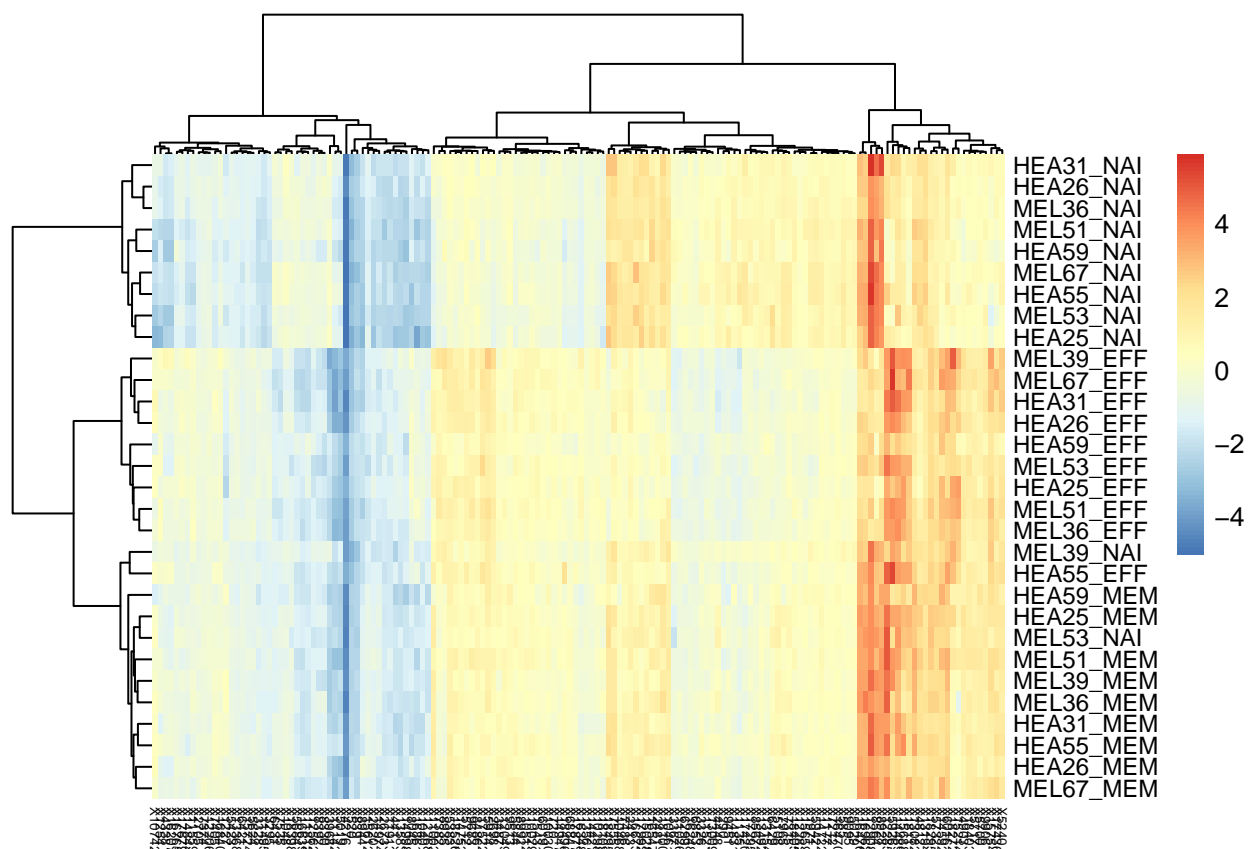
```
#BiocManager::install("pheatmap")
```

```
library("pheatmap")  
pheatmap(Morder, fontsize_col = 5, fontsize_row = 9)
```



?pheatmap

```
pheatmap(Morder, fontsize_col = 5, fontsize_row = 9, clustering_method="ward.D2")
```



```
library('tidyverse')

## Warning in system("timedatectl", intern = TRUE): running command 'timedatectl'
## had status 1

## -- Attaching packages ----- tidyverse 1.3.1 --

## v tibble 3.1.7      v dplyr 1.0.9
## v tidyr 1.2.0      v stringr 1.4.0
## v readr 2.1.2      v forcats 0.5.1
## v purrr 0.3.4

## -- Conflicts ----- tidyverse_conflicts() --
## x ggcyto::%>%() masks ggplot2::%>%()
## x dplyr::filter() masks ncdFlow::filter(), flowCore::filter(), stats::filter()
## x dplyr::lag() masks stats::lag()

cc_data=read.csv("../SCR3_new_data_SP.csv",fileEncoding="UTF-8-BOM")
d = cc_data

library("flowCore")
library("flowViz")
fcsB = read.FCS("../data/Bendall_2011.fcs", truncate_max_range=FALSE)
slotNames(fcsB)

## [1] "exprs" "parameters" "description"

dim(Biobase::exprs(fcsB))

## [1] 91392 41
```

```

markersB = readr::read_csv("../data/Bendall_2011_markers.csv")

## Rows: 10 Columns: 2
## -- Column specification -----
## Delimiter: ","
## chr (2): isotope, marker
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
mt = match(markersB$isotope, colnames(fcsB))
stopifnot(!any(is.na(mt)))
colnames(fcsB)[mt] = markersB$marker

```

```
markersB
```

```

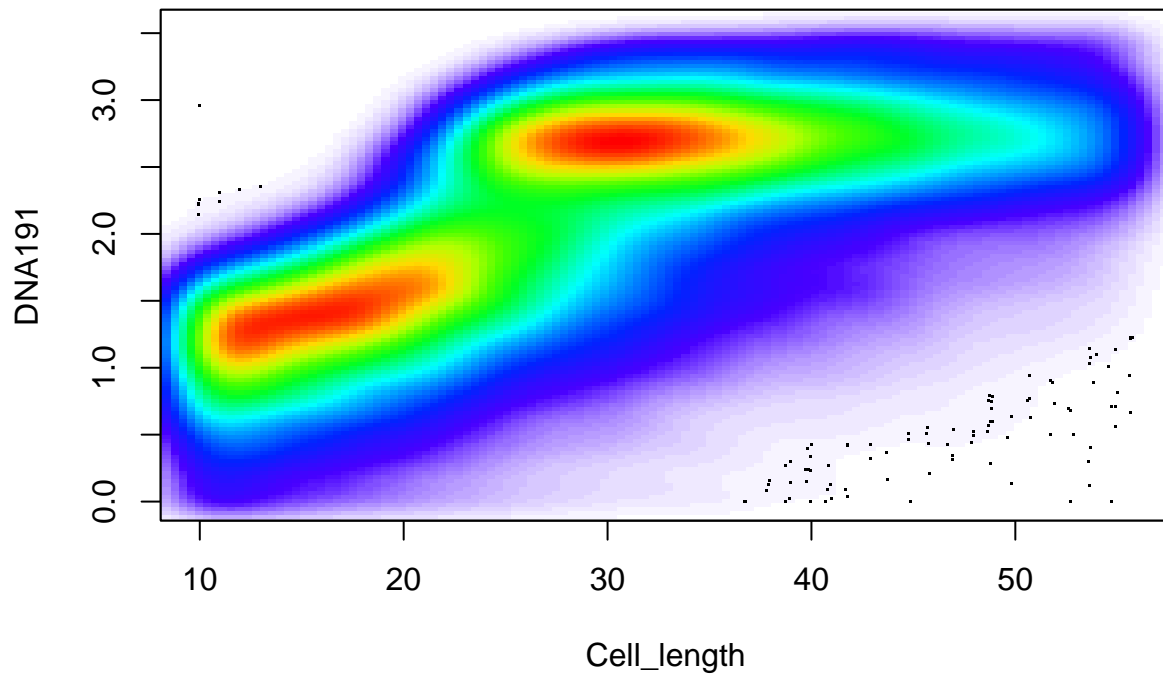
## # A tibble: 10 x 2
##   isotope      marker
##   <chr>      <chr>
## 1 Nd(144.912)-Dual CD4
## 2 Nd(145.913)-Dual CD8
## 3 Sm(146.914)-Dual CD20
## 4 Gd(157.924)-Dual CD33
## 5 Er(169.935)-Dual CD56
## 6 Ir(190.960)-Dual DNA191
## 7 Ir(192.962)-Dual DNA192
## 8 Cd(109.903)-Dual CD3
## 9 La(138.906)-Dual CD45RA
## 10 Cd(110,111,112,114) CD3all
match(c(1,2),c(1,1,1,2,2,2,1,1,1,2,2))

```

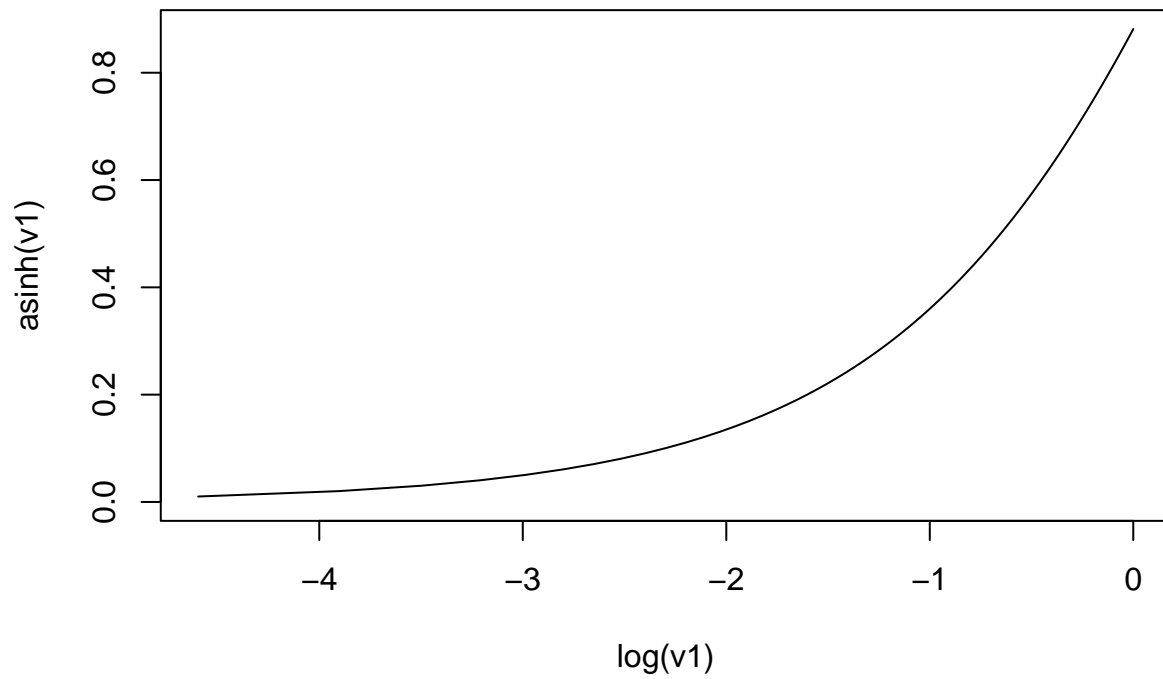
```
## [1] 1 4
```

```
?flowPlot
```

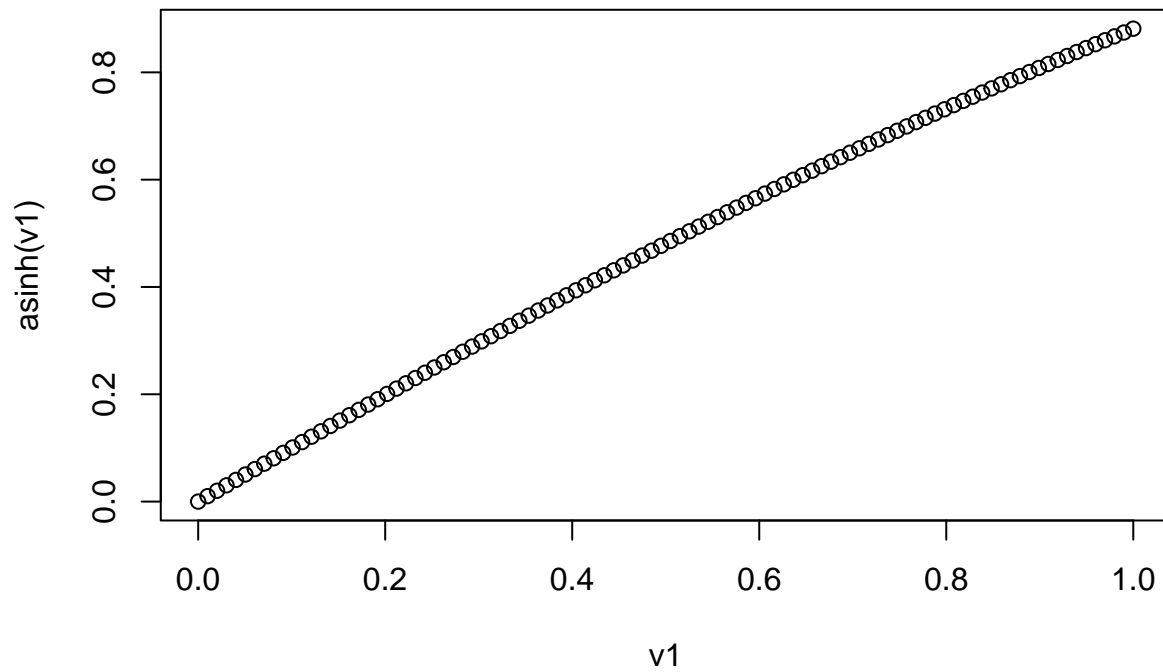
```
flowPlot(fcsB, plotParameters=colnames(fcsB)[2:3], logy=TRUE)
```

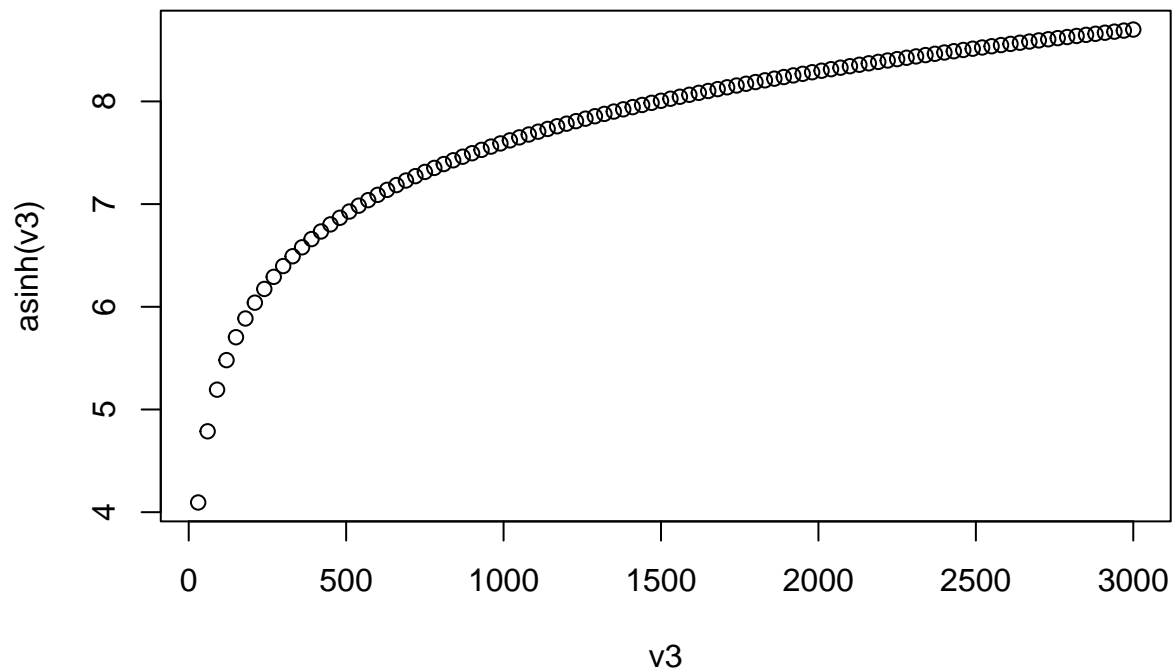
```
v1 = seq(0, 1, length.out = 100)
plot(log(v1), asinh(v1), type = 'l')
```



```
plot(v1, asinh(v1))
```



```
v3 = seq(30, 3000, length = 100)
plot(v3, asinh(v3))
```



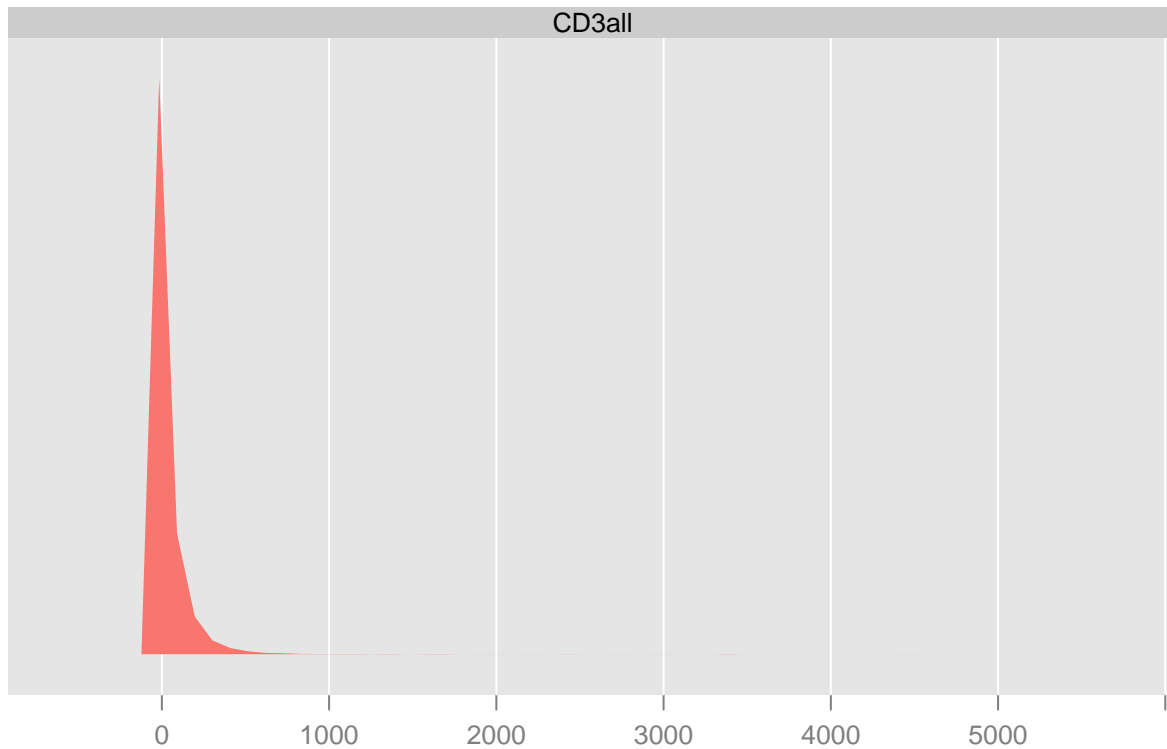
```
asinhtrs = arcsinhTransform(a=0.1, b=1)
fcsBT = transform(fcsB,
                  transformList(colnames(fcsB)[-c(1,2,41)], asinhtrs))
```

```
colnames(fcsB)
```

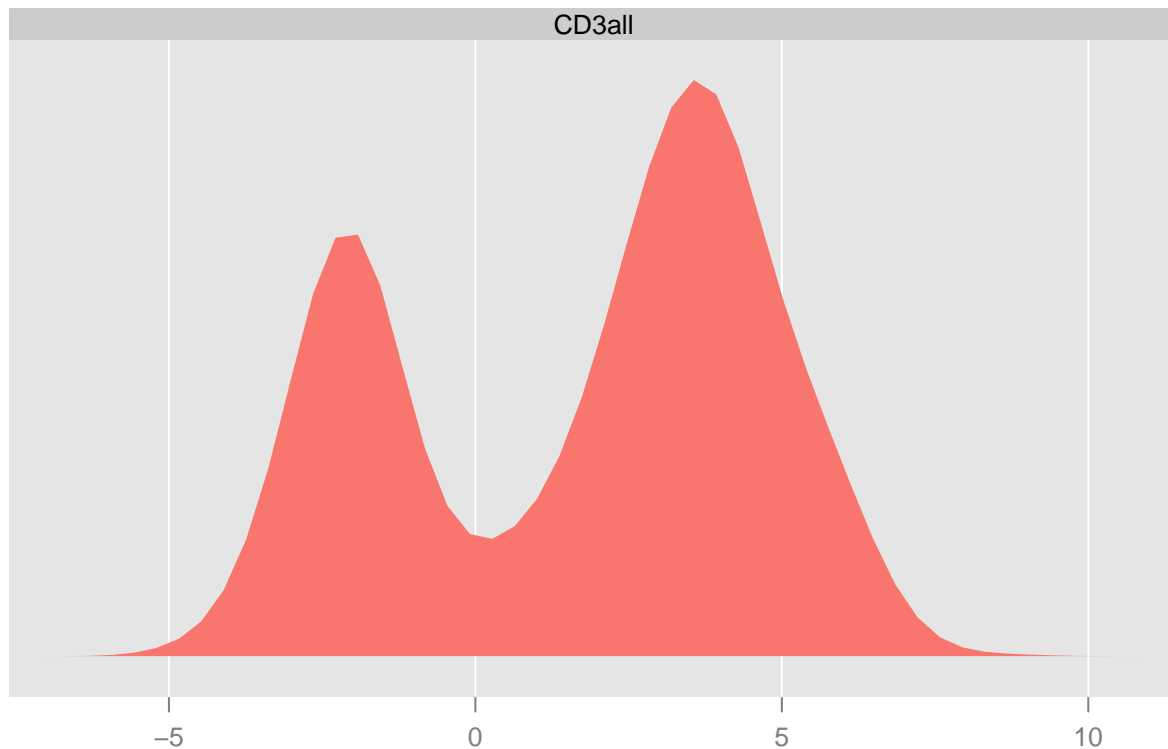
```
## [1] "Time"           "Cell_length"    "DNA191"
## [4] "DNA192"         "Rh(102.905)-Dual" "In(114.903)-Dual"
## [7] "CD3"           "Cd(110.904)-Dual" "Cd(111.902)-Dual"
```

```
## [10] "Cd(113.903)-Dual"      "CD45RA"      "Pr(140.907)-Dual"
## [13] "Nd(141.907)-Dual"      "Nd(143.910)-Dual"  "CD4"
## [16] "CD8"                   "Nd(147.916)-Dual"  "Nd(149.920)-Dual"
## [19] "CD20"                   "Sm(151.919)-Dual"  "Sm(153.922)-Dual"
## [22] "Eu(150.919)-Dual"      "Eu(152.921)-Dual"  "Gd(155.922)-Dual"
## [25] "CD33"                   "Gd(159.927)-Dual"  "Tb(158.925)-Dual"
## [28] "Dy(163.929)-Dual"      "Ho(164.930)-Dual"  "Er(165.930)-Dual"
## [31] "Er(166.932)-Dual"      "Er(167.932)-Dual"  "CD56"
## [34] "Tm(168.934)-Dual"      "Yb(170.936)-Dual"  "Yb(171.936)-Dual"
## [37] "Yb(173.938)-Dual"      "Yb(175.942)-Dual"  "Lu(174.940)-Dual"
## [40] "CD3a11"                "absoluteEventNumber"
```

```
densityplot(~`CD3a11`, fcsB)
```



```
densityplot(~`CD3a11`, fcsBT)
```



```
?kmeansFilter
```

```
kf = kmeansFilter("CD3all"=c("Pop1", "Pop2"), filterId = "myKmFilter")
fres = flowCore::filter(fcsBT, kf)
summary(fres)
```

```
## Pop1: 33434 of 91392 events (36.58%)
```

```
## Pop2: 57958 of 91392 events (63.42%)
```

```
fcsBT1 = flowCore::split(fcsBT, fres, population = "Pop1")
```

```
fcsBT2 = flowCore::split(fcsBT, fres, population = "Pop2")
```

```
library("flowPeaks")
```

```
fp = flowPeaks(Biobase::exprs(fcsBT)[, c("CD3all", "CD56")])
```

```
##
```

```
## Starting the flow Peaks analysis...
```

```
##
```

```
## Task A: compute kmeans...
```

```
## step 0, set the initial seeds, tot.wss=14636.9
```

```
## step 1, do the rough EM, tot.wss=10278.9 at 0.247494 sec
```

```
## step 2, do the fine transfer of Hartigan-Wong Algorithm
```

```
## tot.wss=10221.1 at 0.512915 sec
```

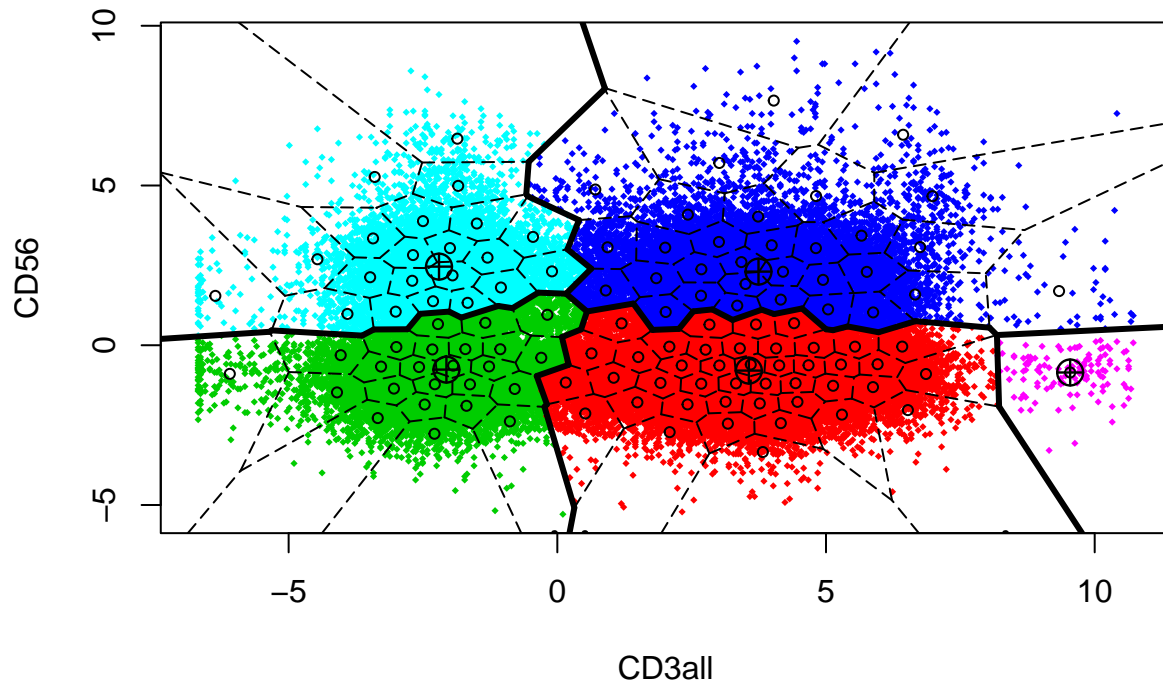
```
## ...finished summarization at 0.515 sec
```

```
##
```

```
## Task B: find peaks...
```

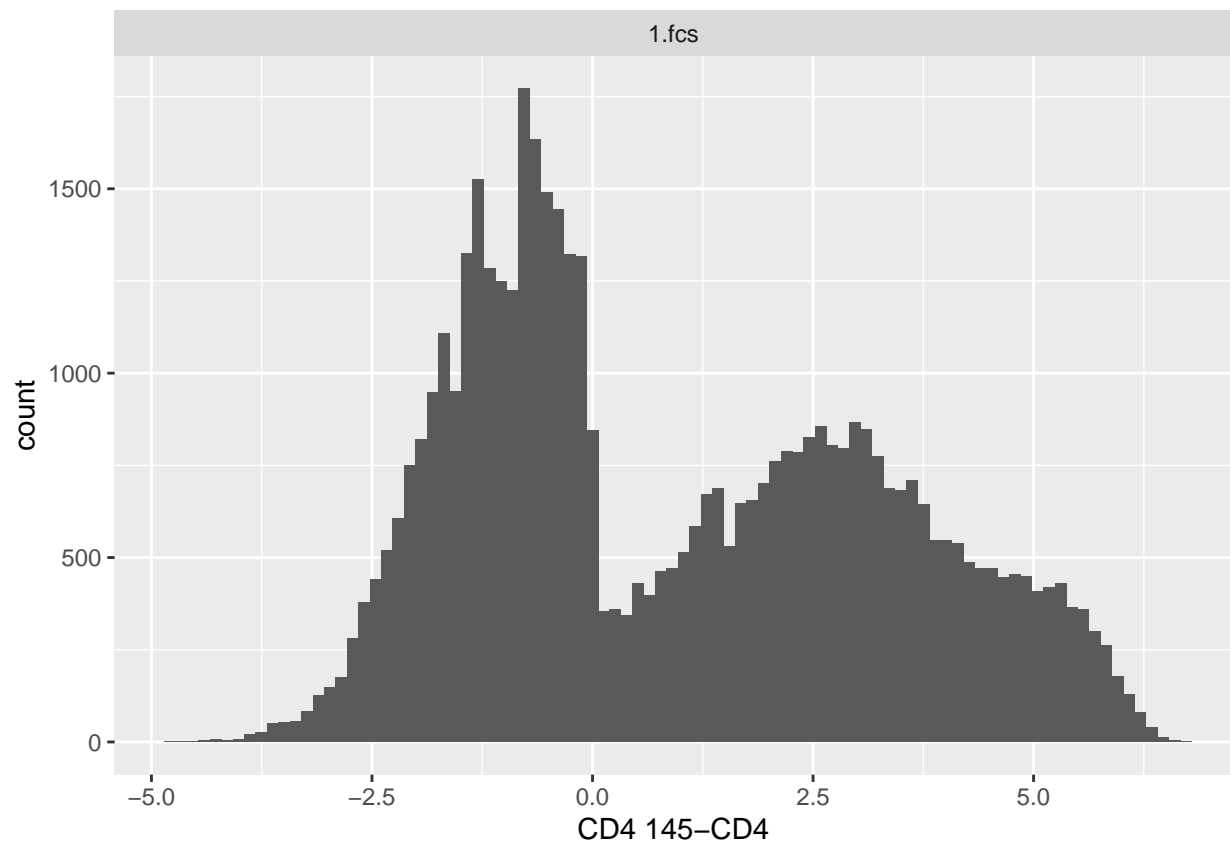
```
## finished at 0.588 sec
```

```
plot(fp)
```

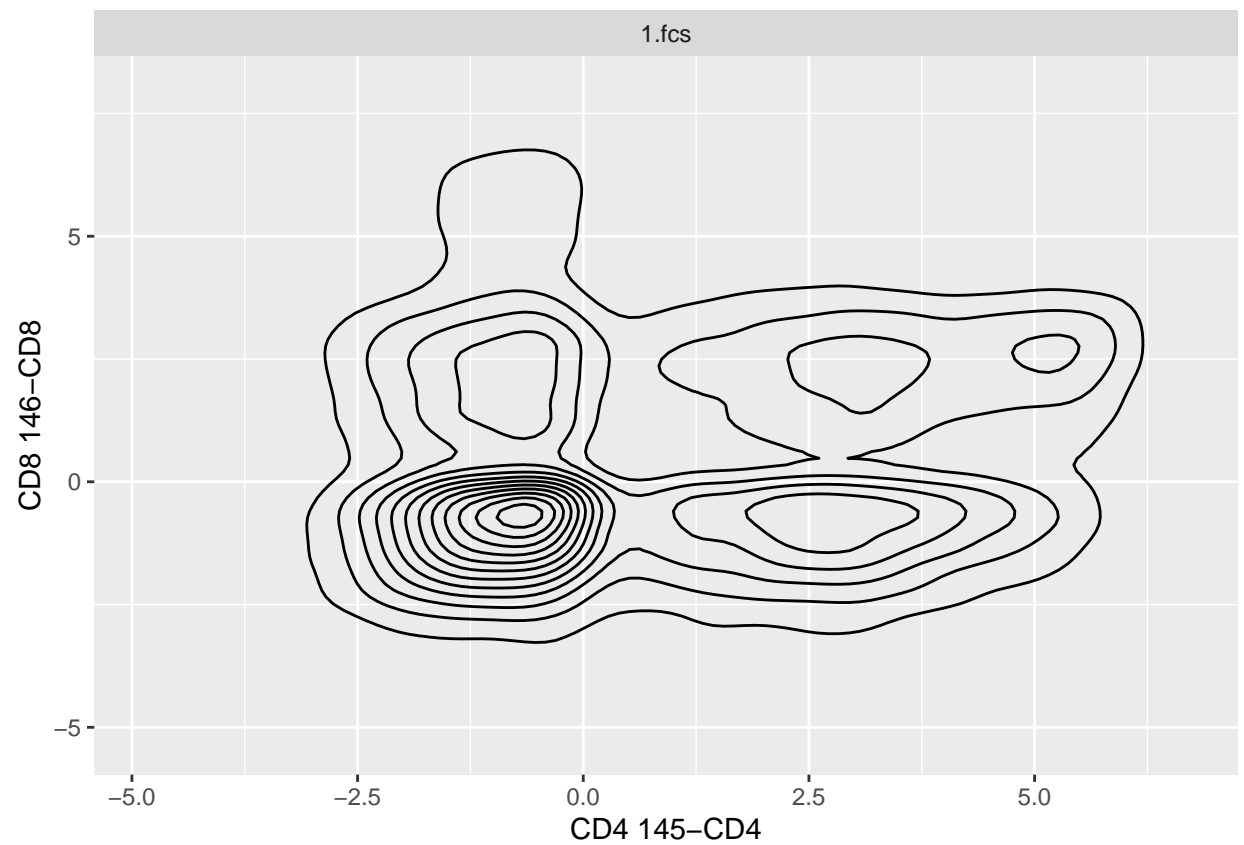


```
library("ggcyto")
library("labeling")
ggcd4cd8 = ggcyto(fcsB, aes(x=CD4, y=CD8))
ggcd4 = ggcyto(fcsB, aes(x=CD4))
ggcd8 = ggcyto(fcsB, aes(x=CD8))
p1 = ggcd4 + geom_histogram(bins=60)
p1b = ggcd8 + geom_histogram(bins=60)
asinhT = arcsinhTransform(a=0, b=1)
trans1 = transformList(colnames(fcsB)[-c(1,2,41)], asinhT)
fcsBT = transform(fcsB, trans1)
p1t = ggcyto(fcsBT, aes(x=CD4)) + geom_histogram(bins=90)
p2t = ggcyto(fcsBT, aes(x=CD4, y=CD8)) + geom_density2d(colour="black")
p3t = ggcyto(fcsBT, aes(x=CD45RA, y=CD20)) + geom_density2d(colour="black")
```

```
p1t
```



p2t



p3t

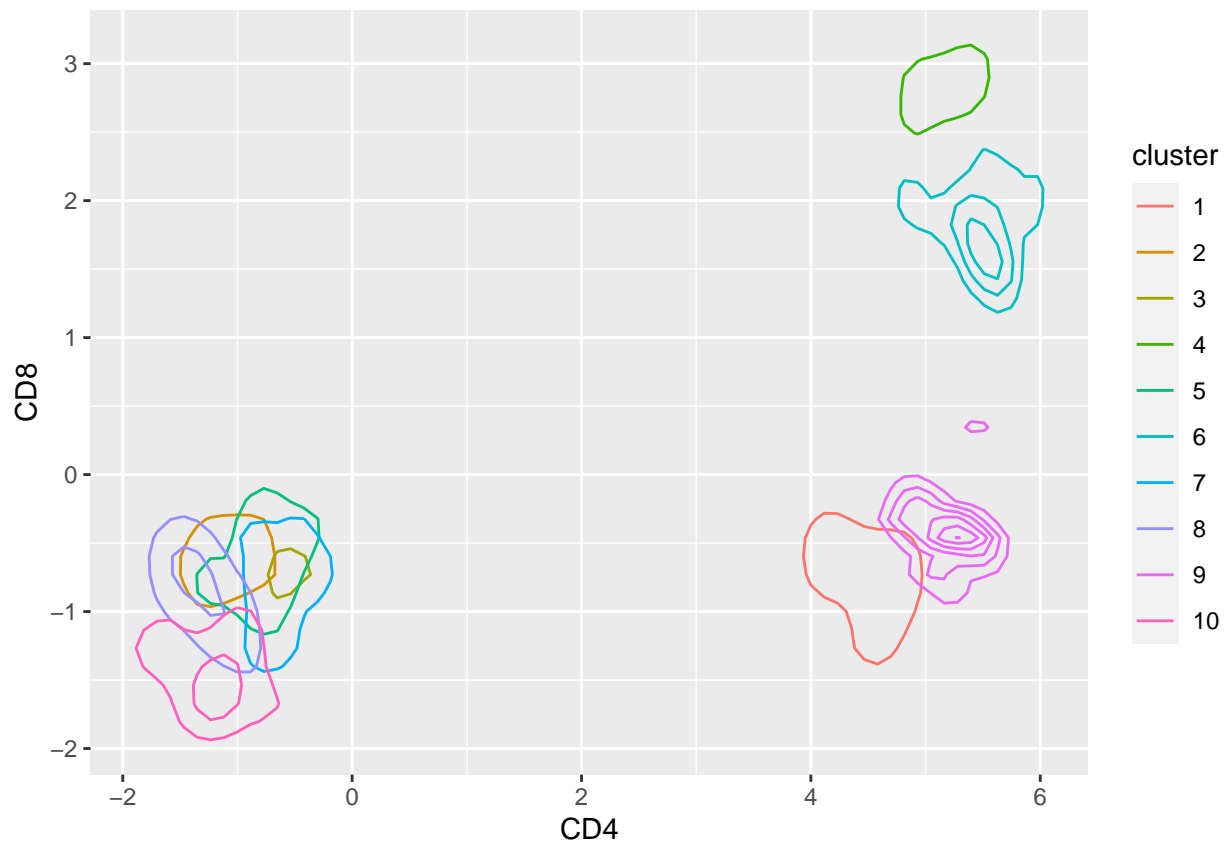


```
library("dbscan")
mc5 = Biobase::exprs(fcsBT)[,c(11,15,16,19,25, 33, 40)]
res5 = dbscan::dbscan(mc5, eps=0.95, minPts=20)
mc5df = data.frame(mc5, cluster=as.factor(res5$cluster))
table(mc5df$cluster)
```

```
##
##      0      1      2      3      4      5      6      7      8      9     10
## 90249    21   102   445   158   119    19   224    17    20    18
```

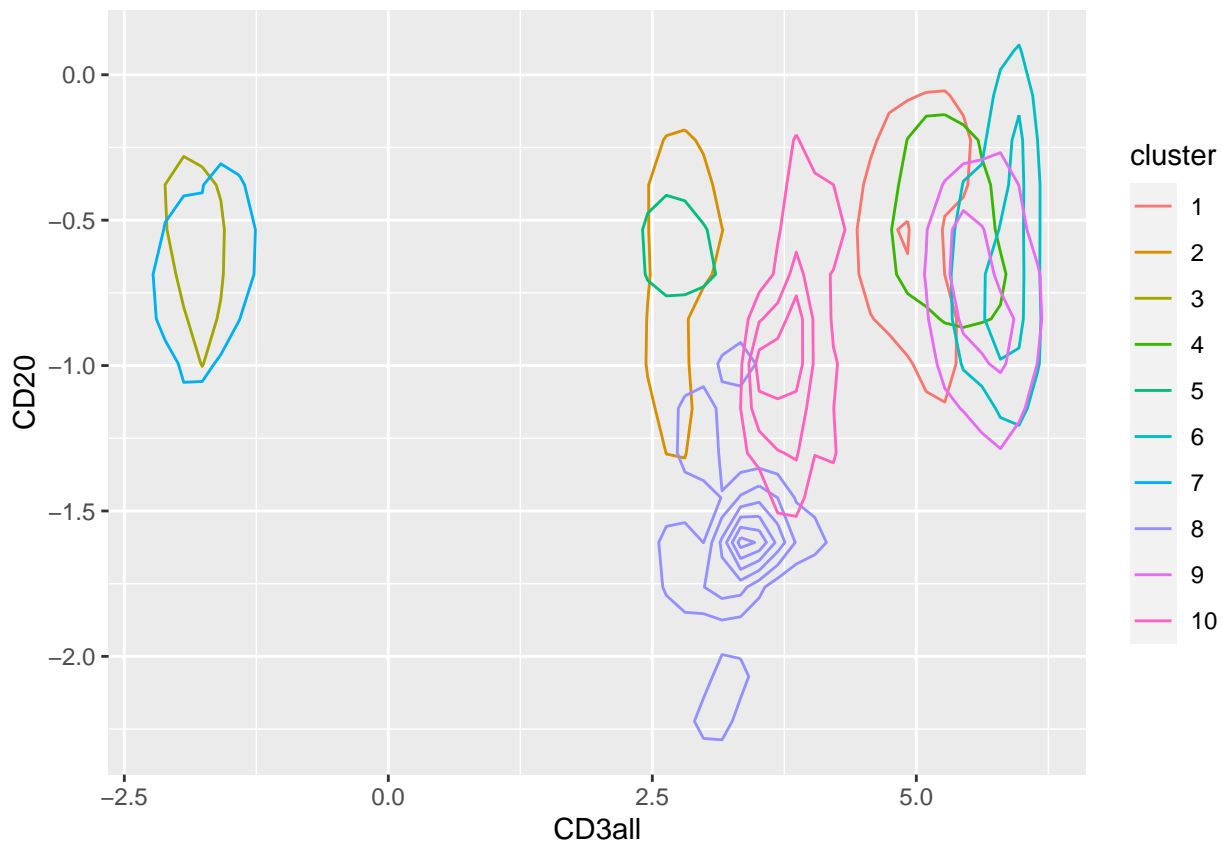
```
ggplot(mc5df, aes(x=CD4, y=CD8, col=cluster))+geom_density2d()
```

```
## Warning: stat_contour(): Zero contours were generated
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
```

```
ggplot(mc5df, aes(x=CD3all, y=CD20, col=cluster))+geom_density2d()
```

```
## Warning: stat_contour(): Zero contours were generated
## Warning in min(x): no non-missing arguments to min; returning Inf
## Warning in max(x): no non-missing arguments to max; returning -Inf
```



```
BiocManager::install("Morder")
```

```
## Bioconductor version 3.15 (BiocManager 1.30.18), R 4.2.0 (2022-04-22)
## Installing package(s) 'Morder'
## Warning: package 'Morder' is not available for Bioconductor version '3.15'
##
## A version of this package for your version of R might be available elsewhere,
## see the ideas at
## https://cran.r-project.org/doc/manuals/r-patched/R-admin.html#Installing-packages
## Installation paths not writeable, unable to update packages
## path: /usr/local/lib/R/library
## packages:
## MASS, nlme
## Old packages: 'broom', 'bslib', 'callr', 'DBI', 'dbplyr', 'ensembldb',
## 'farver', 'flowViz', 'generics', 'ggcyto', 'gtools', 'htmltools', 'KEGGREST',
## 'latticeExtra', 'limma', 'locfit', 'MatrixGenerics', 'ncdfFlow', 'pillar',
## 'processx', 'Rcpp', 'RcppArmadillo', 'restfulr', 'RSQLite', 'rtracklayer',
## 'sass', 'shiny', 'stringi', 'tidyverse', 'tinytex'
```

```
library("MOrder")
```

```
load("../data/Morder.RData")
```

```
dim(Morder)
```

```
## [1] 30 156
```

```

length(Morder[2,])

## [1] 156
sqrt(sum((Morder[1, ] - Morder[2, ])^2))

## [1] 5.593667
as.matrix(dist(Morder))[2,1]

## [1] 5.593667
mut = read.csv("../data/HIVmutations.csv")
mut[1:3, 10:16]

##   p32I p33F p34Q p35G p43T p46I p46L
## 1    0    1    0    0    0    0    0
## 2    0    1    0    0    0    1    0
## 3    0    1    0    0    0    0    0

library("vegan")

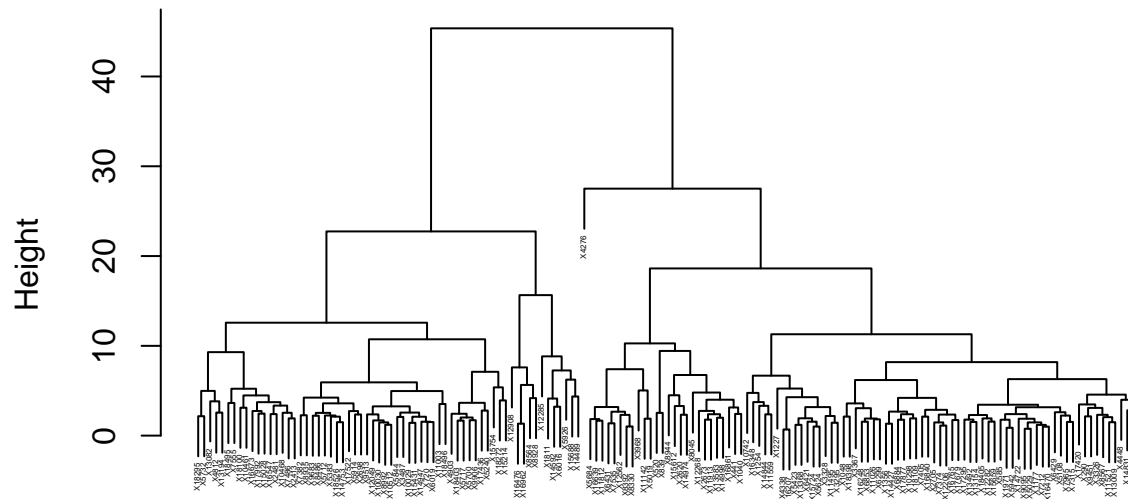
as.matrix(vegdist(mut[,10:16]))[1:3,1:3]

##           1           2           3
## 1 0.0000000 0.3333333 0.0000000
## 2 0.3333333 0.0000000 0.3333333
## 3 0.0000000 0.3333333 0.0000000

D = dist(t(Morder))
gene_clust = hclust(d = D)
plot(gene_clust, cex=0.25)

```

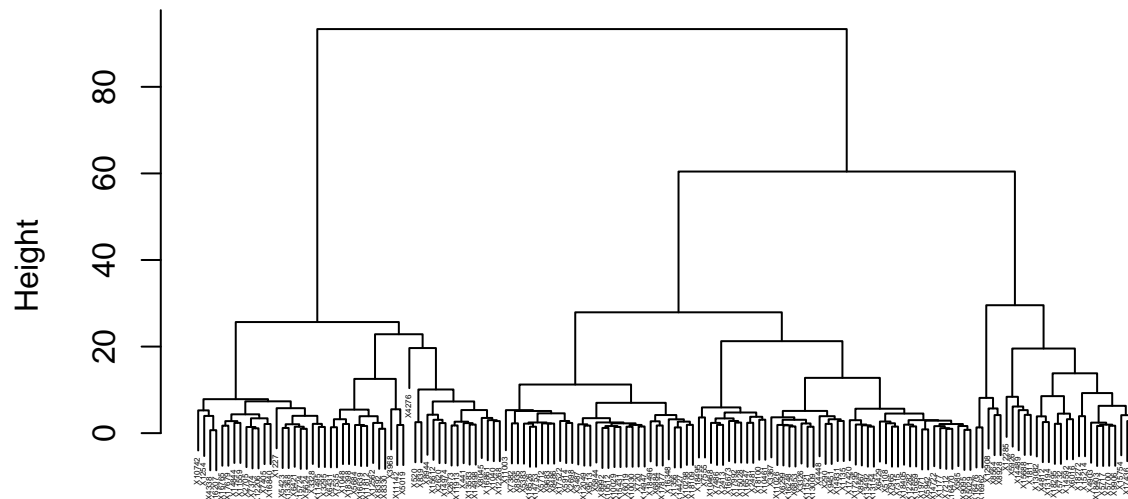
Cluster Dendrogram



D
hclust (*, "complete")

```
gene_clust = hclust(d = D, method="ward.D2")
plot(gene_clust, cex=0.25)
```

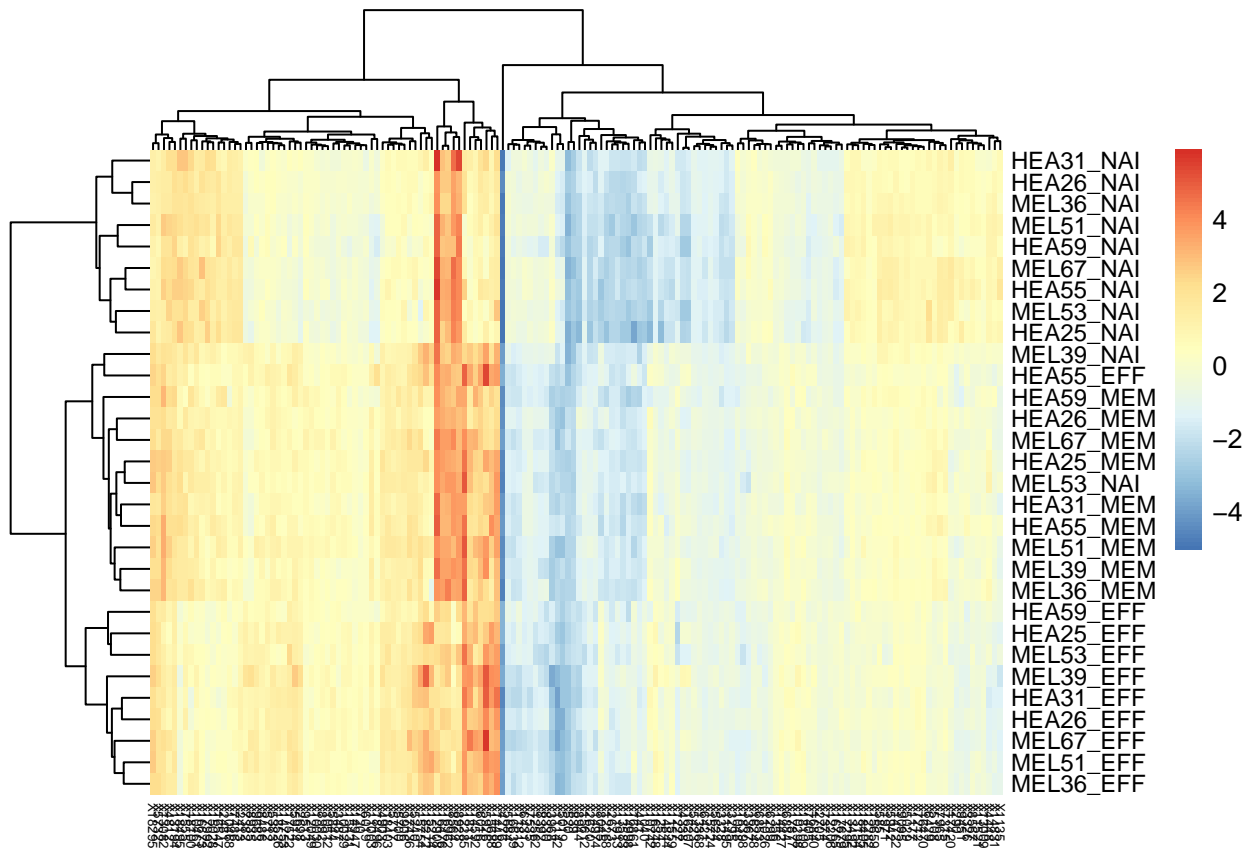
Cluster Dendrogram



D
hclust (*, "ward.D2")

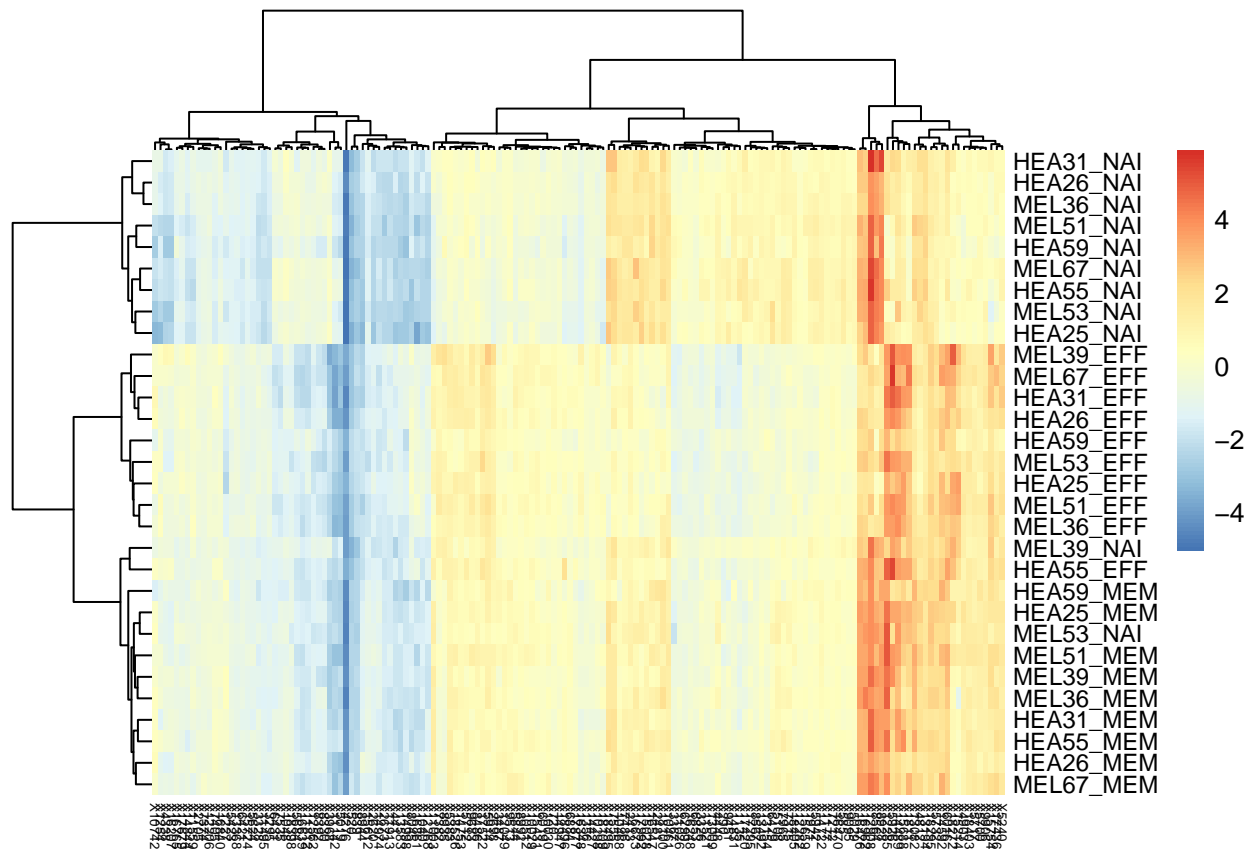
```
#BiocManager::install("pheatmap")
```

```
library("pheatmap")
pheatmap(Morder, fontsize_col = 5, fontsize_row = 9)
```



```
?pheatmap
```

```
pheatmap(Morder, fontsize_col = 5, fontsize_row = 9, clustering_method="ward.D2")
```



```
library('tidyverse')
```

```
cc_data=read.csv("../SCR3_new_data_SP.csv",fileEncoding="UTF-8-BOM")
d = cc_data
d1= filter(d,f2=="Medio_lateral")
d1$type=rep("MU",length(d1$x))
d1$type[d1$f1 %in% "WT"] = "WT"
e <- ggplot(data = d1, aes(x = f1, y = x,color=type))+
  stat_boxplot(geom = 'errorbar',position = position_dodge(0.85), width=0.5)
```

```
mx = c(0,0,0,1,1,1)
my = c(1,0,1,1,0,1)
mz = c(1,1,1,0,1,1)
```

```
mat = rbind(mx, my, mz)
dist(mat)
```

```
##          mx          my
## my 1.732051
## mz 2.000000 1.732051
```

```
d1= filter(d,f2=="Medio_lateral") d1$type = rep("MU",length(d1$x)) d1$type[d1$f1 %in% "WT"] = "WT"
e <- ggplot(data = d1, aes(x = f1, y = x,color=type))+ stat_boxplot(geom = 'errorbar',position = position_dodge(0.85), width=0.5)
```

```
```r
mx = c(0,0,0,1,1,1)
```

```
my = c(1,0,1,1,0,1)
mz = c(1,1,1,0,1,1)

mat = rbind(mx, my, mz)
dist(mat)

mx my
my 1.732051
mz 2.000000 1.732051
```