

ALL pfMCA QC

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```
setwd("/Users/vh3/Documents/PfMCA/ANALYSIS_2")
require("Matrix")
library(scater, quietly = TRUE)
require("SingleCellExperiment")
options(stringsAsFactors = FALSE)
library(plotly)
library(scran)
library(devtools)
```

```
molecules <- read.table("/Users/vh3/Documents/PfMCA/expression_matrices/pfMCA_counts_20200516.csv", head=1, sep=";", as.is=TRUE)
anno <- read.delim("/Users/vh3/Documents/PfMCA/expression_matrices/pfMCA_pheno.csv", header = TRUE, sep=";")
```

```
anno <- anno[match(colnames(molecules), anno$xfilename), ]
```

```
mca <- SingleCellExperiment(assays = list(
  counts = as.matrix(molecules),
  logcounts = log2(as.matrix(molecules) + 1)
), colData = anno)
```

Calculate QC metrics for cells and gene, remove failed spz run

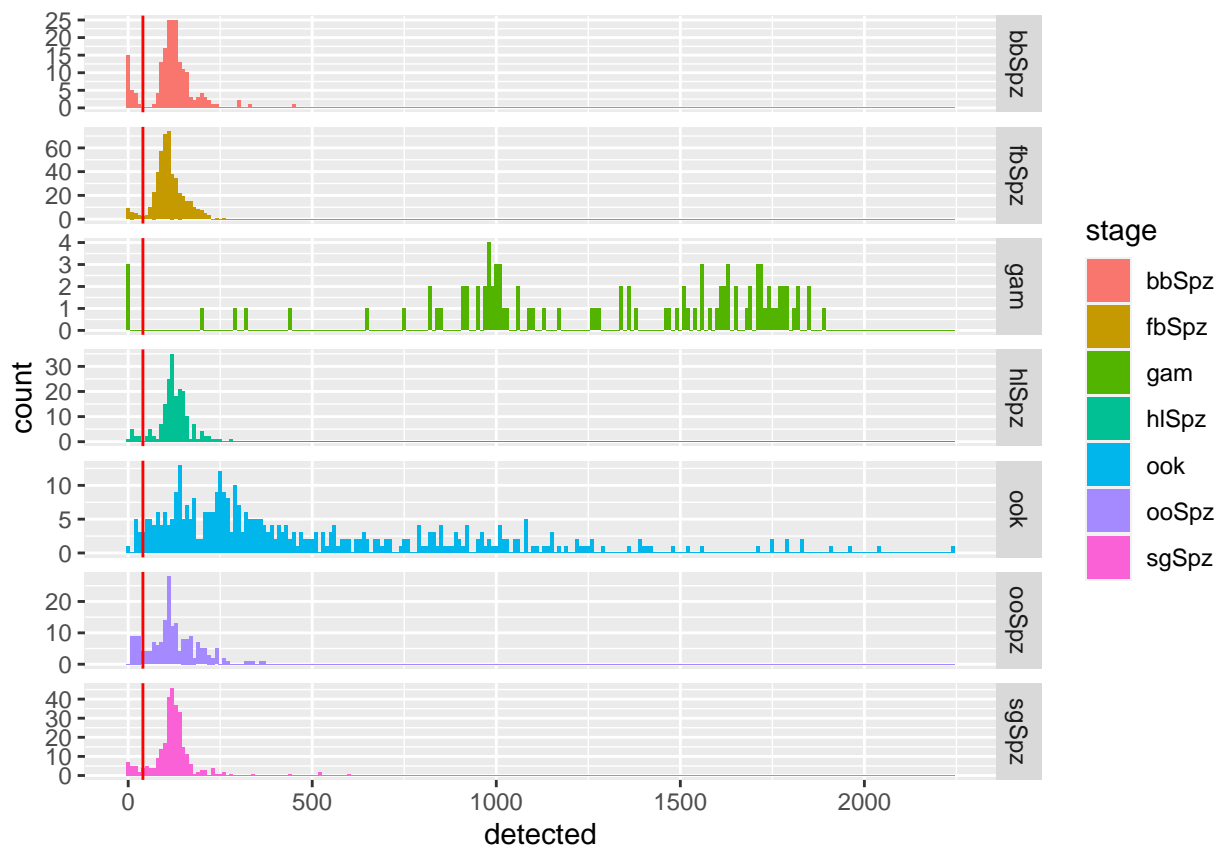
```
CellQC <- perCellQCMetrics(mca)
FeatQC <- perFeatureQCMetrics(mca)

colData(mca) <- cbind(colData(mca), CellQC)
rowData(mca) <- cbind(rowData(mca), FeatQC)

mca <- mca[, mca$stage != "spz"]
mca <- mca[, mca$stage != "mozSpz"]
mca <- mca[, mca$stage != "ffeSpz"]
```

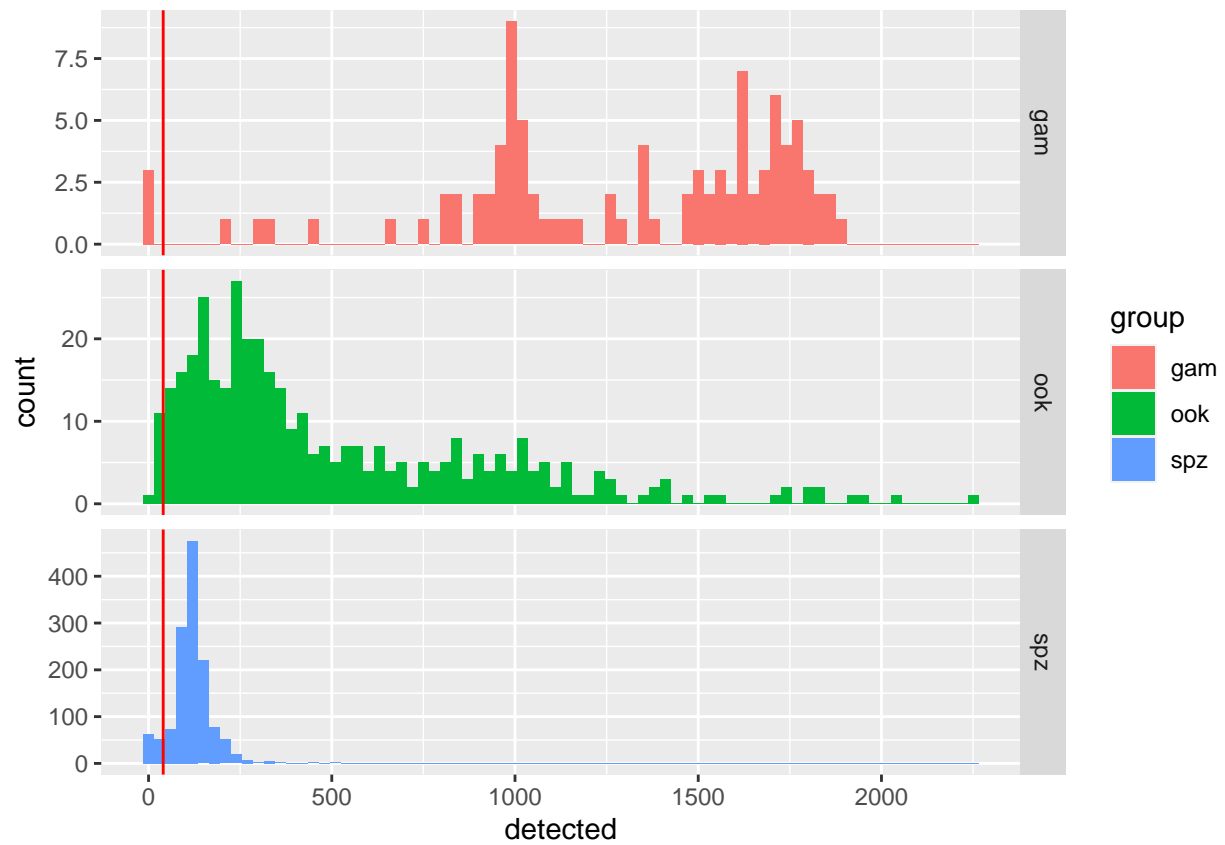
QC by stage

```
tab <- as.data.frame(colData(mca))
ggplot(tab, aes(x=detected, fill = stage)) + geom_histogram(binwidth = 10) + facet_grid(stage~., scales="y")
```

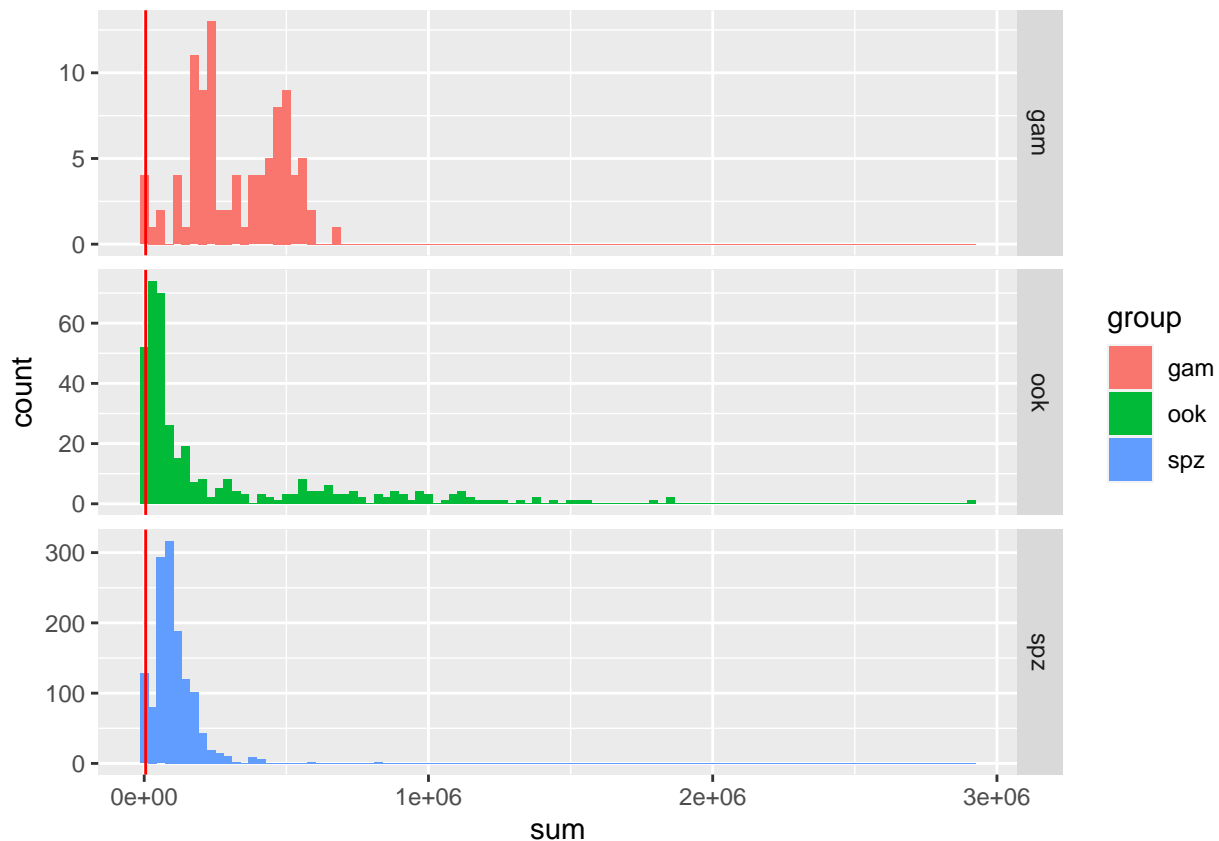


```
mca$group <- rep("spz", length(mca$sample_id))
mca[, which(mca$stage=="gam")]$group <- "gam"
mca[, which(mca$stage=="ook")]$group <- "ook"

tab <- as.data.frame(colData(mca))
ggplot(tab, aes(x=detected, fill = group)) + geom_histogram(binwidth = 30) + facet_grid(group~., scales="y")
```



```
tab <- as.data.frame(colData(mca))
ggplot(tab, aes(x=sum, fill = group)) + geom_histogram(bins=100) + facet_grid(group~., scales="free") +
```



QC of single cells based on Txnal profile

```
mca <- mca[, mca$num_cells=="SC"]

mcasmall <- mca[, colData(mca)$group == "spz"]
mcamedium <- mca[, colData(mca)$group == "ook" ]
mcalarge <- mca[, colData(mca)$group == "gam" ]

#QC of gams

filter_by_total_counts <- (mcalarge$sum > 10000)
table(filter_by_total_counts)

## filter_by_total_counts
## FALSE TRUE
##      4    91

# Filter cells with low numbers of features detected
filter_by_expr_features <- (mcalarge$detected > 500)
table(filter_by_expr_features)

## filter_by_expr_features
## FALSE TRUE
##      7    88

mcalarge$use <- (filter_by_expr_features & filter_by_total_counts)
table(mcalarge$use)

##
```

```

## FALSE TRUE
##      7    88
#QC of ookinetes

# Filter cells with low counts
filter_by_total_counts <- (mcamedium$sum > 5000)
table(filter_by_total_counts)

## filter_by_total_counts
## FALSE TRUE
##     17   366
# Filter cells with low numbers of features detected
filter_by_expr_features <- (mcamedium$detected > 400)
table(filter_by_expr_features)

## filter_by_expr_features
## FALSE TRUE
##    218   165
mcamedium$use <- (filter_by_expr_features & filter_by_total_counts)
table(mcamedium$use)

##
## FALSE TRUE
##    218   165
##QC of Spz

# Filter cells with low counts
filter_by_total_counts <- (mcasmall$sum > 5000)
table(filter_by_total_counts)

## filter_by_total_counts
## FALSE TRUE
##     95  1235
# Filter cells with low numbers of features detected
filter_by_expr_features <- (mcasmall$detected > 40)
table(filter_by_expr_features)

## filter_by_expr_features
## FALSE TRUE
##    102  1228
mcasmall$use <- (filter_by_expr_features & filter_by_total_counts)
table(mcasmall$use)

##
## FALSE TRUE
##    116  1214
mca <- cbind(mcasmall, mcamedium)
mca <- cbind(mca, mcalarge)
table(mca$use, mca$group)

##
##           gam  ook  spz
## FALSE      7  218  116

```

```

##      TRUE      88  165 1214
#make QCed SingleCellExperiment
mca.qc.cells <- mca[, colData(mca)$use]
meds <- tapply(colData(mca.qc.cells)$detected, colData(mca.qc.cells)$group, median)
meds

##      gam      ook      spz
## 1496.5  829.0  119.0
# Gene filtering
filter_genes <- apply(counts(mca[, colData(mca)$use]), 1, function(x) length(x[x >= 1]) >= 2)

table(filter_genes)

## filter_genes
## FALSE  TRUE
##    730  5058

rowData(mca)$use <- filter_genes

dim(mca[rowData(mca)$use, colData(mca)$use])

## [1] 5058 1467

assay(mca, "logcounts_raw") <- log2(counts(mca) + 1)
reducedDim(mca) <- NULL

mca.qc <- mca[rowData(mca)$use, colData(mca)$use]

clusters <- quickCluster(mca.qc)
mca.qc <- computeSumFactors(mca.qc, clusters=clusters, min.mean=1)

## Warning in FUN(...): encountered negative size factor estimates
## Warning in FUN(...): encountered negative size factor estimates
## Warning in FUN(...): encountered negative size factor estimates
## Warning in FUN(...): encountered negative size factor estimates

summary(sizeFactors(mca.qc))

##      Min.  1st Qu.  Median    Mean 3rd Qu.    Max.
## 0.00004  0.00363  0.00822  1.00000  0.02965 35.23496

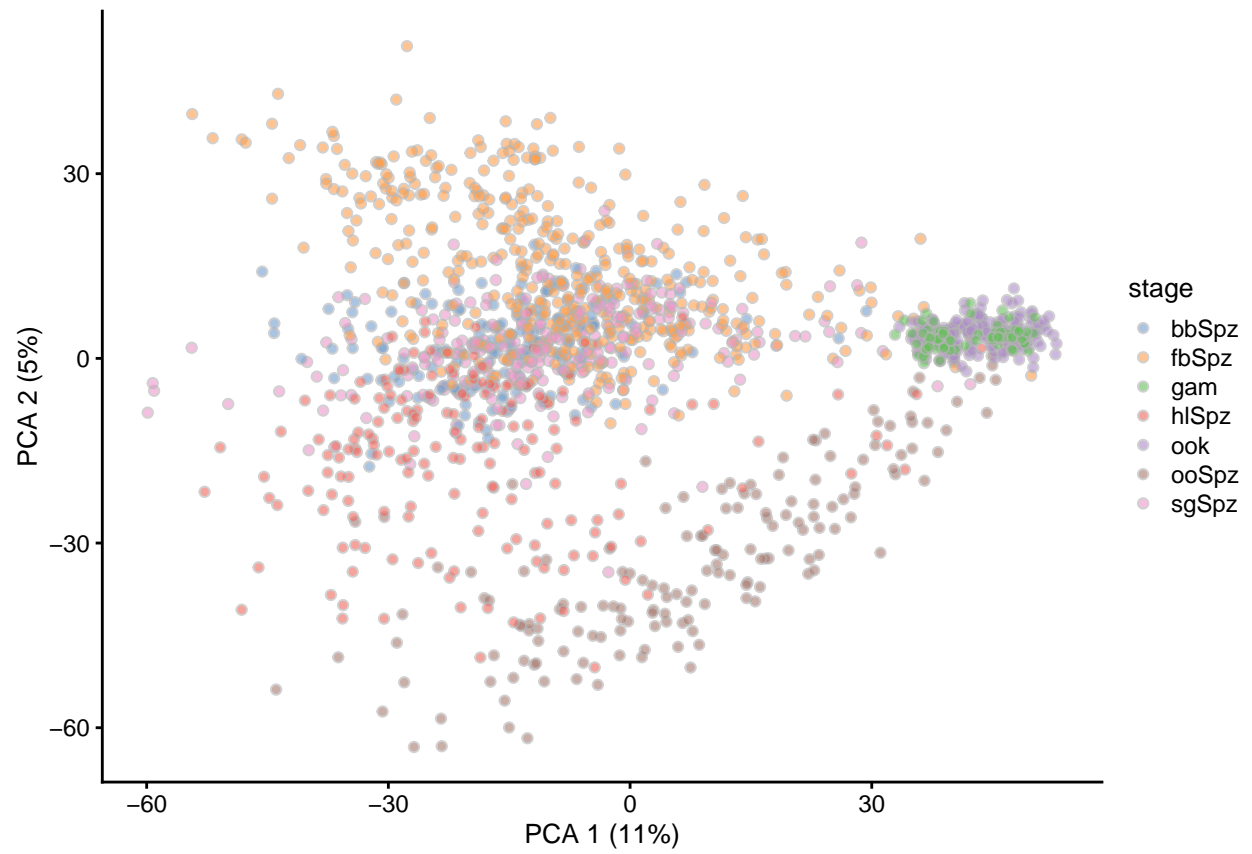
mca.qc <- logNormCounts(mca.qc, log=FALSE, size_factors=sizeFactors(mca.qc))
mca.qc <- logNormCounts(mca.qc, log=TRUE, size_factors=sizeFactors(mca.qc))

cpm(mca.qc) <- calculateCPM(mca.qc) #divide each column by its total and multiple by 1 million
assay(mca.qc, "log_cpm") <- log2(calculateCPM(mca.qc) + 1)

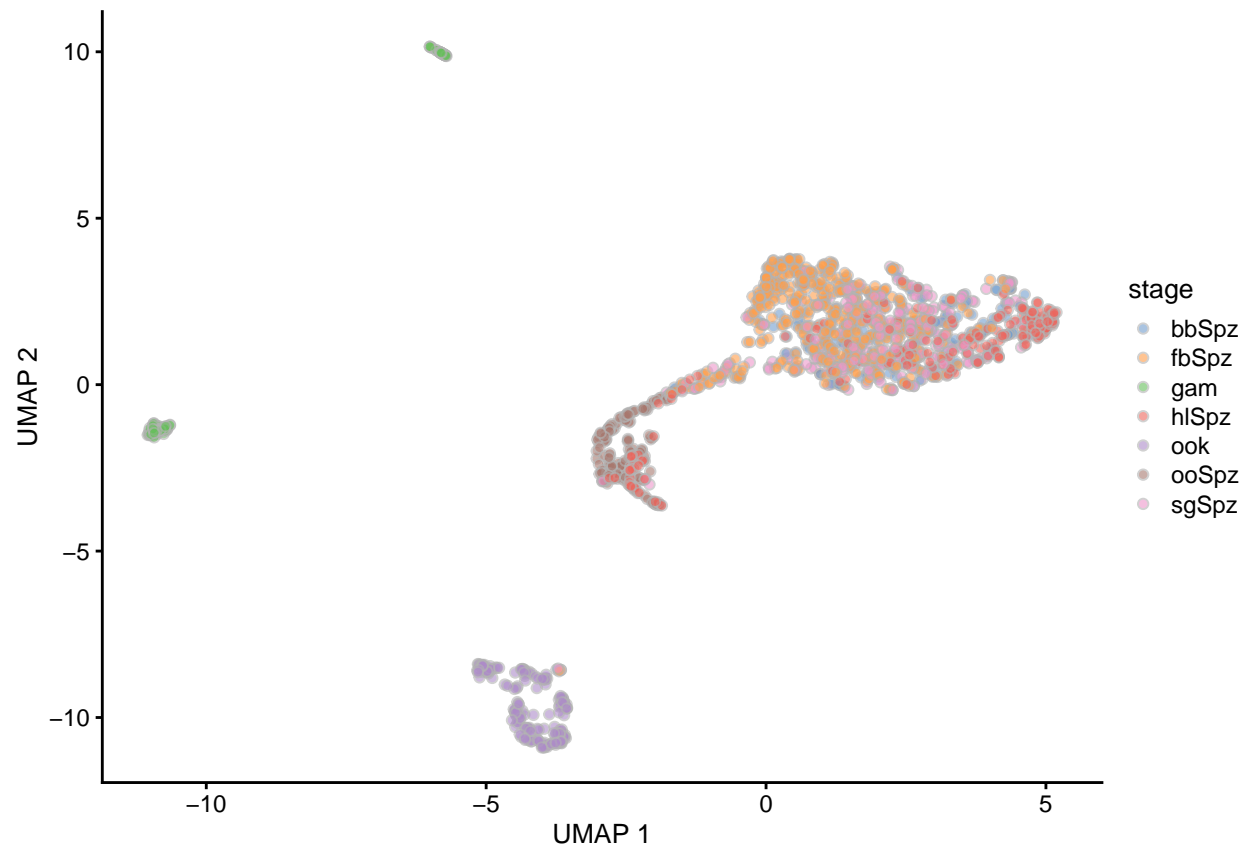
mca.qc <- runPCA(mca.qc, ntop=150)
set.seed(112)
mca.qc <- runUMAP(mca.qc, ntop=150, n_neighbors = 5)
set.seed(666)
mca.qc <- runTSNE(mca.qc, ntop = 150)

```

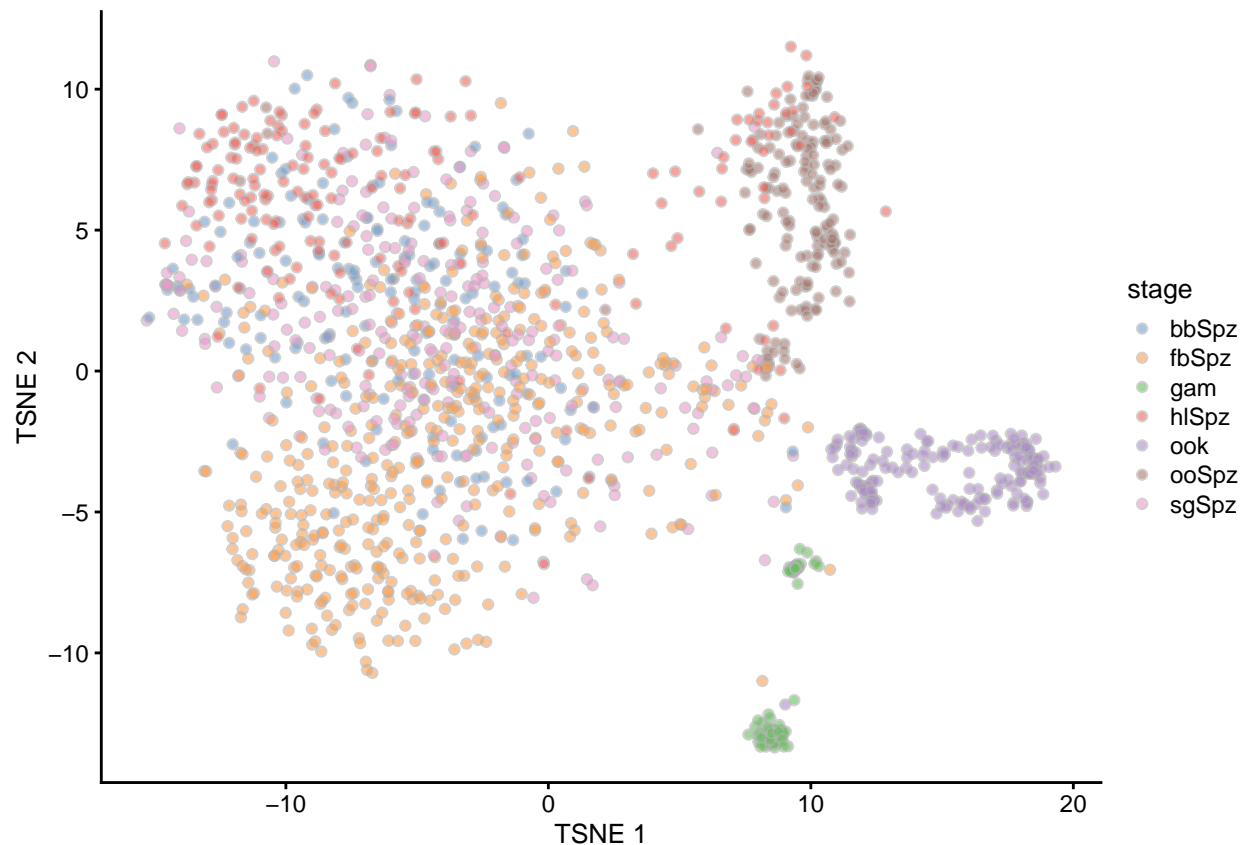
```
plotPCA(mca.qc, colour_by = "stage")
```



```
plotUMAP(mca.qc, colour_by = "stage")
```



```
plotTSNE(mca.qc, colour_by = "stage")
```

```
mca.qc
```

```
## class: SingleCellExperiment
## dim: 5058 1467
## metadata(0):
## assays(6): counts logcounts ... cpm log_cpm
## rownames(5058): PF3D7_0100100.1 PF3D7_0100300.1 ... mal_rna_18:rRNA
##   mal_rna_19:rRNA
## rowData names(3): mean detected use
## colnames(1467): X32706_8_5_sorted.bam X32706_8_6_sorted.bam ...
##   X31032_1_94_sorted.bam X31032_1_98_sorted.bam
## colData names(29): npgnum tag ... use sizeFactor
## reducedDimNames(3): PCA UMAP TSNE
## altExpNames(0):
```

```
assays(mca.qc)
```

```
## List of length 6
## names(6): counts logcounts logcounts_raw normcounts cpm log_cpm
## saveRDS(mca.qc, file = "pf.mca.qc_20200525.rds")
```

```
session_info()
```

```
## - Session info -----
## setting value
## version R version 4.0.0 (2020-04-24)
## os      macOS Mojave 10.14.6
## system  x86_64, darwin17.0
```

```

## ui      X11
## language (EN)
## collate en_GB.UTF-8
## ctype   en_GB.UTF-8
## tz      Europe/London
## date    2020-10-13
##
## - Packages -----
## package      * version  date    lib source
## assertthat   0.2.1    2019-03-21 [1] CRAN (R 4.0.0)
## backports    1.1.7    2020-05-13 [1] CRAN (R 4.0.0)
## beeswarm     0.2.3    2016-04-25 [1] CRAN (R 4.0.0)
## Biobase      * 2.48.0   2020-04-27 [1] Bioconductor
## BiocGenerics * 0.34.0   2020-04-27 [1] Bioconductor
## BiocNeighbors 1.6.0    2020-04-27 [1] Bioconductor
## BiocParallel 1.22.0   2020-04-27 [1] Bioconductor
## BiocSingular 1.4.0    2020-04-27 [1] Bioconductor
## bitops       1.0-6    2013-08-17 [1] CRAN (R 4.0.0)
## callr        3.4.3    2020-03-28 [1] CRAN (R 4.0.0)
## cli          2.0.2    2020-02-28 [1] CRAN (R 4.0.0)
## colorspace   1.4-1    2019-03-18 [1] CRAN (R 4.0.0)
## cowplot      1.0.0    2019-07-11 [1] CRAN (R 4.0.0)
## crayon       1.3.4    2017-09-16 [1] CRAN (R 4.0.0)
## data.table   1.12.8   2019-12-09 [1] CRAN (R 4.0.0)
## DelayedArray * 0.14.0   2020-04-27 [1] Bioconductor
## DelayedMatrixStats 1.10.0   2020-04-27 [1] Bioconductor
## desc         1.2.0    2018-05-01 [1] CRAN (R 4.0.0)
## devtools     * 2.3.0    2020-04-10 [1] CRAN (R 4.0.0)
## digest       0.6.25   2020-02-23 [1] CRAN (R 4.0.0)
## dplyr        0.8.5    2020-03-07 [1] CRAN (R 4.0.0)
## dqrng        0.2.1    2019-05-17 [1] CRAN (R 4.0.0)
## edgeR        3.30.0   2020-04-27 [1] Bioconductor
## ellipsis     0.3.1    2020-05-15 [1] CRAN (R 4.0.0)
## evaluate     0.14     2019-05-28 [1] CRAN (R 4.0.0)
## fansi        0.4.1    2020-01-08 [1] CRAN (R 4.0.0)
## farver       2.0.3    2020-01-16 [1] CRAN (R 4.0.0)
## FNN          1.1.3    2019-02-15 [1] CRAN (R 4.0.0)
## fs           1.4.1    2020-04-04 [1] CRAN (R 4.0.0)
## GenomeInfoDb * 1.24.0   2020-04-27 [1] Bioconductor
## GenomeInfoDbData 1.2.3    2020-05-09 [1] Bioconductor
## GenomicRanges * 1.40.0   2020-04-27 [1] Bioconductor
## ggbeeswarm    0.6.0    2017-08-07 [1] CRAN (R 4.0.0)
## ggplot2      * 3.3.0    2020-03-05 [1] CRAN (R 4.0.0)
## glue         1.4.1    2020-05-13 [1] CRAN (R 4.0.0)
## gridExtra     2.3      2017-09-09 [1] CRAN (R 4.0.0)
## gtable        0.3.0    2019-03-25 [1] CRAN (R 4.0.0)
## htmltools     0.4.0    2019-10-04 [1] CRAN (R 4.0.0)
## htmlwidgets  1.5.1    2019-10-08 [1] CRAN (R 4.0.0)
## httr         1.4.1    2019-08-05 [1] CRAN (R 4.0.0)
## igraph        1.2.5    2020-03-19 [1] CRAN (R 4.0.0)
## IRanges      * 2.22.1   2020-04-28 [1] Bioconductor
## irlba         2.3.3    2019-02-05 [1] CRAN (R 4.0.0)
## jsonlite      1.6.1    2020-02-02 [1] CRAN (R 4.0.0)
## knitr        1.28     2020-02-06 [1] CRAN (R 4.0.0)

```

##	labeling	0.3	2014-08-23	[1]	CRAN	(R 4.0.0)
##	lattice	0.20-41	2020-04-02	[2]	CRAN	(R 4.0.0)
##	lazyeval	0.2.2	2019-03-15	[1]	CRAN	(R 4.0.0)
##	lifecycle	0.2.0	2020-03-06	[1]	CRAN	(R 4.0.0)
##	limma	3.44.1	2020-04-28	[1]	Bioconductor	
##	locfit	1.5-9.4	2020-03-25	[1]	CRAN	(R 4.0.0)
##	magrittr	1.5	2014-11-22	[1]	CRAN	(R 4.0.0)
##	Matrix	* 1.2-18	2019-11-27	[2]	CRAN	(R 4.0.0)
##	matrixStats	* 0.56.0	2020-03-13	[1]	CRAN	(R 4.0.0)
##	memoise	1.1.0	2017-04-21	[1]	CRAN	(R 4.0.0)
##	munsell	0.5.0	2018-06-12	[1]	CRAN	(R 4.0.0)
##	pillar	1.4.4	2020-05-05	[1]	CRAN	(R 4.0.0)
##	pkgbuild	1.0.8	2020-05-07	[1]	CRAN	(R 4.0.0)
##	pkgconfig	2.0.3	2019-09-22	[1]	CRAN	(R 4.0.0)
##	pkgload	1.0.2	2018-10-29	[1]	CRAN	(R 4.0.0)
##	plotly	* 4.9.2.1	2020-04-04	[1]	CRAN	(R 4.0.0)
##	prettyunits	1.1.1	2020-01-24	[1]	CRAN	(R 4.0.0)
##	processx	3.4.2	2020-02-09	[1]	CRAN	(R 4.0.0)
##	ps	1.3.3	2020-05-08	[1]	CRAN	(R 4.0.0)
##	purrr	0.3.4	2020-04-17	[1]	CRAN	(R 4.0.0)
##	R6	2.4.1	2019-11-12	[1]	CRAN	(R 4.0.0)
##	Rcpp	1.0.4.6	2020-04-09	[1]	CRAN	(R 4.0.0)
##	RCurl	1.98-1.2	2020-04-18	[1]	CRAN	(R 4.0.0)
##	remotes	2.1.1	2020-02-15	[1]	CRAN	(R 4.0.0)
##	rlang	0.4.6	2020-05-02	[1]	CRAN	(R 4.0.0)
##	rmarkdown	2.1	2020-01-20	[1]	CRAN	(R 4.0.0)
##	rprojroot	1.3-2	2018-01-03	[1]	CRAN	(R 4.0.0)
##	RSpectra	0.16-0	2019-12-01	[1]	CRAN	(R 4.0.0)
##	rsvd	1.0.3	2020-02-17	[1]	CRAN	(R 4.0.0)
##	Rtsne	0.15	2018-11-10	[1]	CRAN	(R 4.0.0)
##	S4Vectors	* 0.26.1	2020-05-16	[1]	Bioconductor	
##	scales	1.1.1	2020-05-11	[1]	CRAN	(R 4.0.0)
##	scater	* 1.16.0	2020-04-27	[1]	Bioconductor	
##	scan	* 1.16.0	2020-04-27	[1]	Bioconductor	
##	sessioninfo	1.1.1	2018-11-05	[1]	CRAN	(R 4.0.0)
##	SingleCellExperiment	* 1.10.1	2020-04-28	[1]	Bioconductor	
##	statmod	1.4.34	2020-02-17	[1]	CRAN	(R 4.0.0)
##	stringi	1.4.6	2020-02-17	[1]	CRAN	(R 4.0.0)
##	stringr	1.4.0	2019-02-10	[1]	CRAN	(R 4.0.0)
##	SummarizedExperiment	* 1.18.1	2020-04-30	[1]	Bioconductor	
##	testthat	2.3.2	2020-03-02	[1]	CRAN	(R 4.0.0)
##	tibble	3.0.1	2020-04-20	[1]	CRAN	(R 4.0.0)
##	tidyr	1.1.0	2020-05-20	[1]	CRAN	(R 4.0.0)
##	tidyselect	1.1.0	2020-05-11	[1]	CRAN	(R 4.0.0)
##	usethis	* 1.6.1	2020-04-29	[1]	CRAN	(R 4.0.0)
##	uwot	0.1.8	2020-03-16	[1]	CRAN	(R 4.0.0)
##	vctrs	0.3.0	2020-05-11	[1]	CRAN	(R 4.0.0)
##	vipor	0.4.5	2017-03-22	[1]	CRAN	(R 4.0.0)
##	viridis	0.5.1	2018-03-29	[1]	CRAN	(R 4.0.0)
##	viridisLite	0.3.0	2018-02-01	[1]	CRAN	(R 4.0.0)
##	withr	2.2.0	2020-04-20	[1]	CRAN	(R 4.0.0)
##	xfun	0.14	2020-05-20	[1]	CRAN	(R 4.0.0)
##	XVector	0.28.0	2020-04-27	[1]	Bioconductor	
##	yaml	2.2.1	2020-02-01	[1]	CRAN	(R 4.0.0)

```
## zlibbioc          1.34.0    2020-04-27 [1] Bioconductor
##
## [1] /Users/vh3/Library/R/4.0/library
## [2] /Library/Frameworks/R.framework/Versions/4.0/Resources/library
```