Package CompSign

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CompSign is a toolkit for the analysis of mutational signatures with an emphasis on the compositional analysis of exposures. An overview of the compositional nature of the exposures to mutational signatures, which has been often overlooked, is found elsewhere¹.

1 Installation

CompSign can be installed as usual from github:

```
library(devtools)
devtools::install_github("lm687/CompSign")
```

<pre>library(CompSign)</pre>	
<pre>library(compositions)</pre>	

 $^{^{1}\}mathrm{cite\ myself}$

2 Datasets

```
## if the folder data/ is not in github
for(i in list.files("../data/", pattern = "*rda", full.names = TRUE)){load(i)}
```

The package contains several datasets of exposures to mutational signatures and metadata of the corresponding samples. These datasets are:

- SNV signatures
 - Data for 560 breast cancer patients

```
# data("Breast560")
dim(metadata(Breast560))
## [1] 560 47
dim(count_matrix(Breast560))
## [1] 560 12
```

- Pan-cancer from EMu[2] (cite dataset)
- Copy Number signatures
 - Ovarian cancer-derived signatures, as described in [3]. It contains data for 12k TCGA samples.

```
#data("CNA_12K_TCGA")
dim(metadata(CNA_12K_TCGA))

## [1] 10899 37
dim(count_matrix(CNA_12K_TCGA))

## [1] 10899 7
```

- Pan-cancer copy number signatures
- Synthetic data

Data can be visualised as follows add this to the functions of the package

```
source("../CDA_in_Cancer/code/functions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/prettySignatures.R", predictions/meretricious/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/pretty_plots/p
createBarplot(count_matrix(Breast560), remove_labels = TRUE,
                                                                                             order = names(sort(count_matrix(Breast560)[,1])))
## Creating plot... it might take some time if the data are large. Number of samples: 560
                                                                                                                                                                                                                                                                                                                                                                                                                 Signature.∠
                                    1.00
                                                                                                                                                                                                                                                                                                                                                                                                                  Signature.3
                                                                                                                                                                                                                                                                                                                                                                                                                  Signature.5
                                   0.75
                                                                                                                                                                                                                                                                                                                                                                                                                 Signature.6
                                                                                                                                                                                                                                                                                                                                                                                                                 Signature.8
                                   0.50
                                                                                                                                                                                                                                                                                                                                                                                                                  Signature.13
                                   0.25
                                                                                                                                                                                                                                                                                                                                                                                                                 Signature.17
                                                                                                                                                                                                                                                                                                                                                                                                                   Signature.18
```

Signature.20

3 Create a CompSign object

This is a minimal example for transforming a matrix into a sign object

```
basic_matrix <- matrix(runif(12), nrow = 4)</pre>
colnames(basic_matrix) <- paste0('s', 1:3)</pre>
rownames(basic_matrix) <- paste0('Sample ', 1:4)</pre>
basic_sign <- to_sign(basic_matrix)</pre>
basic_sign
## An object of class "sign"
## Slot "id":
## [1] "basic_matrix"
##
## Slot "id_samples":
## [1] "Sample 1" "Sample 2" "Sample 3" "Sample 4"
##
## Slot "id_signatures":
## [1] "s1" "s2" "s3"
##
## Slot "count_matrix":
##
                      s1
                                 s2
## Sample 1 0.300802582 0.2539395 0.7916191
## Sample 2 0.007940389 0.1755893 0.9641138
## Sample 3 0.977974179 0.2364882 0.6105332
## Sample 4 0.776641885 0.9092960 0.8120827
##
## Slot "modified":
## [1] FALSE
```

A sign object can be summarised as follows: add_together_matrix?? what is this?

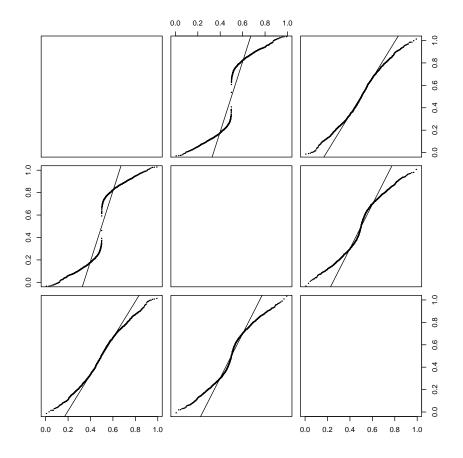
```
results_sumarise <- summarise(add_together_matrix(basic_sign))</pre>
results_sumarise
## $General
## [1] "Object of class sign"
## $`Number of signatures`
## [1] 3
##
## $`Number of samples`
## [1] 4
##
## $`Geometric means of signatures`
## s3 s2 s1
## 0.7843114 0.3129218 0.2063801
##
## $Covariance
   s1 s2
##
## s1 0.19526291 0.0675491810 -0.0553196690
## s2 0.06754918 0.1192200062 0.0004651162
## s3 -0.05531967 0.0004651162 0.0209766812
```

4 Battery of tests

This section takes largely from Aitchison's pioneering work[1] and its succession[4].

4.1 Test for normality

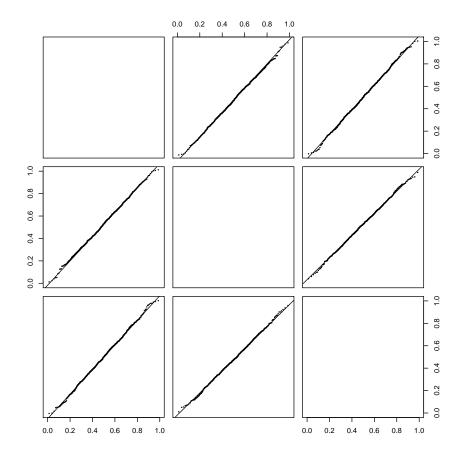
```
par(mfrow=c(1,2))
qqnorm.acomp(acomp(two_normal_pops@count_matrix), pch=19, cex=0.2)
```



```
qqnorm.acomp(acomp(two_normal_pops@count_matrix[1:1000,]), pch=19, cex=0.2, plot.it=FALSE)
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
```

```
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
```

```
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy.coords(x, y), type = type, ...): "plot.it"
is not a graphical parameter
## Warning in plot.window(...): "plot.it" is not a graphical parameter
## Warning in plot.xy(xy, type, ...): "plot.it" is not a graphical
parameter
## Warning in title(...): "plot.it" is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
## Warning in axis(side = side, at = at, labels = labels, ...): "plot.it"
is not a graphical parameter
```



4.2 Test for equality

Test for equality of means.

```
compare_populations(predictors = count_matrix(Breast560),
                    response = as.numeric(as.factor(metadata(Breast560)$final.ER)))
## $note
## [1] "James test"
##
## $mesoi
##
                    X1
                               X2
                                        ХЗ
                                                     X4
                                                                Х5
                                                                         X6
## Sample 1 -1.6969917 -0.9470633 1.923296 -0.103998542 0.2707288 1.528197
## Sample 2 0.8022291 -3.6033765 2.143807
                                            0.002721535 0.6369184 1.607875
##
                                    Х9
                  X7
                           X8
                                            X10
## Sample 1 1.271388 1.248926 1.016479 1.017358
## Sample 2 1.086473 1.283400 1.083742 1.048809
##
## $info
##
                                 p-value
                                                 correction
                 test
##
         2.359067e+02
                            5.324172e-43
                                               1.042820e+00
## corrected.critical
   1.909095e+01
```

References

- [1] John Aitchison. "The statistical analysis of compositional data". In: Journal of the Royal Statistical Society. Series B (Methodological) (1982), pp. 139–177.
- [2] Andrej Fischer, Christopher JR Illingworth, Peter J Campbell, and Ville Mustonen. "EMu: probabilistic inference of mutational processes and their localization in the cancer genome". In: *Genome biology* 14.4 (2013), R39.
- [3] Geoff Macintyre, Teodora E Goranova, Dilrini De Silva, Darren Ennis, Anna M Piskorz, Matthew Eldridge, Daoud Sie, Liz-Anne Lewsley, Aishah Hanif, Cheryl Wilson, et al. "Copy number signatures and mutational processes in ovarian carcinoma". In: *Nature genetics* (2018), p. 1.
- [4] Vera Pawlowsky-Glahn, Juan José Egozcue, and Raimon Tolosana-Delgado. *Modeling and analysis of compositional data*. John Wiley & Sons, 2015.

5 Session info

```
sessionInfo()
## R version 3.5.1 (2018-07-02)
## Platform: x86_64-apple-darwin15.6.0 (64-bit)
## Running under: macOS 10.14.4
##
## Matrix products: default
## BLAS: /Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRblas.0.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/3.5/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_GB.UTF-8/en_GB.UTF-8/en_GB.UTF-8/C/en_GB.UTF-8/en_GB.UTF-8
## attached base packages:
## [1] stats
                 graphics grDevices utils
                                               datasets methods
                                                                    base
##
## other attached packages:
## [1] Compositional_3.4
                            RColorBrewer_1.1-2 reshape2_1.4.3
## [4] ggthemr_1.1.0
                            ggplot2_3.1.1
                                                MCMCpack_1.4-4
## [7] MASS_7.3-51.1
                            coda_0.19-2
                                                compositions_1.40-2
## [10] bayesm_3.1-1
                            energy_1.7-5
                                                robustbase_0.93-4
## [13] tensorA_0.36.1
                            CompSign_0.1.0
                                                knitr_1.22
##
## loaded via a namespace (and not attached):
## [1] Rcpp_1.0.1
                           lattice_0.20-38
                                              assertthat_0.2.1
                                              R6_2.4.0
## [4] digest_0.6.18
                           foreach_1.4.4
## [7] plyr_1.8.4
                           MatrixModels_0.4-1 RcppZiggurat_0.1.5
## [10] stats4_3.5.1
                           evaluate_0.13
                                              spam_2.2-2
                           pillar_1.3.1
## [13] highr_0.8
                                              rlang_0.3.4
## [16] lazyeval_0.2.2
                           SparseM_1.77
                                              Matrix_1.2-16
## [19] labeling_0.3
                           stringr_1.4.0
                                              emplik_1.0-4.3
## [22] munsell_0.5.0
                           compiler_3.5.1
                                              numDeriv_2016.8-1
## [25] xfun_0.5
                           pkgconfig_2.0.2
                                              mnormt_1.5-5
## [28] mcmc_0.9-6
                           tidyselect_0.2.5
                                              tibble_2.1.1
## [31] codetools_0.2-16 crayon_1.3.4
                                              dplyr_0.8.0.1
## [34] withr_2.1.2
                           grid_3.5.1
                                              gtable_0.3.0
## [37] magrittr_1.5
                           scales_1.0.0
                                              Rfast_1.9.3
## [40] stringi_1.4.3
                           sn_1.5-3
                                              doParallel_1.0.14
## [43] boot_1.3-20
                                              tools_3.5.1
                           iterators_1.0.10
## [46] glue_1.3.1
                           DEoptimR_1.0-8
                                              purrr_0.3.2
## [49] maps_3.3.0
                           fields_9.7
                                              parallel_3.5.1
## [52] mixture_1.5
                           colorspace_1.4-1
                                              dotCall64_1.0-0
## [55] quantreg_5.38
```