

**README related to the manuscript "A regularized MANOVA test for semicontinuous high-dimensional data", by Sabbioni E., Agostinelli C., Farcomeni A.**

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**Structure of the folder:** The main folder **Replicability** contains the following files:

- **Results:** folder with the results of the simulation study and of the simulated scenarios that mimic the real micro RNA dataset;
- **analyzeResults.R:** file used to merge together the results of the different Monte Carlo repetitions of the test on the simulated data;
- **functionsSim.R:** file that contains necessary functions to run the simulation study;
- **functionSim\_real.R:** file that contains necessary functions to run the test on the simulated scenarios that mimic the real micro RNA dataset;
- **main.R:** main file that performs the simulation study;
- **microRNA\_sim.R:** file used to perform the test on the simulated scenarios that mimic the real micro RNA dataset;
- **microRNA\_sim.RData:** it contains the sample parameters of the real micro RNA dataset;
- **semicontMANOVA.0.1-4.tar-gz:** semicontMANOVA package;
- **table1.R:** file used to produce Table 1 of the manuscript;
- **table2.R:** file used to produce Table 2 of the manuscript;

**Simulation study** [**"main.R"**]: The results of the simulation study can be reproduced running the file **"main.R"**. The directory is automatically set to the current working directory. The necessary packages are **"semicontMANOVA"** (available for the installation as tar.gz file in the **"Replicability"** folder) and **"parallel"**. This file load automatically also the necessary functions for the simulation (**"functionSim.R"**).

The simulations were run in parallel on a cluster to reduce the time. It is possible to set the number of available cpus through the parameters **ncpus** and **mc.cores**. If there is no possibility to parallelize the code, set **ncpus = 1** and **mc.cores = 1**.

The output of the simulation study is stored in a new folder, called **"Results"**. Different folders are created in it:

- **H0:** storing the results for the simulations under the null hypothesis;
- **H1\_1 – 1:** storing the results for the simulations under the alternative hypothesis with  $c_1 = 1$ ,  $c_2 = 0$ ;
- **H1\_1 – 5:** storing the results for the simulations under the alternative hypothesis with  $c_1 = 5$ ,  $c_2 = 0$ ;
- **H1\_2 – 0.15:** storing the results for the simulations under the alternative hypothesis with  $c_1 = 0$ ,  $c_2 = 0.15$ ;

- H1\_2 – 0.3 : storing the results for the simulations under the alternative hypothesis with  $c_1 = 0$ ,  $c_2 = 0.30$ ;

In each of these folders, there are different files for the different scenarios of  $n$ ,  $p$ ,  $\pi_{j1}$  and  $\rho$  that have been explored. Each file contains a row for each Monte Carlo repetition, storing:

- the index of the repetition (used to set the seed);
- the time taken to run the test (5 entrances, it can be different if the code runs on a different computer);
- results of the test:
  - log-likelihood under no hypothesis  $l^\lambda$ ,
  - log-likelihood under the null hypothesis  $l^{\lambda_0}$ ,
  - selected value of regularization parameter under no hypothesis  $\hat{\lambda}$ ,
  - selected value of regularization parameter under the null hypothesis  $\hat{\lambda}_0$ ,
  - model complexity measure under no hypothesis,
  - model complexity measure under the null hypothesis,
  - Information criteria under no hypothesis  $M(\hat{\lambda}, \hat{\pi}, \hat{\mu}, \hat{\Sigma})$ ,
  - Information criteria under the null hypothesis  $M(\hat{\lambda}_0, \hat{\pi}_0, \hat{\mu}_0, \hat{\Sigma}_0)$ ,
  - test statistic  $D^{\hat{\lambda}, \hat{\lambda}_0}$ ,
  - p-value of the permutation test,
  - final number of components  $p^*$ ,
  - final number of components under  $H_0$  (it is equal to  $p^*$ ).

**Tables** [`"table1.R"`]: Table 1 shows the proportion of rejections of the simulated study. To obtain it, run file `"table1.R"`. Table 2 shows the mean number of components  $p^*$  and the mean values of  $\hat{\lambda}$  and  $\hat{\lambda}_0$ . To obtain it, run file `"table2.R"`. Both the files require package `"xtable"`.

**Real data** [`microRNA_sim.R`]: The real data used for the two applications are confidential and can not be shared. Hence we have simulated two scenarios based on the real dataset with RNA differential expression in blastocyst cultures. The sample mean, the sample variance and covariance matrix and the probability of a missing values of the real dataset, both under the null hypothesis and under the alternative hypothesis, are contained in `"microRNA_sim.RData"`. These scenarios are described in Section 3 of the manuscript and the test in these cases can be obtained running the file `"microRNA_sim.R"`. This file requires the packages `"semicontMANOVA"` and `"parallel"`.

### Session info

```
> sessionInfo()
R version 4.1.2 (2021-11-01)
Platform: x86_64-pc-linux-gnu (64-bit)
Running under: CentOS Linux 7 (Core)
```

Matrix products: **default**

BLAS: /usr/lib64/libblas.so.3.4.2

LAPACK: /usr/lib64/liblapack.so.3.4.2

locale:

```
[1] LC_CTYPE=en_US.UTF-8      LC_NUMERIC=C
[3] LC_TIME=en_US.UTF-8      LC_COLLATE=en_US.UTF-8
[5] LC_MONETARY=en_US.UTF-8  LC_MESSAGES=en_US.UTF-8
[7] LC_PAPER=en_US.UTF-8     LC_NAME=C
[9] LC_ADDRESS=C             LC_TELEPHONE=C
[11] LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
```

attached base **packages**:

```
[1] parallel stats      graphics grDevices utils      datasets methods
[8] base
```

other attached **packages**:

```
[1] semicontMANOVA_0.1-4
```

loaded via a namespace (and not attached):

```
[1] compiler_4.1.2  mvtnorm_1.1-3    matrixcalc_1.0-6
```