

# eQtlBma

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for version 1.2, 22 March 2013

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This manual is for eQtlBma (version 1.2, 22 March 2013), which implements Bayesian methods for eQTL detection.

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# 1 Overview

In genetics, “QTL” stands for quantitative trait locus. It corresponds to a genotype-phenotype relationship in which variation in the genotype is associated with variation in the phenotype. For the moment, this package focuses on the case where genotypes come from single nucleotide polymorphisms (SNP) and phenotypes are gene expression levels, thus explaining the “e” in “eQTL”.

This package provides implementations of Bayesian methods with two goals in mind:

- to detect eQTLs;
- to interpret them.

The implemented methods allow to jointly analyse data sets from multiple subgroups. Here subgroups can be different tissues, cell types, populations, platforms, etc. Currently two tools are available:

- `eqtlbma` can compute summary statistics in each subgroup, Bayes Factors for the joint analysis using default hyperparameters, as well as perform permutations;
- `hm` can fit the hierarchical model with the EM algorithm, provide Empirical Bayes estimates of hyperparameters and thus uses such estimates to re-compute Bayes Factors and provide posterior probabilities.

More details are available in a preprint on [arXiv](#).

## 2 Inputs and options

Typing `eqtlbma --help` or `eqtlbma -h` gives the list of options. As the help message is long, we may prefer to type `eqtlbma -h | less` instead.

### 2.1 Genotypes

The option ‘`-g`, `--geno`’ requires a file as argument. This file has two columns separated by a space or a tabulation, and one line per subgroup. The first column is the identifier of the subgroup. The second column is the path to the file containing the genotypes for this subgroup. Here is an example:

```
Fibroblasts /data/genotypes.vcf.gz
LCLs /data/genotypes.vcf.gz
T-cells /data/genotypes.vcf.gz
```

As you can see, the genotypes can all be in the same file, for instance if subgroups share some or all individuals.

If you want to skip one subgroup, simply add a hashtag at the beginning of the line, like this:

```
#Fibroblasts /data/genotypes.vcf.gz
```

The files containing the genotypes can be in three possible formats. Even though these formats can handle genetic variants other than SNPs, we focus here on SNPs. Moreover, for each format, the names of the individuals have to be indicated and they need to be the same as in the phenotype files (see next section).

The program `eqtlbma` recognizes the original VCF format. See the specifications on the website of the 1000 Genomes project [here](#).

The program `eqtlbma` can also handle a format very similar to the genotype format used by the IMPUTE program. The exact specification of this format is described [here](#). The only difference is that we require a header line. Here is an example:

```
chr name coord a1 a2 <ind1>_a1a1 <ind1>_a1a2 <ind1>_a2a2 <ind2>_a1a1 ...
```

where the “`<ind1>`”’s have to be replaced by the name of the individuals in the given data set.

Finally, the program `eqtlbma` also reads genotypes as allele dose, that is 0, 1, 2 or NA. This format is also read by the R package MatrixEQTL. Here is an example:

```
id ind1 ind2 ind3 ...
snp1 0 2 1 ...
snp2 0 NA 0 ...
...
```

The VCF and IMPUTE-like formats contain information about SNP coordinates, but not the allele-dose format. Therefore, with the latter, we also need to use the option ‘`--scoord`’ followed by a file containing the SNP coordinate in the [BED format](#).

The option ‘`--maf`’ allows to skip loading SNPs if their minor allele frequency is below a given threshold, for instance 0.05.

The option ‘`--covar`’ requires a file as argument. This file has two columns separated by a space or a tabulation, and one line per subgroup. The first column is the identifier of

the subgroup. The second column is the path to the file containing the genotypes for this subgroup.

Each covariate file has to be in the following format:

```
id ind1 ind2 ...
covar1 0.32 0.11 ...
covar2 -1.0 0.8 ...
...
```

Note that this format is also read by the R package MatrixEQTL.

## 2.2 Phenotypes

As for the option ‘`--geno`’, the option ‘`-p, --pheno`’ requires a file as argument. This file has two columns separated by a space or a tabulation, and one line per subgroup. The first column is the identifier of the subgroup. The second column is the path to the file containing the genotypes for this subgroup. Here is an example:

```
Fibroblasts /data/phenotypes_Fibroblasts.txt.gz
LCLs /data/phenotypes_LCLs.txt.gz
T-cells /data/phenotypes_T-cells.txt.gz
```

The program `eqtlbma` uses the term “feature” as the generic term for the entities for which we have phenotypic measurements. They can be exons, transcripts, genes, proteins, metabolites, etc, but we stick to genes in this manual. (Note also that the program implements a model with a specific prior meaningful for genes but which may not be appropriate for some other features.)

The actual files containing the phenotypes have the following format:

```
ind1 ind2 ind3 ...
gene1 2.0495 1.0947 1.9924 ...
gene2 0.1928 -0.873 0.5284 ...
...
```

As the files with phenotypes don’t contain the gene coordinates, we also need to use the option ‘`--fcoord`’ to specify gene coordinates in the **BED format**. Genes with no coordinates will be skipped (useful when launching the program in parallel, see below).

The option ‘`--qnorm`’ allows the program to transform the phenotypes into a standard Normal distribution. An FAQ entry at the end of this document indicates how to do this beforehand in R.

## 2.3 *Cis* region

The `eqtlbma` program focuses on detecting associations between SNPs and genes, restricting itself to SNPs in a *cis* candidate region of each gene. The option ‘`--anchor`’ allows to specify the boundary(ies) of this region, with “FSS” for “feature start site”, “FES” for “feature end site” and “FSS+FES” for both. The option ‘`--cis`’ precises the length of half of the *cis* region, in base pairs.

As an example, ‘`--anchor FSS --cis 100000`’ means that, for each gene, we will test all SNPs falling in the interval [-100kb,+100kb] centered on the the start coordinate of the given gene as determined from the BED file given to option ‘`--fcoord`’.

Following the convention in [BEDTools](#), the definition of the *cis* region uses `<=` and `>=` instead of `<` and `>`.

## 2.4 Analysis steps and output files

The option `‘-o, --out’` requires a character string and will use it as a prefix to name the output files. Moreover, all output files are directly written in a compressed mode using [zlib](#).

The program `eqtlbma` can perform several kinds of analysis. The option `‘--step’` can be used to choose one or all of them. Step 1 only tests for association in each subgroup separately. Step 2 does the same and also performs permutations at the gene level. Step 3 tests for association in each subgroup separately and also in all subgroups jointly. Step 4 does the same and perform permutations but only for the joint analysis. Step 5 does the same and perform permutations for both separate and joint analyses.

At the beginning of each step, summary statistics are computed in each subgroup (estimates of effect sizes, standard errors, p-values, etc). If the option `‘--outss’` is not specified, the summary statistics won’t be saved. This can be useful in some cases: for instance, when we want to run a set of jobs with `‘--permsep 1’` and another set of jobs with `‘--permsep 2’`, both sets of jobs in the same directory. We would typically use option `‘--outss’` with the first set of jobs but not with the second, otherwise both sets of jobs may overwrite each other’s files. However, we need the summary stats per subgroup if we want to make meta-analysis-like forest plots. Also, when the option `‘--outcv’` is set, the summary statistics of the other covariates, if any, are saved.

If the option `‘--outraw’` is not specified, the raw Bayes Factors won’t be saved. This can be useful in some cases: for instance, when the number of subgroups is large (>15-20). However, the hierarchical model requires all the raw BFs.

When using steps 3, 4 or 5, we need to specify the options `‘--gridL’` and `‘--gridS’`, along with two files containing the grids over which the Bayes Factors are averaged. A grid has two columns, the first contains values of  $\phi^2$  (prior variance of the standardized effects  $b_s$ ’s in each subgroup) and the second values of  $\omega^2$  (prior variance of the standardized effect  $\bar{b}$  averaged over all subgroups).

The option `‘--gridL’` specifies a “large” grid. It is typically used for meta-analysis (see this preprint of Wen & Stephens on [arXiv](#)), or for the BMAlite analysis (see the preprint of Flutre *et al* on [arXiv](#)). The option `‘--gridS’` specifies a “small” grid used with configurations (see Flutre *et al*).

The option `‘--bfs’` allows to specify which Bayes Factors we want to compute. The acronym “abf” is used to mean “approximated Bayes factor” because the Bayes Factor can’t be calculated analytically and therefore has to be approximated using Laplace’s method. See Wen & Stephens for more details.

Specifying `‘--bfs gen’` computes the “general” BF corresponding to the consistent configuration using the large grid. Fixed-effect and maximum-heterogeneity BFs are also calculated (see Wen & Stephens).

Specifying `‘--bfs sin’` also computes the BF for each singleton, that is for configurations (100), (010) and (001) if there are 3 subgroups. Also, the BF called BMAlite in Flutre *et al* (corresponding to the average of BFgen and all BFsin’s) is also reported.

Finally, specifying `‘--bfs all’` computes the BF for each configuration. This can be too costly when the number of subgroups exceeds 15 or 20.

The option ‘`--mvlr`’ implements the multivariate model in which the errors in the linear regressions are correlated (see Wen’s preprint on [arXiv](#)). This is especially important when all subgroups share the same set of individuals, for instance when several tissues are sampled from the same set of individuals. When using ‘`--mvlr`’, the option ‘`--fitsig`’ is set by default at 0. Also, with ‘`--mvlr`’, the summary statistics per subgroup are not exported anymore.

The option ‘`--nperm`’ allows to specify how many permutations will be performed. We recommend 10000. In practice, we permute the individual labels. As individuals can be present in several subgroups, we recommend to use ‘`--permsep 1`’ to preserve such correlation structure when doing a subgroup-by-subgroup analysis. You can also specify the initialization of the random number generator with the option ‘`--seed`’ in order to be able to replicate exactly the results.

To speed-up the permutations, we also recommend to use the option ‘`--trick 1`’. Indeed, when it is clear that there is no association between the given gene-SNP pair, it is not necessary to perform 10000 permutations, a much smaller number is enough, and this option implements this adaptively for each gene-SNP pair. It requires another random number generator, which also uses ‘`--seed`’. The output file will contain the total number of permutations performed. The option ‘`--tricut`’ allows to tune the speed gain of the trick: the smaller the faster (i.e. less permutations are performed when there is no association). We found that using ‘`--tricut 10`’ is usually enough.

If we want to compare the two approaches (separate or joint analysis), we may want to use the exact same permutations for both. Yet we may also want to use the “trick”. Specifying ‘`--trick 2`’ allows to do just that and is therefore recommended.

Finally, the option ‘`--pbf`’ specifies which BF is used as a test statistic for steps 4 and 5. The BF called “BMA” in Flutre *et al* corresponds to ‘`--pbf all`’, and the BF called “BMAlite” corresponds to ‘`--pbf gen-sin`’.



### 3 Running the program

For a quick and simple analysis, the command line can look like this:

```
eqtlbma \
--geno file_with_paths_to_genotype_files.txt \
--scoord file_with_SNP_coordinates.bed.gz \
--pheno file_with_paths_to_phenotype_files.txt \
--fcoord file_with_gene_coordinates.bed.gz \
--out output_eqtlbma \
--outss \
--step 3 \
--gridL file_with_large_grid.txt \
--gridS file_with_small_grid.txt \
--bfs all \
```

When dealing with many genes (e.g. 20,000) and SNPs (e.g. 5 millions), we recommend to split the analysis in batches and launch them in parallel. To simplify this, i.e. to avoid the burden of creating new input files, we can have several BED files with different subsets of genes.

Let's say that we want 100 batches, we only need to split all the genes into 100 lists. Starting from the initial BED file, we can do this with the following command (of course you may have to adapt this a bit if it doesn't work at first):

```
nbBatches="100"; mkdir lists_genes; cd lists_genes; \
zcat ../gene_coords.bed.gz | cut -f1-4 | split \
-l $(echo "scale=0; $(zcat ../gene_coords.bed.gz | wc -l)/${nbBatches}" | bc -l) \
--suffix-length=3 --numeric-suffixes=1 --additional-suffix=.bed \
--filter='gzip > $FILE.gz' - list_genes_; cd ..
```

Then, a full command line may look like this:

```
eqtlbma \
--geno file_with_paths_to_genotype_files.txt \
--scoord file_with_SNP_coordinates.bed.gz \
--pheno file_with_paths_to_phenotype_files.txt \
--fcoord lists_genes/list_genes_001.bed.gz \
--out output_eqtlbma_001 \
--step 5 \
--outraw \
--qnorm \
--maf 0.05 \
--gridL file_with_large_grid.txt \
--gridS file_with_small_grid.txt \
--bfs all \
--mvlr \
--fitnull \
--nperm 10000 \
--trick 2 \
--pbf all
```

Have a look at the script `launch_eqtlbma_parallel.bash` in the directory `scripts/` of the package.

Note that you can also use the option ‘`--snp`’ if you want to analyse only a subset of all SNPs. For instance you can have a file with a list of cis SNPs for each BED file containing gene coordinates.

## 4 Reading the outputs

The program `eqtlbma` creates several output files, all starting with the character string given to option `'--out'`, e.g. `"out_eqtlbma"` (remember to include the batch number when you parallelize). All output files contain a header line, which should make it easy to understand as well as load into R.

If `'--outss'` is set but `'--mvlr'` is not, one file is created per subgroup with some summary statistics. They have the suffix `"_sumstats_<subgroup>.txt.gz"`. These summary statistics can be used to draw forest plots. If you provide the option `'--outcv'`, the summary statistics of the other covariates, if any, will also be saved. For steps 2 and 5, there will also be file(s) with the results of the permutations. If `'--permsep 1'` was given, there will be one such file, with suffix `"_sepPermPvals.txt.gz"`. If `'--permsep 2'` was given, there will be one file per subgroup, with suffix `"_sepPermPvals_<subgroup>.txt.gz"`.

One file contains all the BFs averaged over the grid, with suffix `"_l10abfs_avg-grids.txt.gz"`. If option `'--outraw'` was given, there will also be one file with all the raw BFs, i.e. one per grid value, with suffix `"_l10abfs_raw.txt.gz"`. Such files are necessary to run the hierarchical model (see below). For steps 4 and 5, there will also be a file with the results of the permutations, with suffix `"_jointPermPvals.txt.gz"`.

An FAQ entry describes how to concatenate the output files from all batches, for instance to have all `"_sumstats_<subgroup>.txt.gz"` batch files into a single file.

## 5 Running the hierarchical model

The `hm` program can take four options.

The option ‘`-d`’ requires the input file (not compressed, no header line) with the Bayes Factors. The format is the following:

```
snpname_genename model_index log10_bf_grid1 log10_bf_grid2 ...
```

The option ‘`-s`’ requires the number of models to considered. It corresponds to the number of active configurations, e.g. 7 if there are 3 subgroups.

The option ‘`-g`’ requires the number of grids to consider. For instance, if you used a grid with 10 pairs ( $\phi^2, \omega^2$ ), you need to specify ‘`-g 10`’.

The option ‘`-t`’ can be given the threshold increase to terminate the EM algorithm. That is, if the log10-likelihood increases less than this threshold, the iterations stop. The default value is set at 0.05.

The `hm` program writes information on stderr and stdout. On stderr, it outputs at each EM iteration the current parameter values and log10-likelihood of the model. At the end of the run, it also outputs the profile likelihood 95% confidence interval and the point estimates of  $\pi_0$ , configuration probabilities and grid probabilities. On stdout, it writes one line per gene-SNP pair with the gene-level log10(BF) and posterior probability, the snp-level log10(BF) and the log10(BF) for each configuration.

Importantly, if you want to launch the `hm` program with the output files from the `eqtlbma` program, you can use the script `launch_hm.bash`. It will automatically decompress the output file(s) with suffix “\_l10abfs\_raw.txt.gz” (one per job if `eqtlbma` was run in parallel), filter them to only keep the log10(BFs) corresponding to the configurations, and concatenate them into a single file in the proper format. The stdout and stderr of `hm` will be available as gzip files with a common prefix.

Launch `launch_hm.bash -h` to get the help. The command-line will typically look like this:

```
launch_hm.bash \
--p2b ~/bin/hm \
--inp ‘‘out_eqtlbma*_l10abfs_raw.txt.gz’’ \
--nbC 7 \
--nbG 10 \
--outp out_hm
```

If the number of subgroups is large, you may also want to fit the hierarchical model for pairs of subgroups. This can be done easily with the option ‘`--reconf`’. You only need to follow it with a regular expression able to catch the configurations you are interested in. For instance, if you are interested in configurations 1 and 3, you will run:

```
launch_hm.bash --p2b ~/bin/hm --inp ‘‘out_eqtlbma*_l10abfs_raw.txt.gz’’ \
--nbG 10 --outp out_hm --nbC 3 --reconf ‘‘^1$|^3$|^1-3$’’
```

## 6 Frequently asked questions

- **How do I cite this package?**

For the moment, you can cite the preprint available on [arXiv](#): “A statistical framework for joint eQTL analysis in multiple tissues” by T.Flutre, X.Wen, J.Pritchard and M.Stephens (arXiv:1212.4786).

- **How do I make the file(s) for the grid(s)?**

You can use the following R function:

```
getGrid <- function(grid.type="general", no.het=FALSE){
  oma2.plus.phi2 <- c(0.1^2, 0.2^2, 0.4^2, 0.8^2, 1.6^2) # avg eff size
  oma2.over.oma2.plus.phi2 <- c(0, 1/4, 1/2, 3/4, 1) # homogeneity
  if(grid.type != "general"){
    if(no.het){
      oma2.over.oma2.plus.phi2 <- c(1)
    } else
      oma2.over.oma2.plus.phi2 <- c(3/4, 1)
  }
  grid <- matrix(NA, nrow=length(oma2.plus.phi2) *
                  length(oma2.over.oma2.plus.phi2), ncol=2)
  colnames(grid) <- c("phi2", "oma2")
  i <- 1
  for(aes in oma2.plus.phi2){
    for(hom in oma2.over.oma2.plus.phi2){
      grid[i,"phi2"] <- aes * (1 - hom)
      grid[i,"oma2"] <- aes * hom
      i <- i + 1
    }
  }
  return(grid)
}
```

A typical code would look like this:

```
gridL <- getGrid('general')
write.table(x=gridL, file=gzfile('grid_phi2_oma2_general.txt.gz'),
            quote=FALSE, row.names=FALSE, col.names=FALSE)
gridS <- getGrid('configs')
write.table(x=gridS, file=gzfile('grid_phi2_oma2_with-configs.txt.gz'),
            quote=FALSE, row.names=FALSE, col.names=FALSE)
```

- **How do I transform my phenotypes beforehand into the quantiles of a standard Normal?**

You can use the following R command, assuming that `matrix.original` has genes in rows and samples in columns:

```
matrix.qnormed <- t(apply(matrix.original, 1, function(exp.per.gene){
  qqnorm(exp.per.gene, plot.it=FALSE)$x
```

```

}))
colnames(matrix.qnormed) <- colnames(matrix.original)
In the presence of ties, it's better to break them randomly:
set.seed(1859)
matrix.qnormed <- t(apply(matrix.original, 1, function(exp.per.gene){
  idx <- sample(length(exp.per.gene))
  tmp <- qqnorm(exp.per.gene[idx], plot.it=FALSE)$x
  tmp[sort(idx, index.return=TRUE)$ix]
}))
colnames(matrix.qnormed) <- colnames(matrix.original)

```

- **How do I easily concatenate the output files from all batches?**

When launching `eqtlbma` in parallel, you will get output files for each batch. Below are simple bash commands to concatenate them into a single file and compress it:

```

sbgrp="Tissue3"; i=0; \
ls out_eqtlbma_[0-9][0-9][0-9]_sumstats_${sbgrp}.txt.gz | while read f; do \
let i=i+1; echo $i; \
if [ $i -eq "1" ]; then zcat $f > out_eqtlbma_sumstats_${sbgrp}.txt; \
else zcat $f | sed 1d >> out_eqtlbma_sumstats_${sbgrp}.txt; fi; done
gzip out_eqtlbma_sumstats_${sbgrp}.txt

```

- **Is this packaged tested?**

We implemented some R code in order to perform functional tests on `eqtlbma`. Launching them is automatized via `'make check'`.

You can also find in the `src/` directory the code used to simulate data as in Flutre *et al.* It can thus be used to test the `hm` program. To compile it, enter into the `src/` directory and run:

```
g++ -Wall -Wextra -g utils.cpp simul_flutre_et_al.cpp -lgsl -lgslcblas -lz
```

As usual, a help message is available with the option `-h`.

- **How can I contribute?**

The code of the package is freely available on [Github](#), so you can fork it and let us know of any pull request.

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