# fastBVSR Manual

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This software package is a faster implementation of the Bayesian variable selection regression (BVSR) of Guan and Stephens [2011], which was developed for large-scale multi-SNP association analysis. Its usage is very similar to the program **piMASS**, which can be downloaded at http://haplotype.org/software.html.

A typical command for running fastBVSR is

```
./fastBVSR -g test.mg.txt -p test.ph -w 10000 -s 100000 -o try1
```

This command will read the mean genotype file "test.mg.txt" and the phenotype file "test.ph" and then run MCMC with 10000 burn-in iterations and 100000 sampling iterations. All the output files start with prefix "try1". A test dataset is provided in the package.

### 1 Input File Formats

The mean genotype file format and the phenotype format are the same as in **piMASS**.

Mean Genotype File No header row. Each row is a SNP. Columns can be separated by tab, space or comma. The first column is the SNP name (NO whitespace or commas in SNP names); the second is the minor allele; the third is the major allele. The rest columns are the mean genotypes (numbers of copies of the minor allele) of every individual. "NA" or "?" represents a missing value. Example:

```
rs1 A T O 1 2
rs2 G C 1 ? 1.05
```

**Phenotype File** No header row. The n-th line is the phenotypic value (a number) of the n-th individual. Missing values are not allowed. Example:

1 0.4 -0.05

## 2 Understanding the Output

For most users, the only output file of interest is the \*\*\*.beta.txt. It contains 6 columns: the first column is the SNP name; the second is the  $\log_{10}$  BF computed from a single-SNP regression model with prior effect size  $\sigma = 0.2$ ; the third column is the posterior inclusion probability (PIP) estimate from MCMC, which can be expressed as

$$\mathbb{E}(\gamma_j \mid \boldsymbol{y}) = \mathbb{P}(\gamma_j = 1 \mid \boldsymbol{y})$$

where  $\gamma_j = 1$  if the j-th SNP is included in the model (thus associated with the SNP) and  $\gamma_j = 0$  otherwise; the fourth column is the Rao-Blackwellized estimate for PIP; the fifth column gives the estimate for the posterior mean of the effect size, which can be expressed as  $\mathbb{E}(\beta_j \mid \boldsymbol{y})$ ; the sixth column is the Rao-Blackwellized estimate of the posterior mean of  $\beta_j$ . Please refer to Guan and Stephens [2011] for details of the Rao-Blackwellization scheme.

NOTE: the 5th and 6th columns are estimates for  $\mathbb{E}(\beta_j \mid \boldsymbol{y})$ , not  $\mathbb{E}(\beta_j \mid \boldsymbol{y}, \gamma_j = 1)$ !

For users that are familiar with the BVSR method of Guan and Stephens [2011], the information in the \*\*\*.log.txt and \*\*\*.path.txt is probably self-evident.

# 3 List of Common Options

NOTE: all the listed arguments except -R have the same meaning as in **piMASS**. Required/recommended options:

- -g string the name of the input mean genotype file.
- -p *string* the name of the input phenotype file.
- -o *string* prefix of the output files.
- -s integer number of sampling iterations in MCMC.
- -w integer number of burn-in iterations in MCMC.

#### Advanced options:

- ullet -r integer random seed.
- -nstart integer the initial model size.
- -hmax double maximum value for h.
- -hmin double minimum value for h.
- -pmax integer  $\frac{pmax}{N_{snp}}$  is the maximum value for  $\pi$ .
- ullet -pmin integer  $\frac{pmin}{N_{snp}}$  is the minimum value for  $\pi$   $(pmin \geq 1)$ .
- -smax integer maximum model size in MCMC.
- -smin integer minimum model size in MCMC ( $\geq 1$ ).
- -R integer (not to be confused with -r) do Rao-Blackwellization every R iterations (default value = 1000). If you run 1 million sampling iterations, consider using "-R 10000".

# References

Yongtao Guan and Matthew Stephens. Bayesian variable selection regression for genome-wide association studies and other large-scale problems. *The Annals of Applied Statistics*, pages 1780–1815, 2011.