

## 'Automatic' GWAS analyses using WOMBAT

WOMBAT provides an option for GWAS analyses, processing a large number of SNPs one by one in a single analysis. This uses an efficient computing strategy (Meyer and Tier, 2012) which avoids inversion of large matrices and splits computations into a part to be performed once and a much smaller part specific to individual SNPs.

- The GWAS feature is invoked with the run time option `--snap` (standing for 'snappy').
- It provides estimates of multiple SNP effects together with their standard errors for a mixed model with specified (co)variance components for residuals and random effects fitted.
- SNP effects are expected to be fitted as linear covariables.
- The other effects in the model are arbitrary, in such that all models usually available in WOMBAT for uni- and multivariate analyses can be specified (`--snap` is not implemented for random regression analyses).
- Allele counts are expected to be read sequentially from a separate file:
  - This file has the default name `SNPCounts.dat` (previously `QTLAllels.dat`).
  - The file, or a symbolic link to it, must be in the working directory.
  - There should be one long row with allele counts for all phenotypes, for each SNP to be analyzed.
  - Counts should be a single digit for each individual without spaces between them. For example, if there are 1000 genotyped individuals, a row comprised of 1000 digits – usually 0, 1 or 2 – is expected to be read (in Fortran: the input format would be `(1000 i1)`).
  - Currently, there is no provision for missing information, i.e. any missing counts should be imputed prior to analysis or the data should be edited accordingly.
  - The file with allele counts should not contain any blank line – due to the formatted read, WOMBAT can not distinguish between a blank line and a line with all allele counts of "0"!
  - Any SNP with all allele counts the same for all individuals (i.e. a SNP which is not polymorphic) is reported. This is likely to yield an undetermined equation – WOMBAT checks for this and sets corresponding estimates and standard errors to zero. In addition, a warning message is written to `WOMBAT.log`.
- Estimates are written out to a file called `SNPSolutions.dat` (previously `QTLSolutions.dat`). This file has a line per SNP. For univariate analyses columns 1 to 3 give the estimated effect, its standard error and the respective t-value. For multivariate analyses of  $q$  traits, these are given in order of traits, i.e. estimated effect for trait 1 to  $q$ , corresponding standard errors 1 to  $q$  and t-values 1 to  $q$ .

## Toy Example

This is Example14 as distributed with WOMBAT.

Consider records (for a single trait) for 16 animals given in file `SimData.dat`. Column 1 gives the animal code, columns 2 and 3 give the code for two cross-classified fixed effects and column 4 codes their interaction. The SNP allele count is given in column 5. Column 6 gives another covariable and column 7 represents the trait measured.

```
SNPCounts.dat
1211001011111101
1011001011211101
1211001022011101
1211001011011122
```

Corresponding pedigree information is given in file `SimPed.dat`. Including parents without records themselves yields a total of 26 animal genetic effects in the model of analysis. The SNP allele counts given in the data file are not analyzed, but merely act as place holders. The actual counts are expected to be read from the file `SNPCounts.dat`. For this example, we have a total of 4 SNPs and 16 animals with records. Hence the file `SNPCounts.dat` has 4 rows with 16 digits each (of 0, 1 or 2) giving the allele counts for the animals in the data in the same order as the records in the data file. For instance, the “1” in column 1 of row 1 is the allele count for animal “104”, the “2” in column 2 pertains to animal “105” and the “1” in column 16 is the count for animal “213”.

The parameter parameter file – `wombat.par` – for this analysis specifies the analysis type, data and pedigree file and model of analysis as for any other WOMBAT analysis. Specific features for the GWAS analysis are:

- first line: `RUNOP --snap`.

This gives the run time option in the parameter file. This is convenient so as not to forget it; alternatively it could be given on the command line.

- The special instruction: `COVZER snp(1) FIT`.

WOMBAT is fussy about covariables which have a value of zero – too often are these missing values! This line specifies that any allele counts of “0” are indeed valid covariable values

- The special instruction: `SNPEFF snp(1) (previously QTLEFF snp(1))`.

This specifies which of the covariables fitted represents the allele counts which are subsequently to be replaced with values read from `SNPCounts.dat`. NB: If there are other covariables in the model of analysis, this should be specified first covariable!

```
wombat.par
RUNOP --snap
ANAL UNI
PEDS ../SimPed.dat
DATA ../SimData.dat
  animal 0
  kfix 10
  mfix 33
  kxl 199
  snp
  age
  wgt
END
MODEL
  COV snp(1)
  COV age(2)
  FIX kfix
  FIX mfix
  FIX kxl
  RAN animal nrm
  TRAIT wgt
END MOD
VAR animal 1
30
VAR residual 1
70
SPECIAL
  COVZER snp(1) FIT
  SNPEFF snp(1)
END
```

Finally, estimates for the 4 SNPs analyzed are given in the file `SNPSolutions.dat`, with column 1 containing the estimate, column 2 the corresponding standard error and column 3 the ratio of the two, i.e. the t-value for a significance test. Update: column 4 contains a  $p$ -value for  $t$ , approximated from the cumulative Normal distribution (see Gualdrón Duarte et al., 2014) and column 5 gives  $-\log_{10}$  of column 4.

SimData.dat							SimPed.dat		
104	3	21	321	2.0	15.0	237.6668	101	0	0
105	3	20	320	3.0	14.0	261.7078	102	0	0
108	3	21	321	2.0	15.0	236.7068	103	0	0
109	2	21	221	2.0	15.0	215.2132	104	101	102
110	4	22	422	1.0	14.0	242.9927	105	101	102
111	4	21	421	1.0	10.0	225.6397	106	0	0
112	4	22	422	2.0	13.0	248.1895	107	0	0
113	3	20	320	1.0	11.0	187.5965	108	101	103
204	4	22	422	2.0	12.0	228.1260	109	101	103
205	2	20	220	2.0	14.0	206.7631	110	105	106
208	4	21	421	2.0	14.0	249.6117	111	105	106
209	3	21	321	2.0	12.0	221.0490	112	107	108
210	2	21	221	2.0	12.0	206.4229	113	107	108
211	2	21	221	2.0	15.0	209.7781	201	0	0
212	3	21	321	1.0	15.0	225.9217	202	0	0
213	3	21	321	2.0	14.0	229.8008	203	0	0
							204	201	202
							205	201	202
							206	0	0
							207	0	0
							208	201	203
							209	201	203
							210	205	206
							211	205	206
							212	207	208
							213	207	208

  

SNPSolutions.dat					
17.7955	6.12671	2.90457	0.003678	2.434443	SNPeffect1
-6.67386	7.59983	-0.878159	0.379858	0.420379	SNPeffect2
11.6144	4.51428	2.57281	0.010088	1.996212	SNPeffect3
12.1597	5.09893	2.38476	0.017090	1.767246	SNPeffect4

## References

- Gualdrón Duarte J.L., Cantet R.J.C., Bates R.O., Ernst C.W., Raney N.E., Steibel J.P. Rapid screening for phenotype-genotype associations by linear transformations of genomic evaluations. BMC Bioinformatics 15 (2014) 246. doi: [10.1186/1471-2105-15-246](https://doi.org/10.1186/1471-2105-15-246).
- Meyer K., Tier B. "SNP Snappy": A strategy for fast genome wide association studies fitting a full mixed model. Genetics 190 (2012) 275–277. doi: [10.1534/genetics.111.134841](https://doi.org/10.1534/genetics.111.134841).