

# pyGenClean Documentation Release 1.8.1

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# INTRODUCTION

Genetic association studies making use of high throughput genotyping arrays need to process large amounts of data in the order of millions of markers per experiment. The first step of any analysis with genotyping arrays is typically the conduct of a thorough data clean up and quality control to remove poor quality genotypes and generate metrics to inform and select individuals for downstream statistical analysis.

pyGenClean is a bioinformatics tool to facilitate and standardize the genetic data clean up pipeline with genotyping array data. In conjunction with a source batch-queuing system, the tool minimizes data manipulation errors, it accelerates the completion of the data clean up process and it provides informative graphics and metrics to guide decision making for statistical analysis.

pyGenClean is a command tool working on both Linux and Windows operating systems. Its usage is shown below:

```
$ run_pyGenClean --help
usage: run_pyGenClean [-h] [-v] [--bfile FILE] [--tfile FILE] [--file FILE]
                      [--report-title TITLE] [--report-author AUTHOR]
                      [--report-number NUMBER]
                      [--report-background BACKGROUND] --conf FILE
Runs the data clean up (pyGenClean version 1.8.0).
optional arguments:
 -h, --help
                       show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
  --bfile FILE
                        The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively).
 --tfile FILE
                        The input file prefix (will find the plink transposed
                        files by appending the prefix to the .tped and .tfam
                        files, respectively).
  --file FILE
                        The input file prefix (will find the plink files by
                        appending the prefix to the .ped and .fam files).
Report Options:
 --report-title TITLE The report title. [default: Genetic Data Clean Up]
  --report-author AUTHOR
                        The current project number. [default: pyGenClean]
  --report-number NUMBER
                       The current project author. [default: Simple Project]
  --report-background BACKGROUND
                        Text of file containing the background section of the
```

```
Configuration File:
--conf FILE The parameter file for the data clean up.
```

The tool consists of multiple standalone scripts that are linked together via a main script (run\_pyGenClean) and a configuration file (the --conf option), the latter facilitating user customization.

The *Data clean up protocol schema* shows the proposed data cleanup pipeline. Each box represents a customizable standalone script with a quick description of its function. Optional manual checks for go-no-go decisions are indicated.

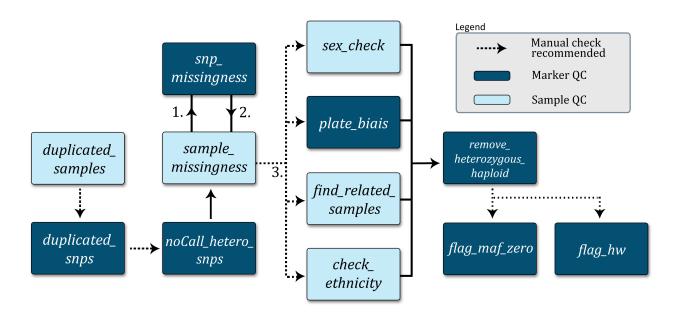


Fig. 1.1: Data clean up protocol schema

# INSTALLATION

pyGenClean is a Python package that works on both Linux and Windows operating systems. It requires a set of Python dependencies and PLINK. Complete installation procedures are available for both Linux (32 and 64 bits) and Windows in the following sections.

# 2.1 Linux Installation

The following steps will help you install pyGenClean on a Linux machine.

# 2.1.1 Requirements

The following softwares and packages are required for pyGenClean:

- 1. Python 2.7
- 2. PLINK (1.07)
- 3. numpy (version 1.6.2 or latest)
- 4. matplotlib (version 1.2.0 or latest)
- 5. scipy (version 0.11.0 or latest)
- 6. scikit-learn (version 0.12.1 or latest)
- 7. Jinja2 (version 2.7.3 or latest)

**Note:** All the requirements will be installed along with the main *pyGenClean* module.

**Warning:** The *Plink* software needs to be in the *PATH* (or in the current working directory). In other words, you should be able to type *plink* at the command line.

#### 2.1.2 Installation

There are two main ways to to install pyGenClean: using an existing Python 2.7 distribution and creating a Python *Virtual environment*, or using *Miniconda*.

#### Virtual environment

If python is already installed, a python virtual environment should be created. If one is already present, you can just proceed to the *Activating the environment* section.

To create a new python virtual environment, download the latest version of virtualenv, located at this web page: http://pypi.python.org/pypi/virtualenv. At the moment of writing this documentation, the latest version was 13.1.2, and the file was named virtualenv-13.1.2.tar.gz. Locate the archive, which is usually in the ~/Downloads directory.

```
$ cd ~/Downloads
$ tar -zxf virtualenv-13.1.2.tar.gz
$ cd virtualenv-13.1.2
```

There is no need to install the module. Just create a directory and create the Python virtual environment:

#### **Activating the environment**

To activate the Python virtual environment, perform the following command:

```
$ source ~/softwares/Python-2.7_virtualenv/bin/activate
```

Finally, to deactivate the Python virtual environment, either close the terminal, or perform the following command:

```
$ deactivate
```

**Warning:** For the following installations and tests, be certain that the Python virtual environment is activated, or nothing will work as planned...

The best way to know if the Python virtual environment is activated, is to see its name, in parenthesis, before the usual prompt in the terminal. For example:

```
(Python-2.7_virtualenv)[username@localhost ~]$
```

#### Installing pyGenClean

To install pyGenClean, only perform the following command:

```
$ pip install pyGenClean
```

#### **Updating pyGenClean**

To update pyGenClean, perform the following command:

```
$ pip install -U pyGenClean
```

#### Miniconda

Download and install miniconda (located at http://conda.pydata.org/miniconda.html). By default, miniconda is installed in ~/miniconda.

To create a new virtual environment, perform the following command:

```
$ conda create -n Python-2.7_virtualenv python=2
```

#### Activating the conda environment

To activate the Python virtual environment (miniconda), perform the following command:

```
$ source ~/miniconda/bin/activate Python-2.7_virtualenv
```

Finally, to deactivate the Python virtual environment, either close the terminal, or perform the following command:

\$ source deactivate

**Warning:** For the following installations and tests, be certain that the Python virtual environment is activated, or nothing will work as planned...

The best way to know if the Python virtual environment is activated, is to see its name, in parenthesis, before the usual prompt in the terminal. For example:

(Python-2.7\_virtualenv)[username@localhost ~]\$

#### Installing pyGenClean

To install pyGenClean, only perform the following command:

```
💲 conda install pyGenClean -c http://statgen.org/wp-content/uploads/Softwares/pyGenClean
```

#### **Updating pyGenClean**

To update pyGenClean, perform the following command:

```
$ conda update pyGenClean -c http://statgen.org/wp-content/uploads/Softwares/pyGenClean
```

# 2.1.3 Testing the installation

**Warning:** Before using *pyGenClean*, be certain that the previously installed Python virtual environment is activated (see *Activating the environment* or *Activating the conda environment* for more information). If the proper environment is not activated, noting will work...

To test the algorithm, download the test data from http://statgen.org/downloads/pygenclean/ and the HapMap reference populations (build 37).

Locate the downloaded archives (it should be in the ~/Downloads directory). Perform the following commands:

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```
$ cd ~/Downloads
$ mkdir -p ~/test_pyGenClean
$ tar -C ~/test_pyGenClean -jxf check_ethnicity_HapMap_reference_populations_b37.tar.bz2
$ tar -C ~/test_pyGenClean -jxf pyGenClean_test_data.tar.bz2
$ cd ~/test_pyGenClean
```

Create a text file named conf.ini inside the ~/test\_pyGenClean directory, containing the following text:

```
[1]
script = check_ethnicity
ceu-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_CEU_r23a_filtered_b37
yri-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_YRI_r23a_filtered_b37
jpt-chb-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_JPT_CHB_r23a_filtered_b37
nb-components = 2
multiplier = 1

[2]
script = sex_check
```

Run the following command:

```
$ run_pyGenClean \
     --conf conf.ini \
     --bfile pyGenClean_test_data/1000G_EUR-MXL_Human610-Quad-v1_H
```

#### Results

Valuable information will be shown in the terminal. Once the program has finished, the results are in the new directory data\_clean\_up.date\_time where date is the current date, and time is the time at which the analysis started.

Here are the new directory structure, with only the files you might be interested in:

```
    data_clean_up.date_time/

            pyGenClean.log
            automatic_report.tex
            excluded_markers.txt
            excluded_samples.txt
            1_check_ethnicity/
               * ethnicity.before.png
            ethnicity.outliers.png
            ethnicity.outliers
            ethnicity.population_file_outliers
            2_sex_check/
            * sexcheck.list_problem_sex
```

The file pyGenClean.log contain the information that was displayed in the console. The file automatic\_report.txt contain the automatic report generated by pyGenClean. The files excluded\_markers.txt and excluded\_samples.txt contains the list of markers and samples, respectively, that were excluded from the dataset (with the reason).

#### 1 check ethnicity/

The first image in the first directory (*ethnicity.before.png*) shows the MDS values for each sample before outlier detection. The second image (*ethnicity.outliers.png*) shows the outliers that should be removed for further analysis. Finally, the file ethnicity.outliers include a list of samples that should be removed for further analysis. The **total number of outliers for this test should be exactly 63**, but the figures might be mirrored for 32 bits systems. For more information about the results of this module, refer to Section *Ethnicity Module*.

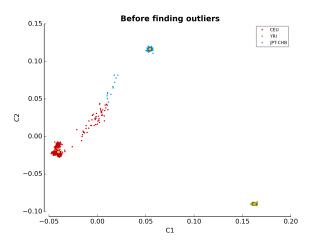


Fig. 2.1: ethnicity.before.png

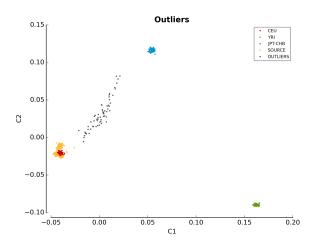


Fig. 2.2: ethnicity.outliers.png

#### 2\_sex\_check/

In the second directory, there should be a file containing the list of samples with gender problem. There should be exactly 4 samples with gender problem. For more information about this module, refer to Section Sex Check Module.

If you want to compare your results with the expected ones, just download the files in the archive pyGenClean\_expected\_results.tar.bz2, available through http://statgen.org/downloads/pygenclean/.

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They were generated using Fedora 18 (64 bits) in about 20 minutes. You should at least compare the following files:

- 1\_check\_ethnicity
  - ethnicity.outliers
  - ethnicity.population\_file\_outliers
  - All the figures (they might be mirrored).
- 2\_sex\_check
  - sexcheck.list\_problem\_sex
  - sexcheck.list\_problem\_sex\_ids

#### **Automatic report**

If LaTeX is installed, you can perform the following commands to compile the automatic report into a PDF file.

```
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
```

The following PDF report will be generated.

# 2.2 Windows Installation

The following steps will help you install *pyGenClean* on a Windows machine. It has been tested on both Windows XP and Windows 7.

# 2.2.1 Requirements

The following softwares and packages are required for pyGenClean:

- 1. Python 2.7
- 2. PLINK (1.07)
- 3. numpy (version 1.6.2 or latest)
- 4. matplotlib (version 1.2.0 or latest)
- 5. scipy (version 0.11.0 or latest)
- 6. scikit-learn (version 0.12.1 or latest)
- 7. Jinja2 (version 2.7.3 or latest)

**Note:** All the requirements will be installed along with the main pyGenClean module.

**Warning:** The *Plink* software needs to be in the *PATH* (or in the current working directory). In other words, you should be able to type *plink* at the command line.

## 2.2.2 Installation

The easiest way to install Python on windows is by using Miniconda.

#### Miniconda

Download and install miniconda (located at http://conda.pydata.org/miniconda.html).

To create a new virtual environment, perform the following command:

```
$ conda create -n Python-2.7_virtualenv python=2
```

#### Activating the conda environment

To activate the Python virtual environment (miniconda), perform the following command:

```
$ activate Python-2.7_virtualenv
```

#### Installing pyGenClean

To install pyGenClean, only perform the following command:

```
$ conda install pyGenClean -c http://statgen.org/wp-content/uploads/Softwares/pyGenClean
```

#### **Updating pyGenClean**

To update pyGenClean, perform the following command:

```
$ conda update pyGenClean -c http://statgen.org/wp-content/uploads/Softwares/pyGenClean
```

# 2.2.3 Testing the Algorithm

To test the algorithm, download the test data from http://statgen.org/downloads/pygenclean/ and the HapMap reference populations (build 37). Create a directory on your Desktop named pyGenClean\_test, and extract the two archive into it. You should have the following directory structure:

```
Desktop\
pyGenClean_test_data\
1000G_EUR-MXL_Human610-Quad-v1_H.bed
1000G_EUR-MXL_Human610-Quad-v1_H.bim
1000G_EUR-MXL_Human610-Quad-v1_H.fam
check_ethnicity_HapMap_ref_pops_b37\
hapmap_CEU_r23a_filtered_b37.bed
hapmap_CEU_r23a_filtered_b37.bim
hapmap_CEU_r23a_filtered_b37.fam
hapmap_YRI_r23a_filtered_b37.bed
hapmap_YRI_r23a_filtered_b37.bim
hapmap_YRI_r23a_filtered_b37.bim
hapmap_JRI_r23a_filtered_b37.fam
hapmap_JPT_CHB_r23a_filtered_b37.bed
hapmap_JPT_CHB_r23a_filtered_b37.bim
hapmap_JPT_CHB_r23a_filtered_b37.fam
```

Open the command prompt and navigate to the newly created directory, and created an new text file using notepad:

```
> cd Desktop\pyGenClean_test
> notepad conf.ini
```

Insert the following code in the file:

```
[1]
script = check_ethnicity
ceu-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_CEU_r23a_filtered_b37
yri-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_YRI_r23a_filtered_b37
jpt-chb-bfile = check_ethnicity_HapMap_ref_pops_b37/hapmap_JPT_CHB_r23a_filtered_b37
nb-components = 2
multiplier = 1

[2]
script = sex_check
```

Finally, run the following command:

```
> run_pyGenClean ^
--conf conf.ini ^
--bfile pyGenClean_test_data\1000G_EUR-MXL_Human610-Quad-v1_H
```

#### Results

Valuable information will be shown on the command prompt. Once the program has finished, the results are in the new directory data\_clean\_up.date\_time where date is the current date, and time is the time when the program started.

Here are the new directory structure, with only the files you might be interested in:

The file pyGenClean.log contain the information that was displayed in the console. The file automatic\_report.txt contain the automatic report generated by pyGenClean. The files excluded\_markers.txt and excluded\_samples.txt contains the list of markers and samples, respectively, that were excluded from the dataset (with the reason).

#### 1 check ethnicity/

The first image in the first directory (*ethnicity.before.png*) shows the MDS values for each sample before outlier detection. The second image (*ethnicity.outliers.png*) shows the outliers that should be removed for further analysis. Finally, the file ethnicity.outliers include a list of samples that should be removed for further analysis. The total number of outliers for this test should be exactly 63. For more information about the results of this module, refer to Section *Ethnicity Module*.

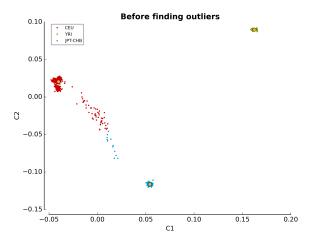


Fig. 2.3: ethnicity.before.png

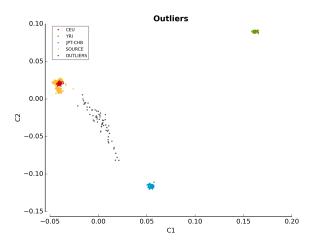


Fig. 2.4: ethnicity.outliers.png

#### 2\_sex\_check/

In the second directory, there should be a file containing the list of samples with gender problem. There should be exactly 4 samples with gender problem. For more information about this module, refer to Section Sex Check Module.

If you want to compare your results with the expected ones, just download the files in the archive pyGenClean\_expected\_results.tar.bz2, available through http://statgen.org/downloads/pygenclean/.

They were generated using Fedora 18 (64 bits) in about 20 minutes. You should at least compare the following files:

- 1\_check\_ethnicity
  - ethnicity.outliers
  - ethnicity.population\_file\_outliers
  - All the figures (they might be mirrored).
- 2\_sex\_check
  - sexcheck.list\_problem\_sex
  - sexcheck.list\_problem\_sex\_ids

## **Automatic report**

If LaTeX is installed, you can perform the following commands to compile the automatic report into a PDF file.

```
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
```

The following PDF report will be generated.

**CHAPTER** 

THREE

# **INPUT FILES**

To use pyGenClean, two sets of files are required: a set of genotype files and a configuration file (using the INI format).

# 3.1 Genotype files

The input files of the main program (run\_pyGenClean) are either:

- PLINK's pedfile format (use *pyGenClean*'s --file option) consists of two files with the following extensions: PED and MAP.
- PLINK's transposed pedfile format (use *pyGenClean*'s --tfile option) consists of two files with the following extensions: TPED and TFAM.
- PLINK's binary pedfile format (use pyGenClean's --bfile option) consists of three files with the following
  extensions: BED, BIM and FAM.

For more information about these file formats, have a look at PLINK's website, in the *Basic usage/data formats* section (http://pngu.mgh.harvard.edu/~purcell/plink/data.shtml).

**Warning:** If the format used is the *transposed* one, the columns **must** be separated using **tabulations**, but alleles of each marker need to be separated by a single space.

To create this exact transposed pedfile format, you need to use the following PLINK's options:

- --recode to recode the file.
- -- transposed to create an output file in the transposed pedfile format.
- --tab to use tabulations.

# 3.2 Configuration file

To customized pyGenClean, a basic configuration file is required. It tells which script to use in a specific order. It also sets the different options and input files, so that the analysis is easy to replicate or modify.

The configuration file uses the INI format. It consists of sections, led by a [section] header (contiguous integers which gives the order of the pipeline) and followed by customization of this particular part of the pipeline. Lines preceded by a # are comments and are not read by pyGenClean.

The following example first removes samples with a missing rate of 10% and more (section starting at line 1), then removes markers with a missing rate of 2% and more (section starting at line 6). Finally, it removes the samples with a missing rate of 2% and more (section starting at line 3).

```
[1]
2  # Removes sample with a missing rate higher than 10%.
3  script = sample_missingness
4  mind = 0.1
5  
6  [2]
7  # Removes markers with a missing rate higher than 2%.
8  script = snp_missingness
9  geno = 0.02
10  
11  [3]
12  # Removes sample with a missing rate higher than 2%.
13  script = sample_missingness
14  mind = 0.02
```

For a more thorough example, complete configuration files are available for download at http://www.statgen.org and are explained in the *Configuration Files* section. For a list of available modules and standalone script, refer to the *List of Modules and their Options*.

# 3.2.1 List of Modules and their Options

The following sections show a list the available scripts that can be used in the configuration file, along with their options for customization.

#### Contamination

The name to use in the configuration file is contamination and the *List of options for the contamination script*. table shows its configuration.

	1	1
Option	Type	Description
raw-dir	STRING	Directory containing the raw data (one file per sam-
		ple, where the name of the file (minus the extension)
		is the sample identification number.
colsample	STRING	The sample column.
colmarker	STRING	The marker column.
colbaf	STRING	The B allele frequency column.
colab1	STRING	The AB Allele 1 column.
colab2	STRING	The AB Allele 2 column.
sge		Use SGE for parallelization.
sge-walltime	STRING	The walltime for the job to run on the cluster. Do
		not use if you are not required to specify a wall-
		time for your jobs on your cluster (e.g. 'qsub
		-lwalltime=1:0:0' on the cluster).
sge-nodes	INT	The number of nodes and the number of processor per
		nodes to use (e.g. 'qsub -lnodes=X:ppn=Y' on
		the cluster, where X is the number of nodes and Y is
		the number of processor to use. Do not use if you are
		not required to specify the number of nodes for your
		jobs on the cluster.

INT

Table 3.1: List of options for the **contamination** script.

The name of the standalone script is pyGenClean\_check\_contamination.

The number of sample to run for a single SGE job.

--sample-per-run-for-sge

## **Duplicated Samples**

The name to use in the configuration file is duplicated\_samples and the *List of options for the duplicated\_samples script*. table shows its configuration.

Table 3.2: List of options for the **duplicated\_samples** script.

Option	Туре	Description
sample-completion-threshold		The completion threshold to consider a replicate when
		choosing the best replicates and for creating the com-
		posite samples. [default: 0.9]
sample-concordance-threshold	FLOAT	The concordance threshold to consider a replicate
		when choosing the best replicates and for creating the
		composite samples. [default: 0.97]

The name of the standalone script is pyGenClean\_duplicated\_samples.

#### **Duplicated Markers**

The name to use in the configuration file is duplicated\_snps and the *List of options for the duplicated\_snps script.* table shows its configuration.

Table 3.3: List of options for the **duplicated\_snps** script.

Option	Туре	Description
snp-completion-threshold		The completion threshold to consider a replicate when
		choosing the best replicates and for composite cre-
		ation. [default: 0.9]
snp-concordance-threshold	FLOAT	The concordance threshold to consider a replicate
		when choosing the best replicates and for composite
		creation. [default: 0.98]
frequency_difference	FLOAT	The maximum difference in frequency between dupli-
		cated markers [default: 0.05]

The name of the standalone script is pyGenClean\_duplicated\_snps.

#### Clean No Call and Only Heterozygous Markers

The name to use in the configuration file is noCall\_hetero\_snps and there are no customization possible.

The name of the standalone script is pyGenClean\_clean\_noCall\_hetero\_snps.

#### **Sample Missingness**

The name to use in the configuration file is sample\_missingness and the List of options for the sample\_missingness script. table shows its configuration.

Table 3.4: List of options for the **sample\_missingness** script.

Option	Type	Description
mind	FLOAT	The missingness threshold (remove samples with more than x percent missing genotypes). [Default:
		0.100]

The name of the standalone script is pyGenClean\_sample\_missingness.

#### **Marker Missingness**

The name to use in the configuration file is snp\_missingness and the *List of options for the snp\_missingness script.* table shows its configuration.

Table 3.5: List of options for the **snp\_missingness** script.

Option	Туре	Description
geno	FLOAT	The missingness threshold (remove SNPs with more
		than x percent missing genotypes). [Default: 0.020]

The name of the standalone script is pyGenClean\_snp\_missingness.

#### **Sex Check**

The name to use in the configuration file is sex\_check and the *List of options for the sex\_check script*. table shows its configuration.

Table 3.6: List of options for the **sex\_check** script.

Option	Туре	Description
femaleF	FLOAT	The female F threshold. [default: < 0.300000]
maleF	FLOAT	The male F threshold. [default: > 0.700000]
nbChr23	INT	The minimum number of markers on chromosome 23
		before computing Plink's sex check [default: 50]
gender-plot		Create the gender plot (summarized chr Y intensities
		in function of summarized chr X intensities) for prob-
		lematic samples. Not used by default.
sex-chr-intensities	FILE	A file containing alleles intensities for each of the
		markers located on the X and Y chromosome for the
		gender plot.
gender-plot-format	STRING	The output file format for the gender plot (png, ps, or
		pdf formats are available). [default: png]
lrr-baf		Create the LRR and BAF plot for problematic sam-
		ples. Not used by default.
lrr-baf-raw-dir	DIR	Directory or list of directories containing information
		about every samples (BAF and LRR).
lrr-baf-format	STRING	The output file format for the LRR and BAF plot (png,
		ps or pdf formats are available). [default: png]
lrr-baf-dpi	INT	The pixel density of the figure(s) (DPI).

The name of the standalone script is pyGenClean\_sex\_check. If you want to redo the BAF and LRR plot or the gender plot, you can use the pyGenClean\_baf\_lrr\_plot and pyGenClean\_gender\_plot scripts, respectively.

#### **Plate Bias**

The name to use in the configuration file is plate\_bias and the *List of options for the plate\_bias script*. table shows its configuration.

Option	Type	Description
loop-assoc	FILE	The file containing the plate organization of each sam-
		ples. Must contains three column (with no header):
		famID, indID and plateName.
pfilter	FLOAT	The significance threshold used for the plate effect.
		[default: 1.0e-07]

The name of the standalone script is pyGenClean\_plate\_bias.

# **Heterozygous Haploid**

The name to use in the configuration file is remove\_heterozygous\_haploid and there are no customization possible.

The name of the standalone script is pyGenClean\_remove\_heterozygous\_haploid.

#### **Related Samples**

The name to use in the configuration file is find\_related\_samples and the *List of options for the find\_related\_samples script*. table shows its configuration.

Table 3.8: List of options for the **find\_related\_samples** script.

Option	Туре	Description
genome-only		Only create the genome file. Not selected by default.
min-nb-snp	INT	The minimum number of markers needed to compute
		IBS values. [Default: 10000]
indep-pairwise	INT INT FLOAT	Three numbers: window size, window shift and the r2
		threshold. [default: ['50', '5', '0.1']]
maf	FLOAT	Restrict to SNPs with MAF >= threshold. [default:
		0.05]
ibs2-ratio	FLOAT	The initial IBS2* ratio (the minimum value to show
		in the plot. [default: 0.8]
sge		Use SGE for parallelization.
sge-walltime	STRING	The time limit (for clusters). Do not use if you are not
		required to specify a walltime for your jobs on your
		<pre>cluster (e.glwalltime=1:0:0 on the cluster).</pre>
		Allow enough time for proper job completion.
sge-nodes	INT INT	The number of nodes and the number of processor
		per nodes to use (e.g. qsub -lnodes=X:ppn=Y
		on the cluster, where X is the number of nodes and Y
		is the number of processor to use. Do not use if you
		are not required to specify the number of nodes for
		your jobs on the cluster. Allow enough ressources for
		proper job completion.
line-per-file-for-sge	INT	The number of line per file for SGE task array. [de-
		fault: 100]

The name of the standalone script is pyGenClean\_find\_related\_samples. Even though randomly choosing a subset of related samples is done automatically, you can use the pyGenClean\_merge\_related\_samples to perform it again.

# **Ethnicity**

The name to use in the configuration file is  $check\_ethnicity$  and the List of options for the check\\_ethnicity script. table shows its configuration.

Table 3.9: List of options for the **check\_ethnicity** script.

Option	Туре	Description
skip-ref-pops		Perform the MDS computation, but skip the three ref-
		erence panels.
ceu-bfile	FILE	The input file prefix (will find the plink binary files by appending the prefix to the .bim, .bed and .fam files, respectively.) for the CEU population.
yri-bfile	FILE	The input file prefix (will find the plink binary files by appending the prefix to the .bim, .bed and .fam files, respectively.) for the CEU population.
jpt-chb-bfile	FILE	The input file prefix (will find the plink binary files by appending the prefix to the .bim, .bed and .fam files, respectively.) for the JPT-CHB population.
min-nb-snp	FILE	The minimum number of markers needed to compute IBS values. [Default: 8000]
indep-pairwise	INT INT FLOAT	Three numbers: window size, window shift and the r2 threshold. [default: ['50', '5', '0.1']]
maf	INT	Restrict to SNPs with MAF >= threshold. [default: 0.05]
sge		Use SGE for parallelization.
sge-walltime	STRING	The time limit (for clusters). Do not use if you are not required to specify a walltime for your jobs on your cluster (e.glwalltime=1:0:0 on the cluster). Allow enough time for proper job completion.
sge-nodes	INT INT	The number of nodes and the number of processor per nodes to use (e.g. qsub -lnodes=X:ppn=Y on the cluster, where X is the number of nodes and Y is the number of processor to use. Do not use if you are not required to specify the number of nodes for your jobs on the cluster. Allow enough ressources for proper job completion.
ibs-sge-walltime	STRING	The time limit (for clusters) for the IBS jobs. Do not use if you are not required to specify a walltime for your jobs on your cluster (e.glwalltime=1:0:0 on the cluster). Allow enough time for proper job completion.
ibs-sge-nodes	INT INT	The number of nodes and the number of processor per nodes to use for the IBS jobs (e.g. qsub-lnodes=X:ppn=Y on the cluster, where X is the number of nodes and Y is the number of processor to use. Do not use if you are not required to specify the number of nodes for your jobs on the cluster. Allow enough ressources for proper job completion.
line-per-file-for-sge	INT	The number of line per file for SGE task array. [default: 100]
nb-components	INT	The number of component to compute. [default: 10]
outliers-of	STRING	Finds the outliers of this population. [default: CEU]
multiplier	FLOAT	To find the outliers, we look for more than x times the cluster standard deviation. [default: 1.9]
xaxis	STRING	The component to use for the X axis. [default: C1]
yaxis	STRING	The component to use for the Y axis. [default: C2]
format	STRING	The output file format (png, ps, pdf, or X11 formats are available). [default: png]
title	STRING	The title of the MDS plot. [default: C2 in function of
3.2. Configuration file		C1 - MDS] <b>2</b>
xlabel	STRING	The label of the X axis. [default: C1]
ylabel	STRING	The label of the Y axis. [default: C2]
create-scree-plot		Computes Eigenvalues and creates a scree plot.

The name of the standalone script is pyGenClean\_check\_ethnicity. If you want to redo the outlier detection using a different multiplier, have a look at the pyGenClean\_find\_outliers script. If you want to redo any MDS plot, have a look at the pyGenClean\_plot\_MDS script. If you want to compute the *Eigenvectors* using the smartpca tool, have a look at the pyGenClean\_plot\_eigenvalues script.

#### Minor Allele Frequency of Zero

The name to use in the configuration file is flag\_maf\_zero and there are no customization possible.

The name of the standalone script is pyGenClean\_flag\_maf\_zero.

#### Hardy Weinberg Equilibrium

The name to use in the configuration file is flag\_hw and the *List of options for the flag\_hw script*. table shows its configuration.

Table 3.10: List of options for the **flag\_hw** script.

Option	Туре	Description
hwe	FLOAT	The Hardy-Weinberg equilibrium threshold. [default:
		1e-4]

The name of the standalone script is pyGenClean\_flag\_hw.

#### **Subsetting the Data**

The name to use in the configuration file is subset and the *List of options for the subset script*. table shows its configuration.

Table 3.11: List of options for the **subset** script.

Option	Туре	Description
exclude	FILE	A file containing SNPs to exclude from the data set.
extract	FILE	A file containing SNPs to extract from the data set.
remove	FILE	A file containing samples (FID and IID) to remove
		from the data set.
keep	FILE	A file containing samples (FID and IID) to keep from
		the data set.

The name of the standalone script is  $pyGenClean\_subset\_data$ .

## Comparison with a Gold Standard

The name to use in the configuration file is compare\_gold\_standard and the List of options for the compare\_gold\_standard script. table shows its configuration.

Table 3.12: List of options for the **compare\_gold\_standard** script.

Option	Туре	Description
gold-bfile	FILE	The input file prefix (will find the plink binary files by
		appending the prefix to the .bim, .bed and .fam files,
		respectively.) for the Gold Standard.
same-samples	FILE	A file containing samples which are present in both
		the gold standard and the source panel. One line by
		identity and tab separated. For each row, first sample
		is Gold Standard, second is source panel.
source-manifest	FILE	The illumina marker manifest.
source-alleles	FILE	A file containing the source alleles (TOP). Two
		columns (separated by tabulation, one with the marker
		name, the other with the alleles (separated by space).
		No header.
sge		Use SGE for parallelization.
do-not-flip		Do not flip SNPs. WARNING: only use this option
		only if the Gold Standard was generated using the
		same chip (hence, flipping is unnecessary).
use-marker-names		Use marker names instead of (chr, position). WARN-
		ING: only use this options only if the Gold Standard
		was generated using the same chip (hence, they have
		the same marker names).

The name of the standalone script is  $pyGenClean\_compare\_gold\_standard$ .

# INFORMATION ABOUT THE PROTOCOL

The following sections describe the proposed protocol and provides information about which file should be looked for quality control. Finally, configuration files (with all available parameters) are given.

# 4.1 Proposed Protocol

#### 4.1.1 Contamination Module

#### **Note: Input files:**

- PLINK binary pedfiles (BED, BIM and FAM)
- 1. Examine the output file named contamination.bafRegress. It will contain the contamination estimates (along with confidence values). Usually, an estimate higher than 0.01 means possible contamination.
- 2. The automatic report will contain the list of samples with possible contamination (*i.e.* an estimate value higher than 0.01).

# 4.1.2 Preprocessing Steps

- Remove SNPs without chromosomal and physical position (chromosome and position of 0).
- Remove INDELs (markers with alleles I or D).
- Determine if there are duplicated samples. These samples must have exactly the same family (FID) and individual (IID) identification to be treated as duplicated samples by the *Duplicated Samples Module*. PLINK's option --update-ids could be used.
- If input is a transposed pedfile, be sure to use PLINK's option --tab to produce the appropriate file format.
- For the *Plate Bias Module*, a text file explaining the plate distribution of each sample must be provided using the option --loop-assoc in the configuration file. The following columns are required (in order, without a header):
  - the family identification;
  - the individual identification;
  - and the plate identification.
- Produce parameter files (see the *Configuration Files* for details about parameter file).
- To launch the analysis consult the section *How to Run the Pipeline*.

# 4.1.3 Duplicated Samples Module

#### **Note: Input files:**

- PLINK transposed pedfiles from the *Preprocessing Steps*.
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine dup\_samples.diff to evaluate if some samples have many discordant genotypes (this could indicate a possible samples mix up). To identify discordant samples, use the following command line:

```
$ cut -f4 dup_samples.diff | sort -k1,1 | uniq -c
$ cut -f5 dup_samples.diff | sort -k1,1 | uniq -c
```

If samples are present more than 10,000 times (for 2.5E-6 SNPs) this could indicate a sample mix up.

- 3. Examine dup\_samples.not\_good\_enough to determine if samples have a concordance rate below the threshold set by the user. These samples are present in the dup\_samples.final.tfam if they are the chosen ones.
- 4. Examine dup\_samples.summary to evaluate completion rate and concordance between the replicates of potentially problematic samples.
- 5. Examine dup\_samples.concordance file for the problematic samples; this could help to determine which sample is the discordant replicate.
- 6. If a sample appears problematic rename it and keep it in the analysis to determine if it is a duplicate of another sample (mix up) with the related sample module.

If necessary, samples present in the dup\_samples.not\_good\_enough file can be removed from the data set with the subset module (see the *First Subset Module* (optional)). If not, proceed to the *Duplicated Markers Module*).

## 4.1.4 First Subset Module (optional)

#### **Note: Input files:**

From the Duplicated Samples Module:

- dup\_samples.final.tfam
- dup\_samples.final.tped
- 1. Extract the family (FID) and individual (IID) identification from dup\_samples.not\_good\_enough with the following command line:

# 4.1.5 Duplicated Markers Module

#### **Note: Input files:**

From the Duplicated Samples Module:

• dup\_samples.final.tfam

• dup\_samples.final.tped

or from the First Subset Module (optional):

- subset.bed
- subset.bim
- subset.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script
- 2. Examine dup\_snps.duplicated\_marker\_names to detect SNPs with exactly the same name but mapping to different chromosomal location. (This file is not produce if no duplicated marker names are identified).
- 3. Determine the number of duplicated SNPs merged (same allele, same frequency, etc). SNPs merged were removed and are listed in the file dup\_snps.removed\_duplicates. Number of lines in this file corresponds to number of SNPs merged. SNPs not merged and reasons why (e.g. homo\_hetero, diff\_frequency, homo\_flip, etc.) are present in file dup\_snps.problems.
- 4. SNPs with concordance rate below the threshold are present in dup\_snps.not\_good\_enough. To have the list of those SNPs:

If necessary, use the subset option in the configuration file to remove the low concordance rate SNPs (see the *Second Subset Module (optional)*).

# 4.1.6 Second Subset Module (optional)

#### **Note: Input files:**

From the Duplicated Markers Module:

- dup\_snps.final.tfam
- dup\_snps.final.tped
- Extract SNPs with concordance rate below the threshold set by the user with the command line

# 4.1.7 Clean No Call and Only Heterozygous Markers Module

#### **Note: Input files:**

From the *Duplicated Markers Module*:

- dup\_snps.final.tfam
- dup\_snps.final.tped

or from the Second Subset Module (optional):

• subset.bed

- subset.bim
- subset.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. SNPs removed because they are failed are listed in clean\_noCall\_hetero.allFailed.
- 3. SNPs removed because they are all heterozygous are listed in clean\_noCall\_hetero.allHetero.

# 4.1.8 Sample Missingness Module (mind 0.1)

#### **Note: Input files:**

From the Clean No Call and Only Heterozygous Markers Module:

- clean\_noCall\_hetero.tfam
- clean\_noCall\_hetero.tped
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine PLINK's log file to detect any problem at this step.
- 3. Individuals removed because they did not pass the completion rate threshold are listed in clean\_mind.irem.

# 4.1.9 Marker Missingness Module

#### **Note: Input files:**

From the Sample Missingness Module (mind 0.1):

- · clean mind.bed
- clean\_mind.bim
- clean\_mind.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine PLINK's log file to detect any problem at this step.
- 3. SNPs removed because they did not pass the completion rate threshold are listed in clean\_geno.removed\_snps.

# 4.1.10 Sample Missingness Module (mind 0.02)

#### **Note: Input files:**

From the Marker Missingness Module:

- · clean geno.bed
- clean\_geno.bim
- clean\_geno.fam

- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine PLINK's log file to detect any problem at this step.
- 3. Individuals removed because they did not pass the completion rate threshold are listed in clean\_mind.irem.

#### 4.1.11 Sex Check Module

#### **Note: Input files:**

From Sample Missingness Module (mind 0.02):

- clean\_mind.bed
- clean\_mind.bim
- clean\_mind.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine PLINK's log file to detect any problem at this step.
- 3. Examine sexcheck.list\_problem\_sex, it contains all individuals identified by PLINK as having gender problem.
- 4. Examine sexcheck.chr23\_recodeA.raw.hetero to determine heterozygosity on the X chromosome of problematic samples. Consanguineous females may have low heterozygosity on the X chromosome. If many genotyped SNPs are rare, heterozygosity may also be low.
- 5. Examine sexcheck.chr24\_recodeA.raw.noCall to determine the number of Y markers with missing calls. Females have low number of genotypes for Y chromosome markers (high values of missing calls), but is often not equal to 0 probably because some Y markers come from pseudo autosomal regions. Column nbGeno is the total number of genotypes check and nbNoCall is the number of genotypes with missing calls on chromosome Y. Males should have low values in this column while females have higher number of missing calls but not equal to the total number of genotypes tested.

If probe intensities from X and Y chromosomes are available and the gender plot has been created:

- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine sexcheck.png to detect any individuals in the XXY or X0 regions, females in the male cluster and males in the female cluster (see the *Gender plot* figure). Confirm if possible the gender problems identified with the previous sex check problem step.

If intensities file for each sample are available and the BAF and LRR plot has been created:

- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine sexcheck\_sample-id\_lrr\_baf.png for each sample. Usually, females have LRR values around 0 (between -0.5 and 0.5) while males have LRR values between -0.5 and -1. Females have three lines on BAF graphics: one at 1 (homozygous for the B allele), one at 0.5 (heterozygous AB) and one at 0 (homozygous for the A allele). Males have two lines: one at 1 (homozygous for the B allele) and one at 0 (homozygous for the A allele). For more details, see the *The Plots* section of the *Sex Check Module*.

Keep individuals identified with gender problem until the *Related Samples Module* (mix up of samples could be resolved at this step).

#### 4.1.12 Plate Bias Module

## **Note: Input files:**

From the Sample Missingness Module (mind 0.02):

- · clean mind.bed
- clean mind.bim
- clean\_mind.fam

or if subset option is used to remove SNPs from nof file (see below):

- subset.bed
- subset.bim
- subset.fam
- 1. Verify if there is a nof file produce by PLINK when the input files for this step were produced (from the *Sample Missingness Module (mind 0.02)*). The nof contains SNPs with no founder genotypes observed. If so, remove the SNPs present in the nof file using the subset tool before launching the plate bias analysis. Those SNPs, if they are not removed will produced an error message when PLINK performs the loop-assoc analysis and the following message will be present in PLINK's log file plate\_bias.log: "ERROR: FEXACT error 3". SNPs on chromosome 24 could also produce this error.
- 2. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 3. Examine plate\_bias.log to detect any problem at this step.
- 4. The plate\_bias.significant\_SNPs.txt file contains a list of SNPs with P value below the threshold. Care should be taken with those SNPs if significant results are obtained in association tests. These SNPs are NOT removed from the data set, only flagged.
- 5. Low MAF can explain part of plate bias. Examine the output file plate\_bias.significant\_SNPs.frq to determine if SNPs have low MAF. Other reasons explaining plate bias are relatedness or ethnicity of individuals assign to the same plates and none of them on other plates.

## 4.1.13 Related Samples Module

#### **Note: Input files:**

From the Sample Missingness Module (mind 0.02):

- clean\_mind.bed
- clean\_mind.bim
- clean mind.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. File ibs.pruning\_0.1.prune.in contains the list of uncorrelated SNPs used for the IBS analysis
- 3. Examine ibs.related\_individuals\_z1.png and ibs.related\_individuals\_z2.png to detect if there are samples in the parent-child, duplicated samples, first degree relative and second degree relative areas. (see Z1 in function of IBS2 ratio and Z2 in function of IBS2 ratio plots).

- 4. File ibs.related\_individuals lists pairs of related individuals. Index column indicates group of related samples. Status column indicated the probable link between pair of individuals based on  $Z_0$ ,  $Z_1$  and  $Z_2$  values (see the *IBD allele sharing values* table [for which Z values are approximation] or RelatedSamples.find\_related\_samples.extractRelatedIndividuals() function for thresholds).
- 5. If there are known duplicated samples, examine ibs.related\_individuals to determine if they were identified correctly, if not this could indicate a possible samples mix up.
- 6. File ibs.choosen\_related\_individuals contains a list of related samples to keep. One related sample from the pair is randomly selected. If there are a group of related individuals, one sample in randomly selected from the group. All non selected samples are listed in ibs.discarded\_related\_individuals and should be removed from the analysis at a later stage.

Relationship	$k_0$	$k_1$	$k_2$	Coancestry $\theta = 1/2k_2 + 1/4k_1$
Unrelated	1	0	0	0
Identical twins	0	0	1	1/2
Parent-child	0	1	0	1/4
Full siblings	1/4	1/2	1/4	1/4
Half siblings	1/2	1/2	0	1/8
Uncle nephew	1/2	1/2	0	1/8
Grandparent grandchild	1/2	1/2	0	1/8
Double first cousins	9/16	3/8	1/16	1/8
First cousins	3/4	1/4	0	1/16

Table 4.1: IBD allele sharing values

# 4.1.14 Ethnicity Module

## **Note: Input files:**

From the Sample Missingness Module (mind 0.02):

- clean\_mind.bed
- clean\_mind.bim
- clean mind.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. File ethnic.ibs.pruning\_0.1.prune.in contains the list of uncorrelated SNPs used for the MDS analysis.
- 3. File ethnic.mds.mds contains the list of principale components as calculated by PLINK.
- 4. Examine ethnicity.mds.png, ethnicity.before.png, ethnicity.after.png and ethnicity.outliers.png to detect samples outside the selected cluster (see *The Plots* generated from the *Ethnicity Module* for more information).
  - If there are too many outliers still present in the data set (*i.e.* radius is too large), analysis can be redone using the pyGenClean\_find\_outliers standalone script, using a different value for --multiplier. For more information, refer to the *Finding Outliers* section of the *Ethnicity Module*.
- 5. Samples outside the selected cluster are listed in ethnicity.outliers. If necessary those samples could be removed at a later stage with the subset option.

## 4.1.15 Third Subset Module

## **Note: Input files:**

From the Sample Missingness Module (mind 0.02):

- clean\_mind.bed
- clean mind.bim
- clean\_mind.fam

Use the subset module to remove samples with gender problems (the *Sex Check Module*), outliers from the ethnicity cluster (the *Ethnicity Module*), related samples (the *Related Samples Module*) and any other samples that need to be removed from the data set.

• To produces a file containing all the samples to remove from the dataset:

```
$ cat sexcheck.list_problem_sex_ids ibs.discarded_related_individuals \
> ethnicity.outliers > samples_to_remove.txt
```

One sample may be removed for more than one reason, hence be present more than one time in the final samples\_to\_remove.txt file. This is not an issue for this step.

## 4.1.16 Heterozygote Haploid Module

## **Note: Input files:**

From the Third Subset Module:

- subset.bed
- subset.bim
- subset.fam

Samples with gender problems must have been removed before performing this module.

- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine without\_hh\_genotypes.log to detect any problem at this step.

Number of heterozygous haploid genotypes set to missing are indicated in without\_hh\_genotypes.log file.

## 4.1.17 Minor Allele Frequency of Zero Module

## **Note: Input files:**

From the *Heterozygote Haploid Module*:

- without\_hh\_genotypes.bed
- without\_hh\_genotypes.bim
- without\_hh\_genotypes.fam

- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine flag\_maf\_0.log to detect any problem at this step.
- 3. The file flag\_maf\_0.na\_list contains a list of SNPs with minor allele frequency of 0.

If necessary, use subset module to remove SNPs with minor allele frequency of 0, since they were only flagged using the *Fourth Subset Module (optional)*.

## 4.1.18 Fourth Subset Module (optional)

## **Note: Input files:**

From the Heterozygote Haploid Module:

- without\_hh\_genotypes.bed
- without\_hh\_genotypes.bim
- without\_hh\_genotypes.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine subset . log to detect any problem at this step.

## 4.1.19 Hardy Weinberg Equilibrium Module

## **Note: Input files:**

From the *Heterozygote Haploid Module*:

- without\_hh\_genotypes.bed
- without\_hh\_genotypes.bim
- without\_hh\_genotypes.fam

or from the Fourth Subset Module (optional):

- subset.bed
- subset.bim
- subset.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine flag\_hw.threshold\_1e-4.log and flag\_hw.threshold\_Bonferroni.log to detect any problem at this step.
- 3. The files flag\_hw.snp\_flag\_threshold\_Bonferroni and flag\_hw.snp\_flag\_threshold\_1e-4 contain lists of SNPs with P value below Bonferroni and below  $1 \times 10^{-4}$  threshold, respectively.

The markers are only flagged using this module. If you want to remove those markers, have a look at the *Fifth Subset Module (optional)*.

## 4.1.20 Fifth Subset Module (optional)

## **Note: Input files:**

From the *Heterozygote Haploid Module*:

- without\_hh\_genotypes.bed
- without\_hh\_genotypes.bim
- without\_hh\_genotypes.fam

or from the Fourth Subset Module (optional):

- subset.bed
- subset.bim
- subsert.fam
- 1. Examine the log to confirm options used and to detect any problems occurring while running the script.
- 2. Examine subset.log to detect any problem at this step.

# 4.2 Configuration Files

Two default configuration files are available to run the proposed protocol. Before using them, be sure to follow the *Preprocessing Steps* described in the *Proposed Protocol* section.

Note that lines starting with a # are comments, and are not used by the pipeline. The default parameters were commented out, and could be uncommented to change their values.

## 4.2.1 First Configuration File

This file should be use with the original dataset as input. Only change the loop-assoc file name in the plate\_bias section ([8]) and the reference population files (ceu-bfile, yri-bfile and jpt-chb-bfile in the check\_ethnicity section ([10]). Those last three datasets are provided and can be downloaded at http://www.statgen.org.

If you want to generate the gender and BAF and LRR plots, you will require to provide the intensities (sex-chr-intensities and lrr-baf-raw-dir in the sex\_check section ([7]) after uncommenting the required options).

```
# colsample = Sample Name
  # colmarker = SNP Name
16
  # colbaf = B Allele Freq
17
  # colab1 = Allele1 - AB
  \# colab2 = Allele2 - AB
  # sge
20
  # sqe-walltime = WRITE WALLTIME ONLY IF REQUIRED
21
  # sqe-nodes = WRITE NB NODES AND NB PROCESSOR PER NODE ONLY IF REQUIRED
22
  # sample-per-run-for-sge = 30
23
24
  [2]
27
  * *****************************
28
  # Checks missing rate and pairwise concordance of duplicated samples. Duplicated
29
  # samples should have same family and individual identification numbers. The
  # names can be modified directly in the transposed pedfile.
  33
  script = duplicated_samples
34
  # sample-completion-threshold = 0.9
35
  # sample-concordance-threshold = 0.97
37
40
  41
  # Checks missing rate and pairwise concordance of duplicated markers. Duplicated
42
  # markers are found by looking at their chromosomal position. No modification of
43
  # the transposed bedfile is required.
44
  46
  script = duplicated_snps
47
  # snp-completion-threshold = 0.9
48
  # snp-concordance-threshold = 0.98
40
  # frequency_difference = 0.05
53
54
  55
  # Finds and removes markers which have a missing rate of 100% or markers (not
56
  # located on mitochondrial chromosome) that have a heterozygosity rate of 0%.
57
  59
  script = noCall_hetero_snps
60
61
62
63
  [5]
  # Removes sample with a missing rate higher than a user defined threshold. For
  # this step, we recommend using a threshold of 10% missing rate as samples with
  # a missing rate of 2% will be later removed.
68
  69
  script = sample_missingness
  # mind = 0.1
```

```
73
74
  [6]
  77
  # Removes markers with a missing rate higher than a user defined threshold. For
  # this step, we recommend using a threshold of 2% missing rate.
  80
81
82
  script = snp_missingness
83
  \# geno = 0.02
84
85
86
87
  [7]
  # Removes sample with a missing rate higher than a user defined threshold. For
  # this step, we recommend using a threshold of 2% missing rate.
  91
92
  script = sample_missingness
93
  mind = 0.02
94
97
98
  99
  # Using PLINK, finds samples with gender issues, according to heterozygosity
100
  # rate on the X chromosome. If you want to produce a gender plot, you need to
  # uncomment the "gender-plot" option and provide a file containing marker
  # intensities on the X and Y chromosomes. If you want to produce a BAF and LRR
103
  # plot, you need to uncomment the "lrr-baf" option and provide a directory
104
  # containing the BAF and LRR values of each marker on the X and Y chromosomes
105
  # (one file per sample).
106
  107
  script = sex_check
  # femaleF = 0.3
110
  \# maleF = 0.7
111
  # nbChr23 = 50
112
  # gender-plot
113
  # sex-chr-intensities = /PATH/TO/FILE/CONTAINING/INTENSITIES_FILE.txt
  # gender-plot-format = png
  # lrr-baf
  # lrr-baf-raw-dir = /PATH/TO/DIRECTORY/CONTAINING/BAF_LRR_FILES.txt
117
  # lrr-baf-format = png
118
  # 1rr-baf-dpi = 300
119
120
121
122
123
  124
  # Using PLINK, performs a plate bias analysis, using a p value threshold of
125
  # 1.00-7.
126
  127
  script = plate_bias
129
  loop-assoc = /PATH/TO/FILE/CONTAINING/PLATE_INFORMATION.txt
```

```
# pfilter = 1.0e-07
131
132
133
134
135
   136
   # Checks for related individual and randomly keeps one of each related group. If
137
   # you have a server with a DRMAA-compliant distributed resource management
   # system, you can uncomment the "sge" and the "line-per-file-for-sge" options,
   # to run this step in parallel.
   142
   script = find_related_samples
143
   \# min-nb-snp = 10000
144
   # indep-pairwise = 50 5 0.1
145
   \# maf = 0.05
146
   \# ibs2-ratio = 0.8
148
   # sqe
   # line-per-file-for-sge = 100
149
   # sqe-walltime = WRITE WALLTIME ONLY IF REQUIRED
150
   # sqe-nodes = WRITE NB NODES AND NB PROCESSOR PER NODE ONLY IF REQUIRED
151
152
153
154
   [11]
155
   * *****************************
156
   # Using PLINK, computes the MDS value of each sample, and using three reference
157
   # populations (CEU, YRI and JPT-CHB), finds outliers of one of those three
158
   # reference population. You might want to skip the reference population using
159
   # the "skip-ref-pops" option. You might need to change the "multiplier" option
   # to be more or less stringent, according to you dataset. If you have a server
   # with a DRMAA-compliant distributed resource management system, you can
162
   # uncomment the "sqe" and the "line-per-file-for-sqe" options, to run this step
163
   # in parallel.
164
   165
   script = check_ethnicity
   ceu-bfile = /PATH/TO/PLINK/BINARY/FILE/FOR/CEU_population
   yri-bfile = /PATH/TO/PLINK/BINARY/FILE/FOR/YRI_population
169
   jpt-chb-bfile = /PATH/TO/PLINK/BINARY/FILE/FOR/JPT-CHB_population
170
   # skip-ref-pops
171
   \# min-nb-snp = 8000
172
173
   # indep-pairwise = 50 5 0.1
   \# maf = 0.05
174
175
   # sqe
   # line-per-file-for-sqe = 100
176
   \# nb-components = 10
177
   # outliers-of = CEU
178
   # multiplier = 1.9
179
   \# xaxis = C1
   # yaxis = C2
   # format = png
182
   # title = "C2 in function of C1 - MDS"
183
   \# xlabel = C1
184
   # ylabel = C2
185
   # create-scree-plot
   # scree-plot-title "TITLE OF THE PLOT"
   # sge-walltime = WRITE WALLTIME ONLY IF REQUIRED
```

```
# sge-nodes = WRITE NB NODES AND NB PROCESSOR PER NODE ONLY IF REQUIRED

# ibs-sge-walltime = WRITE WALLTIME ONLY IF REQUIRED

# ibs-sge-nodes = WRITE NB NODES AND NB PROCESSOR PER NODE ONLY IF REQUIRED
```

## 4.2.2 Second Configuration File

This configuration file should be run after the *First Configuration File* and with the output of the second sample missingness section ([6] in the *First Configuration File*).

A file containing the samples and markers to be removed should be created using the output of the sex\_check, find\_related\_samples, check\_ethnicity and plate\_bias sections of the First Configuration File.

```
# This is the second part of example configuration files for performing
  # efficient data clean up. All commented out parameters are those that are used
2
  # by default.
3
  # The input file should be the output file of the second sample missigness step
  # (which is the one that has been used by any of these scripts):
       - sex_check
       - find_related_samples
      - check_ethnicity
      - plate_bias
10
  # Note that the final usable dataset is the one located in the directory where
12
  # "remove_heterozygous_haploid" was run (which is the one that has been used by
13
  # any of these scripts):
14
       - flag_maf_zero
15
       - flag_hw
  # Hence, if you want to remove the flagged markers, you should use
  # pyGenClean_subset_data on markers in the "flag_maf_zero" and "flag_hw"
  # directories using the PLINK's binary file located in
  # "remove_heterozygous_haploid".
20
21
22
  * *****************************
23
  # After manually checking that everything went fine in the previous steps, you
24
  # need to create a list of samples to remove from steps [7] to [10] and a list
25
  # of markers to exclude from steps [6]. Just create a file containing family and
26
  # individual identification numbers for all those samples to remove. Note that
27
  # the two options 'reason-marker' and 'reason-sample' are for the automatic
28
  # report generated after the analysis.
29
  31
  script = subset
32
  reason-marker = reason for marker exclusion
33
  reason-sample = reason for sample exclusion
34
  remove = /PATH/TO/FILE/CONTAINING/ALL_SAMPLES_FROM_PREVIOUS_STEPS_TO_REMOVE.txt
35
  exclude = /PATH/TO/FILE/CONTAINING/ALL_MARKERS_FROM_PREVIOUS_STEPS_TO_EXCLUDE.txt
36
37
39
40
  41
  # Removes heterozygous haploid genotypes from the dataset.
42.
  43
  script = remove_heterozygous_haploid
```

```
46
47
 [14]
 50
 # Flags uninformative markers (with a MAF of 0). This step only flag markers.
 # You might want to exclude them later on.
52
 53
55
 script = flag_maf_zero
56
57
58
 [15]
59
 # Flags markers that fail HWE test for a p value of 1e-4 and after Bonferroni
 # correction. This step only flag markers. You might want to exclude them later
63
 64
65
 script = flag_hw
66
 # hwe = 1e-4
```

# 4.3 How to Run the Pipeline

**Warning:** Before using *pyGenClean*, be sure to activate the appropriate Python virtual environment (refer to the Linux *virtualenv* or *conda* installation section, or the *Windows* installation section for more information.

Modify the *First Configuration File* so that it suits your needs. After following the *Preprocessing Steps* described in the *Proposed Protocol* section, run the following command:

While the protocol is running, check the outputs according to the *Proposed Protocol*. If there are any problems, interrupt the analysis and make the required modifications. The completed steps can be skipped by commenting them out, while using the last output dataset as the input one for the steps that need to be done again.

Once everything was checked, locate the samples and the markers that need to be removed. For example, if the output directory from the first dataset is data\_clean\_up.YYYY-MM-DD\_HH.MM.SS, the following command will help you:

```
$ output_dir=data_clean_up.YYYY-MM-DD_HH.MM.SS
$ cat $output_dir/7_sex_check/sexcheck.list_problem_sex_ids \
> $output_dir/9_find_related_samples/ibs.discarded_related_individuals \
> $output_dir/10_check_ethnicity/ethnicity.outliers \
> $ samples_to_remove.txt
```

Then, modify the first subset section in the Second Configuration File so that it reads:

```
[11]
script = subset
remove = samples_to_remove.txt
exclude = data_clean_up.YYYY-MM-DD_HH.MM.SS/8_plate_bias/plate_bias.significant_SNPs.txt
```

Once everything was checked, run the following command to finish the data clean up pipeline:

```
output_dir=data_clean_up.YYYY-MM-DD_HH.MM.SS
run_pyGenClean \
    --conf configuration_example_2_of_2.ini \
    --bfile $output_dir/6_sample_missingness/clean_mind
```

If you want to removed the markers that were flagged in the flag\_maf\_zero and flag\_hw section, performed the following commands (using the newly created output directory data\_clean\_up.YYYY-MM-DD\_HH.MM.SS):

# 4.4 Automatic Report

The pyGenClean module creates an automatic report using LaTeX. Each of the output directory will contain a final report (named automatic\_report.tex). The report, once compiled into the PDF format, includes various quality metrics. To compile the report, perform the following commands:

```
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
$ pdflatex automatic_report.tex
```

**Note:** Executing the command three times insure that the links in the automatic report are properly formed.

## 4.4.1 Report merging

On a typical data clean up pipeline, multiple directories will be created (one for each of the parts of the pipeline). A script is provided to merge all those reports (one per data\_clean\_up.YYYY-MM-DD\_HH.MM.SS directory) into a single report. Here is the usage of this script:

```
Report Options:
--report-title TITLE The report title. [default: Genetic Data Clean Up]
--report-author AUTHOR
The current project number. [default: pyGenClean]
--report-number NUMBER
The current project author. [default: Simple Project]
--report-background BACKGROUND
Text of file containing the background section of the report.

Output Directory:
--out-dir FILE The name of the directory that will contain the final report. [default: pyGenClean_report]
```

To execute the report merging procedure, perform the following command:

```
$ pyGenClean_merge_reports --qc-dir data_clean_up.*
```

**Note:** It is possible to change the title, the author, the number or the background of the automatic report by using the --report-title, --report-author, --report-number or --report-background options, respectively.

Once again, to compile the final report, perform the following command:

```
$ pdflatex pyGenClean_report.tex
$ pdflatex pyGenClean_report.tex
$ pdflatex pyGenClean_report.tex
```

## THE ALGORITHM

All the functions used for this project are shown and explained in the following section:

# 5.1 Main pyGenClean pipeline

Here is the usage of the main pipeline.

```
$ run_pyGenClean --help
usage: run_pyGenClean [-h] [-v] [--bfile FILE] [--tfile FILE] [--file FILE]
                      [--report-title TITLE] [--report-author AUTHOR]
                      [--report-number NUMBER]
                      [--report-background BACKGROUND] --conf FILE
Runs the data clean up (pyGenClean version 1.8.0).
optional arguments:
 -h, --help
                        show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
                        The input file prefix (will find the plink binary
  --bfile FILE
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively).
                        The input file prefix (will find the plink transposed
 --tfile FILE
                        files by appending the prefix to the .tped and .tfam
                        files, respectively).
  --file FILE
                        The input file prefix (will find the plink files by
                        appending the prefix to the .ped and .fam files).
Report Options:
 --report-title TITLE The report title. [default: Genetic Data Clean Up]
 --report-author AUTHOR
                        The current project number. [default: pyGenClean]
 --report-number NUMBER
                        The current project author. [default: Simple Project]
 --report-background BACKGROUND
                        Text of file containing the background section of the
                        report.
Configuration File:
 --conf FILE
                        The parameter file for the data clean up.
```

## 5.1.1 Algorithm

For more information about the algorithms, have a look below.

## pyGenClean package

## **Subpackages**

**pyGenClean.Contamination package** For more information about how to use this module, refer to the *Contamination Module*.

## Module contents

### **Submodules**

## pyGenClean.Contamination.contamination module

```
exception pyGenClean.Contamination.contamination.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.Contamination.contamination.checkArgs (args)

Checks the arguments and options.

Parameters args (argparse.Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Checks the raw sample files.

### **Parameters**

- fam\_filename (str) the name of the FAM file.
- $raw_dirname(str)$  the name of the directory containing the raw file.

**Returns** the set of all the sample files that are compatible with the FAM file.

## Return type set

Creates an extraction file (keeping only markers on autosomes).

### **Parameters**

- bim\_filename (str) the name of the BIM file.
- **out\_prefix** (*str*) the prefix for the output file.

```
\verb|pyGenClean.Contamination.contamination.main(| argString=None)|\\
```

The main function of the module.

**Parameters argString** (list) – the options.

These are the steps:

- 1.Prints the options.
- 2. Compute frequency using Plink.
- 3. Runs bafRegress.

pyGenClean.Contamination.contamination.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type Description
bfile	string The input file prefix (will find the plink binary files by appending the prefix to the
	.bim, .bed and .fam files, respectively).
raw-dir	string Directory containing the raw data (one file per sample, where the name of the file
	(minus the extension) is the sample identification number.
colsample	string The sample column.
colmarker	string The marker column.
colbaf	string The B allele frequency column.
colab1	string The AB Allele 1 column.
colab2	string The AB Allele 2 column.
out	string The prefix of the output files.
sge	bool Use SGE for parallelization.
sge-walltin	estring The walltime for the job to run on the cluster. Do not use if you are not required
	to specify a walltime for your jobs on your cluster (e.g. 'qsub -lwalltime=1:0:0'
	on the cluster).
sge-nodes	int The number of nodes and the number of processor per nodes to use (e.g. 'qsub
	-lnodes=X:ppn=Y' on the cluster, where X is the number of nodes and Y is the
	number of processor to use. Do not use if you are not required to specify the
	number of nodes for your jobs on the cluster.
sample-per-	rinth - fEhe-nameber of sample to run for a single SGE job.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

Runs the bafRegress function.

## **Parameters**

- **filenames** (set) the set of all sample files.
- **out\_prefix** (*str*) the output prefix.
- **extract\_filename** (str) the name of the markers to extract.
- **freq\_filename** (*str*) the name of the file containing the frequency.
- options (argparse.Namespace) the other options.

Runs the bafRegress function using SGE.

#### **Parameters**

- **filenames** (set) the set of all sample files.
- **out\_prefix** (*str*) the output prefix.
- **extract filename** (str) the name of the markers to extract.
- **freq\_filename** (*str*) the name of the file containing the frequency.
- options (argparse.Namespace) the other options.

```
pyGenClean.Contamination.contamination.run_plink(in_prefix, out_prefix, ex-
tract_filename)
```

Runs Plink with the geno option.

### **Parameters**

- **in\_prefix** (*str*) the input prefix.
- **out\_prefix** (*str*) the output prefix.
- **extract\_filename** the name of the file containing markers to extract.
- extract filename str

```
pyGenClean.Contamination.contamination.safe_main()
```

A safe version of the main function (that catches ProgramError).

**pyGenClean.DupSNPs package** For more information about how to use this module, refer to the *Duplicated Markers Module*.

## **Module contents**

#### **Submodules**

## pyGenClean.DupSNPs.duplicated snps module

```
exception pyGenClean.DupSNPs.duplicated_snps.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting. pyGenClean.DupSNPs.duplicated\_snps.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Choose the best duplicates according to the completion and concordance.

## **Parameters**

• **tped** (numpy.array) – a representation of the tped of duplicated markers.

- **snps** (dict) the position of the duplicated markers in the tped.
- trueCompletion (numpy.array) the completion of each markers.
- trueConcordance (dict) the pairwise concordance of each markers.
- **prefix** (str) the prefix of the output files.

**Returns** a tuple containing the chosen indexes (dict) as the first element, the completion (numpy.array) as the second element, and the concordance (dict) as last element.

It creates two output files: prefix.chosen\_snps.info and prefix.not\_chosen\_snps.info. The first one contains the markers that were chosen for completion, and the second one, the markers that weren't.

It starts by computing the completion of each markers (dividing the number of calls divided by the total number of genotypes). Then, for each of the duplicated markers, we choose the best one according to completion and concordance (see explanation in DupSamples.duplicated\_samples.chooseBestDuplicates() for more details).

pyGenClean.DupSNPs.duplicated\_snps.computeFrequency(prefix, outPrefix)
Computes the frequency of the SNPs using Plink.

#### **Parameters**

- **prefix** (*str*) the prefix of the input files.
- **outPrefix** (*str*) the prefix of the output files.

**Returns** a dict containing the frequency of each marker.

Start by computing the frequency of all markers using Plink. Then, it reads the output file, and saves the frequency and allele information.

pyGenClean.DupSNPs.duplicated\_snps.computeStatistics(tped, tfam, snps)
Computes the completion and concordance of each SNPs.

## **Parameters**

- tped (numpy.array) a representation of the tped.
- tfam (list) a representation of the tfam
- **snps** (*dict*) the position of the duplicated markers in the tped.

**Returns** a tuple containing the completion of duplicated markers (numpy.array) as first element, and the concordance (dict) of duplicated markers, as last element.

A marker's completion is compute using this formula (where  $G_i$  is the set of genotypes for the marker i):

$$Completion_i = \frac{||g \in G_i \text{ where } g \neq 0||}{||G_i||}$$

The pairwise concordance between duplicated markers is compute as follow (where  $G_i$  and  $G_j$  are the sets of genotypes for markers i and j, respectively):

$$Concordance_{i,j} = \frac{||g \in G_i \cup G_j \text{ where } g_i = g_j \neq 0||}{||g \in G_i \cup G_j \text{ where } g \neq 0||}$$

Hence, we only computes the numerators and denominators of the completion and concordance, for future reference.

**Note:** When the genotypes are not comparable, the function tries to flip one of the genotype to see if it becomes comparable.

pyGenClean.DupSNPs.duplicated\_snps.createAndCleanTPED (tped, tfam, snps, prefix, chosenSNPs, completion, concordance, snpsToComplete, tfam-FileName, completionT, concordanceT)

Complete a TPED for duplicated SNPs.

### **Parameters**

- tped (numpy.array) a representation of the tped of duplicated markers.
- **tfam** (*list*) a representation of the tfam.
- **snps** (*dict*) the position of duplicated markers in the tped.
- **prefix** (str) the prefix of the output files.
- **chosenSNPs** (dict) the markers that were chosen for completion (including problems).
- **completion** (*numpy.array*) the completion of each of the duplicated markers.
- **concordance** (*dict*) the pairwise concordance of the duplicated markers.
- snpsToComplete(set) the markers that will be completed (excluding problems).
- **tfamFileName** (*str*) the name of the original tfam file.
- completionT (float) the completion threshold.
- **concordanceT** (*float*) the concordance threshold.

**Returns** a tuple containing the new tped after completion (numpy.array as the first element, and the index of the markers that will need to be rid of (set) as the last element.

It creates three different files:

- •prefix.zeroed\_out: contains information about markers and samples where the genotyped was zeroed out.
- •prefix.not\_good\_enough: contains information about markers that were not good enough to help in completing the chosen markers (because of concordance or completion).
- •prefix.removed\_duplicates: the list of markers that where used for completing the chosen one, hence they will be removed from the final data set.

Cycling through every genotypes of every samples of every duplicated markers, checks if the genotypes are all the same. If the chosen one was not called, but the other ones were, then we complete the chosen one with the genotypes for the others (assuming that they are all the same). If there is a difference between the genotypes, it is zeroed out for the chosen marker.

pyGenClean.DupSNPs.duplicated\_snps.createFinalTPEDandTFAM(tped, toReadPrefix, prefix, snpToRemove)

Creates the final TPED and TFAM.

## Parameters

- **tped** (numpy.array) a representation of the tped of duplicated markers.
- toReadPrefix (str) the prefix of the unique files.
- **prefix** (*str*) the prefix of the output files.
- snpToRemove(set) the markers to remove.

Starts by copying the unique markers' tfam file to prefix.final.tfam. Then, it copies the unique markers' tped file, in which the chosen markers will be appended.

The final data set will include the unique markers, the chosen markers which were completed, and the problematic duplicated markers (for further analysis). The markers that were used to complete the chosen ones are not present in the final data set.

pyGenClean.DupSNPs.duplicated\_snps.findUniques (mapF)Finds the unique markers in a MAP.

**Parameters mapF** (list) – representation of a map file.

**Returns** a dict containing unique markers (according to their genomic localisation).

pyGenClean.DupSNPs.duplicated\_snps.flipGenotype(genotype)
 Flips a genotype.

**Parameters** genotype (set) – the genotype to flip.

**Returns** the new flipped genotype (as a set)

pyGenClean.DupSNPs.duplicated\_snps.getIndexOfHeteroMen (genotypes, menIndex) Get the indexes of heterozygous men.

#### **Parameters**

- **genotypes** (numpy.array) the genotypes of everybody.
- menIndex (numpy.array) the indexes of the men (for the genotypes).

**Returns** a numpy . array containing the indexes of the genotypes to remove.

Finds the mean that have a heterozygous genotype for this current marker. Usually used on sexual chromosomes.

```
\verb|pyGenClean.DupSNPs.duplicated_snps.main| (argString=None)
```

The main function of the module..

Here are the steps for duplicated samples:

- 1. Prints the options.
- 2. Reads the map file to gather marker's position (readMAP()).
- 3. Reads the tfam file (readTFAM()).
- 4. Finds the unique markers using the map file (findUniques()).
- 5. Process the tped file. Write a file containing unique markers in prefix.unique\_snps (tfam and tped). Keep in memory information about the duplicated markers (tped) (processTPED()).
- 6.If there are no duplicated markers, the file prefix.unique\_snps (tped and tfam) are copied to prefix.final.

- 7.If there are duplicated markers, print a tped and tfam file containing the duplicated markers (printDuplicatedTPEDandTFAM()).
- 8.Computes the frequency of the duplicated markers (using Plink) and read the output file (computeFrequency()).
- 9. Computes the concordance and pairwise completion of each of the duplicated markers (computeStatistics()).
- 10.Prints the problematic duplicated markers with a file containing the summary of the statistics (completion and pairwise concordance) (printProblems()).
- 11. Print the pairwise concordance in a file (matrices) (printConcordance ()).
- 12. Choose the best duplicated markers using concordance and completion (chooseBestSnps()).
- 13. Completes the chosen markers with the remaining duplicated markers (createAndCleanTPED()).
- 14. Creates the final tped file, containing the unique markers, the chosen duplicated markers that were completed, and the problematic duplicated markers (for further analysis). This set excludes markers that were used for completing the chosen ones (createFinalTPEDandTFAM()).

pyGenClean.DupSNPs.duplicated\_snps.parseArgs (argString=None)
Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
tfile	string	The input file prefix (Plink tfile).
snp-completion-thres	h <b>float</b>	The completion threshold to consider a replicate when choosing
		the best replicates.
snp-concordance-thre	s <b>float</b> d	The concordance threshold to consider a replicate when choosing
		the best replicates.
frequency_difference	float	The maximum difference in frequency between duplicated
		markers.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.DupSNPs.duplicated\_snps.printConcordance (concordance, prefix, tped, snps)
Print the concordance.

### **Parameters**

- concordance (dict) the concordance.
- **prefix** (*str*) the prefix if the output files.
- tped (numpy.array) a representation of the tped of duplicated markers.
- **snps** (*dict*) the position of the duplicated markers in the tped.

Prints the concordance in a file, in the format of a matrix. For each duplicated markers, the first line (starting with the # signs) contains the name of all the markers in the duplicated markers set. Then a  $N \times N$  matrix is printed to file (where N is the number of markers in the duplicated marker list), containing the pairwise concordance.

pyGenClean.DupSNPs.duplicated\_snps.printDuplicatedTPEDandTFAM(tped, tfamFile-Name.outPrefix)

Print the duplicated SNPs TPED and TFAM.

#### **Parameters**

- **tped** (numpy.array) a representation of the tped of duplicated markers.
- **tfamFileName** (*str*) the name of the original tfam file.
- **outPrefix** (*str*) the output prefix.

First, it copies the original tfam into outPrefix.duplicated\_snps.tfam. Then, it prints the tped of duplicated markers in outPrefix.duplicated\_snps.tped.

Print the statistics.

#### **Parameters**

- **completion** (numpy.array) the completion of each duplicated markers.
- **concordance** (dict) the pairwise concordance between duplicated markers.
- tped (numpy.array) a representation of the tped of duplicated markers.
- snps(dict) the positions of the duplicated markers in the tped
- **frequencies** (dict) the frequency of each of the duplicated markers.
- **prefix** (str) the prefix of the output files.
- **diffFreq** (*float*) the frequency difference threshold.

**Returns** a set containing duplicated markers to complete.

Creates a summary file (prefix.summary) containing information about duplicated markers: chromosome, position, name, alleles, status, completion percentage, completion number and mean concordance.

The frequency and the minor allele are used to be certain that two duplicated markers are exactly the same marker (and not a tri-allelic one, for example).

For each duplicated markers:

- 1. Constructs the set of available alleles for the first marker.
- 2. Constructs the set of available alleles for the second marker.
- 3.If the two sets are different, but the number of alleles is the same, we try to flip one of the marker. If the two sets are the same, but the number of alleles is 1, we set the status to homo\_flip. If the markers are heterozygous, we set the status to flip.
- 4.If there is a difference in the number of alleles (one is homozygous, the other, heterozygous), and that there is on allele in common, we set the status to homo\_hetero. If there are no allele in common, we try to flip one. If the new sets have one allele in common, we set the status to homo hetero flip.
- 5.If the sets of available alleles are the same (without flip), we check the frequency and the minor alleles. If the minor allele is different, we set the status to diff\_minor\_allele. If the difference in frequencies is higher than a threshold, we set the status to diff\_frequency.
- 6.If all of the above fail, we set the status to problem.

Problems are written in the prefix.problems file, and contains the following columns: chromosome, position, name and status. This file contains all the markers with a status, as explained above.

pyGenClean.DupSNPs.duplicated\_snps.processTPED (uniqueSNPs, mapF, fileName, tfam, prefix)

Process the TPED file.

### **Parameters**

- uniqueSNPs (dict) the unique markers.
- mapF (list) a representation of the map file.
- **fileName** (str) the name of the tped file.
- **tfam** (str) the name of the tfam file.
- **prefix** (str) the prefix of all the files.

**Returns** a tuple with the representation of the tped file (numpy.array) as first element, and the updated position of the duplicated markers in the tped representation.

Copies the tfam file into prefix.unique\_snps.tfam. While reading the tped file, creates a new one (prefix.unique\_snps.tped) containing only unique markers.

pyGenClean.DupSNPs.duplicated\_snps.readMAP (fileName, prefix)
 Reads the MAP file.

**Parameters** fileName (str) – the name of the map file.

**Returns** a list of tuples, representing the map file.

While reading the map file, it saves a file (prefix.duplicated\_marker\_names) containing the name of the unique duplicated markers.

pyGenClean.DupSNPs.duplicated\_snps.readTFAM(fileName)
 Reads the TFAM file.

**Parameters fileName** (str) – the name of the tfam file.

Returns a representation the tfam file (numpy.array).

pyGenClean.DupSNPs.duplicated\_snps.runCommand(command)

Run the command in Plink.

**Parameters** command (list) – the command to run.

Tries to run a command using subprocess.

```
pyGenClean.DupSNPs.duplicated_snps.safe_main()
```

A safe version of the main function (that catches ProgramError).

**pyGenClean.DupSamples package** For more information about how to use this module, refer to the *Duplicated Samples Module*.

## **Module contents**

### **Submodules**

## pyGenClean.DupSamples.duplicated\_samples module

```
\textbf{exception} \; \texttt{pyGenClean.DupSamples.duplicated\_samples.ProgramError} \; (\textit{msg})
```

Bases: exceptions. Exception

An Exception raised in case of a problem.

Parameters msg(str) – the message to print to the user before exiting.

Append a tfile to another, creating a new one.

#### **Parameters**

- tped (numpy.array) the tped that will be appended to the other one.
- tfam (numpy.array) the tfam that will be appended to the other one.
- **prefix** (*str*) the prefix of all the files.
- toAddPrefix (str) the prefix of the final file.

Here are the steps of this function:

- 1. Writes the tped into prefix.chosen\_samples.tped.
- 2. Writes the tfam into prefix.chosen\_samples.tfam.
- 3. Copies the previous tfam (toAddPrefix.tfam) into the final tfam (prefix.final.tfam).
- 4. Append the tfam to the final tfam (prefix.final.tfam).
- 5.Reads the previous tped (toAddPrefix.tped) and append the new tped to it, writing the final one (prefix.final.tped).

Warning: The tped and tfam variables need to contain at least one sample.

Parameters args (argparse.Namespace) — a argparse.Namespace object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Choose the best duplicates according to the completion rate.

### **Parameters**

- tped (numpy.array) the tped containing the duplicated samples.
- **samples** (dict) the updated position of the samples in the tped containing only duplicated samples.
- **oldSamples** (dict) the original duplicated sample positions.
- completion (numpy.array) the completion of each of the duplicated samples.
- **concordance\_all** (*dict*) the concordance of every duplicated samples.
- **prefix** (str) the prefix of all the files.

**Returns** a tuple where the first element is a list of the chosen samples' indexes, the second on is the completion and the last one is the concordance (a map).

These are the steps to find the best duplicated sample:

- 1. Sort the list of concordances.
- 2. Sort the list of completions.
- 3. Choose the best of the concordance and put in a set.
- 4. Choose the best of the completion and put it in a set.
- 5. Compute the intersection of the two sets. If there is one sample or more, then randomly choose one sample.
- 6.If the intersection doesn't contain at least one sample, redo steps 3 and 4, but increase the number of chosen best by one. Redo step 5 and 6 (if required).

The chosen samples are written in prefix.chosen\_samples.info. The rest are written in prefix.excluded\_samples.info.

Computes the completion and concordance of each samples.

### **Parameters**

- tped (numpy.array) the tped containing duplicated samples.
- tfam (numpy.array) the tfam containing duplicated samples.
- samples (dict) the updated position of the samples in the tped containing only duplicated samples.
- oldSamples (dict) the original duplicated sample positions.
- **prefix** (str) the prefix of all the files.

**Returns** a tuple containing the completion (numpy.array) as first element, and the concordance (dict) as last element.

Reads the tped file and compute the completion for each duplicated samples and the pairwise concordance between duplicated samples.

**Note:** The completion and concordance computation excludes a markers if it's on chromosome 24 and if the sample is a female.

**Note:** A missing genotype is encoded by 0.

**Note:** No percentage is computed here, only the numbers. Percentages are computing in other functions: printStatistics(), for completion, and printConcordance(), for concordance.

## Completion

Computes the completion of none zero values (where all genotypes of at least one duplicated sample are no call [i.e. 0]). The completion of sample i (i.e.  $Comp_i$ ) is the number of genotypes that have a call divided by the total number of genotypes (the set  $G_i$ ):

$$Comp_i = \frac{||g \in G_i \text{ where } g \neq 0||}{||G_i||}$$

**Note:** We consider a genotype as being missing if the sample is a male and if a marker on chromosome 23 or 24 is heterozygous.

## Concordance

Computes the pairwise concordance between duplicated samples. For each marker, if both genotypes are not missing, we add one to the total number of compared markers. If both genotypes are the same, we add one to the number of concordant calls. We write the observed genotype difference in the file prefix.diff. The concordance between sample i and j (i.e.  $Concordance_{i,j}$ ) is the number of genotypes that are equal divided by the total number of genotypes (excluding the no calls):

$$Concordance_{i,j} = \frac{||g \in G_i \cup G_j \text{ where } g_i = g_j \neq 0||}{||g \in G_i \cup G_j \text{ where } g \neq 0||}$$

Complete a TPED for duplicate samples.

#### **Parameters**

- tped (numpy.array) the tped containing the duplicated samples.
- tfam (numpy.array) the tfam containing the duplicated samples.
- samples (dict) the updated position of the samples in the tped containing only duplicated samples.
- oldSamples (dict) the original duplicated sample positions.
- **chosenSamples** (dict) the position of the chosen samples.
- **prefix** (*str*) the prefix of all the files.
- completion (numpy.array) the completion of each of the duplicated samples.
- completionT (float) the completion threshold.
- **concordance** (dict) the pairwise concordance of each of the duplicated samples.
- concordanceT (float) the concordance threshold.

Using a tped containing duplicated samples, it creates a tped containing unique samples by completing a chosen sample with the other replicates.

**Note:** A chosen sample is not completed using bad replicates (those that don't have a concordance or a completion higher than a certain threshold). The bad replicates are written in the file prefix.not\_good\_enough.

```
pyGenClean.DupSamples.duplicated_samples.findDuplicates (tfam)
    Finds the duplicates in a TFAM.
```

**Parameters tfam** (list) – representation of a tfam file.

Returns two dict, containing unique and duplicated samples position.

pyGenClean.DupSamples.duplicated\_samples.main(argString=None)
Check for duplicated samples in a tfam/tped file.

### **Parameters** argString (list) – the options

Here are the steps for the duplicated samples step.

- 1. Prints the options.
- 2. Reads the tfam file (readTFAM()).
- 3. Separate the duplicated samples from the unique samples (findDuplicates ()).
- 4. Writes the unique samples into a file named prefix.unique\_samples.tfam (printUniqueTFAM()).
- 5.Reads the tped file and write into prefix.unique\_samples.tped the pedigree file for the unique samples (processTPED()). Saves in memory the pedigree for the duplicated samples. Updates the indexes of the duplicated samples.
- 6.If there are no duplicated samples, simply copies the files prefix.unique\_samples (tped and tfam) to prefix.final.tfam and prefix.final.tped, respectively.
- 7. Computes the completion (for each of the duplicated samples) and the concordance of each sample pairs (computeStatistics()).
- 8. Prints statistics (concordance and completion) (printStatistics()).
- 9. We print the concordance matrix for each duplicated samples (printConcordance ()).
- 10. We print the tped and the tfam file for the duplicated samples (prefix.duplicated\_samples) (printDuplicatedTPEDandTFAM()).
- 11. Choose the best of each duplicates (to keep and to complete) according to completion and concordance (chooseBestDuplicates()).
- 12.Creates a unique tped and tfam from the duplicated samples by completing the best chosen one with the other samples (createAndCleanTPED()).
- 13. Merge the two tfiles together (prefix.unique\_samples and prefix.chosen\_samples) to create the final dataset (prefix.final) (addToTPEDandTFAM()).

pyGenClean.DupSamples.duplicated\_samples.parseArgs (argString=None)
Parses the command line options and arguments.

### **Parameters argString** (list) – the options

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
tfile	string	The input file prefix (of type tfile).
sample-completion-threshold	float	The completion threshold.
sample-concordance-threshold	float	The concordance threshold.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs()*).

pyGenClean.DupSamples.duplicated\_samples.printConcordance(concordance, prefix)
Print the concordance.

- **concordance** (*dict*) the concordance of each sample.
- **prefix** (str) the prefix of all the files.

## **Returns** the concordance percentage (dict)

The concordance is the number of genotypes that are equal when comparing a duplicated samples with another one, divided by the total number of genotypes (excluding genotypes that are no call [i.e. 0]). If a duplicated sample has 100% of no calls, the concordance will be zero.

The file prefix concordance will contain  $N \times N$  matrices for each set of duplicated samples.

```
pyGenClean.DupSamples.duplicated_samples.printDuplicatedTPEDandTFAM(tped, tfam, samples, oldSamples, prefix)
```

Print the TPED and TFAM of the duplicated samples.

### **Parameters**

- tped (numpy.array) the tped containing duplicated samples.
- tfam (numpy.array) the tfam containing duplicated samples.
- **samples** (dict) the updated position of the samples in the tped containing only duplicated samples.
- oldSamples (dict) the original duplicated sample positions.
- **prefix** (str) the prefix of all the files.

The tped and tfam files are written in prefix.duplicated\_samples.tped and prefix.duplicated\_samples.tfam, respectively.

Print the statistics in a file.

## **Parameters**

- completion (numpy.array) the completion of each duplicated samples.
- **concordance** (dict) the concordance of each duplicated samples.
- **tpedSamples** (dict) the updated position of the samples in the tped containing only duplicated samples.
- oldSamples (dict) the original duplicated sample positions.
- **prefix** (str) the prefix of all the files.

**Returns** the completion for each duplicated samples, as a numpy.array.

Prints the statistics (completion of each samples and pairwise concordance between duplicated samples) in a file (prefix.summary).

```
pyGenClean.DupSamples.duplicated_samples.printUniqueTFAM(tfam, samples, prefix)
Prints a new TFAM with only unique samples.
```

- **tfam** (list) a representation of a TFAM file.
- **samples** (dict) the position of the samples
- **prefix** (str) the prefix of the output file name

pyGenClean.DupSamples.duplicated\_samples.processTPED(uniqueSamples, duplicated\_ Samples, fileName, prefix)

Process the TPED file.

#### **Parameters**

- uniqueSamples (dict) the position of unique samples.
- duplicatedSamples (collections.defaultdict) the position of duplicated samples.
- **fileName** (str) the name of the file.
- **prefix** (str) the prefix of all the files.

**Returns** a tuple containing the tped (numpy.array) as first element, and the updated positions of the duplicated samples (dict)

Reads the entire tped and prints another one containing only unique samples (prefix.unique\_samples.tped). It then creates a numpy.array containing the duplicated samples.

pyGenClean.DupSamples.duplicated\_samples.readTFAM(fileName)
 Reads the TFAM file.

**Parameters fileName** (str) – the name of the tfam file.

**Returns** a list of tuples, representing the tfam file.

**pyGenClean.Ethnicity package** For more information about how to use this module, refer to the *Ethnicity Module*.

## **Module contents**

#### Submodules

## pyGenClean.Ethnicity.check\_ethnicity module

```
class pyGenClean.Ethnicity.check_ethnicity.Dummy
```

Bases: object

exception pyGenClean.Ethnicity.check\_ethnicity.ProgramError(msg)

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.Ethnicity.check\_ethnicity.allFileExists (fileList)
Check that all file exists.

**Parameters fileList** (*list*) – the list of file to check.

Check if all the files in fileList exists.

```
pyGenClean.Ethnicity.check_ethnicity.checkArgs (args)
```

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the <code>ProgramError</code> class, a message is printed to the <code>sys.stderr</code> and the program exists with code 1.

pyGenClean. Ethnicity.check\_ethnicity.combinePlinkBinaryFiles (prefixes, outPrefix) Combine Plink binary files.

### **Parameters**

- **prefixes** (list) a list of the prefix of the files that need to be combined.
- **outPrefix** (*str*) the prefix of the output file (the combined file).

It uses Plink to merge a list of binary files (which is a list of prefixes (strings)), and create the final data set which as outPrefix as the prefix.

pyGenClean. Ethnicity.check\_ethnicity.computeFrequency (prefix, outPrefix)
Compute the frequency using Plink.

### **Parameters**

- **prefix** (*str*) the prefix of the file binary file for which we need to compute frequencies.
- **outPrefix** (str) the prefix of the output files.

Uses Plink to compute the frequency of all the markers in the prefix binary file.

pyGenClean.Ethnicity.check\_ethnicity.compute\_eigenvalues (in\_prefix, out\_prefix)
Computes the Eigenvalues using smartpca from Eigensoft.

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- **out\_prefix** (*str*) the prefix of the output files.

Creates a "parameter file" used by smartpca and runs it.

pyGenClean.Ethnicity.check\_ethnicity.createMDSFile(nb\_components, inPrefix, outPrefix, genomeFileName)

Creates a MDS file using Plink.

#### **Parameters**

- **nb\_components** (*int*) the number of component.
- **inPrefix** (*str*) the prefix of the input file.
- **outPrefix** (str) the prefix of the output file.
- **genomeFileName** (str) the name of the genome file.

Using Plink, computes the MDS values for each individual using the inPrefix, genomeFileName and the number of components. The results are save using the outPrefix prefix.

pyGenClean.Ethnicity.check\_ethnicity.createPopulationFile(inputFiles, labels, outputFileName)

Creates a population file.

- inputFiles (list) the list of input files.
- labels (list) the list of labels (corresponding to the input files).
- outputFileName (str) the name of the output file.

The inputFiles is in reality a list of tfam files composed of samples. For each of those tfam files, there is a label associated with it (representing the name of the population).

The output file consists of one row per sample, with the following three columns: the family ID, the individual ID and the population of each sample.

Creates a scree plot using smartpca results.

### **Parameters**

- in\_filename (str) the name of the input file.
- out\_filename (str) the name of the output file.
- plot\_title (str) the title of the scree plot.

```
pyGenClean.Ethnicity.check_ethnicity.excludeSNPs(inPrefix, outPrefix, exclusionFile-Name)
```

Exclude some SNPs using Plink.

#### **Parameters**

- inPrefix (str) the prefix of the input file.
- **outPrefix** (*str*) the prefix of the output file.
- exclusionFileName (str) the name of the file containing the markers to be excluded.

Using Plink, exclude a list of markers from inPrefix, and saves the results in outPrefix. The list of markers are in exclusionFileName.

```
pyGenClean.Ethnicity.check_ethnicity.extractSNPs (snpToExtractFileNames, cePrefixes, popNames, outPrefix, runSGE, options)
```

Extract a list of SNPs using Plink.

## **Parameters**

- **snpToExtractFileNames** (*list*) the name of the files which contains the markers to extract from the original data set.
- **referencePrefixes** (list) a list containing the three reference population prefixes (the original data sets).
- popNames (list) a list containing the three reference population names.
- **outPrefix** (*str*) the prefix of the output file.
- runSGE (boolean) Whether using SGE or not.
- options (argparse.Namespace) the options.

Using Plink, extract a set of markers from a list of prefixes.

pyGenClean. Ethnicity.check\_ethnicity.findflippedSNPs (frqFile1, frqFile2, outPrefix) Find flipped SNPs and flip them in the data.

- **frqFile1** (*str*) the name of the first frequency file.
- **frqFile2** (str) the name of the second frequency file.
- **outPrefix** (*str*) the prefix of the output files.

By reading two frequency files (frqFile1 and frqFile2), it finds a list of markers that need to be flipped so that the first file becomes comparable with the second one. Also finds marker that need to be removed.

A marker needs to be flipped in one of the two data set if the two markers are not comparable (same minor allele), but become comparable if we flip one of them.

A marker will be removed if it is all homozygous in at least one data set. It will also be removed if it's impossible to determine the phase of the marker (e.g. if the two alleles are A and T or C and G).

```
pyGenClean.Ethnicity.check_ethnicity.findOverlappingSNPsWithReference (prefix, reference)
erencePrefixes, reference-Populations, out-Prefix)
```

Find the overlapping SNPs in 4 different data sets.

#### **Parameters**

- **prefix** (str) the prefix of all the files.
- **referencePrefixes** (*list*) the prefix of the reference population files.
- referencePopulations (list) the name of the reference population (same order as referencePrefixes)
- **outPrefix** (str) the prefix of the output files.

It starts by reading the bim file of the source data set (prefix.bim). It finds all the markers (excluding the duplicated ones). Then it reads all of the reference population bim files (referencePrefixes.bim) and find all the markers that were found in the source data set.

It creates three output files:

- •outPrefix.ref\_snp\_to\_extract: the name of the markers that needs to be extracted from the three reference panels.
- •outPrefix.source\_snp\_to\_extract: the name of the markers that needs to be extracted from the source panel.
- •outPrefix.update\_names: a file (readable by Plink) that will help in changing the names of the selected markers in the reference panels, so that they become comparable with the source panel.

Finds the outliers of a given population.

- $mds_file_name(str)$  the name of the mds file.
- population\_file\_name (str) the name of the population file.

- ref\_pop\_name (str) the name of the reference population for which to find outliers from.
- multiplier (float) the multiplier of the cluster standard deviation to modify the strictness of the outlier removal procedure.
- $out_prefix(str)$  the prefix of the output file.

Uses the pyGenClean. Ethnicity. find\_outliers modules to find outliers. It requires the mds file created by createMDSFile() and the population file created by createPopulationFile().

pyGenClean. Ethnicity.check\_ethnicity.flipSNPs (inPrefix, outPrefix, flipFileName) Flip SNPs using Plink.

### **Parameters**

- inPrefix (str) the prefix of the input file.
- **outPrefix** (*str*) the prefix of the output file.
- **flipFileName** (str) the name of the file containing the markers to flip.

Using Plink, flip a set of markers in inPrefix, and saves the results in outPrefix. The list of markers to be flipped is in flipFileName.

pyGenClean.Ethnicity.check\_ethnicity.main(argString=None)
 The main function.

**Parameters** argString(list) – the options.

These are the steps of this module:

- 1.Prints the options.
- 2.Finds the overlapping markers between the three reference panels and the source panel (findOverlappingSNPsWithReference()).
- 3.Extract the required markers from all the data sets (extractSNPs()).
- 4.Renames the reference panel's marker names to that they are the same as the source panel (for all populations) (renameSNPs()).
- 5.Combines the three reference panels together (combinePlinkBinaryFiles ()).
- 6.Compute the frequency of all the markers from the reference and the source panels (computeFrequency()).
- 7. Finds the markers to flip in the reference panel (when compared to the source panel) (findFlippedSNPs()).
- 8.Excludes the unflippable markers from the reference and the source panels (excludeSNPs()).
- 9. Flips the markers that need flipping in their reference panel (flipSNPs()).
- 10. Combines the reference and the source panels (combinePlinkBinaryFiles ()).
- 11.Runs part of pyGenClean.RelatedSamples.find\_related\_samples on the combined data set (runRelatedness()).
- 12. Creates the mds file from the combined data set and the result of previous step (createMDSFile()).
- 13.Creates the population file (createPopulationFile()).
- 14.Plots the mds values (plotMDS()).
- 15. Finds the outliers of a given reference population (find\_the\_outliers()).
- 16.If required, computes the Eigenvalues using smartpca (compute\_eigenvalues()).

17.If required, creates a scree plot from smartpca resutls (create\_scree\_plot()).

pyGenClean.Ethnicity.check\_ethnicity.parseArgs(argString=None)

Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse.Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
bfile	string	The input file prefix (Plink binary file).
skip-ref-pops	bool	Perform the MDS computation, but skip the three reference panels.
ceu-bfile	string	The input file prefix for the CEU population (Plink binary file).
yri-bfile	string	The input file prefix for the YRI population (Plink binary file).
jpt-chb-bfile	string	The input file prefix for the JPT-CHB population (Plink binary file).
min-nb-snp	int	The minimum number of markers needed to compute IBS.
indep-pairwise	string	Three numbers: window size, window shift and the r2 threshold.
maf	string	Restrict to SNPs with MAF >= threshold.
sge	bool	Use SGE for parallelization.
sge-walltime	int	The time limit (for clusters).
sge-nodes	int	Two INTs (number of nodes and number of processor per nodes).
	int	
ibs-sge-walltime	int	The time limit (for clusters) (for IBS)
ibs-sge-nodes	int	Two INTs (number of nodes and number of processor per nodes)
	int	(for IBS).
line-per-file-for-s	sojmet	The number of line per file for SGE task array.
nb-components	int	The number of component to compute.
outliers-of	string	Finds the ouliers of this population.
multiplier	float	To find the outliers, we look for more than x times the cluster
		standard deviation.
xaxis	string	The component to use for the X axis.
yaxis	string	The component to use for the Y axis.
format	string	The output file format.
title	string	The title of the MDS plot.
xlabel	string	The label of the X axis.
ylabel	string	The label of the Y axis.
create-scree-plot	bool	Computes Eigenvalues and creates a scree plot.
scree-plot-title	string	The main title of the scree plot
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.Ethnicity.check\_ethnicity.plotMDS(inputFileName, outPrefix, populationFile-Name, options)

Plots the MDS value.

- inputFileName (str) the name of the mds file.
- **outPrefix** (*str*) the prefix of the output files.
- **populationFileName** (*str*) the name of the population file.
- options (argparse.Namespace) the options

Plots the mds value according to the inputFileName file (mds) and the populationFileName (the population file).

pyGenClean. Ethnicity.check\_ethnicity.renameSNPs (inPrefix, updateFileName, outPrefix) Updates the name of the SNPs using Plink.

## **Parameters**

- **inPrefix** (*str*) the prefix of the input file.
- updateFileName (str) the name of the file containing the updated marker names.
- **outPrefix** (*str*) the prefix of the output file.

Using Plink, changes the name of the markers in inPrefix using updateFileName. It saves the results in outPrefix.

pyGenClean.Ethnicity.check\_ethnicity.runCommand(command)
 Run a command.

Parameters command (list) - the command to run.

Tries to run a command. If it fails, raise a ProgramError. This function uses the subprocess module.

Warning: The variable command should be a list of strings (no other type).

pyGenClean. Ethnicity.check\_ethnicity.runRelatedness (inputPrefix, outPrefix, options)
Run the relatedness step of the data clean up.

### **Parameters**

- **inputPrefix** (*str*) the prefix of the input file.
- **outPrefix** (*str*) the prefix of the output file.
- options (argparse. Namespace) the options

**Returns** the prefix of the new bfile.

Runs pyGenClean.RelatedSamples.find\_related\_samples using the inputPrefix files and options options, and saves the results using the outPrefix prefix.

```
\verb|pyGenClean.Ethnicity.check_ethnicity.safe_main()|\\
```

A safe version of the main function (that catches ProgramError).

## pyGenClean.Ethnicity.find\_outliers module

```
exception pyGenClean.Ethnicity.find_outliers.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

```
Parameters msg (str) – the message to print to the user before exiting. pyGenClean.Ethnicity.find_outliers.add_custom_options (parser) Adds custom options to a parser.
```

Parameters parser (argparse. Argument Parser) – the parser to which to add options.

```
\verb|pyGenClean.Ethnicity.find_outliers.checkArgs| (args)
```

Checks the arguments and options.

Parameters args (argparse.Namespace) - a argparse.Namespace object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Finds the outliers for a given population.

#### **Parameters**

- mds (numpy.recarray) the mds information about each samples.
- centers (numpy.array) the centers of the three reference population clusters.
- **center\_info** (dict) the label of the three reference population clusters.
- **ref\_pop** (str) the reference population for which we need the outliers from.
- options (argparse.Namespace) the options

**Returns** a set of outliers from the ref\_pop population.

Perform a KMeans classification using the three centers from the three reference population cluster.

Samples are outliers of the required reference population (ref\_pop) if:

- •the sample is part of another reference population cluster;
- •the sample is an outlier of the desired reference population (ref\_pop).

A sample is an outlier of a given cluster  $C_j$  if the distance between this sample and the center of the cluster  $C_j$  ( $O_j$ ) is bigger than a constant times the cluster's standard deviation  $\sigma_j$ .

$$\sigma_j = \sqrt{\frac{\sum d(s_i, O_j)^2}{||C_j|| - 1}}$$

where  $||C_j||$  is the number of samples in the cluster  $C_j$ , and  $d(s_i, O_j)$  is the distance between the sample  $s_i$  and the center  $O_j$  of the cluster  $C_j$ .

$$d(s_i, O_j) = \sqrt{(x_{O_j} - x_{s_i})^2 + (y_{O_j} - y_{s_i})^2}$$

Using a constant equals to one ensure we remove 100% of the outliers from the cluster. Using a constant of 1.6 or 1.9 ensures we remove 99% and 95% of outliers, respectively (an error rate of 1% and 5%, respectively).

pyGenClean.Ethnicity.find\_outliers.find\_ref\_centers(mds)

Finds the center of the three reference clusters.

**Parameters mds** (numpy.recarray) – the mds information about each samples.

**Returns** a tuple with a numpy.array containing the centers of the three reference population cluster as first element, and a dict containing the label of each of the three reference population clusters.

First, we extract the mds values of each of the three reference populations. The, we compute the center of each of those clusters by computing the means.

Cluster<sub>pop</sub> = 
$$\left(\frac{\sum_{i=1}^{n} x_i}{n}, \frac{\sum_{i=1}^{n} y_i}{n}\right)$$

pyGenClean.Ethnicity.find\_outliers.main (argString=None)
 The main function.

Parameters argString(list of strings) - the options.

These are the steps of the modules:

- 1. Prints the options.
- 2.Reads the population file (read\_population\_file()).
- 3. Reads the mds file (read\_mds\_file()).
- 4. Computes the three reference population clusters' centers (find\_ref\_centers()).
- 5. Computes three clusters according to the reference population clusters' centers, and finds the outliers of a given reference population (find\_outliers()). This steps also produce three different plots.
- 6. Writes outliers in a file (prefix.outliers).

pyGenClean.Ethnicity.find\_outliers.overwrite\_tex (tex\_fn, nb\_outliers, script\_options)
Overwrites the TeX summary file with new values.

#### **Parameters**

- **tex\_fn** (str) the name of the TeX summary file to overwrite.
- **nb\_outliers** (*int*) the number of outliers.
- **script\_options** the script options.

pyGenClean.Ethnicity.find\_outliers.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
mds	string	The MDS file from Plink.
population-filestring		A population file from
		pyGenClean.Ethnicity.check_ethnicity module.
format	string	The output file format (png, ps, or pdf.
outliers-of	string	Finds the outliers of this population.
multiplier	float	To find the outliers, we look for more than $x$ times the cluster standard
		deviation.
xaxis	string	The component to use for the X axis.
yaxis	string	The component to use for the Y axis.
format	string	The output file format (png, ps, or pdf formats are available).
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.Ethnicity.find\_outliers.read\_mds\_file (file\_name, c1, c2, pops)
Reads a MDS file.

## **Parameters**

- file\_name (str) the name of the mds file.
- c1 (str) the first component to read (x axis).
- **c2** (str) the second component to read (y axis).
- **pops** (dict) the population of each sample.

**Returns** a numpy.recarray (one sample per line) with the information about the family ID, the individual ID, the first component to extract, the second component to extract and the population.

The mds file is the result of Plink (as produced by the pyGenClean. Ethnicity.check\_ethnicity module).

pyGenClean.Ethnicity.find\_outliers.read\_population\_file (file\_name)
 Reads the population file.

**Parameters file\_name** (str) – the name of the population file.

**Returns** a dict containing the population for each of the samples.

The population file should contain three columns:

- 1.The family ID.
- 2. The individual ID.
- 3. The population of the file (one of CEU, YRI, JPT-CHB or SOURCE).

The outliers are from the SOURCE population, when compared to one of the three reference population (CEU, YRI or JPT-CHB).

```
pyGenClean.Ethnicity.find_outliers.safe_main()
```

A safe version of the main function (that catches ProgramError).

# pyGenClean.Ethnicity.plot\_eigenvalues module

```
exception pyGenClean.Ethnicity.plot_eigenvalues.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting. pyGenClean. Ethnicity.plot\_eigenvalues.add\_custom\_options(parser)

Adds custom options to a parser.

Parameters parser (argparse.ArgumentParser) – the parser to which the options will be added.

```
pyGenClean.Ethnicity.plot_eigenvalues.check_args(args)
```

Checks the arguments and options.

**Parameters args** (argparse.Namespace) – an object containing the options and arguments of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exits with error code 1.

```
pyGenClean.Ethnicity.plot_eigenvalues.create_scree_plot (data, o_filename, options) Creates the scree plot.
```

## **Parameters**

- data (numpy.ndarray) the eigenvalues.
- o\_filename (str) the name of the output files.
- options (argparse.Namespace) the options.

```
pyGenClean.Ethnicity.plot_eigenvalues.main(argString=None)
```

The main function.

The purpose of this module is to plot Eigenvectors provided by the Eigensoft software.

Here are the steps of this module:

- 1.Reads the Eigenvector (read\_eigenvalues()).
- 2.Plots the Scree Plot (create scree plot ()).

pyGenClean.Ethnicity.plot\_eigenvalues.parse\_args (argString=None)

Parses the command line options and arguments.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
evec	string	The EVEC file from EIGENSOFT
scree-plot-title	string	The main title of the scree plot
out	string	The name of the output file

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see checkArgs()).

pyGenClean. Ethnicity.plot\_eigenvalues.read\_eigenvalues(i\_filename)

Reads the eigenvalues from EIGENSOFT results.

**Parameters** i\_filename (str) – the name of the input file.

Returns a numpy . ndarray array containing the eigenvalues.

pyGenClean.Ethnicity.plot\_eigenvalues.safe\_main()

A safe version of the main function (that catches ProgramError).

**pyGenClean.FlagHW package** For more information about how to use this module, refer to the *Hardy Weinberg Equilibrium Module*.

## Module contents

#### **Submodules**

# pyGenClean.FlagHW.flag\_hw module

 ${f class}$  pyGenClean.FlagHW.flag\_hw.**Dummy** 

Bases: object

exception pyGenClean.FlagHW.flag\_hw.ProgramError(msg)

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.FlagHW.flag\_hw.checkArgs(args)

Checks the arguments and options.

**Parameters args** (argparse.Namespace) – a argparse.Namespace object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.FlagHW.flag\_hw.compareBIMfiles(beforeFileName, afterFileName, outputFile-Name)

Compare two BIM files for differences.

#### **Parameters**

- **beforeFileName** (str) the name of the file before modification.
- **afterFileName** (*str*) the name of the file after modification.
- outputFileName (str) the name of the output file (containing the differences between the before and the after files.

**Returns** the number of differences between the two files.

The bim files contain the list of markers in a given dataset. The before file should have more markers than the after file. The after file should be a subset of the markers in the before file.

pyGenClean.FlagHW.flag\_hw.computeHWE (prefix, threshold, outPrefix)
Compute the Hardy Weinberg test using Plink.

## **Parameters**

- **prefix** (str) the prefix of all the files.
- **threshold** (*str*) the Hardy Weinberg threshold.
- **outPrefix** (str) the prefix of the output file.

Uses Plink to exclude markers that failed the Hardy-Weinberg test at a specified significance threshold.

```
pyGenClean.FlagHW.flag_hw.computeNumberOfMarkers (inputFileName)
Count the number of marker (line) in a BIM file.
```

**Parameters** inputFileName (str) – the name of the bim file.

Returns the number of marker in the bim file.

```
pyGenClean.FlagHW.flag_hw.main(argString=None)
The main function.
```

**Parameters argString** (list) – the options.

These are the steps performed by this module:

- 1. Prints the options of the module.
- 2. Computes the number of markers in the input file (computeNumberOfMarkers ()).
- 3.If there are no markers, the module stops.
- 4. Computes the Bonferroni therhold (0.05/nbMarkers).
- 5.Runs Plink to find failed markers with the Bonferroni threshold.
- 6.Runs Plink to find failed markers with the default threshold.
- 7. Compares the bim files for the Bonferroni threshold.
- 8. Compares the bim files for the default threshold.
- 9. Computes the "in between" marker list, which is the markers from the default threshold and the Bonferroni threshold.

```
pyGenClean.FlagHW.flag_hw.parseArgs (argString=None)
Parses the command line options and arguments.
```

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
bfile	string	The input file prefix (binary Plink file).
hwe	float	The Hardy-Weinberg equilibrium threshold.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs()*).

 $\verb"pyGenClean.FlagHW.flag_hw.runCommand" ( command )$ 

Run a command.

Parameters command (list) - the command to run.

Tries to run a command. If it fails, raise a ProgramError. This function uses the subprocess module.

Warning: The variable command should be a list of stings (no other type).

```
pyGenClean.FlagHW.flag_hw.safe_main()
```

A safe version of the main function (that catches ProgramError).

**pyGenClean.FlagMAF package** For more information about how to use this module, refer to the *Minor Allele Frequency of Zero Module*.

## **Module contents**

## **Submodules**

```
pyGenClean.FlagMAF.flag_maf_zero module
```

 $\textbf{exception} \; \texttt{pyGenClean.FlagMAF.flag\_maf\_zero.ProgramError} \; (\textit{msg})$ 

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.FlagMAF.flag\_maf\_zero.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse.Namespace) - a argparse.Namespace object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.FlagMAF.flag\_maf\_zero.computeFrequency(options)

Compute the frequency of the SNPs.

Parameters options (argparse. Namespace) – the options.

pyGenClean.FlagMAF.flag\_maf\_zero.findSnpWithMaf0 (freqFileName, prefix)

Finds SNPs with MAF of 0 and put them in a file.

## **Parameters**

- **freqFileName** (str) the name of the frequency file.
- **prefix** (str) the prefix of all the files.

Reads a frequency file from Plink, and find markers with a minor allele frequency of zero.

```
\verb|pyGenClean.FlagMAF.flag_maf_zero.main| (argString=None)
```

The main function.

**Parameters** argString(list) – the options.

These are the steps:

- 1.Prints the options.
- 2.Computes the frequencies using Plinl (computeFrequency ()).
- 3. Finds markers with MAF of 0, and saves them in a file (findSnpWithMaf0()).

```
pyGenClean.FlagMAF.flag_maf_zero.parseArgs(argString=None)
```

Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description	
bfile	string	The input file prefix (Plink binary file).	
out	string	The prefix of the output files.	

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs* ()).

```
pyGenClean.FlagMAF.flag_maf_zero.safe_main()
```

A safe version of the main function (that catches ProgramError).

**pyGenClean.HeteroHap package** For more information about how to use this module, refer to the *Heterozygous Haploid Module*.

## Module contents

## **Submodules**

# pyGenClean.HeteroHap.remove\_heterozygous\_haploid module

```
exception pyGenClean.HeteroHap.remove_heterozygous_haploid.ProgramError(msg)
Bases: exceptions.Exception
```

An Exception raised in case of a problem.

Parameters msg(str) - the message to print to the user before exiting.

pyGenClean.HeteroHap.remove\_heterozygous\_haploid.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse.Namespace) – a an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.HeteroHap.remove\_heterozygous\_haploid.main(argString=None)
The main function of this module.

**Parameters** argString(list) – the options.

pyGenClean.HeteroHap.remove\_heterozygous\_haploid.parseArgs (argString=None)
Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description	
bfile	string	The input file prefix (Plink binary file).	
out	string	The prefix of the output files.	

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.HeteroHap.remove\_heterozygous\_haploid.runPlink(options)
Sets heterozygous haploid markers to missing Plink.

**Parameters options** (argparse.Namespace) – the options.

pyGenClean.HeteroHap.remove\_heterozygous\_haploid.safe\_main()
A safe version of the main function (that catches ProgramError).

## pyGenClean.LaTeX package

## **Submodules**

## pyGenClean.LaTeX.auto\_report module

## **Parameters**

- $report_filename (str)$  the name of the file.
- **outdirname** (*str*) the name of the output directory.

# pyGenClean.LaTeX.merge\_reports module

```
exception pyGenClean.LaTeX.merge_reports.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) - the message to print to the user before exiting. pyGenClean.LaTeX.merge\_reports.add\_custom\_options(parser)

Adds custom options to a parser.

Parameters parser (argparse. ArgumentParser) – the parser to which to add options.

```
pyGenClean.LaTeX.merge_reports.checkArgs(args)
```

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

```
\verb|pyGenClean.LaTeX.merge_reports.copy_initial_files| (\textit{filename}, \textit{out\_dir})|
```

Copy the initial\_files file to the final directory.

#### **Parameters**

- filename the name of the file.
- out\_dir(str) the name of the output directory

Generates the report.

#### **Parameters**

- **out\_dir** (*str*) the output directory.
- latex\_summaries (list) the list of LaTeX summaries.
- **nb markers** (str) the final number of markers.
- **nb\_samples** (str) the final number of samples.
- options (argparse. Namespace) the list of options.

```
pyGenClean.LaTeX.merge_reports.get_final_numbers (filename, out_dir)
```

Copy the final\_files file and get the number of markers and samples.

## **Parameters**

- **filename** (str) the name of the file.
- **out\_dir** (*str*) the output directory.

Returns the final number of markers and samples

## Return type tuple

```
pyGenClean.LaTeX.merge_reports.get_summary_files (dirnames)
Gets the TeX summary files for each test.
```

**Parameters dirnames** (list) – the list of directories to merge data from.

**Returns** a list of summary file names.

#### Return type list

```
pyGenClean.LaTeX.merge_reports.main(argString=None)
```

The main function of this module.

```
Parameters argString (list of strings) – the options.
```

```
pyGenClean.LaTeX.merge_reports.merge_required_files (dirnames, out_dir)

Merges the required files from each of the directories.
```

## **Parameters**

• **dirnames** (*list*) – the list of directories to merge data from.

• out\_dir(str) - the name of the output directory.

pyGenClean.LaTeX.merge\_reports.order\_qc\_dir(dirnames)

Order the QC directory names according to their date.

**Parameters dirnames** (list) – the list of directories to merge data from.

**Returns** the sorted list of directories

Return type list

pyGenClean.LaTeX.merge\_reports.parseArgs(argString=None)

Parses the command line options and arguments.

Parameters argString(list of strings) - the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
report-author	String	The current project number.
report-number	String	The current project author.
report-background	String	Text of file containing the background section of the report.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

```
pyGenClean.LaTeX.merge_reports.safe_main()
```

A safe version of the main function (that catches ProgramError).

# pyGenClean.LaTeX.utils module

pyGenClean.LaTeX.utils.bib\_entry(\*\*kwargs)

Creates a bibliography entry.

#### **Parameters**

- name (str) the name of the entry.
- **authors** (*str*) the authors.
- **title** (*str*) the title.
- journal (str) the journal.
- year (str) the year.
- **volume** (*str*) the volume.
- number (str) the number.
- pages (str) the pages.

## **Returns** a bib entry.

pyGenClean.LaTeX.utils.format numbers (number, prefix='')

Formats number in the scientific notation for LaTeX.

## **Parameters**

- **number** (*str*) the number to format.
- **prefix** (*str*) a prefix to add before the number (e.g. "p < ").

Returns a string containing the scientific notation of the number.

## Return type str

pyGenClean.LaTeX.utils.inline\_math(text)

Creates an inline mathematical formula.

pyGenClean.LaTeX.utils.item(text)

Returns an LaTeX item (for enumerate or itemize).

**Parameters** text (str) – the text.

**Returns** a LaTeX item.

pyGenClean.LaTeX.utils.sanitize\_fig\_name (name)

Sanitizes the name of a file (for including graphics in LaTeX).

**Parameters** name (str) – the name of the file to sanitize.

**Returns** the sanitized name.

For example, if the name of the graphic file is test.1.png, the sanitized version of it for LaTeX is {test.1}.png.

pyGenClean.LaTeX.utils.sanitize\_tex(original\_text)

Sanitize TeX text.

**Parameters** original\_text (str) – the text to sanitize for LaTeX.

**Returns** the sanitize text.

Text is sanitized by following these steps:

- 1.Replaces \' by ''\textbackslash
- 2. Escapes certain characters (such as \$, \$,  $\_$ ,  $\}$ ,  $\{$ , & and #) by adding a backslash (e.g. from & to  $\setminus \&$ ).
- 3.Replaces special characters such as  $\sim$  by the LaTeX equivalent (e.g. from  $\sim$  to  $\gamma \simeq 0$ ).

pyGenClean.LaTeX.utils.section(name)

Creates a new section in LaTeX.

**Parameters** name (str) – the name of the new section.

**Returns** a LaTeX string containing a new section.

Return type str

pyGenClean.LaTeX.utils.subsection(name)

Creates a new section in LaTeX.

**Parameters** name (str) – the name of the new section.

**Returns** a LaTeX string containing a new section.

Return type str

pyGenClean.LaTeX.utils.textbf (text)

Returns bold font.

**Parameters** text (str) – the text.

**Returns** an bold font.

pyGenClean.LaTeX.utils.textit(text)

Returns italic font.

**Parameters** text (str) – the text.

Returns an italic font.

```
pyGenClean.LaTeX.utils.texttt(text)
```

Returns type writer font.

**Parameters** text (str) – the text.

**Returns** a type writer font.

pyGenClean.LaTeX.utils.wrap\_lines(content, length=80)

Wraps long lines to a maximum length of 80.

#### **Parameters**

- **content** (*str*) the content to wrap.
- **legnth** the maximum length to wrap the content.

**Returns** a string containing the wrapped content.

Return type str

#### Module contents

**pyGenClean.MarkerMissingness package** For more information about how to use this module, refer to the *Marker Missingness Module*.

## Module contents

## Submodules

## pyGenClean.MarkerMissingness.snp\_missingness module

```
exception pyGenClean.MarkerMissingness.snp_missingness.ProgramError(msg)
Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

```
pyGenClean.MarkerMissingness.snp_missingness.checkArgs(args)
```

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

```
pyGenClean.MarkerMissingness.snp_missingness.compareBIM(args)
```

Compare two BIM file.

```
Parameters args (argparse. Namespace) – the options.
```

Creates a *Dummy* object to mimic an argparse. Namespace class containing the options for the pyGenClean. PlinkUtils.compare\_bim module.

```
pyGenClean.MarkerMissingness.snp_missingness.main(argString=None)
```

The main function of the module.

```
Parameters argString(list) – the options.
```

These are the steps:

- 1. Prints the options.
- 2.Runs Plink with the geno option (runPlink()).
- 3. Compares the two bim files (before and after the Plink geno analysis) (compareBIM()).

pyGenClean.MarkerMissingness.snp\_missingness.parseArgs (argString=None)
Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description	
bfile	string	The input file prefix (Plink binary file).	
geno	float	The missingness threshold.	
out	string	The prefix of the output files.	

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs* ()).

pyGenClean.MarkerMissingness.snp\_missingness.runPlink(options)
Runs Plink with the geno option.

**Parameters options** (argparse.Namespace) – the options.

pyGenClean.MarkerMissingness.snp\_missingness.safe\_main()
A safe version of the main function (that catches ProgramError).

# pyGenClean.Misc package

# Submodules

## pyGenClean.Misc.compare\_gold\_standard module

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.Misc.compare\_gold\_standard.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse.Namespace) — a Namespace object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Check fam files for required\_samples.

```
pyGenClean.Misc.compare_gold_standard.compute_statistics(out_dir,
                                                                                    gold prefix,
                                                                        source prefix,
                                                                        same_samples, use_sge,
                                                                        final_out_prefix)
     Compute the statistics.
pyGenClean.Misc.compare_gold_standard.exclude_SNPs_samples (inPrefix,
                                                                                      outPrefix,
                                                                           exclusionSNP=None,
                                                                           keepSample=None,
                                                                           transpose=False)
     Exclude some SNPs and keep some samples using Plink.
pyGenClean.Misc.compare_gold_standard.extractSNPs (prefixes,
                                                                         snpToExtractFileNames,
                                                               outPrefixes, runSGE)
     Extract a list of SNPs using Plink.
pyGenClean.Misc.compare_gold_standard.findFlippedSNPs(goldFrqFile1, sourceAlleles,
                                                                    outPrefix)
     Find flipped SNPs and flip them in the data1.
pyGenClean.Misc.compare_gold_standard.findOverlappingSNPsWithGoldStandard(prefix,
                                                                                              gold_prefixe,
                                                                                              out_prefix,
                                                                                              use_marker_names=Fal
     Find the overlapping SNPs in 4 different data sets.
pyGenClean.Misc.compare_gold_standard.flipSNPs(inPrefix, outPrefix, flipFileName)
     Flip SNPs using Plink.
pyGenClean.Misc.compare_gold_standard.illumina_to_snp (strand, snp)
     Return the TOP strand of the marker.
     Function that takes a strand (TOP or BOT) and a SNP (e.g. : [A/C]) and returns a space separated Alle-
     leA[space]AlleleB string.
          Parameters
               • strand (str) – Either "TOP" or "BOT"
               • snp (str) - [A/C], [A/T], [G/C], [T/C], [A/G], [C/G], [T/A] or [T/G].
          Returns The nucleotide for allele A and the nucleotide for allele B (space separated)
          Return type str
pyGenClean.Misc.compare_gold_standard.keepSamples(prefixes,
                                                                           samplesToExtractFile-
                                                               Names,
                                                                         outPrefixes,
                                                                                       runSGE,
                                                               transpose=False)
     Extract a list of SNPs using Plink.
pyGenClean.Misc.compare_gold_standard.main(argString=None)
pyGenClean.Misc.compare_gold_standard.parseArgs(argString=None)
     Parses the command line options and arguments.
          Returns A numpy. Namespace object created by the argparse module. It contains the values
             of the different options.
```

Options	Type	Description
bfile	string	The input file prefix (will find the plink binary files by appending the prefix to the
		.bim, .bed and .fam files, respectively).
gold-bfi	lstring	The input file prefix (will find the plink binary files by appending the prefix to the
		.bim, .bed and .fam files, respectively) for the Gold Standard.
same-sam	p <b>štein</b> g	A file containing samples which are present in both the gold standard and the source
		panel. One line by identity and tab separated. For each row, first sample is Gold
		Standard, second is source panel.
source-m	a <b>strifig</b>	sEhe illumina marker manifest. This file should have tabs as field separator. There
		should be no lines before the main header line. There should be no lines after the
		last data line.
source-a	l steing	sA file containing the source alleles (TOP). Two columns (separated by tabulation,
		one with the marker name, the other with the alleles (separated by space). No
		header.
sge	boole	arUse SGE for parallelization.
do-not-f	l <b>b</b> opole	anDo not flip SNPs. WARNING: only use this option only if the Gold Standard was
		generated using the same chip (hence, flipping is unnecessary).
use-mark	e <b>boode</b>	and se marker names instead of (chr, position). WARNING: only use this options only
		if the Gold Standard was generated using the same chip (hence, they have the same
		marker names).
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

Reads a file containing same samples.

```
pyGenClean.Misc.compare_gold_standard.read_source_alleles (file_name)
    Reads an allele file.
```

```
pyGenClean.Misc.compare_gold_standard.read_source_manifest (file_name)
    Reads Illumina manifest.
```

pyGenClean.Misc.compare\_gold\_standard.renameSNPs (inPrefix, updateFileName, outPrefix) Updates the name of the SNPs using Plink.

```
pyGenClean.Misc.compare_gold_standard.runCommand(command)
    Run a command.
```

```
pyGenClean.Misc.compare_gold_standard.safe_main()
    A safe version of the main function (that catches ProgramError).
```

## Module contents

**pyGenClean.NoCallHetero package** For more information about how to use this module, refer to the *Clean No Call and Only Heterozygous Markers Module*.

# **Module contents**

## **Submodules**

## pyGenClean.NoCallHetero.clean\_noCall\_hetero\_snps module

An Exception raised in case of a problem.

Parameters msg(str) - the message to print to the user before exiting. pyGenClean. NoCallHetero.clean\_noCall\_hetero\_snps.checkArgs (args)

Checks the arguments and options.

**Parameters args** (argparse.Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the <code>ProgramError</code> class, a message is printed to the <code>sys.stderr</code> and the program exists with code 1.

pyGenClean.NoCallHetero.clean\_noCall\_hetero\_snps.main(argString=None)
 The main function of the module.

**Parameters argString** (list) – the options.

These are the steps:

- 1.Prints the options.
- 2.Reads the tfam and tped files and find all heterozygous and all failed markers (processTPEDandTFAM()).

pyGenClean.NoCallHetero.clean\_noCall\_hetero\_snps.parseArgs (argString=None)
Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description	
tfile	string	The input file prefix (Plink tfile).	
out	string	The prefix of the output files	

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

Process the TPED and TFAM files.

## **Parameters**

- **tped** (str) the name of the tped file.
- **tfam** (str) the name of the tfam file.
- **prefix** (str) the prefix of the output files.

Copies the original tfam file into prefix.tfam. Then, it reads the tped file and keeps in memory two sets containing the markers which are all failed or which contains only heterozygous genotypes.

It creates two output files, prefix.allFailed and prefix.allHetero, containing the markers that are all failed and are all heterozygous, respectively.

Note: All heterozygous markers located on the mitochondrial chromosome are not remove.

```
pyGenClean.NoCallHetero.clean_noCall_hetero_snps.safe_main()
    A safe version of the main function (that catches ProgramError).
```

# $py GenClean. No Call Hetero. heterozygosity\_plot\ module$

```
exception pyGenClean.NoCallHetero.heterozygosity_plot.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) - the message to print to the user before exiting. pyGenClean.NoCallHetero.heterozygosity\_plot.checkArgs(args) Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

Computes the heterozygosity ratio of samples (from tped).

pyGenClean.NoCallHetero.heterozygosity\_plot.compute\_nb\_samples (in\_prefix) Check the number of samples.

**Parameters** in\_prefix (str) – the prefix of the input file.

**Returns** the number of sample in prefix.fam.

```
pyGenClean.NoCallHetero.heterozygosity_plot.is_heterozygous(genotype)
Tells if a genotype "A B" is heterozygous.
```

**Parameters** genotype (str) – the genotype to test for heterozygosity.

**Returns** True if the genotype is heterozygous, False otherwise.

The genotype must contain two alleles, separated by a space. It then compares the first allele (genotype[0]) with the last one (genotype[-1]).

```
>>> is_heterozygous("A A")
False
>>> is_heterozygous("G C")
True
>>> is_heterozygous("0 0") # No call is not heterozygous.
False
```

pyGenClean.NoCallHetero.heterozygosity\_plot.main(argString=None)

The main function of the module.

**Parameters argString** (list) – the options.

These are the steps:

- 1.Prints the options.
- 2. Checks the number of samples in the tfam file (compute\_nb\_samples()).
- 3. Computes the heterozygosity rate (compute\_heterozygosity()).

- 4. Saves the heterozygosity data (in out.het).
- 5.Plots the heterozygosity rate (plot\_heterozygosity()).

 $\verb|pyGenClean.NoCallHetero.heterozygosity_plot.parse \verb|Args| (argString=None)|$ 

Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description	
tfile	string	The prefix of the transposed file.	
boxplot	bool	Draw a boxplot instead of a histogram.	
format	string	The output file format.	
bins	int	The number of bins for the histogram.	
xlim	float	The limit of the x axis.	
ymax	float	"The maximal Y value.	
out	string	The prefix of the output files.	

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

Plots the heterozygosity rate distribution.

#### **Parameters**

- heterozygosity (numpy.array) the heterozygosity data.
- options (argparse.Namespace) the options.

Plots a histogram or a boxplot of the heterozygosity distribution.

```
\verb|pyGenClean.NoCallHetero.heterozygosity_plot.safe_main()|\\
```

A safe version of the main function (that catches ProgramError).

Saves the heterozygosity data.

## **Parameters**

- heterozygosity (numpy.array) the heterozygosity data.
- samples (list of tuples of str) the list of samples.
- **out\_prefix** (*str*) the prefix of the output files.

**pyGenClean.PlateBias package** For more information about how to use this module, refer to the *Plate Bias Module*.

## **Module contents**

# Submodules

## pyGenClean.PlateBias.plate\_bias module

exception pyGenClean.PlateBias.plate\_bias.ProgramError (msg)

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.PlateBias.plate\_bias.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.PlateBias.plate\_bias.computeFrequencyOfSignificantSNPs (options)
Computes the frequency of the significant markers.

Parameters options (argparse. Namespace) – the options.

Extract a list of markers (significant after plate bias analysis) and computes their frequencies.

pyGenClean.PlateBias.plate\_bias.createSummaryFile (results, maf, prefix)

Creat the final summary file containing plate bias results.

#### **Parameters**

- results (list) the list of all the significant results.
- maf (dict) the minor allele frequency of the significant results.
- **prefix** (*str*) the prefix of all the files.

pyGenClean.PlateBias.plate\_bias.executePlateBiasAnalysis(options)

Execute the plate bias analysis with Plink.

Parameters options (argparse. Namespace) - the options.

pyGenClean.PlateBias.plate\_bias.extractSignificantSNPs (prefix)

Extract significant SNPs in the fisher file.

**Parameters** prefix(str) – the prefix of the input file.

Reads a list of significant markers (prefix.assoc.fisher) after plate bias analysis with Plink. Writes a file (prefix.significant\_SNPs.txt) containing those significant markers.

pyGenClean.PlateBias.plate\_bias.main(argString=None)

The main function of this module.

**Parameters argString** (list) – the options.

These are the steps:

- 1. Runs a plate bias analysis using Plink (executePlateBiasAnalysis()).
- 2. Extracts the list of significant markers after plate bias analysis (extractSignificantSNPs()).
- 3.Computes the frequency of all significant markers after plate bias analysis (computeFrequencyOfSignificantSNPs()).

pyGenClean.PlateBias.plate\_bias.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters** argString (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
bfile	string	The input file prefix (Plink binary).
loop-assoc	string	The file containing the plate organization of each samples.
pfilter	float	The significance threshold used for the plate effect.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.PlateBias.plate\_bias.runCommand(command)

Run a command.

**Parameters** command (list) – the command to run.

Tries to run a command. If it fails, raise a *ProgramError*. This function uses the subprocess module.

Warning: The variable command should be a list of strings (no other type).

```
pyGenClean.PlateBias.plate_bias.safe_main()
```

A safe version of the main function (that catches ProgramError).

**pyGenClean.PlinkUtils package** For more information about how to use this module, refer to the *Plink Utils*.

#### **Module contents**

pyGenClean.PlinkUtils.createRowFromPlinkSpacedOutput (line)

Remove leading spaces and change spaces to tabs.

Param line: a line from a Plink's report file.

Type line: str

**Returns** an array containing each field from the input line.

Plink's output files are usually created so that they are human readable. Hence, instead of separating fields using tabulation, it uses a certain amount of spaces to create columns. Using the re module, the fields are split.

```
>>> line = " CHR SNP BP A1 A2"
>>> createRowFromPlinkSpacedOutput(line)
['CHR', 'SNP', 'BP', 'A1', 'A2']
```

pyGenClean.PlinkUtils.get\_plink\_version()

Gets the Plink version from the binary.

**Returns** the version of the Plink software

Return type str

This function uses subprocess. Popen to gather the version of the Plink binary. Since executing the software to gather the version creates an output file, it is deleted.

**Warning:** This function only works as long as the version is returned as | PLINK! | NNN | (where, NNN is the version), since we use regular expression to extract the version number from the standard output of the software.

## **Submodules**

## pyGenClean.PlinkUtils.compare\_bim module

 $\textbf{exception} \; \texttt{pyGenClean.PlinkUtils.compare\_bim.ProgramError} \; (\textit{msg})$ 

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.PlinkUtils.compare\_bim.checkArgs(args)

Checks the arguments and options.

**Parameters args** (argparse. Namespace) – an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.PlinkUtils.compare\_bim.compareSNPs(before, after, outFileName)
Compares two set of SNPs.

## **Parameters**

- **before** (set) the names of the markers in the before file.
- **after** (set) the names of the markers in the after file.
- outFileName (str) the name of the output file.

Finds the difference between two sets of markers, and write them in the outFileName file.

**Note:** A *ProgramError* is raised if:

- 1. There are more markers in the after set than in the before set.
- 2. Some markers that are in the after set are not in the before set.

```
pyGenClean.PlinkUtils.compare_bim.main()
```

The main function of the module.

The purpose of this module is to find markers that were removed by Plink. When Plinks exclude some markers from binary files, there are no easy way to find the list of removed markers, except by comparing the two BIM files (before and after modification).

Here are the steps of this module:

- 1.Reads the BIM file before the modification (readBIM()).
- 2.Reads the BIM file after the modification (readBIM()).
- 3.Compares the list of markers before and after modification, and write the removed markers into a file (compareSNPs()).

**Note:** This module only finds marker that were removed (since adding markers to a BIM file usually includes a companion file to tell Plink which marker to add.

```
pyGenClean.PlinkUtils.compare_bim.parseArgs()
```

Parses the command line options and arguments.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
before	string	The name of the BIM file before modification.
after	string	The name of the BIM file after modification.
out	string	The prefix of the output files

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs()*).

 $\verb|pyGenClean.PlinkUtils.compare\_bim.readBIM| (\textit{fileName})$ 

Reads a BIM file.

**Parameters** fileName (str) – the name of the BIM file to read.

**Returns** the set of markers in the BIM file.

Reads a Plink BIM file and extract the name of the markers. There is one marker per line, and the name of the marker is in the second column. There is no header in the BIM file.

pyGenClean.PlinkUtils.compare\_bim.safe\_main()

A safe version of the main function (that catches ProgramError).

## pyGenClean.PlinkUtils.plot\_MDS module

exception pyGenClean.PlinkUtils.plot\_MDS.ProgramError (msg)

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.PlinkUtils.plot\_MDS.addCustomOptions(parser)

Adds custom options to a parser.

**Parameters** parser (argparse.parser) – the parser.

pyGenClean.PlinkUtils.plot\_MDS.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.PlinkUtils.plot\_MDS.extractData(fileName, populations)

Extract the C1 and C2 columns for plotting.

#### **Parameters**

- **fileName** (dict) the name of the MDS file.
- **populations** the population of each sample in the MDS file.

**Returns** the MDS data with information about the population of each sample. The first element of the returned tuple is a tuple. The last element of the returned tuple is the list of the populations (the order is the same as in the first element). The first element of the first tuple is the C1 data, and the last element is the C2 data.

**Note:** If a sample in the MDS file is not in the population file, it is skip.

```
pyGenClean.PlinkUtils.plot_MDS.main()
```

The main function of the module.

These are the steps:

- 1. Reads the population file (readPopulations ()).
- 2.Extract the MDS data (extractData()).
- 3. Plots the MDS data (plotMDS()).

```
pyGenClean.PlinkUtils.plot_MDS.parseArgs()
```

Parses the command line options and arguments.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
file	string	The MBS file.
population-file	string	A file containing population information.
format	string	The output file format.
title	string	The title of the MDS plot.
xlabel	string	The label of the X axis.
ylabel	string	The label of the Y axis.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.PlinkUtils.plot\_MDS.plotMDS (data, theOrders, theLabels, theColors, theSizes, the-Markers, options)

# Parameters

Plot the MDS data.

- data (list of numpy.array) the data to plot (MDS values).
- **theOrders** (*list*) the order of the populations to plot.
- **theLabels** (*list*) the names of populations to plot.
- **theColors** (*list*) the colors of the populations to plot.
- **theSizes** (*list*) the sizes of the markers for each population to plot.
- **theMarkers** (list) the type of markers for each population to plot.
- options (argparse.Namespace) the options.

pyGenClean.PlinkUtils.plot\_MDS.readPopulations(inputFileName)
 Reads a population file.

**Parameters** inputFileName (str) – the name of the population file.

Returns a dict of population for each of the samples.

```
pyGenClean.PlinkUtils.plot_MDS.safe_main()
```

A safe version of the main function (that catches ProgramError).

## pyGenClean.PlinkUtils.plot\_MDS\_standalone module

exception pyGenClean.PlinkUtils.plot\_MDS\_standalone.ProgramError(msg)
Bases: exceptions.Exception

An Exception raised in case of a problem.

**Parameters** msg(str) - the message to print to the user before exiting. pyGenClean.PlinkUtils.plot\_MDS\_standalone.checkArgs(args)
Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.PlinkUtils.plot\_MDS\_standalone.extractData (fileName, populations, population\_order, xaxis, yaxis)

Extract the C1 and C2 columns for plotting.

#### **Parameters**

- **fileName** (str) the name of the MDS file.
- **populations** (dict) the population of each sample in the MDS file.
- **population\_order** (*list*) the required population order.
- **xaxis** (str) the component to print as the X axis.
- yaxis (str) the component to print as the Y axis.

**Returns** the MDS data with information about the population of each sample. The first element of the returned tuple is a tuple. The last element of the returned tuple is the list of the populations (the order is the same as in the first element). The first element of the first tuple is the C1 data, and the last element is the C2 data.

**Note:** If a sample in the MDS file is not in the population file, it is skip.

```
pyGenClean.PlinkUtils.plot_MDS_standalone.main()
```

The main function of the module.

These are the steps:

- 1. Reads the population file (readPopulations()).
- 2.Extracts the MDS values (extractData()).
- 3. Plots the MDS values (plotMDS ()).

```
pyGenClean.PlinkUtils.plot_MDS_standalone.parseArgs()
```

Parses the command line options and arguments.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
file	string	The MBS file.
population-file	string	A file containing population information.
population-order	string	The order to print the different populations.
population-colors	string	The population point color in the plot.
population-sizes	string	The population point size in the plot.
population-markers	string	The population point marker in the plot.
population-alpha	string	The population alpha value in the plot.
format	string	The output file format.
title	string	The title of the MDS plot.
xaxis	string	The component to print on the X axis.
xlabel	string	The label of the X axis.
yaxis	string	The component to print on the Y axis.
ylabel	string	The label of the Y axis.
legend-position	string	The position of the legend.
legend-size	int	The size of the legend text.
legend-ncol	int	The number of columns for the legend.
legend-alpha	float	The alpha value of the legend.
title-fontsize	int	The font size of the title.
label-fontsize	int	The font size of the X and Y labels.
axis-fontsize	int	The font size of the X and Y axis.
adjust-left	float	Adjust the left margin.
adjust-right	float	Adjust the right margin.
adjust-top	float	Adjust the top margin.
adjust-bottom	float	Adjust the bottom margin.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.PlinkUtils.plot\_MDS\_standalone.plotMDS (data, theOrders, theLabels, theColors, theAlphas, theSizes, theMarkers, options)

Plot the MDS data.

# **Parameters**

- data (list of numpy.array) the data to plot (MDS values).
- **theOrders** (*list*) the order of the populations to plot.
- **theLabels** (*list*) the names of the populations to plot.
- **theColors** (*list*) the colors of the populations to plot.
- **theAlphas** (list) the alpha value for the populations to plot.
- theSizes (list) the sizes of the markers for each population to plot.
- **theMarkers** (*list*) the type of marker for each population to plot.
- options (argparse.Namespace) the options.

# **Parameters**

- **inputFileName** (*str*) the name of the population file.
- requiredPopulation (list) the required population.

**Returns** a dict containing the population of each samples.

```
pyGenClean.PlinkUtils.plot_MDS_standalone.safe_main()
```

A safe version of the main function (that catches ProgramError).

## pyGenClean.PlinkUtils.subset\_data module

```
exception pyGenClean.PlinkUtils.subset_data.ProgramError(msg)
```

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.PlinkUtils.subset\_data.checkArgs(args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

**Note:** Only one operation for markers and one operation for samples can be done at a time. Hence, one of --exclude or --extract can be done for markers, and one of --remove or --keep can be done for samples.

```
pyGenClean.PlinkUtils.subset_data.main(argString=None)
```

The main function of the modile.

**Parameters argString** (list) – the options.

Here are the steps:

- 1. Prints the options.
- 2.Subset the data (subset\_data()).

**Note:** The type of the output files are determined by the type of the input files (*e.g.* if the input files are binary files, so will be the output ones).

```
pyGenClean.PlinkUtils.subset_data.parseArgs(argString=None)
```

Parses the command line options and arguments.

**Parameters** argString(list) – the parameters.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
ifile	string	The input file prefix.
is-bfile	bool	The input file is a bfile
is-tfile	bool	The input file is a tfile
is-file	bool	The input file is a file
exclude	string	A file containing SNPs to exclude from the data set.
extract	string	A file containing SNPs to extract from the data set.
remove	string	A file containing samples (FID and IID) to remove from the data set.
keep	string	A file containing samples (FID and IID) to keep from the data set.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.PlinkUtils.subset\_data.runCommand(command)
 Runs a command.

Parameters command (list) - the command to run.

If there is a problem, a *ProgramError* is raised.

pyGenClean.PlinkUtils.subset\_data.safe\_main()

A safe version of the main function (that catches ProgramError).

pyGenClean.PlinkUtils.subset\_data.subset\_data(options)
Subset the data.

Parameters options (argparse.Namespace) - the options.

Subset the data using either --exclude or --extract `for markers or `--remove or keep for samples.

**pyGenClean.RelatedSamples package** For more information about how to use this module, refer to the *Related Samples Module*.

# **Module contents**

## **Submodules**

# $py GenClean. Related Samples. find\_related\_samples\ module$

An Exception raised in case of a problem.

Parameters msg(str) – the message to print to the user before exiting. pyGenClean.RelatedSamples.find\_related\_samples.checkArgs(args) Checks the arguments and options.

**Parameters args** (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.RelatedSamples.find\_related\_samples.checkNumberOfSNP (fileName, minimumNumber)

Check there is enough SNPs in the file (with minimum).

#### **Parameters**

- **fileName** (str) the name of the file.
- minimumNumber (int) the minimum number of markers that needs to be in the file.

**Returns** True if there is enough markers in the file, False otherwise.

Reads the number of markers (number of lines) in a file.

```
\label{eq:continuity} {\it pyGenClean.RelatedSamples.find\_related\_samples.extractRelatedIndividuals} (\textit{fileName}, out-Prefix, ibs2 ratio threshold) \\
```

Extract related individuals according IBS2\* ratio.

## **Parameters**

- **fileName** (str) the name of the input file.
- **outPrefix** (*str*) the prefix of the output files.
- **ibs2\_ratio\_threshold** (*float*) the ibs2 ratio threshold (tells if sample pair is related or not).

**Returns** a numpy.recarray data set containing (for each related sample pair) the ibs2 ratio, Z1, Z2 and the type of relatedness.

Reads a genome file (provided by runGenome()) and extract related sample pairs according to IBS2 ratio.

A genome file contains at least the following information for each sample pair:

- •FID1: the family ID of the first sample in the pair.
- •IID1: the individual ID of the first sample in the pair.
- •FID2: the family ID of the second sample in the pair.
- •IID2: the individual ID of the second sample in the pair.
- •**Z0:** the probability that IBD = 0.
- •**Z1:** the probability that IBD = 1.
- •**Z2:** the probability that IBD = 2.
- •**HOMHOM:** the number of IBS = 0 SNP pairs used in PPC test.
- •**HETHET:** the number of IBS = 2 het/het SNP pairs in PPC test.

The IBS2 ratio is computed using the following formula:

$$IBS2 \text{ ratio} = \frac{HETHET}{HOMHOM + HETHET}$$

If the IBS2 ratio is higher than the threshold, the samples in the pair are related. The following values help in finding the relatedness of the sample pair.

Values	Relation	Code
$0.17 \le z_0 \le 0.33$ and $0.40 \le z_1 \le 0.60$	Full-sibs	1
$0.40 \le z_0 \le 0.60$ and $0.40 \le z_1 \le 0.60$	Half-sibs or Grand-parent-Child or Uncle-Nephew	2
$z_0 \le 0.05 \text{ and } z_1 \ge 0.95 \text{ and } z_2 \le 0.05$	Parent-Child	3
$z_0 \le 0.05 \text{ and } z_1 \le 0.05 \text{ and } z_2 \ge 0.95$	Twins or Duplicated samples	4

pyGenClean.RelatedSamples.find\_related\_samples.extractSNPs(snpsToExtract, options)

Extract markers using Plink.

## **Parameters**

- **snpsToExtract** (*str*) the name of the file containing markers to extract.
- options (argparse.Namespace) the options

**Returns** the prefix of the output files.

pyGenClean.RelatedSamples.find\_related\_samples.main(argString=None)
The main function of this module.

**Parameters** argString(list) – the options.

Here are the steps for this function:

- 1.Prints the options.
- 2.Uses Plink to extract markers according to LD (selectSNPsAccordingToLD()).
- 3. Checks if there is enough markers after pruning (checkNumberOfSNP()). If not, then quits.
- 4.Extract markers according to LD (extract SNPs ()).
- 5.Runs Plink with the genome option (runGenome ()). Quits here if the user asker only for the genome file.
- 6. Finds related individuals and gets values for plotting (extractRelatedIndividuals ()).
- 7.Plots Z1 in function of IBS2 ratio for related individuals (plot\_related\_data()).
- 8.Plots Z2 in function of IBS2 ratio for related individuals (plot related data()).

 $py {\tt GenClean.RelatedSamples.find\_related\_samples.mergeGenomeLogFiles} \ (out Prefix, nb Set)$ 

Merge genome and log files together.

#### **Parameters**

- **outPrefix** (*str*) the prefix of the output files.
- **nbSet** (*int*) The number of set of files to merge together.

**Returns** the name of the output file (the genome file).

After merging, the files are deleted to save space.

pyGenClean.RelatedSamples.find\_related\_samples.parseArgs (argString=None) Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options Type		Description
bfile	string	The input file prefix (Plink binary file).
genome-only	bool	Only create the genome file.
min-nb-snp	int	The minimum number of markers needed to compute IBS
		values.
indep-pairwise	string	Three numbers: window size, window shift and the r2
		threshold.
maf	string	Restrict to SNPs with MAF >= threshold.
ibs2-ratio	float	The initial IBS2* ratio (the minimum value to show in the plot.
sge	bool	Use SGE for parallelization.
sge-walltime	int	The time limit (for clusters).
sge-nodes	int	Two INTs (number of nodes and number of processor per
	int	nodes).
line-per-file-for-sge	int	The number of line per file for SGE task array.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

## **Parameters**

Plot Z1 and Z2 in function of IBS2\* ratio.

- x (numpy.array of floats) the x axis of the plot (IBS2 ratio).
- y (numpy.array of floats) the y axis of the plot (either z1 or z2).
- code (numpy.array) the code of the relatedness of each sample pair.
- ylabel (str) the label of the y axis (either z1 or z2).
- **fileName** (str) the name of the output file.
- options (argparse. Namespace) the options.

There are four different relation codes (represented by 4 different color in the plots:

Code	Relation	Color
1	Full-sbis	#CC0000
2	Half-sibs or Grand-parent-Child or Uncle-Nephew	#0099CC
3	Parent-Child	#FF8800
4	Twins or Duplicated samples	#9933CC

Sample pairs with unknown relation are plotted using #669900 as color.

```
pyGenClean.RelatedSamples.find_related_samples.runCommand(command)
    Run a command.
```

**Parameters** command (list) – the command to run.

Tries to run a command. If it fails, raise a ProgramError. This function uses the subprocess module.

Warning: The variable command should be a list of strings (no other type).

pyGenClean.RelatedSamples.find\_related\_samples.runGenome (bfile, options)
Runs the genome command from plink.

#### **Parameters**

- **bfile** (*str*) the input file prefix.
- options (argparse.Namespace) the options.

Returns the name of the genome file.

Runs Plink with the genome option. If the user asks for SGE (options.sge is True), a frequency file is first created by plink. Then, the input files are split in options.line\_per\_file\_for\_sge and Plink is called (using the genome option) on the cluster using SGE (runGenomeSGE()). After the analysis, Plink's output files and logs are merged using mergeGenomeLogFiles().

pyGenClean.RelatedSamples.find\_related\_samples.runGenomeSGE (bfile, freqFile, nbJob, outPrefix, options)

Runs the genome command from plink, on SGE.

## **Parameters**

- **bfile** (*str*) the prefix of the input file.
- **freqFile** (*str*) the name of the frequency file (from Plink).
- **nbJob** (*int*) the number of jobs to launch.
- **outPrefix** (*str*) the prefix of all the output files.
- options (argparse.Namespace) the options.

Runs Plink with the genome options on the cluster (using SGE).

```
pyGenClean.RelatedSamples.find_related_samples.safe_main()
    A safe version of the main function (that catches ProgramError).
```

pyGenClean.RelatedSamples.find\_related\_samples.selectSNPsAccordingToLD (options) Compute LD using Plink.

Parameters options (argparse.Namespace) – the options.

**Returns** the name of the output file (from Plink).

```
pyGenClean.RelatedSamples.find_related_samples.splitFile(inputFileName, linePer-
File, outPrefix)
Split a file.
```

## **Parameters**

- **inputFileName** (*str*) the name of the input file.
- linePerFile (int) the number of line per file (after splitting).
- **outPrefix** (*str*) the prefix of the output files.

**Returns** the number of created temporary files.

Splits a file (inputFileName into multiple files containing at most linePerFile lines.

## pyGenClean.RelatedSamples.merge related samples module

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

Parameters args (argparse. Namespace) – a an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.RelatedSamples.merge\_related\_samples.main (argString=None)
 The main function of the module.

**Parameters** argString(list) – the options.

Merge related samples.

#### **Parameters**

- **file\_name** (str) the name of the input file.
- **out\_prefix** (*str*) the prefix of the output files.
- no status (boolean) is there a status column in the file?

In the output file, there are a pair of samples per line. Hence, one can find related individuals by merging overlapping pairs.

pyGenClean.RelatedSamples.merge\_related\_samples.parseArgs (argString=None)
Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
ibs-related	string	The input file containing related individuals according to IBS value.
no-status	bool	The input file doesn't have a status column.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

```
pyGenClean.RelatedSamples.merge_related_samples.safe_main()
    A safe version of the main function (that catches ProgramError).
```

**pyGenClean.SampleMissingness package** For more information about how to use this module, refer to the *Sample Missingness Module*.

#### Module contents

## **Submodules**

## pyGenClean.SampleMissingness.sample\_missingness module

exception pyGenClean.SampleMissingness.sample\_missingness.ProgramError(msg)
Bases: exceptions.Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.SampleMissingness.sample\_missingness.checkArgs (args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – a object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

 $\verb|pyGenClean.SampleMissingness.sample_missingness.main| (argString=None)$ 

The main function of the module.

**Parameters argString** (list) – the options.

These are the steps:

- 1. Prints the options.
- 2.Runs Plink with the mind option (runPlink()).

pyGenClean.SampleMissingness.sample\_missingness.parseArgs(argString=None)

Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
ifile	string	The input file prefix (either a Plink binary file or a tfile).
is-bfile	bool	The input file (ifile) is a bfile instead of a tfile.
mind	float	The missingness threshold.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.SampleMissingness.sample\_missingness.runPlink(options)
Run Plink with the mind option.

Parameters options (argparse. Namespace) – the options.

pyGenClean.SampleMissingness.sample\_missingness.safe\_main()

A safe version of the main function (that catches ProgramError).

**pyGenClean.SexCheck package** For more information about how to use this module, refer to the *Sex Check Module*.

## Module contents

## Submodules

## pyGenClean.SexCheck.baf\_lrr\_plot module

An Exception raised in case of a problem.

 $\label{eq:parameters} \textbf{Parameters} \ \textbf{msg} \ (\textit{str}) - \text{the message to print to the user before exiting.} \\ \text{pyGenClean.SexCheck.baf\_lrr\_plot.checkArgs} \ (\textit{args})$ 

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

#### **Parameters**

- **samples** (*list of tuples*) a list of tuples with the family ID as first element (str) and sample ID as last element (str).
- raw\_dir (str) the directory containing the raw files.
- options (argparse.Namespace) the options.

**Returns** a dict containing samples as key (a tuple with the family ID as first element and sample ID as last element) and the name of the raw file as element.

**Parameters** chromosome (str) – the chromosome to encode.

**Returns** the encoded chromosome.

Encodes the sexual chromosomes, from 23 and 24 to X and Y, respectively.

**Note:** Only the sexual chromosomes are encoded.

```
>>> encode_chromosome("23")
'X'
>>> encode_chromosome("24")
'Y'
>>> encode_chromosome("This is not a chromosome")
'This is not a chromosome'
```

pyGenClean.SexCheck.baf\_lrr\_plot.main(argString=None)

The main function of this module.

**Parameters argString** (list) – the options.

These are the steps:

- 1.Prints the options.
- 2.Reads the problematic samples (read\_problematic\_samples()).
- 3. Finds and checks the raw files for each of the problematic samples (check\_file\_names ()).
- 4.Plots the BAF and LRR (plot\_baf\_lrr()).

pyGenClean.SexCheck.baf\_lrr\_plot.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
problematic-samples	string	The list of sample with sex problems to plot
use-full-ids	bool	Use full sample IDs (famID and indID).
full-ids-delimiter	string	The delimiter between famID and indID.
raw-dir	string	Directory containing information about every samples (BAF and
		LRR).
format	string	The output file format (png, ps, pdf, or X11).
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see *checkArgs* ()).

pyGenClean.SexCheck.baf\_lrr\_plot.plot\_baf\_lrr(file\_names, options)

Plot BAF and LRR for a list of files.

#### **Parameters**

- **file\_names** (dict) contains the name of the input file for each sample.
- options (argparse.Namespace) the options.

Plots the BAF (B Allele Frequency) and LRR (Log R Ratio) of each samples. Only the sexual chromosome are shown.

pyGenClean.SexCheck.baf\_lrr\_plot.read\_problematic\_samples (file\_name)
 Reads a file with sample IDs.

**Parameters file\_name** (str) – the name of the file containing problematic samples after sex check.

**Returns** a set of problematic samples (tuple containing the family ID as first element and the sample ID as last element).

Reads a file containing problematic samples after sex check. The file is provided by the module <code>pyGenClean.SexCheck.sex\_check</code>. This file contains two columns, the first one being the family ID and the second one, the sample ID.

pyGenClean.SexCheck.baf\_lrr\_plot.safe\_main()

A safe version of the main function (that catches ProgramError).

# pyGenClean.SexCheck.gender\_plot module

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.SexCheck.gender\_plot.checkArgs (args)

Checks the arguments and options.

Parameters args (argparse. Namespace) – an object containing the options of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

**Parameters** chromosome (str) – the chromosome to encode.

**Returns** the encoded chromosome as int.

It changes X, Y, XY and MT to 23, 24, 25 and 26, respectively. It changes everything else as int.

If ValueError is raised, then *ProgramError* is also raised. If a chromosome as a value below 1 or above 26, a *ProgramError* is raised.

```
>>> [encode_chr(str(i)) for i in range(0, 11)]
[0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10]
>>> [encode_chr(str(i)) for i in range(11, 21)]
[11, 12, 13, 14, 15, 16, 17, 18, 19, 20]
>>> [encode_chr(str(i)) for i in range(21, 27)]
[21, 22, 23, 24, 25, 26]
>>> [encode_chr(i) for i in ["X", "Y", "XY", "MT"]]
[23, 24, 25, 26]
>>> encode_chr("27")
Traceback (most recent call last):
...
ProgramError: 27: invalid chromosome
>>> encode_chr("XX")
Traceback (most recent call last):
...
ProgramError: XX: invalid chromosome
```

 $\verb|pyGenClean.SexCheck.gender_plot.encode_gender| (\textit{gender})$ 

Encodes the gender.

**Parameters gender** (str) – the gender to encode.

**Returns** the encoded gender.

It changes 1 and 2 to Male and Female respectively. It encodes everything else to Unknown.

```
>>> encode_gender("1")
'Male'
>>> encode_gender("2")
'Female'
>>> encode_gender("0")
'Unknown'
>>> encode_gender("This is not a gender code")
'Unknown'
```

pyGenClean.SexCheck.gender\_plot.main(argString=None)

The main function of the module.

**Parameters** argString(list) – the options.

These are the steps:

- 1. Prints the options.
- 2.If there are summarized\_intensities provided, reads the files (read\_summarized\_intensities()) and skips to step 7.
- 3. Reads the bim file to get markers on the sexual chromosomes (read\_bim()).

- 4. Reads the fam file to get gender (read\_fam()).
- 5. Reads the file containing samples with sex problems (read\_sex\_problems()).
- 6.Reads the intensities and summarizes them (read\_intensities()).
- 7. Plots the summarized intensities (plot\_gender()).

pyGenClean.SexCheck.gender\_plot.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters argString** (list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description
bfile	string	The plink binary file containing information about markers and
		individuals.
intensities	string	A file containing alleles intensities for each of the markers located on
		the X and Y chromosome.
summarized-intens	istrings	The prefix of six files containing summarized chr23 and chr24
		intensities.
sex-problems	string	The file containing individuals with sex problems.
format	string	The output file format (png, ps, pdf, or X11).
xlabel	string	The label of the X axis.
ylabel	string	The label of the Y axis.
out	string	The prefix of the output files.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

```
pyGenClean.SexCheck.gender_plot.plot.gender(data, options)
    Plots the gender.
```

#### **Parameters**

- data (numpy.recarray) the data to plot.
- options (argparse.Namespace) the options.

Plots the summarized intensities of the markers on the Y chromosomes in function of the markers on the X chromosomes, with problematic samples with different colors.

Also uses print\_data\_to\_file() to save the data, so that it is faster to rerun the analysis.

```
pyGenClean.SexCheck.gender_plot.print_data_to_file (data, file_name)
    Prints data to file.
```

#### **Parameters**

- data (numpy.recarray) the data to print.
- **file\_name** (str) the name of the output file.

```
pyGenClean.SexCheck.gender_plot.read_bim(file_name)
```

Reads the BIM file to gather marker names.

**Parameters file\_name** (str) – the name of the bim file.

Returns a dict containing the chromosomal location of each marker on the sexual chromosomes.

It uses the encode\_chr() to encode the chromosomes from X and Y to 23 and 24, respectively.

pyGenClean.SexCheck.gender\_plot.read\_fam(file\_name)

Reads the FAM file to gather sample names.

**Parameters file\_name** (str) – the fam file to read.

Returns a dict containing the gender of each samples.

It uses the <code>encode gender()</code> to encode the gender from 1 `and `2 to Male and Female, respectively.

Reads the intensities from a file.

## **Parameters**

- **file\_name** (str) the name of the input file.
- needed\_markers\_chr (dict) the markers that are needed.
- needed\_samples\_gender (dict) the gender of all the samples.
- **sex\_problems** (*frozenset*) the sample with sex problem.

**Returns** a :py:class'numpy.recarray' containing the following columns (for each of the samples): sampleID, chr23, chr24, gender and status.

Reads the normalized intensities from a final report. The file must contain the following columns: SNP Name, Sample ID, X, Y and Chr. It then keeps only the required markers (those that are on sexual chromosomes (23 or 24), encoding *NaN* intensities to zero.

The final data set contains the following information for each sample:

- •sampleID: the sample ID.
- •chr23: the summarized intensities for chromosome 23.
- •chr24: the summarized intensities for chromosome 24.
- •gender: the gender of the sample (Male or Female).
- •status: the status of the sample (OK or Problem).

The summarized intensities for a chromosome  $(S_{chr})$  is computed using this formula (where  $I_{chr}$  is the set of all marker intensities on chromosome chr):

$$S_{chr} = \frac{\sum I_{chr}}{||I_{chr}||}$$

pyGenClean.SexCheck.gender\_plot.read\_sex\_problems (file\_name)

Reads the sex problem file.

**Parameters file\_name** (str) – the name of the file containing sex problems.

Returns a frozenset containing samples with sex problem.

If there is no file\_name (i.e. is None), then an empty frozenset is returned.

pyGenClean.SexCheck.gender\_plot.read\_summarized\_intensities(prefix)

Reads the summarized intensities from 6 files.

**Parameters** prefix (str) – the prefix of the six files.

**Returns** a :py:class'numpy.recarray' containing the following columns (for each of the samples): sampleID, chr23, chr24, gender and status.

Instead of reading a final report (like read\_intensities()), this function reads six files previously created by this module to gather sample information. Here are the content of the six files:

•prefix.ok\_females.txt: information about females without sex problem.

•prefix.ok\_males.txt: information about males without sex problem.

\*prefix.ok\_unknowns.txt: information about unknown gender without sex problem.

•prefix.problematic\_females.txt: information about females with sex problem.

•prefix.problematic\_males.txt: information about males with sex problem.

•prefix.problematic\_unknowns.txt: information about unknown gender with sex problem.

Each file contains the following columns: sampleID, chr23, chr24, gender and status.

The final data set contains the following information for each sample:

- •sampleID: the sample ID.
- •chr23: the summarized intensities for chromosome 23.
- •chr24: the summarized intensities for chromosome 24.
- •gender: the gender of the sample (Male or Female).
- •status: the status of the sample (OK or Problem).

The summarized intensities for a chromosome  $(S_{chr})$  is computed using this formula (where  $I_{chr}$  is the set of all marker intensities on chromosome chr):

$$S_{chr} = \frac{\sum I_{chr}}{||I_{chr}||}$$

pyGenClean.SexCheck.gender\_plot.safe\_main()

A safe version of the main function (that catches ProgramError).

### pyGenClean.SexCheck.sex\_check module

exception pyGenClean.SexCheck.sex\_check.ProgramError(msg)

Bases: exceptions. Exception

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

pyGenClean.SexCheck.sex check.checkArgs(args)

Checks the arguments and options.

**Parameters args** (argparse. Namespace) – an object containing the options of the program.

Returns True if everything was OK.

If there is a problem with an option, an exception is raised using the *ProgramError* class, a message is printed to the sys.stderr and the program exists with code 1.

pyGenClean.SexCheck.sex\_check.checkBim(fileName, minNumber, chromosome)

Checks the BIM file for chrN markers.

#### **Parameters**

- fileName (str) -
- minNumber (int) -
- chromosome (str)-

**Returns** True if there are at least minNumber markers on chromosome chromosome, False otherwise.

pyGenClean.SexCheck.sex\_check.computeHeteroPercentage (fileName)
Computes the heterozygosity percentage.

**Parameters fileName** (str) – the name of the input file.

Reads the ped file created by Plink using the recodeA options (see <code>createPedChr23UsingPlink())</code> and computes the heterozygosity percentage on the chromosome 23.

pyGenClean.SexCheck.sex\_check.computeNoCall (fileName)
Computes the number of no call.

**Parameters fileName** (str) – the name of the file

Reads the ped file created by Plink using the recodeA options (see <code>createPedChr24UsingPlink())</code> and computes the number and percentage of no calls on the chromosome 24.

#### **Parameters**

- **bfile** (*str*) the prefix of the input binary file.
- **intensities** (*str*) the file containing the intensities.
- **problematic\_samples** (*str*) the file containing the problematic samples.
- **format** (*str*) the format of the output plot.
- $out_prefix(str)$  the prefix of the output file.

Creates the gender plot of the samples using the pyGenClean.SexCheck.gender\_plot module.

pyGenClean.SexCheck.sex\_check.createLrrBafPlot (raw\_dir, problematic\_samples, format, dpi, out\_prefix)

Creates the LRR and BAF plot.

### **Parameters**

- raw\_dir (str) the directory containing the intensities.
- **problematic\_samples** (*str*) the file containing the problematic samples.
- **format** (*str*) the format of the plot.
- **dpi** the DPI of the resulting images.
- out\_prefix (str) the prefix of the output file.

Creates the LRR (Log R Ratio) and BAF (B Allele Frequency) of the problematic samples using the  $pyGenClean.SexCheck.baf\_lrr\_plot$  module.

pyGenClean.SexCheck.sex\_check.createPedChr23UsingPlink(options)
 Run Plink to create a ped format.

**Parameters options** (argparse.Namespace) – the options.

Uses Plink to create a ped file of markers on the chromosome 23. It uses the recodeA options to use additive coding. It also subsets the data to keep only samples with sex problems.

pyGenClean.SexCheck.sex\_check.createPedChr24UsingPlink (options)
 Run plink to create a ped format.

**Parameters options** (argparse.Namespace) – the options.

Uses Plink to create a ped file of markers on the chromosome 24. It uses the recodeA options to use additive coding. It also subsets the data to keep only samples with sex problems.

pyGenClean.SexCheck.sex\_check.main(argString=None)

The main function of the module.

**Parameters** argString(list) – the options.

These are the following steps:

- 1.Prints the options.
- 2. Checks if there are enough markers on the chromosome 23 (checkBim()). If not, quits here.
- 3.Runs the sex check analysis using Plink (runPlinkSexCheck()).
- 4.If there are no sex problems, then quits (readCheckSexFile()).
- $5. Creates \ the \ recoded \ file \ for \ the \ chromosome \ 23 \ (\textit{createPedChr23UsingPlink} \ ()).$
- 6.Computes the heterozygosity percentage on the chromosome 23 (computeHeteroPercentage()).
- 7.If there are enough markers on chromosome 24 (at least 1), creates the recoded file for this chromosome (createPedChr24UsingPlink()).
- 8. Computes the number of no call on the chromosome 24 (computeNoCall()).
- 9.If required, plots the gender plot (createGenderPlot()).
- 10.If required, plots the BAF and LRR plot (createLrrBafPlot()).

pyGenClean.SexCheck.sex\_check.parseArgs (argString=None)

Parses the command line options and arguments.

**Parameters** argString(list) – the options.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Туре	Description		
bfile	string	The input file prefix (Plink binary).		
femaleF	float	The female F threshold.		
maleF	float	The male F threshold.		
nbChr23	int	The minimum number of markers on chromosome 23 before computing		
		Plink's sex check.		
gender-plot	bool	Create the gender plot.		
sex-chr-intensi	t <b>stein</b> g	A file containing alleles intensities for each of the markers located on the		
		X and Y chromosome.		
gender-plot-formatting		The output file format for the gender plot.		
lrr-baf	bool	Create the LRR and BAF plot.		
lrr-baf-raw-dir	string	Directory containing information about every samples (BAF and LRR).		
lrr-baf-format	string	The output file format.		
lrr-baf-dpi	int	The pixel density of the figure(s) (DPI).		
out	string	The prefix of the output files.		

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see <code>checkArgs()</code>).

pyGenClean.SexCheck.sex\_check.readCheckSexFile (fileName, allProblemsFileName, idsFile-Name, femaleF, maleF)

Reads the Plink check-sex output file.

#### **Parameters**

- **fileName** (str) the name of the input file.
- allProblemsFileName (str) the name of the output file that will contain all the problems.
- idsFileName (str) the name of the output file what will contain samples with sex problems.
- **femaleF** (float) the F threshold for females.
- maleF (float) the F threshold for males.

Returns True if there are sex problems, False otherwise.

Reads sex check file provided by runPlinkSexCheck() (Plink) and extract the samples that have sex problems.

 $\verb"pyGenClean.SexCheck.sex_check.runCommand" (command)$ 

Run a command.

**Parameters** command (list) – the command to run.

Tries to run a command. If it fails, raise a *ProgramError*. This function uses the subprocess module.

**Warning:** The variable command should be a list of strings (no other type).

```
pyGenClean.SexCheck.sex_check.runPlinkSexCheck(options)
```

Runs Plink to perform a sex check analysis.

Parameters options (argparse.Namespace) - the options.

Uses Plink to perform a sex check analysis.

```
pyGenClean.SexCheck.sex_check.safe_main()
```

A safe version of the main function (that catches ProgramError).

#### **Submodules**

## pyGenClean.pipeline\_error module

```
exception pyGenClean.pipeline_error.ProgramError(msg)
    Bases: exceptions.Exception
```

An Exception raised in case of a problem.

**Parameters** msg(str) – the message to print to the user before exiting.

#### pyGenClean.run data clean up module

**Parameters file\_list** (list) – the names of files to check.

Returns True if all files exist, False otherwise.

```
\verb|pyGenClean.run_data_clean_up.check_args| (args)
```

Checks the arguments and options.

Parameters args (argparse.Namespace) – an object containing the options and arguments of the program.

**Returns** True if everything was OK.

If there is a problem with an option, an exception is raised using the ProgramError class, a message is printed to the sys.stderr and the program exits with error code 1.

pyGenClean.run\_data\_clean\_up.check\_input\_files (prefix, the\_type, required\_type) Check that the file is of a certain file type.

#### **Parameters**

- **prefix** (*str*) the prefix of the input files.
- **the\_type** (*str*) the type of the input files (bfile, tfile or file).
- required\_type (str) the required type of the input files (bfile, tfile or file).

Returns True if everything is OK.

Checks if the files are of the required type, according to their current type. The available types are bfile (binary), tfile (transposed) and file (normal).

```
pyGenClean.run_data_clean_up.count_markers_samples (prefix, file_type)
Counts the number of markers and samples in plink file.
```

#### **Parameters**

- **prefix** (*str*) the prefix of the files.
- **file\_type** (*str*) the file type.

Returns the number of markers and samples (in a tuple).

```
pyGenClean.run_data_clean_up.main()
```

The main function.

These are the steps performed for the data clean up:

- 1. Prints the version number.
- 2.Reads the configuration file (read\_config\_file()).
- 3. Creates a new directory with data\_clean\_up as prefix and the date and time as suffix.
- 4. Check the input file type (bfile, tfile or file).
- 5. Creates an intermediate directory with the section as prefix and the script name as suffix (inside the previous directory).
- 6. Runs the required script in order (according to the configuration file section).

**Note:** The main function is not responsible to check if the required files exist. This should be done in the run functions.

```
pyGenClean.run_data_clean_up.parse_args()
```

Parses the command line options and arguments.

**Returns** A argparse. Namespace object created by the argparse module. It contains the values of the different options.

Options	Type	Description
bfile	String	The input binary file prefix from Plink.
tfile	String	The input transposed file prefix from Plink.
file	String	The input file prefix from Plink.
conf	String	The parameter file for the data clean up.
report-author	String	The current project number.
report-number	String	The current project author.
report-background	String	Text of file containing the background section of the report.

**Note:** No option check is done here (except for the one automatically done by argparse). Those need to be done elsewhere (see checkArgs()).

```
pyGenClean.run_data_clean_up.read_config_file (filename)
    Reads the configuration file.
```

**Parameters filename** (str) – the name of the file containing the configuration.

**Returns** A tuple where the first element is a list of sections, and the second element is a map containing the configuration (options and values).

The structure of the configuration file is important. Here is an example of a configuration file:

```
[1] # Computes statistics on duplicated samples
script = duplicated_samples
[2] # Removes samples according to missingness
script = sample_missingness
[3] # Removes markers according to missingness
script = snp_missingness
[4] # Removes samples according to missingness (98%)
script = sample_missingness
mind = 0.02
[5] # Performs a sex check
script = sex_check
[6] # Flags markers with MAF=0
script = flag_maf_zero
[7] # Flags markers according to Hardy Weinberg
script = flag_hw
[8] # Subset the dataset (excludes markers and remove samples)
script = subset
exclude = .../filename
rempove = .../filename
```

Sections are in square brackets and must be integer. The section number represent the step at which the script will be run (*i.e.* from the smallest number to the biggest). The sections must be continuous.

Each section contains the script names (script variable) and options of the script (all other variables) (e.g. section 4 runs the sample\_missingness script (run\_sample\_missingness()) with option mind sets to 0.02).

Here is a list of the available scripts:

```
•duplicated_samples(run_duplicated_samples())
```

```
•duplicated_snps(run_duplicated_snps())
       •noCall_hetero_snps(run_noCall_hetero_snps())
       •sample_missingness(run_sample_missingness())
       •snp_missingness(run_snp_missingness())
       •sex check (run sex check())
       •plate bias(run plate bias())
       •contamination(run_contamination())
       •remove_heterozygous_haploid(run_remove_heterozygous_haploid())
       •find_related_samples(run_find_related_samples())
       •check_ethnicity(run_check_ethnicity())
       •flag_maf_zero(run_flag_maf_zero())
       •flag_hw(run_flag_hw())
       •subset (run subset data())
       •compare_gold_standard(run_compare_gold_standard())
pyGenClean.run_data_clean_up.run_check_ethnicity(in_prefix,
                                                              in type,
                                                                        out_prefix,
                                                    base_dir, options)
    Runs step10 (check ethnicity).
```

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.Ethnicity.check\_ethnicity</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The *pyGenClean.Ethnicity.check\_ethnicity* module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

```
pyGenClean.run_data_clean_up.run_command(command)
    Run a command using subprocesses.
```

**Parameters** command (list) – the command to run.

Tries to run a command. If it fails, raise a ProgramError.

Warning: The variable command should be a list of strings (no other type).

Compares with a gold standard data set (compare\_gold\_standard.

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.Misc.compare\_gold\_standard</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The pyGenClean.Misc.compare\_gold\_standard module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

Runs the contamination check for samples.

### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- out\_prefix (str) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

Runs step1 (duplicated samples).

# **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (tfile).

This function calls the <code>pyGenClean.DupSamples.duplicated\_samples</code> module. The required file type for this module is <code>tfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

#### **Parameters**

- in prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (tfile).

This function calls the <code>pyGenClean.DupSNPs.duplicated\_snps</code> module. The required file type for this module is tfile, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** This function creates a map file, needed for the *pyGenClean.DupSNPs.duplicated\_snps* module.

Runs step9 (find related samples).

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- out\_prefix (str) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.RelatedSamples.find\_related\_samples</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The pyGenClean.RelatedSamples.find\_related\_samples module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

```
pyGenClean.run_data_clean_up.run_flag_hw(in_prefix, in_type, out_prefix, base_dir, options)
Runs step12 (flag HW).
```

### **Parameters**

• in\_prefix (str) - the prefix of the input files.

- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.FlagHW.flag\_hw</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The *pyGenClean.FlagHW.flag\_hw* module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

```
pyGenClean.run_data_clean_up.run_flag_maf_zero(in_prefix, in_type, out_prefix, base_dir, options)
```

Runs step11 (flag MAF zero).

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.FlagMAF.flag\_maf\_zero</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The <code>pyGenClean.FlagMAF.flag\_maf\_zero</code> module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

Runs step 3 (clean no call and hetero).

#### **Parameters**

- in prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (tfile).

This function calls the <code>pyGenClean.NoCallHetero.clean\_noCall\_hetero\_snps</code> module. The required file type for this module is <code>tfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

```
pyGenClean.run_data_clean_up.run_plate_bias (in_prefix, in_type, out_prefix, base_dir, options)

Runs step7 (plate bias).
```

### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.PlateBias.plate\_bias</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The *pyGenClean.PlateBias.plate\_bias* module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

Runs step8 (remove heterozygous haploid).

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.HeteroHap.remove\_heterozygous\_haploid</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

```
pyGenClean.run_data_clean_up.run_sample_missingness(in_prefix, in_type, out_prefix, base_dir, options)

Runs step4 (clean mind).
```

# Parameters

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.

- out\_prefix (str) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.SampleMissingness.sample\_missingness</code> module. The required file type for this module is either a <code>bfile</code> or a <code>tfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

```
pyGenClean.run_data_clean_up.run_sex_check(in_prefix, in_type, out_prefix, base_dir, options)

Runs step6 (sexcheck).
```

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- out\_prefix (str) the output prefix.
- **base\_dir** (*str*) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.SexCheck.sex\_check</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The *pyGenClean.SexCheck.sex\_check* module doesn't return usable output files. Hence, this function returns the input file prefix and its type.

```
pyGenClean.run_data_clean_up.run_snp_missingness(in_prefix, in_type, out_prefix, base_dir, options)

Run step5 (clean geno).
```

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- out prefix (str) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the <code>pyGenClean.MarkerMissingness.snp\_missingness</code> module. The required file type for this module is <code>bfile</code>, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

```
pyGenClean.run_data_clean_up.run_subset_data(in_prefix, in_type, out_prefix, base_dir, op-
tions)
Subsets the data.
```

#### **Parameters**

- in\_prefix (str) the prefix of the input files.
- in\_type (str) the type of the input files.
- **out\_prefix** (*str*) the output prefix.
- base\_dir (str) the output directory.
- options (list) the options needed.

**Returns** a tuple containing the prefix of the output files (the input prefix for the next script) and the type of the output files (bfile).

This function calls the pyGenClean.pyGenClean.PlinkUtils.subset\_data module. The required file type for this module is bfile, hence the need to use the <code>check\_input\_files()</code> to check if the file input file type is the good one, or to create it if needed.

**Note:** The output file type is the same as the input file type.

```
pyGenClean.run_data_clean_up.safe_main()
```

A safe version of the main function (that catches ProgramError).

#### pyGenClean.version module

#### **Module contents**

```
pyGenClean.add_file_handler_to_root (log_fn)
Adds a file handler to the root logging.
```

**Parameters**  $\log_{n} fn(str)$  – the name of the log file.

## 5.2 Contamination Module

The usage of the standalone module is shown below:

```
$ pyGenClean_check_contamination --help
usage: pyGenClean_check_contamination [-h] [-v] --bfile FILE --raw-dir DIR
                                      [--colsample COL] [--colmarker COL]
                                      [--colbaf COL] [--colab1 COL]
                                      [--colab2 COL] [--sge]
                                      [--sge-walltime TIME]
                                      [--sge-nodes INT INT]
                                      [--sample-per-run-for-sge INT]
                                      [--out FILE]
Check BAF and LogR ratio for data contamination.
optional arguments:
 -h, --help
                       show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
 --bfile FILE
                       The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
```

```
.fam files, respectively).
Raw Data:
 --raw-dir DIR
                        Directory containing the raw data (one file per
                        sample, where the name of the file (minus the
                        extension) is the sample identification number.
  --colsample COL
                        The sample column. [default: Sample Name]
 --colmarker COL
                       The marker column. [default: SNP Name]
 --colbaf COL
                       The B allele frequency column. [default: B Allele
                       Freq]
                       The AB Allele 1 column. [default: Allele1 - AB]
 --colab1 COL
 --colab2 COL
                       The AB Allele 2 column. [default: Allele2 - AB]
SGE Options:
                       Use SGE for parallelization.
 --sae
 --sge-walltime TIME \,\,\,\,\,\,\, The walltime for the job to run on the cluster. Do not
                        use if you are not required to specify a walltime for
                       your jobs on your cluster (e.g. 'qsub
                        -lwalltime=1:0:0' on the cluster).
  --sge-nodes INT INT
                       The number of nodes and the number of processor per
                        nodes to use (e.g. 'qsub -lnodes=X:ppn=Y' on the
                        cluster, where X is the number of nodes and Y is the
                        number of processor to use. Do not use if you are not
                        required to specify the number of nodes for your jobs
                        on the cluster.
  --sample-per-run-for-sqe INT
                        The number of sample to run for a single SGE job.
                        [default: 30]
Output File:
  --out FILE
                        The prefix of the output files. [default:
                        contamination]
```

## 5.2.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest). It also uses intensities file (one per sample to test) usually provided by the genotyping platform.

### 5.2.2 Procedure

Here are the steps performed by the module:

- 1. Selects only markers located on autosomes.
- 2. Compute frequency for each autosomal markers (as required by *bafRegress*).
- 3. Execute *bafRegress* on the dataset (in parallel if required).

## 5.2.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. contamination]):

- 1. contamination.to\_extract: the autosomal markers that will be used by bafRegress.
- 2. contamination.frq: the frequency of each of the autosomal markers.

3. contamination.bafRegress: the *bafRegress* results for each of the tested sample.

## 5.2.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

• pyGenClean.Contamination.contamination

# 5.3 Duplicated Samples Module

The usage of the standalone module is shown below:

```
$ pyGenClean_duplicated_samples --help
usage: pyGenClean_duplicated_samples [-h] [-v] --tfile FILE
                                     [--sample-completion-threshold FLOAT]
                                     [--sample-concordance-threshold FLOAT]
                                     [--out FILE]
Extracts and merges duplicated samples.
optional arguments:
 -h, --help
                       show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
 --tfile FILE
                        The input file prefix (will find the tped and tfam
                        file by appending the prefix to .tped and .tfam,
                        respectively.) The duplicated samples should have the
                        same identification numbers (both family and
                        individual ids.)
Options:
 --sample-completion-threshold FLOAT
                        The completion threshold to consider a replicate when
                        choosing the best replicates and for creating the
                        composite samples. [default: 0.9]
 --sample-concordance-threshold FLOAT
                        The concordance threshold to consider a replicate when
                        choosing the best replicates and for creating the
                        composite samples. [default: 0.97]
Output File:
  --out FILE
                        The prefix of the output files. [default: dup_samples]
```

# 5.3.1 Input Files

This module uses PLINK's transposed pedfile format (tped and tfam files). For this step to work, the duplicated samples must have the same identification (family and sample ID). One should keep a file containing the original identifications before modifying the dataset accordingly.

### 5.3.2 Procedure

Here are the steps performed by the module:

- 1. Reads the tfam file to find duplicated samples.
- 2. Separates the duplicated samples from the unique samples.
- 3. Writes the unique samples into a file.
- 4. Reads the tped file and write the pedigree file for the unique samples. Saves in memory the pedigree for the duplicated samples. Updates the indexes of the duplicated samples.
- 5. If there are no duplicated samples, simply create the final file. Stop here.
- 6. Computes the completion (for each of the duplicated samples) and the concordance of each sample pairs.
- 7. Prints statistics (concordance and completion).
- 8. Prints the concordance matrix for each duplicated samples.
- 9. Prints the tped and the tfam file for the duplicated samples.
- 10. Chooses the best of each duplicates (to keep and to complete) according to completion and concordance.
- 11. Creates a unique tped and tfam from the duplicated samples by completing the best chosen one with the other samples.
- 12. Creates the final dataset.

## 5.3.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. dup\_samples]):

- 1. No output file is created.
- 2. No output file is created.
- 3. Only one of the two PLINK's transposed pedfiles is created:
  - dup\_samples.unique\_samples.tfam: the tfam file containing only the unique samples from the original dataset.
- 4. The second of the two PLINK's transposed pedfiles is created (see previous step):
  - dup\_samples.unique\_samples.tped: the tped file containing only the unique samples from the
    original dataset.
- 5. If there are not duplicated samples, the final PLINK's transposed pedfiles are created (if not, continue tu next step):
  - dup\_samples.final: the tfam and tped final files.
- 6. One result file is created:
  - dup\_samples.diff: a file containing the differences in the genotypes for each pair of duplicated samples. Each line contains the following information: name the name of the marker, famID the family ID, indID the individual ID, dupIndex\_1 the index of the first duplicated sample in the original dataset (since the identification of each duplicated samples are the same), dupIndex\_2 the index of the second duplicated sample in the original dataset, genotype\_1 and genotype\_2, the genotype of the first and second duplicated samples for the current marker, respectively.
- 7. One result file is created:
  - dup\_samples.summary: the completion and summarized concordance of each duplicated sample pair. The first two columns (origindex and dupindex are the indexes of the duplicated sample in the original and duplicated transposed pedfiles, respectively.

- 8. One result file is created
  - dup\_samples.concordance: the pairwise concordance of each duplicated samples.
- 9. One set of PLINK's transposed pedfiles:
  - dup\_samples.duplicated\_samples: the dataset containing the duplicated samples from the original dataset.
- 10. Two output files are created:
  - dup\_samples.chosen\_samples.info: a list of samples that were chosen for completion according to their completion and summarized concordance with their duplicates. Again, their indexes in the original and duplicated transposed pedfiles are saved (the two first columns).
  - dup\_samples.excluded\_samples.info: a list of samples that were not chosen for completion according to their completion and summarized concordance with their duplicates.
- 11. Multiple output files are created, along with on set of PLINK's transposed pedfiles:
  - dup\_samples.zeroed\_out: the list of genotypes that were zeroed out during completion of the chosen duplicated samples.
  - dup\_samples.not\_good\_enough: the list of samples that were not good enough (according to completion and concordance) to create the composite sample (the chosen duplicated samples).
- 12. Two sets of PLINK's transposed pedfiles are created:
  - dup\_samples.chosen\_samples: a transposed pedfiles containing the completed chosen samples.
  - dup\_samples.final: the final dataset.

# 5.3.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

• pyGenClean.DupSamples.duplicated\_samples

# 5.4 Duplicated Markers Module

The usage of the standalone module is shown below:

```
$ pyGenClean_duplicated_snps --help
usage: pyGenClean_duplicated_snps [-h] [-v] --tfile FILE
                                  [--snp-completion-threshold FLOAT]
                                  [--snp-concordance-threshold FLOAT]
                                  [--frequency_difference FLOAT] [--out FILE]
Extracts and merges duplicated markers.
optional arguments:
 -h, --help
                       show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
  --tfile FILE
                        The input file prefix (will find the tped and tfam
                        file by appending the prefix to .tped and .tfam,
                        respectively. A .map file is also required.
```

```
Options:

--snp-completion-threshold FLOAT

The completion threshold to consider a replicate when choosing the best replicates and for composite creation. [default: 0.9]

--snp-concordance-threshold FLOAT

The concordance threshold to consider a replicate when choosing the best replicates and for composite creation. [default: 0.98]

--frequency_difference FLOAT

The maximum difference in frequency between duplicated markers [default: 0.05]

Output File:

--out FILE

The prefix of the output files. [default: dup_snps]
```

## 5.4.1 Input Files

This module uses PLINK's transposed pedfile format (tped and tfam files). It also requires a map file to speed up the process of finding the duplicated markers, so that the tped file is not read.

### 5.4.2 Procedure

Here are the steps performed by the module:

- 1. Reads the map file to gather marker's position.
- 2. Reads the tfam file.
- 3. Finds the unique markers using the map file.
- 4. Process the tped file, finding unique and duplicated markers according to chromosomal positions.
- 5. If there are no duplicated markers, stop here.
- 6. If there are duplicated markers, print a tped and tfam file containing the duplicated markers.
- 7. Computes the frequency of the duplicated markers (using Plink) and read the output file.
- 8. Computes the concordance and pairwise completion of each of the duplicated markers.
- 9. Prints the problematic duplicated markers with a file containing the summary of the statistics (completion and pairwise concordance).
- 10. Print the pairwise concordance in a file (matrices).
- 11. Choose the best duplicated markers using concordance and completion.
- 12. Completes the chosen markers with the remaining duplicated markers.
- 13. Creates the final tped file, containing the unique markers, the chosen duplicated markers that were completed, and the problematic duplicated markers (for further analysis). This set excludes markers that were used for completing the chosen ones.

## 5.4.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. dup\_snps]):

- 1. If the marker names are not unique, one file is created:
  - dup\_snps.duplicated\_marker\_names: a list of marker names and chromosomal positions for each marker with duplicated names. This file is not created if there are no markers with duplicated names.
- 2. No files are created.
- 3. No files are created.
- 4. One set of transposed pedfiles.
  - dup\_snps.unique\_snps: the transposed pedfiles containing the unique markers (according to chromosomal positions).
- 5. If there are no duplicated markers (according to chromosomal positions), the transposed pedfiles created at the previous step are copied to a new set of transposed pedfiles.
  - dup\_snps.final: the final transposed pedfiles.
- 6. One set of transposed pedfiles.
  - dup\_snps.duplicated\_snps: the transposed pedfiles containing the duplicated markers (according to chromosomal positions).
- 7. One set of PLINK's result file.
  - dup\_snps.duplicated\_snps: the file with the frq extension contains the frequency of each duplicated markers.
- 8. No files are created.
- 9. Multiple files are created.
  - dup\_snps.summary: contains the completion and pairwise concordance between duplicated markers.
  - dup\_snps.problems: contains the list of markers with "problems" that can't be used for further completion of the duplicated markers. (either a difference in MAF [diff\_frequency], a difference in the minor allele [diff\_minor\_allele], two homozygous markers where one is flipped [homo\_flip], markers with flipped alleles [flip], one marker is homozygous, the other is heterozygous [homo\_hetero], one marker is homozygous, the other is heterozygous but one is flipped [homo\_hetero\_flip] or any other problem [problem].
- 10. One output file is created.
  - dup\_snps.concordance: a matrix containing a pairwise concordance comparison for each duplicated markers.
- 11. Two output files are created.
  - dup\_snps.chosen\_snps.info: the list of duplicated markers that were chosen for completion with the other markers (the best of the duplicated markers, according to concordance and completion).
  - dup\_snps.not\_chosen\_snps.info: the list of duplicated markers that were not chosen for completion with the other markers.
- 12. Multiple output files are created along with a set of transposed pedfiles.
  - dup\_snps.zeroed\_out: the list of genotypes that were zeroed out while completing the chosen duplicated markers with the others. Each line contains the id of the sample and the name of the marker that was zeroed out.
  - dup\_snps.not\_good\_enough: the list of markers that were not good enough (according to concordance and completion) to complete the best of the duplicated markers.
  - dup\_snps.removed\_duplicates: the list of markers that were used to complete the chosen duplicated markers. Those markers were removed from the dataset.

- dup\_snps.chosen\_snps: the transposed pedfiles containing the completed chosen duplicated markers (a composite of all the duplicated markers that were good enough).
- 13. On set of transposed pedfiles.
  - dup\_snps.final: the final dataset, containing the unique markers, the chosen duplicated markers
    that were complete (composite) and the duplicated markers that weren't completed because of various
    problems.

## 5.4.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

```
• pyGenClean.DupSNPs.duplicated_snps
```

# 5.5 Clean No Call and Only Heterozygous Markers Module

The usage of the standalone module is shown below:

# 5.5.1 Input Files

This module uses the transposed pedfile format separated by tabulations (tped and tfam files) for the source data set (the data of interest).

### 5.5.2 Procedure

Here are the steps performed by the module:

1. Reads the transposed pedfiles and extract markers which are all heterozygous or all failed from the dataset.

## 5.5.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. clean\_noCall\_hetero\_snps]):

1. One transposed pedfiles and two custom output files are created:

- clean\_noCall\_hetero: the transposed pedfiles separated by tabulations containing the new dataset, with markers which are all heterozygous or all failed were removed from the initial dataset.
- clean\_noCall\_hetero.allHetero: the list of markers which were all heterozygous in the initial dataset.
- clean\_noCall\_hetero.allFailed: the list of markers which were all failed in the initial dataset.

## 5.5.4 The Plots

A standalone script has been created so that heterozygosity rates can be visualized using histograms or box plots. This script has not yet been included in the automated pipeline, so it needs to be started manually.

```
$ pyGenClean_heterozygosity_plot --help
usage: pyGenClean_heterozygosity_plot [-h] [-v] --tfile FILE [--boxplot]
                                       [--format FORMAT] [--bins INT]
                                       [--xlim FLOAT FLOAT] [--ymax FLOAT]
                                       [--out FILE]
Plots the distribution of the heterozygosity ratio.
optional arguments:
 -h, --help
                     show this help message and exit
  -v, --version
                     show program's version number and exit
Input File:
  --tfile FILE
                      The prefix of the transposed file
Options:
                      Draw a boxplot instead of a histogram.
 --boxplot
 --format FORMAT
                     The output file format (png, ps, pdf, or X11 formats are
                      available). [default: png]
                      The number of bins for the histogram. [default: 100]
 --bins INT
  --xlim FLOAT FLOAT The limit of the x axis (floats).
                      The maximal Y value.
 --ymax FLOAT
Output File:
  --out FILE
                      The prefix of the output files. [default:
                      heterozygosity]
```

The script produces either a histogram (see the *Heterozygosity rate histogram* figure) or a box plot (see the *Heterozygosity rate box plot* figure) of samples' heterozygosity rates.

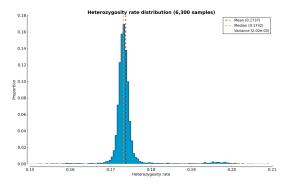


Fig. 5.1: Heterozygosity rate histogram

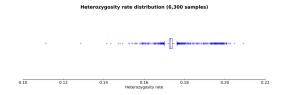


Fig. 5.2: Heterozygosity rate box plot

# 5.5.5 The Algorithm

For more information about the actual algorithms and source codes, refer to the following pages.

- pyGenClean.NoCallHetero.clean\_noCall\_hetero\_snps
- pyGenClean.NoCallHetero.heterozygosity\_plot

# 5.6 Sample Missingness Module

The usage of the standalone module is shown below:

```
$ pyGenClean_sample_missingness --help
usage: pyGenClean_sample_missingness [-h] [-v] --ifile FILE [--is-bfile]
                                     [--mind FLOAT] [--out FILE]
Computes sample missingness using Plink.
optional arguments:
 -h, --help show this help message and exit
 -v, --version show program's version number and exit
Input File:
 --ifile FILE
                The input file prefix (by default, this input file must be a
                tfile. If options --is-bfile is used, the input file must be
                 a bfile).
Options:
 --is-bfile
                The input file (--ifile) is a bfile instead of a tfile.
 --mind FLOAT
                The missingness threshold (remove samples with more than x
                percent missing genotypes). [Default: 0.100]
Output File:
 --out FILE
                The prefix of the output files (wich will be a Plink binary
                 file). [default: clean_mind]
```

## 5.6.1 Input Files

This module uses either PLINK's binary file format (bed, bim and fam files) or the transposed pedfile format separated by tabulations (tped and tfam) for the source data set (the data of interest).

## 5.6.2 Procedure

Here are the steps performed by the module:

1. Uses Plink to remove samples with a high missing rate (above a user defined threshold).

## 5.6.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. clean\_geno]):

- 1. One set of PLINK's output and result files:
  - clean\_mind: the new dataset with samples having a high missing rate removed (above a user defined threshold). The file clean\_mind.irem contains a list of samples that were removed.

## 5.6.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

• pyGenClean.SampleMissingness.sample\_missingness

# 5.7 Marker Missingness Module

The usage of the standalone module is shown below:

```
$ pyGenClean_snp_missingness --help
usage: pyGenClean_snp_missingness [-h] [-v] --bfile FILE [--geno FLOAT]
                                  [--out FILE]
Computes marker missingness using Plink.
optional arguments:
 -h, --help show this help message and exit
 -v, --version show program's version number and exit
Input File:
  --bfile FILE
                 The input file prefix (will find the plink binary files by
                 appending the prefix to the .bim, .bed and .fam files,
                 respectively.
Options:
 --geno FLOAT
                The missingness threshold (remove SNPs with more than x
                 percent missing genotypes). [Default: 0.020]
Output File:
 --out FILE
                 The prefix of the output files. [default: clean_geno]
```

## 5.7.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

## 5.7.2 Procedure

Here are the steps performed by the module:

- 1. Runs Plink to remove markers with a missing rate above a user defined threshold.
- 2. Finds the markers that were removed (those that have a missing rate above the user defined threshold.

## 5.7.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. clean\_geno]):

- 1. One set of Plink output files:
  - clean\_geno.fam: the dataset with markers having a high missing rate removed (according to a user defined threshold).
- 2. One custom file:
  - clean\_geno.removed\_snps: a list of markers that have a high missing rate (above a user defined threshold).

# 5.7.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

• pyGenClean.MarkerMissingness.snp missingness

## 5.8 Sex Check Module

The usage of the standalone module is shown below:

```
$ pyGenClean_sex_check --help
usage: pyGenClean_sex_check [-h] [-v] --bfile FILE [--femaleF FLOAT]
                            [--maleF FLOAT] [--nbChr23 INT] [--gender-plot]
                            [--sex-chr-intensities FILE]
                            [--gender-plot-format FORMAT] [--lrr-baf]
                            [--lrr-baf-raw-dir DIR] [--lrr-baf-format FORMAT]
                            [--out FILE]
Check sample's gender using Plink.
optional arguments:
 -h, --help
                        show this help message and exit
 -v, --version
                        show program's version number and exit
Input File:
 --bfile FILE
                        The input file prefix (will find the Plink binary
                        files by appending the prefix to the .bed, .bim, and
                        .fam files, respectively.
Options:
 --femaleF FLOAT
                        The female F threshold. [default: < 0.300000]
 --maleF FLOAT
                        The male F threshold. [default: > 0.700000]
 --nbChr23 INT
                        The minimum number of markers on chromosome 23 before
```

```
computing Plink's sex check [default: 50]
Gender Plot:
 --gender-plot
                        Create the gender plot (summarized chr Y intensities
                        in function of summarized chr X intensities) for
                        problematic samples.
  --sex-chr-intensities FILE
                        A file containing alleles intensities for each of the
                        markers located on the X and Y chromosome for the
  --gender-plot-format FORMAT
                        The output file format for the gender plot (png, ps,
                        pdf, or X11 formats are available). [default: pnq]
LRR and BAF Plot:
  --lrr-baf
                        Create the LRR and BAF plot for problematic samples
  --lrr-baf-raw-dir DIR
                        Directory or list of directories containing
                        information about every samples (BAF and LRR).
  --lrr-baf-format FORMAT
                        The output file format for the LRR and BAF plot (png,
                        ps, pdf, or X11 formats are available). [default: png]
Output File:
 --out FILE
                        The prefix of the output files (which will be a Plink
                        binary file. [default: sexcheck]
```

# 5.8.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

If the option of generating the gender plot is used, a file containing intensities information about each markers on the sexual chromosomes is required. This file (which could be gzipped) should contain at least the following columns:

- Sample ID: the unique sample id for each individual.
- SNP Name: the unique name of each markers.
- Chr: the name of the chromosome on which each marker is located.
- X: the intensities of the first allele of each marker.
- Y: the intensities of the second allele of each marker.

If the options of generating the BAF and LRR values is used, the name of a directory containing intensities file for each sample is required. The name of each file should be the unique sample id. This file (which could be gzipped) should contain at least the following columns:

- Chr: the name of the chromosome on which each marker is located.
- Position: the position of the marker on the chromosome.
- B Allele Freq: the BAF value of each marker.
- Log R Ratio: the LRR value of each marker.

If the two plotting module is used alone, one more file is required per module: a list of samples with gender problem and explanation for pyGenClean.SexCheck.gender\_plot, and only the list of samples with gender problem for pyGenClean.SexCheck.baf\_lrr\_plot (both files are provided by the pyGenClean.SexCheck.sex\_check module).

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## 5.8.2 Procedure

Here are the steps performed by the module:

- 1. Checks if there are enough markers on the chromosome 23. If not, the module stops here.
- 2. Runs the sex check analysis using Plink.
- 3. If there are no sex problems, the module quits.
- 4. Creates the recoded file for the chromosome 23.
- 5. Computes the heterozygosity percentage on the chromosome 23.
- 6. If there are enough markers on chromosome 24 (at least 1), creates the recoded file for this chromosome.
- 7. Computes the number of no call on the chromosome 24.
- 8. If required, plots the gender plot.
  - (a) If there are summarized\_intensities provided, reads the files and skips to step vi.
  - (b) Reads the bim file to get markers on the sexual chromosomes.
  - (c) Reads the fam file to get individual's gender.
  - (d) Reads the file containing samples with sex problems.
  - (e) Reads the intensities and summarizes them.
  - (f) Plots the summarized intensities.
- 9. If required, plots the BAF and LRR plots.
  - (a) Reads the problematic samples.
  - (b) Finds and checks the raw files for each of the problematic samples.
  - (c) Plots the BAF and LRR plots.

## 5.8.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e sexcheck]):

- 1. No output files created.
- 2. One set of PLINK's result files:
  - sexcheck: the result of the sex check procedure from Plink.
- 3. Two files are created if there are sex problems:
  - sexcheck.list\_problem\_sex: a summary of samples with sex problem.
  - sexcheck.list\_problem\_sex\_ids: the list of sample ids with sex problem.
- 4. One set of Plink's files:
  - sexcheck.chr23\_recodeA: the recoded file for the chromosome 23.
- 5. One custom output file:
  - sexcheck.chr23\_recodeA.raw.hetero: the heterozygosity percentage on the chromosome 23. The file includes the following columns: PED (the pedigree ID), ID (the individual ID), SEX (the gender) and HETERO (the heterozygosity).

- 6. One set of Plink's files:
  - sexcheck.chr24 recodeA: the recoded file for the chromosome 24.
- 7. One custom output file:
  - sexcheck.chr24\_recodeA.raw.noCall: the number of no call on the chromosome 24. The file includes the following columns: PED (the pedigree ID), ID (the individual ID), SEX (the gender), nbGeno (the number of genotypes on the chromosome 24) and nbNoCall (the number of genotypes that were not called on chromosome 24).
- 8. Multiple files and one plot. The files are created so that the plot can be generated again with different parameters (since the summarized intensities for each sample are really long to compute).
  - sexcheck.png: the gender plot (see Figure Gender plot).
  - sexcheck.ok\_females.txt: the list of females without sex problem, including their summarized intensities on chromosome 23 and 24.
  - sexcheck.ok\_males.txt: the list of males without sex problem, including their summarized intensities on chromosome 23 and 24.
  - sexcheck.ok\_unknowns.txt: the list of unknown gender without sex problem, including their summarized intensities on chromosome 23 and 24.
  - sexcheck.problematic\_females.txt: the list of females with sex problem, including their summarized intensities on chromosome 23 and 24.
  - sexcheck.problematic\_males.txt: the list of males with sex problem, including their summarized intensities on chromosome 23 and 24.
  - sexcheck.problematic\_unknowns.txt: the list of unknown gender with sex problem, including their summarized intensities on chromosome 23 and 24. When this file is created by the pyGenClean.SexCheck.sex\_check module, it is empty.
- 9. A directory containing one file per individual with gender problem (see Figure BAF and LRR plot).

## 5.8.4 The Plots

The plot generated by the pyGenClean. SexCheck. gender\_plot module (the Gender plot figure) represents the summarized intensities of each sample of the data set. The color code represent the gender of each sample. Blue and red dots represent the males and females without gender problem, respectively. The green and purple triangles represent the males and females with gender problem. The gray dots and triangles represent the samples with unknown gender, with and without gender problem, respectively. This plot makes possible to find samples with sexual chromosomes abnormalities, such as males which are XXY or females with only one copy of the X chromosome (X0). Males that appear to be females and vice versa might in fact be sample mix up and would require further analysis.

The *Gender plot* figure can also be manually created after the data clean up pipeline, using its results and this following standalone script:

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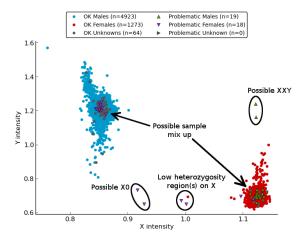


Fig. 5.3: Gender plot

```
Input File:
  --bfile FILE
                        The plink binary file containing information about
                        markers and individuals. Must be specified if
                        '--summarized-intensities' is not.
                        A file containing alleles intensities for each of the
  --intensities FILE
                        markers located on the X and Y chromosome. Must be
                        specified if '--summarized-intensities' is not.
  --summarized-intensities FILE
                        The prefix of six files (prefix.ok_females.txt,
                        prefix.ok_males.txt, prefix.ok_unknowns.txt,
                        problematic_females.txt, problematic_males.txt and
                        problematic_unknowns.txt) containing summarized chr23
                        and chr24 intensities. Must be specified if '--bfile'
                        and '--intensities' are not.
  --sex-problems FILE
                        The file containing individuals with sex problems.
                        This file is not read if the option 'summarized-
                        intensities' is used.
Options:
  --format FORMAT
                        The output file format (png, ps, pdf, or X11 formats
                        are available). [default: png]
                        The label of the X axis. [default: X intensity]
  --xlabel STRING
  --ylabel STRING
                        The label of the Y axis. [default: Y intensity]
Output File:
  --out FILE
                        The prefix of the output files (which will be a Plink
                        binary file. [default: sexcheck]
```

The log R ratio (LRR) for a sample is the log ratio of the normalized R value for the marker divided by the expected normalized R value. Hence, a value of 0 means 2 copies. A drop in the LRR shows a loss of a copy, while an increasing LRR shows a gain of a copy. Expected LRR values on chromosome 23 for female and female are 0 and [-0.5, -1], respectively. The LRR values of each markers on both the X and Y chromosomes are shown in the *BAF and LRR plot* figure.

The B allele frequency (BAF) for a sample shows the theta value for a marker, corrected for cluster position. For a normal number of copies, markers should have a BAF around 1 (homozygous for the B allele), 0.5 (heterozygous) or 0 (homozygous for A allele). Normal females should have the three lines across the chromosome. Normal males should only have two lines, located near 1 or 0. The BAF values of each markers on both the X and Y chromosomes

are shown in the BAF and LRR plot figure.

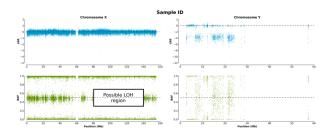


Fig. 5.4: BAF and LRR plot

The BAF and LRR plot figure can also be manually created after the data clean up pipeline, using this following standalone script:

```
$ pyGenClean_baf_lrr_plot --help
usage: pyGenClean_baf_lrr_plot [-h] [-v] --problematic-samples FILE
                               [--use-full-ids] [--full-ids-delimiter CHAR]
                               --raw-dir DIR [--format FORMAT] [--out FILE]
Plots the BAF and LRR of problematic samples.
optional arguments:
                        show this help message and exit
 -h, --help
 -v, --version
                        show program's version number and exit
Input File:
  --problematic-samples FILE
                        A file containing the list of samples with sex
                        problems (family and individual ID required, separated
                        by a single tabulation). Uses only the individual ID
                        by default, unless --use-full-ids is used.
  --use-full-ids
                        Use this options to use full sample IDs (famID and
                        indID). Otherwise, only the indID will be use.
  --full-ids-delimiter CHAR
                        The delimiter between famID and indID for the raw file
                        names. [default: _]
  --raw-dir DIR
                        Directory containing information about every samples
                        (BAF and LRR).
Options:
  --format FORMAT
                        The output file format (png, ps, pdf, or X11 formats
                        are available). [default: png]
Output File:
 --out FILE
                        The prefix of the output files. [default: sexcheck]
```

# 5.8.5 The Algorithm

For more information about the actual algorithms and source codes, refer to the following pages.

- pyGenClean.SexCheck.sex\_check
- pyGenClean.SexCheck.gender\_plot
- pyGenClean.SexCheck.baf\_lrr\_plot

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# 5.9 Plate Bias Module

The usage of the standalone module is shown below:

```
$ pyGenClean_plate_bias --help
usage: pyGenClean_plate_bias [-h] [-v] --bfile FILE --loop-assoc FILE
                             [--pfilter FLOAT] [--out FILE]
Checks for plate bias.
optional arguments:
 -h, --help
                     show this help message and exit
 -v, --version
                   show program's version number and exit
Input File:
 --bfile FILE
                     The input file prefix (will find the plink binary files
                     by appending the prefix to the .bim, .bed and .fam files,
                     respectively.
 --loop-assoc FILE The file containing the plate organization of each
                     samples. Must contains three column (with no header):
                     famID, indID and plateName.
Options:
  --pfilter FLOAT
                     The significance threshold used for the plate effect.
                     [default: 1.0e-07]
Output File:
 --out FILE
                     The prefix of the output files. [default: plate_bias]
```

## 5.9.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

## 5.9.2 Procedure

Here are the steps performed by the module:

- 1. Runs the plate bias analysis using Plink.
- 2. Extracts the list of significant markers after plate bias analysis.
- 3. Computes the frequency of all significant markers after plate bias analysis.

# 5.9.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. plate\_bias]):

- 1. One set of PLINK's result files:
  - plate\_bias: this includes file like plate\_bias.PLATE\_NAME.assoc.fisher containing a list of markers that were significant after the plate bias analysis.
- 2. One file:

- plate\_bias.significant\_SNPs.txt: a file containing a list of markers that were significant after the plate bias analysis (contained in all the \*.fisher files).
- 3. One set of PLINK's result files:
  - plate\_bias.significant\_SNPs: the result files containing the frequency of all the markers that were significant after the plate bias analysis (contained in all the \*.fisher files).

# 5.9.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

```
• pyGenClean.PlateBias.plate_bias
```

# 5.10 Heterozygous Haploid Module

The usage of the standalone module is shown below:

```
$ pyGenClean_remove_heterozygous_haploid --help
Usage: pyGenClean_remove_heterozygous_haploid [-h] [-v] --bfile FILE
                                             [--out FILE]
Removes heterozygous haploid genotypes.
Optional arguments:
 -h, --help show this help message and exit
 -v, --version show program's version number and exit
Input File:
 --bfile FILE
                The input file prefix (will find the plink binary files by
                appending the prefix to the .bim, .bed and .fam files,
                 respectively.
Output File:
 --out FILE
                The prefix of the output files. [default:
                 without_hh_genotypes]
```

# 5.10.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

## 5.10.2 Procedure

Here are the steps performed by the module:

1. Uses Plink to remove the heterozygous haploid genotypes.

## 5.10.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. without\_hh\_genotypes]):

1. On set of Plink's output files:

• without hh\_genotypes: the data set with heterozygous haploid genotypes removed.

# 5.10.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

• pyGenClean.HeteroHap.remove\_heterozygous\_haploid

# 5.11 Related Samples Module

The usage of the standalone module is shown below:

```
$ pyGenClean_find_related_samples --help
usage: pyGenClean_find_related_samples [-h] [-v] --bfile FILE [--genome-only]
                                        [--min-nb-snp INT]
                                        [--indep-pairwise STR STR STR]
                                        [--maf FLOAT] [--ibs2-ratio FLOAT]
                                        [--sge] [--sge-walltime TIME]
                                        [--sge-nodes INT INT]
                                        [--line-per-file-for-sge INT]
                                        [--out FILE]
Finds related samples according to IBS values.
optional arguments:
                     show this help message and exit show program's version number and exit
 -h, --help
 -v, --version
Input File:
 --bfile FILE
                       The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively.)
Options:
 --genome-only
                        Only create the genome file
                       The minimum number of markers needed to compute IBS
 --min-nb-snp INT
                        values. [Default: 10000]
 --indep-pairwise STR STR STR
                        Three numbers: window size, window shift and the r2
                        threshold. [default: ['50', '5', '0.1']]
 --maf FLOAT
                       Restrict to SNPs with MAF >= threshold. [default:
                        0.05]
  --ibs2-ratio FLOAT
                        The initial IBS2* ratio (the minimum value to show in
                        the plot. [default: 0.8]
                       Use SGE for parallelization.
  --sae
  --sge-walltime TIME The walltime for the job to run on the cluster. Do not
                        use if you are not required to specify a walltime for
                        your jobs on your cluster (e.g. 'qsub
                        -lwalltime=1:0:0' on the cluster).
                        The number of nodes and the number of processor per
 --sge-nodes INT INT
                        nodes to use (e.g. 'qsub -lnodes=X:ppn=Y' on the
                        cluster, where X is the number of nodes and Y is the
                        number of processor to use. Do not use if you are not
                        required to specify the number of nodes for your jobs
                        on the cluster.
  --line-per-file-for-sge INT
```

```
The number of line per file for SGE task array.

[default: 100]

Output File:

--out FILE The prefix of the output files. [default: ibs]
```

## 5.11.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

### 5.11.2 Procedure

Here are the steps performed by the module:

- 1. Uses Plink to extract markers according to LD.
- 2. Checks if there is enough markers after pruning.
- 3. Extract markers according to LD.
- 4. Runs Plink with the genome option to compute the IBS values.
- 5. Finds related individuals and gets values for plotting.
- 6. Plots 21 in function of IBS2 ratio for related individuals.
- 7. Plots Z2 in function of IBS2 ratio for related individuals.

## 5.11.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. ibs]):

- 1. One set of PLINK's result files:
  - ibs.pruning\_0.1: the results of the pruning process of Plink. The value depends on the option of --indep-pairwise. The markers that are kept are in the file ibs.pruning\_0.1.prune.in.
- 2. No file created.
- 3. One set of PLINK's binary files:
  - ibs.pruned\_data: the data sets containing only the marker from the first step (the list is in ibs.pruning\_0.1.prune.in).
- 4. One set of PLINK's result files (two if --sge is used):
  - ibs.frequency: PLINK's result files when computing the frequency of each of the pruned markers. This data set will exist only if the option —sge is used.
  - ibs.genome: PLINK's results including IBS values.
- 5. One file provided by the pyGenClean.RelatedSamples.find\_related\_samples and three files provided by pyGenClean.RelatedSamples.merge\_related\_samples:
  - ibs.related\_individuals: a subset of the ibs.genome.genome file containing only samples that are considered to be related. Three columns are appended to the original ibs.genome.genome file: IBS2\_ratio (the value that is considered to find related individuals), status (the type of relatedness [e.g. twins]) and

code (a numerical code that represent the status). This file is provided by the pyGenClean.RelatedSamples.find\_related\_samples module.

- ibs.merged\_related\_individuals: a file aggregating related samples in groups, containing the following columns: index (the group number), FID1 (the family ID of the first sample), IID1 (the individual ID of the first sample), FID2 (the family ID of the second sample), IID2 (the individual ID of the second sample) and status (the type of relatedness between the two samples). This file is provided by the merge\_related\_samples.
- ibs.chosen\_related\_individuals: the related individuals that were randomly chosen from each group to be kept in the final data set. This file is provided by the merge\_related\_samples.
- ibs.discarded\_related\_individual: the related individuals that needs to be discarded, so that the final data set include only unrelated individuals. This file is provided by the merge\_related\_samples.

### 6. One image file:

• ibs.related\_individuals\_z1.png: a plot showing the  $Z_1$  value in function of the  $IBS2^*_{ratio}$  for all samples above a certain  $IBS2^*_{ratio}$  (the default threshold is 0.8). See Figure Z1 in function of IBS2 ratio.

### 7. One image file:

• ibs.related\_individuals\_z2.png: a plot showing the  $Z_2$  value in function of the  $IBS2^*_{ratio}$  for all samples above a certain  $IBS2^*_{ratio}$  (the default threshold is 0.8). See Figure  $Z_2$  in function of IBS2 ratio.

## **5.11.4 The Plots**

The first plot (Z1 in function of IBS2 ratio figure) that is created is  $Z_1$  in function of  $IBS2^*_{ratio}$  (where each point represents a pair of related individuals. The color code comes from the different value of  $Z_0$ ,  $Z_1$  and  $Z_2$ , as described in the  $pyGenClean.RelatedSamples.find\_related\_samples.extractRelatedIndividuals() function. In this plot, there are four locations where related samples tend to accumulate (first degree relatives (full sibs), second degree relatives (half-sibs, grand-parent-child or uncle-nephew), parent-child and twins (or duplicated samples). The unknown sample pairs represent possible undetected related individuals.$ 

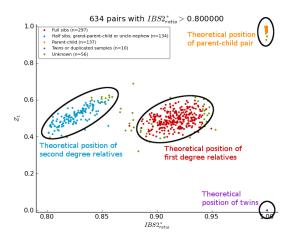


Fig. 5.5: Z1 in function of IBS2 ratio

The second plot (Z2 in function of IBS2 ratio figure) that is created is  $Z_2$  in function of  $IBS2^*_{ratio}$  (where each

point represents a pair of related individuals. It's just another representation of relatedness of sample pairs, where the location of the "clusters" is different.

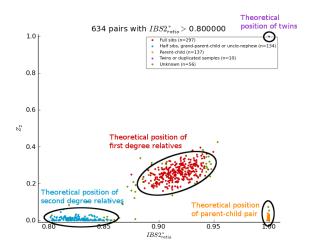


Fig. 5.6: Z2 in function of IBS2 ratio

# 5.11.5 Finding Outliers

A standalone script was created in order to regroup related samples in different subset. The usage is as follow:

```
$ pyGenClean_merge_related_samples --help
usage: pyGenClean_merge_related_samples [-h] [-v] --ibs-related FILE
                                        [--no-status] [--out FILE]
Merges related samples according to IBS.
optional arguments:
                    show this help message and exit
 -h, --help
 -v, --version
                     show program's version number and exit
Input File:
  --ibs-related FILE The input file containing related individuals according
                      to IBS value.
Options:
                      The input file doesn't have a 'status' column.
 --no-status
Output File:
                      The prefix of the output files. [default: ibs_merged]
 --out FILE
```

At the end of the analysis, two files are created. The file \*.chosen\_related\_individuals" contains a list of randomly selected samples according to their relatedness (to keep only on sample for a group of related samples). The file \*.discarded\_related\_individuals contains a list of sample to exclude to only keep unrelated samples in a dataset.

# 5.11.6 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

- pyGenClean.RelatedSamples.find\_related\_samples
- pyGenClean.RelatedSamples.merge\_related\_samples

# **5.12 Ethnicity Module**

The usage of the standalone module is shown below:

```
$ pyGenClean_check_ethnicity --help
usage: pyGenClean_check_ethnicity [-h] [-v] --bfile FILE [--skip-ref-pops]
                                  [--ceu-bfile FILE] [--yri-bfile FILE]
                                  [--jpt-chb-bfile FILE] [--min-nb-snp INT]
                                  [--indep-pairwise STR STR STR] [--maf FLOAT]
                                  [--sge] [--sge-walltime TIME]
                                  [--sge-nodes INT INT]
                                  [--ibs-sge-walltime TIME]
                                  [--ibs-sge-nodes INT INT]
                                  [--line-per-file-for-sge INT]
                                  [--nb-components INT] [--outliers-of POP]
                                  [--multiplier FLOAT] [--xaxis COMPONENT]
                                  [--yaxis COMPONENT] [--format FORMAT]
                                  [--title STRING] [--xlabel STRING]
                                  [--ylabel STRING] [--create-scree-plot]
                                  [--scree-plot-title TITLE] [--out FILE]
Checks samples' ethnicity using reference populations and IBS.
optional arguments:
 -h, --help
                       show this help message and exit
 -v, --version
                       show program's version number and exit
Input File:
                        The input file prefix (will find the plink binary
 --bfile FILE
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively.
 --skip-ref-pops
                        Perform the MDS computation, but skip the three
                        reference panels.
 --ceu-bfile FILE
                        The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively.) for the CEU population
 --yri-bfile FILE
                        The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively.) for the YRI population
 --jpt-chb-bfile FILE The input file prefix (will find the plink binary
                        files by appending the prefix to the .bim, .bed and
                        .fam files, respectively.) for the JPT-CHB population
Options:
  --min-nb-snp INT
                        The minimum number of markers needed to compute IBS
                        values. [Default: 8000]
  --indep-pairwise STR STR STR
                        Three numbers: window size, window shift and the r2
                        threshold. [default: ['50', '5', '0.1']]
 --maf FLOAT
                        Restrict to SNPs with MAF >= threshold. [default:
                        0.051
                        Use SGE for parallelization.
 --sae
 --sge-walltime TIME
                       The walltime for the job to run on the cluster. Do not
```

```
use if you are not required to specify a walltime for
                        your jobs on your cluster (e.g. 'qsub
                        -lwalltime=1:0:0' on the cluster).
  --sge-nodes INT INT
                        The number of nodes and the number of processor per
                        nodes to use (e.g. 'qsub -lnodes=X:ppn=Y' on the
                        cluster, where X is the number of nodes and Y is the
                        number of processor to use. Do not use if you are not
                        required to specify the number of nodes for your jobs
                        on the cluster.
 --ibs-sge-walltime TIME
                        The walltime for the IBS jobs to run on the cluster.
                        Do not use if you are not required to specify a
                        walltime for your jobs on your cluster (e.g. 'qsub
                        -lwalltime=1:0:0' on the cluster).
 --ibs-sge-nodes INT INT
                        The number of nodes and the number of processor per
                        nodes to use for the IBS jobs (e.g. 'qsub
                        -lnodes=X:ppn=Y' on the cluster, where X is the number
                        of nodes and Y is the number of processor to use. Do
                        not use if you are not required to specify the number
                        of nodes for your jobs on the cluster.
 --line-per-file-for-sge INT
                        The number of line per file for SGE task array for the
                        IBS jobs. [default: 100]
  --nb-components INT The number of component to compute. [default: 10]
Outlier Options:
  --outliers-of POP
                        Finds the outliers of this population. [default: CEU]
 --multiplier FLOAT
                        To find the outliers, we look for more than {\bf x} times
                        the cluster standard deviation. [default: 1.9]
  --xaxis COMPONENT
                        The component to use for the X axis. [default: C1]
  --yaxis COMPONENT
                        The component to use for the Y axis. [default: C2]
MDS Plot Options:
 --format FORMAT
                        The output file format (png, ps, pdf, or X11 formats
                        are available). [default: png]
  --title STRING
                        The title of the MDS plot. [default: C2 in function of
                        C1 - MDS]
  --xlabel STRING
                        The label of the X axis. [default: C1]
 --vlabel STRING
                       The label of the Y axis. [default: C2]
Scree Plot Options:
 --create-scree-plot
                        Computes Eigenvalues and creates a scree plot.
 --scree-plot-title TITLE
                        The main title of the scree plot [EIGENSOFT results]
Output File:
 -- Out FILE
                        The prefix of the output files. [default: ethnicity]
```

### 5.12.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest) and three sets of binary files for the reference panels (CEU, YRI and JPG-CHB).

### 5.12.2 Procedure

Here are the steps performed by the module:

- 1. Finds the overlapping markers between the three reference panels and the source panel.
- 2. Extracts the required markers from all the data sets (source and reference panels).
- 3. Combines the three reference panels together to create a single data set.
- 4. Renames the reference panel's markers so that they match the names of the markers in the source panel.
- 5. Computes the frequency of all the markers from the reference and the source panels.
- 6. Finds the markers to flip in the reference panel, to enable fast comparison with the source panel.
- 7. Excludes markers that cannot be flip from the reference and the source panels.
- 8. Flips the markers that need to be in the reference panel.
- 9. Combines the reference and the source panels.
- 10. Computes the IBS values (see Section Related Samples Module for more information).
- 11. Creates the MDS file from the combined data set and the IBS values.
- 12. Creates a population file for plotting purposes.
- 13. Plots the MDS values.
- 14. Finds the outliers of a given reference population (either CEU, YRI or JPT-CHB).
  - (a) Reads the population file.
  - (b) Reads the MDS values.
  - (c) Computes the three reference population clusters' center.
  - (d) Computes three clusters according to the reference population clusters' centers, and finds the outliers of a given reference population.
  - (e) Writes the outliers in a file.

## 5.12.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e ethnicity]):

- 1. Three files are created:
  - ethnicity.ref\_snp\_to\_extract: a list of markers to extract from the reference panels.
  - ethnicity.source\_snp\_to\_extract: a list of markers to extract from the source panel.
  - ethnicity.update\_names: the updated names of the marker in the reference panels, so that they
    match with the names in the source panel.
- 2. Four sets of PLINK's binary files are created:
  - ethnicity.reference\_panel.CEU: the data set containing the extracted markers from the CEU reference population.
  - ethnicity.reference\_panel.YRI: the data set containing the extracted markers from the YRI reference population.

- ethnicity.reference\_panel.JPT-CHB: the data set containing the extracted markers from the JPG-CHB reference population.
- ethnicity.source\_panel.ALL: the data set containing the extracted markers from the source population.
- 3. One required file and one set of PLINK's binary files are created:
  - ethnicity.reference\_panel.ALL.files\_to\_merge: the file required by Plink to merge more than two data sets together.
  - ethnicity.reference\_panel.ALL: the data set containing the merged data sets of the three reference population.
- 4. One set of PLINK's binary files is created:
  - ethnicity.reference\_panel.ALL.rename: the data set after markers have been renamed in the reference panels.
- 5. Two sets of PLINK's result files are created:
  - ethnicity.reference\_panel.ALL.rename.frequency: the frequencies of the markers in the reference panels.
  - ethnicity.source\_panel.ALL.frequency: the frequencies of the markers in the source panels.
- 6. Two files are created:
  - ethnicity.snp\_to\_flip\_in\_reference: the list of markers to flip in the reference panels.
  - ethnicity.snp\_to\_remove: the list of markers to remove because they are not comparable to the markers in the source panel, even after trying to flip them.
- 7. Two sets of PLINK's binary files are created:
  - ethnicity.reference\_panel.ALL.rename.cleaned: the data set after the markers found in the previous step are excluded from the reference panels.
  - ethnicity.source\_panel.ALL.cleaned: the data set after the markers found in the previous step are excluded from the source panel.
- 8. One set of PLINK's binary files is created:
  - ethnicity.reference\_panel.ALL.rename.cleaned.flipped: the data set after markers from the reference panels were flipped so that they become comparable with the source panel.
- 9. One required file and one set of PLINK's binary files are created:
  - ethnicity.final\_dataset\_for\_genome.files\_to\_merge: the file required by Plink to merge more than two data sets together.
  - ethnicity.final\_dataset\_for\_genome: the data set containing the merged reference and source panels.
- 10. Multiple files are created after this step.
  - ethnicity.ibs: for more information about those files, see Section Related Samples Module.
- 11. One set of PLINK's result files is created:
  - ethnicity.mds: files containing the MDS values.
- 12. One file is created:
  - ethnicity.population\_file: the population file required for MDS value plotting.
- 13. One file is created:

• ethnicity.mds.png: the plot of the MDS values (see Figure *Initial MDS plot*).

#### 14. Four files are created:

- ethnicity.before.png: the MDS values before outliers detection (see Figure MDS plot before outlier detection).
- ethnicity.after.png: the MDS values after outliers detection for each of the three reference populations. The shaded points are the outliers (see Figure MDS plot after outlier detection).
- ethnicity.outliers.png: the MDS values after outliers detection for the selected reference population (default is CEU) (see Figure *Ethnic outliers*).
- ethnicity.outliers: the list of outliers (excluding the reference populations).
- ethnicity.population\_file\_outliers: a population file containing the outliers (to help creating a new MDS plot using pyGenClean.PlinkUtils.plot\_MDS\_standalone).

### 5.12.4 The Plots

Multiple plots are created by this module. The first one (Figure *Initial MDS plot*) is the MDS values right after they are computed by Plink. There is one color per reference populations (CEU in blue, YRI in green and JPT-CHB in purple). The source population is represented as red crosses.

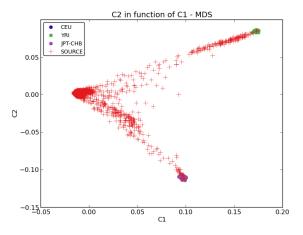


Fig. 5.7: Initial MDS plot

The second one (Figure *MDS plot before outlier detection*) is the MDS values before outlier detection. Points in red, green and blue represent the individuals part of the CEU, YRI and JPT-CHB clusters, respectively. The yellow points represent the center of each of the cluster, when only considering the three reference panels.

The third plot (Figure MDS plot after outlier detection) is the MDS values after outlier detection. Points in red, green and blue represent the individuals part of the CEU, YRI and JPT-CHB clusters, respectively. Outliers are found for each of the three reference populations and they are represented with the same, but lighter color. Once again, the yellow points represent the center of each of the cluster, when only considering the three reference panels.

The last plot (Figure *Ethnic outliers*) shows the outliers of the selected reference population (CEU by default). Red, green and blue represent the CEU, YRI and JPT-CHB samples, respectively. Orange represents the individuals from the source panel who are part of the selected reference population. Gray represents the outliers of the selected reference population.

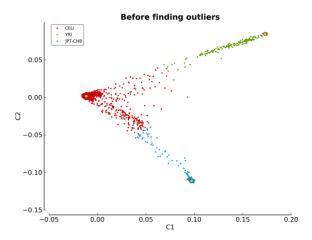


Fig. 5.8: MDS plot before outlier detection

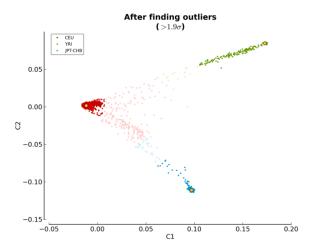


Fig. 5.9: MDS plot after outlier detection

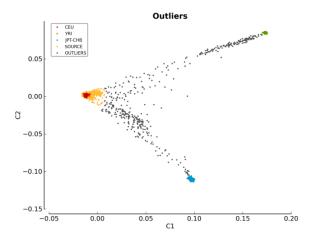


Fig. 5.10: Ethnic outliers

### **Modifying The Outlier Plot**

If you want to manually modify the above figures, have a look at the pyGenClean.PlinkUtils.plot\_MDS\_standalone module. Here is the usage of this script:

```
$ pyGenClean_plot_MDS --help
usage: pyGenClean_plot_MDS [-h] [-v] --file FILE --population-file FORMAT
                           [--population-order STRING]
                           [--population-colors STRING]
                           [--population-sizes STRING]
                           [--population-markers STRING]
                           [--population-alpha STRING] [--format FORMAT]
                           [--title STRING] [--xaxis STRING] [--xlabel STRING]
                           [--yaxis STRING] [--ylabel STRING]
                           [--legend-position STRING] [--legend-size INT]
                           [--legend-ncol INT] [--legend-alpha FLOAT]
                           [--title-fontsize INT] [--label-fontsize INT]
                           [--axis-fontsize INT] [--adjust-left FLOAT]
                           [--adjust-right FLOAT] [--adjust-top FLOAT]
                           [--adjust-bottom FLOAT] [--out FILE]
Creates a MDS plot.
optional arguments:
 -h, --help
                        show this help message and exit
 -v, --version
                        show program's version number and exit
Input File:
  --file FILE
                        The MBS file.
 --population-file FORMAT
                        A file containing population information. There must
                        be three columns: famID, indID and population
                        information.
Population Properties:
 --population-order STRING
                        The order to print the different populations.
                        [default: CEU, YRI, JPT-CHB, SOURCE, OUTLIER]
  --population-colors STRING
                        The population point color in the plot [default:
                        377eb8,4daf4a,984ea3,e41a1c,ff7f00]
  --population-sizes STRING
                        The population point size in the plot. [default:
                        12,12,12,8,31
 --population-markers STRING
                        The population point marker in the plot. [default:
                        .,.,+,D]
 --population-alpha STRING
                        The population alpha value in the plot. [default:
                        1.0,1.0,1.0,1.0,1.0]
Graphical Properties:
  --format FORMAT
                        The output file format (png, ps, pdf, or X11 formats
                        are available). [default: png]
 --title STRING
                        The title of the MDS plot. [default: C2 in function of
                        C1 - MDS1
 --xaxis STRING
                        The component to print on the X axis. [default: C1]
 --xlabel STRING
                        The label of the X axis. [default: C1]
```

```
--yaxis STRING
                        The component to print on the Y axis. [default: C2]
  --ylabel STRING
                        The label of the Y axis. [default: C2]
  --legend-position STRING
                        The position of the legend. [default: best]
  --legend-size INT
                        The size of the legend. [default: 10]
  --legend-ncol INT
                        The number of column for the legend. [default: 1]
                        The alpha value of the legend frame. [default: 1.0]
  --legend-alpha FLOAT
  --title-fontsize INT
                        The font size of the title. [default: 15]
  --label-fontsize INT
                       The font size of the X and Y labels. [default: 12]
  --axis-fontsize INT
                        The font size of the X and Y axis. [Default: 12]
 --adjust-left FLOAT
                        Adjust the left margin. [Default: 0.12]
 --adjust-right FLOAT Adjust the right margin. [Default: 0.90]
 --adjust-top FLOAT
                        Adjust the top margin. [Default: 0.90]
 --adjust-bottom FLOAT
                        Adjust the bottom margin. [Default: 0.10]
Output File:
 --out FILE
                        The prefix of the output files. [default: mds]
```

And here is an example of usage (for a MDS and a population file named ethnicity.mds.mds and ethnicity.population\_file\_outliers, respectively), producing the Figure Ethnic outliers modified.

```
$ pyGenClean_plot_MDS \
      --file ethnicity.mds.mds \
      --population-file ethnicity.population_file_outliers \
      --population-order SOURCE, CEU, YRI, JPT-CHB, OUTLIER \
      --population-colors e41a1c, 377eb8, 4daf4a, 984ea3, 000000 \
      --population-markers .,.,.,+ \
      --population-sizes 8,8,8,8,8
      --axis-fontsize 18 \
      --label-fontsize 18 \
      --title-fontsize 24 \
      --adjust-bottom 0.11 \
      --adjust-left 0.15 \
      --adjust-right 0.96 \
>
      --legend-size 14 \
      --legend-position lower-right
```

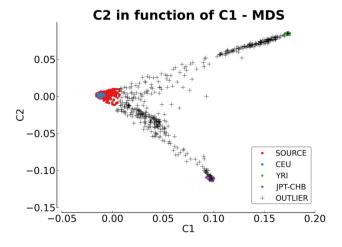


Fig. 5.11: Ethnic outliers modified

## 5.12.5 Finding Outliers

If the multiplier of the cluster standard deviation was too stringent (or not stringent enough), there is no need to run the module from the start. A standalone script was created for this exact purpose, and it will find the outliers using the MDS and population file previously created. Just modify the --multiplier option and restart the analysis (which takes about a couple of seconds).

```
$ pyGenClean_find_outliers --help
usage: pyGenClean_find_outliers [-h] [-v] --mds FILE --population-file FILE
                                 [--outliers-of POP] [--multiplier FLOAT]
                                 [--xaxis COMPONENT] [--yaxis COMPONENT]
                                 [--format FORMAT] [--out FILE]
Finds outliers in SOURCE from CEU samples.
optional arguments:
 -h, --help
                       show this help message and exit
  -v, --version
                       show program's version number and exit
Input File:
  --mds FILE
                       The MDS file from Plink
  --population-file FILE
                         A population file containing the following columns
                         (without a header): FID, IID and POP. POP should be
                         one of 'CEU', 'JPT-CHB', 'YRI' and SOURCE.
Options:
  --outliers-of POP Finds the outliers of this population. [default: CEU]
  --multiplier FLOAT To find the outliers, we look for more than x times
                       the cluster standard deviation. [default: 1.9]
  --xaxis COMPONENT
                      The component to use for the X axis. [default: C1]
 --yaxis COMPONENT The component to use for the Y axis. [default: C2] --format FORMAT The output file format (png, ps, or pdf formats are
                        The output file format (png, ps, or pdf formats are
                         available). [default: pnq]
Output File:
  --out FILE
                         The prefix of the output files. [default: ethnicity]
```

### 5.12.6 The Algorithm

For more information about the actual algorithms and source codes, refer to the following pages.

```
• pyGenClean. Ethnicity. check_ethnicity
```

- pyGenClean. Ethnicity. find\_outliers
- pyGenClean.PlinkUtils.plot\_MDS\_standalone

# 5.13 Minor Allele Frequency of Zero Module

The usage of the standalone module is shown below:

```
$ pyGenClean_flag_maf_zero --help
usage: pyGenClean_flag_maf_zero [-h] [-v] --bfile FILE [--out FILE]
Flags SNPs with MAF of 0.
```

## 5.13.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

### 5.13.2 Procedure

Here are the steps performed by the module:

- 1. Computes the frequencies using Plink.
- 2. Finds markers with a MAF of zero.

## 5.13.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. flag\_maf\_0]):

- 1. One file and one set of PLINK's result file:
  - flag\_maf\_0.frq: the frequency of each marker in the source dataset.
  - flag\_maf\_0.list: the list of markers with a minor allele frequency of zero.

## 5.13.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

```
• pyGenClean.FlagMAF.flag maf zero
```

## 5.14 Hardy Weinberg Equilibrium Module

The usage of the standalone module is shown below:

```
$ pyGenClean_flag_hw --help
usage: pyGenClean_flag_hw [-h] [-v] --bfile FILE [--hwe FLOAT] [--out FILE]

Flags SNPs with Hardy-Weinberg disequilibrium.

optional arguments:
   -h, --help show this help message and exit
```

```
-v, --version show program's version number and exit

Input File:
--bfile FILE The input file prefix (will find the plink binary files by appending the prefix to the .bim, .bed and .fam files, respectively.

Options:
--hwe FLOAT The Hardy-Weinberg equilibrium threshold. [default: 1e-4]

Output File:
--out FILE The prefix of the output files. [default: flag_hw]
```

## 5.14.1 Input Files

This module uses PLINK's binary file format (bed, bim and fam files) for the source data set (the data of interest).

#### 5.14.2 Procedure

Here are the steps performed by the module:

- 1. Computes the number of markers in the input file.
- 2. Computes the Bonferroni threshold.
- 3. Runs Plink to find failed markers for HWE with the Bonferroni threshold.
- 4. Runs Plink to find failed markers for HWE with the default threshold.
- 5. Compares the two marker lists (Bonferroni and default threshold) and finds markers that are between the two thresholds.

### 5.14.3 Output Files

The output files of each of the steps described above are as follow (note that the output prefix shown is the one by default [i.e. flag\_hw]):

- 1. No files are created for this step.
- 2. No files are created for this step.
- 3. One set of PLINK's binary file is created:
  - flag\_hw.threshold\_X.Xe-X: the data set containing only the markers that pass the HWE test (above the Bonferroni threshold).
- 4. One set of PLINK's binary file is created:
  - flag\_hw.threshold\_1e-4: the data set containing only the markers that pass the HWE test (above the genome wide significance threshold of  $1 \times 10^{-4}$ ). This value can be modified at the command line.
- 5. Three files are created:
  - flag\_hw.snp\_flag\_threshold\_X.Xe-X: the list of markers that failed HWE test for the Bonferroni threshold.
  - flag\_hw.snp\_flag\_threshold\_1e-4: the list of markers that failed HWE test for the genome wide significance threshold of  $1 \times 10^{-4}$ . This value can be modified at the command line.

• flag\_hw.snp\_flag\_threshold\_between\_1e-4-X.Xe-X: the list of markers that failed HWE test at a threshold between the Bonferroni and the genome wide significance thresholds, so that you can exclude only the ones that have a lower p value than the Bonferroni threshold.

## 5.14.4 The Algorithm

For more information about the actual algorithms and source codes, refer to the following page.

```
• pyGenClean.FlagHW.flag_hw
```

## 5.15 Comparison with a Gold Standard Module

Explain the procedure here.

## 5.15.1 Output Files

Describe the output files here.

## 5.15.2 The algorithm

For more information about the actual algorithms and source codes, refer to the following pages.

```
• pyGenClean.Misc.compare_gold_standard
```

### 5.16 Plink Utils

This module provides useful functions and scripts for efficient interactions with PLINK's output files. For example, the majority of PLINK's output files are spaced delimited, and are formated in such a way that it is "beautiful" to the human eye, but is a bit harder to parse using a script compared to tabulated files. The <code>pyGenClean.PlinkUtils.createRowFromPlinkSpacedOutput()</code> function helps producing an array of all the fields for each line.

## 5.16.1 Comparing BIM files

Another example is the fact that when PLINK removes a certain amount of markers from the data file, it just gives the number of excluded markers, but not a list. The <code>pyGenClean.PlinkUtils.compare\_bim</code> module creates a list of markers that were removed from the original dataset when compared with the new one. Here is the usage of the standalone script:

```
Input File:
   --before FILE    The name of the bim FILE before modification.
   --after FILE    The name of the bim FILE after modification.

Output File:
   --out FILE    The prefix of the output files. [default: snp_removed]
```

## 5.16.2 Subsetting a dataset

A useful standalone script is the pyGenClean.PlinkUtils.subset\_data module. It helps in subsetting a dataset by keeping or removing a set of samples, and at the same time extracting or excluding a set of markers. The following standalone script is available for the user:

```
$ pyGenClean_subset_data --help
usage: pyGenClean_subset_data [-h] [-v] --ifile FILE [--is-bfile] [--is-tfile]
                              [--is-file] [--exclude FILE] [--extract FILE]
                              [--remove FILE] [--keep FILE] [--out FILE]
Subsets genotype data using Plink.
optional arguments:
 -h, --help show this help message and exit
 -v, --version show program's version number and exit
Input File:
 --ifile FILE
                 The input file prefix. The format will be specified by --is-
                 bfile, --is-tfile or --is-file, for bfile, tfile and file,
                 respectively.
                 The file specified by --ifile is a bfile
 --is-bfile
 --is-tfile
                 The file specified by --ifile is a tfile
 --is-file
                 The file specified by --ifile is a file
Options:
 --exclude FILE A file containing SNPs to exclude from the data set.
 --extract FILE A file containing SNPs to extract from the data set.
 --remove FILE A file containing samples (FID and IID) to remove from the
                 data set.
 --keep FILE
                 A file containing samples (FID and IID) to keep from the
                 data set.
Output File:
  --out FILE
                  The prefix of the output files. [default: subset]
```

The standalone script works with the three most used PLINK's format: pedfile, transposed and binary pedfiles. The --is-bfile, --is-tfile and --is-file options tell the standalone script what is the format of the input file. The output file format will be the same as the input one.

## 5.16.3 The Algorithm

For more information about the actual algorithms and source codes, refer to the following pages.

- pyGenClean.PlinkUtils
- pyGenClean.PlinkUtils.compare\_bim
- pyGenClean.PlinkUtils.subset\_data

**CHAPTER** 

SIX

## **CITING PYGENCLEAN**

If you use pyGenClean in any published work, please cite the published scientific paper describing the tool.

Lemieux Perreault LP, Provost S, Legault MA, Barhdadi A, Dubé MP: **pyGenClean: efficient tool for genetic data clean up before association testing.** *Bioinformatics* 2013, 29(13):1704-1705 [DOI:10.1093/bioinformatics/btt261]

## **SEVEN**

## **APPENDIX**

# 7.1 Result Summary Table

This table summurized information available from output files produced by pyGenClean during the data clean up procedure. Numbers correspond to number of lines in output files see  $Proposed\ Protocol$  for details. Only removed SNPs and IDs are indicated in the column SNPs and IDs, flagged SNPs or IDs are present in the n column.

Table 7.1: Summary information of the data clean up procedure.

Description	$\overline{n}$	SNPs	IDs
Total number of SNPs in file received	2,379,855		
Total number of samples	494		
Number of duplicate samples	0		
Number of individuals with no genotype (failed)	0		
Number of SNPs with no physical position (chromosome and physical position =	7,239	-7,239	
0)			
Number of INDEL	43	-43	
Number of replicate controls	5		
Number of replicate samples	0		
Number of duplicate SNPs (by chromosome and physical position)	5,643		
Duplicated SNPs by chromosome and physical position with the same allele	5,417	-5,147	
(merge)			
Number of duplicated SNP with <98% concordance	22	-22	
Completely failed SNPs	1	-1	
All heterozogous SNPs	0		
Number of individuals removed because they have more than 10% missing geno-	5		-5
types			
Number of SNPs removed because they have more than 2% missing value	128,562	-128,562	
Number of individuals removed because they have more than 2% missing geno-	7		-7
types			
Number of individuals with gender problem	1		
Number of SNPs with plate bias test P value below threshold of $1 \times 10^{-7}$	19		
Number of SNPs used for IBS analysis	73,651		
Number of duplicates pairs or twin	1		
Number of related pairs (including twins)	2		
Number of SNPs used for MDS analysis	80,262		
Number of individuals with ethnicity other than Caucasian as detected by MDS	20		
analysis			
Number of gender problems	1		-1
	Continue	ed on next	page

Table 7.1 – continued from previous page

Description	n	SNPs	IDs
Number of related pairs	2		-2
Number of caucasian outliers	20		-20
Number of controls	5		-5
Number of heterozygote haploid genotypes set to missing (after correction of gen-	277,206		
der problems)			
Number of SNPs with MAF=0	602,480	-602,480	
Number of SNPS with HWE test P Value below threshold of $1 \times 10^{-4}$ and higher	603		
than Bonferroni threshold			
Number of SNPS with HWE test below Bonferroni threshold	162	-162	
Total number of SNPs	1,635,931		
Total number of samples	454		

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