# Reading Genetic Data Files Into R with adegenet and pegas

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adegenet [1] and pegas [3] are two packages that complement each other for population genetic analyses in R. Since various computer programs have been used by population genetists, most of them with their own data file formats, it is crucial that R can read them to ease users to switch to R. The present document explains how to read several file formats commonly used in population genetics. The following formats are considered:

- $\bullet~$  Text (ASCII) in tabular form,
- VCF files.
- FSTAT data format,
- Genetix data format,
- Genepop data format,
- STRUCTURE data format,
- Excel.

Except the last one, these files are stored in text (usually standard ASCII) format the differences being in the layout of the data.

# 1 Data Structures in adegenet and pegas

First, let's have a brief look on the way allelic data are stored by our two packages. adegenet has the class "genind" where individuals are rows and alleles are columns in a matrix named tab. This is an S4 class, so the elements are accessed with the @ operator (e.g., x@tab). Additional information are stored in other slots (@ind.names, @pop, ...) The details can be found with class?genind.

pegas has the class "loci" which is a simple data frame with a mandatory attribute named "locicol" which identifies the columns that are loci; the other columns are additional (individual) variables that may be of any kind. The loci are coded with factors where the different levels are the observed genotypes with the alleles separated with a forward slash, for instance, 'A/A' for a classical genotype, or '132/148' for a microsatellite locus. This is an S3 class. Some examples are given in the next subsection.

 $<sup>^1</sup> For\ details:\ ape-package.ird.fr/pegas/DefinitionDataClassesPegas.pdf.$ 

With version 0.6, pegas supports phased and unphased genotypes (A|A and A/A, respectively). In unphased genotypes, the alleles are sorted with uppercase first, and then in alphabetical order, so that a/A is changed into A/a (even if the latter was not observed in the original data file).

There is no need to choose between these two data structures: they are used by each package and they can be converted between each other with the functions genind2loci (or the generic form as.loci) and loci2genind. Therefore, it is straightforward to run analyses with both packages on the same data.

## 2 Reading Genetic Data Files

#### 2.1 Reading Text Tabular Files

It is intuitive to organise allelic data in a tabular form where each row is an individual and the columns are loci and possibly other variables such as population, spatial locations, and so on. A simple example of such a file would be (file 'toto'):<sup>2</sup>

#### a/a

This file can be read with the pegas function read.loci:

Since the file has no label for the column, we used header = FALSE. Note that printing a "loci" object displays a very brief account of the data; the option details = TRUE allows to print them like a standard data frame. If the same data were formatted with a different allele separator (file 'titi'):

#### a-a

Then this file would be read with:

```
> y <- read.loci("titi", header = FALSE, allele.sep = "-")
> print(y, details = TRUE)
```

<sup>&</sup>lt;sup>2</sup>File contents are printed in blue to distinguish them from R input/output.

We already know file, header, and allele.sep. Note the default value for this last option which specifies that the allele separator can be either a slash or a vertical bar. loci.sep is the separator of the columns (not only the loci) which is one or several spaces by default (use sep = "\t" if a tabulation). col.pop must be an integer giving the index of the column that will be labelled "population" in the returned data; by default there is none. col.loci does the same for the loci; by default all columns are treated as loci except if col.pop is used. Finally '...' may be any further (named) arguments passed to read.table (e.g., skip in case there are comments at the top of the file).

Any level of ploidy is accepted and pegas checks the order of the alleles (see above). For instance the file 'tutu' is:

```
a/a/A
A/a/a

> print(read.loci("tutu", FALSE), TRUE)
     V1
1 A/a/a
2 A/a/a
```

Phased and unphased genotypes can be mixed in a file. For instance the file 'tyty' is:

```
Loc1
A/a
a/A
A|a
a|A

> X <- read.loci("tyty")
> print(X, TRUE)

Loc1
1 A/a
2 A/a
3 A|a
4 a|A
```

```
> summary(X)
Locus Loc1 :
-- Genotype frequencies:
A/a A|a a|A
    2    1    1
-- Allele frequencies:
A a
4 4
```

A more realistic example with four columns—an allozyme locus, a microsat locus, a population assignment, and a phenotypic variable—might be (file 'tata'):

```
Adh2
                 SSR1
                                  size
                         pop
IndA1
        A/A
                 100/200 A
                                  2.3
IndA2
                 100/120 A
                                  2.5
        A/a
IndB1
        A/A
                 100/100 B
                                  2.1
IndB2
                 120/120 B
                                  2.8
        a/a
```

which will be read with:

```
> z \leftarrow read.loci("tata", loci.sep = "\t", col.loci = 2:3, col.pop = 4, row.names = 1) > z
```

Allelic data frame: 4 individuals 2 loci

2 additional variables

> print(z, details = TRUE)

```
Adh2 SSR1 population size
IndA1 A/A 100/200 A 2.3
IndA2 A/A 100/120 A 2.5
IndB1 A/A 100/100 B 2.1
IndB2 a/A 120/120 B 2.8
```

Note row.names which is passed with the '...' argument. To make sure that only the first and the second columns are treated as loci, let us extract the alleles from this data set:

```
> getAlleles(z)

$Adh2
[1] "A" "a"

$SSR1
[1] "100" "120" "200"
```

We may check that the attribute "locicol" has been set correctly, but usually the user does not need:

```
> attr(z, "locicol")
```

#### [1] 1 2

Finally we display the internal structure of the data to see that the additional variables are treated as they should be:

#### > str(z)

```
Classes 'loci' and 'data.frame': 4 obs. of 4 variables:
$ Adh2 : Factor w/ 3 levels "A/A","A/a","a/a": 1 2 1 3
$ SSR1 : Factor w/ 4 levels "100/100","100/120",..: 3 2 1 4
$ population: Factor w/ 2 levels "A","B": 1 1 2 2
$ size : num 2.3 2.5 2.1 2.8
- attr(*, "locicol")= int 1 2
```

#### 2.2 Reading VCF Files

Starting with version 0.6, pegas can read VCF files with the function read.vcf.

```
> args(read.vcf)
function (file, nloci = 1000, skip = 0)
NULL
```

Because VCF files can be very large, only 1000 loci are read. The option skip specifies how many loci to skip before reading the data, so that a file can be read and/or analysed in successive steps.

read.vcf returns an object of class "loci" with the following additional
attributes:

```
CHR: the chromosome number (integer values);
```

POS: the position of the locus (numeric values);

QUAL: the quality of the inferred locus (integer values);

```
FILTER: the filter (characters).
```

VCF files contain a lot more information (genotype likelihoods, ...) which are (currently) not read by read.vcf.

# 2.3 Importing Fstat, Genetix, Genepop, and Structure Data Files

These four programs have their own data format. Roughly, these formats have the same idea: they store the genotypes of individuals from different populations. So, they store genotypes at several loci and an individual categorical variable. Additionally, the GENETIX and STRUCTURE formats allow for individual labels.

adegenet includes four data files in each of these formats of the same microsatellite data set. These files can be displayed in the R console with:

```
> file.show(system.file("files/nancycats.dat", package="adegenet"))
> file.show(system.file("files/nancycats.gtx", package="adegenet"))
> file.show(system.file("files/nancycats.gen", package="adegenet"))
> file.show(system.file("files/nancycats.str", package="adegenet"))
```

If you want to copy these files into the working directory to further display or edit them with your favourite editor, use these commands:

```
> file.copy(system.file("files/nancycats.dat", package = "adegenet"), getwd())
[1] TRUE
> file.copy(system.file("files/nancycats.gtx", package = "adegenet"), getwd())
[1] TRUE
> file.copy(system.file("files/nancycats.gen", package = "adegenet"), getwd())
[1] TRUE
> file.copy(system.file("files/nancycats.str", package = "adegenet"), getwd())
```

adegenet provides four functions to read these formats. Reading the first three formats is straightforward:

```
> A <- read.fstat("nancycats.dat", quiet = TRUE)
> B <- read.genetix("nancycats.gtx", quiet = TRUE)
> C <- read.genepop("nancycats.gen", quiet = TRUE)</pre>
```

Reading a STRUCTURE file is slightly more complicated because the function needs some exta information. This can be done interactively (the default), or by specifying the appropriate options in which case we will use ask = FALSE:

 $\verb| > D <- read.structure("nancycats.str", onerowperind=FALSE, n.ind=237, n.loc=9, col.lab=1, loc=9, loc=9, col.lab=1, loc=9, l$ 

All four data sets are identical (we only compare the tab slots):

- > identical(A@tab, C@tab)
- [1] TRUE

[1] TRUE

- > identical(B@tab, D@tab)
- [1] TRUE

Once the data have been read into R, they can be analysed with adegenet or with pegas after eventually converting them with as.loci. We now delete the data files:

```
> unlink(c("nancycats.dat", "nancycats.gtx", "nancycats.gen", "nancycats.str"))
```

Finally, pegas has the function read.gtx to read a GENETIX data file and return an object of class "loci". This function has no option.

#### 2.4 Importing Excel Files

Excel is widely used for trivial data management, but clearly these data must be exported to other programs for most analyses. This also applies to the free spreadsheet editors such as OpenOffice's Calc or Gnumeric. Several solutions to get such data into R are given below. I assume that the allelic data in the spreadsheet are in a tabular form similar to what we have seen in Section 2.1, so the objective is to have them in R as a "loci" object.

- 1. The simplest solution is to save the spreadsheet as a text file using either the tab-delimited or comma-separated-variable (csv) format. This can be done with any spreadsheet editor since Calc or Gnumeric can import Excel files. Once the text file is created, read.loci can be used with the option loci.sep = "\t" or loci.sep = ",", as well as any other that may be needed.
- 2. If the "Save as..." solution does not work, it is possible to save a sheet, or part of it, in a text file by following these steps:
  - Open the file, again this may be done with any program.
  - Select the cells you want to export; this can be done by clicking once on the top-left cell, and then clicking a second time on the bottom-right cell after pressing the Shift key (this could avoid you a tunnel syndrome and is much easier if many cells must be selected).
  - Copy the selected cells in the clipboard (usually Ctrl-C).
  - Open a text editor (do not use a word processor), paste the content of the clipboard (usually Ctrl-V), and save the file.

The text file can now be read with read.loci(..., loci.sep = "t").

3. If Perl is installed on your computer (this is true for almost all Linux distributions), you can use the function read.xls from the package gdata (available on CRAN) to read directly an Excel file into R (the Perl program actually does the same job than the user does manually in the "Save as..." solution above). By default the first sheet is used, but this can be changed with the sheet option. The returned object is a data frame and can be converted as a "loci" object with as.loci. In that case, the same options that in read.loci can be used (see ?as.loci.).

In my experience, read.xls works well with small to moderate size Excel files but can be very slow with bigger files (> 10 MB).

We also note the function read.genealex in the package poppr [2] which reads a Genalex file that has been exported into csv format and returns an object class "genind".

## 3 Editing and Writing Genetic Data Files

After the data have been read into R, they can be manipulated in the standard way. This is straightforward for the class "loci" since it is a direct extension of data frames. pegas has a few method functions adapted to "loci": rbind,

cbind, and the indexing operator [. Some other functions, such as subset, split, rownames, colnames, or the \$ operator, can be used without problem since they respect additional attributes. Others, such as transform, drop the attributes and so will return a simple data frame.

adegenet allows to edit an object of class "genind", but since this is an S4 class, the elements are accessed with the @ operator. The help page ?genind describes them in details. A few functions are provided to ease the manipulation of "genind" objects because setting all elements by hand may be tedious: seploc splits the data with respect to each locus, seppop does the same with respect to each population, and repool allows to do the opposite operation.

It is also possible to select a part of a "genind" object with the usual indexing operator [, the indices will apply to the rows and/or columns of the @tab slot, and the other slots will be modified accordingly. Some care should be paid when using numerical indexing on columns because something like x[, 1] will only select one allele column, eventually excluding other alleles of the same locus. It is safer to use the option nloc which specifies the loci to be selected, and so will select the appropriate allele columns. Further details are available in ?pop as well as information on some other functions.

In addition to standard data editing, pegas allows to edit a "loci" object with edit or fix. The command edit(x) opens the data in R's spreadsheet-like data editor. Here are a few points about this procedure:

- It is possible to change the row and column labels (rownames and colnames).
- It is possible to add new rows (individuals): if some columns are not filled they will be given NA.
- You can add new genotypes and/or alleles to a locus column: the levels of the corresponding factor will be adjusted and a warning message will inform you of that.
- New columns may be added, but they can only be numerical or character vectors.
- Like most R functions, edit returns its results in the console if no assignment has been done, so you may prefer to call the editor with x <-edit(x) or fix(x).

If you forgot the assignment and don't want to lose all the changes you did, after you have closed the editor you can save the modified data with (only if you don't do any other operation after edit):

x <- .Last.value

#### References

- [1] T.~Jombart. adegenet: a R package for the multivariate analysis of genetic markers. *Bioinformatics*, 24:1403–1405, 2008.
- [2] Z.~N. Kamvar, J.~F. Tabima, and N.~J. Grünwald. *Poppr*: an R package for genetic analysis of populations with clonal, partially clonal, and/or sexual reproduction. *PeerJ*, 2:e281, 2014.

[3] E. Paradis. pegas: an R package for population genetics with an integrated—modular approach.  $Bioinformatics,\ 26:419–420,\ 2010.$