# Package ‘numberofalleles’ 

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Title Compute the Probability Distribution of the Number of Alleles in a DNA Mixture

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Description The number of distinct alleles observed in a DNA mixture is informative of the number of contributors to the mixture. The package provides methods for computing the probability distribution of the number of distinct alleles in a mixture for a given set of allele frequencies. The mixture contributors may be related according to a provided pedigree.
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## R topics documented:

expected_number_of_distinct_alleles ..... 2
mean.pf ..... 3
numberofalleles ..... 4
plot.pf ..... 4
pr_independent_alleles ..... 7
pr_independent_alleles_ped ..... 8
pr_number_of_distinct_alleles ..... 9
pr_total_number_of_distinct_alleles ..... 10
read_allele_freqs ..... 12
var ..... 13
variance_number_of_distinct_alleles ..... 14
Index ..... 16

```
expected_number_of_distinct_alleles
```

                                    Compute the expectation of the number of distinct alleles observed in
                                    a DNA mixture for a locus
    
## Description

For a given number of independent alleles, compute the mean and variance of the number of distinct alleles observed in a DNA mixture.

## Usage

expected_number_of_distinct_alleles(number_of_independent_alleles, f, fst = 0)

## Arguments

number_of_independent_alleles Integer. Number of independent alleles in the mixture.
f Numeric vector with allele frequencies
fst Numeric value for sub-population correction (also known as theta)

## Details

Due to allele sharing between DNA mixture contributors, the number of distinct alleles observed in a mixture is often less than the number of independent alleles in the mixture. For example, if mixture comprises two unrelated contributors, there are four independent alleles. Some of these four independent alleles may be of the same allelic type so that at least one and at most four distinct alleles are observed.

This function computes the probability distribution of the number of distinct alleles observed when the mixtures comprises a given number of independent alleles. Optionally, a sub-population correction may be applied by setting fst>0.

## Value

Expected value (numeric of length one)

## Examples

```
    f<- c(A = 0.1, B = 0.2, C = 0.7)
    e <- expected_number_of_distinct_alleles(3, f)
    # by hand calculation
    p <- pr_number_of_distinct_alleles(3, f)
    e_by_hand <- sum(as.numeric(names(p)) * p)
    stopifnot(isTRUE(all.equal(e, e_by_hand)))
```

mean.pf Mean method for objects of class pf

## Description

Mean method for objects of class pf

## Usage

\#\# S3 method for class 'pf'
mean (x, by_locus = FALSE, ...)

## Arguments

x
Object of class pf: output of pr_total_number_of_distinct_alleles
by_locus
If TRUE then the results will be returned locus by locus
... other arguments that may p

## Value

either a vector of means, one for each locus, or the sum of the locus means. The means are the expected number of alleles observed at each locus

## Examples

```
freqs <- read_allele_freqs(system.file("extdata","FBI_extended_Cauc.csv",
        package = "numberofalleles"))
    p <- pr_total_number_of_distinct_alleles(contributors = c("U1","U2"),
        freqs = freqs)
    mean(p)
    var(p)
```

```
numberofalleles numberofalleles
```


## Description

Probabilities for observing a number of distinct alleles in a forensic DNA mixture

## Author(s)

Maarten Kruijver
plot.pf Plot method for objects of class pf

## Description

Plot method for objects of class pf

## Usage

\#\# S3 method for class 'pf'
plot
x,
lines = TRUE,
points = TRUE,
line_col = "black",
point_col = "black",
xlab = "Number of alleles (n)",
ylab $=\operatorname{expression}\left(\operatorname{Pr}\left(\mathrm{N}^{2}=\mathrm{n}\right)\right)$,
add = FALSE,
)

## Arguments

| x | An object of class pf |
| :--- | :--- |
| lines | if TRUE then lines will be drawn from 0 to the probability value for each x value. |
| points | if TRUE then points will be plotted at the probability value for each x value. |
| line_col | the colour of the lines drawn for each probability mass |
| point_col | the colour of the points plotted for each probability mass |
| xlab | a label for the $x$ axis, defaults to "Number of alleles $(\mathrm{n}) "$ |
| ylab | a label for the y axis, defaults to expression $(\operatorname{Pr}(N==n))$ |
| add | If TRUE then the plotting information will be added to the existing plot. |
| $\ldots$ | Any other arguments that should be sent to plot, arrows, or points. |

## Value

No return value. Has the side effect of plotting to the active graphics device.

## Examples

```
## Load allele frequencies
freqs <- read_allele_freqs(system.file("extdata","FBI_extended_Cauc.csv",
                    package = "numberofalleles"))
gf_loci <- c("D3S1358", "vWA", "D16S539", "CSF1PO", "TPOX", "D8S1179",
        "D21S11", "D18S51", "D2S441", "D19S433", "TH01", "FGA",
        "D22S1045", "D5S818", "D13S317", "D7S820", "SE33",
        "D10S1248", "D1S1656", "D12S391", "D2S1338")
gf_freqs <- freqs[gf_loci]
## Compute the pedigrees for two and three siblings respectively
pedSibs2 = pedtools::nuclearPed(father = "F", mother = "M",
    children = c("S1", "S2"))
pedSibs3 = pedtools::addChildren(father = "F", mother = "M",
    pedSibs2, ids = "S3")
## Compute the probability functions for each of 2 Unknowns, and 2 Sibs
p2U = pr_total_number_of_distinct_alleles(contributors = c("U1", "U2"),
        freqs = gf_freqs)
p2S = pr_total_number_of_distinct_alleles(contributors = c("S1", "S2"),
                                    freqs = gf_freqs,
                                    pedigree = pedSibs2)
## And plot the two probability distribution functions on top of each other
plot(p2U,
    line_col = "red",
    point_col = "red",
    pch = 18,
    lwd = 2,
    ylim = c(0, 0.15),
    xlab = "Total Number of Alleles (TAC)",
    ylab = expression(Pr(N == n~"|"~ P)))
plot(p2S,
    add = TRUE,
    point_col = "blue",
    line_col = "blue",
    lwd = 2)
legend("topleft", legend = c("2 U", "2 S"), fill = c("red", "blue"), bty = "n")
## Compute the LR for the number of peaks given the
# number of contributors and the pedigrees
lr = p2U$pf / p2S$pf
data.df = data.frame(log10lr = log10(lr), noa = p2U$noa)
```

```
## Plot the LR and a grid so that it's easy to see where
# the LR becomes greater than 1
plot(log10lr~noa,
    data = data.df,
    axes = FALSE,
    xlab = "Total number of alleles, n",
    ylab = expression(log[10](LR(P[1],P[2]~"|"~N==n))),
    xaxs = "i", yaxs = "i",
    xlim = c(22,93),
    pch = 18)
axis(1)
y.exponents = seq(-20, 15, by = 5)
for(i in 1:length(y.exponents)){
    if(y.exponents[i] == 0)
        axis(2, at=y.exponents[i], labels="1", las = 1)
    else if(y.exponents[i] == 1)
        axis(2, at=y.exponents[i], labels="10", las = 1)
    else
        axis(2, at = y.exponents[i],
            labels = eval(substitute(
                expression(10^y),
                    list(y = y.exponents[i]))),
                las = 1)
}
grid()
box()
## Let's look at 2 sibs versus 3 sibs
p3S = pr_total_number_of_distinct_alleles(contributors = c("S1", "S2", "S3"),
                        freqs = gf_freqs,
                        pedigree = pedSibs3)
plot(p3S,
    line_col = "green",
    point_col = "green",
    pch = 18,
    lwd = 2,
    ylim = c(0, 0.15),
    xlab = "Total Number of Alleles (TAC)",
    ylab = expression(Pr(N == n~"|"~ P)))
plot(p2S,
    add = TRUE,
    pch = 18,
    point_col = "blue",
    line_col = "blue",
    lwd = 2)
legend("topleft", legend = c("3 S", "2 S"), fill = c("green", "blue"), bty = "n")
## And finally two sibs and one unknown versus three sibs
p2SU = pr_total_number_of_distinct_alleles(contributors = c("S1", "S2", "U1"),
freqs = gf_freqs,
```

```
plot(p3S,
    line_col = "green",
    point_col = "green",
    pch = 18,
    lwd = 2,
    ylim = c(0, 0.15),
    xlab = "Total Number of Alleles (TAC)",
    ylab = expression(Pr(N == n~"|"~ P)))
plot(p2SU,
    add = TRUE,
    pch = 18,
    point_col = "orange",
    line_col = "orange",
    lwd = 2)
legend("topleft", legend = c("3 S", "2 S + U"),
            fill = c("green", "orange"), bty = "n")
```

    pr_independent_alleles
    Compute the probability distribution of the number of independent al-
    leles in a mixture with dropout
    
## Description

Without dropout, each mixture contributor has two independent but not necessarily distinct alleles that are represented in the DNA mixture. If the probability of dropout for a mixture contributor is greater than zero, then the mixture contributor has either 0 (full dropout), 1 (partial dropout) or 2 (no dropout) independent alleles that are represented in the mixture. This function computes the probability distribution of the number of independent alleles that unrelated mixture contributors have in total for a locus given their dropout parameters.

## Usage

pr_independent_alleles(dropout_prs)

## Arguments

dropout_prs Numeric vector. Dropout probabilities per contributor.

## Value

A named numeric vector describing the probability distribution. Numeric values are the probabilities corresponding to the names describing integer values.

## See Also

pr_independent_alleles_ped

## Examples

```
# a dropout pr. of 0.5
p <- pr_independent_alleles(0.5)
stopifnot(all.equal(as.vector(p),
    c(0.5^2, 2 * 0.5*0.5,(1-0.5)^2)))
# one contrib. without dropout and one with d=0.5
p1 <- pr_independent_alleles(c(0, 0.5))
stopifnot(identical(as.integer(names(p1)),
    as.integer(names(p)) + 2L))
```

```
pr_independent_alleles_ped
    Compute the probability distribution of the number of independent al-
    leles in a mixture with dropout and related contributors
```


## Description

When mixture contributors are related according to a pedigree, they may share some alleles identical by descent so that their total number of independent alleles is smaller than two times the number of contributors. The number of independent alleles can be further reduced if dropout plays a role. This function computes the probability distribution of the number of independent alleles that related mixture contributors have in total for a locus given their dropout parameters. Note that the number of distinct alleles that is observed at the locus is typically smaller than the number of independent alleles due to allele sharing.

## Usage

pr_independent_alleles_ped(pedigree, ped_contributors, dropout_prs)

## Arguments

pedigree ped object
ped_contributors
Character vector with unique names of contributors. Valid names are the names of pedigree members.
dropout_prs Numeric vector. Dropout probabilities per contributor.

## Value

A named numeric vector describing the probability distribution. Numeric values are the probabilities corresponding to the names describing integer values.

## See Also

pr_independent_alleles

## Examples

```
# without dropout, a father-mother-child mixture has 4 indep. alleles
p <- pr_independent_alleles_ped(pedtools::nuclearPed(),
    ped_contributors = as.character(1:3),
    dropout_prs = rep(0, 3))
stopifnot(identical(p,
    stats::setNames(1., "4")))
```

pr_number_of_distinct_alleles
Compute the probability distribution of the number of distinct alleles
observed in a DNA mixture for a locus

## Description

For a given number of independent alleles, compute the probability distribution of the number of distinct alleles observed in a DNA mixture.

```
Usage
    pr_number_of_distinct_alleles(
        number_of_independent_alleles,
        f,
        fst = 0,
        brute_force = FALSE
    )
```


## Arguments

number_of_independent_alleles
Integer. Number of independent alleles in the mixture.
$f \quad$ Numeric vector with allele frequencies
fst Numeric value for sub-population correction (also known as theta)
brute_force Logical. Should a brute force algorithm be used?

## Details

Due to allele sharing between DNA mixture contributors, the number of distinct alleles observed in a mixture is often less than the number of independent alleles in the mixture. For example, if mixture comprises two unrelated contributors, there are four independent alleles. Some of these four independent alleles may be of the same allelic type so that at least one and at most four distinct alleles are observed.

This function computes the probability distribution of the number of distinct alleles observed when the mixtures comprises a given number of independent alleles. Optionally, a sub-population correction may be applied by setting $f s t>0$.

An efficient way of computing the probability distribution was given by Tvedebrink (2014) and was slightly adapted by Kruijver \& Curran (2022) to handle the case of an odd number of independent alleles. A much slower brute force algorithm is also implemented (argument brute_force=TRUE) for testing purposes.

## Value

A named numeric vector describing the probability distribution. Numeric values are the probabilities corresponding to the names describing integer values.

## References

M. Kruijver \& J.Curran (2022). 'The number of alleles in DNA mixtures with related contributors', manuscript submitted
T. Tvedebrink (2014). 'On the exact distribution of the number of alleles in DNA mixtures', International Journal of Legal Medicine; 128(3):427-37. doi: 10.1007/s0041401309513

## Examples

```
\(f<-c(A=0.1, B=0.2, C=0.7)\)
p <- pr_number_of_distinct_alleles(3, f)
p_by_hand <- c(sum(f^3), \(1-\operatorname{sum}\left(f^{\wedge} 3\right)-6\) * prod(f), 6 * prod(f))
stopifnot(all.equal(as.vector(p), p_by_hand))
```

```
pr_total_number_of_distinct_alleles
                                    Compute the probability distribution of total number of distinct alleles
    in a DNA mixture
```


## Description

Compute the probability distribution of total number of distinct alleles in a DNA mixture

## Usage

```
pr_total_number_of_distinct_alleles(
    contributors,
    freqs,
    pedigree,
    dropout_prs = rep(0, length(contributors)),
    fst = 0,
    loci = names(freqs)
)
```


## Arguments

contributors Character vector with unique names of contributors. Valid names are "U1", "U2", ... for unrelated contributors or the names of pedigree members for related contributors.
freqs $\quad$ Allele frequencies (see read_allele_freqs)
pedigree (optionally) ped object
dropout_prs Numeric vector. Dropout probabilities per contributor. Defaults to zeroes.
fst Numeric. Defaults to 0 .
loci $\quad$ Character vector of locus names (defaults to names attr. of freqs)

## Details

A DNA mixture of $n$ contributors contains $2 n$ independent alleles per locus if the contributors are unrelated; fewer if they are related. This function computes the probability distribution of the total number of distinct alleles observed across all loci. Mixture contributors may be related according to an optionally specified pedigree. Optionally, a sub-population correction may be applied by setting fst>0.

The case where all contributors are unrelated was discussed by Tvedebrink (2014) and is implemented in the DNAtools package. Kruijver \& Curran (2022) extended this to include related contributors by exploiting the multiPersonIBD function in the ribd package.

## Value

an object of class pf. This is a list containing:

- pf. A named numeric vector describing the probability distribution of the total number of alleles. Numeric values are the probabilities corresponding to the names describing integer values.
- by_locus. A list of probability distributions by locus.
- noa. For convenience, an integer vector with the number of alleles corresponding to the probability distribution pf (the names attribute as integer vector)
- min. For convenience, the minimum of noa
- max. For convenience, the maximum of noa


## References

M. Kruijver \& J.Curran (2022). 'The number of alleles in DNA mixtures with related contributors', manuscript submitted
T. Tvedebrink (2014). 'On the exact distribution of the number of alleles in DNA mixtures', International Journal of Legal Medicine; 128(3):427-37. doi: 10.1007/s0041401309513

## Examples

```
    # define a pedigree of siblings S1 and S2 (and their parents)
    ped_sibs <- pedtools::nuclearPed(children = c("S1", "S2"))
    # define allele frequencies
    freqs <- list(locus1 = c(0.1, 0.9),
        locus2 = c(0.25, 0.5, 0.25))
    # compute dist. of number of alleles for two siblings and one unrelated persons
pr_total_number_of_distinct_alleles(contributors = c("S1","S2","U1"), freqs,
            pedigree = ped_sibs)
## GlobalFiler example (2 unrelated contributors)
freqs <- read_allele_freqs(system.file("extdata","FBI_extended_Cauc.csv",
package = "numberofalleles"))
gf_loci <- c("D3S1358", "vWA", "D16S539", "CSF1PO", "TPOX", "D8S1179",
    "D21S11", "D18S51", "D2S441", "D19S433", "TH01", "FGA",
    "D22S1045", "D5S818", "D13S317", "D7S820", "SE33",
    "D10S1248", "D1S1656", "D12S391", "D2S1338")
p_gf <- pr_total_number_of_distinct_alleles(contributors = c("U1", "U2"),
                        freqs = freqs, loci = gf_loci)
barplot(p_gf$pf)
```

read_allele_freqs Read allele frequencies in FSIgen format (.csv)

## Description

Read allele frequencies in FSIgen format (.csv)

## Usage

read_allele_freqs(filename, remove_zeroes = TRUE, normalise = TRUE)

## Arguments

filename Path to csv file.
remove_zeroes Logical. Should frequencies of 0 be removed from the return value? Default is TRUE.
normalise Logical. Should frequencies be normalised to sum to 1? Default is TRUE.

## Details

Reads allele frequencies from a .csv file. The file should be in FSIgen format, i.e. comma separated with the first column specifying the allele labels and one column per locus. The last row should be the number of observations. No error checking is done since the file format is only loosely defined, e.g. we do not restrict the first column name or the last row name.

## Value

list

## Examples

```
# below we read an allele freqs file that comes with the package
filename <- system.file("extdata","FBI_extended_Cauc.csv",package = "numberofalleles")
freqs <- read_allele_freqs(filename)
freqs # the output is just a list with an N attribute
```

var Variance method for objects of class pf

## Description

Variance method for objects of class pf
Variance method for pf object

## Usage

$$
\operatorname{var}(x, \ldots)
$$

\#\# S3 method for class 'pf'
$\operatorname{var}(x$, by_locus $=$ FALSE,...$)$

## Arguments

x
... other arguments that may $p$
by_locus If TRUE then the results will be returned locus by locus

## Value

Either a vector of variances, one for each locus, or the sum of the locus variances. The variances are the variances of the number of alleles observed at each locus.

## See Also

mean.pf

## Examples

```
freqs <- read_allele_freqs(system.file("extdata","FBI_extended_Cauc.csv",
        package = "numberofalleles"))
p <- pr_total_number_of_distinct_alleles(contributors = c("U1","U2"),
                        freqs = freqs)
mean(p)
var(p)
```

variance_number_of_distinct_alleles
Compute the variance of the number of distinct alleles observed in a
DNA mixture for a locus

## Description

For a given number of independent alleles, compute the mean and variance of the number of distinct alleles observed in a DNA mixture.

## Usage

variance_number_of_distinct_alleles(number_of_independent_alleles, f, fst = 0)

## Arguments

number_of_independent_alleles
Integer. Number of independent alleles in the mixture.
f Numeric vector with allele frequencies
fst Numeric value for sub-population correction (also known as theta)

## Details

Due to allele sharing between DNA mixture contributors, the number of distinct alleles observed in a mixture is often less than the number of independent alleles in the mixture. For example, if mixture comprises two unrelated contributors, there are four independent alleles. Some of these four independent alleles may be of the same allelic type so that at least one and at most four distinct alleles are observed.

This function computes the probability distribution of the number of distinct alleles observed when the mixtures comprises a given number of independent alleles. Optionally, a sub-population correction may be applied by setting fst>0.

## Value

Variance (numeric of length one)

## Examples

```
f<- c(A = 0.1, B = 0.2, C = 0.7)
v <- variance_number_of_distinct_alleles(3, f)
# now compute variance by hand from the full pr. dist of N
p <- pr_number_of_distinct_alleles(3, f)
n <- as.numeric(names(p))
p_n <- as.vector(p)
# compute expected value
ev <- expected_number_of_distinct_alleles(3, f)
# and variance by hand
v2 <- sum(p_n * (n - ev)^2)
stopifnot(all.equal(v,v2))
```


## Index

```
expected_number_of_distinct_alleles,2
mean.pf, 3, l3
multiPersonIBD,11
numberofalleles,4
ped, 8, 11
plot.pf,4
pr_independent_alleles, 7, 8
pr_independent_alleles_ped, 7, 8
pr_number_of_distinct_alleles, }
pr_total_number_of_distinct_alleles, 3,
    10,13
read_allele_freqs, 11,12
var,13
variance_number_of_distinct_alleles,
    14
```

