

Package ‘QFASA’

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Title Quantitative Fatty Acid Signature Analysis

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Description Accurate estimates of the diets of predators are required in many areas of ecology, but for many species current methods are imprecise, limited to the last meal, and often biased. The diversity of fatty acids and their patterns in organisms, coupled with the narrow limitations on their biosynthesis, properties of digestion in monogastric animals, and the prevalence of large storage reservoirs of lipid in many predators, led to the development of quantitative fatty acid signature analysis (QFASA) to study predator diets.

Depends R (>= 3.5.0)

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Encoding UTF-8

LazyData true

Imports stats, Rsolnp, boot, futile.logger, gamlss, gamlss.dist, vegan, bootstrap, Compositional, TMB, compositions, MASS, dplyr, mvtnorm,

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VignetteBuilder rmarkdown, knitr

Suggests plyr, knitr, rmarkdown, testthat, gtools

BugReports <https://github.com/cstewartGH/QFASA/issues>

URL <https://CRAN.R-project.org/package=QFASA>

NeedsCompilation yes

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<i>AIT.dist</i>	<i>Returns the distance between two compositional vectors using Aitchison's distance measure.</i>
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Description

Returns the distance between two compositional vectors using Aitchison's distance measure.

Usage

`AIT.dist(x.1, x.2)`

Arguments

- `x.1` compositional vector
- `x.2` compositional vector

References

Aitchison, J., (1992) On criteria for measures of compositional difference. *Mathematical Geology*, 24(4), pp.365-379.

Connie Stewart (2017) An approach to measure distance between compositional diet estimates containing essential zeros, *Journal of Applied Statistics*, 44:7, 1137-1152, DOI: 10.1080/02664763.2016.1193846

<i>AIT.more</i>	<i>Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and Aitchison distance measure.</i>
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Description

Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and Aitchison distance measure.

Usage

`AIT.more(alpha, predator, prey.quantiles)`

Arguments

alpha	compositional QFASA diet estimate.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.

AIT.obj	<i>Used in solnp() as the objective function to be minimized when Aitchison distance measure is chosen.</i>
---------	-------------------------------------------------------------------------------------------------------------

Description

Used in solnp() as the objective function to be minimized when Aitchison distance measure is chosen.

Usage

```
AIT.obj(alpha, predator, prey.quantiles)
```

Arguments

alpha	vector over which minimization takes place.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.

bal.diet.data	<i>Sample example of balanced repeatability diet estimates data with only two repeated measurements per predator.</i>
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Description

Sample example of balanced repeatability diet estimates data with only two repeated measurements per predator.

Usage

```
bal.diet.data
```

Format

A data frame with 100 predator diets (50 unique predators) and 13 variables:

Seal.ID Predator (1 to 50)

Year Either 1 or 2

capelin estimated diet proportion

coho estimated diet proportion

eulachon estimated diet proportion

herring estimated diet proportion

mackerel estimated diet proportion

pilchard estimated diet proportion

pollock estimated diet proportion

sandlance estimated diet proportion

squid estimated diet proportion

surfsmelt_s estimated diet proportion

sufsmelt_lg estimated diet proportion

CC

Fatty acid calibration coefficients.

Description

Fatty acid calibration coefficients.

Usage

CC

Format

A data frame with 66 observations and 2 variables:

FA fatty acid names

CC calibration coefficient for corresponding fatty acid

chisq.CA	<i>Called by create.d.mat() to compute the chi-square distance.</i>
----------	---------------------------------------------------------------------

Description

Called by create.d.mat() to compute the chi-square distance.

Usage

```
chisq.CA(x1, x2)
```

Arguments

x1	vector
x2	vector

chisq.dist	<i>Returns the distance between two compositional vectors using the chi-square distance.</i>
------------	----------------------------------------------------------------------------------------------

Description

Returns the distance between two compositional vectors using the chi-square distance.

Usage

```
chisq.dist(x.1, x.2, gamma)
```

Arguments

x.1	compositional vector
x.2	compositional vector
gamma	power transform taken to be 1.

References

Stewart, C., Iverson, S. and Field, C. (2014) Testing for a change in diet using fatty acid signatures. *Environmental and Ecological Statistics* 21, pp. 775-792.

Connie Stewart (2017) An approach to measure distance between compositional diet estimates containing essential zeros, *Journal of Applied Statistics*, 44:7, 1137-1152, DOI: 10.1080/02664763.2016.1193846

Description

Computes a measure of repeatability for a sample of predators with repeated diet estimate measurements.

Usage

```
comp.rep(
  data,
  prey.database,
  fatcont.mat,
  dist.meas,
  ext.fa,
  B = 50,
  R = 100,
  CI = FALSE,
  alpha = 0.05,
  gamma.QFASA = 1,
  gamma.rho = 1
)
```

Arguments

data	data frame of diet estimates. First column must denote the predator and second column the second factor (eg. year or season).
prey.database	prey data base that was used to compute the QFASA diet estimates in data. Will be used to generate pseudo predators.
fatcont.mat	data frame or matrix of length equal to the number of prey FA signatures in prey data base. First column is name of species and second column is lipid.
dist.meas	distance measure to use in p.QFASA.
ext.fa	subset of FAs to use.
B	number of pseudo predators samples to generate for bias calculation. Default is set to 50 because is slow to run.
R	number of bootstrap samples (i.e. R samples for each generated sample of pseudo predators). Default is set to 100 because it is slow to run.
CI	indicates if a confidence interval for rho is to be calculated. Default is FALSE since this is time consuming to obtain.
alpha	a $(1-\alpha/2) \times 100$ percent confidence interval is calculated for rho if CI=TRUE.
gamma.QFASA	if dist.meas=3, gamma is required. Default is 1.
gamma.rho	value of gamma to be used to compute CS distance in repeatability functions. Default is 1.

Value

Bias corrected measure of repeatability, estimate of the bias and (if CI=TRUE) a confidence interval for the true repeatability.

References

"Repeatability for Compositional Diet Estimates with Zeros". Contact Connie Stewart (cstewart@unb.ca).

Examples

```
## These examples take some time to run.
## Please uncomment code below to run them.

# data(prexFAs)
# data(FAs)

## Balanced Diet Data

my.preybase <- preyFAs[, -c(1,3)]
my.preybase[, -1] <- my.preybase[, -1]/rowSums(my.preybase[, -1])

set.seed(10)

comp.rep(data = bal.diet.data, prey.database=my.preybase,
#fatcont.mat = as.data.frame(prexFAs[, c(2,3)]), dist.meas=2,
#ext.fa = as.vector(unlist(FAs)))

## Unbalanced Diet Data

my.preybase <- preyFAs[, -c(1,3)]
my.preybase[, -1] <- my.preybase[, -1]/rowSums(my.preybase[, -1])

set.seed(10)

comp.rep(unbal.diet.data, my.preybase, as.data.frame(prexFAs[, c(2,3)]), 2,
as.vector(unlist(FAs)))
```

 conf.meth

Confidence Intervals for Diet Proportions

Description

Returns simultaneous confidence intervals for the diet of each species in the prey database.

Usage

```

conf.meth(
  predator.mat,
  prey.mat,
  p.mat,
  cal.mat = rep(1, length(ext.fa)),
  dist.meas,
  FC = rep(1, nrow(preymat)),
  alpha = 0.05,
  nprey = 30,
  R.p = 1,
  R.ps = 100,
  R = 100,
  R.bias = 100,
  noise = 0,
  ext.fa
)

```

Arguments

predator.mat	matrix containing fatty acid signatures of the predators with fatty acids summing to one.
prey.mat	prey database. A data frame with first column a Species label and other columns fatty acid proportions summing to one..
p.mat	matrix of previously computed predator diet estimates needed for confidence interval calculation.
cal.mat	matrix or vector of calibration coefficients of predators. Each COLUMN corresponds to a different predator. Default is a vector of ones. The number of fatty acids should be the same as the number of predator and prey fatty acids.
dist.meas	distance measure to use for estimation: 1=KL, 2=AIT or 3=CS
FC	vector of prey fat content, one for each individual in prey database. Note that this vector is passed to the gen.pseudo.seals which expects fat content values for individual prey samples while pseudo.seal and p.QFASA expect a species average. Default is a vector of ones.
alpha	1-alpha is the family-wise or overall confidence level. Default is 0.05 for an overall confidence level of 0.95.
nprey	number of prey to sample from the prey database when generating pseudo predators for the nuisance parameter estimation using original QFASA simulating code. Default is 30.
R.p	number of times to re-sample data. Due to algorithm being slow, the default parameter is 1.
R.ps	number of pseudo predators to generate when estimating nuisance parameters. Default is 100.
R	number of bootstrap replicates to use when generating p-values for confidence interval estimation. Default is 100.

R.bias	number of replicates for bias computation. Default is 100.
noise	proportion of noise to include in the generation of pseudo predators using original QFASA simulating code.
ext.fa	subset of fatty acids to be used. These should be the same as those in predator.mat, prey.mat and cal.mat.

Details

Intervals are biased corrected as recommended in Stewart, C. (2013). Intervals are slow to obtain, particularly if there are many prey types. See vignette on parallel execution to speed up calculations.

Value

Simultaneous $(1-\alpha)*100$ zero-inflated beta distribution.

References

Stewart, C. (2013) Zero-inflated beta distribution for modeling the proportions in quantitative fatty acid signature analysis. *Journal of Applied Statistics*, 40(5), 985-992.

Examples

```
## Reducing prey database to three species so that code below will run more quickly.
## Please uncomment code to run.

#set.seed(1234)
## Fatty Acids
#data(FAs)
#fa.set = as.vector(unlist(FAs))

## Sample of Predators
#data(predatorFAs)
#predator.matrix = predatorFAs[, -c(1:4)]
#predator.matrix.ext = predatorFAs[, fa.set]
#predator.matrix.ext = predator.matrix.ext/rowSums(predator.matrix.ext)

# Prey Database
#prey.red =
#preyFAs[preyFAs$Species=="capelin"|preyFAs$Species=="herring"|preyFAs$Species=="sandlance", ]
#prey.red = prey.red[, -c(1,3)]
#prey.red.ext = prey.red[, c("Species", fa.set)]
#prey.red.ext[, -1] <- prey.red.ext[, -1]/rowSums(pre.y.red.ext[, -1])
#prey.red.ext.means = MEANmeth(pre.y.red.ext)

## Calibration Coefficients

#data(CC)
#cal.vec = CC[CC$FA %in% fa.set, 2]

#diet.est <- p.QFASA(predator.mat = predator.matrix.ext,
#                    prey.mat = prey.red.ext.means,
```

```

#           cal.mat = cal.vec,
#           dist.meas = 2,
#           start.val = rep(1,nrow(pre.y.red.ext.means)),
#           ext.fa = fa.set)[['Diet Estimates']]

## conf.meth needs the full prey matrix unlike in p.QFASA
#ci <- conf.meth(predator.mat = predator.matrix.ext, prey.mat = prey.red.ext, cal.mat = cal.vec,
#               p.mat = diet.est, dist.meas = 2, ext.fa = fa.set)

```

create.d.mat	<i>Called by testfordiff.ind.boot.fun() to create a matrix of distances.</i>
--------------	------------------------------------------------------------------------------

Description

Called by testfordiff.ind.boot.fun() to create a matrix of distances.

Usage

```
create.d.mat(Y.1, Y.2)
```

Arguments

Y.1	vector
Y.2	vector

CS.more	<i>Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and chi-square distance measure.</i>
---------	------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------

Description

Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and chi-square distance measure.

Usage

```
CS.more(alpha, predator, prey.quantiles, gamma)
```

Arguments

alpha	compositional QFASA diet estimate.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.
gamma	power transform exponent (see chisq.dist()).

CS.obj	<i>Used in solnp() as the objective function to be minimized when chi-square distance measure is chosen. Unlike AIT.obj() and KL.obj(), does not require modifying zeros.</i>
--------	-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------

Description

Used in solnp() as the objective function to be minimized when chi-square distance measure is chosen. Unlike AIT.obj() and KL.obj(), does not require modifying zeros.

Usage

```
CS.obj(alpha, predator, prey.quantiles, gamma)
```

Arguments

alpha	vector over which minimization takes place.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.
gamma	power transform exponent (see chisq.dist()).

FAs _{set}	<i>List of fatty acids used in sample prey and predator data sets, preyFAs and predatorFAs respectively.</i>
--------------------	--------------------------------------------------------------------------------------------------------------

Description

List of fatty acids used in sample prey and predator data sets, preyFAs and predatorFAs respectively.

Usage

```
FAsset
```

Format

A data frame with 39 observations and 1 variable:

FA Fatty acid name

KL.dist	<i>Returns the distance between two compositional vectors using Kullback–Leibler distance measure.</i>
---------	--------------------------------------------------------------------------------------------------------

Description

Returns the distance between two compositional vectors using Kullback–Leibler distance measure.

Usage

```
KL.dist(x.1, x.2)
```

Arguments

x.1	compositional vector
x.2	compositional vector

References

S.J. Iverson, C. Field, W.D. Bowen, and W. Blanchard (2004) Quantitative fatty acid signature analysis: A new method of estimating predator diets, *Ecological Monographs* 72, pp. 211-235.

KL.more	<i>Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and Kullback-Leibler distance measure.</i>
---------	------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------

Description

Used to provide additional information on various model components evaluated at the optimal solution, i.e., using the QFASA diet estimates and Kullback-Leibler distance measure.

Usage

```
KL.more(alpha, predator, prey.quantiles)
```

Arguments

alpha	compositional QFASA diet estimate.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.

KL.obj	<i>Used in solnp() as the objective function to be minimized when Kullback–Leibler distance measure is chosen.</i>
--------	--------------------------------------------------------------------------------------------------------------------

Description

Used in solnp() as the objective function to be minimized when Kullback–Leibler distance measure is chosen.

Usage

```
KL.obj(alpha, predator, prey.quantiles)
```

Arguments

alpha	vector over which minimization takes place.
predator	fatty acid signature of predator.
prey.quantiles	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.

mean.geometric	<i>Returns the geometric mean of a compositional vector</i>
----------------	-------------------------------------------------------------

Description

Returns the geometric mean of a compositional vector

Usage

```
## S3 method for class 'geometric'
mean(x)
```

Arguments

x	compositional vector
---	----------------------

MEANmeth	<i>Returns the multivariate mean FA signature of each prey group entered into the QFASA model. Result can be passed to prey.mat in p.QFASA().</i>
----------	---------------------------------------------------------------------------------------------------------------------------------------------------

Description

Returns the multivariate mean FA signature of each prey group entered into the QFASA model. Result can be passed to prey.mat in p.QFASA().

Usage

```
MEANmeth(preymat)
```

Arguments

preymat	matrix containing the FA signatures of the prey. The first column indexes the prey group.
---------	-------------------------------------------------------------------------------------------

p.MLE	<i>Returns simplified MLE diet estimates corresponding to a sample of predators.</i>
-------	--------------------------------------------------------------------------------------

Description

Computes the diet estimate for each predator in *pred.mat* using the simplified MLE method, without the use of random effects.

Usage

```
p.MLE(predmat, preymat, calmat, FC, extfa)
```

Arguments

predmat	matrix containing the FA signatures of the predators.
preymat	matrix containing the FA signatures of the individual prey. The first column must index the prey group. <i>preymat</i> is the prey database.
calmat	matrix of calibration factors where the <i>i</i> th column is to be used with the <i>i</i> th predator. If modelling is to be done without calibration coefficients, simply pass a vector or matrix of ones.
FC	vector of fat content of length equal to the number of prey groups or species.
extfa	subset of fatty acids to be used to obtain diet estimates.

Details

The assumed model is similar to the MUFASA model but the random effects are replaced by the prey species' sample means to speed up computations. Unlike *p.MUFASA*, this function does not require integration and hence is much faster.

Value

A list with components:

Diet_Estimates A matrix of the diet estimates for each predator where each row corresponds to a predator and the columns to prey species. The estimates are expressed as proportions summing to one.

Var_Epsilon Optimized values of error variance. See reference.

nll Negative log likelihood values. As per *solnp* documentation, *nll* is a "vector of function values during optimization with last one the value at the optimal".

References

Steeves, Holly (2020) Maximum likelihood approach to diet estimation and inference based on fatty acid signatures. PhD thesis available at <https://dalspace.library.dal.ca/handle/10222/80034>.

Examples

```
## This example takes some time to run.
## Please uncomment the code below to run.

#library(dplyr)
#library(compositions)

## Fatty Acids
#data(FAset)
#ext.fa <- as.vector(unlist(FAset))

## Predators
#data(predatorFAs)
#pred.mat <- predatorFAs[, -c(1:4)]
#n.pred <- nrow(pred.mat)

## Prey
#data(prexFAs)
#prey.mat <- prexFAs[, -c(1,3)]

#FC = prexFAs[,c(2,3)]
#FC = as.vector(tapply(FC$lipid,FC$Species,mean,na.rm=TRUE))

## Calibration Coefficients
#data(CC)
#cal.vec = CC[,2]
#cal.mat = replicate(n.pred, cal.vec)
```



```
#rownames(cal.mat) <- CC$FA

## Diet Estimates
#mle.est <- p.MLE(pred.mat, prey.mat, cal.mat, FC, ext.fa)
#mle.est$"Diet Estimates"
```

p.MUFASA *Returns MUFASA diet estimates corresponding to a sample of predators.*

Description

Computes the diet estimate for each predator in *pred.mat* using MLE method.

Usage

```
p.MUFASA(pred.mat, prey.mat, cal.mat, FC, ext.fa)
```

Arguments

pred.mat	matrix containing the FA signatures of the predators.
prey.mat	matrix containing FA signatures from each prey group The first column must index the prey group. <i>prey.mat</i> is the prey database.
cal.mat	matrix of calibration factors where the <i>i</i> th column is to be used with the <i>i</i> th predator. If modelling is to be done without calibration coefficients, simply pass a vector or matrix of ones. <i>cal.mat</i> must contain names of FAs.
FC	vector of fat content of length equal to the number of prey groups or species.
ext.fa	subset of fatty acids to be used to obtain QFASA diet estimates.

Value

A list with components:

Diet_Estimates	A matrix of the diet estimates for each predator where each row corresponds to a predator and the columns to prey species. The estimates are expressed as proportions summing to one.
nll	Negative log likelihood values. As per <i>solnp</i> documentation, <i>nll</i> is "Vector of function values during optimization with last one the value at the optimal".
Var_Epsilon	Optimized values of error variance. See reference.

References

Steeves, Holly (2020) Maximum likelihood approach to diet estimation and inference based on fatty acid signatures. PhD thesis available at <https://dalspace.library.dal.ca/handle/10222/80034>.

See Also

p.MLE() for a simplified version of *p.MUFASA()* that is faster to run.

Examples

```
## This example takes some time to run.
## Please uncomment code below to run.

#library(dplyr)
#library(compositions)
## Fatty Acids
#data(FAs)
#fa.set = as.vector(unlist(FAs))

## Predators
#data(predatorFAs)
#tombstone.info = predatorFAs[,1:4]
#predator.matrix = predatorFAs[,5:(ncol(predatorFAs))]
#npredators = nrow(predator.matrix)

## Prey
## Extracting a small number of species to speed up calculations for the example.
#data(prexFAs)
#prey.matrix = prexFAs[,-c(1,3)]
#spec.red <-c("capelin", "herring", "mackerel", "pilchard", "sandlance")
#spec.red <- sort(spec.red)
#prey.red <- prey.matrix %>% filter(Species %in% spec.red)

## Fat content
#FC = prexFAs[,c(2,3)]
#FC = FC %>% arrange(Species)
#FC.vec = tapply(FC$lipid,FC$Species,mean,na.rm=TRUE)
#FC.red <- FC.vec[spec.red]

## Calibration Coefficients
#data(CC)
#cal.vec = CC[,2]
#cal.m = replicate(npredators, cal.vec)
#rownames(cal.m) <- CC$FA

#M <- p.MUFASA(predator.matrix, prey.red, cal.m, FC.red, fa.set)

## Diet Estimates

#M$Diet_Estimates
```

Description

Computes the diet estimate for each predator in *predator.mat* using either the Kullback-Leibler Distance (KL), the Aitchison Distance (AIT) or the Chi-Square Distance (CS).

Usage

```
p.QFASA(
  predator.mat,
  prey.mat,
  cal.mat,
  dist.meas,
  gamma = 1,
  FC = rep(1, nrow(preymat)),
  start.val = rep(0.99999, nrow(preymat)),
  ext.fa
)
```

Arguments

<code>predator.mat</code>	matrix containing the FA signatures of the predators.
<code>prey.mat</code>	matrix containing a representative FA signature from each prey group (usually the mean). The first column must index the prey group. Note can use function <i>MEANmeth</i> to calculate the means.
<code>cal.mat</code>	matrix of calibration factors where the <i>i</i> th column is to be used with the <i>i</i> th predator. If modelling is to be done without calibration coefficients, simply pass a vector or matrix of ones.
<code>dist.meas</code>	distance measure to use for estimation: 1=KL, 2=AIT or 3=CS
<code>gamma</code>	parameter required for calculations using CS distance (passed to CS.obj). Currently being set to 1.
<code>FC</code>	vector of fat content of length equal to the number of prey groups or species.
<code>start.val</code>	initial vector of parameters to be optimized
<code>ext.fa</code>	subset of fatty acids to be used to obtain QFASA diet estimates.

Details

Before carrying out an analysis using QFASA, rows of prey database must be normalized to sum to one. See Example for code that extracts a subset of FAs and then normalizes the prey database signatures.

Value

A list with components:

Diet Estimates A matrix of the diet estimates for each predator where each row corresponds to a predator and the columns to prey species. The estimates are expressed as proportions summing to one.

Additional Measures

	For each predator for which a diet estimate was obtained:
ModFAS	the value of the modelled fatty acid. These are expressed as proportions summing to one.
DistCont	The contribution of each fatty acid to the final minimized distance.
PropDistCont	The contribution of each fatty acid to the final minimized distance as a proportion of the total.
MinDist	The final minimized distance.

References

Iverson, Sara J., Field, Chris, Bowen, W. Don and Blanchard, Wade (2004) Quantitative Fatty Acid Signature Analysis: A New Method of Estimating Predator Diets. *Ecological Monographs*, 74(2), 211-235

Examples

```
## Fatty Acids
data(FASet)
fa.set = as.vector(unlist(FASet))

## Predators
data(predatorFAs)
tombstone.info = predatorFAs[,1:4]
predator.matrix = predatorFAs[,5:(ncol(predatorFAs))]
npredators = nrow(predator.matrix)

## Prey
data(prexFAs)
prey.sub=(prexFAs[,4:(ncol(prexFAs))])[fa.set]
prey.sub=prey.sub/apply(prey.sub,1,sum)
group=as.vector(prexFAs$Species)
prey.matrix=cbind(group,prey.sub)
prey.matrix=MEANmeth(prey.matrix)

## Fat Content
FC = prexFAs[,c(2,3)]
FC = as.vector(tapply(FC$lipid,FC$Species,mean,na.rm=TRUE))

## Calibration Coefficients
data(CC)
cal.vec = CC[,2]
cal.mat = replicate(npredators, cal.vec)

## Run QFASA
Q = p.QFASA(predator.matrix,
            prey.matrix,
            cal.mat,
            dist.meas = 1,
            gamma=1,
```

```

FC,
start.val = rep(1,nrow(preymatrix)),
fa.set)

## Diet Estimates
DietEst = Q$'Diet Estimates'
```

p.sim.QFASA	<i>Simultaneous estimation of diet composition and calibration coefficients</i>
-------------	---------------------------------------------------------------------------------

Description

Computes the diet estimate for each predator in *pred.sig* as well as an overall estimate of the calibration coefficient vector.

Usage

```
p.sim.QFASA(pred.sig, prey.mat, FC = rep(1, nrow(preymat)))
```

Arguments

pred.sig	matrix containing the FA signatures of the predator
prey.mat	matrix containing a representative FA signature from each prey group (usually the mean). The first column must index the prey group.
FC	vector of fat content of length equal to the number of prey groups (or species)

Details

Starting values for the diet estimates are equal proportions and a vector of ones is used for the calibration coefficients.

Value

A list with components:

diet.est	A matrix of the diet estimates for each predator where each row corresponds to a predator and the columns to prey species. The estimates are expressed as proportions summing to one.
cc.est	Estimated vector of calibration coefficients

References

Bromaghin, Jeffrey F., Budge, Suzanne M., Thiemann, Gregory and Rode, Karyn D. (2017) Simultaneous estimation of the diet composition and calibration coefficients with fatty acid signature data. *Ecology and Evolution*, 7(16), 6103-6113

Examples

```
## This example takes some time to run.
## Please uncomment code below to run.

## Fatty Acids
#data(Faset)
#fa.set = as.vector(unlist(Faset))

## Predators
#data(predatorFAs)
#tombstone.info = predatorFAs[,1:4]
#predator.matrix = predatorFAs[,5:(ncol(predatorFAs))]
#npredators = nrow(predator.matrix)

## Need predator and prey to have same length

#predator.ext <- predator.matrix[fa.set]
#predator.ext <- predator.ext/rowSums(predator.ext)

## Prey
#data(prexFAs)
#prey.sub=(prexFAs[,4:(ncol(prexFAs))])[fa.set]
#prey.sub=prey.sub/apply(prex.sub,1,sum)
#group=as.vector(prexFAs$Species)
#prey.matrix=cbind(group,prey.sub)
#prey.matrix=MEANmeth(prex.matrix)

## Fat Content
#FC = prexFAs[,c(2,3)]
#FC = as.vector(tapply(FC$lipid,FC$Species,mean,na.rm=TRUE))

#Q.sim <-p.sim.QFASA(predator.ext,prey.matrix,FC)
## Average Diet Estimate
#round(colMeans(Q.sim[[1]]),3)
## Calibration Coefficients
#Q.sim[[2]]
```

p.SMUFASA

Simultaneous maximum unified fatty acid signature analysis

Description

Returns SMUFASA calibration coefficient estimates and an average diet among a sample of predators.

Usage

```
p.SMUFASA(pred.mat, prey.mat, FC, ext.fa)
```

Arguments

pred.mat	matrix containing the FA signatures of the predators.
prey.mat	matrix containing a representative FA signature from each prey group (usually the mean). The first column must index the prey group.
FC	vector of fat content of length equal to the number of prey groups or species.
ext.fa	subset of fatty acids to be used to obtain estimates.

Details

Calibration coefficients (CCs) are not supplied but are instead estimated. While one overall diet is computed, the CCs can be used in p.QFASA or p.MUFASA to estimate individual diet estimates.

Value

A list with components:

Cal_Estimates	A vector of estimated calibration coefficients common to all predators. The k th value corresponds to the k th fatty acid. The estimates sum to the number of fatty acids.
Diet_Estimate	A vector of estimates of the average diet among the predators. The estimates are expressed as proportions summing to one.
Var_Epsilon	Optimized values of error variance.
nll	Negative log likelihood values. As per <i>solnp</i> documentation, <i>nll</i> is "Vector of function values during optimization with last one the value at the optimal".

Examples

```
## This example takes some time to run.
## Please uncomment code below to run.

#library(dplyr)
#library(compositions)
## Fatty Acids
#data(FAs)
#fa.set = as.vector(unlist(FAs))

## Predators
#data(predatorFAs)
#tombstone.info = predatorFAs[,1:4]
#predator.matrix = predatorFAs[,5:(ncol(predatorFAs))]
#npredators = nrow(predator.matrix)

## Prey
## Extracting a small number of species to speed up calculations for the example.
#data(prexFAs)
#prey.matrix = prexFAs[,-c(1,3)]
#spec.red <-c("capelin", "herring", "mackerel", "pilchard", "sandlance")
#spec.red <- sort(spec.red)
#prey.red <- prey.matrix %>% filter(Species %in% spec.red)
```

```
## Fat content
#FC = preyFAs[,c(2,3)]
#FC = FC %>% arrange(Species)
#FC.vec = tapply(FC$lipid,FC$Species,mean,na.rm=TRUE)
#FC.red <- FC.vec[spec.red]

#out <- p.SMUFASA(predator.matrix, prey.red, FC.red, fa.set)

#out$Cal_Estimates
```

POOLVARmeth	<i>Computes within species variance-covariance matrices on transformed scaled, along with a pooled estimate.</i>
-------------	------------------------------------------------------------------------------------------------------------------

Description

Computes within species variance-covariance matrices on transformed scaled, along with a pooled estimate.

Usage

```
POOLVARmeth(prey.mat)
```

Arguments

prey.mat matrix containing transformed FA signatures of the prey. Note that the first column indexes prey type.

Value

Returns the variance-covariance matrix of each prey type as well as a pooled estimate of the variance-covariance matrix

predatorFAs	<i>Predator fatty acid signatures. Each predator signature is a row with fatty acid proportions in columns.</i>
-------------	-----------------------------------------------------------------------------------------------------------------

Description

Fatty acid signatures are subsetted for the chosen fatty acid set and renormalized during the modelling so there is no need to subset and/or renormalize prior to running p.QFASA. However, make sure that the the same fatty acids appear in the predator and prey files (if a FA appears in one but not the other the code will give you an error).

Usage

predatorFAs

Format

A data frame with 10 observations and 70 variables:

SampleCode TODO

AnimalCode TODO

SampleGroup TODO

Biopsy TODO

c12.0

c13.0

Iso14

c14.0

c14.1w9

c14.1w7

c14.1w5

Iso15

Anti15

c15.0

c15.1w8

c15.1w6

Iso16

c16.0

c16.1w11

c16.1w9

c16.1w7

c7Mec16.0

c16.1w5

c16.2w6

Iso17

c16.2w4

c16.3w6

c17.0

c16.3w4

c17.1

c16.4w3

c16.4w1

c18.0
c18.1w13
c18.1w11
c18.1w9
c18.1w7
c18.1w5
c18.2d5.11
c18.2w7
c18.2w6
c18.2w4
c18.3w6
c18.3w4
c18.3w3
c18.3w1
c18.4w3
c18.4w1
c20.0
c20.1w11
c20.1w9
c20.1w7
c20.2w9
c20.2w6
c20.3w6
c20.4w6
c20.3w3
c20.4w3
c20.5w3
c22.1w11
c22.1w9
c22.1w7
c22.2w6
c21.5w3
c22.4w6
c22.5w6
c22.4w3
c22.5w3
c22.6w3
c24.1w9

Details

Unlike the original QFASApack code the predator data can contain as much tombstone data in columns as you wish but the predator FA signatures must be extracted as a separate input in order to run in p.QFASA.

prey.cluster	<i>Produces a dendrogram using distances between the mean FA signatures of the prey types.</i>
--------------	------------------------------------------------------------------------------------------------

Description

Performs a hierarchical cluster analysis of mean prey fatty acid signatures using function hclust.

Usage

```
prey.cluster(preymatrix, method = "complete", dist.meas = 2)
```

Arguments

prey.matrix	data frame of prey fatty acid signature samples. First column must be species used to group samples. Other columns are assumed to be fatty acid proportions.
method	the agglomeration method to be used. This should be one of the possible methods in hclust such as "single", "complete" or "average". Default is "complete".
dist.meas	distance measure to use for calculating dissimilarities: 1=KL, 2=AIT or 3=CS. Default is AIT.

Value

Plot (dendrogram)

Examples

```
## Fatty Acids
data(FAs)
fa.set = as.vector(unlist(FAs))

## prey.cluster requires full prey database.
data(preymatrix)
prey.sub=(preymatrix[, 4:(ncol(preymatrix))][fa.set])
prey.sub=prey.sub/apply(preymatrix, 1, sum)
group=as.vector(preymatrix$Species)
preymatrix=cbind(group,prey.sub)

prey.cluster(preymatrix,method="average",dist.meas=3)
```

prey.on.prey	<i>Each prey fatty acid signature is systematically removed from the supplied prey database and its QFASA diet estimate is obtained by treating the individual as a predator.</i>
--------------	-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------

Description

Each prey fatty acid signature is systematically removed from the supplied prey database and its QFASA diet estimate is obtained by treating the individual as a predator.

Usage

```
prey.on.prey(preibase, dist.meas, gamma = 1)
```

Arguments

preibase	first column is name of species and remaining columns are fatty acids.
dist.meas	see help file for p.QFASA .
gamma	see help file for p.QFASA .

Value

diet estimate

Examples

```
data(prexFAs)
my.preibase <- preyFAs[, -c(1,3)]

# Note: uncomment examples to run. CRAN tests fail because execution time > 5 seconds
# diets.out <- prey.on.prey(my.preibase, 2)
# round(MEANmeth(diets.out), 3)
```

preyFAs	<i>Prey fatty acid signatures. Each prey signature is a row with fatty acid proportions in columns.</i>
---------	---------------------------------------------------------------------------------------------------------

Description

The prey file should contain all of the individual fatty acid signatures of the prey and their lipid contents (where appropriate) - a matrix of the mean values for the FAs (prey.matrix) by the designated prey modelling group is then calculated using the MEANmeth function.

Usage

preyFAs

Format

A data frame with 302 observations and 70 variables:

Lab.Code TODO

Species TODO

lipid TODO

c12.0

c13.0

Iso14

c14.0

c14.1w9

c14.1w7

c14.1w5

Iso15

Anti15

c15.0

c15.1w8

c15.1w6

Iso16

c16.0

c16.1w11

c16.1w9

c16.1w7

c7Me16.0

c16.1w5

c16.2w6

Iso17

c16.2w4

c16.3w6

c17.0

c16.3w4

c17.1

c16.3w1

c16.4w3

c16.4w1

c18.0
c18.1w13
c18.1w11
c18.1w9
c18.1w7
c18.1w5
c18.2d5.11
c18.2w7
c18.2w6
c18.2w4
c18.3w6
c18.3w4
c18.3w3
c18.3w1
c18.4w3
c18.4w1
c20.0
c20.1w11
c20.1w9
c20.1w7
c20.2w9
c20.2w6
c20.3w6
c20.4w6
c20.3w3
c20.4w3
c20.5w3
c22.1w11
c22.1w9
c22.1w7
c22.2w6
c21.5w3
c22.4w6
c22.5w6
c22.4w3
c22.5w3
c22.6w3
c24.1w9

Details

Like the predator .csv file you can have as many tombstone data columns as required but there must be at least one column that identifies the modelling group, in this case, Species.

Unlike the predator data, the prey data is not subsetted and renormalized during the modelling so the prey file needs to be subsetted for the desired fatty acid set and renormalized to sum to 1 prior to calculating the mean values.

The full FA set is extracted from the data frame (columns 4 onward), subsetted for the FA set in use and then renormalized over 1. The modelling group names (the "Species" column in this case) is then added back to the subsetted and renormalized data (as the first column) and the average values calculated using the MEANmeth function. Note that for the MEANmeth function to work the modelling group name must be in the first column.

pseudo.pred	<i>Generate a pseudo predator by sampling with replacement from prey database.</i>
-------------	------------------------------------------------------------------------------------

Description

Generates a single pseudo predator by sampling with replacement from prey database. To generate a sample of pseudo predators, please refer to example code.

Usage

```
pseudo.pred(diet, preybase, cal.vec, fat.vec, preysize = 2)
```

Arguments

diet	the "true" of "desired" diet of the pseudo predator. A compositional vector of proportions that sum to one with length equal to the number of prey species.
preybase	prey database from which to generate the pseudo predator. First column must provide the species name.
cal.vec	vector of calibration coefficients whose length is the same as the number of fatty acids in prey database.
fat.vec	vector of fat content whose length is the same as the number of species.
preysize	number of prey to sample from prey database. If preysize=1, then one prey is selected from each species. Otherwise, a sample of n_k signatures (where n_k is sample size for species k) is obtained by sampling with replacement.

Details

The default is to re-sample all of the prey signatures within each species (that is, preysize=2). Alternatively, one prey may be randomly selected from each species yielding potentially more variable pseudo-predators. For details on simulating realistic predators signatures, see Bromaghin, J. (2015) Simulating realistic predator signatures in quantitative fatty acid signature analysis, Ecological Informatics, 30, 68-71.

Value

A simulated predator FA signature.

Examples

```
data(prexFAs)

# Generating a sample of 10 pseudo predators each with "true" diet being
# (1/11,1/11,...1/11), no calibration effect and no fat content. The QFASA diet estimate
# is then computed for each pseudo predator.

# Note: To incorporate calibration and fat content in a simulation study,
# one set of calibration and fat content is generally used to simulate the pseudo predator
# and another is used to estimate the diet.

set.seed(11)
p.mat <- matrix(rep(NA,10*11),nrow=10)
for (i in 1: 10) {
  my.seal <- pseudo.pred(rep(1/11,11),
                        preyFAs[,-c(1,3)],
                        rep(1,ncol(prexFAs[,-c(1,3)]-1)),
                        rep(1,11))
  p.mat[i,] <- p.QFASA(my.seal,
                     MEANmeth(prexFAs[,-c(1,3)]),
                     rep(1,length(my.seal)),
                     2,
                     ext.fa=colnames(prexFAs[,-c(1:3)]))$`Diet Estimates`
}

# Can verify that average diet estimate of the 10 pseudo predators is close to
# "true" diet.

round(apply(p.mat,2,mean),3)
```

pseudo.pred.norm	<i>Generate a pseudo predator parametrically from multivariate normal distributions.</i>
------------------	------------------------------------------------------------------------------------------

Description

Generate a pseudo predator parametrically from multivariate normal distributions.

Usage

```
pseudo.pred.norm(mu.mat, sigma.pool, diet)
```


Arguments

<code>mu.mat</code>	matrix where each row represents the mean transformed FA signature of each prey type
<code>sigma.pool</code>	pooled variance-covariance matrix of the transformed fatty acid signatures of prey types
<code>diet</code>	vector of proportions of prey species in diet (true diet)

Details

Similar to *pseudo.pred* but instead generates the pseudo-predators parametrically by assuming the transformed FA signatures have a multivariate normal distribution.

Value

A simulated predator FA signature. See *pseudo.pred* for an example illustrating how to generate a sample of pseudo predators.

 QFASA

QFASA: A package for Quantitative Fatty Acid Signature Analysis

Description

Accurate estimates of the diets of predators are required in many areas of ecology, but for many species current methods are imprecise, limited to the last meal, and often biased. The diversity of fatty acids and their patterns in organisms, coupled with the narrow limitations on their biosynthesis, properties of digestion in monogastric animals, and the prevalence of large storage reservoirs of lipid in many predators, led us to propose the use of quantitative fatty acid signature analysis (QFASA) to study predator diets.

 QFASA.const.eqn

Returns sum(alpha) and used in solnp().

Description

Returns `sum(alpha)` and used in `solnp()`.

Usage

```
QFASA.const.eqn(alpha, predator, prey.quantiles, gamma)
```

Arguments

<code>alpha</code>	vector over which minimization takes place.
<code>predator</code>	fatty acid signature of predator.
<code>prey.quantiles</code>	matrix of fatty acid signatures of prey. Each row contains an individual prey signature from a different species.
<code>gamma</code>	power transform exponent (see <code>chisq.dist</code>).

split.prey	<i>Splits prey database into a simulation set (1/3) and a modelling set (2/3). Returns a list:</i>
------------	----------------------------------------------------------------------------------------------------

Description

1. simulation prey database 2. modelling prey database
1. simulation prey database 2. modelling prey database

Usage

```
## S3 method for class 'prey'
split(pre.mat)

## S3 method for class 'prey'
split(pre.mat)
```

Arguments

pre.mat	matrix of individual prey fatty acid signatures where the first column denotes the prey type
---------	----------------------------------------------------------------------------------------------

Details

IF number of samples of a prey type ≤ 5 , then prey.mod AND prey.sim are duplicated instead of split.

IF number of samples of a prey type ≤ 5 , then prey.mod AND prey.sim are duplicated instead of split.

testfordiff.ind.boot	<i>Called by testfordiff.ind.pval().</i>
----------------------	------------------------------------------

Description

Called by testfordiff.ind.pval().

Usage

```
testfordiff.ind.boot(data, ns1, R)
```

Arguments

data	sample of compositional data
ns1	sample size of compdata.1
R	number of bootstrap samples. default is 500.

```
testfordiff.ind.boot.fun
```

Called by testfordiff.ind.boot().

Description

Called by testfordiff.ind.boot().

Usage

```
testfordiff.ind.boot.fun(data, i, ns1, change.zero = 1e-05)
```

Arguments

data	sample of compositional data
i	row index
ns1	sample size of compdata.1
change.zero	tolerance

```
testfordiff.ind.pval
```

Test for a difference between two independent samples of compositional data. Zeros of any type are allowed.

Description

Test for a difference between two independent samples of compositional data. Zeros of any type are allowed.

Usage

```
testfordiff.ind.pval(compdata.1, compdata.2, R = 500)
```

Arguments

compdata.1	sample of compositional data.
compdata.2	sample of compositional data.
R	number of bootstrap samples, default is 500.

Value

p-value obtained through a multivariate permutation test with test statistic based on chi-square distances.

References

Stewart, C., Iverson, S. and Field, C. (2014) Testing for a change in diet using fatty acid signatures. *Environmental and Ecological Statistics* 21, pp. 775-792.

Examples

```
## Prey
data(prexFAs)

## Capelin FA sig
capelin.sig=prexFAs[prexFAs$Species=="capelin",4:(ncol(prexFAs))]
capelin.sig=capelin.sig/apply(capelin.sig,1,sum)

## Sandlance FA sig
sandlance.sig=prexFAs[prexFAs$Species=="sandlance",4:(ncol(prexFAs))]
sandlance.sig=sandlance.sig/apply(sandlance.sig,1,sum)

# Note: uncomment examples to run. CRAN tests fail because execution time > 5 seconds
# testfordiff.ind.pval(as.matrix(capelin.sig),as.matrix(sandlance.sig))
```

unbal.diet.data	<i>Sample example of unbalanced repeatability diet estimates data with a max of two repeated measurements per predator.</i>
-----------------	-----------------------------------------------------------------------------------------------------------------------------

Description

Sample example of unbalanced repeatability diet estimates data with a max of two repeated measurements per predator.

Usage

```
unbal.diet.data
```

Format

A data frame with 96 predator diets (50 unique predators) and 13 variables:

Seal.ID Predator (1 to 50)

Year Either 1 or 2

capelin estimated diet proportion

coho estimated diet proportion

eulachon estimated diet proportion

herring estimated diet proportion

mackerel estimated diet proportion

pilchard estimated diet proportion
pollock estimated diet proportion
sandlance estimated diet proportion
squid estimated diet proportion
surfsmelt_s estimated diet proportion
sufsmelt_lg estimated diet proportion

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