

Package ‘galgo’

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Title Genetic Algorithms for Multivariate Statistical Models from
Large-scale Functional Genomics Data

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Description Galgo attempt to build multivariate predictive models from large datasets having far larger number of features than samples such as in functional genomics datasets

License GPL-2

LazyLoad no

Depends R.oo, MASS, class, e1071, rpart, nnet, randomForest

URL <http://bioinformatica.mty.itesm.mx/?q=node/82>

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galgo-package

*Galgo perform feature selection from large scale data.***Description**

Represents a genetic algorithm (GA) itself. The basic GA uses at least one population of chromosomes, a “fitness” function, and a stopping rule (see references).

The Galgo object is not limited to a single population, it implements a list of populations where any element in the list can be either a `Niche` object or a `World` object. Nevertheless, any user-defined object that implements `evolve`, `progeny`, `best`, `max`, `bestFitness`, and `maxFitness` methods can be part of the `populations` list.

The “fitness” function is by far the most important part of a GA, it evaluates a `Chromosome` to determine how good the chromosome is respect to a given goal. The function can be sensitive to data stored in `.GlobalEnv` or any other object (see `*evaluate()` for further details). For this package and in the case of the microarray, we have included several fitness functions to classify samples using different methods. However, it is not limited for a classification problem for microarray data, because you can create any fitness function in any given context.

The stopping rule has three options. First, it is simply a desired fitness value implemented as a numeric `fitnessGoal`, and If the maximum fitness value of a population is equal or higher than `fitnessGoal` the GA ends. Second, `maxGenerations` determine the maximum number of generations a GA can evolve. The current generation is increased after evaluating the fitness function to the entire population list. Thus, if the current generation reach `maxGenerations` the GA stops. Third, if the result of the user-defined `callBackFunc` is `NA` the GA stops. In addition, you can always break any R program using `Ctrl-C` (or `Esc` in Windows).

When the GA ends many values are used for further analysis. Examples are the best chromosome (best method), its fitness (bestFitness method), the final generation (generation variable), the evolution of the maximum fitness (maxFitnesses list variable), the maximum chromosome in each generation (maxChromosome list variable), and the elapsed time (elapsedTime variable). Moreover, flags like goalScored, userCancelled, and running are available.

Details

Package: galgo
 Type: Package
 Version: 1.0
 Date: 2011-05-31
 License: What license is it under?
 LazyLoad: yes

See BigBang and Galgo Objects for usage.

Author(s)

Victor Trevino and Francesco Falciani
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References

GALGO: An R Package For Multivariate Variable Selection Using Genetic Algorithms Victor Trevino and Francesco Falciani School of Biosciences, University of Birmingham, Edgbaston, UK Bioinformatics 2006

See Also

BigBang and Galgo Objects.

Examples

```
## Not run:
  bb <- configBB.VarSel(...) #not runs

## End(Not run)
```

ALL

Acute Lymphoblastic Leukemia data (Yeoh et. al., 2002) for GALGO package

Description

Acute Lymphoblastic Leukemia for GALGO package data published by Yeoh et. al. The original 360 pediatric acute leukemia samples were filtered by class. 233 samples are included corresponding to 5 classes EMLLA, HYP+50, MLL, T, and TEL. The Affymetrix microarray HG_U95Av2 containing 12,600 probesets were filtered by range and standard deviation resulting in 2,435 probesets (genes).

Usage

```
data (ALL)
```

Format

The format is: 2,435 Rows : Genes 233 Columns : Samples Row Names : ProbeId Col Names : Samples Id 5 Classes : Lukemia Types: "EMLLA"=E2A-PBX1, "T"=T-ALL, "HYP+50"=Hyperdiploid > 50 Chromosomes, "MLL"=MLL rearrangement, and "TEL"=TEL-AML1

Details

ALL data is complemented by ALL.classes which contain the classes for each column sample.

References

Eng-Juh Yeoh, Mary E. Ross, Sheila A. Shurtleff, W. Kent Williams, Divyen Patel, Rami Mahfouz, Fred G. Behm, Susana C. Raimondi, Mary V. Relling, Anami Patel, Cheng Cheng, Dario Campana,, Dawn Wilkins, Xiaodong Zhou, Jinyan Li, Huiqing Liu, Ching-Hon Pui, William E. Evans, Clayton Naeve, Limsoon Wong, and James R. Downing. *Classification, subtype discovery, and prediction of outcome in pediatric acute lymphoblastic leukemia by gene expression profiling*. Cancer Cell. March 2002.

Examples

```
data (ALL)
data (ALL.classes)
```

ALL.classes	<i>Acute Lymphoblastic Leukemia data (Yeoh et. al., 2002) for GALGO package</i>
-------------	---

Description

Acute Lymphoblastic Leukemia for GALGO package data published by Yeoh et. al. The original 360 pediatric acute leukemia samples were filtered by class. 233 samples are included corresponding to 5 classes EMLLA, HYP+50, MLL, T, and TEL. The Affymetrix microarray HG_U95Av2 containing 12,600 probesets were filtered by range and standard deviation resulting in 2,435 probesets (genes).

Usage

```
data (ALL.classes)
```

Format

5 Classes : Lukemia Types: "EMLLA"=E2A-PBX1, "T"=T-ALL, "HYP+50"=Hyperdiploid > 50 Chromosomes, "MLL"=MLL rearrangement, and "TEL"=TEL-AML1

Details

ALL.classes is complementary for ALL data which contain the expression values for the genes in all samples.

References

Eng-Juh Yeoh, Mary E. Ross, Sheila A. Shurtleff, W. Kent Williams, Divyen Patel, Rami Mahfouz, Fred G. Behm, Susana C. Raimondi, Mary V. Relling, Anami Patel, Cheng Cheng, Dario Campana,, Dawn Wilkins, Xiaodong Zhou, Jinyan Li, Huiqing Liu, Ching-Hon Pui, William E. Evans, Clayton Naeve, Limsoon Wong, and James R. Downing. *Classification, subtype discovery, and prediction of outcome in pediatric acute lymphoblastic leukemia by gene expression profiling*. Cancer Cell. March 2002.

Examples

```
data(ALL)
data(ALL.classes)
```

as.list.Object	<i>Convert a variable of class Object to a list</i>
----------------	---

Description

Object variables behave as lists, however they are really environments. Sometimes it is necessary to use the variable as a list instead of an Object. This function converts the Object to a list.

Usage

```
as.list(x, ...)
```

Arguments

x	Variable of class Object
...	Other object to include

Value

Returns a list with values equivalent to the Object.

Note

Values that contain functions will be assigned to .GlobalEnv environment.

Author(s)

Victor Trevino. Francesco Falciiani Group. University of Birmingham, U.K.

Examples

```
xO <- Object()
xO$var = "hello"
class(xO)
xOL <- as.list(xO)
xOL
class(xOL)
```

 Bag

A list-like Object

Description

Create a list of values. Lists inside an `Object` behave as by value (if the list is modified in a method, the original list is not updated). Therefore, `Bag` replace this behaviour extending `Object` and allowing to save reference-lists inside objects.

Usage

```
Bag(...)
```

Arguments

... Values to store in the `Bag` object.

Class

Package: galgo

Class Bag

`Object`

~~|

~~+--Bag

Directly known subclasses:

```
public static class Bag
extends Object
```

Fields and Methods

Methods:

<code>length</code>	Gets the length of the object as its list version.
<code>print</code>	Prints the representation of the <code>Bag</code> object.
<code>summary</code>	Prints the representation of the <code>Bag</code> object.

Methods inherited from `Object`:

`as.list`, `unObject`, `$`, `$<-`, `[]`, `[[<-`, `as.character`, `attach`, `clone`, `detach`, `equals`, `extend`, `finalize`, `getFields`, `getInstanciationTime`, `getStaticInstance`, `hasField`, `hashCode`, `ll`, `load`, `objectSize`, `print`, `save`

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

See Also

See also `list()`.

Examples

```
b <- Bag(a=1,b=2,c=3)
b
as.list(b)
unObject(b)
```

BigBang

Represents the ensemble of the results of evolving several Galgo objects

Description

The `BigBang` object is an attempt to use more the information of a large collection of solutions instead of a unique solution. Perhaps we are studying the solution landscape or we would like to “ensemble” solutions from other “small” solutions. For complex problems (or even simple problems), the number of “solutions” may be very large and diverse. In the context of classification for microarray data, we have seen that models assembled from many solution could be used as “general models” and that the most frequent genes in solutions provide insights for biological phenomena.

Therefore, we designed the `BigBang` object, which implements methods to run a `Galgo` object several times recording relevant information from individual galgos for further analysis. Running a `BigBang` takes commonly several minutes, hours or perhaps days depending on the complexity of the fitness function, the data, the `goalFitness`, the stopping rules in `Galgo`, and the number of solutions to collect. Parallelism is not explicitly implemented but some methods has been implemented to make this task easy and possible.

As in a `Galgo` object, there are three stopping methods: `maxBigBangs`, `maxSolutions` and `callbackFunc`. `maxBigBangs` controls the maximum number of `galgo` evolutions to run; when the current evolution-cycle reaches this value, the process ends. Sometimes evolutions do not end up with a `goalFitness` reached, this is not called a “solution”. Therefore, `maxSolutions` controls the maximum number of solutions desired. If `onlySolutions==FALSE`, all `galgo` evolutions are saved and considered as “solution”, nevertheless the `solution` variable save the real status in the `BigBang` object. `callbackFunc` may ends the process if it returns `NA`. It must be considered that any R-program can be broken typing `Ctrl-C` (`Esc` in Windows). If for some reason the process has been interrupt, the `BigBang` process can continue processing the same cycle just calling the method `blast` again. However the object integrity may be risked if the process is broken in critical parts (when the object is being updated at the end of each cycle). Thus, it is recommended to break the process in the `galgo` “evolution”.

In the case of variable selection for microarray data, some methods has been proposed that use several independent solutions to design a final solution (or set of better solutions, see XXX references *** MISSING ***).

There is `configBB.VarSel` and `configBB.VarSelMisc` functions that configure a `BigBang` object together with all sub-objects for common variable selection problems (e.g. classification, regression, etc.)

Usage

```

BigBang(id=0,
galgo=NULL,
maxBigBangs=10,
maxSolutions=1,
collectMode=c("bigbang", "galgos", "chromosomes"),
onlySolutions=TRUE,
verbose=1,
callPreFunc=function(bigbang, galgo) TRUE,
callBackFunc=function(bigbang, galgo) TRUE,
callEnhancerFunc=function(chr, parent) NULL,
data=NULL,
saveFile=NULL,
saveFrequency=100,
saveVariableName=collectMode,
saveMode=c("unObject+compress", "unObject", "object", "object+compress"),
saveGeneBreaks=NULL,
geneNames=NULL,
sampleNames=NULL,
classes=NULL,
gcFrequency=123,
gcCalls=5,
call=NULL,
...)

```

Arguments

<code>id</code>	A way to identify the object.
<code>galgo</code>	The prototype Galgo object that will be used to run and collect solutions.
<code>maxBigBangs</code>	The maximum number of BigBangs. A bigbang is the evolution of a Galgo object using the method <code>evolve</code> . When the current number of bigbangs has reached <code>maxBigBangs</code> value, the process ends.
<code>maxSolutions</code>	The maximum number of solutions. If the total number of solutions collected achieve <code>maxSolutions</code> value the process ends. A solution is defined when the <code>goalFitness</code> has been reach. When the Galgo object ends and <code>goalFitness</code> has not been reached, The best chromosome is NOT saved unless <code>onlySolutions</code> is FALSE, in this case <code>maxSolutions</code> and <code>maxBigBangs</code> are equivalent.
<code>collectMode</code>	The type of result to collect for further analysis. "galgos" saves every evolved galgo object, thus it consumes a lot of memory; more than 100 is perhaps not recommendable. "chromosomes" and "bigbangs" save the best chromosome, its fitness, and fitness evolution in the BigBang object. "bigbang" saves the BigBang object to disk whereas "chromosome" saves only the list of chromosomes.
<code>onlySolutions</code>	If TRUE only solutions that has been reach the <code>goalFitness</code> are saved. Otherwise, all solutions are saved and counted as "solution" and <code>\$solutions</code> variable contains the real status.
<code>verbose</code>	Instruct the BigBang to display the general information about the process. When <code>verbose==1</code> this information is printed every evolution. In general every <code>verbose</code> number of generation would produce a line of output. Of course if <code>verbose==0</code> would not display a thing at all.

<code>callPreFunc</code>	A user-function to be called before every evolution. It should receive the <code>BigBang</code> and <code>Galgo</code> objects. If the result is <code>NA</code> , the process ends.
<code>callBackFunc</code>	A user-function to be called after every evolution. It should receive the <code>BigBang</code> and <code>Galgo</code> objects. If the result is <code>NA</code> , the process ends. When <code>callBackFunc</code> is for instance <code>plot</code> the trace of the evolution is nicely viewed in a plot; however, in long runs it can consume time and memory.
<code>callEnhancerFunc</code>	A user-function to be called after every evolution to improve the solution. It should receive a <code>Chromosome</code> and the <code>BigBang</code> objects as parameters, and must return a new <code>Chromosome</code> object. If the result is <code>NULL</code> nothing is saved. The result replace the original evolved chromosomes, which is saved in <code>evolvedChromosomes</code> list variable in the <code>BigBang</code> object. For functional genomics data, we have included two general routines called <code>geneBackwardElimination</code> and <code>robustGeneBackwardElimination</code> to generate “enhanced” chromosomes.
<code>data</code>	Any user-data can be stored in this variable (but it is not limited to <code>data</code> , the user can insert any other like <code>myData</code> , <code>mama.mia</code> or whatever in the <code>...</code> argument).
<code>saveFile</code>	The file name where the objects would be saved (see <code>collectMode</code>).
<code>saveFrequency</code>	How often the operation of saving would occur. Saving is a time-consuming operation, low values may degrade the performance.
<code>saveVariableName</code>	The preferable variable name used for saving (this will be needed when loading).
<code>saveMode</code>	Any combinations of the two options <code>compress</code> and <code>unObject</code> . It can be character vector length 1 or larger. For example, <code>saveMode=="compress+unObject"</code> would call <code>unObject</code> and save the file using <code>compress=TRUE</code> . The vector <code>c("object", "compress")</code> (or shorter <code>c("compress")</code>) would save the <code>BigBang</code> object and compressed. It is not recommended to save the crude object because the functions variables are stuck to environments and R will try to save those environments together, the result can be a waste of disk space and saving time. We strongly recommend <code>saveMode="unObject+compress"</code> .
<code>geneNames</code>	Gene names (if they are discrete and finite).
<code>sampleNames</code>	Sample names (if any).
<code>classes</code>	Class of the original samples (useful for classification problems only).
<code>saveGeneBreaks</code>	In the case of variable selection for microarray data (and other problems with discrete and finite genes), a summary on the genes selected is computed and saved in each evolution. It is used to facilitate the computation for some plots and others methods. For no-finite gene applications, it may be useful interpreting <code>saveGeneBreaks</code> as the breaks needed to create an histogram based on the genes included in the “best”.
<code>gcFrequency</code>	How often the garbage collector would be called. Useful if memory needs to be collected during the process.
<code>gcCalls</code>	How many calls to garbage collector (we have seen that many consecutive calls to <code>gc()</code> is better [R < 2.0]).
<code>call</code>	Internal use.
<code>...</code>	Other user named values to include in the object.

Class

Package: galgo
Class BigBang

Object
 ~|
 ~+--BigBang

Directly known subclasses:

public static class **BigBang**
 extends Object

Fields and Methods**Methods:**

activeChromosomeSet	Focus the analysis to different sets of chromosomes.
addCount	Add a chromosome to rank and frequency stability counting.
addRandomSolutions	Adds random pre-existed solutions.
as.matrix	Prints the representation of the BigBang object.
assignParallelFile	Assigns a different saveFile value for parallelization.
blast	Evolves Galgo objects saving the results for further analysis.
buildCount	Builds the rank and frequency stability counting.
classPredictionMatrix	Predicts class for samples from chromosomes.
computeCount	Compute the counts for every gene from a set of chromosomes..
confusionMatrix	Computes the class confusion matrix from a class prediction matrix.
distanceImportanceNetwork	Converts geneImportanceNetwork matrix to distance matrix.
filterSolution	Filters solutions.
fitnessSplits	Computes the fitness function from chromosomes for different splits.
formatChromosome	Converts chromosome for storage in BigBang object.
forwardSelectionModels	Gets the “best” models using top-ranked genes and a forward-selection strategy.
geneCoverage	Computes the fraction of genes present in the top-rank from the total genes present.
geneFrequency	Computes the frequency of genes based on chromosomes.
geneImportanceNetwork	Computes the number of times a couple of top-ranked-genes are present in models.
geneRankStability	Computes the rank history for top-ranked genes.
getFrequencies	Computes gene frequencies.
heatmapModels	Plots models using heatmap plot.
loadParallelFiles	Load all files saved during the parallelization.
meanFitness	Computes the “mean” fitness from several solutions.
meanGeneration	Computes the mean number of generations required to reach a given fitness value.
mergeBangs	Merges the information from other BigBang objects.
pcaModels	Plots models in principal components space.
plot	Plots about the collected information in a BigBang object.
predict	Predicts the class or fitting of new set of samples.
print	Prints the representation of a BigBang object.
saveObject	Saves the BigBang object into a file in a suitable format.
sensitivityClass	Computes the sensitivity of class prediction.
specificityClass	Computes the specificity of class prediction.

summary

Prints the representation of the BigBang object.

Methods inherited from Object:

as.list, unObject, \$, \$<-, [, [[<-, as.character, attach, clone, detach, equals, extend, finalize, getFields, getInstanciationTime, getStaticInstance, hasField, hashCode, ll, load, objectSize, print, save

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

Gene, Chromosome, Niche, World, Galgo, configBB.VarSel(), configBB.VarSelMisc().

Examples

```
## Not run:
cr <- Chromosome(genes=newCollection(Gene(shape1=1, shape2=100),5))
ni <- Niche(chromosomes=newRandomCollection(cr, 10))
wo <- World(niches=newRandomCollection(ni,2))
ga <- Galgo(populations=newRandomCollection(wo,1), goalFitness = 0.75,
callBackFunc=plot,
           fitnessFunc=function(chr, parent) 5/sd(as.numeric(chr)))

#evolve(ga) ## not needed here

bb <- BigBang(galgo=ga, maxSolutions=10, maxBigBangs=10, saveGeneBreaks=1:100)
blast(bb)
## it performs 10 times evolve() onto ga object
## every time, it reinitilize and randomize
## finally, the results are saved.
plot(bb)

#it is missing a microarray classification example

## End(Not run)
```

Chromosome

The representation of a set of genes for genetic algorithms

Description

Represents a set of genes for the genetic algorithm. The chromosome contains all current values of each gene and will be evaluated using a “fitness” function similar to those defined by Goldberg. The fitness function normally depends on the Galgo object.

See references for Genetic Algorithms.

Usage

```
Chromosome(id=0,
genes=list(),
getValues=function(x, ...) unlist(lapply(x, ...)),
decode=function(x) genes(x),
values=list(),
...)
```

Arguments

<code>id</code>	A way to identify the object.
<code>genes</code>	A list of defined Gene objects composing the chromosome.
<code>getValues</code>	A function to be evaluated for every gene to obtain a value. In general, the result could be any object in a list. In particular, the default is a vector of current gene values.
<code>decode</code>	A function that converts the chromosome representation in real values. It is used mainly for output purposes and for frequency counting. It has no effect for variable selection in microarray data since the default <code>decode</code> is directly the gene value.
<code>values</code>	The specific initial values. If <code>value</code> is not specified, <code>getValues</code> function is ran to obtain initial values.
<code>...</code>	Other user named values to include in the object.

Class

Package: galgo

Class Chromosome

Object

~~|

~~+--Chromosome

Directly known subclasses:

```
public static class Chromosome
extends Object
```

Fields and Methods**Methods:**

<code>as.double</code>	Converts the chromosome values (genes) to its numerical representation.
<code>clone</code>	Clones itself and its genes.
<code>decode</code>	Converts the gene values to user-readable values.
<code>generateRandom</code>	Generates random values for all genes in the chromosome.
<code>genes</code>	Converts the genes values to a numeric vector.
<code>length</code>	Gets the number of genes defined in the chromosome.

mutate	Mutates a chromosome in specific positions.
newCollection	Generates a list of chromosomes cloning the original chromosome object.
newRandomCollection	Creates a list of cloned chromosomes object with its internal values generated by random.
print	Prints the representation of the chromosome object.
reInit	Erases all internal values in order to re-use the object.
summary	Prints the representation of the chromosome object and all its genes.

Methods inherited from Object:

as.list, unObject, \$, \$<-, [], [[<-, as.character, attach, clone, detach, equals, extend, finalize, getFields, getInstanciationTime, getStaticInstance, hasField, hashCode, ll, load, objectSize, print, save

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

Gene. Niche. World. Galgo. BigBang.

Examples

```
cr <- Chromosome(genes=newCollection(Gene(shape1=1, shape2=100), 5))
cr
```

classPrediction *Function used to predict class evaluating a fitness function in many train-test sets*

Description

Function used to predict class evaluating a fitness function in many train-test sets.

Usage

```
classPrediction(chr, parent, splits = 1:length(parent$data$splitTrain), set = parent
```

Arguments

chr	Chromosome or vector object.
parent	Parent object, commonly BigBang object.
splits	Which sets of splits will be used to compute the fitness function. Default to all splits defined in parent\$data\$splitTrain.
set	Weights used in training and test sets. Vector of two values. The first is the weight of train error. The second is the weight of test error. The default value is taken from parent\$data\$testErrorWeights whose default is c(0,1) (considering only test error).

mode The type of value to return. "sum" returns a matrix with the number of times a sample (rows) has been predicted as any class (columns). The values are proportional to train and test weights. "probability" conversion of "sum" to probabilities dividing each row by its sum. "class" returns a vector of the predicted class given by majority vote.

Value

A matrix or vector depending on mode paramater.

Note

This function is designed to be used in forwardSelectionModels

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

forwardSelectionModels.BigBang,modelSelection,fitness,configBB.VarSel

configBB.VarSel *Creates and configure all objects needed for a "variable selection for classificacion" problem*

Description

Creates and configure all objects needed for a "variable selection for classificacion" problem. It configures Gene, Chromosome, Niche, World, Galgo and BigBang objects.

Usage

```
configBB.VarSel(
  file=NULL,
  data=NULL,
  classes=NULL,
  train=rep(2/3,333),
  test=1-train,
  force.train=c(),
  force.test=c(),
  train.cases=FALSE,
  main="project",
  classification.method=c("knn","mlhd","svm","nearcent","rpart","nnet","ranforest","u
  classification.test.error=c(0,1),
  classification.train.error=c("kfolds","splits","loocv","resubstitution"),
  classification.train.Ksets=-1,
  classification.train.splitFactor=2/3,
  classification.rutines=c("C","R"),
  classification.userFitnessFunc=NULL,
  scale=(classification.method[1] %in% c("knn","nearcent","mlhd","svm")),
  knn.k=3,
```

```

knn.l=1,
knn.distance=c("euclidean", "maximum", "manhattan", "canberra", "binary", "minkowski"),
nearcent.method=c("mean", "median"),
svm.kernel=c("radial", "polynomial", "linear", "sigmoid"),
svm.type=c("C-classification", "nu-classification", "one-classification"),
svm.nu=0.5,
svm.degree=4,
svm.cost=1,
nnet.size=2,
nnet.decay=5e-4,
nnet.skip=TRUE,
nnet.rang=0.1,
geneFunc=runifInt,
chromosomeSize=5,
populationSize=-1,
niches=1,
worlds=1,
immigration=c(rep(0,18), .5, 1),
mutationsFunc=function(ni) length(ni),
crossoverFunc=function(ni) round(length(ni)/2, 0),
crossoverPoints=round(chromosomeSize/2, 0),
offspringScaleFactor=1,
offspringMeanFactor=0.85,
offspringPowerFactor=2,
elitism=c(rep(1, 9), .5),
goalFitness=0.90,
galgoVerbose=20,
maxGenerations=200,
minGenerations=10,
galgoUserData=NULL,
maxBigBangs=1000,
maxSolutions=1000,
onlySolutions=FALSE,
collectMode="bigbang",
bigbangVerbose=1,
saveFile="?.Rdata",
saveFrequency=50,
saveVariable="bigbang",
callBackFuncGALGO=function(...) 1,
callBackFuncBB=plot,
callEnhancerFunc=function(chr, parent) NULL,
saveGeneBreaks=NULL,
geneNames=NULL,
sampleNames=NULL,
bigbangUserData=NULL
)

```

Arguments

`file` The file containing the data. First row should be sample names. First column should be variable names (genes). Second row must be the class for every sample if `classes` is not provided.

<code>data</code>	If a file is not provided, <code>data</code> is the a data matrix or data frame with samples in columns and genes in rows (with its respective colnames and rownames set). If <code>data</code> is provided, <code>class</code> must be specified.
<code>classes</code>	if a file is not provided, specifies the classes for the data. If the <code>file</code> is provided and <code>classes</code> is specified, the second row of the file is considered as data.
<code>train</code>	A vector of the proportion of random samples to be used as training sets. The number of sets is determined by the length of <code>train</code> . The <code>train+test</code> should never be greater than 1. All sets are randomly chosen with the same proportion of samples per class than the original sample set.
<code>test</code>	A vector of the proportion of random samples to be used as testing sets. The number of sets is determined by the length of <code>train</code> . All sets are randomly chosen with the same proportion of samples per class than the original sample set.
<code>force.train</code>	A vector with sample indexes forced to be part of all training sets.
<code>force.test</code>	A vector with sample indexes forced to be part of all test sets.
<code>train.cases</code>	If TRUE, the same number of cases for each class. If numeric vector, then it is interpreted as the number of samples in training per class
<code>main</code>	A string or ID related to your project that will be used in all plots and would help you to distinguish results from different studies.
<code>classification.method</code>	The method to be used for classification. The current available methods (in this package) are "knn", "mlhd", "svm", "nearcent" (nearest centroid), "rpart"
<code>classification.test.error</code>	Vector of two weights specifying how the fitness function is evaluated to compute the test error. The first value is the weight of training and the second the weight of test. The default is c(0,1) which consider only test error. The sum of this values should be 1.
<code>classification.train.error</code>	Specify how the training set is divided to compute the error in the training set (in <code>evolve</code> method for Galgo object). The fitness function really compute 1-error where error is always computed from the proportion of samples that has been incorrectly classified. "kfold" (k-fold-cross-validation) compute K non overlapping sets (<code>classification.train.Ksets</code>) attempting to conserve class proportions. "splits" compute K(<code>classification.train.Ksets</code>) random splits. "loocv" (leave-one-out-cross-validation) compute K=training samples. "resubstitution" no folding at all; it is faster and provided for quick overviews.
<code>classification.train.Ksets</code>	The number of training set folds/splits. Negative means automatic detection (<code>n=samples, max(min(round(13-n/11),n),3)</code>).
<code>classification.train.splitFactor</code>	When <code>classification.train.error=="splits"</code> , specifies the proportion of samples used in splitting the training set.
<code>classification.routines</code>	For most of the methods, R and C code has been provided. C code is preferred for performance reason, however finding mistakes is easier in R. Besides, the example code could be used as a guide for new user fitness functions. "rpart" has not C code. "svm" has only some improvements removing redundancy checks.

<code>classification.userFitnessFunc</code>	For <code>classification.method == "user"</code> , specify the function that would be used to compute the accuracy and class prediction. The required prototype is <code>function(chr, parent, tr, te, result)</code> where <code>chr</code> is the chromosome to be evaluated, a conversion using <code>as.numeric</code> is commonly needed to extract the exact values from the chromosome. <code>parent</code> would be the <code>BigBang</code> object where all their variables are exposed. The fitness function commonly use <code>parent\$data\$data</code> , which has been trasposed. <code>tr</code> is the vector of samples (rows) that MUST be used as training and <code>te</code> the samples that must be used as test. They can correspond to training and test in the evolution or in any other context (as the computation of the confusion matrix or the forward selection). The fitness function should return the result in two different formats, which is specified in the <code>result</code> parameter. <code>result</code> is 0 (zero) when the predicted class for the test is required (as an integer, not as a factor) otherwise the it is expected the number of correctly classified samples from the test vector.
<code>scale</code>	TRUE instruct to scale all rows for zero mean and unitary variance. By default, <code>scale</code> is TRUE when <code>classification.method</code> is "knn", "nearcent", "mlhd", or "svm".
<code>knn.k</code>	For KNN method, <code>knn.k</code> is the number of nearest neighbours to consider.
<code>knn.l</code>	For KNN method, <code>knn.l</code> is the number of minimum neighbours needed to predict a class.
<code>knn.distance</code>	The distance to be used in KNN method. Possible values are "euclidean", "maximum", "manha (see <code>dist</code> method).
<code>nearcent.method</code>	For nearest centroid method, <code>nearcent.method</code> specify the method for computing the centroid ("mean", "median").
<code>nnet.size</code>	Parameter passed to <code>nnet</code> .
<code>nnet.decay</code>	Parameter passed to <code>nnet</code> .
<code>nnet.skip</code>	Parameter passed to <code>nnet</code> .
<code>nnet.rang</code>	Parameter passed to <code>nnet</code> .
<code>svm.kernel</code>	For SVM (support vector machines) method, specify the kernel method "radial", "polynomial", " (see <code>svm</code> method in <code>e1071</code> package).
<code>svm.type</code>	For SVM method, specify the type of classificacion.
<code>svm.nu</code>	For SVM method and <code>nu-classification</code> specify the <code>nu</code> value.
<code>svm.degree</code>	For SVM method and <code>polynomial</code> kernel, specify the degreee value.
<code>svm.cost</code>	For SVM method, specify the C value (cost).
<code>nnet.</code>	Parameters for neural networks classification. See <code>nnet</code> package.
<code>geneFunc</code>	The function that provides random values for genes. The default is <code>runifInt</code> , which generates a random integer value with a uniform distribution.
<code>chromosomeSize</code>	Specify the chromosome size (the number of variables/genes to be included in a model). Defaults to 5. See <code>Gene</code> and <code>Chromosome</code> objects.
<code>populationSize</code>	Specify the number of chromosomes per niche. Defaults is <code>min(20,20+(2000-nrow(data))/400)</code> . See <code>Chromosome</code> and <code>Niche</code> objects.
<code>niches</code>	Specify the number of niches. Defaults to 2. See <code>Niche</code> , <code>World</code> and <code>Galgo</code> objects.

worlds	Specify the number of worlds. Defaults to 1. See World and Galgo objects.
immigration	Specify the migration criteria.
mutationsFunc	Specify the function that returns the number of mutations to perform in the population.
crossoverFunc	Specify the function that returns the number of crossover to perform. The default is the length of the niche divided by 2.
crossoverPoints	Specify the active positions for crossover operator. Defaults to a single point in the middle of the chromosome. See Niche object.
offspringScaleFactor	Scale factor for offspring generation. Defaults 1. See Niche object.
offspringMeanFactor	Mean factor for offspring generation. Defaults to 0.85. See Niche object.
offspringPowerFactor	Power factor for offspring generation. Defaults to 2. See Niche object.
elitism	Elitism probability/flag/vector. Defaults to c(1,1,1,1,1,1,1,1,0.5) (elitism present for 9 generations followed by a 50% chance, then repeated). See Niche object.
goalFitness	Specify the desired fitness value (fraction of correct classification). Defaults to 0.90. See Galgo object.
galgoVerbose	verbose parameter for Galgo object.
maxGenerations	Maximum number of generations. Defaults to 200. See Galgo object.
minGenerations	Minimum number of generations. Defaults to 10. See Galgo object.
galgoUserData	Additional user data for the Galgo object. See Galgo object.
maxBigBangs	Maximum number of bigbang cycles. Defaults to 1000. See BigBang object.
maxSolutions	Maximum number of solutions collected. Defaults to 1000. See BigBang object.
onlySolutions	Save only when a solution is reach. Defaults to FALSE (to use all the information, then a filter can be used afterwards). See BigBang object.
collectMode	information to collect. Defaults to "bigbang". See BigBang object.
bigbangVerbose	Verbose flag for BigBang object. Defaults to 1. See BigBang object.
saveFile	File name where the data is saved. Defaults to NULL which implies the name is a concatenation of classification.method, method specific parameters, file and ".Rdata". See BigBang object.
saveFrequency	How often the "current" solutions are saved. Defaults to 50. See BigBang object.
saveVariable	Internal R variable name of the saved file. Defaults to "bigbang". See BigBang object.
callbackFuncGALGO	callbackFunc for Galgo object. See Galgo object.

```

callbackFuncBB
    callbackFunc for BigBang object. See BigBang object.
callEnhancerFunc
    callEnhancerFunc for BigBang object. See BigBang object.
saveGeneBreaks
    saveGeneBreaks vector for BigBang object. Defaults to NULL which
    means to be computed automatically (recommended). See BigBang object.
geneNames
    The gene (variable) names if they differ from the first column in file or
    rownames(data).
sampleNames
    The sample names if they differ from first row in file or colnames(data).
bigbangUserData
    Additional user data for BigBang object (stored in data variable in BigBang
    object returned).

```

Details

Wrapper function. Configure all objects from parameters.

Value

A ready to use bigbang object.

*** TO DO: EXPLAIN THE STRUCTURE OF "DATA" ***

Author(s)

Victor Trevino

See Also

BigBang.

Examples

```

## Not run:
bb <- configBB.VarSel(...)
bb
blast(bb)

## End(Not run)

```

```
configBB.VarSelMisc
```

Creates and configure all objects needed for a “variable selection” problem

Description

Creates and configure all objects needed for a “variable selection” problem. It configures Gene, Chromosome, Niche, World, Galgo and BigBang objects.

Usage

```

configBB.VarSelMisc(
  file=NULL,
  data=NULL,
  strata=NULL,
  train=rep(2/3,333),
  test=1-train,
  force.train=c(),
  force.test=c(),

  main="project",

  test.error=c(0,1),
  train.error=c("kfolds","splits","loocv","resubstitution"),
  train.Ksets=-1, # -1 : automatic detection : max(min(round(13-n/11),n),3) n=samples
  train.splitFactor=2/3,
  fitnessFunc=NULL,

  scale=FALSE,

  geneFunc=runifInt,
  chromosomeSize=5,
  populationSize=-1,
  niches=1,
  worlds=1,
  immigration=c(rep(0,18),.5,1),
  mutationsFunc=function(ni) length(ni),
  crossoverFunc=function(ni) round(length(ni)/2,0),
  crossoverPoints=round(chromosomeSize/2,0),
  offspringScaleFactor=1,
  offspringMeanFactor=0.85,
  offspringPowerFactor=2,
  elitism=c(rep(1,9),.5),
  goalFitness=0.90,
  galgoVerbose=20,
  maxGenerations=200,
  minGenerations=10,
  galgoUserData=NULL, # additional user data for galgo

  maxBigBangs=1000,
  maxSolutions=1000,
  onlySolutions=FALSE,
  collectMode="bigbang",
  bigbangVerbose=1,
  saveFile="?.Rdata",
  saveFrequency=50,
  saveVariable="bigbang",
  callBackFuncGALGO=function(...) 1,
  callBackFuncBB=plot,
  callEnhancerFunc=function(chr, parent) NULL,
  saveGeneBreaks=NULL,
  geneNames=NULL,

```

```

sampleNames=NULL,
bigbangUserData=NULL # additional user data for bigbang
)

```

Arguments

<code>file</code>	The file containing the data. First row should be sample names. First column should be variable names (genes). Second row must be the class or strata for every sample if <code>strata</code> is not provided. The strata is used to balance the train-test sets relative to different strata. If there are only one strata, use the same value for all samples.
<code>data</code>	If a file is not provided, <code>data</code> is the a data matrix or data frame with samples in columns and genes in rows (with its respective colnames and rownames set). If <code>data</code> is provided, <code>strata</code> must be specified.
<code>strata</code>	if a file is not provided, specifies the classes or strata of the data. If the <code>file</code> is provided and <code>strata</code> is specified, the second row of the file is considered as data. The strata is used to balance the train-test sets relative to different strata. If there are only one strata, use the same value for all samples.
<code>train</code>	A vector of the proportion of random samples to be used as training sets. The number of sets is determined by the length of <code>train</code> . The <code>train+test</code> should never be greater than 1. All sets are randomly chosen with the same proportion of samples per class than the original sample set.
<code>test</code>	A vector of the proportion of random samples to be used as testing sets. The number of sets is determined by the length of <code>train</code> . All sets are randomly chosen with the same proportion of samples per class than the original sample set.
<code>force.train</code>	A vector with sample indexes forced to be part of all training sets.
<code>force.test</code>	A vector with sample indexes forced to be part of all test sets.
<code>main</code>	A string or ID related to your project that will be used in all plots and would help you to distinguish results from different studies.
<code>test.error</code>	Vector of two weights specifying how the fitness function is evaluated to compute the test error. The first value is the weight of training and the second the weight of test. The default is <code>c(0,1)</code> which consider only test error. The sum of this values should be 1.
<code>train.error</code>	Specify how the training set is divided to compute the error in the training set (in <code>evolve</code> method for Galgo object). <code>"splits"</code> compute K (<code>train.Ksets</code>) random splits. <code>"loocv"</code> (leave-one-out-cross-validation) compute K =training samples. <code>"resubstitution"</code> no folding at all; it is faster and provided for quick overviews.
<code>train.Ksets</code>	The number of training set folds/splits. Negative means automatic detection (<code>n=samples, max(min(round(13-n/11),n),3)</code>).
<code>train.splitFactor</code>	When <code>train.error=="splits"</code> , specifies the proportion of samples used in splitting the training set.
<code>fitnessFunc</code>	Specify the function that would be used to compute the accuracy. The required prototype is <code>function(chr, parent, tr, te, result)</code> where <code>chr</code> is the chromosome to be evaluated. <code>parent</code> would be the BigBang object where all their variables are exposed. The fitness function commonly use <code>parent\$data\$data</code> , which has been trasposed. <code>tr</code> is the vector of samples

	(rows) that MUST be used as training and <code>test</code> the samples that must be used as test.
<code>scale</code>	TRUE instruct to scale all rows for zero mean and unitary variance. By default, this value is FALSE.
<code>geneFunc</code>	Specify the function that mutate genes. The default is using an integer uniform distribution function (<code>runifInt</code>).
<code>chromosomeSize</code>	Specify the chromosome size (the number of variables/genes to be included in a model). Defaults to 5. See <code>Gene</code> and <code>Chromosome</code> objects.
<code>populationSize</code>	Specify the number of chromosomes per niche. Defaults is $\min(20, 20 + (2000 - \text{nrow}(\text{data})) / 400)$. See <code>Chromosome</code> and <code>Niche</code> objects.
<code>niches</code>	Specify the number of niches. Defaults to 2. See <code>Niche</code> , <code>World</code> and <code>Galgo</code> objects.
<code>worlds</code>	Specify the number of worlds. Defaults to 1. See <code>World</code> and <code>Galgo</code> objects.
<code>immigration</code>	Specify the migration criteria.
<code>mutationsFunc</code>	Specify the function that returns the number of mutations to perform in the population.
<code>crossoverFunc</code>	Specify the function that returns the number of crossover to perform. The default is the length of the niche divided by 2.
<code>crossoverPoints</code>	Specify the active positions for crossover operator. Defaults to a single point in the middle of the chromosome. See <code>Niche</code> object.
<code>offspringScaleFactor</code>	Scale factor for offspring generation. Defaults 1. See <code>Niche</code> object.
<code>offspringMeanFactor</code>	Mean factor for offspring generation. Defaults to 0.85. See <code>Niche</code> object.
<code>offspringPowerFactor</code>	Power factor for offspring generation. Defaults to 2. See <code>Niche</code> object.
<code>elitism</code>	Elitism probability/flag/vector. Defaults to <code>c(1,1,1,1,1,1,1,1,0.5)</code> (elitism present for 9 generations followed by a 50% chance, then repeated). See <code>Niche</code> object.
<code>goalFitness</code>	Specify the desired fitness value (fraction of correct classification). Defaults to 0.90. See <code>Galgo</code> object.
<code>galgoVerbose</code>	<code>verbose</code> parameter for <code>Galgo</code> object.
<code>maxGenerations</code>	Maximum number of generations. Defaults to 200. See <code>Galgo</code> object.
<code>minGenerations</code>	Minimum number of generations. Defaults to 10. See <code>Galgo</code> object.
<code>galgoUserData</code>	Additional user data for the <code>Galgo</code> object. See <code>Galgo</code> object.
<code>maxBigBangs</code>	Maximum number of bigbang cycles. Defaults to 1000. See <code>BigBang</code> object.
<code>maxSolutions</code>	Maximum number of solutions collected. Defaults to 1000. See <code>BigBang</code> object.
<code>onlySolutions</code>	Save only when a solution is reach. Defaults to FALSE (to use all the information, then a filter can be used afterwards). See <code>BigBang</code> object.

`collectMode` information to collect. Defaults to "bigbang". See BigBang object.
`bigbangVerbose` Verbose flag for BigBang object. Defaults to 1. See BigBang object.
`saveFile` File name where the data is saved. Defaults to NULL which implies the name is a concatenation of `classification.method`, method specific parameters, file and ".Rdata". See BigBang object.
`saveFrequency` How often the "current" solutions are saved. Defaults to 50. See BigBang object.
`saveVariable` Internal R variable name of the saved file. Defaults to "bigbang". See BigBang object.
`callbackFuncGALGO` `callbackFunc` for Galgo object. See Galgo object.
`callbackFuncBB` `callbackFunc` for BigBang object. See BigBang object.
`callEnhancerFunc` `callEnhancerFunc` for BigBang object. See BigBang object.
`saveGeneBreaks` `saveGeneBreaks` vector for BigBang object. Defaults to NULL which means to be computed automatically (recommended). See BigBang object.
`geneNames` The gene (variable) names if they differ from the first column in file or `rownames(data)`.
`sampleNames` The sample names if they differ from first row in file or `colnames(data)`.
`bigbangUserData` Additional user data for BigBang object (stored in `$data` variable in BigBang object returned).

Details

Wrapper function. Configure all objects from parameters.

Value

A ready to use bigbang object.

*** TO DO: EXPLAIN THE STRUCTURE OF "DATA" ***

Author(s)

Victor Trevino

See Also

BigBang.

Examples

```
## Not run:
bb <- configBB.VarSelMisc(...)
bb
blast(bb)

## End(Not run)
```

 fitness

Function used to evaluate a chromosome

Description

Function used to evaluate a chromosome using training and validation sets (second-level training-test sets) and the selected split.

Usage

```
fitness(chr, parent)
```

Arguments

chr Chromosome or vector object.
parent Parent object, commonly BigBang object.

Value

A numeric value with the fitness computed for the chromosome.

Note

This function is designed to be used under configBB.VarSel configuration and depend on splitTrainKFold and splitValidKFold variables.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

forwardSelectionModels.BigBang, modelSelection, classPrediction, configBB.VarSel

 Galgo

The representation of a Genetic Algorithm

Description

Represents a genetic algorithm (GA) itself. The basic GA uses at least one population of chromosomes, a “fitness” function, and a stopping rule (see references).

The Galgo object is not limited to a single population, it implements a list of populations where any element in the list can be either a Niche object or a World object. Nevertheless, any user-defined object that implements evolve, progeny, best, max, bestFitness, and maxFitness methods can be part of the populations list.

The “fitness” function is by far the most important part of a GA, it evaluates a Chromosome to determine how good the chromosome is respect to a given goal. The function can be sensitive to data stored in .GlobalEnv or any other object (see *evaluate() for further details). For this package and in the case of the microarray, we have included several fitness functions to classify samples

using different methods. However, it is not limited for a classification problem for microarray data, because you can create any fitness function in any given context.

The stopping rule has three options. First, it is simply a desired fitness value implemented as a numeric `fitnessGoal`, and If the maximum fitness value of a population is equal or higher than `fitnessGoal` the GA ends. Second, `maxGenerations` determine the maximum number of generations a GA can evolve. The current generation is increased after evaluating the fitness function to the entire population list. Thus, if the current generation reach `maxGenerations` the GA stops. Third, if the result of the user-defined `callBackFunc` is NA the GA stops. In addition, you can always break any R program using `Ctrl-C` (or `Esc` in Windows).

When the GA ends many values are used for futher analysis. Examples are the best chromosome (`best method`), its fitness (`bestFitness method`), the final generation (`generation variable`), the evolution of the maximum fitness (`maxFitnesses list variable`), the maximum chromosome in each generation (`maxChromosome list variable`), and the elapsed time (`elapsedTime variable`). Moreover, flags like `goalScored`, `userCancelled`, and `running` are available.

Usage

```
Galgo(id=0,
      populations=list(),
      fitnessFunc=function(...) 1,
      goalFitness=0.9,
      minGenerations=1,
      maxGenerations=100,
      addGenerations=0,
      verbose=20,
      callBackFunc=function(...) 1,
      data=NULL,
      gcCall=0,
      savePopulations=FALSE,
      maxFitnesses=c(),
      maxFitness=0,
      maxChromosomes=list(),
      maxChromosome=NULL,
      bestFitness=0,
      bestChromosome=NULL,
      savedPopulations=list(),
      generation=0,
      elapsedTime=0,
      initialTime=0,
      userCancelled=FALSE,
      goalScored=FALSE,
      running=FALSE,
      ...)
```

Arguments

<code>id</code>	A way to identify the object.
<code>populations</code>	A list of populations of any class <code>World</code> , <code>Niche</code> , or user-defined population.
<code>fitnessFunc</code>	The function that will be evaluate any chromosome in the populations. This function should receive two parameteres, the <code>Chromosome</code> object and the <code>parent</code> object (defined as a parameter as well). The <code>parent</code> object is commonly a object of class <code>BigBang</code> when used combined. Theoretically, the fitness function

may return a numeric non-negative finite value, but commonly in practice these values are limited from 0 to 1. The `offspring` factors in class `Niche` where established using the 0–1 range assumption.

<code>goalFitness</code>	The desired fitness. The GA will evolve until it reach this value or any other stopping rule is met. See description section.
<code>minGenerations</code>	The minimum number of generations. A GA evolution will not ends before this generation number even that <code>fitnessGoal</code> has been reach.
<code>maxGenerations</code>	The maximum number of generations that the GA could evolve.
<code>addGenerations</code>	The number of generations to over-evolve once that <code>goalFitness</code> has been met. Some solutions reach the goal from a large “jump” (or quasi-random mutation) and some other from “plateau”. <code>addGenerations</code> helps to ensure the solutions has been “matured” at least that number of generations.
<code>verbose</code>	Instruct the GA to display the general information about the evolution. When <code>verbose==1</code> this information is printed every generation. In general every <code>verbose</code> number of generation would produce a line of output. Of course if <code>verbose==0</code> would not display a thing at all.
<code>callbackFunc</code>	A user-function to be called after every generation. It should receive the <code>Galgo</code> object itself. If the result is <code>NA</code> the GA ends. For instance, if <code>callbackFunc</code> is <code>plot</code> the trace of all generations is nicely viewed in a plot; however, in long runs it can consume time and memory.
<code>data</code>	Any user-data can be stored in this variable (but it is not limited to <code>data</code> , the user can insert any other like <code>myData</code> , <code>mama.mia</code> or whatever in the . . . argument).
<code>gcCall</code>	How often 10 calls to garbage collection function <code>gc()</code> . This sometimes helps for memory issues.
<code>savePopulations</code>	If <code>TRUE</code> , it save the population array in a <code>savedPopulations</code> variable of the <code>galgo</code> object.
<code>maxFitnesses</code>	Internal object included for generality not inteded for final users.
<code>maxFitness</code>	Internal object included for generality not inteded for final users.
<code>maxChromosomes</code>	Internal object included for generality not inteded for final users.
<code>maxChromosome</code>	Internal object included for generality not inteded for final users.
<code>bestFitness</code>	Internal object included for generality not inteded for final users.
<code>bestChromosome</code>	Internal object included for generality not inteded for final users.
<code>savedPopulations</code>	Internal object included for generality not inteded for final users.
<code>generation</code>	Internal object included for generality not inteded for final users.
<code>elapsedTime</code>	Internal object included for generality not inteded for final users.
<code>initialTime</code>	Internal object included for generality not inteded for final users.
<code>userCancelled</code>	Internal object included for generality not inteded for final users.

goalScored	Internal object included for generality not intended for final users.
running	Internal object included for generality not intended for final users.
...	Other user named values to include in the object (like pMutation, pCrossover or any other).

Class

Package: galgo

Class Galgo

```
Object
~~|
~~+--Galgo
```

Directly known subclasses:

```
public static class Galgo
extends Object
```

Fields and Methods**Methods:**

best	Returns the best chromosome.
bestFitness	Returns the fitness of the best chromosome.
clone	Clones itself and all its objects.
evaluate	Evaluates all chromosomes with a fitness function.
evolve	Evolves the chromosomes populations of a Galgo (Genetic Algorithm).
generateRandom	Generates random values for all populations in the Galgo object.
length	Gets the number of populations defined in the Galgo object.
max	Returns the chromosome whose current fitness is maximum.
maxFitness	Returns the fitness of the maximum chromosome.
plot	Plots information about the Galgo object.
print	Prints the representation of a Galgo object.
refreshStats	Updates the internal values from the current populations.
reInit	Erases all internal values in order to re-use the object.
summary	Prints the representation and statistics of the galgo object.

Methods inherited from Object:

as.list, unObject, \$, \$<-, [, [[<-, as.character, attach, clone, detach, equals, extend, finalize, getFields, getInstanciacionTime, getStaticInstance, hasField, hashCode, ll, load, objectSize, print, save

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

Gene, Chromosome, Niche, World, BigBang, configBB.VarSel(), configBB.VarSelMisc().

Examples

```
cr <- Chromosome(genes=newCollection(Gene(shape1=1, shape2=100),5))
ni <- Niche(chromosomes = newRandomCollection(cr, 10))
wo <- World(niches=newRandomCollection(ni,2))
ga <- Galgo(populations=list(wo), goalFitness = 0.75, callBackFunc=plot,
            fitnessFunc=function(chr, parent) 5/sd(as.numeric(chr)))
ga
evolve(ga)

# missing a classification example
```

galgo.dist

Computes the distance in GALGO for KNN based methods

Description

KNN function does not include other common distances. This function includes more distances computations.

Usage

```
galgo.dist(x, method, p = 2)
```

Arguments

x	Matrix to compute distnaces
method	Any of "euclidean", "maximum", "manhattan", "canberra", "binary", "minkowski". See dist function.
p	Minkowski power.

Value

A vector class dist.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

dist

Gene

*The representation of a gene in a chromosome for genetic algorithms***Description**

Represents the behaviour of a gene in a chromosome for the genetic algorithm. The default properties are supposed to be used in the variable selection problem for microarray data. However, they can be used for any other problem. In addition, any other wanted variable can be added.

See references for Genetic Algorithms.

Usage

```
Gene(id=0, shape1=0, shape2=0, generateFunc=runifInt, ...)
```

Arguments

<code>id</code>	To identify the object.
<code>shape1</code>	Parameter for a distribution. Used to generate a random value for a gene (mean, minimum, alfa, etc).
<code>shape2</code>	Parameter for a distribution. Used to generate a random value for a gene (sd, maximum, beta, etc).
<code>generateFunc</code>	Function that generate a random value for a gene using the above shape parameters. This function would be used to get an initial value and to mutate a gene. The default is a random uniform integer with <code>shape1</code> as minimum and <code>shape2</code> as maximum (either inclusive). The parameters used in the call are <code>object</code> , <code>n</code> , <code>shape1</code> , and <code>shape2</code> . The random value generated is not saved. If future values depends on the previous, you must save it explicitly in the object.
<code>...</code>	Other user named values to include in the object.

Class

Package: galgo

Class Gene

Object

~~|

~~+--Gene

Directly known subclasses:

```
public static class Gene
extends Object
```

Fields and Methods**Methods:**

<code>as.double</code>	Converts the gene parameters (shape1, shape2) to its numerical representation.
<code>as.matrix</code>	Converts the gene parameters (shape1, shape2) to matrix.
<code>generateRandom</code>	Generates a random value from the defined function.
<code>mutate</code>	Mutates a gene.
<code>newCollection</code>	Generates a list of cloned objects.
<code>newRandomCollection</code>	Generates a list of cloned objects and random values.
<code>print</code>	Prints the representation of a gene object.
<code>reInit</code>	Erases all internal values in order to re-use the object.
<code>summary</code>	Prints the representation of a gene object.

Methods inherited from Object:

`as.list`, `unObject`, `$`, `$<-`, `[]`, `[[<-`, `as.character`, `attach`, `clone`, `detach`, `equals`, `extend`, `finalize`, `getFields`, `getInstanciationTime`, `getStaticInstance`, `hasField`, `hashCode`, `ll`, `load`, `objectSize`, `print`, `save`

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

`Chromosome`, `Niche`, `World`, `Galgo`, `BigBang`, `runifInt`.

Examples

```
ge <- Gene(shape1=1, shape2=100)
ge
```

geneBackwardElimination

Searches for shorter or better models using backward elimination strategy

Description

Searches for shorter or better models using backward elimination strategy. Recursively eliminates variables/genes from a chromosome one by one computing the fitness function. This function is specially designed to be used in the `BigBang` object and for variable selection problems.

Usage

```
geneBackwardElimination(chr, bigbang, result=c("highest", "shortest", "selected", "v
```

Arguments

<code>chr</code>	Original chromosome object (or numeric vector).
<code>bigbang</code>	The BigBang object to be used to call the fitness function.
<code>result</code>	The type of result needed. "highest" returns the visited chromosome whose fitness was highest. Ties are resolved using the shortest chromosome and finally by random. "shortest" returns the visited chromosome whose length was minimum and fitness greater than or equal to the original. Ties are resolved by highest fitness and finally by random. "visited" returns a list of all visited chromosomes. "selected" only the chromosomes with fitness greater than or equal to original fitness.
<code>minChromosomeSize</code>	The minimum possible size of a chromosome. The default is 2.
<code>fitnessFunc</code>	The fitness function used to evaluate the chromosomes. The default is the usage of <code>bigbang\$galgo\$fitnessFunc</code> .
<code>fitnessAid</code>	To avoid local minima, <code>fitnessAid</code> is an amount to be reduced to original fitness in order to try search for better fitness. When it is negative, it is interpreted as percentage value to reduce from the original fitness. If <code>fitnessAid</code> is positive, it is subtracted from original fitness.
<code>verbose</code>	Display internal steps for debugging purposes.
<code>...</code>	Additional arguments to <code>fitnessFunc</code> .

Details

Removes one gene/variable at the time and compute the fitness. If the fitness is greater than or equal to original "reduced" fitness, another attempt to remove other variable will be performed. The result might be a reduced chromosome with same or better fitness.

Value

A chromosome when `result=="highest"` or `result=="smallest"` and a data frame otherwise.

Author(s)

Victor Trevino

See Also

`BigBang`, `robustGeneBackwardElimination`.

Examples

```
## Not run:
rchr <- lapply(bb$bestChromosomes[1:100],geneBackwardElimination, bb, result="shortest")
barplot(table(unlist(lapply(rchr,length))),main="Length of Shortened Chromosomes (evaluated

rchr <- lapply(bb$bestChromosomes[1:100],robustGeneBackwardElimination, bb, result="shortest")
barplot(table(unlist(lapply(rchr,length))),main="Length of Shortened Chromosomes")

## End(Not run)
```

```
generateRandomModels
```

Generates Random shorter models

Description

Evaluate random models using the specified gene indexes.

Usage

```
generateRandomModels(genes, bigbang,
  size=trunc(length(genes)/2), n=100,
  fitnessFunc=bigbang$data$modelSelectionFunc,
  models=FALSE, ...)
```

Arguments

genes	Original chromosome object (or numeric vector).
bigbang	The BigBang object to be used to call the fitness function.
size	Size of new random models.
n	Number of models
fitnessFunc	The fitness function used to evaluate the chromosomes. The default is the usage of bigbang\$galgo\$fitnessFunc.
models	Logical value.
...	Other parameters passed to fitnessFunc.

Value

If models==TRUE, a vector of resulted fitness for random models, otherwise a list with models (matrix, cols=models) and their fitness (vector) is returned.

Author(s)

Victor Trevino

See Also

BigBang.

Examples

```
## Not run:
rm <- generateRandomModels(geneFrequency(bb, value="index") [1:50], bb, size=5, n=100, models=T)
rm

## End(Not run)
```

knn_C_predict	<i>Class prediction using KNN method calling the C code</i>
---------------	---

Description

C code for knn. There is a knn_R_predict but R code is slower, which is included for debugging and educational purposes.

Usage

```
knn_C_predict(chr, parent, tr, te, result)
```

Arguments

chr	Chromosome. Must be integer, use as.integer().
parent	Bigbang object.
tr	Sample indexes for training vector. Must be integer, use as.integer().
te	Sample indexes for test vector. Must be integer, use as.integer().
result	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use as.integer().

Value

Vector of classes (integer) or numeric value. Depends on result argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

knn

knn_R_predict	<i>Class prediction using KNN method calling the R code</i>
---------------	---

Description

R code is slower than C code. This function is included for debugging and educational purposes.

Usage

```
knn_R_predict(chr, parent, tr, te, result)
```

Arguments

<code>chr</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

`nnet`

`loadObject`

Load saved data of class `Object` and use `reObject` as necessary

Description

Load the data from a file into the `.GlobalEnv` (or any other environment). If variables were converted to a list using `unObject`, this variables are converted to original object using `reObject` method.

Usage

```
loadObject(file=NULL, envir=.GlobalEnv, verbose=T, reobjectize=T, compatibilize=TRUE)
```

Arguments

<code>file</code>	The file to load.
<code>envir</code>	The environment to load the data. The default is <code>.GlobalEnv</code> .
<code>verbose</code>	Displays progress.
<code>reobjectize</code>	Specify if <code>reObject</code> method should be called. Defaults to <code>TRUE</code> .
<code>compatibilize</code>	Compatibilze chromosomes built on previous versions.
<code>...</code>	Additional arguments to <code>reObject</code>

Details

Load the data from a file into the `.GlobalEnv` (or any other environment). If variables were converted to a list using `unObject`, this variables are converted to original object using `reObject` method.

Value

A data frame with variable names and class of loaded objects.

Warning

It could take some seconds for large and/or complex objects/files.

Author(s)

Victor Trevino

See Also

unObject, reObject.

Examples

```
library(R.oo) # needed library
o <- Object()
o$x = 1
o$y = 2
o$x
o$y
o
class(o)
names(o)
uo <- unObject(o)
uo
class(uo)
save(uo, file="uo.Rdata")

### perhaps other session here
library(R.oo)
loadObject("uo.Rdata")
uo
class(uo)
# the class is the original from the original object (o in this case)

### equivalent to:
library(R.oo)
load("uo.Rdata")
uo <- reObject(uo)
uo
class(uo)
```

mlhd_C_predict

*Class prediction using Maximum Likelihood Discriminant Functions
method calling the C code*

Description

C code for mlhd. There is a mlhd_R_predict but R code is slower, which is included for debugging and educational purposes.

Usage

```
mlhd_C_predict(chr, parent, tr, te, result)
```

Arguments

chr	Chromosome. Must be integer, use as.integer().
parent	Bigbang object.
tr	Sample indexes for training vector. Must be integer, use as.integer().
te	Sample indexes for test vector. Must be integer, use as.integer().
result	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use as.integer().

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

mlhd_R_predict	<i>Class prediction using Maximum Likelihood Discriminant Functions method calling the R code</i>
----------------	---

Description

R code is slower than C code. This function is included for debugging and educational purposes.

Usage

```
mlhd_R_predict(chr, parent, tr, te, result)
```

Arguments

chr	Chromosome. Must be integer, use as.integer().
parent	Bigbang object.
tr	Sample indexes for training vector. Must be integer, use as.integer().
te	Sample indexes for test vector. Must be integer, use as.integer().
result	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use as.integer().

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

modelSelection *Function used to evaluate a fitness function in many train-test sets*

Description

Function used to evaluate a fitness function in many train-test sets

Usage

```
modelSelection(chr, parent, splits=1:length(parent$data$splitTrain), set=parent$data
```

Arguments

chr	Chromosome or vector object.
parent	Parent object, commonly BigBang object.
splits	Which sets of splits will be used to compute the fitness function. Default to all splits defined in parent\$data\$splitTrain.
set	Weights used in training and test sets. Vector of two values. The first is the weight of train error. The second is the weight of test error. The default value is taken from parent\$data\$testErrorWeights whose default is c(0,1) (considering only test error).

Value

A vector with the fitness computed for each split weighted according to set parameter.

Note

This function is designed to be used in forwardSelectionModels

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

```
forwardSelectionModels.BigBang, classPrediction, fitness, configBB.VarSel
```

nearcent_C_predict *Class prediction using the nearest centroid method calling the C code*

Description

C code for nearest centroid. There is a nearcent_R_predict but R code is slower, which is included for debugging and educational purposes.

Usage

```
nearcent_C_predict(chr, parent, tr, te, result)
```

Arguments

<code>chr</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

`nearcent_R_predict` *Class prediction using the nearest centroid method calling the R code*

Description

R code is slower than C code. This function is included for debugging and educational purposes.

Usage

```
nearcent_R_predict(chr, parent, tr, te, result)
```

Arguments

<code>chr</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

Description

Niche represents a set of chromosomes for the genetic algorithm. The niche can generate a progeny that may be more adapted to certain tasks (or environment, see Goldberg). To decide which chromosomes are more suitable to be chosen as “parents”, every chromosome in the niche is evaluated using a “fitness” function. The selected chromosomes are mated using crossover to produce diversity. Finally the chromosomes are mutated and the new progeny is ready for next generation.

The basic idea to generate a progeny is a random selection biased toward the best chromosomes (see Goldberg). We implemented this idea as a weighted probability for a chromosome to be selected using the formula:

$$p = \text{scale} * \max(0, \text{fitness} - \text{mean} * \text{mean}(\text{fitness}))^{\text{power}}$$

where scale, mean and power are the properties of the niche (`offspringScaleFactor`, `offspringMeanFactor` and `offspringPowerFactor` respectively). The default values were selected to be reasonably bias when the variance in the fitness are both high (at early generations) and low (in late generatios).

The crossover mechanism needs to know the positions whose chromosomes can actually mate (`crossoverPoints`). The number of crossovers can be customized with `crossoverFunc(*crossover())`.

The elitism mechanism (`elitism` variable) are implemented replacing a random chromosome from the niche at the end of the progeny process (`*progeny()`).

The Niche object keeps a record of the number of generations, the maximum chromosome in the niche, and the best chromosome ever known (see `*best()` for an example).

The length of the niche is static. Nevertheless this behaviour (and any other) can be customised overwriting original methods (like `progeny` or `crossover`) methods. However, this is intend to be used only for experienced users.

The niche is considered a “closed population”, this means mating with chromosomes within the same niche. Migration mechanism uses niches to exchange chromosomes between them, which is implemented in `World` object (see `World`).

Usage

```
Niche(id=0,
      chromosomes=list(),
      offspringScaleFactor=1,
      offspringMeanFactor=0.85,
      offspringPowerFactor=2,
      crossoverPoints=0,
      mutationsFunc=function(.) length(.),
      crossoverFunc=function(.) length(.)/2,
      elitism=1,
      generation=0,
      fitness=0,
      maxFitness=0,
      bestFitness=0,
      maxChromosome=NULL,
      bestChromosome=NULL,
      ...)
```

Arguments

<code>id</code>	A way to identify the object.
<code>chromosomes</code>	A list of defined chromosomes composing the niche.
<code>offspringScaleFactor</code>	The <code>offspringScaleFactor</code> parameter. See description.
<code>offspringMeanFactor</code>	The <code>offspringMeanFactor</code> parameter. See description.
<code>offspringPowerFactor</code>	The <code>offspringPowerFactor</code> parameter. See description.
<code>crossoverPoints</code>	Specific positions at which the chromosomes can be mated. Should be from 2 to <i>minimum</i> possible length of any chromosome in the niche.
<code>mutationsFunc</code>	A function returning the final number of mutations in the niche. It receives the <code>Niche</code> object as parameter. To implement “probability of mutation” instead, add a variable like <code>pMutation</code> in the constructor and multiply by the length of the niche and the length of the chromosome in the function (<code>function(niche) niche\$pMutation</code>
<code>crossoverFunc</code>	A function returning the final number of crossovers in the niche. It receives the <code>Niche</code> object as parameter. To implement “probability of crossover” instead, add a variable like <code>pCrossOver</code> in the constructor and multiply by the length of the niche in the function. (<code>function(niche) niche\$pCrossOver * length(niche)</code>).
<code>elitism</code>	Controls the elitism mechanism. Elitism is desired to find solutions quicker, but it may be a nuisance when it is trapped in strong attractors. Therefore, in general, it may be a probability. Furthermore, it can be a vector of probabilities where the index is controlled by generation. If the current generation is greater than the length of this vector, a cycled version is used (starting from the first value).
<code>fitness</code>	The current fitness. It should be 0 initially, but it is included for generalization.
<code>bestFitness</code>	The best fitness ever visited. It should be 0 initially. Included for generalization.
<code>maxFitness</code>	The maximum fitness from the current chromosomes. It should be 0 initially, but it is included for generalization.
<code>maxChromosome</code>	The chromosome whose fitness is maximum from the current chromosomes. It should be NULL initially, but it is included for generalization.
<code>bestChromosome</code>	The chromosome whose fitness is maximum visited ever. It should be NULL initially, but it is included for generalization.
<code>generation</code>	For internal uses only.
<code>...</code>	Other user named values to include in the object (like <code>pMutation</code> , <code>pCrossover</code> or any other).

Class

Package: galgo

Class Niche

Object

~~|

```
~~+--Niche
```

Directly known subclasses:

```
public static class Niche
extends Object
```

Fields and Methods

Methods:

<code>as.double</code>	Converts the chromosome values (genes) to a vector.
<code>as.matrix</code>	Converts the chromosome values (genes) to a matrix.
<code>best</code>	Returns the best chromosome of the niche.
<code>bestFitness</code>	Returns the fitness of the best chromosome in the niche.
<code>clone</code>	Clones itself and its chromosomes.
<code>crossover</code>	Performs crossover between chromosomes of the niche.
<code>evaluate</code>	Evaluates the chromosome using a fitness function.
<code>generateRandom</code>	Generates random values for all genes contained in all chromosomes in the niche.
<code>getFitness</code>	Returns the fitness vector related to chromosomes.
<code>length</code>	Gets the number of chromosomes defined in the niche.
<code>max</code>	Returns the chromosome in the niche whose current fitness is maximum.
<code>maxFitness</code>	Returns the fitness of the maximum chromosome in the niche.
<code>mutate</code>	Mutates a niche calling mutate method for all chromosomes.
<code>newCollection</code>	Generates a list of cloned niches.
<code>newRandomCollection</code>	Creates a list of cloned niches with its internal values generated by random.
<code>offspring</code>	Overwrites the new niche selecting a new population from the best chromosomes.
<code>plot</code>	Plots information about niche object.
<code>print</code>	Prints the representation of a niche object.
<code>progeny</code>	Performs offspring, crossover, mutation, and elitism mechanism to generate the “evolved” n
<code>refreshStats</code>	Updates the internal values from the current population.
<code>reInit</code>	Erases all internal values in order to re-use the object.
<code>scaling</code>	Assigns a weight for every chromosome to be selected for the next generation.
<code>summary</code>	Prints the representation and statistics of the niche object.

Methods inherited from Object:

`as.list`, `unObject`, `$`, `$<-`, `[]`, `[[<-`, `as.character`, `attach`, `clone`, `detach`, `equals`, `extend`, `finalize`, `getFields`, `getInstanciacionTime`, `getStaticInstance`, `hasField`, `hashCode`, `ll`, `load`, `objectSize`, `print`, `save`

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

Gene, Chromosome, World, Galgo, BigBang.

Examples

```
cr <- Chromosome(genes=newCollection(Gene(shape1=1, shape2=100),5))
ni <- Niche(chromosomes=newRandomCollection(cr, 10))
ni

## in average, one of 10 genes can be mutated
mf <- function(niche) niche$pMutations * length(niche) * length(niche$chromosomes[[1]])
ni2 <- Niche(chromosomes=newRandomCollection(cr, 10),
             mutationsFunc=mf,
             pMutations=1/10)
ni2      # random initial niche
mutate(ni2) # returns the chromosomes indexes that were mutated
ni2      # mutated niche
```

nnet_R_predict

Class prediction using the neural networks method calling the R code

Description

neural networks R code for prediction.

Usage

```
nnet_R_predict(x, parent, tr, te, result, ...)
```

Arguments

x	Chromosome. Must be integer, use as.integer().
parent	Bigbang object.
tr	Sample indexes for training vector. Must be integer, use as.integer().
te	Sample indexes for test vector. Must be integer, use as.integer().
result	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use as.integer().
...	Not used. Included for package compatibility documentation purposes.

Value

Vector of classes (integer) or numeric value. Depends on result argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

nnet

```
randomforest_R_predict
```

Class prediction using RandomForest method calling the R code

Description

Prediction using random forest from randomForest package.

Usage

```
randomforest_R_predict(chr, parent, tr, te, result)
```

Arguments

<code>chr</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

`knn`

```
reObject
```

Creates proper extended Object from a list obtained by unObject

Description

Rebuilds an object to its original class from a list which was usually obtained using `unObject`. The original class is deduced using the `Class` value and its S3 constructor will be called using all other values as properties.

Usage

```
reObject(o, showStructure = 0)
```

Arguments

- o The list attempted to convert to its original Object.
- showStructure Flag to show/debug the conversion course. It can be 1, 2 or 0.

Details

The original class (`x$class . value`) is called without any parameter, then all properties (names) in the list are set using `assign`. The procedure is recursive called if an object of class list is found inside `x`. If the original object was extended from `Object`, this object have to be already defined using S3 methodology, otherwise an error would occur.

Value

Object of original class given by `x$class .`

Warning

It could take some seconds for large and/or complex objects.

Note

It is very important that if the original class was extended from `Object`, this class and its methods are already defined, otherwise unexpected behaviour and/or errors would occur.

Author(s)

Victor Trevino

See Also

`unObject`.

Examples

```
library(R.oo) # needed library
o <- Object()
o$x = 1
o$y = 2
o$x
o$y
o
class(o)
names(o)
uo <- unObject(o)
uo
x <- reObject(uo)
class(x)
names(x)
x$x
x$y
```

```
### saving/retriving
```

```

library(R.oo)
o <- Object()
o$x = 1
o$y = 2
uo <- unObject(o)
save(uo, file="uo.Rdata")
### perhaps other session here
library(R.oo)
#if your object requires other sub-class (extend Object) and/or method definition,
#load it here before using reObject otherwise an error would occur.
load("uo.Rdata")
class(uo)          ## uo now is a list
uo
x <- reObject(uo)
class(x)          ### now x is Object
names(x)
x$x
x$y
x

```

```

robustGeneBackwardElimination
      Searches for shorter or better models using backward elimination
      strategy

```

Description

Searches for shorter or better models using backward elimination strategy. Recursively eliminates variables/genes from a chromosome one by one computing the fitness function. This function is specially designed to be used in the BigBang object and for variable selection problems.

Usage

```
robustGeneBackwardElimination(chr, bigbang, fitnessFunc=bigbang$data$modelSelectionFunc)
```

Arguments

chr	Original chromosome object (or numeric vector).
bigbang	The BigBang object to be used to call the fitness function.
fitnessFunc	The fitness function used to evaluate the chromosomes. The default is the usage of bigbang\$data\$modelSelectionFunc.
...	Additional Arguments passed to geneBackwardElimination.

Details

Removes one gene/variable at the time and compute the fitness. If the fitness is greater than or equal to original "reduced" fitness, another attempt to remove other variable will be performed. The result might be a reduced chromosome with same or better fitness.

Value

A chromosome when result=="highest" or result=="smallest" and a data frame otherwise.

Author(s)

Victor Trevino

See Also

BigBang, geneBackwardElimination.

Examples

```
## Not run:
rchr <- lapply(bb$bestChromosomes[1:100], robustGeneBackwardElimination, bb, result="shortest")
barplot(table(unlist(lapply(rchr, length))), main="Length of Shortened Chromosomes")

## End(Not run)
```

rpart_R_predict	<i>Class prediction using the recursive tree partitions method calling the R code</i>
-----------------	---

Description

Recursive tree partition code in R.

Usage

```
rpart_R_predict(chr, parent, tr, te, result)
```

Arguments

chr	Chromosome. Must be integer, use as.integer().
parent	Bigbang object.
tr	Sample indexes for training vector. Must be integer, use as.integer().
te	Sample indexes for test vector. Must be integer, use as.integer().
result	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use as.integer().

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

runifInt *Generation of random uniform integer values*

Description

random number of uniform distribution

Usage

```
runifInt(.O, n, mn, mx)
```

Arguments

.O	Gene object
n	Number of random values to generate
mn	Minimum value
mx	Maximum value

Value

A vector with random values drawn from a uniform distribution.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

runif

svm_C_predict *Class prediction using support vector machines method calling the C/R code*

Description

This function really calls the C function that is provided in svm package. The only difference with svm function is that many checks are removed in order to speed up the process. However, it is responsibility of the user use valid values.

Usage

```
svm_C_predict(x, parent, tr, te, result, ...)
```

Arguments

<code>x</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .
<code>...</code>	Not used. Included for package compatibility documentation purposes.

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

`svm`

<code>svm_R_predict</code>	<i>Class prediction using support vector machines method calling the R code</i>
----------------------------	---

Description

This function just call `svm R` code.

Usage

```
svm_R_predict(x, parent, tr, te, result, ...)
```

Arguments

<code>x</code>	Chromosome. Must be integer, use <code>as.integer()</code> .
<code>parent</code>	Bigbang object.
<code>tr</code>	Sample indexes for training vector. Must be integer, use <code>as.integer()</code> .
<code>te</code>	Sample indexes for test vector. Must be integer, use <code>as.integer()</code> .
<code>result</code>	0 indicates to return class prediction, non-zero returns the proportion of samples with same class prediction. Must be integer, use <code>as.integer()</code> .
<code>...</code>	Not used. Included for package compatibility documentation purposes.

Value

Vector of classes (integer) or numeric value. Depends on `result` argument.

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K.

See Also

svm

unObject

Converts variables from class Object (and derived classes) to list

Description

Converts objects derived from class Object to a list object that preserve the properties (data) and can be accessed using the same R syntax. It is primarily used to explore the data or to save the object as an R object independent of the original methods.

Usage

```
unObject(...)
```

Arguments

... Variables of class Object (or list containing some Object).

Details

In R.oo package, all objects are internally represented as environment objects (see R.oo package) to give the “by value” functionality. However, this representation is not suitable to save, retrieve or explore the data as easy as common objects in R. This method converts an object derived from class Object to a common list object preserving all data except the original methods. It is very useful when an object of class Object contains other objects derived from same class Object.

Value

Return a list containing all values of the object. If `x` contains a list or other Object, these are represented also as a list. The original class of the object is stored in "Class." value.

Warning

The CPU time consumed by this method depends on the complexity of `x`. It is commonly very fast but can be a nuisance when `x` contains many nested objects of class Object (or many lists containing Objects).

Note

If properties (values) inside an object Object contains a function object, the environment is set to `.GlobalEnv` for convenience. This method is also implemented for list object because it could contain another Object.

Author(s)

Victor Trevino

See Also

Object, reObject, unObject.list.

Examples

```
library(R.oo) # needed library
o <- Object()
o$x = 1
o$y = 2
o$x
o$y
o
class(o)
names(o)
uo <- unObject(o)
uo
```

World

The representation of a set of niches with migration for genetic algorithms

Description

Represents a set of niches for the genetic algorithm. Because the niches are “closed populations”, it is sometimes needed exchange information between niches (or “islands”). The `World` object implements the exchange of chromosomes between niches, and to be compatible, it also implements the needed methods than an usual niche but considering the immigration property. Thus, the `Galgo` object can receive a list of `Niches`, a list of `Worlds`, or a list of any mixture of them.

Usage

```
World(id=0,
niches=list(),
immigration=0,
maxFitness=0,
bestFitness=0,
maxChromosome=NULL,
bestChromosome=NULL,
generation=0,
...)
```

Arguments

<code>id</code>	A way to identify the object.
<code>niches</code>	A list of defined niches composing the world. However, it can be a list containing even <code>World</code> objects.
<code>immigration</code>	It can be <code>NULL</code> , a function, or a vector. When it is <code>NULL</code> immigration is disabled. When it is a function it is evaluated using the same <code>World</code> object as parameter, the result should be a numeric value. When the length of <code>immigration</code> is greater than 1 a cycled version is used depending on the generation. If the resulted or selected numeric value is greater than 1 it is

	interpreted as the number of chromosomes to migrate, otherwise it is assumed to be a probability to migrate one chromosome. The final \mathbb{I} best chromosomes to migrate apply to all niches.
bestFitness	The best fitness ever visited.
maxFitness	The maximum fitness from the current chromosomes. It should be 0 initially, but it is included for generalization.
maxChromosome	The chromosome whose fitness is maximum from the current chromosomes. It should be NULL initially, but it is included for generalization.
bestChromosome	The chromosome whose fitness is maximum visited ever. It should be NULL initially, but it is included for generalization.
generation	For internal use only.
...	Other user named values to include in the object (like pMutation, pCrossover or any other).

Class

Package: galgo

Class World

```
Object
~~|
~~+--World
```

Directly known subclasses:

```
public static class World
extends Object
```

Fields and Methods**Methods:**

best	Returns the best chromosome.
bestFitness	Returns the fitness of the best chromosome.
clone	Clones itself and its niches.
evaluate	Evaluate all niches with a fitness function.
generateRandom	Generates random values for all niches in the world.
length	Gets the number of niches defined in the world.
max	Returns the chromosome whose current fitness is maximum.
maxFitness	Returns the fitness of the maximum chromosome.
newCollection	Generates a list cloning an object.
newRandomCollection	Creates a list of cloned object with its internal values generated by random.
plot	Plots information about world object.
print	Prints the representation of a world object.
progeny	Calls progeny method to all niches in the world object.
refreshStats	Updates the internal statistics from the current population.

reInit	Erases all internal values in order to re-use the world object.
summary	Prints the representation and statistics of the world object.

Methods inherited from Object:

as.list, unObject, \$, \$<-, [], [[<-, as.character, attach, clone, detach, equals, extend, finalize, getFields, getInstanciationTime, getStaticInstance, hasField, hashCode, ll, load, objectSize, print, save

Author(s)

Victor Trevino. Francesco Falciani Group. University of Birmingham, U.K. <http://www.bip.bham.ac.uk/bioinf>

References

Goldberg, David E. 1989 *Genetic Algorithms in Search, Optimization and Machine Learning*. Addison-Wesley Pub. Co. ISBN: 0201157675

See Also

Gene, Chromosome, Niche, Galgo, BigBang.

Examples

```
cr <- Chromosome(genes=newCollection(Gene(shape1=1, shape2=100),5))
ni <- Niche(chromosomes=newRandomCollection(cr, 10))
wo <- World(niches=newRandomCollection(ni,2))
wo

progeny(wo) # returns the chromosomes indexes that were mutated
```

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