# Package 'EmiR'

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```
Type Package
Title Evolutionary Minimizer for R
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Description A C++ implementation of the following evolutionary
      algorithms: Bat Algorithm (Yang, 2010 < doi:10.1007/978-3-642-12538-6_6>),
      Cuckoo Search (Yang, 2009 < doi:10.1109/nabic.2009.5393690 > ),
      Genetic Algorithms (Holland, 1992, ISBN:978-0262581110),
      Gravitational Search Algorithm (Rashedi et al., 2009 <doi:10.1016/j.ins.2009.03.004>),
      Grey Wolf Optimization (Mirjalili et al., 2014 <doi:10.1016/j.advengsoft.2013.12.007>),
      Harmony Search (Geem et al., 2001 <doi:10.1177/003754970107600201>),
      Improved Harmony Search (Mahdavi et al., 2007 < doi:10.1016/j.amc.2006.11.033>),
      Moth-flame Optimization (Mirjalili, 2015 <doi:10.1016/j.knosys.2015.07.006>),
      Particle Swarm Optimization (Kennedy et al., 2001 ISBN:1558605959),
      Simulated Annealing (Kirkpatrick et al., 1983 < doi:10.1126/science.220.4598.671>),
      Whale Optimization Algorithm (Mir-
      jalili and Lewis, 2016 <doi:10.1016/j.advengsoft.2016.01.008>).
      'EmiR' can be used not only for unconstrained optimization problems, but also
      in presence of inequality constrains, and variables restricted to be integers.
License GPL-3
Encoding UTF-8
LazyData true
Depends R (>= 3.5.0)
Imports Rcpp (>= 1.0.5), methods, Rdpack, tictoc, ggplot2, tibble, tidyr, dplyr, gganimate, math-
     jaxr, data.table, plot3D
LinkingTo Rcpp, RcppProgress, testthat
RoxygenNote 7.1.1
Roxygen list(markdown = TRUE)
RdMacros Rdpack, mathjaxr
SystemRequirements C++11
```

Suggests xml2, testthat

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# R topics documented:

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# Description

ackley\_func

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Implementation of n-dimensional Ackley function, with  $a=20,\,b=0.2$  and  $c=2\pi$  (see definition below).

Ackley Function

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### Usage

ackley\_func(x)

# **Arguments**

Х

numeric or complex vector.

#### **Details**

On an n-dimensional domain it is defined by

$$f(\vec{x}) = -a \exp\left(-b\sqrt{\frac{1}{n}\sum_{i=1}^{n} x_i^2}\right) - \exp\left(\frac{1}{n}\sum_{i=1}^{n} \cos(cx_i)\right) + a + \exp(1),$$

and is usually evaluated on  $x_i \in [-32.768, 32.768]$ , for all i = 1, ..., n. The function has one global minimum at  $f(\vec{x}) = 0$  for  $x_i = 0$  for all i = 1, ..., n.

#### Value

The value of the function.

#### References

Ackley DH (1987). A Connectionist Machine for Genetic Hillclimbing. Springer US. doi: 10.1007/9781461319979.

animate\_population

Animation of population motion

# **Description**

Create an animation of the population motion for the minimization of 1D and 2D functions. The animation can be produced only if save\_pop\_history is TRUE in the options of the minimizer (see MinimizerOpts).

# Usage

```
animate_population(minimizer_result, n_points = 100)
```

#### **Arguments**

minimizer\_result

an object of class OptimizationResults (see OptimizationResults).

 $n\_points$ 

number of points per dimension used to draw the objective function. Default is 100.

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bohachevsky\_func

Bohachevsky Function

# Description

Implementation of 2-dimensional Bohachevsky function.

# Usage

bohachevsky\_func(x)

# Arguments

Х

numeric or complex vector.

# **Details**

On an 2-dimensional domain it is defined by

$$f(\vec{x}) = x_1^2 + 2x_2^2 - 0.3\cos(3\pi x_1) - 0.4\cos(4\pi x_2) + 0.7$$

and is usually evaluated on  $x_i \in [-100, 100]$ , for all i = 1, 2. The function has one global minimum at  $f(\vec{x}) = 0$  for  $\vec{x} = [0, 0]$ .

# Value

The value of the function.

### References

Bohachevsky IO, Johnson ME, Stein ML (1986). "Generalized simulated annealing for function optimization." *Technometrics*, **28**(3), 209–217.

colville\_func

Colville Function

# Description

Implementation of 4-dimensional Colville function.

# Usage

colville\_func(x)

# **Arguments**

Х

numeric or complex vector.

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#### **Details**

On an 4-dimensional domain it is defined by

```
f(\vec{x}) = 100(x_1^2 - x_2)^2 + (x_1 - 1)^2 + (x_3 - 1)^2 + 90(x_3^2 - x_4)^2 + 10.1((x_2 - 1)^2 + (x_4 - 1)^2) + 19.8(x_2 - 1)(x_4 - 1), and is usually evaluated on x_i \in [-10, 10], for all i = 1, ..., 4. The function has one global minimum at f(\vec{x}) = 0 for \vec{x} = [1, 1, 1, 1].
```

#### Value

The value of the function.

#### References

Grippo L, Lampariello F, Lucidi S (1989). "A truncated Newton method with nonmonotone line search for unconstrained optimization." *Journal of Optimization Theory and Applications*, **60**(3), 401–419. doi: 10.1007/bf00940345.

config\_abc

Configuration object for the Artificial Bee Colony Algorithm

### **Description**

Create a configuration object for the Artificial Bee Colony Algorithm (ABC). At minimum the number of iterations (parameter iterations) and the number of bees (parameter population\_size) have to be provided.

#### Usage

```
config_abc(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  employed_frac = 0.5,
  n_scout = 1
)
```

# **Arguments**

```
iterations
                  maximum number of iterations.
population_size
                  number of bees.
iterations_same_cost
                  maximum number of consecutive iterations with the same (see the parameter
                  absolute_tol) best cost before ending the minimization. If NULL the minimiza-
                  tion continues for the number of iterations specified by the parameter iterations.
                  Default is NULL.
absolute_tol
                  absolute tolerance when comparing best costs from consecutive iterations. If
                  NULL the machine epsilon is used. Default is NULL.
employed_frac
                  fraction employed bees. Default is 0.5.
                  number of scout bees. Default is 1.
n_scout
```

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#### Value

config\_abc returns an object of class ABCConfig.

#### References

Karaboga D, Basturk B (2007). "A powerful and efficient algorithm for numerical function optimization: artificial bee colony (ABC) algorithm." *Journal of Global Optimization*, **39**(3), 459–471. doi: 10.1007/s108980079149x.

config\_algo

Configuration object for algorithms

# **Description**

Create a configuration object for one of the algorithms available in EmiR. At minimum the id of the algorithm (parameter algorithm\_id), the number of iterations (parameter iterations) and the number of individuals in the population (parameter population\_size) have to be provided.

# Usage

```
config_algo(
  algorithm_id,
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  ...
)
```

#### **Arguments**

 ${\tt algorithm\_id} \qquad {\tt id} \ of \ the \ algorithm \ to \ be \ used. \ See \ \underline{list\_of\_algorithms} \ for \ the \ list \ of \ the \ available$ 

algorithms.

iterations maximum number of iterations.

population\_size

number of individuals in the population.

iterations\_same\_cost

maximum number of consecutive iterations with the same (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations.

Default is NULL.

absolute\_tol

absolute tolerance when comparing best costs from consecutive iterations. If  $\mathsf{NULL}$  the machine epsilon is used. Default is  $\mathsf{NULL}$ .

algorithm specific parameters (see specific configuration functions for more details).

### Value

config\_algo returns a configuration object specific for the specified algorithm.

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config\_bat

Configuration object for the Bat Algorithm

#### **Description**

Create a configuration object for the Bat Algorithm (BAT). At minimum the number of iterations (parameter iterations) and the number of bats (parameter population\_size) have to be provided.

# Usage

```
config_bat(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  initial_loudness = 1.5,
  alpha = 0.9,
  initial_pulse_rate = 0.5,
  gamma = 0.9,
  freq_min = 0,
  freq_max = 2
)
```

# **Arguments**

 $\begin{array}{ll} \mbox{iterations} & \mbox{maximum number of iterations.} \\ \mbox{population\_size} & \end{array}$ 

number of bats.

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations.

Default is NULL.

absolute\_tol absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

initial\_loudness

initial loudness of emitted pulses. Typical values are in the range [1, 2]. Default is 1.5.

alpha parameter to control the linearly decreasing loudness with the iterations. It should be between 0 and 1. Default is 0.9.

initial\_pulse\_rate

initial rate at which pulses are emitted. It should be between 0 and 1. Default is 0.5

gamma parameter to control the exponentially decreasing pulse rate with the iterations.

Defatul is 0.9.

freq\_min minimum frequency value of pulses. Default is 0.
freq\_max maximum frequency value of pulses. Default is 2.0.

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#### Value

config\_bat returns an object of class BATConfig.

#### References

Yang X (2010). "A new metaheuristic bat-inspired algorithm." In *Nature inspired cooperative strategies for optimization (NICSO 2010)*, 65–74. Springer.

config\_cs

Configuration object for the Cuckoo Search Algorithm

# **Description**

Create a configuration object for the Cuckoo Search Algorithm (CS). At minimum the number of iterations (parameter iterations) and the number of host nests (parameter population\_size) have to be provided.

#### Usage

```
config_cs(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  discovery_rate = 0.25,
  step_size = 1
)
```

### **Arguments**

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

Default is NOL

absolute\_tol absolute tolerance when comparing best costs from consecutive iterations. If

NULL the machine epsilon is used. Default is NULL.

discovery\_rate probability for the egg laid by a cuckoo to be discovered by the host bird. It

should be between 0 and 1. Default is 0.25.

step\_size step size of the Levy flight. Default is 1.0.

#### Value

config\_cs returns an object of class CSConfig.

# References

Yang X, Deb S (2009). "Cuckoo Search via Lèvy flights." In 2009 World Congress on Nature & Biologically Inspired Computing (NaBIC). doi: 10.1109/nabic.2009.5393690.

config\_ga 9

config\_ga

Configuration object for the Genetic Algorithm

#### **Description**

Create a configuration object for the Genetic Algorithm (GA). At minimum the number of iterations (parameter iterations) and the number of chromosomes (parameter population\_size) have to be provided.

# Usage

```
config_ga(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  keep_fraction = 0.4,
  mutation_rate = 0.1
)
```

# **Arguments**

```
iterations
                  maximum number of iterations.
population_size
                  number of chromosomes.
iterations_same_cost
                  maximum number of consecutive iterations with the same (see the parameter
                  absolute_tol) best cost before ending the minimization. If NULL the minimiza-
                  tion continues for the number of iterations specified by the parameter iterations.
                  Default is NULL.
absolute_tol
                  absolute tolerance when comparing best costs from consecutive iterations. If
                  NULL the machine epsilon is used. Default is NULL.
keep_fraction
                  fraction of the population that survives for the next step of mating. Default is
                  probability of mutation. Default is 0.1.
mutation_rate
```

# Value

config\_ga returns an object of class GAConfig.

# References

Holland JH (1992). Adaptation in Natural and Artificial Systems: An Introductory Analysis with Applications to Biology, Control and Artificial Intelligence. MIT Press, Cambridge, MA, USA. ISBN 0262082136.

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config\_gsa

Configuration object for the Gravitational Search Algorithm

# **Description**

Create a configuration object for the Gravitational Search Algorithm (GSA). At minimum the number of iterations (parameter iterations) and the number of planets (parameter population\_size) have to be provided.

# Usage

```
config_gsa(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  grav = 1000,
  grav_evolution = 20
)
```

### **Arguments**

# Value

config\_gsa returns an object of class GSAConfig.

iterations. Default is 20.0.

#### References

Rashedi E, Nezamabadi-pour H, Saryazdi S (2009). "GSA: A Gravitational Search Algorithm." *Information Sciences*, **179**(13), 2232–2248. doi: 10.1016/j.ins.2009.03.004.

config\_gwo 11

config\_gwo

Configuration object for the Grey Wolf Optimizer Algorithm

# **Description**

Create a configuration object for the Grey Wolf Optimizer Algorithm (GWO). At minimum the number of iterations (parameter iterations) and the number of wolves (parameter population\_size) have to be provided.

# Usage

```
config_gwo(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL
)
```

# **Arguments**

 $\begin{array}{ccc} \text{iterations} & \text{maximum number of iterations.} \\ \text{population\_size} & \\ & \text{number of wolves.} \end{array}$ 

 $iterations\_same\_cost$ 

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

absolute\_tol

absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

# Value

config\_gwo returns an object of class GWOConfig.

### References

Mirjalili S, Mirjalili SM, Lewis A (2014). "Grey Wolf Optimizer." *Advances in Engineering Software*, **69**, 46–61. doi: 10.1016/j.advengsoft.2013.12.007.

config\_hs

Configuration object for the Harmony Search Algorithm

# Description

Create a configuration object for the Harmony Search Algorithm (HS). At minimum the number of iterations (parameter iterations) and the number of solutions in the harmony memory (parameter population\_size) have to be provided.

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#### Usage

```
config_hs(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  considering_rate = 0.5,
  adjusting_rate = 0.5,
  distance_bandwidth = 0.1
)
```

#### **Arguments**

iterations maximum number of iterations. population\_size

number of solutions in the harmony memory.

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

absolute\_tol

absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

considering\_rate

probability for each component of a newly generated solution to be recalled from the harmony memory.

adjusting\_rate probability of the pitch adjustment in case of a component recalled from the harmony memory.

distance\_bandwidth

amplitude of the random pitch adjustment.

### Value

config\_hs returns an object of class HSConfig.

### References

Lee KS, Geem ZW (2004). "A new structural optimization method based on the harmony search algorithm." *Computers & Structures*, **82**(9-10), 781–798. doi: 10.1016/j.compstruc.2004.01.002.

config\_ihs

Configuration object for the Improved Harmony Search Algorithm

# Description

Create a configuration object for the Improved Harmony Search Algorithm (IHS). At minimum the number of iterations (parameter iterations) and the number of solutions in the harmony memory (parameter population\_size) have to be provided.

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#### Usage

```
config_ihs(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  considering_rate = 0.5,
  min_adjusting_rate = 0.3,
  max_adjusting_rate = 0.99,
  min_distance_bandwidth = 1e-04,
  max_distance_bandwidth = 1
```

### **Arguments**

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

absolute\_tol absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

considering\_rate

probability for each component of a newly generated solution to be recalled from the harmony memory.

min\_adjusting\_rate

minimum value of the pitch adjustment probability.

max\_adjusting\_rate

maximum value of the pitch adjustment probability.

min\_distance\_bandwidth

minimum amplitude of the random pitch adjustment.

max\_distance\_bandwidth

maximum amplitude of the random pitch adjustment.

#### Value

config\_ihs returns an object of class IHSConfig.

# References

Mahdavi M, Fesanghary M, Damangir E (2007). "An improved harmony search algorithm for solving optimization problems." *Applied Mathematics and Computation*, **188**(2), 1567–1579. doi: 10.1016/j.amc.2006.11.033.

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config\_mfo

Configuration object for the Moth-flame Optimization Algorithm

# **Description**

Create a configuration object for the Moth-flame Optimization Algorithm (MFO). At minimum the number of iterations (parameter iterations) and the number of moths (parameter population\_size) have to be provided.

# Usage

```
config_mfo(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL
)
```

# **Arguments**

 $\begin{array}{ccc} \text{iterations} & \text{maximum number of iterations.} \\ \text{population\_size} & \\ & \text{number of moths.} \end{array}$ 

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

absolute\_tol

absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

# Value

config\_mfo returns an object of class MFOConfig.

### References

Mirjalili S (2015). "Moth-flame optimization algorithm: A novel nature-inspired heuristic paradigm." *Knowledge-Based Systems*, **89**, 228–249. doi: 10.1016/j.knosys.2015.07.006.

config\_ps

Configuration object for the Particle Swarm Algorithm

# Description

Create a configuration object for the Particle Swarm Algorithm (PS). At minimum the number of iterations (parameter iterations) and the number of particles (parameter population\_size) have to be provided.

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### Usage

```
config_ps(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  alpha_vel = 0.5,
  alpha_evolution = 1,
  cognitive = 2,
  social = 2,
  inertia = 0.9
)
```

# **Arguments**

 $\begin{array}{ll} \mbox{iterations} & \mbox{maximum number of iterations.} \\ \mbox{population\_size} & \end{array}$ 

number of particles.

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations.

Default is NULL.

absolute\_tol absolute tolerance when comparing best costs from consecutive iterations. If

NULL the machine epsilon is used. Default is NULL.

alpha\_vel maximum velocity of particles, defined as a fraction of the range on each pa-

rameter. Default is 0.5.

alpha\_evolution

parameter to control the decreasing alpha\_vel value with the iterations. Default

is 1.0 (linear).

cognitive parameter influencing the motion of the particle on the basis of distance between

its current and best positions. Default is 2.0.

social parameter influencing the motion of the particle on the basis of distance between

its current position and the best position in the swarm. Default is 2.0.

inertia parameter influencing the dependency of the velocity on its value at the previous

iteration. Default 0.9.

# Value

config\_ps returns an object of class PSConfig.

# References

Eberhart R, Kennedy J (1995). "A new optimizer using particle swarm theory." In MHS'95. Proceedings of the Sixth International Symposium on Micro Machine and Human Science, 39–43. Ieee.

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config\_sa

Configuration object for the Simulated Annealing Algorithm

### **Description**

Create a configuration object for the Simulated Annealing algorithm (SA). At minimum the number of iterations (parameter iterations) and the number of particles (parameter population\_size) have to be provided.

#### Usage

```
config_sa(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL,
  T0 = 50,
  Ns = 3,
  Nt = 3,
  c_step = 2,
  Rt = 0.85,
  Wmin = 0.25,
  Wmax = 1.25
)
```

# Arguments

iterations maximum number of iterations. population\_size

number of particles.

iterations\_same\_cost

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations.

Default is NULL.

absolute\_tol absolute tolerance when comparing best costs from consecutive iterations. If

NULL the machine epsilon is used. Default is NULL.

T0 initial temperature. Default is 50.

Ns number of iterations before changing velocity. Default is 3.

Nt number of iterations before changing the temperature. Default is 3.

c\_step parameter involved in the velocity update. Default is 2.

Rt scaling factor for the temperature. Default is 0.85.

Wmin parameter involved in the generation of the starting point. Default is 0.25.

Wmax parameter involved in the generation of the starting point. Default is 1.25.

# Value

config\_sa returns an object of class SAConfig.

config\_woa 17

#### References

Kirkpatrick S, Gelatt CD, Vecchi MP (1983). "Optimization by Simulated Annealing." *Science*, **220**(4598), 671–680. doi: 10.1126/science.220.4598.671.

config\_woa

Configuration object for the Whale Optimization Algorithm

### **Description**

Create a configuration object for the Whale Optimization Algorithm (WOA). At minimum the number of iterations (parameter iterations) and the number of whales (parameter population\_size) have to be provided.

# Usage

```
config_woa(
  iterations,
  population_size,
  iterations_same_cost = NULL,
  absolute_tol = NULL
)
```

#### **Arguments**

 $\begin{tabular}{ll} iterations & maximum number of iterations. \\ population\_size & & number of whales. \\ iterations\_same\_cost & \end{tabular}$ 

maximum number of consecutive iterations with the *same* (see the parameter absolute\_tol) best cost before ending the minimization. If NULL the minimization continues for the number of iterations specified by the parameter iterations. Default is NULL.

absolute\_tol

absolute tolerance when comparing best costs from consecutive iterations. If NULL the machine epsilon is used. Default is NULL.

### Value

config\_woa returns an object of class WOAConfig.

#### References

Mirjalili S, Lewis A (2016). "The Whale Optimization Algorithm." *Advances in Engineering Software*, **95**, 51-67. ISSN 0965-9978, doi: 10.1016/j.advengsoft.2016.01.008, https://www.sciencedirect.com/science/article/pii/S0965997816300163.

18 constraint

 ${\tt constrained\_function} \quad \textit{Constrained function for minimization}$ 

# Description

Create a constrained function for minimization.

# Usage

```
constrained_function(func, ...)
```

# **Arguments**

func original objective function.

... one or more constraints of class Constraint. See constraint.

#### Value

 $constrained\_function\ returns\ an\ object\ of\ class\ ConstrainedFunction.$ 

constraint

Constraint for minimization

# **Description**

Create a constraint function for constrained optimization. Only inequality constraints are supported.

# Usage

```
constraint(func, inequality)
```

# Arguments

func function describing the constraint.

inequality inequality type. Possible values: >, >=, <=, <.

# Value

constraint returns an object of class Constraint.

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freudenstein\_roth\_func

Freudenstein Roth Function

# Description

Implementation of 2-dimensional Freudenstein Roth function.

# Usage

freudenstein\_roth\_func(x)

# Arguments

Х

numeric or complex vector.

#### **Details**

On an 2-dimensional domain it is defined by

$$f(\vec{x}) = (x_1 - 13 + ((5 - x_2)x_2 - 2)x_2)^2 + (x_1 - 29 + ((x_2 + 1)x_2 - 14)x_2)^2$$

and is usually evaluated on  $x_i \in [-10, 10]$ , for all i = 1, 2. The function has one global minimum at  $f(\vec{x}) = 0$  for  $\vec{x} = [5, 4]$ .

# Value

The value of the function.

# References

Rao S (2019). *Engineering optimization : theory and practice*. John Wiley \& Sons, Ltd, Hoboken, NJ, USA. ISBN 978-1-119-45479-3.

G01InitPop

Data set for example G01

# Description

This data set contains the initial positions for a population of size 20 to be used with the example G01.

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get\_population

Get population positions

### **Description**

Return a data. frame with the position of all individuals in the population at the specified iteration, from an object of class OptimizationResults produced with the option save\_pop\_history set to TRUE (see MinimizerOpts).

# Usage

```
get_population(minimizer_result, iteration)
```

# **Arguments**

minimizer\_result

an object of class OptimizationResults (see OptimizationResults).

iteration

iteration number.

#### Value

An object of class data. frame.

griewank\_func

Griewank Function

# Description

Implementation of n-dimensional Griewank function.

#### Usage

```
griewank_func(x)
```

# **Arguments**

х

numeric or complex vector.

## **Details**

On an n-dimensional domain it is defined by

$$f(\vec{x}) = 1 + \sum_{i=1}^{n} \frac{x_i^2}{4000} - \prod_{i=1}^{n} \cos\left(\frac{x_i}{\sqrt{i}}\right),$$

and is usually evaluated on  $x_i \in [-600, 600]$ , for all i = 1, ..., n. The function has global minima at  $f(\vec{x}) = 0$  for  $x_i = 0$  for all i = 1, ..., n.

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#### Value

The value of the function.

# References

Griewank AO (1981). "Generalized descent for global optimization." *Journal of optimization theory and applications*, **34**(1), 11–39.

 $list\_of\_algorithms$ 

Return the list of algorithms in EmiR

# Description

Return a data. frame with the ID, description and configuration function name of all the algorithms implemented in  $\operatorname{EmiR}$ .

# Usage

```
list_of_algorithms()
```

# Value

An object of class data. frame.

 $list\_of\_functions$ 

Return the list of pre-defined functions in EmiR

# **Description**

Return a data.frame with function name, full name, and minimum and maximum number of parameters accepted for all the pre-defined functions in EmiR.

# Usage

```
list_of_functions()
```

# Value

An object of class data. frame.

22 minimize

# **Description**

Implementation of 4-dimensional Miele Cantrell Function.

# Usage

miele\_cantrell\_func(x)

### **Arguments**

Х

numeric or complex vector.

# **Details**

On an 4-dimensional domain it is defined by

$$f(\vec{x}) = (e^{-x_1} - x_2)^4 + 100(x_2 - x_3)^6 + (\tan(x_3 - x_4))^4 + x_1^8$$

and is usually evaluated on  $x_i \in [-2, 2]$ , for all i = 1, ..., 4. The function has one global minimum at  $f(\vec{x}) = 0$  for  $\vec{x} = [0, 1, 1, 1]$ .

#### Value

The value of the function.

# References

Cragg EE, Levy AV (1969). "Study on a supermemory gradient method for the minimization of functions." *Journal of Optimization Theory and Applications*, **4**(3), 191–205.

minimize

Minimize an Objective Function

# Description

Minimize (or maximize) an objective function, possibly subjected to inequality constraints, using any of the algorithms available in EmiR.

# Usage

```
minimize(algorithm_id, obj_func, parameters, config, constraints = NULL, ...)
```

MinimizerOpts 23

#### **Arguments**

config

algorithm\_id id of the algorithm to be used. See <a href="list\_of\_algorithms">list\_of\_algorithms</a> for the list of the available algorithms.

obj\_func objective function be minimized/maximized.

parameters list of parameters composing the search space for the objective function. Parme-

ters are requested to be objects of class Parameter (see parameter).

an object with the configuration parameters of the chosen algorithm. For each algorithm there is different function for the tuning of its configuration parameter, as reported in the following list:

- config\_abc configuration function for the Artificial Bee Colony Algorithm.
- config\_bat configuration function for the *Bat Algorithm*.
- config\_cs configuration function for the *Cuckoo Search Algorithm*.
- config\_ga configuration function for the *Genetic Algorithm*.
- config\_gsa configuration function for the *Gravitational Search Algorithm*.
- config\_gwo configuration function for the Grey Wolf Optimizer Algorithm.
- config\_hs configuration function for the *Harmony Search Algorithm*.
- config\_ihs configuration function for the *Improved Harmony Search Algorithm*.
- config\_mfo configuration function for the *Moth-flame Optimization Algorithm*.
- config\_ps configuration function for the *Particle Swarm Algorithm*.
- config\_sa configuration function for the *Simulated Annealing algorithm*.
- config woa configuration function for the Whale Optimization Algorithm.

constraints list of constraints. Constraints are requested to be objects of class Constraint

(see constraint).
additional options (see MinimizerOpts).

#### Value

. . .

minimize returns an object of class OptimizationResults (see OptimizationResults).

MinimizerOpts EmiR optimization options

# **Description**

A S4 class storing the options for the optimization algorithms in EmiR.

# Slots

maximize if TRUE the objective function is maximized instead of being minimized. Default is FALSE.

silent\_mode if TRUE no output to console is generated. Default is FALSE.

save\_pop\_history if TRUE the position of all individuals in the population at each iteration is stored. This is necessary for functions like plot\_population and animate\_population to work. Default is FALSE.

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constrained\_method method for constrained optimization. Possible values are:

• "PENALTY" - Penalty Method: the constrained problem is converted to an unconstrained one, by adding a *penalty function* to the objective function. The penalty function consists of a *penalty parameter* multiplied by a measure of violation of the constraints. The penalty parameter is multiplied by a scale factor (see penalty\_scale) at every iteration;

- "BARRIER" Barrier Method: the value of the objective function is set equal to an arbitrary large positive (or negative in case of maximization) number if any of the constraints is violated;
- "ACCREJ" Acceptance-Rejection method: a solution violating any of the constraints is replaced by a randomly generated new one in the feasible region. Default is "PENALTY".
- penalty\_scale scale factor for the *penalty parameter* at each iteration. It should be greater than 1. Default is 10.
- start\_penalty\_param initial value of the *penalty parameter*. It should be greater than 0. Default is 2.
- max\_penalty\_param maximum value for the *penalty parameter*. It should be greater than 0. Default is 1.e+10.
- constr\_init\_pop if TRUE the initial population is generated in the *feasible region* only. Default is TRUE

oob\_solutions strategy to treat out-of-bound solutions. Possible values are:

- "RBC" Reflective Boundary Condition: the solution is placed back inside the search
  domain at a position which is distanced from the boundary as the out-of-bound excess.
   Depending on the optimization algorithm, the velocity of the corresponding individual of
  the population could be also inverted;
- "PBC" Periodic Boundary Condition: the solution is placed back inside the search domain at a position which is distanced from the *opposite* boundary as the out-of-bound excess;
- "BAB" Back At Boundary: the solution is placed back at the boundaries for the out-ofbound dimensions;
- "DIS" Disregard the solution: the solution is replaced by a new one, which is randomly generated in the search space. Default is "DIS".
- seed seed for the internal random number generator. Accepted values are strictly positive integers. If NULL a random seed at each execution is used. Default is NULL.
- initial\_population manually specify the position of the initial population. A  $n \times d$  matrix has to be provided, where n is the population size and d is the number of parameters the objective function is minimized with respect to.

### **Description**

A S4 class storing all relevant data from an optimization with EmiR.

parameter 25

#### **Slots**

algorithm the name of the algorithm.

iterations the number of iterations.

population\_size the number of individuals in the population.

 $obj\_function$  the minimized/maximized objective function.

constraints the constraints the objective function is subjected to.

best\_cost the best value of the objective function found.

best\_parameters the parameter values for which the best cost was obtained.

parameter\_range the range on the parameters.

pop\_history list containing the positions of all individuals in the population at each iteration. The list is filled only if save\_pop\_history is TRUE in the options of the minimizer (see MinimizerOpts).

cost\_history the vector storing the best value of the objective function at each iteration.

exec\_time\_sec the execution time in seconds.

is\_maximization if TRUE the objective function has been maximized insted of being minimized.

parameter	Parameter for minimization	
-----------	----------------------------	--

### **Description**

Create a parameter the objective function is minimized with respect to.

### Usage

```
parameter(name, min_val, max_val, integer = FALSE)
```

#### **Arguments**

name	name of the parameter.
min_val	minimum value the parameter is allowed to assume during minimization.
max_val	maximum value the parameter is allowed to assume during minimization.
integer	if TRUE the parameter is constrained to be integer. Default is FALSE.

#### Value

parameter returns an object of class Parameter.

26 plot\_history

parameters

Set of parameters for minimization

# Description

Create the set of parameters the objective function is minimized with respect to. A  $2 \times n$  matrix or a  $3 \times n$  matrix, where the first row is for the lower limits, the second one is for the upper limits, and the (optional) third one is to specify if a parameter is constrained to be integer. In case the third row is not provided, all the parameters are treated as continuous. The name of each of the n parameters is automatically generated and it is of the form xi, where i=1,...,n.

### Usage

```
parameters(values)
```

# **Arguments**

values

a  $2 \times n$  matrix or a  $3 \times n$  matrix.

#### Value

parameters returns a list of objects of class Parameter.

plot\_history

Plot minimization history

# **Description**

Plot the minimization history as a function of the number of iterations.

# Usage

```
plot_history(minimizer_result, ...)
```

### **Arguments**

```
minimizer_result
an object of class OptimizationResults (see OptimizationResults).
... additional arguments, such as graphical parameters (see plot).
```

plot\_population 27

plot\_population

Plot the population position

### **Description**

Plot the position of all individuals in the population, at a given iteration, for 1D and 2D functions. The plot can be produced only if save\_pop\_history is TRUE in the options of the minimizer (see MinimizerOpts).

# Usage

```
plot_population(minimizer_result, iteration, n_points = 100)
```

# **Arguments**

minimizer\_result

an object of class OptimizationResults (see OptimizationResults).

iteration iteration at which the population is plotted.

n\_points number of points per dimention used to draw the objective function. Default is

100.

rastrigin\_func

Rastrigin Function

# Description

Implementation of n-dimensional Rastrigin function.

# Usage

```
rastrigin_func(x)
```

# **Arguments**

Χ

numeric or complex vector.

## **Details**

On an n-dimensional domain it is defined by:

$$f(\vec{x}) = 20n + \sum_{i=1}^{n} (x_i^2 - 20\cos(2\pi x_i)),$$

and is usually evaluated on  $x_i \in [-5.12, 5.12]$ , for all i = 1, ..., n. The function has one global minimum at  $f(\vec{x}) = 0$  for  $x_i = 0$  for all i = 1, ..., n.

#### Value

The value of the function.

28 rosenbrock\_func

#### References

Rastrigin LA (1974). "Systems of extremal control." Nauka.

rosenbrock\_func

Rosenbrock Function

# Description

Implementation of n-dimensional Rosenbrock function, with  $n \geq 2$ .

# Usage

rosenbrock\_func(x)

# Arguments

Х

numeric or complex vector.

# **Details**

On an n-dimensional domain it is defined by

$$f(\vec{x}) = \sum_{i=1}^{n-1} \left[ 100(x_{i+1} - x_i^2)^2 + (x_i - 1)^2 \right],$$

and is usually evaluated on  $x_i \in [-5, 10]$ , for all i = 1, ..., n. The function has one global minimum at  $f(\vec{x}) = 0$  for  $x_i = 1$  for all i = 1, ..., n.

# Value

The value of the function.

# References

Rosenbrock HH (1960). "An Automatic Method for Finding the Greatest or Least Value of a Function." *The Computer Journal*, **3**(3), 175–184. doi: 10.1093/comjnl/3.3.175.

schwefel\_func 29

schwefel\_func

Schwefel Function

### **Description**

Implementation of n-dimensional Schwefel function.

# Usage

```
schwefel_func(x)
```

# **Arguments**

Х

numeric or complex vector.

#### **Details**

On an n-dimensional domain it is defined by

$$f(\vec{x}) = \sum_{i=1}^{n} \left[ -x_i \sin(\sqrt{|x_i|}) \right],$$

and is usually evaluated on  $x_i \in [-500, 500]$ , for all i = 1, ..., n. The function has one global minimum at  $f(\vec{x}) = -418.9829n$  for  $x_i = 420.9687$  for all i = 1, ..., n.

# Value

The value of the function.

#### References

Schwefel H (1981). Numerical optimization of computer models. John Wiley & Sons, Inc.

# Description

Implementation of n-dimensional Styblinski-Tang function.

# Usage

```
styblinski_tang_func(x)
```

# **Arguments**

Х

numeric or complex vector.

#### **Details**

On an n-dimensional domain it is defined by

$$f(\vec{x}) = \frac{1}{2} \sum_{i=1}^{n} (x_i^4 - 16x_i^2 + 5x_i),$$

and is usually evaluated on  $x_i \in [-5, 5]$ , for all i = 1, ..., n. The function has one global minimum at  $f(\vec{x}) = -39.16599n$  for  $x_i = -2.903534$  for all i = 1, ..., n.

# Value

The value of the function.

# References

Styblinski MA, Tang T (1990). "Experiments in nonconvex optimization: Stochastic approximation with function smoothing and simulated annealing." *Neural Networks*, **3**(4), 467–483. doi: 10.1016/08936080(90)90029k, https://doi.org/10.1016/0893-6080(90)90029-k.

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