

# Package ‘suropt’

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**Type** Package

**Title** Surrogate-Based Optimization

**Version** 0.1.1

**Description** Multi-Objective optimization based on surrogate models.  
Important functions: build\_surmodel, train\_hego, train\_mego, train\_sme.

**License** GPL-3

**Encoding** UTF-8

**LazyData** true

**RoxygenNote** 6.1.1

**Depends** R (>= 3.4.0)

**Imports** methods, lhs, ggplot2, dplyr, tidyr, purrr, tibble,  
DiceKriging, DiceOptim, GPareto, emoa, mco, rgenoud, pso, GenSA

**NeedsCompilation** no

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.SEL	<i>sel_funs: Selection Functions</i>
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## Description

Selection functions

## Usage

```
.SEL(x, ...)
```

```
.X(x)
```

```
## S3 method for class 'data.frame'
```

```
.X(x)
```

```
## S3 method for class 'list'
```

```
.X(x)
```

```
## Default S3 method:
```

```
.X(x, ...)
```

```
.Y(x)
```

```
## S3 method for class 'data.frame'
```

```
.Y(x)
```

```
## S3 method for class 'list'
```

```
.Y(x)
```

```
## Default S3 method:
```

```
.Y(x, ...)
```

```
.G(x)
```

```
## S3 method for class 'data.frame'
```

```
.G(x)
```

```
## S3 method for class 'list'
```

```
.G(x)
```

```
## Default S3 method:  
.G(x, ...)
```

### Arguments

x	input data to be subeseted
...	aditional parameters

---

.SET	<i>set_funs: Setting Functions</i>
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---

### Description

Seting functions

### Usage

```
.SET(x, value)  
.Y(x) <- value  
.G(x) <- value
```

### Arguments

x	input data to be subeseted
value	value to be set to x
...	aditional parameters

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build_surmodel	<i>Build an surmodel object</i>
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### Description

Build an surmodel object

### Usage

```
build_surmodel(fn, n_in, d_in, doe_type = "rlhs", sur_type = "mkm",  
pre_process = NULL, post_process = NULL)
```

**Arguments**

fn	high fidelity function (fun must return a list of vectors with the format <code>list(y = c(y1, y2, y3), g = c(g1, g2))</code> ). Alternatively, it can be a data.frame with names such as X.1, X.2, Y.1, G.1, G.2, G.3
n_in, d_in	integer number of observations and dimension of the input variables
doe_type	string that defines the doe generation scheme (list valid schemes)
sur_type	string that defines the surrogate type (list valid types)
pre_process	string vector defining the pre processing functions
post_process	string vector defining the post processing

**Value**

surrogate model

**Examples**

```
fn <- function(x) list(y = x^2)
model <- build_surmodel(fn, 20, 1)

fn <- function(x) list(y = DiceKriging::branin(x))
model <- build_surmodel(fn, 20, 2)

fn <- function(x) list(y = DiceKriging::branin(x), g = 0.2 - prod(x))
model <- build_surmodel(fn, 20, 2)

fn <- shaffer2
model <- build_surmodel(fn, 20, 1)

fn <- binh
model <- build_surmodel(fn, 20, 2)

data <- data.frame(X.1 = runif(5), X.2 = runif(5), Y.1 = runif(5))
model <- build_surmodel(data)

data <- data.frame(X.1 = runif(5), X.2 = runif(5), Y.1 = runif(5), G.1 = rnorm(5))
model <- build_surmodel(data)
```

---

get

*get: get prediction data of models*

---

**Description**

Get prediction data of models

**Usage**

```
get_feasibility(model, newdata)
```

```
get_entropy(model, newdata)
```

```
get_stats(model, newdata, slot = "all", stats = c("mean", "sd"))
```

**Arguments**

model	suropt model
newdata	input data where predictions will be done
slot	character indicating slot, must be 'y', 'g' or 'all' (default)
stats	character indicating statistics to be taken, must be one or some of 'mean', 'sd', 'lower95', 'upper95' or 'trend'

**Details**

Bla

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nowacki\_beam

*Test function: The Nowacki Beam*

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**Description**

This function is a variation of the classic multi-objective optimization problem (NOWACKI, 1980). In this problem the aim is to design a tip loaded cantilever beam for minimum cross-sectional area and lowest bending stress subject to a number of constraints.

**Usage**

```
nowacki_beam(x, g = c(5, 240, 120, 10, 2), l = 1500, F = 5000,
  E = 216620, G = 86650, v = 0.27, box = data.frame(b = c(10, 50),
  h = c(20, 250)))
```

**Arguments**

x	vector of length 2 correspond the normalized beath and height of the beam
g	vector of length 5 containing the upper limits of each constraint
l	numeric length of the beam
F	numeric force applied at the beam tip
E	numeric elastic longitudinal moduli
G	numeric elastic transversal moduli
v	numeric poisson ratio
box	data.frame structure containing the upper and lower limits for b and h

**Value**

vector of objective and constrain responses

**References**

Forrester, A., Sobester, A., & Keane, A. (2008). *Engineering design via surrogate modelling: a practical guide*. John Wiley & Sons.

**Examples**

```
nowacki_beam(c(0,0))
nowacki_beam(c(1,1))
```

---

predict,surmodel-method

*Predictor surrogate model*

---

**Description**

This functions performs predictions for an surogate model.

**Usage**

```
## S4 method for signature 'surmodel'
predict(object, newdata = NULL)
```

**Arguments**

object	An object of class surmodel
newdata	An optional vector, matrix or data.frame containing the points where to perform predictions. If not provided the predicted optima will be outputed.

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pre\_process

*Pre-Processing of models*

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**Description**

Pre-Processing of models

**Usage**

```
pre_process(data, operations = NULL, control = NULL)
```

**Arguments**

data	input data.frame
operations	string vector with the operation names in order to be applied
control	list of control parameters for the operations

**Examples**

```
fn <- binh
model <- build_surmodel(fn, 20, 2)
data <- model@data
```

---

show.surmodel	<i>Custom method for showing model objects</i>
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**Description**

Custom method for showing model objects

**Usage**

```
show.surmodel(object)
```

**Arguments**

object	surmodel object
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surmodel-class	<i>The surmodel class</i>
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**Description**

The surmodel class

**Slots**

data a data.frame with the model data  
sur a list with the surrogates  
fn a function used as high-fidelity model

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suropt	<i>suropt: Surrogate-based optimization</i>
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**Description**

suropt is a implementation of some surrogate-based single and multi-objective optimization schmes.

**Details**

The idea, is to alleviate the computational cost of optimization exploiting meta-models of the functions.

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test_functions	<i>nowacki_beam_tps' Test functions for optimization</i>
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**Description**

This page is a collection of test functions commonly used to test optimization algorithms

**Usage**

shaffer1(x)

shaffer2(x)

fonseca(x)

kursawe(x)

viennet(x)

binh(x)

**Arguments**

x,                    numeric value (or vector for multivariable functions)

**References**

[https://en.wikipedia.org/wiki/Test\\_functions\\_for\\_optimization](https://en.wikipedia.org/wiki/Test_functions_for_optimization)

<http://www.sfu.ca/~ssurjano/optimization.html>



**Examples**

```
#function should be evaluated in the  $-A < x < A$  interval,  
#where A is from 10 to  $10^5$  and  $\text{length}(x) = 1$   
shaffer1(0)  
  
#function should be evaluated in the  $-5 < x < 10$  interval  $\text{length}(x) = 1$   
shaffer2(0)  
  
#function should be evaluated in the  $-20 < x < 20$  interval and  $\text{length}(x) \geq 1$   
fonseca(rep(0,10))  
  
#function should be evaluated in the  $-5 < x < 5$  interval and  $\text{length}(x) == 3$   
kursawe(rep(0,3))  
  
#function should be evaluated in the  $-3 < x < 3$  interval and  $\text{length}(x) == 2$   
viennet(c(0.5,0.5))  
  
#function should be evaluated in the  $0 < x < (5,3)$  interval and  $\text{length}(x) == 2$   
binh(c(0,0))
```

---

train\_hego

*Trainer for a surmodel object based on the HEGO algorithm*

---

**Description**

Trainer for a surmodel object based on the HEGO algorithm

**Usage**

```
train_hego(model, niter, optimizer = "gen")
```

**Arguments**

model	surmodel object to be trained
niter	integer indicating number of iterations
optimizer	string one of: "gen" (genetic, default), "sa" (simulated annealing) or "ps" (particle swarm)

**Examples**

```
fn <- binh  
# model <- build_surmodel(fn, 5, 2) %>% train_hego(1, 'sa')
```

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train_mego	<i>Trainer for a surmodel object based on the MEGO algorithm</i>
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---

**Description**

Trainer for a surmodel object based on the MEGO algorithm

**Usage**

```
train_mego(model, niter, optimizer = "gen")
```

**Arguments**

model	surmodel object to be trained
niter	integer indicating number of iterations
optimizer	string one of: "gen" (genetic, default), "sa" (simulated annealing) or "ps" (particle swarm)

**Examples**

```
fn <- binh  
# model <- build_surmodel(fn, 5, 2) %>% train_mego(1, 'sa')
```

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train_sme	<i>Trainer for a surmodel object based on the SME algorithm</i>
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**Description**

Trainer for a surmodel object based on the SME algorithm

**Usage**

```
train_sme(model, niter, optimizer = "nsga2")
```

**Arguments**

model	surmodel object to be trained
niter	integer indicating number of iterations
optimizer	character, only working for nsga2 by now

**Examples**

```
# fn <- shaffer2
# model <- build_surmodel(fn, 10, 1) %>% train_sme(5)

# fn <- binh
# model <- build_surmodel(fn, 10, 2) %>% train_sme(5)
# suropt:::plot_predict(model)

# data <- data.frame(X.1 = runif(5), X.2 = runif(5), Y.1 = runif(5), G.1 = rnorm(5))
# x_star <- build_surmodel(data) %>% train_sme(-1)
```

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