Package 'paradox'

July 9, 2024

Type Package

Title Define and Work with Parameter Spaces for Complex Algorithms

Version 1.0.1

Description Define parameter spaces, constraints and dependencies for arbitrary algorithms, to program on such spaces. Also includes statistical designs and random samplers. Objects are implemented as 'R6' classes.

License LGPL-3

URL https://paradox.mlr-org.com, https://github.com/mlr-org/paradox

BugReports https://github.com/mlr-org/paradox/issues

Imports backports, checkmate, data.table, methods, mlr3misc (>= 0.9.4), R6

Suggests rmarkdown, mlr3learners, e1071, knitr, lhs, spacefillr, testthat

Encoding UTF-8

Config/testthat/edition 3

Config/testthat/parallel false

NeedsCompilation no

RoxygenNote 7.3.2

VignetteBuilder knitr

Collate 'Condition.R' 'Design.R' 'Domain.R' 'Domain_methods.R' 'NoDefault.R' 'ParamDbl.R' 'ParamFct.R' 'ParamInt.R' 'ParamLgl.R' 'ParamSet.R' 'ParamSetCollection.R' 'ParamUty.R' 'Sampler.R' 'Sampler1D.R' 'SamplerHierarchical.R' 'SamplerJointIndep.R' 'SamplerUnif.R' 'asserts.R' 'default_values.R' 'generate_design_grid.R' 'generate_design_lhs.R' 'generate_design_random.R' 'generate_design_sobol.R' 'helper.R' 'ps.R' 'ps_replicate.R' 'ps_union.R' 'reexports.R' 'to_tune.R' 'zzz.R'

2 Contents

Author Michel Lang [aut] (https://orcid.org/0000-0001-9754-0393),
Bernd Bischl [aut] (https://orcid.org/0000-0001-6002-6980),
Jakob Richter [aut] (https://orcid.org/0000-0003-4481-5554),
Xudong Sun [aut] (https://orcid.org/0000-0003-3269-2307),
Martin Binder [aut, cre],
Marc Becker [ctb] (<https: 0000-0002-8115-0400="" orcid.org="">)</https:>

Maintainer Martin Binder <mlr.developer@mb706.com>

Repository CRAN

Date/Publication 2024-07-09 13:10:02 UTC

Contents

Index

paradox-package
assert_param_set
condition_test
default_values
Design
Domain
generate_design_grid
generate_design_lhs
generate_design_random
generate_design_sobol
NO_DEF
ParamSet
ParamSetCollection
ps
psc
ps_replicate
ps_union
Sampler
Sampler1D
Sampler1DCateg
Sampler1DNormal
Sampler1DRfun
Sampler1DUnif
SamplerHierarchical
SamplerJointIndep
SamplerUnif
to_tune

49

paradox-package 3

paradox-package

paradox: Define and Work with Parameter Spaces for Complex Algorithms

Description

Define parameter spaces, constraints and dependencies for arbitrary algorithms, to program on such spaces. Also includes statistical designs and random samplers. Objects are implemented as 'R6' classes.

Author(s)

Maintainer: Martin Binder <mlr.developer@mb706.com>

Authors:

- Michel Lang <michellang@gmail.com> (ORCID)
- Bernd Bischl

bernd_bischl@gmx.net> (ORCID)
- Jakob Richter < jakob1richter@gmail.com> (ORCID)
- Xudong Sun <smilesun.east@gmail.com> (ORCID)

Other contributors:

• Marc Becker <marcbecker@posteo.de> (ORCID) [contributor]

See Also

Useful links:

- https://paradox.mlr-org.com
- https://github.com/mlr-org/paradox
- Report bugs at https://github.com/mlr-org/paradox/issues

assert_param_set

Assertions for Params and ParamSets

Description

Assertions for Params and ParamSets

Usage

```
assert_param_set(
  param_set,
  cl = NULL,
  no_untyped = FALSE,
  must_bounded = FALSE,
  no_deps = FALSE
)
```

4 condition_test

Arguments

no_untyped (logical(1))

Are untyped Domains allowed?

must_bounded (logical(1))

Only bounded Domains allowed?

no_deps (logical(1))

Are dependencies allowed?

Value

The checked object, invisibly.

condition_test

Dependency Condition

Description

Condition object, to specify the condition in a dependency.

Usage

```
condition_test(cond, x)
condition_as_string(cond, lhs_chr = "x")
Condition(rhs, condition_format_string)
```

Arguments

cond (Condition)

Condition to use

x (any)

Value to test

lhs_chr (character(1))

Symbolic representation to use for <1hs> in the returned string.

rhs (any)

Right-hand-side of the condition.

condition_format_string

(character(1))

Format-string for representing the condition when pretty-printing in condition_as_string().

Should contain two %s, as it is used in an sprintf()-call with two further string

values.

default_values 5

Functions

• condition_test(): Used internally. Tests whether a value satisfies a given condition. Vectorizes when x is atomic.

• condition_as_string(): Used internally. Returns a string that represents the condition for pretty printing, in the form "<lhs> <relation> <rhs>", e.g. "x == 3" or "param %in% {1, 2, 10}".

Currently implemented simple conditions

- CondEqual(rhs)
 Value must be equal to rhs.
- CondAnyOf(rhs)
 Value must be any value of rhs.

default_values

Extract Parameter Default Values

Description

Extract parameter default values.

Usage

```
default_values(x, ...)
## S3 method for class 'ParamSet'
default_values(x, ...)
```

Arguments

```
x (any)
Object to extract default values from.
... (any)
Additional arguments.
```

Value

```
list().
```

Design Design

Design

Design of Configurations

Description

A lightweight wrapper around a ParamSet and a data.table::data.table(), where the latter is a design of configurations produced from the former - e.g., by calling a generate_design_grid() or by sampling.

Public fields

Methods

Public methods:

```
• Design$new()
```

- Design\$format()
- Design\$print()
- Design\$transpose()
- Design\$clone()

Usage:

Design\$print(...)

Method new(): Creates a new instance of this R6 class.

```
Usage:
Design$new(param_set, data, remove_dupl)
Arguments:
param_set (ParamSet).
data (data.table::data.table())
    Stored data.
remove_dupl (logical(1))
    Remove duplicates?

Method format(): Helper for print outputs.
Usage:
Design$format(...)
Arguments:
... (ignored).
Method print(): Printer.
```

```
Arguments: . . . (ignored).
```

Method transpose(): Converts data into a list of lists of row-configurations, possibly removes NA entries of inactive parameter values due to unsatisfied dependencies, and possibly calls the trafo function of the ParamSet.

```
Usage:
Design$transpose(filter_na = TRUE, trafo = TRUE)
Arguments:
filter_na (logical(1))
    Should NA entries of inactive parameter values due to unsatisfied dependencies be removed?
trafo (logical(1))
    Should the trafo function of the ParamSet be called?
```

Method clone(): The objects of this class are cloneable with this method.

```
Usage:
Design$clone(deep = FALSE)
Arguments:
deep Whether to make a deep clone.
```

Domain

Domain: Parameter Range without an Id

Description

A Domain object is a representation of a single dimension of a ParamSet. Domain objects are used to construct ParamSets, either through the ps() short form, through the ParamSet constructor itself, or through the ParamSet\$search_space() mechanism (see to_tune()). For each of the basic parameter classes ("ParamInt", "ParamDbl", "ParamLgl", "ParamFct", and "ParamUty") there is a function constructing a Domain object (p_int(), p_dbl(), p_lgl(), p_fct(), p_uty()). They each have fitting construction arguments that control their bounds and behavior.

Domain objects are representations of parameter ranges and are intermediate objects to be used in short form constructions in to_tune() and ps(). Because of their nature, they should not be modified by the user, once constructed. The Domain object's internals are subject to change and should not be relied upon.

Usage

```
p_dbl(
  lower = -Inf,
  upper = Inf,
  special_vals = list(),
  default = NO_DEF,
  tags = character(),
```

```
tolerance = sqrt(.Machine$double.eps),
  depends = NULL,
  trafo = NULL,
  logscale = FALSE,
  init,
  aggr = NULL,
  in_tune_fn = NULL,
  disable_in_tune = NULL
)
p_fct(
  levels,
  special_vals = list(),
  default = NO_DEF,
  tags = character(),
  depends = NULL,
  trafo = NULL,
  init,
  aggr = NULL,
  in_tune_fn = NULL,
  disable_in_tune = NULL
)
p_int(
  lower = -Inf,
  upper = Inf,
  special_vals = list(),
  default = NO_DEF,
  tags = character(),
  tolerance = sqrt(.Machine$double.eps),
  depends = NULL,
  trafo = NULL,
  logscale = FALSE,
  init,
  aggr = NULL,
  in_tune_fn = NULL,
  disable_in_tune = NULL
)
p_lgl(
  special_vals = list(),
  default = NO_DEF,
  tags = character(),
  depends = NULL,
  trafo = NULL,
  init,
  aggr = NULL,
  in_tune_fn = NULL,
```

```
disable_in_tune = NULL
    )
    p_uty(
      custom_check = NULL,
      special_vals = list(),
      default = NO_DEF,
      tags = character(),
      depends = NULL,
      trafo = NULL,
      repr = substitute(default),
      init,
      aggr = NULL,
      in_tune_fn = NULL,
      disable_in_tune = NULL
    )
Arguments
    lower
                      (numeric(1))
                      Lower bound, can be -Inf.
                      (numeric(1))
    upper
                      Upper bound can be +Inf.
                      (list())
    special_vals
                      Arbitrary special values this parameter is allowed to take, to make it feasible.
                      This allows extending the domain of the parameter. Note that these values are
                      only used in feasibility checks, neither in generating designs nor sampling.
    default
                      Default value. Can be from the domain of the parameter or an element of
                      special_vals. Has value NO DEF if no default exists. NULL can be a valid de-
                      fault. The value has no effect on ParamSet$values or the behavior of ParamSet$check(),
                      $test() or $assert(). The default is intended to be used for documentation
                      purposes. '
                      (character())
    tags
                      Arbitrary tags to group and subset parameters. Some tags serve a special pur-
                        • "required" implies that the parameters has to be given when setting values
                          in ParamSet.
    tolerance
                      (numeric(1))
                      Initializes the $tolerance field that determines the
    depends
                      (call | expression)
                      An expression indicating a requirement for the parameter that will be constructed
                      from this. Can be given as an expression (using quote()), or the expression can
                      be entered directly and will be parsed using NSE (see examples). The expression
```

may be of the form <Param> == <value> or <Param> %in% <values>, which

will result in dependencies according to ParamSet\$add_dep(on = "<Param>", cond = CondEqual(<val

> or ParamSet\$add_dep(on = "<Param>", cond = CondAnyOf(<values>)), respectively (see CondEqual, CondAnyOf). The expression may also contain multiple conditions separated by &&.

trafo

(function)

Single argument function performing the transformation of a parameter. When the Domain is used to construct a ParamSet, this transformation will be applied to the corresponding parameter as part of the \$trafo function.

Note that the trafo is *not* inherited by TuneTokens! Defining a parameter with e.g. p_dbl(..., trafo = ...) will *not* automatically give the to_tune() assigned to it a transformation. trafo only makes sense for ParamSets that get used as search spaces for optimization or tuning, it is not useful when defining domains or hyperparameter ranges of learning algorithms, because these do not use trafos.

logscale

(logical(1))

Put numeric domains on a log scale. Default FALSE. Log-scale Domains represent parameter ranges where lower and upper bounds are logarithmized, and where a trafo is added that exponentiates sampled values to the original scale. This is *not* the same as setting trafo = exp, because logscale = TRUE will handle parameter bounds internally: a p_dbl(1, 10, logscale = TRUE) results in a parameter that has lower bound 0, upper bound log(10), and uses exp transformation on these. Therefore, the given bounds represent the bounds after the transformation. (see examples).

p_int() with logscale = TRUE results in a continuous parameter similar to p_dbl(), not an integer-valued parameter, with bounds log(max(lower, 0.5)) ... log(upper + 1) and a trafo similar to "as.integer(exp(x))" (with additional bounds correction). The lower bound is lifted to 0.5 if lower 0 to handle the lower == 0 case. The upper bound is increased to log(upper + 1) because the trafo would otherwise almost never generate a value of upper.

When logscale is TRUE, then upper bounds may be infinite, but lower bounds should be greater than 0 for p_dbl() or greater or equal 0 for p_int().

Note that "logscale" is *not* inherited by TuneTokens! Defining a parameter with p_dbl(... logscale = TRUE) will *not* automatically give the to_tune() assigned to it log-scale. logscale only makes sense for ParamSets that get used as search spaces for optimization or tuning, it is not useful when defining domains or hyperparameter ranges of learning algorithms, because these do not use trafos.

logscale happens on a natural (e == 2.718282...) basis. Be aware that using a different base (log10()/10[^], log2()/2[^]) is completely equivalent and does not change the values being sampled after transformation.

(any)

Initial value. When this is given, then the corresponding entry in ParamSet\$values is initialized with this value upon construction.

(function) aggr

> Default aggregation function for a parameter. Can only be given for parameters tagged with "internal_tuning". Function with one argument, which is a list of parameter values and that returns the aggregated parameter value.

in_tune_fn (function(domain, param_vals))

Function that converters a Domain object into a parameter value. Can only be

init

given for parameters tagged with "internal_tuning". This function should also assert that the parameters required to enable internal tuning for the given domain are set in param_vals (such as early_stopping_rounds for XGBoost).

disable_in_tune

(named list())

The parameter values that need to be set in the ParamSet to disable the internal tuning for the parameter. For XGBoost this would e.g. be list(early_stopping_rounds

= NULL).

levels (character|atomic|list)

Allowed categorical values of the parameter. If this is not a character, then a trafo is generated that converts the names (if not given: as.character() of the values) of the levels argument to the values. This trafo is then performed

before the function given as the trafo argument.

custom_check (function())

Custom function to check the feasibility. Function which checks the input. Must return 'TRUE' if the input is valid and a character(1) with the error message otherwise. This function should *not* throw an error. Defaults to NULL, which

means that no check is performed.

repr (language)

Symbol to use to represent the value given in default. The deparse() of this

object is used when printing the domain, in some cases.

Details

Although the levels values of a constructed p_fct() will always be character-valued, the p_fct function admits a levels argument that goes beyond this: Besides a character vector, any atomic vector or list (optionally named) may be given. (If the value is a list that is not named, the names are inferred using as.character() on the values.) The resulting Domain will correspond to a range of values given by the names of the levels argument with a trafo that maps the character names to the arbitrary values of the levels argument.

Value

A Domain object.

See Also

Other ParamSet construction helpers: ps(), to_tune()

Examples

```
params = ps(
  unbounded_integer = p_int(),
  bounded_double = p_dbl(0, 10),
  half_bounded_integer = p_dbl(1),
  half_bounded_double = p_dbl(upper = 1),
  double_with_trafo = p_dbl(-1, 1, trafo = exp),
  extra_double = p_dbl(0, 1, special_vals = list("xxx"), tags = "tagged"),
  factor_param = p_fct(c("a", "b", "c")),
```

```
factor_param_with_implicit_trafo = p_fct(list(a = 1, b = 2, c = list()))
print(params)
params$trafo(list(
  bounded_double = 1,
  double_with_trafo = 1,
  factor_param = "c",
  factor_param_with_implicit_trafo = "c"
))
# logscale:
params = ps(x = p_dbl(1, 100, logscale = TRUE))
# The ParamSet has bounds log(1) .. log(100):
print(params)
# When generating a equidistant grid, it is equidistant within log values
grid = generate_design_grid(params, 3)
print(grid)
# But the values are on a log scale with desired bounds after trafo
print(grid$transpose())
# Integer parameters with logscale are `p_dbl()`s pre-trafo
params = ps(x = p_int(0, 10, logscale = TRUE))
print(params)
grid = generate_design_grid(params, 4)
print(grid)
# ... but get transformed to integers.
print(grid$transpose())
# internal tuning
param_set = ps(
 iters = p_int(0, Inf, tags = "internal_tuning", aggr = function(x) round(mean(unlist(x))),
    in_tune_fn = function(domain, param_vals) {
      stopifnot(domain$lower <= 1)</pre>
      stopifnot(param_vals$early_stopping == TRUE)
      domain$upper
   },
    disable_in_tune = list(early_stopping = FALSE)),
  early_stopping = p_lgl()
)
param_set$set_values(
  iters = to_tune(upper = 100, internal = TRUE),
  early\_stopping = TRUE
)
param_set$convert_internal_search_space(param_set$search_space())
param_set$aggr_internal_tuned_values(
```

generate_design_grid 13

```
list(iters = list(1, 2, 3))
)

param_set$disable_internal_tuning("iters")
param_set$values$early_stopping
```

generate_design_grid Generate a Grid Design

Description

Generate a grid with a specified resolution in the parameter space. The resolution for categorical parameters is ignored, these parameters always produce a grid over all their valid levels. For number params the endpoints of the params are always included in the grid.

Usage

```
generate_design_grid(param_set, resolution = NULL, param_resolutions = NULL)
```

Arguments

Value

Design.

See Also

Other generate_design: generate_design_lhs(), generate_design_random(), generate_design_sobol()

Examples

```
pset = ps(
  ratio = p_dbl(lower = 0, upper = 1),
  letters = p_fct(levels = letters[1:3])
)
generate_design_grid(pset, 10)
```

generate_design_lhs

Description

Generate a space-filling design using Latin hypercube sampling. Dependent parameters whose constraints are unsatisfied generate NA entries in their respective columns.

Usage

```
generate_design_lhs(param_set, n, lhs_fun = NULL)
```

Arguments

```
param_set (ParamSet).

n (integer(1))
Number of points to sample.

lhs_fun (function(n, k))
Function to use to generate a LHS sample, with n samples and k values per param. LHS functions are implemented in package lhs, default is to use lhs::maximinLHS().
```

Value

Design.

See Also

Other generate_design: generate_design_grid(), generate_design_random(), generate_design_sobol()

Examples

```
pset = ps(
  ratio = p_dbl(lower = 0, upper = 1),
  letters = p_fct(levels = letters[1:3])
)

if (requireNamespace("lhs", quietly = TRUE)) {
  generate_design_lhs(pset, 10)
}
```

```
generate_design_random
```

Generate a Random Design

Description

Generates a design with randomly drawn points. Internally uses SamplerUnif, hence, also works for ParamSets with dependencies. If dependencies do not hold, values are set to NA in the resulting data.table.

Usage

```
generate_design_random(param_set, n)
```

Arguments

```
param_set (ParamSet).
n (integer(1))
Number of points to draw randomly.
```

Value

Design.

See Also

Other generate_design: generate_design_grid(), generate_design_lhs(), generate_design_sobol()

Examples

```
pset = ps(
  ratio = p_dbl(lower = 0, upper = 1),
  letters = p_fct(levels = letters[1:3])
)
generate_design_random(pset, 10)
```

generate_design_sobol Generate a Space-Filling Sobol Sequence Design

Description

Generate a space-filling design using a Sobol sequence. Dependent parameters whose constraints are unsatisfied generate NA entries in their respective columns.

```
Uses spacefillr::generate_sobol_set.
```

Note that non determinism is achieved by sampling the seed argument via sample(.Machine\integer.max, size = 1L).

NO_DEF

Usage

```
generate_design_sobol(param_set, n)
```

Arguments

```
param_set (ParamSet).

n (integer(1))
Number of points to sample.
```

Value

Design.

See Also

Other generate_design: generate_design_grid(), generate_design_lhs(), generate_design_random()

Examples

```
pset = ps(
  ratio = p_dbl(lower = 0, upper = 1),
  letters = p_fct(levels = letters[1:3])
)

if (requireNamespace("spacefillr", quietly = TRUE)) {
  generate_design_sobol(pset, 10)
}
```

NO_DEF

Extra data type for "no default value"

Description

Special new data type for no-default. Not often needed by the end-user, mainly internal.

- NO_DEF: Singleton object for type, used in Domain when no default is given.
- is_nodefault(): Is an object the 'no default' object?

ParamSet ParamSet

Description

An object representing the space of possible parametrizations of a function or another object. ParamSets are used on the side of objects being parameterized, where they function as a configuration space determining the set of possible configurations accepted by these objects. They can also be used to specify search spaces for optimization, indicating the set of legal configurations to try out. It is often convenient to generate search spaces from configuration spaces, which can be done using the \$search_space() method in combination with to_tune() / TuneToken objects.

Individual dimensions of a ParamSet are specified by Domain objects, created as p_dbl(), p_lgl() etc. The field \$values can be used to store an active configuration or to partially fix some parameters to constant values – the precise effect can be determined by the object being parameterized.

Constructing a ParamSet can be done using ParamSet\$new() in combination with a named list of Domain objects. This route is recommended when the set of dimensions (i.e. the members of this named list) is dynamically created, such as when the number of parameters is variable. ParamSets can also be created using the ps() shorthand, which is the recommended way when the set of parameters is fixed. In practice, the majority of cases where a ParamSet is created, the ps() should be used.

S3 methods and type converters

as.data.table()
 ParamSet -> data.table::data.table()
 Compact representation as datatable. Col types are:

id: characterclass: character

- lower, upper: numeric

- levels: list col, with NULL elements

- nlevels: integer valued numeric

- is_bounded: logical

- special_vals: list col of list

- default: list col

- storage_type: character

- tags: list col of character vectors

Public fields

```
assert_values (logical(1))
```

Should values be checked for validity during assignment to active binding \$values? Default is TRUE, only switch this off if you know what you are doing.

Active bindings

```
data (data.table) data.table representation of the ParamSet.
values (named list())
     Currently set / fixed parameter values. Settable, and feasibility of values will be checked when
     you set them. You do not have to set values for all parameters, but only for a subset. When
    you set values, all previously set values will be unset / removed.
tags (named list() of character())
    Can be used to group and subset parameters. Named with parameter IDs.
params (named list())
     data.table representing the combined Domain objects used to construct the ParamSet. Used
     for internal purpuses. Its use by external code is deprecated.
domains (named list of Domain) List of Domain objects that could be used to initialize this
    ParamSet.
extra_trafo (function(x, param_set))
     Transformation function. Settable. User has to pass a function(x), of the form
     (named list(), ParamSet) -> named list().
    The function is responsible to transform a feasible configuration into another encoding, before
    potentially evaluating the configuration with the target algorithm. For the output, not many
     things have to hold. It needs to have unique names, and the target algorithm has to accept the
     configuration. For convenience, the self-paramset is also passed in, if you need some info from
    it (e.g. tags). Is NULL by default, and you can set it to NULL to switch the transformation
    off.
constraint (function(x))
    Constraint function. Settable. This function must evaluate a named list() of values and
     determine whether it satisfies constraints, returning a scalar logical(1) value.
deps (data.table::data.table())
     Table has cols id (character(1)) and on (character(1)) and cond (Condition). Lists all
     (direct) dependency parents of a param, through parameter IDs. Internally created by a call to
     add_dep. Settable, if you want to remove dependencies or perform other changes.
length (integer(1))
    Number of contained parameters.
is_empty (logical(1))
    Is the ParamSet empty? Named with parameter IDs.
has_trafo (logical(1))
     Whether a trafo function is present, in parameters or in extra_trafo.
has_extra_trafo (logical(1))
     Whether extra_trafo is set.
has_deps (logical(1))
     Whether the parameter dependencies are present
has_constraint (logical(1))
     Whether parameter constraint is set.
all_numeric (logical(1))
```

Is TRUE if all parameters are p_dbl() or p_int().

```
all_categorical (logical(1))
     Is TRUE if all parameters are p_fct() and p_lgl().
all_bounded (logical(1))
    Is TRUE if all parameters are bounded.
class (named character())
    Classes of contained parameters. Named with parameter IDs.
lower (named double())
     Lower bounds of numeric parameters (NA for non-numerics). Named with parameter IDs.
upper (named double())
     Upper bounds of numeric parameters (NA for non-numerics). Named with parameter IDs.
levels (named list() of character)
     Allowed levels of categorical parameters (NULL for non-categoricals). Named with parameter
storage_type (character())
    Data types of parameters when stored in tables. Named with parameter IDs.
special_vals (named list() of list())
     Special values for all parameters. Named with parameter IDs.
default (named list())
     Default values of all parameters. If no default exists, element is not present. Named with
     parameter IDs.
has_trafo_param (logical())
     Whether trafo is set for any parameter.
is_logscale (logical())
     Whether trafo was set to logscale during construction.
    Note that this only refers to the logscale flag set during construction, e.g. p_dbl(logscale
    = TRUE). If the parameter was set to logscale manually, e.g. through p_dbl(trafo = exp),
     this is_logscale will be FALSE.
nlevels (named integer())
     Number of distinct levels of parameters. Inf for double parameters or unbounded integer
    parameters. Named with param IDs.
is_number (named logical())
     Whether parameter is p_dbl() or p_int(). Named with parameter IDs.
is_categ (named logical())
     Whether parameter is p_fct() or p_lgl(). Named with parameter IDs.
is_bounded (named logical())
     Whether parameters have finite bounds. Named with parameter IDs.
```

Methods

Public methods:

- ParamSet\$new()
- ParamSet\$ids()
- ParamSet\$get_values()
- ParamSet\$set_values()

```
• ParamSet$trafo()
  • ParamSet$aggr_internal_tuned_values()
  • ParamSet$disable_internal_tuning()
  • ParamSet$convert_internal_search_space()
  • ParamSet$test_constraint()
  • ParamSet$test_constraint_dt()
  • ParamSet$check()
  • ParamSet$check_dependencies()
  • ParamSet$test()
  • ParamSet$assert()
  • ParamSet$check_dt()
  • ParamSet$test_dt()
  ParamSet$assert_dt()
  • ParamSet$qunif()
  • ParamSet$get_domain()
  • ParamSet$subset()
  • ParamSet$subspaces()
  • ParamSet$flatten()
  • ParamSet$search_space()
  ParamSet$add_dep()
  • ParamSet$format()
  • ParamSet$print()
  • ParamSet$clone()
Method new(): Creates a new instance of this R6 class.
 ParamSet$new(params = named_list(), allow_dangling_dependencies = FALSE)
 Arguments:
 params (named list())
     List of Domain, named with their respective ID.
 allow_dangling_dependencies (character(1))
     Whether dependencies depending on parameters that are not present should be allowed. A
     parameter x having depends = y == 0 if y is not present would usually throw an error, but if
     dangling dependencies are allowed, the dependency is added regardless. This is mainly for
     internal use.
Method ids(): Retrieves IDs of contained parameters based on some filter criteria selections,
NULL means no restriction. Only returns IDs of parameters that satisfy all conditions.
 Usage:
 ParamSet$ids(class = NULL, tags = NULL, any_tags = NULL)
 Arguments:
 class (character())
     Typically a subset of "ParamDbl", "ParamInt", "ParamFct", "ParamLgl", "ParamUty".
```

Other classes are possible if implemented by 3rd party packages. Return only IDs of di-

mensions with the given class.

tags (character()). Return only IDs of dimensions that have *all* tags given in this argument. any_tags (character()). Return only IDs of dimensions that have at least one of the tags given in this argument.

Returns: character().

Method get_values(): Retrieves parameter values based on some selections, NULL means no restriction and is equivalent to \$values. Only returns values of parameters that satisfy all conditions.

```
Usage:
ParamSet$get_values(
  class = NULL,
  tags = NULL,
  any_tags = NULL,
  type = "with_token",
  check_required = TRUE,
  remove_dependencies = TRUE
Arguments:
class (character()). See $ids().
tags (character()). See $ids().
any_tags (character()). See $ids().
type (character(1))
   Return values "with_token" (i.e. all values),
check_required (logical(1))
   Check if all required parameters are set?
remove_dependencies (logical(1))
   If TRUE, set values with dependencies that are not fulfilled to NULL.
Returns: Named list().
```

Method set_values(): Allows to to modify (and overwrite) or replace the parameter values. Per default already set values are being kept unless new values are being provided.

```
Usage:
ParamSet$set_values(..., .values = list(), .insert = TRUE)
Arguments:
... (any)
   Named parameter values.
.values (named list())
   Named list with parameter values. Names must not already appear in ....
.insert (logical(1))
   Whether to insert the values (old values are being kept, if not overwritten), or to replace all values. Default is TRUE.
```

Method trafo(): Perform transformation specified by the trafo of Domain objects, as well as the \$extra_trafo field.

Usage:

```
ParamSet$trafo(x, param_set = self)
 Arguments:
 x (named list() | data.frame)
     The value(s) to be transformed.
 param_set (ParamSet)
     Passed to extra_trafo(). Note that the extra_trafo of self is used, not the extra_trafo
     of the ParamSet given in the param_set argument. In almost all cases, the default param_set
     = self should be used.
Method aggr_internal_tuned_values(): Aggregate parameter values according to their ag-
gregation rules.
 Usage:
 ParamSet$aggr_internal_tuned_values(x)
 Arguments:
 x (named list() of list()s)
     The value(s) to be aggregated. Names are parameter values. The aggregation function is
     selected based on the parameter.
 Returns: (named list())
Method disable_internal_tuning(): Set the parameter values so that internal tuning for the
selected parameters is disabled.
 Usage:
 ParamSet$disable_internal_tuning(ids)
 Arguments:
 ids (character())
     The ids of the parameters for which to disable internal tuning.
 Returns: Self
Method convert_internal_search_space(): Convert all parameters from the search space
to parameter values using the transformation given by in_tune_fn.
 Usage:
 ParamSet$convert_internal_search_space(search_space)
 Arguments:
 search_space (ParamSet)
     The internal search space.
 Returns: (named list())
```

Method test_constraint(): **checkmate**-like test-function. Takes a named list. Return FALSE if the given \$constraint is not satisfied, TRUE otherwise. Note this is different from satisfying the bounds or types given by the ParamSet itself: If x does not satisfy these, an error will be thrown, given that assert_value is TRUE.

```
Usage:
ParamSet$test_constraint(x, assert_value = TRUE)
```

```
Arguments:
x (named list())
   The value to test.
assert_value (logical(1))
```

Whether to verify that x satisfies the bounds and types given by this ParamSet. Should be TRUE unless this was already checked before.

Returns: logical(1): Whether x satisfies the \$constraint.

Method test_constraint_dt(): **checkmate**-like test-function. Takes a data.table. For each row, return FALSE if the given \$constraint is not satisfied, TRUE otherwise. Note this is different from satisfying the bounds or types given by the ParamSet itself: If x does not satisfy these, an error will be thrown, given that assert_value is TRUE.

```
Usage:
```

```
ParamSet$test_constraint_dt(x, assert_value = TRUE)
Arguments:
x (data.table)
   The values to test.
assert_value (logical(1))
   Whether to verify that x satisfies the bounds and types given by this ParamSet. Sh
```

Whether to verify that x satisfies the bounds and types given by this ParamSet. Should be TRUE unless this was already checked before.

Returns: logical: For each row in x, whether it satisfies the \$constraint.

Method check(): **checkmate**-like check-function. Takes a named list. A point x is feasible, if it configures a subset of params, all individual param constraints are satisfied and all dependencies are satisfied. Params for which dependencies are not satisfied should not be part of x. Constraints and dependencies are not checked when check_strict is FALSE.

```
Usage:
```

```
ParamSet$check(xs, check_strict = TRUE, sanitize = FALSE)
Arguments:
xs (named list()).
check_strict (logical(1))
   Whether to check that constraints and dependencies are satisfied.
sanitize (logical(1))
```

Whether to move values that are slightly outside bounds to valid values. These values are accepted independent of sanitize (depending on the tolerance arguments of p_dbl() and p_int()). If sanitize is TRUE, the additional effect is that, should checks pass, the sanitized values of xs are added to the result as attribute "sanitized".

Returns: If successful TRUE, if not a string with an error message.

Method check_dependencies(): **checkmate**-like check-function. Takes a named list. Checks that all individual param dependencies are satisfied.

```
Usage:
```

```
ParamSet$check_dependencies(xs)
```

Arguments:

```
xs (named list()).
```

Returns: If successful TRUE, if not a string with an error message.

Method test(): **checkmate**-like test-function. Takes a named list. A point x is feasible, if it configures a subset of params, all individual param constraints are satisfied and all dependencies are satisfied. Params for which dependencies are not satisfied should not be part of x. Constraints and dependencies are not checked when check_strict is FALSE.

```
Usage:
ParamSet$test(xs, check_strict = TRUE)
Arguments:
xs (named list()).
check_strict (logical(1))
   Whether to check that constraints and dependencies are satisfied.
```

Returns: If successful TRUE, if not FALSE.

Method assert(): **checkmate**-like assert-function. Takes a named list. A point x is feasible, if it configures a subset of params, all individual param constraints are satisfied and all dependencies are satisfied. Params for which dependencies are not satisfied should not be part of x. Constraints and dependencies are not checked when check_strict is FALSE.

```
Usage:
ParamSet$assert(
    xs,
    check_strict = TRUE,
    .var.name = vname(xs),
    sanitize = FALSE
)

Arguments:
xs (named list()).
check_strict (logical(1))
    Whether to check that constraints and dependencies are satisfied.
.var.name (character(1))
    Name of the checked object to print in error messages.
    Defaults to the heuristic implemented in vname.
sanitize (logical(1))
```

Whether to move values that are slightly outside bounds to valid values. These values are accepted independent of sanitize (depending on the tolerance arguments of $p_dbl()$ and $p_int()$). If sanitize is TRUE, the additional effect is that xs is converted to within bounds.

Returns: If successful xs invisibly, if not an error message.

Method check_dt(): **checkmate**-like check-function. Takes a data.table::data.table where rows are points and columns are parameters. A point x is feasible, if it configures a subset of params, all individual param constraints are satisfied and all dependencies are satisfied. Params for which dependencies are not satisfied should not be part of x. Constraints and dependencies are not checked when check_strict is FALSE.

```
ParamSet$check_dt(xdt, check_strict = TRUE)
 Arguments:
 xdt (data.table::data.table | data.frame()).
 check_strict (logical(1))
     Whether to check that constraints and dependencies are satisfied.
 Returns: If successful TRUE, if not a string with the error message.
Method test_dt(): checkmate-like test-function (s. $check_dt()).
 Usage:
 ParamSet$test_dt(xdt, check_strict = TRUE)
 Arguments:
 xdt (data.table::data.table).
 check_strict (logical(1))
     Whether to check that constraints and dependencies are satisfied.
 Returns: If successful TRUE, if not FALSE.
Method assert_dt(): checkmate-like assert-function (s. $check_dt()).
 Usage:
 ParamSet$assert_dt(xdt, check_strict = TRUE, .var.name = vname(xdt))
 Arguments:
 xdt (data.table::data.table).
 check_strict (logical(1))
     Whether to check that constraints and dependencies are satisfied.
 .var.name (character(1))
     Name of the checked object to print in error messages.
     Defaults to the heuristic implemented in vname.
 Returns: If successful xs invisibly, if not, an error is generated.
Method qunif(): Map a matrix or data.frame of values between 0 and 1 to proportional
values inside the feasible intervals of individual parameters.
 Usage:
 ParamSet$qunif(x)
 Arguments:
 x (matrix | data.frame)
     Values to map. Column names must be a subset of the names of parameters.
 Returns: data.table.
Method get_domain(): get the Domain object that could be used to create a given parameter.
 ParamSet$get_domain(id)
 Arguments:
```

```
id (character(1)).
 Returns: Domain.
Method subset(): Create a new ParamSet restricted to the passed IDs.
 ParamSet$subset(
    ids,
    allow_dangling_dependencies = FALSE,
    keep\_constraint = TRUE
 )
 Arguments:
 ids (character()).
 allow_dangling_dependencies (logical(1))
     Whether to allow subsets that cut across parameter dependencies. Dependencies that point
     to dropped parameters are kept (but will be "dangling", i.e. their "on" will not be present).
 keep_constraint (logical(1))
     Whether to keep the $constraint function.
 Returns: ParamSet.
Method subspaces(): Create new one-dimensional ParamSets for each dimension.
 ParamSet$subspaces(ids = private$.params$id)
 Arguments:
 ids (character())
     IDs for which to create ParamSets. Defaults to all IDs.
 Returns: named list() of ParamSet.
Method flatten(): Create a ParamSet from this object, even if this object itself is not a
ParamSet but e.g. a ParamSetCollection.
 Usage:
 ParamSet$flatten()
Method search_space(): Construct a ParamSet to tune over. Constructed from TuneToken in
$values, see to_tune().
 ParamSet$search_space(values = self$values)
 Arguments:
 values (named list): optional named list of TuneToken objects to convert, in place of $values.
Method add_dep(): Adds a dependency to this set, so that param id now depends on param on.
 ParamSet$add_dep(id, on, cond, allow_dangling_dependencies = FALSE)
 Arguments:
```

```
id (character(1)).
       on (character(1)).
       cond (Condition).
       allow_dangling_dependencies (logical(1)): Whether to allow dependencies on parame-
           ters that are not present.
     Method format(): Helper for print outputs.
       Usage:
       ParamSet$format()
       Arguments:
       ... (ignored).
     Method print(): Printer.
       Usage:
       ParamSet$print(
        hide_cols = c("levels", "is_bounded", "special_vals", "tags", "storage_type")
       )
       Arguments:
       ... (ignored).
       hide_cols (character())
           Which fields should not be printed? Default is "levels", "is_bounded", "special_vals",
           "tags", and "storage_type".
     Method clone(): The objects of this class are cloneable with this method.
       Usage:
       ParamSet$clone(deep = FALSE)
       Arguments:
       deep Whether to make a deep clone.
Examples
    pset = ParamSet$new(
     params = list(
       d = p_dbl(lower = -5, upper = 5, default = 0, trafo = function(x) 2^x),
        f = p_fct(levels = letters[1:3])
     )
   )
    # alternative, recommended way of construction in this case since the
    # parameter list is not dynamic:
   pset = ps(
     d = p_dbl(lower = -5, upper = 5, default = 0, trafo = function(x) 2^x),
     f = p_fct(levels = letters[1:3])
   pset$check(list(d = 2.1, f = "a"))
    pset$check(list(d = 2.1, f = "d"))
```

28 ParamSetCollection

ParamSetCollection

ParamSetCollection

Description

A collection of multiple ParamSet objects.

- The collection is basically a light-weight wrapper / container around references to multiple sets.
- In order to ensure unique param names, every param in the collection is referred to with "<set_id>.<param_id>", where <set_id> is the name of the entry a given ParamSet in the named list given during construction. Parameters from ParamSet with empty (i.e. "") set_id are referenced directly. Multiple ParamSets with set_id "" can be combined, but their parameter names may not overlap to avoid name clashes.
- When you either ask for 'values' or set them, the operation is delegated to the individual, contained ParamSet references. The collection itself does not maintain a values state. This also implies that if you directly change values in one of the referenced sets, this change is reflected in the collection.
- Dependencies: It is possible to currently handle dependencies
 - regarding parameters inside of the same set in this case simply add the dependency to the set, best before adding the set to the collection
 - across sets, where a param from one set depends on the state of a param from another setin this case add call add_dep on the collection.

If you call deps on the collection, you are returned a complete table of dependencies, from sets and across sets.

Super class

```
paradox::ParamSet -> ParamSetCollection
```

Active bindings

```
deps (data.table::data.table())
```

Table has cols id (character(1)) and on (character(1)) and cond (Condition). Lists all (direct) dependency parents of a param, through parameter IDs. Internally created by a call to add_dep. Settable, if you want to remove dependencies or perform other changes.

```
extra_trafo (function(x, param_set))
```

Transformation function. Settable. User has to pass a function(x), of the form (named list(), ParamSet) -> named list().

The function is responsible to transform a feasible configuration into another encoding, before potentially evaluating the configuration with the target algorithm. For the output, not many things have to hold. It needs to have unique names, and the target algorithm has to accept the configuration. For convenience, the self-paramset is also passed in, if you need some info from it (e.g. tags). Is NULL by default, and you can set it to NULL to switch the transformation off.

ParamSetCollection 29

```
constraint (function(x))
        Constraint function. Settable. This function must evaluate a named list() of values and
        determine whether it satisfies constraints, returning a scalar logical(1) value.
    sets (named list())
        Read-only list of of ParamSets contained in this ParamSetCollection. This field provides
        direct references to the ParamSet objects.
Methods
     Public methods:
       ParamSetCollection$new()
       • ParamSetCollection$add()

    ParamSetCollection$disable_internal_tuning()

       • ParamSetCollection$convert_internal_search_space()
       • ParamSetCollection$flatten()
       • ParamSetCollection$clone()
     Method new(): Creates a new instance of this R6 class.
       Usage:
       ParamSetCollection$new(sets, tag_sets = FALSE, tag_params = FALSE)
       Arguments:
       sets (named list() of ParamSet)
          ParamSet objects are not cloned. Names are used as "set_id" for the naming scheme of
          delegated parameters.
       tag_sets (logical(1))
          Whether to add tags of the form "set_<set_id>" to each parameter originating from a
          given ParamSet given with name <set_id>.
       tag_params (logical(1))
           Whether to add tags of the form "param_<param_id>" to each parameter with original ID
          <param_id>.
     Method add(): Adds a ParamSet to this collection.
       Usage:
       ParamSetCollection$add(p, n = "", tag_sets = FALSE, tag_params = FALSE)
       Arguments:
       p (ParamSet).
       n (character(1))
          Name to use. Default "".
       tag_sets (logical(1))
```

Method disable_internal_tuning(): Set the parameter values so that internal tuning for the selected parameters is disabled.

Whether to add tags of the form "param_id>" to each parameter with original ID

Whether to add tags of the form "set_<n>" to the newly added parameters.

tag_params (logical(1))

<param_id>.

30 ps

```
Usage:
 ParamSetCollection$disable_internal_tuning(ids)
 Arguments:
 ids (character())
     The ids of the parameters for which to disable internal tuning.
Method convert_internal_search_space(): Convert all parameters from the search space
to parameter values using the transformation given by in_tune_fn.
 ParamSetCollection$convert_internal_search_space(search_space)
 Arguments:
 search_space (ParamSet)
     The internal search space.
 Returns: (named list())
Method flatten(): Create a ParamSet from this ParamSetCollection.
 Usage:
 ParamSetCollection$flatten()
Method clone(): The objects of this class are cloneable with this method.
 Usage:
 ParamSetCollection$clone(deep = FALSE)
 Arguments:
 deep Whether to make a deep clone.
```

Construct a ParamSet using Short Forms

Description

ps

The ps() short form constructor uses Domain objects (p_dbl, p_fct, ...) to construct ParamSets in a succinct and readable way.

For more specifics also see the documentation of Domain.

Usage

```
ps(
    ...,
    .extra_trafo = NULL,
    .constraint = NULL,
    .allow_dangling_dependencies = FALSE
)
```

ps 31

Arguments

... (Domain)

Named arguments of Domain objects. The ParamSet will be constructed of the given Domains, The names of the arguments will be used as \$id() in the resulting ParamSet.

.extra_trafo (function(x, param_set))

Transformation to set the resulting ParamSet's \$trafo value to. This is in addition to any trafo of Domain objects given in . . . , and will be run *after* transformations of individual parameters were performed.

.constraint (function(x))

Constraint function. When given, this function must evaluate a named list() of values and determine whether it satisfies constraints, returning a scalar logical(1) value.

 $. \verb|allow_dangling_dependencies||$

(logical)

Whether dependencies depending on parameters that are not present should be allowed. A parameter x having depends = y = 0 if y is not present in the ps() call would usually throw an error, but if dangling dependencies are allowed, the dependency is added regardless. This is usually a bad idea and mainly for internal use. Dependencies between ParamSets when using to_tune() can be realized using this.

Value

A ParamSet object.

See Also

Other ParamSet construction helpers: Domain(), to_tune()

Examples

```
pars = ps(
  a = p_{int}(0, 10),
  b = p_int(upper = 20),
  c = p_dbl(),
  e = p_fct(letters[1:3]),
  f = p_uty(custom_check = checkmate::check_function)
)
print(pars)
pars = ps(
  a = p_dbl(0, 1, trafo = exp),
  b = p_dbl(0, 1, trafo = exp),
  .extra_trafo = function(x, ps) {
   x$c <- x$a + x$b
   Х
  }
)
```

32 ps_replicate

```
# See how the addition happens after exp()ing:
pars$trafo(list(a = 0, b = 0))

pars$values = list(
    a = to_tune(ps(x = p_int(0, 1),
        .extra_trafo = function(x, param_set) list(a = x$x)
    )),
    # make 'y' depend on 'x', but they are defined in different ParamSets
    # Therefore we need to allow dangling dependencies here.
    b = to_tune(ps(y = p_int(0, 1, depends = x == 1),
        .extra_trafo = function(x, param_set) list(b = x$y),
        .allow_dangling_dependencies = TRUE
    ))
)

pars$search_space()
```

psc

Create a ParamSet Collection

Description

Creates a ParamSetCollection.

Usage

```
psc(...)
```

Arguments

... (any)

The ParamSets from which to create the collection.

ps_replicate

Create a ParamSet by Repeating a Given ParamSet

Description

Repeat a ParamSet a given number of times and thus create a larger ParamSet. By default, the resulting parameters are prefixed with the string "repX.", where Xcounts up from 1. It is also possible to tag parameters easier.

ps_replicate 33

Usage

```
ps_replicate(
   set,
   times = length(prefixes),
   prefixes = sprintf("rep%s", seq_len(times)),
   tag_sets = FALSE,
   tag_params = FALSE
)
```

Arguments

set (ParamSet)

ParamSet to use as template.

times (integer(1))

Number of times to repeat set. Should not be given if prefixes is provided.

prefixes (character)

A character vector indicating the prefixes to use for each repetition of set. If this is given, times is inferred from length(prefixes) and should not be given separately. If times is given, this defaults to "repX", with X counting up

from 1.

tag_sets (logical(1))

Whether to add a tag of the form "set_fixes[[i]]>" to each parameter

in the result, indicating the repetition each parameter belongs to.

tag_params (logical(1))

Whether to add a tag of the form "param_<id>" to each parameter in the result,

indicating the original parameter ID inside set.

Examples

```
pset = ps(
    i = p_int(),
    z = p_lgl()
)

ps_replicate(pset, 3)

ps_replicate(pset, prefixes = c("first", "last"))

pset$values = list(i = 1, z = FALSE)

psr = ps_replicate(pset, 2, tag_sets = TRUE, tag_params = TRUE)

# observe the effect of tag_sets, tag_params:
psr$tags

# note that values are repeated as well
psr$values

psr$set_values(rep1.i = 10, rep2.z = TRUE)
```

34 ps_union

```
# use `any_tags` to get subset of values.
# `any_tags = ` is preferable to `tags = `, since parameters
# could also have other tags. `tags = ` would require the
# selected params to have the given tags exclusively.
# get all values associated with the original parameter `i`
```

get all values associated with the first repetition "rep1"
psr\$get_values(any_tags = "set_rep1")

psr\$get_values(any_tags = "param_i")

ps_union

psr\$values

Create a ParamSet from a list of ParamSets

Description

This emulates ParamSetCollection\$new(sets), except that the result is a flat ParamSet, not a ParamSetCollection. The resulting object is decoupled from the input ParamSet objects: Unlike ParamSetCollection, changing \$values of the resulting object will not change the input ParamSet \$values by reference.

This emulates ParamSetCollection\$new(sets), which in particular means that the resulting ParamSet has all the Domains from the input sets, but some \$ids are changed: If the ParamSet is given in sets with a name, then the Domains will have their <id> changed to <name in "sets">.<id>.<id>.

This is also reflected in deps.

The c() operator, applied to ParamSets, is a synony for ps_union().

Usage

```
ps_union(sets, tag_sets = FALSE, tag_params = FALSE)
```

Arguments

sets (list of ParamSet)

This may be a named list, in which case non-empty names are prefixed to pa-

rameters in the corresponding ParamSet.

tag_sets (logical(1))

Whether to add tags of the form "set_<set_id>" to each parameter originating

from a given ParamSet given with name <name in "sets">.

tag_params (logical(1))

Whether to add tags of the form "param_<param_id>" to each parameter with

original ID <param_id>.

Sampler 35

Examples

```
ps1 = ps(x = p_dbl())
ps1$values = list(x = 1)
ps2 = ps(y = p_lgl())
pu = ps_union(list(ps1, ps2))
# same as:
pu = c(ps1, ps2)
pu
pu$values
pu$values$x = 2
pu$values
# p1 is unchanged:
ps1$values
# Prefixes automatically created for named elements.
# This allows repeating components.
pu2 = c(one = ps1, two = ps1, ps2)
pu2
pu2$values
```

Sampler

Sampler Class

Description

This is the abstract base class for sampling objects like Sampler1D, SamplerHierarchical or SamplerJointIndep.

Public fields

```
param_set (ParamSet)
```

Domain / support of the distribution we want to sample from.

Methods

Public methods:

- Sampler\$new()
- Sampler\$sample()
- Sampler\$format()
- Sampler\$print()

36 Sampler

• Sampler\$clone()

```
Method new(): Creates a new instance of this R6 class.
Note that this object is typically constructed via derived classes, e.g., Sampler1D.
 Usage:
 Sampler$new(param_set)
 Arguments:
 param_set (ParamSet)
     The ParamSet to associated with this Sampler.
Method sample(): Sample n values from the distribution.
 Usage:
 Sampler$sample(n)
 Arguments:
 n (integer(1)).
 Returns: Design.
Method format(): Helper for print outputs.
 Usage:
 Sampler$format(...)
 Arguments:
 ... (ignored).
Method print(): Printer.
 Usage:
 Sampler$print(...)
 Arguments:
 ... (ignored).
Method clone(): The objects of this class are cloneable with this method.
 Usage:
 Sampler$clone(deep = FALSE)
 Arguments:
 deep Whether to make a deep clone.
```

See Also

Other Sampler: Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep, SamplerUnif

Sampler1D 37

Sampler1D

Sampler1D Class

Description

1D sampler, abstract base class for Sampler like Sampler1DUnif, Sampler1DRfun, Sampler1DCateg and Sampler1DNormal.

Super class

```
paradox::Sampler -> Sampler1D
```

Active bindings

```
param (ParamSet)
```

Returns the one-dimensional ParamSet that is sampled from.

Methods

Public methods:

- Sampler1D\$new()
- Sampler1D\$clone()

Method new(): Creates a new instance of this R6 class.

Note that this object is typically constructed via derived classes, e.g., Sampler1DUnif.

Usage:

Sampler1D\$new(param)

Arguments:

param (ParamSet)

Domain / support of the distribution we want to sample from. Must be one-dimensional.

Method clone(): The objects of this class are cloneable with this method.

Usage:

Sampler1D\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep, SamplerUnif

38 Sampler1DCateg

Sampler1DCateg

Sampler1DCateg Class

Description

Sampling from a discrete distribution, for a ParamSet containing a single p_fct() or p_lgl().

Super classes

```
paradox::Sampler -> paradox::Sampler1D -> Sampler1DCateg
```

Public fields

```
prob (numeric() | NULL)
```

Numeric vector of param\$nlevels probabilities.

Methods

Public methods:

- Sampler1DCateg\$new()
- Sampler1DCateg\$clone()

Method new(): Creates a new instance of this R6 class.

```
Usage:
```

Sampler1DCateg\$new(param, prob = NULL)

Arguments:

param (ParamSet)

Domain / support of the distribution we want to sample from. Must be one-dimensional.

prob (numeric() | NULL)

Numeric vector of param\$nlevels probabilities, which is uniform by default.

Method clone(): The objects of this class are cloneable with this method.

Usage:

Sampler1DCateg\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler, Sampler1D, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep, SamplerUnif

Sampler1DNormal 39

Sampler1DNormal

Sampler1DNormal Class

Description

Normal sampling (potentially truncated) for p_dbl().

Super classes

```
paradox::Sampler->paradox::Sampler1D->paradox::Sampler1DRfun->Sampler1DNormal
```

Active bindings

```
mean (numeric(1))
     Mean parameter of the normal distribution.
sd (numeric(1))
    SD parameter of the normal distribution.
```

Methods

Public methods:

- Sampler1DNormal\$new()
- Sampler1DNormal\$clone()

```
Method new(): Creates a new instance of this R6 class.
```

```
Usage:
```

```
Sampler1DNormal$new(param, mean = NULL, sd = NULL)
```

Arguments:

```
param (ParamSet)
```

Domain / support of the distribution we want to sample from. Must be one-dimensional.

mean (numeric(1))

Mean parameter of the normal distribution. Default is mean(c(param\$lower, param\$upper).

sd (numeric(1))

SD parameter of the normal distribution. Default is (param\$upper - param\$lower)/4.

Method clone(): The objects of this class are cloneable with this method.

```
Usage:
```

```
Sampler1DNormal$clone(deep = FALSE)
```

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler1D, Sampler1DCateg, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep, SamplerUnif

40 Sampler1DRfun

Sampler1DRfun

Sampler1DRfun Class

Description

Arbitrary sampling from 1D RNG functions from R.

Super classes

```
paradox::Sampler -> paradox::Sampler1D -> Sampler1DRfun
```

Public fields

```
rfun (function())
    Random number generator function.
trunc (logical(1))
    TRUE enables naive rejection sampling, so we stay inside of [lower, upper].
```

Methods

Public methods:

- Sampler1DRfun\$new()
- Sampler1DRfun\$clone()

```
Method new(): Creates a new instance of this R6 class.
```

```
Usage:
```

Sampler1DRfun\$new(param, rfun, trunc = TRUE)

Arguments:

param (ParamSet)

Domain / support of the distribution we want to sample from. Must be one-dimensional.

rfun (function())

Random number generator function, e.g. rexp to sample from exponential distribution.

trunc (logical(1))

TRUE enables naive rejection sampling, so we stay inside of [lower, upper].

Method clone(): The objects of this class are cloneable with this method.

Usage:

Sampler1DRfun\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler, Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep, SamplerUnif

Sampler1DUnif 41

Sampler1DUnif

Sampler1DUnif Class

Description

Uniform random sampler for arbitrary (bounded) parameters.

Super classes

```
paradox::Sampler -> paradox::Sampler1D -> Sampler1DUnif
```

Methods

Public methods:

- Sampler1DUnif\$new()
- Sampler1DUnif\$clone()

Method new(): Creates a new instance of this R6 class.

Usage:

Sampler1DUnif\$new(param)

Arguments:

param (ParamSet)

Domain / support of the distribution we want to sample from. Must be one-dimensional.

Method clone(): The objects of this class are cloneable with this method.

Usage:

Sampler1DUnif\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, SamplerHierarchical, SamplerJointIndep, SamplerUnif

42 SamplerHierarchical

SamplerHierarchical SamplerHierarchical Class

Description

Hierarchical sampling for arbitrary param sets with dependencies, where the user specifies 1D samplers per param. Dependencies are topologically sorted, parameters are then sampled in topological order, and if dependencies do not hold, values are set to NA in the resulting data.table.

Super class

```
paradox::Sampler -> SamplerHierarchical
```

Public fields

```
samplers (list())
```

List of Sampler1D objects that gives a Sampler for each dimension in the param_set.

Methods

Public methods:

- SamplerHierarchical\$new()
- SamplerHierarchical\$clone()

Method new(): Creates a new instance of this R6 class.

```
Usage:
```

SamplerHierarchical\$new(param_set, samplers)

Arguments:

```
param_set (ParamSet)
```

The ParamSet to associated with this SamplerHierarchical.

```
samplers (list())
```

List of Sampler1D objects that gives a Sampler for each dimension in the param_set.

Method clone(): The objects of this class are cloneable with this method.

Usage:

SamplerHierarchical\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler, Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerJointIndep, SamplerUnif

SamplerJointIndep 43

SamplerJointIndep

SamplerJointIndep Class

Description

Create joint, independent sampler out of multiple other samplers.

Super class

```
paradox::Sampler -> SamplerJointIndep
```

Public fields

```
samplers (list())
    List of Sampler objects.
```

Methods

Public methods:

- SamplerJointIndep\$new()
- SamplerJointIndep\$clone()

Method new(): Creates a new instance of this R6 class.

```
Usage:
```

SamplerJointIndep\$new(samplers)

Arguments:

```
samplers (list())
   List of Sampler objects.
```

Method clone(): The objects of this class are cloneable with this method.

```
Usage:
```

```
SamplerJointIndep$clone(deep = FALSE)
```

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerUnif

44 SamplerUnif

SamplerUnif

SamplerUnif Class

Description

Uniform random sampling for an arbitrary (bounded) ParamSet. Constructs 1 uniform sampler per parameter, then passes them to SamplerHierarchical. Hence, also works for ParamSets sets with dependencies.

Super classes

```
paradox::Sampler -> paradox::SamplerHierarchical -> SamplerUnif
```

Methods

Public methods:

- SamplerUnif\$new()
- SamplerUnif\$clone()

Method new(): Creates a new instance of this R6 class.

```
Usage:
SamplerUnif$new(param_set)
Arguments:
```

param_set (ParamSet)

The ParamSet to associated with this SamplerUnif.

Method clone(): The objects of this class are cloneable with this method.

Usage:

SamplerUnif\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

See Also

Other Sampler: Sampler, Sampler1D, Sampler1DCateg, Sampler1DNormal, Sampler1DRfun, Sampler1DUnif, SamplerHierarchical, SamplerJointIndep

to_tune

Indicate that a Parameter Value should be Tuned

Description

to_tune() creates a TuneToken object which can be assigned to the \$values slot of a ParamSet as an alternative to a concrete value. This indicates that the value is not given directly but should be tuned using **bbotk** or **mlr3tuning**. If the thus parameterized object is invoked directly, without being wrapped by or given to a tuner, it will give an error.

The tuning range ParamSet that is constructed from the TuneToken values in a ParamSet's \$values slot can be accessed through the ParamSet\$search_space() method. This is done automatically by tuners if no tuning range is given, but it is also possible to access the \$search_space() method, modify it further, and give the modified ParamSet to a tuning function (or do anything else with it, nobody is judging you).

A TuneToken represents the range over which the parameter whose \$values slot it occupies should be tuned over. It can be constructed via the to_tune() function in one of several ways:

- to_tune(): Indicates a parameter should be tuned over its entire range. Only applies to finite parameters (i.e. discrete or bounded numeric parameters)
- to_tune(lower, upper, logscale): Indicates a numeric parameter should be tuned in the inclusive interval spanning lower to upper, possibly on a log scale if logscale is se to TRUE. All parameters are optional, and the parameter's own lower / upper bounds are used without log scale, by default. Depending on the parameter, integer (if it is a p_int()) or real values (if it is a p_dbl()) are used.

lower, upper, and logscale can be given by position, except when only one of them is given, in which case it must be named to disambiguate from the following cases.

When logscale is TRUE, then a trafo is generated automatically that transforms to the given bounds. The bounds are log()'d pre-trafo (see examples). See the logscale argument of Domain functions for more info.

Note that "logscale" is *not* inherited from the Domain that the TuneToken belongs to! Defining a parameter with p_dbl(... logscale = TRUE) will *not* automatically give the to_tune() assigned to it log-scale.

- to_tune(levels): Indicates a parameter should be tuned through the given discrete values. levels can be any named or unnamed atomic vector or list (although in the unnamed case it must be possible to construct a corresponding character vector with distinct values using as.character).
- to_tune(<Domain>): The given Domain object (constructed e.g. with p_int() or p_fct()) indicates the range which should be tuned over. The supplied trafo function is used for parameter transformation.
- to_tune(<ParamSet>): The given ParamSet is used to tune over a single dimension. This is useful for cases where a single evaluation-time parameter value (e.g. p_uty()) is constructed from multiple tuner-visible parameters (which may not be p_uty()). If not one-dimensional, the supplied ParamSet should always contain a \$extra_trafo function, which must then always return a list with a single entry.

The TuneToken object's internals are subject to change and should not be relied upon. TuneToken objects should only be constructed via to_tune(), and should only be used by giving them to \$values of a ParamSet.

Usage

```
to_tune(..., internal = !is.null(aggr), aggr = NULL)
```

Arguments

... if given, restricts the range to be tuning over, as described above.

internal (logical(1))

Whether to create an InternalTuneToken. This is only available for parameters

tagged with "internal_tuning".

aggr (function)

Function with one argument, which is a list of parameter values and returns a single aggregated value (e.g. the mean). This specifies how multiple parameter values are aggregated to form a single value in the context of internal tuning. If none specified, the default aggregation function of the parameter will be used.

Value

A TuneToken object.

See Also

Other ParamSet construction helpers: Domain(), ps()

Examples

```
params = ps(
 int = p_int(0, 10),
 int_unbounded = p_int(),
 dbl = p_dbl(0, 10),
 dbl_unbounded = p_dbl(),
 dbl_bounded_below = p_dbl(lower = 1),
 fct = p_fct(c("a", "b", "c")),
 uty1 = p_uty(),
 uty2 = p_uty(),
 uty3 = p_uty(),
 uty4 = p_uty(),
 uty5 = p_uty()
)
params$values = list(
 # tune over entire range of `int`, 0..10:
 int = to_tune(),
 # tune over 2..7:
 int_unbounded = to_tune(2, 7),
```

```
# tune on a log scale in range 1..10;
 # recognize upper bound of 10 automatically, but restrict lower bound to 1:
 dbl = to_tune(lower = 1, logscale = TRUE),
 ## This is equivalent to the following:
 # dbl = to_tune(p_dbl(log(1), log(10), trafo = exp)),
 # nothing keeps us from tuning a dbl over integer values
 dbl_unbounded = to_tune(p_int(1, 10)),
 # tune over values "a" and "b" only
 fct = to_tune(c("a", "b")),
 # tune over integers 2..8.
 # ParamUty needs type information in form of p_xxx() in to_tune.
 uty1 = to_tune(p_int(2, 8)),
 # tune uty2 like a factor, trying 1, 10, and 100:
 uty2 = to_tune(c(1, 10, 100)),
 # tune uty3 like a factor. The factor levels are the names of the list
 # ("exp", "square"), but the trafo will generate the values from the list.
 # This way you can tune an objective that has function-valued inputs.
 uty3 = to_tune(list(exp = exp, square = function(x) x^2)),
 # tune through multiple parameters. When doing this, the ParamSet in tune()
 # must have the trafo that generates a list with one element and the right
 # name:
 uty4 = to_tune(ps(
   base = p_dbl(0, 1),
   exp = p_int(0, 3),
    .extra_trafo = function(x, param_set) {
     list(uty4 = x$base ^ x$exp)
   }
 )),
 # not all values need to be tuned!
 uty5 = 100
print(params$values)
print(params$search_space())
# Change `$values` directly and generate new `$search_space()` to play around
params$values$uty3 = 8
paramsvaluesuty2 = to_tune(c(2, 4, 8))
print(params$search_space())
# Notice how `logscale` applies `log()` to lower and upper bound pre-trafo:
params = ps(x = p_dbl())
```

```
params$values$x = to_tune(1, 100, logscale = TRUE)
print(params$search_space())
grid = generate_design_grid(params$search_space(), 3)
# The grid is equidistant within log-bounds pre-trafo:
print(grid)
# But the values are on a log scale scale with desired bounds after trafo:
print(grid$transpose())
```

Index

generate_design_grid(), 6 generate_design_lhs, 13, 14, 15, 16 generate_design_random, 13, 14, 15, 16 generate_design_sobol, 13-15, 15
is_nodefault (NO_DEF), 16
lhs::maximinLHS(), 14
NO_DEF, 9, 16 NoDefault (NO_DEF), 16
p_dbl (Domain), 7 p_dbl(), 17-19, 39, 45
p_fct (Domain), 7
<pre>p_fct(), 19, 38, 45 p_int (Domain), 7 p_int(), 18, 19, 45 p_lgl (Domain), 7 p_lgl(), 17, 19, 38</pre>
p_uty (Domain), 7 p_uty(), 45
paradox (paradox-package), 3 paradox-package, 3 paradox::ParamSet, 28 paradox::Sampler, 37-44 paradox::Sampler1D, 38-41 paradox::Sampler1DRfun, 39 paradox::SamplerHierarchical, 44 ParamSet, 4, 6, 7, 9, 10, 13-16, 17, 18, 22, 26, 28-42, 44-46 ParamSetCollection, 26, 28, 32, 34 ps, 11, 30, 46 ps(), 7, 17 ps_replicate, 32 ps_union, 34 psc, 32 R6, 6, 20, 29, 36-44
Sampler, 35, <i>37–44</i>

50 INDEX

```
Sampler1D, 35, 36, 37, 38-44

Sampler1DCateg, 36, 37, 38, 39-44

Sampler1DNormal, 36-38, 39, 40-44

Sampler1DRfun, 36-39, 40, 41-44

Sampler1DUnif, 36-40, 41, 42-44

SamplerHierarchical, 35-41, 42, 43, 44

SamplerJointIndep, 35-42, 43, 44

SamplerUnif, 15, 36-43, 44

spacefillr::generate_sobol_set, 15

to_tune, 11, 31, 45

to_tune(), 7, 26, 31

TuneToken, 10, 17, 26

TuneToken (to_tune), 45
```