# Package 'nlexperiment'

September 4, 2015

Type Package
Title Exploration of NetLogo Agent Based Models
Version 0.1.3
<b>Date</b> 2015-08-19
Author Darko Bergant
Maintainer Darko Bergant <darko.bergant@gmail.com></darko.bergant@gmail.com>
BugReports https://github.com/bergant/nlexperiment/issues
<pre>URL https://github.com/bergant/nlexperiment</pre>
Description A tool for NetLogo experiment definition, exploring simulation results and model optimization. Makes it easy to turn the cycle of experiment definition, data analysis, visualisations and parameter fitting into readable and reproducible documents.
<b>Depends</b> R (>= 3.1)
License GPL-2
Imports RNetLogo, digest
Suggests knitr, dplyr, png, ggplot2, testthat, tgp  LazyData TRUE
R topics documented:
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nlexperiment-package nlexperiment: NetLogo experiments

#### **Description**

Exploration of NetLogo (Wilensky 1999) agent based models.

#### **Details**

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A tool for NetLogo experiment definition, exploring simulation results and model optimization. Makes it easy to turn the cycle of experiment definition, data analysis, visualisations and parameter fitting into readable and reproducible documents.

RNetLogo package (Thiele 2014) is used as an interface to NetLogo environment.

Functions in **nlexperiment** assume the following steps:

- Define NetLogo experiment object with parameter sets, measures and simulation options (see nl\_experiment function).
- Run experiment (see nl\_run). The result of running an experiment keeps original experiment definition along with the simulation results and makes the process of model analysis more concise and reproducible. To run the simulation in parallel working processes use the parallel attribute in nl\_run function.
- Analyse and present results of simulation(s). See nl\_get\_result for getting different data from the result and nl\_show\_step, nl\_show\_patches for pre-defined plots.
- When additional questions pop out, changes to experiment will be needed. Refine the original definition of the experiment by changing only parameter sets (nl\_set\_param\_values), set different measures (nl\_set\_measures) or set other simulation options (nl\_set\_run\_options).

#### References

Wilensky, U. (1999) NetLogo. http://ccl.northwestern.edu/netlogo/. Center for Connected Learning and Computer-Based Modeling, Northwestern University. Evanston, IL.

Thiele, J. (2014) R Marries NetLogo: Introduction to the RNetLogo Package. Journal of Statistical Software 58(2) 1-41. http://www.jstatsoft.org/v58/i02/

The ideas and principles of NetLogo experiment definition is taken from the NetLogo's Behavior Space tool http://ccl.northwestern.edu/netlogo/docs/behaviorspace.html and BehaviorSearch tool http://www.behaviorsearch.org/

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#### **Examples**

```
## Not run:
# Set the path to your NetLogo installation
nl_netlogo_path("c:/Program Files (x86)/NetLogo 5.1.0/")
# Create NetLogo experiment of Net Logo Fire model
experiment <- nl_experiment(</pre>
  model_file = "models/Sample Models/Earth Science/Fire.nlogo",
  while_condition = "any? turtles",
  repetitions = 10,
  run_measures = measures(
    percent_burned = "(burned-trees / initial-trees) * 100",
    progress = "max [pxcor] of patches with [pcolor > 0 and pcolor < 55]"</pre>
  ),
  param_values = list(
    density = seq(from = 55, to = 62, by = 1)
  )
)
# Run the experiment using multi-core processing
result <- nl_run(experiment, parallel = TRUE)</pre>
# Get observations data frame
dat <- nl_get_run_result(result)</pre>
# plot percent burned by density
library(ggplot2)
ggplot(dat, mapping = aes(x = factor(density), y = percent_burned)) +
  geom_violin()
## End(Not run)
```

nl eval run

Evaluate experiment with specific parameters

#### **Description**

Function nl\_eval\_run runs experiment as with nl\_run but requires started NetLogo instance with loaded model.

Function nl\_eval\_init starts NetLogo instance and loads the NetLogo model. When using parallel version it initializes several processes and returns cluster objects

Function nl\_eval\_close stops NetLogo instance

Function  $nl_get_eval_fun$  returns a function wich calls  $nl_eval_run$  but does not need additional parameters.

## Usage

```
nl_eval_run(param_set, experiment, criteria = NULL, print_progress = FALSE,
    call_back = NULL, parallel = FALSE, cluster = NULL,
    param_names = NULL)

nl_eval_init(experiment, parallel = FALSE, max_cores = NULL)
```

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```
nl_eval_close(parallel = FALSE, cluster = NULL)
nl_get_eval_fun(experiment, param_names, parallel = FALSE, cluster = NULL,
    criteria, call_back = NULL)
```

## **Arguments**

parameter set (a list of parameters with values) param\_set NetLogo experiment object (see nl\_experiment) experiment Which experiment evaluation criteria to be returned criteria print\_progress print evaluation progress call\_back A call-back function for tracing result in optimization processes parallel If TRUE nl\_eval\_init returns cluster object which should be passed to nl\_eval\_run and nl eval close. cluster Required for parallel execution (nl\_eval\_init returns cluster object) parameter names for parameter set param\_names If not defined all available cores are used. max\_cores

#### **Details**

Use nl\_eval\_run when parameter set depend on previous evaluation (parameter fitting / callibration / optimization methods). It can use the same experiment object as nl\_run function. Evaluation criteria should be defined. (see nl\_experiment or nl\_set\_measures).

#### **Examples**

```
## Not run:
  experiment <- nl_experiment(</pre>
   model_file = "models/Sample Models/Biology/Flocking.nlogo",
   setup_commands = c("setup", "repeat 100 [go]"),
   iterations = 5,
   param_values = list(
      world_size = 50,
      population = 80,
      vision = 6,
      min_separation = seq(from = 0, to = 4, by = 0.5),
      max_align_turn = seq(from = 0, to = 20, by = 2.5)
   ),
   mapping = c(
      min_separation = "minimum-separation",
      max_align_turn = "max-align-turn"),
   step_measures = measures(
      converged = "1 -
      (standard-deviation [dx] of turtles +
      standard-deviation [dy] of turtles) / 2",
      mean_crowding =
        "mean [count flockmates + 1] of turtles"
```

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```
eval_criteria = criteria(
      c_converged = mean(step$converged),
      c_mcrowding = mean(step$mean_crowding)
   ),
   repetitions = 10,
                                       # repeat simulations 10 times
   eval_aggregate_fun = mean,
                                       # aggregate over repetitions
   eval_mutate = criteria(
                                       # evaluation criterium
      eval_value =
        sqrt((c_mcrowding - 8)^2 + 400*(c_converged - 1)^2)
 )
library(dfoptim)
cl <- nl_eval_init(experiment, parallel = TRUE)</pre>
 trace <- nl_eval_tracer(verbose = FALSE)</pre>
 param_range <- nl_get_param_range(experiment)</pre>
 set.seed(1)
o_result <- nmkb(
  par = (param_range$upper + param_range$lower)/2,
   fn = nl_eval_run,
    experiment = experiment,
    criteria = "eval_value",
    call_back = trace$add,
    parallel = TRUE, cluster = cl,
    param_names = names(param_range$lower),
   lower = param_range$lower,
  upper = param_range$upper,
  control = list(maxfeval = 200)
nl_eval_close(parallel = TRUE, cl)
## End(Not run)
```

nl\_eval\_tracer

Iterations call-back factory

## Description

Iterations call-back factory

## Usage

```
nl_eval_tracer(verbose = TRUE)
```

#### **Arguments**

verbose

When TRUE adding new data will print the line

nl\_experiment

nl_experiment
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## Description

Use this function to create NetLogo experiment object.

## Usage

```
nl_experiment(model_file, iterations = NULL, while_condition = NULL,
  repetitions = 1, random_seed = NULL, step_measures = NULL,
  run_measures = NULL, mapping = NULL, param_values = NULL,
  agents_after = NULL, patches_after = NULL, export_view = FALSE,
  export_world = FALSE, setup_commands = "setup", go_command = "go",
  eval_criteria = NULL, eval_aggregate_fun = NULL, eval_mutate = NULL,
  data_handler = NULL)
```

## Arguments

<b>8</b>	
model_file	An absolute path to your NetLogo model file (.nlogo)
iterations	Number of iterations to run. Alternatively define while_condition to stop simulation.
while_condition	
	A string with a NetLogo conditional reporter. (for example: "ticks < 100")
repetitions	How many times to run the model with the same parameters. It is set to 1 by default. Result data sets will include run_id as additional variable to identify the specific runs. To change repetitions of existing experiment object use nl_set_run_options
random_seed	If defined, random seed will be set for each run. Note: using random seed and repetitions $> 1$ does not make sense.
step_measures	Measures per each simulation step in a named character vector. Use measures() function to construct measures in right format. To change step measures of existing experiment object use nl_set_measures
run_measures	Measures per each simulation run in a named character vector. Use measures() function to construct measures in right format. To change run measures of existing experiment object use $nl_set_measures$
mapping	Mapping between R and NetLogo parameters in named character vector. For example: $c(diffusion\_rate = "diffusion-rate", population = "population")$
param_values	A data.frame with parameter values or a list of values to be expanded to all combinations of values
agents_after	Agents reporters see nl_set_agent_reports
patches_after	Patches reporters see nl_set_agent_reports
export_view	If set to TRUE, the views will be exported to a png image files for each run (when running the experiment)
export_world	If set to TRUE, the world will be exported to a csv file for each run
setup_commands	NetLogo command strings to execute to setup the model
go_command	NetLogo command string to execute the step in the model

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#### Value

NetLogo experiment object

#### See Also

To run experiment use nl\_run. To change existing experiment object see nl\_set\_measures, nl\_set\_run\_options and nl\_set\_param\_values.

#### **Examples**

```
experiment <- nl_experiment(
  model_file = "models/Sample Models/Earth Science/Fire.nlogo",
  while_condition = "any? turtles",
  repetitions = 20,
  run_measures = measures(
    percent_burned = "(burned-trees / initial-trees) * 100",
    progress = "max [pxcor] of patches with [pcolor > 0 and pcolor < 55]"
  ),
  param_values = list(
    density = seq(from = 55, to = 62, by = 1)
  )
)</pre>
```

nl\_export\_path

Get and set export path

#### **Description**

Get and set export path

## Usage

```
nl_export_path(export_path = NULL)
```

#### **Arguments**

export\_path target folder to export files

#### **Details**

Setting export path is optional. If not set, running experiments with export options (view images and worlds) will create "export" folder in working directory. Option is defined per session.

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nl_get_param_range Get ranges of experiment par	rameter sets
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#### **Description**

Upper and lower value for each parameter in experiment parameter sets

#### Usage

```
nl_get_param_range(experiment, diff_only = TRUE, as.data.frame = FALSE)
```

#### **Arguments**

```
experiment NetLogo experiment object
diff_only Uses only non-constant parameters
as.data.frame Return in a data frame
```

#### Value

A list with lower and upper values for all parameters in experiment parameter set. When as data frame is specified a data frame with lower and upper columns.

nl\_get\_result Get observations joined with parameter values

## Description

Observations are stored in result object only with references to parameter sets (param\_set\_id). nl\_get\_result joins the data with actual parameters used for each observation.

## Usage

```
nl_get_result(result, add_parameters = TRUE, type = "run",
    sub_type = NULL, ...)

nl_get_run_result(result, add_parameters = TRUE, ...)

nl_get_step_result(result, add_parameters = TRUE, ...)

nl_get_criteria_result(result, add_parameters = TRUE, ...)
```

## **Arguments**

result	NetLogo result object
add_parameters	Add parameter values from parameter space to the results
type	Observation type: "run", "step", "criteria", "agents_after", "patches_after" See nl_run for simulations result structure.
sub_type	Observation sub-type (in case of individual agents measures the sub type is a name of the measure)
	expressions to transform resulting data frame

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nl\_import\_sliders

Import sliders from NetLogo model file

## Description

Reads NetLogo model file and parses slider section

## Usage

```
nl_import_sliders(experiment, max_values = 20)
```

#### **Arguments**

experiment NetLogo experiment object
max\_values Maximum values per parameter

## **Details**

Imports parameter names and ranges from sliders defined in NetLogo model file. Based on information from https://github.com/NetLogo/NetLogo/wiki/Model-file-format https://github.com/NetLogo/NetLogo/wiki/Widg Format

#### Value

A list with slider data, suggested parameter sets and mapping

 $nl\_netlogo\_path$ 

Get and set netlogo path

## Description

Get and set netlogo path

## Usage

```
nl_netlogo_path(nl_path = NULL)
```

## **Arguments**

nl\_path

An absolute path to your NetLogo installation On Windows, for example, something like "C:/Program Files/NetLogo 5.1.0".

nl\_param\_lhs

nl\_param\_lhs

Create parameter sets with latin hypercube sampling

#### **Description**

Parameter sets are created with 1hs function from tgp package

#### Usage

```
nl_param_lhs(n, ...)
```

#### **Arguments**

n Number of parameter sets

... Named list of parameter ranges (numeric vectors)

## **Examples**

```
experiment <- nl_experiment(</pre>
 model_file = "models/Sample Models/Biology/Flocking.nlogo",
  setup_commands = c("setup", "repeat 100 [go]"),
  iterations = 5,
  param_values = nl_param_lhs(
   n = 100,
   world_size = 50,
   population = 80,
   vision = 6,
   min_separation = c(0, 4),
   max_align_turn = c(0, 20)
  ),
  mapping = c(
   min_separation = "minimum-separation",
   max_align_turn = "max-align-turn"),
  step_measures = measures(
   converged = "1 -
    (standard-deviation [dx] of turtles +
   standard-deviation [dy] of turtles) / 2",
   mean_crowding =
      "mean [count flockmates + 1] of turtles"
  ),
  eval_criteria = criteria(
   c_converged = mean(step$converged),
   c_mcrowding = mean(step$mean_crowding)
  ),
  repetitions = 10,
                                            # repeat simulations 10 times
  random\_seed = 1:10,
  eval_aggregate_fun = mean
                                            # aggregate over repetitions
```

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nl_run	Run NetLogo experiment	

#### **Description**

Runs NetLogo model for defined every parameter and repetitions. Returns a list of data frames for each measure defined in experiment.

## Usage

```
nl_run(experiment, print_progress = FALSE, gui = FALSE, parallel = FALSE,
    max_cores = NULL)
```

## **Arguments**

experiment NetLogo experiment object

print\_progress Set to TRUE if you want to follow the progress in the console

gui Start NetLogo with GUI (by default NetLogo is run in headless mode)

parallel Runs experiment in parallel worker processes (requires parallel package)

max\_cores (optional) only relevant if parallel = TRUE. If not defined all available processors will be used

#### **Details**

Model is run for each parameter combination defined in parameter sets If repetition (defined in experiment) is greater than 1 then each run for a parameter set is repeated accordingly. Before each run the parameters are set and setup procedure(s) are called. After each run criteria function(s) are calculated (if defined)

Use parallel option if there are more than a few runs per processor core.

## Value

Returns an object of class nl\_result. It is a list containing at most the following components:

step	a data frame with observations based on temporal (step) measures. It includes at least param_set_id (id of parameter set), run_id (ID of simulation repetition), step_id (ID of simulation step), and columns named after the temporal measures	
run	a data frame with observations based on final run measures. It includes at least param_set_id (id of parameter set), run_id (ID of simulation repetition ), and columns named after the temporal measures	
agents_after	a data frame with observations based on agents after each simulation run	
agents_before		
	a data frame with observations based on agents before each simulation run	
patches_after		
	a data frame with observations based on patches after each simulation run	
patches_before		
	a data frame with observations based on patches before each simulation run	

nl\_set\_agent\_reports

criteria a data frame with values provided by criteria expressions (eval\_criteria in

experiment definition possibly aggregated by eval\_aggregate\_fun) and addi-

tional criteria defined by eval\_mutate expressions

export a filename list with reference to parameter sets and simulation repetitions

duration time spent to complete the experiment (in difftime)

experiment original NetLogo experiment object used

#### See Also

See nl\_experiment for creating NetLogo experiment object.

#### **Description**

Set reporting of variable value(s) of one or more agent(s) as a data.frame

## Usage

```
nl_set_agent_reports(experiment, agents_before = NULL, agents_after = NULL,
    patches_before = NULL, patches_after = NULL)
```

## **Arguments**

experiment NetLogo experiment object

agents\_before A list of agent reports to be accessed before each run.

agents\_after A list of agent reports to be accessed after each run.

patches\_before A list of patches reports to be accessed before each run

patches\_after A list of patches reports to be accessed after each run

#### Value

NetLogo experiment object

#### See Also

To create an experiment object use nl\_experiment

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nl_set_measures Set or change measures of existing NetLogo experiment	
---	--

## Description

Set or change measures of existing NetLogo experiment

## Usage

```
nl_set_measures(experiment, step = NULL, run = NULL, eval_criteria = NULL,
  eval_aggregate_fun = NULL, eval_mutate = NULL, as.data.frame = TRUE,
  step_transform = NULL)
```

## Arguments

experiment	NetLogo experiment object	
step	NetLogo reporters for each step (reported at every tick). A list of named character vectors. Use measures function to get the correct structure.	
run	NetLogo reporters for each run (reported at end of run). A list of named character vectors. Use measures function to get the correct structure.	
eval_criteria	A criteria calculation expressions. May use step or run data frames to calculate criteria. Elements from step should be aggregated. Must return named numeric vector.	
eval_aggregate_fun		
	Aggregate criteria. It makes sense when when repetitions > 1	
eval_mutate	Add criteria based on aggregated values	
as.data.frame	Reporting in data frame format (TRUE by default)	
step_transform	A function to transform data frame result from step reporters. When simulation has many steps and only summary data is needed, step_transform can reduce memory requirements to run experiment.	

#### **Details**

Values of experiment measures are NetLogo reporters. Names of measures will be used in the resulting data frames as column names.

## Value

NetLogo experiment object

## See Also

To create an experiment object use nl\_experiment

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nl_set_param_values	Define parameter se	ets for NetLogo	experiment
---------------------	---------------------	-----------------	------------

### **Description**

Define parameter sets for NetLogo experiment

#### Usage

```
nl_set_param_values(experiment, param_values = NULL, mapping = NULL)
```

#### **Arguments**

experiment NetLogo experiment object from nl\_experiment() function

param\_values A data.frame with parameter values or a list of values to be expanded to all

combinations of values

mapping Mapping between R and NetLogo parameters in named character vector. For

example: c(diffusion\_rate = "diffusion-rate", population = "population")

#### Value

NetLogo experiment object

#### Description

You can set basic run options when creating experiment object with nl\_experiment. To change these or add additional options use nl\_set\_run\_options

## Usage

```
nl_set_run_options(experiment, random_seed = NULL, repetitions = 1,
   max_minutes = 10, setup_commands = "setup", go_command = "go",
   data_handler = NULL)
```

#### **Arguments**

experiment	NetLogo experiment object from nl_experiment() function
random_seed	Random seed
repetitions	Number of repetitions (when random seed is not defined)
max_minutes	If max.minutes $>$ 0 the execution stops after the defined number of minutes (with an error and no return value) Default value is 10.
setup_commands	NetLogo command strings to execute to setup the model
go_command	NetLogo command string to execute the step in the model
data_handler	Function to handle observations. If handler is defined the observations will not be stored in result elements when running the experiment with 'nl_run' function.

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#### Value

NetLogo experiment object

#### **Examples**

```
experiment <- nl_experiment(
  model_file = "my_model.nlogo",
  while_condition = "any? turtles"
)

experiment <- nl_set_run_options(
  experiment,
  repetitions = 3,
  setup_commands = c("setup", "change_something")
)</pre>
```

 $nl\_show\_patches$ 

Plot multiple patches result

#### **Description**

Plot patches from simualations result

## Usage

```
nl_show_patches(result, x_param, y_param = NULL, fill = "pcolor",
  type = "patches_after", sub_type = NULL)
```

#### **Arguments**

result	NetLogo experiment result object
x_param	row parameter
y_param	column parameter
fill	variable to control the color (default is pcolor)
type	as type from nl_get_result (default is "patches_after)
sub_type	as sub_type from nl_get_result (optional - if not the first patches set)

nl\_show\_step

Plot step measure observations

#### **Description**

Plot observations for each simulation step

## Usage

```
nl_show_step(result, x = "step_id", y, color = "run_id", x_param = ".",
    y_param = ".", title = NULL, data_filter = NULL, alpha = 1)
```

print.nl\_experiment

#### **Arguments**

result	NetLogo experiment result object
х	"step_id" or measure name (as string) to choose for x axis
У	measure name as string to plot on y axis
color	by default it is based on "run_id" (simulation repetition). Change to NA to plot every repetition in black
x_param	which parameter to use for faceting horizontally
y_param	which parameter to use for faceting vertically
title	plot title
data_filter	optional subset expression (not quoted) using parameters, run_id and step_id
alpha	lines opacity

#### See Also

To get only data and create custom plots see nl\_get\_result

nl\_show\_views\_grid Show exported views images in a grid

#### **Description**

Show exported views images in a grid

## Usage

```
nl_show_views_grid(result, x_param = NULL, y_param = NULL, img_gap = 0.03)
```

## Arguments

result	Result from nl_run function
x_param	Name of parameter on x axis
y_param	Name of parameter on y axis
img_gap	A gap between the images

## **Description**

Print NetLogo experiment object

## Usage

```
## S3 method for class 'nl_experiment'
print(x, ...)
```

## Arguments

x NetLogo experiment object

... further arguments passed to or from other methods.

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