## Package: Isinglandr (via r-universe)

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Type Package

Title Landscape Construction and Simulation for Ising Networks

Version 0.1.1.9000

Description A toolbox for constructing potential landscapes for Ising networks. The parameters of the networks can be directly supplied by users or estimated by the 'IsingFit' package by van Borkulo and Epskamp (2016) <https://CRAN.R-project.org/package=IsingFit> from empirical data. The Ising model's Boltzmann distribution is preserved for the potential landscape function. The landscape functions can be used for quantifying and visualizing the stability of

network states, as well as visualizing the simulation process.

License GPL (>= 3)

URL https://sciurus365.github.io/Isinglandr/,

https://github.com/Sciurus365/Isinglandr

BugReports https://github.com/Sciurus365/Isinglandr/issues

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autolayer.stability Get ggplot2 layers of stability metrics to add to the landscape plots

## Description

Those layers can show how the stability metrics are calculated on the landscape.

## Usage

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```
## S3 method for class 'stability_2d_Isingland'
autolayer(
 object,
  point = TRUE,
 line = TRUE,
  split_value = TRUE,
  interval = TRUE,
  stability_value = TRUE,
  . . .
)
## S3 method for class 'stability_2d_Isingland_matrix'
autolayer(
 object,
  point = TRUE,
  line = TRUE,
  split_value = TRUE,
  interval = TRUE,
  stability_value = TRUE,
  . . .
)
```

## Arguments

object	A stability object calculated by calculate_stability() or calculate_stability.2d_Isingland	
point, line, split_value, interval, stability_value		
	Show those elements on the layer? Default is TRUE for all of them.	
	Not in use.	

## Value

a ggplot layer

calculate\_barrier.Isingland Calculate energy barrier for Ising landscapes

## Description

Calculate energy barrier for Ising landscapes

## Usage

```
## S3 method for class '`2d_Isingland`'
calculate_barrier(l, ...)
## S3 method for class '`2d_Isingland_matrix`'
calculate_barrier(l, ...)
## S3 method for class 'barrier_2d_Isingland'
print(x, simplify = FALSE, ...)
## S3 method for class 'barrier_2d_Isingland'
summary(object, ...)
## S3 method for class 'barrier_2d_Isingland_matrix'
summary(object, ...)
```

#### Arguments

1	$\label{eq:analytical_singland} An \mbox{ Isingland object constructed with } make_2d_I \mbox{ singland () or } make_2d_I \mbox{ singland } matrix ().$
	Not in use.
х	a result of the <i>default</i> method of summary().
simplify	Print a simplified version of the output? Default is FALSE.
object	an object for which a summary is desired.

## Value

A barrier\_Isingland object that contains the following components:

- shape A character describing the shape of the landscape.
- local\_min\_start,local\_min\_end,saddle\_point The positions of the two local minimums and the saddle point, described each by a list containing:
  - U The potential value.
  - location
    - \* x\_index The row index in get\_dist(1).
    - \* x\_value The number of active nodes.
- delta\_U\_start,delta\_U\_end The barrier heights for both sides.

## Functions

- summary(barrier\_2d\_Isingland): Return a vector of barrier heights.
- summary(barrier\_2d\_Isingland\_matrix): Return a tibble of barrier heights and conditions.

calculate\_stability Calculate the stability metrics for Ising landscapes

#### Description

The stability is calculated based on the shape of the potential landscape and the prior knowledge about the qualitatively different parts of the system. Two stability indicators are calculated separately, and their difference is used to represent a general stability of the system in favor of the first phase. Within each phase, the potential difference between the local maximum and the local minimum (if multiple minimums exist, use the one that is further from the other phase; and the local maximum should always be on the side to the other phase) is used to represent the stability of this phase.

#### Usage

```
calculate_stability(1, ...)
## S3 method for class '`2d_Isingland`'
calculate_stability(1, split_value = 0.5 * 1$Nvar, ...)
## S3 method for class '`2d_Isingland_matrix`'
calculate_stability(1, split_value = 0.5 * 1$Nvar, ...)
```

#### Arguments

1	An Isingland object constructed with make_2d_Isingland() or make_2d_Isingland_matrix().
	Not in use.
split_value	An integer to specify the number of active nodes used to split two stability
	ranges. Default is half of the number of nodes.

calculate\_stability\_se

#### Value

calculate\_stability.2d\_Isingland() Returns a calculate\_stability.2d\_Isingland project, which contains the following elements:

**dist** The distribution tibble which is the same as in the input 1.

- effective\_minindex1,effective\_maxindex1,effective\_minindex2,effective\_maxindex2 The (row)indices in dist that were used as the positions of the local minimums and maximums in two parts.
- stability1,stability2,stability\_diff The stability measures for the first (left) part, the second
   part (right), and their difference.
- calculate\_stability.2d\_Isingland\_matrix() Returns a stability\_2d\_Isingland\_matrix
   object, which is a tibble containing columns of the varying parameters and a column stability
   of the calculate\_stability.2d\_Isingland objects for each landscape.

When print()ed, a verbal description of the stability metrics is shown. Use the summary() method for a tidy version of the outputs.

calculate\_stability\_se

Calculate the standard error, confidence interval, and p-value for the stability metrics of an Ising landscape using bootstrapping

#### Description

Note that the BCa method is used for stability differences, and the percentile method is used for stability measures of individual phases because the stability measures of individual phases are highly zero-inflated and may crash the BCa estimation procedure. **The range estimation of the stability measures of individual phases should be interpreted with caution**.

#### Usage

```
calculate_stability_se(
    data,
    split_value = 0.5 * ncol(data),
    R = 1000,
    IsingFit_options = list(plot = FALSE),
    Isingland_options = list(),
    ...
)
## S3 method for class 'stability_se'
print(x, ...)
compare_stability(
    data1,
    data2,
    split_value = 0.5 * ncol(data),
    R = 1000,
```

```
IsingFit_options = list(plot = FALSE),
Isingland_options = list(),
...
)
```

#### Arguments

data	A matrix of binary data	
split_value	An integer to specify the number of active nodes used to split two stability ranges. Default is half of the number of nodes.	
R	The number of bootstrap replicates. Usually this will be a single positive integer. For importance resampling, some resamples may use one set of weights and others use a different set of weights. In this case R would be a vector of integers where each component gives the number of resamples from each of the rows of weights.	
<pre>IsingFit_options</pre>		
	Parameters passed to IsingFit::IsingFit()	
Isingland_options		
	Parameters passed to make_2d_Isingland()	
	Parameters passed to boot::boot()	
x	An object of class stability_se	
data1, data2	Two matrices of binary data	

#### Details

Use calculate\_stability\_se() for a single dataset, and use compare\_stability() for comparing the stability metrics of two groups.

If you encounter the error message "Error in if (any(ints)) out[inds[ints]] <- tstar[k[inds[ints]]] : missing value where TRUE/FALSE needed", you may need to install the patched version of the boot.pval package with pak::pkg\_install("Sciurus365/boot.pval@patch-1"). See https://github.com/mthulin/boot.pval/issues/4.

If you encounter the error message "estimated adjustment 'a' is NA", that probably means you should increase the number of bootstrap samples (R). See https://stats.stackexchange.com/ questions/37918/why-is-the-error-estimated-adjustment-a-is-na-generated-from-r-boot-package.

#### References

Puth, M.-T., Neuhäuser, M., & Ruxton, G. D. (2015). On the variety of methods for calculating confidence intervals by bootstrapping. Journal of Animal Ecology, 84(4), 892–897. https://doi.org/10.1111/1365-2656.12382 chain\_simulate\_Isingland

Make Ising chains from (a series of) Ising grid(s) and perform a chain simulation.

## Description

First specify what is the network parameter in each time points, then perform a chain simulation based on it. An Ising chain can be generated from one or more Ising grid(s) with one changing condition each.

#### Usage

```
chain_simulate_Isingland(
   Ising_chain,
   transform = FALSE,
   initial = 0,
   beta2 = NULL
)
```

make\_Ising\_chain(...)

#### Arguments

Ising_chain	An Ising_chain object generated from make_Ising_chain().
transform	By default, this function considers the Ising network to use -1 and 1 for two states. Set transform = TRUE if the Ising network uses 0 and 1 for two states, which is often the case for the Ising networks estimated using IsingFit::IsingFit().
initial	An integer indicating the initial number of active nodes for the simulation. Float numbers will be converted to an integer automatically.
beta2	The <i>beta</i> value used for simulation. By default use the same value as for land- scape construction. Manually setting this value can make the system easier or more difficult to transition to another state, but will alter the steady-state distri- bution as well.
	Ising grid(s) created by make_Ising_grid().

## Value

make\_Ising\_chain returns an Ising\_chain object, which is a tibble, and each row represents a set of parameters for an Ising network.

chain\_simulate\_Isingland returns a chain\_sim\_Isingland object, which is a tibble containing the parameters, the landscape, and the number of active nodes for each time step.

make\_2d\_Isingland

#### Description

Calculate the potential value U(n) for each system state, represented by the number of active nodes n. The potential value is determined so that the Boltzmann distribution is preserved. The Boltzmann distribution is the basis and the steady-state distribution of all dynamic methods for Ising models, including those used in IsingSampler::IsingSampler() and Glauber dynamics. This means that if you assume the real-life system has the same steady-state distribution as the Boltzmann distribution of the Ising model, then possibility that their are n active nodes in the system is proportional to  $e^{U(n)}$ . Because of this property of  $e^{U(n)}$ , it is aligned with the potential landscape definition by Wang et al. (2008) and can quantitatively represent the stability of different system states.

#### Usage

```
make_2d_Isingland(thresholds, weiadj, beta = 1, transform = FALSE)
```

#### Arguments

thresholds, weiadjThe thresholds and the weighted adjacency matrix of the Ising network. If<br/>you have an IsingFit object estimated using IsingFit::IsingFit(), you<br/>can find those two parameters in its components (<IsingFit>\$thresholds and<br/><IsingFit>\$weiadj).betaThe  $\beta$  value for calculating the Hamiltonian.transformBy default, this function considers the Ising network to use -1 and 1 for two<br/>states. Set transform = TRUE if the Ising network uses 0 and 1 for two states,<br/>which is often the case for the Ising networks estimated using IsingFit::IsingFit().

## Details

The potential function U(n) is calculated by the following equation:

$$U(n) = -\log(\sum_{v}^{a(v)=n} e^{-\beta H(v)})/\beta,$$

where v represent a specific activation state of the network, a(v) is the number of active nodes for v, and H is the Hamiltonian function for Ising networks.

#### Value

A 2d\_Isingland object that contains the following components:

- dist\_raw,dist Two tibbles containing the probability distribution and the potential values for different states.
- thresholds, weiadj, beta The parameters supplied to the function.
- Nvar The number of variables (nodes) in the Ising network.

#### References

Wang, J., Xu, L., & Wang, E. (2008). Potential landscape and flux framework of nonequilibrium networks: Robustness, dissipation, and coherence of biochemical oscillations. Proceedings of the National Academy of Sciences, 105(34), 12271-12276. https://doi.org/10.1073/pnas.0800579105 Sacha Epskamp (2020). IsingSampler: Sampling methods and distribution functions for the Ising model. R package version 0.2.1. https://CRAN.R-project.org/package=IsingSampler Glauber, R. J. (1963). Time-dependent statistics of the Ising model. Journal of Mathematical Physics, 4(2), 294-307. https://doi.org/10.1063/1.1703954

### See Also

make\_3d\_Isingland() if you have two groups of nodes that you want to count the number of active ones separately.

#### Examples

```
Nvar <- 10
m <- rep(0, Nvar)
w <- matrix(0.1, Nvar, Nvar)
diag(w) <- 0
result1 <- make_2d_Isingland(m, w)
plot(result1)</pre>
```

make\_2d\_Isingland\_matrix

Make a matrix of landscapes for multiple Ising networks

#### Description

Make multiple landscapes together for different parameters.

## Usage

```
make_2d_Isingland_matrix(Ising_grid, transform = FALSE)
```

#### Arguments

Ising_grid	Parameter values generated by make_Ising_grid().
transform	By default, this function considers the Ising network to use -1 and 1 for two
	states. Set transform = TRUE if the Ising network uses 0 and 1 for two states,
	which is often the case for the Ising networks estimated using <pre>lsingFit::IsingFit().</pre>

## Value

A 2d\_Isingland\_matrix object that contains the following components:

- dist\_raw,dist Two tibbles containing the probability distribution and the potential values for different states.
- Nvar The number of variables (nodes) in the Ising network.

## Examples

```
Nvar <- 10
m <- rep(0, Nvar)
w <- matrix(0.1, Nvar, Nvar)
diag(w) <- 0
result4 <- make_Ising_grid(
    all_thresholds(seq(-0.1, 0.1, 0.1), .f = `+`),
    whole_weiadj(seq(0.5, 1.5, 0.5)),
    m, w
) %>% make_2d_Isingland_matrix()
plot(result4)
```

make\_3d\_Isingland Make a 3D landscape for an Ising network

## Description

Similar to make\_2d\_Isingland(), but two categories of nodes can be specified so the number of active nodes can be calculated separately.

## Usage

```
make_3d_Isingland(thresholds, weiadj, x, y, beta = 1, transform = FALSE)
```

#### Arguments

thresholds, weiadj

	The thresholds and the weighted adjacency matrix of the Ising network. If you have an IsingFit object estimated using IsingFit::IsingFit(), you can find those two parameters in its components ( <isingfit>\$thresholds and <isingfit>\$weiadj).</isingfit></isingfit>
х, у	Two vectors specifying the indices or the names of the nodes for two categories. If they are character vectors, the names should match the row names of the thresholds matrix.
beta	The $\beta$ value for calculating the Hamiltonian.
transform	By default, this function considers the Ising network to use -1 and 1 for two states. Set transform = TRUE if the Ising network uses 0 and 1 for two states, which is often the case for the Ising networks estimated using IsingFit::IsingFit().

## Value

A 3d\_Isingland object that contains the following components:

- dist\_raw,dist Two tibbles containing the probability distribution and the potential values for different states.
- thresholds,weiadj,beta The parameters supplied to the function.
- Nvar The number of variables (nodes) in the Ising network.

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## make\_Ising\_grid

#### See Also

make\_2d\_Isingland() for the algorithm.

make\_Ising\_grid Make a Grid to Specify Multiple Ising Networks

#### Description

Specify one or two varying parameters for Ising networks. The output of make\_Ising\_grid() can be used to make landscapes of multiple networks.

#### Usage

```
make_Ising_grid(par1, par2 = NULL, thresholds, weiadj, beta = 1)
```

#### Arguments

par1, par2	Generated from one of single_threshold(), all_thresholds(), single_wei(), [whole_weiadj()] = NULL' if you only want to vary one parameter.	
thresholds, weiadj		
	The thresholds and the weighted adjacency matrix of the Ising network. If you have an IsingFit object estimated using IsingFit::IsingFit(), you can find those two parameters in its components ( <isingfit>\$thresholds and <isingfit>\$weiadj).</isingfit></isingfit>	
beta	The $\beta$ value for calculating the Hamiltonian.	

## Details

There are five possible ways to vary the parameters for Ising networks, corresponding to five control functions:

- single\_threshold() Vary a threshold value for a single variable.
- all\_thresholds() Vary all threshold values together.
- single\_wei() Vary a single weight value for a path between two variables.
- whole\_weiadj() Vary the whole weighted adjacency matrix.
- beta\_list() Use a list of different beta values.

See make\_Ising\_grid-control-functions for details.

#### Value

An Ising\_grid object that is based on a tibble and contains the information of all simulation conditions.

make\_Ising\_grid-control-functions

Control Functions to Specify the Varying Parameters for an Ising Grid.

## Description

Control Functions to Specify the Varying Parameters for an Ising Grid.

### Usage

```
single_threshold(pos, seq, .f = `*`)
single_wei(pos, seq, .f = `*`)
all_thresholds(seq, .f = `*`)
whole_weiadj(seq, .f = `*`)
beta_list(seq, .f = `*`)
```

#### Arguments

pos	The position of the single threshold or the weight value that should vary across Ising networks. Should be a single number for single_threshold() or a numeric vector of length 2 for single_wei().
seq	A vector that specify the values. Can be generated with base::seq().
.f	What calculation should be done for seq and the original threshold value(s) or the original weight(ed adjacency matrix)? * by default, which means the values supplied in seq will be multiplied to the original value, vector, or matrix.

## Value

An ctrl\_\* object specifying the varying parameters.

MDDNetworkEstimation data for the Ising network of major depressive disorder

## Description

Estimation data for the Ising network of major depressive disorder

## Usage

MDDConnectivity

MDDThresholds

## Format

An object of class matrix (inherits from array) with 9 rows and 9 columns.

An object of class numeric of length 9.

## Functions

- MDDConnectivity: The connectivity strength of the network, represented in a weighted adjacency matrix.
- MDDThresholds: The thresholds of the network nodes, represented in a vector.

## Source

```
https://figshare.com/projects/Major_depression_as_a_complex_dynamic_system_accepted_
for_publication_in_PLoS_ONE_/17360
```

shiny\_Isingland\_MDD A shiny app that shows the landscape for the Ising network of major depressive disorder

## Description

A shiny app that shows the landscape for the Ising network of major depressive disorder

#### Usage

```
shiny_Isingland_MDD(...)
```

## Arguments

... Not in use.

## Value

This function opens a Shiny app session without a return value.

simulate\_Isingland Simulate a 2D Ising landscape

#### Description

Perform a numeric simulation using the landscape. The simulation is performed using a similar algorithm as Glauber dynamics, that the transition possibility is determined by the difference in the potential function, and the steady-state distribution is the same as the Boltzmann distribution (if not setting beta2). Note that, the conditional transition possibility of this simulation may be different from Glauber dynamics or other simulation methods.

## Usage

```
simulate_Isingland(1, ...)
## S3 method for class '`2d_Isingland`'
simulate_Isingland(
  1,
 mode = "single",
  initial = 0,
  length = 100,
 beta2 = 1$beta,
  . . .
)
## S3 method for class '`2d_Isingland_matrix`'
simulate_Isingland(
  1,
 mode = "single",
 initial = 0,
 length = 100,
 beta2 = NULL,
  . . .
)
```

#### Arguments

1	An Isingland object constructed with make_2d_Isingland() or make_2d_Isingland_matrix().
	Not in use.
mode	One of "single", "distribution". Do you want to simulate the state of a single system stochastically or simulate the distribution of the states? "single" is used by default.
initial	An integer indicating the initial number of active nodes for the simulation. Float numbers will be converted to an integer automatically.
length	An integer indicating the simulation length.

beta2 The *beta* value used for simulation. By default use the same value as for landscape construction. Manually setting this value can make the system easier or more difficult to transition to another state, but will alter the steady-state distribution as well.

## Details

In each simulation step, the system can have one more active node, one less active node, or the same number of active nodes (if possible; so if all nodes are already active then it is not possible to have one more active node). The possibility of the three cases is determined by their potential function:

$$P(n_t = b | n_{t-1} = a) = \frac{e^{-\beta U(b)}}{\sum_{i \in \{a-1, a, a+1\}, 0 \le i \le N} e^{-\beta U(i)}}, \text{ if } b \in \{a-1, a, a+1\} \& 0 \le i \le N; 0, \text{ otherwise}, b < 0 \le i \le N; 0, \text{ otherwise}, b < 0 \le i \le N; 0, 0 \le N; 0, 0$$

where  $n_t$  is the number of active nodes at the time t, and U(n) is the potential function.

#### Value

A sim\_Isingland object with the following components:

- output A tibble of the simulation output.
- landscape The landscape object supplied to this function.
- mode A character representing the mode of the simulation.

#### Examples

```
Nvar <- 10
m <- rep(0, Nvar)
w <- matrix(0.1, Nvar, Nvar)
diag(w) <- 0
result1 <- make_2d_Isingland(m, w)
plot(result1)
set.seed(1614)
sim1 <- simulate_Isingland(result1, initial = 5)
plot(sim1)</pre>
```

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