

# Package ‘lorad’

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**Title** Lowest Radial Distance Method of Marginal Likelihood Estimation

**Version** 0.0.1.0

**Description** Estimates marginal likelihood from a posterior sample using the method described in Wang et al. (2023) <[doi:10.1093/sysbio/syad007](https://doi.org/10.1093/sysbio/syad007)>, which does not require evaluation of any additional points and requires only the log of the unnormalized posterior density for each sampled parameter vector.

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**Encoding** UTF-8

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bridgesampling (>= 1.1)

**Imports** stats

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<b>gtrigsamples</b>	<i>Sequence data used in gtrig vignette</i>
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## Description

Sequence data used in gtrig vignette

## Usage

`gtrigsamples`

## Format

**gtrigsamples:**

A data frame with 10,001 rows and 35 columns:

**Iteration** MCMC iteration

**Posterior** Log of the unnormalized posterior density

**Likelihood** Log likelihood

**Prior** Log of the prior density

**alpha** Shape parameter of the (mean=1) Gamma distribution of among-site rate heterogeneity

**edge\_length\_proportions.1.** Proportion of total tree length used by edge 1

**edge\_length\_proportions.2.** Proportion of total tree length used by edge 2

**edge\_length\_proportions.3.** Proportion of total tree length used by edge 3

**edge\_length\_proportions.4.** Proportion of total tree length used by edge 4

**edge\_length\_proportions.5.** Proportion of total tree length used by edge 5

**edge\_length\_proportions.6.** Proportion of total tree length used by edge 6

**edge\_length\_proportions.7.** Proportion of total tree length used by edge 7

**edgelens.1.** Edge length 1

**edgelens.2.** Edge length 2

**edgelens.3.** Edge length 3

**edgelens.4.** Edge length 4

**edgelens.5.** Edge length 5

**edgelens.6.** Edge length 6

**edgelens.7.** Edge length 7

**er.1.** Exchangeability parameter for A to C

**er.2.** Exchangeability parameter for A to G

**er.3.** Exchangeability parameter for A to T

**er.4.** Exchangeability parameter for C to G  
**er.5.** Exchangeability parameter for C to T  
**er.6.** Exchangeability parameter for G to T  
**pi.1.** Nucleotide relative frequency for A  
**pi.2.** Nucleotide relative frequency for C  
**pi.3.** Nucleotide relative frequency for G  
**pi.4.** Nucleotide relative frequency for t  
**pinvar** Proportion of invariable sites  
**site\_rates.1.** Rate for site category 1  
**site\_rates.2.** Rate for site category 1  
**site\_rates.3.** Rate for site category 1  
**site\_rates.4.** Rate for site category 1  
**tree\_length** Tree length (sum of all edge lengths) in substitutions per site

## Source

The program RevBayes (version 1.2.1) was used to obtain a sample from the Bayesian posterior distribution for 5 green plant rbcL sequences under a GTR+I+G model.

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k80samples

*Sequence data used in k80 vignette*

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## Description

Sequence data used in k80 vignette

## Usage

k80samples

## Format

**k80samples:**  
A data frame with 10,000 rows and 4 columns:  
**iter** Iteration  
**log.kernel** Log unnormalized posterior  
**edgelen** Edge length in substitutions per site  
**kappa** Transition transversion rate ratio

## Source

doi: [10.1093/sysbio/syad007](https://doi.org/10.1093/sysbio/syad007)

`lorad_calc_log_sum`      *Calculate a sum on log scale*

### Description

Calculates the (natural) log of a sum without leaving the log scale by factoring out the largest element.

### Usage

```
lorad_calc_log_sum(logx)
```

### Arguments

logx	Numeric vector in which elements are on log scale
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### Value

The log of the sum of the (exponentiated) elements supplied in logx

`lorad_estimate`      *Calculates the LoRaD estimate of the marginal likelihood*

### Description

Provided with a data frame containing sampled parameter vectors and a dictionary relating column names to parameter types, returns a named character vector containing the following quantities:

- logML (the estimated log marginal likelihood)
- nsamples (number of samples)
- nparams (length of each parameter vector)
- training\_frac (fraction of samples used for training)
- tsamples (number of samples used for training)
- esamples (number of samples used for estimation)
- coverage (nominal fraction of the estimation sample used)
- esamplesused (number of estimation samples actually used for estimation)
- realized\_coverage (actual fraction of estimation sample used)
- rmax (lowest radial distance: defines boundary of working parameter space)
- log\_delta (volume under the unnormalized posterior inside working parameter space)

### Usage

```
lorad_estimate(params, colspec, training_frac, training_mode, coverage)
```

## Arguments

<code>params</code>	Data frame in which rows are sample points and columns are parameters, except that last column holds the log posterior kernel
<code>colspec</code>	Named character vector associating column names in <code>params</code> with column specifications
<code>training_frac</code>	Number between 0 and 1 specifying the training fraction
<code>training_mode</code>	One of random, left, or right, specifying how training fraction is chosen
<code>coverage</code>	Number between 0 and 1 specifying fraction of training sample used to compute working parameter space

## Value

Named character vector of length 11.

## Examples

```
normals <- rnorm(1000000,0,10)
prob_normals <- dnorm(normals,0,10,log=TRUE)
proportions <- rbeta(1000000,1,2)
prob_proportions <- dbeta(proportions,1,2,log=TRUE)
lengths <- rgamma(1000000, 10, 1)
prob_lengths <- dgamma(lengths,10,1,log=TRUE)
paramsdf <- data.frame(
  normals,prob_normals,
  proportions, prob_proportions,
  lengths, prob_lengths)
columnkey <- c(
  "normals"="unconstrained",
  "prob_normals"="posterior",
  "proportions"="proportion",
  "prob_proportions"="posterior",
  "lengths"="positive",
  "prob_lengths"="posterior")
results <- lorad_estimate(paramsdf, columnkey, 0.5, 'random', 0.1)
lorad_summary(results)
```

<code>lorad_standardize</code>	<i>Transforms unconstrained parameters to have the same location and scale</i>
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## Description

Standardizes parameters that have already been transformed (if necessary) to have unconstrained support. Standardization involves subtracting the sample mean and dividing by the sample standard deviation. Assumes that the log posterior kernel (i.e. the log of the unnormalized posterior) is the last column in the supplied data frame.

**Usage**

```
lorad_standardize(df, coverage)
```

**Arguments**

<code>df</code>	Data frame containing a column for each model parameter sampled and a final column of log posterior kernel values
<code>coverage</code>	Fraction of the training sample used to compute working parameter space

**Value**

List containing the log-Jacobian of the standardization transformation, the inverse square root matrix, a vector of column means, and rmax (radial distance to furthest point in working parameter space)

**lorad\_standardize\_estimation\_sample**

*Transforms training sample using training sample means and standard deviations*

**Description**

Transforms training sample using training sample means and standard deviations

**Usage**

```
lorad_standardize_estimation_sample(standardinfo, y)
```

**Arguments**

<code>standardinfo</code>	List containing the log Jacobian of the standardization transformation, the inverse square root matrix, the column means, and rmax (the radial distance representing the edge of the working parameter space)
<code>y</code>	Data frame containing a column for each transformed model parameter in the estimation sample, with last column being the log kernel values

**Value**

A new data frame consisting of the standardized estimation sample with log kernel in last column

<code>lorad_summary</code>	<i>Summarize output from <a href="#">lorad_estimate()</a></i>
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### Description

Summarize output from [lorad\\_estimate\(\)](#)

### Usage

```
lorad_summary(results)
```

### Arguments

<code>results</code>	Named character vector returned from <a href="#">lorad_estimate()</a>
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### Value

String containing a summary of the supplied `results` object

### Examples

```
normals <- rnorm(1000000,0,10)
prob_normals <- dnorm(normals,0,10,log=TRUE)
paramsdf <- data.frame(normals,prob_normals)
columnkey <- c("normals"="unconstrained", "prob_normals"="posterior")
results <- lorad_estimate(paramsdf, columnkey, 0.5, 'left', 0.1)
lorad_summary(results)
```

<code>lorad_transform</code>	<i>Log (or log-ratio) transform parameters having constrained support</i>
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### Description

Log-transforms parameters with support (0,infinity), log-ratio transforms K-dimensional parameters with support a (K-1)-simplex, logit transforms parameters with support [0,1], and leaves unchanged parameters with unconstrained support (-infinity, infinity).

### Usage

```
lorad_transform(params, colspec)
```

### Arguments

<code>params</code>	Data frame containing a column for each model parameter sampled as well as one or more columns that, when summed, constitute the log joint posterior kernel
<code>colspec</code>	Named character vector matching each column name in <code>params</code> with a column specification

**Value**

A new data frame comprising transformed parameter values with a final column holding the log joint posterior kernel

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