

# Package ‘modelIntegration’

June 20, 2016

**Type** Package

**Title** Integration of Probability Distributions

**Version** 1.0.0

**Date** 2016-06-17

**Author** Anna Shchiptsova [aut, cre]

**Maintainer** Anna Shchiptsova <shchipts@iiasa.ac.at>

**Depends** R (>= 3.2.5)

**Description** Combination of prior distributions into an aggregated (synthetic) one. The package implements the posterior integration method, reported in Kryazhimskiy, A.V. (2013). Posterior integration of independent stochastic estimates. IIASA Interim Report. IR-13-006. For comparison, an implementation of simple averaging of the input distributions is added.

**License** MIT + file LICENSE

**LazyData** true

**RoxygenNote** 5.0.1

**Suggests** testthat, knitr, rmarkdown

**VignetteBuilder** knitr

**NeedsCompilation** no

## R topics documented:

average . . . . .	2
forest_npp . . . . .	2
forest_npp90 . . . . .	3
integrate . . . . .	4
is.distribution_table . . . . .	5
modelIntegration . . . . .	6
print.distribution_table . . . . .	7
product . . . . .	7
statistics . . . . .	8
summary.distribution_table . . . . .	9

<b>Index</b>	<b>11</b>
--------------	-----------

---

average	<i>Average distribution</i>
---------	-----------------------------

---

### Description

Combines source distributions into the resultant integrated distribution using the average of distribution probabilities. The latter one is called an *average* probability distribution.

### Usage

```
average(x, ...)
```

### Arguments

x	an R object with source distributions
...	other arguments passed to methods

### Details

The probability of the true value to be equal  $z$  is computed as  $(p1[z]+p2[z]+...+pn[z])/n$ , where  $p1...pn$  are probabilities from  $x$  and  $n$  is the number of source distributions.

### Value

A data frame with the 'table-based' distribution, where every row contains an outcome in the random variable range and its probability in the integrated distribution.

### Examples

```
# Average distribution of two 'table-based' distributions
# S3 method for class "distribution_table"
pdf1 <- c(0.25, 0.75)
pdf2 <- c(0.5, 0.5)
bins <- c(1, 2)
average(integrate(bins, list(pdf1, pdf2)))
```

---

forest_npp	<i>NPP distribution tables</i>
------------	--------------------------------

---

### Description

Probability distribution tables for net primary production (NPP) of the forest ecosystems in seven bioclimatic zones in Russia. A dataset contains distributions estimated with the landscape-ecosystem approach (LEA) and from the ensemble of dynamic global vegetation models (DGVMs).

### Usage

```
forest_npp
```

**Format**

A data frame with 1131 rows and 17 variables

- npp: NPP values
- LEA\_Tundra: LEA-based probability for the Tundra climatic zone
- LEA\_Tundra\_Northern-Taiga: LEA-based probability for the Forest tundra and Northern Taiga climatic zone
- LEA\_Middle\_Taiga: LEA-based probability for the Middle taiga climatic zone
- LEA\_Southern\_Taiga: LEA-based probability for the Southern taiga climatic zone
- LEA\_Temperate: LEA-based probability for the Temperate climatic zone
- LEA\_Steppe: LEA-based probability for the Steppe climatic zone
- LEA\_Deserts: LEA-based probability for the Semi-deserts and deserts climatic zone
- LEA\_Total: LEA-based probability taken over all climatic zones
- DGVM\_Tundra: DGVM-based probability for the Tundra climatic zone
- DGVM\_Tundra\_Northern-Taiga: DGVM-based probability for the Forest tundra and Northern Taiga climatic zone
- DGVM\_Middle\_Taiga: DGVM-based probability for the Middle taiga climatic zone
- DGVM\_Southern\_Taiga: DGVM-based probability for the Southern taiga climatic zone
- DGVM\_Temperate: DGVM-based probability for the Temperate climatic zone
- DGVM\_Steppe: DGVM-based probability for the Steppe climatic zone
- DGVM\_Deserts: DGVM-based probability for the Semi-deserts and deserts climatic zone
- DGVM\_Total: DGVM-based probability taken over all climatic zones

**References**

Kryazhimskiy, A., Rovenskaya, E., Shvidenko, A., Gusti, M. Shchepashchenko, D. & Veshchinskaya, V. (2015). Towards harmonizing competing models: Russian forests' net primary production case study. *Technological Forecasting & Social Change*, 98: 245-254.

---

forest\_npp90

*NPP distribution tables*

---

**Description**

Probability distribution tables for aggregated net primary production (NPP) of the forest ecosystems in seven bioclimatic zones in Russia. A dataset contains distributions estimated with the landscape-ecosystem approach (LEA).

**Usage**

forest\_npp90

**Format**

A data frame with 15 rows and 9 variables

- `npp`: NPP values aggregated into size classes of 90 gC/m<sup>2</sup> per year
- `LEA_Tundra`: LEA-based probability for the Tundra climatic zone
- `LEA_Tundra_Northern-Taiga`: LEA-based probability for the Forest tundra and Northern Taiga climatic zone
- `LEA_Middle-Taiga`: LEA-based probability for the Middle taiga climatic zone
- `LEA_Southern-Taiga`: LEA-based probability for the Southern taiga climatic zone
- `LEA_Temperate`: LEA-based probability for the Temperate climatic zone
- `LEA_Steppe`: LEA-based probability for the Steppe climatic zone
- `LEA_Deserts`: LEA-based probability for the Semi-deserts and deserts climatic zone
- `LEA_Total`: LEA-based probability taken over all climatic zones

**References**

Kryazhimskiy, A., Rovenskaya, E., Shvidenko, A., Gusti, M. Shchepashchenko, D. & Veshchinskaya, V. (2015). Towards harmonizing competing models: Russian forests' net primary production case study. *Technological Forecasting & Social Change*, 98: 245-254.

---

integrate

*Integration of distributions*

---

**Description**

Combines distributions into an aggregated discrete distribution using several methods.

**Usage**

```
integrate(vals, pdfs, cdfs)
```

**Arguments**

<code>vals</code>	a discrete ordered range of the random variables
<code>pdfs</code>	probability distributions in the 'table-based' format
<code>cdfs</code>	probability distributions in the 'cdf-based' format

**Details**

Integration is done for the discrete prior stochastic estimates. Every prior has the same range specified in *vals*. Prior distribution can be specified in the 'table-based' format or in the 'cdf-based' format. A 'table-based' distribution gives a probability to every outcome in the range. A 'cdf-based' distribution assigns a probability for every bin, whose middle point is an outcome in the range and bin's borders are defined between the range points.

**Value**

An object of the `distribution_table` class.

**Note**

Source distributions are integrated using the posterior integration method [Kryazhimskiy, 2013] and using simple averaging of all input distributions.

**References**

Kryazhimskiy, A.V. (2013). Posterior integration of independent stochastic estimates. IIASA Interim Report. IR-13-006.

**See Also**

[product](#), [average](#), [summary.distribution\\_table](#)

**Examples**

```
# Integration of the two 'table-based' distributions
range <- c(1, 2, 3)
result <- integrate(range, list("m1" = c(0.3, 0.6, 0.1), "m2" = c(0.2, 0.4, 0.4)))
summary(result)
print(result)

# Integration of the 'table-based' and 'cdf-based' distributions
integrate(
  forest_npp90[, 1],
  as.list(forest_npp90["LEA_Tundra"]),
  list("DGVM_Tundra" = function(x)(pnorm(x, mean = 202, sd = 52))))

# Integration of the 'cdf-based' distributions
integrate(
  c(1, 2),
  cdfs = list(function(x)(punif(x, min = 0.5, max = 2.5)),
              function(x)(punif(x, min = 0.5, max = 2.5))))
```

---

is.distribution\_table *Distribution tables*

---

**Description**

Test of an object being interpretable as a distribution table.

**Usage**

```
is.distribution_table(obj)
```

**Arguments**

obj                    an object to be tested

**Value**

The method returns TRUE if its argument inherits from the class "distribution\_table", and FALSE otherwise.

## Description

Combination of prior distributions into an aggregated (synthetic) one. The package implements the posterior integration method [Kryazhimskiy, 2013]. For comparison, an implementation of simple averaging of the input distributions is added.

## Note

A posteriori integration is understood as an improvement of data given by a priori probabilities. The approach is based on the concept of an a posteriori event in the product of probability spaces associated with a priori probabilities. The conditional probability on the product space that is specified by an a posteriori event (which reflects the fact that all the prior stochastic estimates represent the same deterministic element) determines in a natural way the probability on the set of initial elementary events; the latter is recognized as the result of a posteriori integration of a priori models [Kryazhimskiy, 2016].

E.g., the probability of the true value to be equal  $z$  is computed as  $p1[z]*p2[z]*...*pn[z]/P(E^*)$ , where  $p1...pn$  are probabilities from  $x$  and  $E^*$  denotes a posteriori event.

## Author(s)

Anna Shchiptsova, IIASA

## References

- Kryazhimskiy, A.V. (2013). Posterior integration of independent stochastic estimates. IIASA Interim Report. IR-13-006.
- Kryazhimskiy, A.V. (2016). Posteriori integration of probabilities. Elementary theory. Theory of Probability and its Applications, 60(1): 62-87.

## See Also

[integrate](#)

## Examples

```
library(modelIntegration)

pdf1 <- c(0.75, 0.25)
pdf2 <- c(0.75, 0.25)
bins <- c(1, 2)

result <- integrate(bins, list(pdf1, pdf2))

summary(result)
product(result)
```

---

```
print.distribution_table
```

*Print method*

---

### Description

Prints an object of the `distribution_table` class.

### Usage

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

### Arguments

<code>x</code>	an R object of the <code>distribution_table</code> class
<code>...</code>	other arguments passed to methods

### Details

The print format matches a format for the `data.frame` class. The output contains discrete probability distributions of the sources and their product. The column `x` returns a random variable range. The *Product* column has probabilities from the product distribution.

### See Also

[product](#)

### Examples

```
# S3 method for class "distribution_table"  
pdf1 <- c(0.75, 0.25)  
pdf2 <- c(0.75, 0.25)  
bins <- c(1, 2)  
print(integrate(bins, list(pdf1, pdf2)))
```

---

<code>product</code>	<i>Product distribution</i>
----------------------	-----------------------------

---

### Description

Combines source distributions into the resultant integrated distribution using the posterior integration method [Kryazhimskiy, 2013]. The latter one is called a *product* probability distribution.

### Usage

```
product(x, ...)
```

**Arguments**

`x` an R object with source distributions  
`...` other arguments passed to methods

**Details**

A posteriori integration is understood as an improvement of data given by a priori probabilities in  $x$ . The approach is based on the concept of an a posteriori event in the product of probability spaces associated with a priori probabilities. The conditional probability on the product space that is specified by an a posteriori event (which reflects the fact that all the prior stochastic estimates represent the same deterministic element) determines in a natural way the probability on the set of initial elementary events; the latter is recognized as the result of a posteriori integration of a priori models [Kryazhimskiy, 2016].

E.g, the probability of the true value to be equal  $z$  is computed as  $p1[z]*p2[z]*...*pn[z]/P(E^*)$ , where  $p1...pn$  are probabilities from  $x$  and  $E^*$  denotes a posteriori event.

**Value**

A data frame with the 'table-based' distribution, where every row contains an outcome in the random variable range and its probability in the integrated distribution.

**References**

Kryazhimskiy, A.V. (2013). Posterior integration of independent stochastic estimates. IIASA Interim Report. IR-13-006.

Kryazhimskiy, A.V. (2016). Posteriori integration of probabilities. Elementary theory. Theory of Probability and its Applications, 60(1): 62-87.

**Examples**

```
# Product distribution of two 'table-based' distributions
# S3 method for class "distribution_table"
pdf1 <- c(0.75, 0.25)
pdf2 <- c(0.75, 0.25)
bins <- c(1, 2)
product(integrate(bins, list(pdf1, pdf2)))
```

---

statistics

*Descriptive statistics*

---

**Description**

Provides descriptive statistics of the source and integrated distributions.

**Usage**

```
statistics(x, ...)
```

**Arguments**

`x` an R object with source distributions  
`...` other arguments passed to methods

**Details**

Descriptive statistics include distribution mean and standard deviation. Source distributions are combined into the product and average integrated distributions.

**Value**

A data frame with means and standard deviations. The the last two columns "Product" and "Average" contain estimates for the corresponding integrated distributions.

**See Also**

[product](#), [average](#)

**Examples**

```
# S3 method for class "distribution_table"
pdf1 <- c(0.75, 0.25)
pdf2 <- c(0.75, 0.25)
bins <- c(1, 2)
statistics(integrate(bins, list(pdf1, pdf2)))
```

---

summary.distribution\_table

*Summary of integrated distributions*

---

**Description**

Provides summary statistics of integrated combinations of the source distributions.

**Usage**

```
## S3 method for class 'distribution_table'
summary(object, ...)
```

**Arguments**

object	an R object of the distribution_table class
...	other arguments passed to methods

**Details**

Distributions are summarized by their mean and standard deviation. Source distributions are combined into the product and average integrated distributions.

**Value**

A data frame with means and standard deviations. The columns "Product" and "Average" contain estimates for the corresponding integrated distributions.

**See Also**

[statistics](#), [product](#), [average](#)

**Examples**

```
# S3 method for class "distribution_table"  
pdf1 <- c(0.75, 0.25)  
pdf2 <- c(0.75, 0.25)  
bins <- c(1, 2)  
summary(integrate(bins, list(pdf1, pdf2)))
```

# Index

## \*Topic **datasets**

forest\_npp, 2

forest\_npp90, 3

average, 2, 5, 9

forest\_npp, 2

forest\_npp90, 3

integrate, 4, 6

is.distribution\_table, 5

modelIntegration, 6

modelIntegration-package

(modelIntegration), 6

print.distribution\_table, 7

product, 5, 7, 7, 9

statistics, 8, 9

summary.distribution\_table, 5, 9