

# Package ‘overlapping’

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**Type** Package

**Title** Estimation of Overlapping in Empirical Distributions

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**Author** Massimiliano Pastore [aut, cre],  
Pierfrancesco Alaimo Di Loro [ctb],  
Marco Mingione [ctb],  
Antonio Calcagni' [ctb]

**Maintainer** Massimiliano Pastore <massimiliano.pastore@unipd.it>

**Description** Functions for estimating the overlapping area of two or more kernel density estimations from empirical data.

**Depends** R (>= 3.0.0), ggplot2, testthat

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boot.overlap

*Nonparametric Bootstrap to estimate the overlapping area***Description**

Resampling via non-parametric bootstrap to estimate the overlapping area between two or more kernel density estimations from empirical data.

**Usage**

```
boot.overlap( x, B = 1000, pairsOverlap = FALSE, ... )
```

**Arguments**

x	a list of numerical vectors to be compared (each vector is an element of the list).
B	integer, number of bootstrap draws.
pairsOverlap	logical, if TRUE, available only when the list x contains more than two elements, it returns the overlapped area relative to each pair of distributions.
...	options, see function <a href="#">overlap</a> for details.

**Details**

If the list x contains more than two elements (i.e., more than two distributions) it computes the bootstrap overlapping measure between all the  $q$  paired distributions. For example, if x contains three elements then  $q = 3$ ; if x contains four elements then  $q = 6$ .

**Value**

It returns a list containing the following components:

OVboot_stats	a data frame $q \times 3$ where each row contains the following statistics: estOV, estimated overlapping area, $\hat{\eta}$ ; bias, difference between the expected value over the bootstrap samples and the observed overlapping area: $E(\hat{\eta}^*) - \hat{\eta}$ ; se, bootstrap standard error $\sigma_{\hat{\eta}}$ .
OVboot_dist	a matrix with B rows (bootstrap replicates) and $q$ columns (depending on the number of elements of x); each column is a bootstrap distribution of the corresponding overlapping measure.

**Note**

Call function [overlap](#).

Thanks to Jeremy Vollen for suggestions.

**Author(s)**

Massimiliano Pastore

## References

Pastore, M. (2018). Overlapping: a R package for Estimating Overlapping in Empirical Distributions. *The Journal of Open Source Software*, 3 (32), 1023. doi: [10.21105/joss.01023](https://doi.org/10.21105/joss.01023)

Pastore, M., Calcagni, A. (2019). Measuring Distribution Similarities Between Samples: A Distribution-Free Overlapping Index. *Frontiers in Psychology*, 10:1089. doi: [10.3389/fpsyg.2019.01089](https://doi.org/10.3389/fpsyg.2019.01089)

## Examples

```
set.seed(20150605)
x <- list(X1=rnorm(100), X2=rt(50,8), X3=rchisq(80,2))

## bootstrapping
out <- boot.overlap( x, B = 10 )
out$OVboot_stats

# bootstrap quantile intervals
apply( out$OVboot_dist, 2, quantile, probs = c(.05, .9) )

# plot of bootstrap distributions
Y <- stack( data.frame( out$OVboot_dist ) )
ggplot( Y, aes( values ) ) + facet_wrap( ~ind ) + geom_density()
```

---

final.plot

*Final plot*

---

## Description

Graphical representation of the estimated densities along with the overlapping area.

## Usage

```
final.plot( x, pairs = FALSE, boundaries = NULL )
```

## Arguments

x	a list of numerical vectors to be compared; each vector is an element of the list, see <a href="#">overlap</a> .
pairs	logical, if TRUE (and x contains more than two elements) produces pairwise plots.
boundaries	an optional vector indicating the minimum and the maximum over a predefined subset of the support of the empirical densities.

## Details

It requires the package `ggplot2`.

**Note**

The output plot can be customized using the ggplot2 rules, see example below.

**Author(s)**

Massimiliano Pastore

**Examples**

```
set.seed(20150605)
x <- list(X1=rnorm(100),X2=rt(50,8),X3=rchisq(80,2))
final.plot(x)
final.plot(x, pairs = TRUE)

# customizing plot
final.plot(x) + scale_fill_brewer() + scale_color_brewer()
final.plot(x) + theme(text=element_text(size=15))
```

---

overlap

*Estimate the overlapping measure.*

---

**Description**

It returns the overlapped estimated area between two or more kernel density estimations from empirical data. The overlapping measure can be computed either as the integral of the minimum between two densities (`type = "1"`) or as the proportion of overlapping area between two densities (`type = "2"`). In the last case, the integral of the minimum between two densities is divided by the integral of the maximum of the two densities.

**Usage**

```
overlap( x, nbins = 1024, type = c( "1", "2" ),
         pairsOverlap = TRUE, plot = FALSE, boundaries = NULL,
         get_xpoints = FALSE, ... )
```

**Arguments**

<code>x</code>	a list of numerical vectors to be compared (each vector is an element of the list).
<code>nbins</code>	number of equally spaced points through which the density estimates are compared; see <a href="#">density</a> for details.
<code>type</code>	character, type of index. If <code>type = "2"</code> returns the proportion of the overlapped area between two or more densities, see Details.
<code>pairsOverlap</code>	logical, if TRUE (default) returns the overlapped area relative to each pair of distributions.
<code>plot</code>	logical, if TRUE, the final plot of estimated densities and overlapped areas is produced.

<code>boundaries</code>	an optional vector indicating the minimum and the maximum over a predefined subset of the support of the empirical densities, see Details.
<code>get_xpoints</code>	logical, if TRUE returns a vector where the abscissas represent the points of intersection among the densities. Note: it works only if <code>pairsOverlap = FALSE</code> .
<code>...</code>	optional arguments to be passed to the function <a href="#">density</a> .

## Details

When dealing with two densities: `type = "1"` corresponds to the integral of the minimum between the two densities; `type = "2"` corresponds to the proportion of the overlapped area over the total area.

If the list `x` contains more than two elements (i.e. more than two distributions) it computes both the multiple and the pairwise overlapping among all distributions.

If `plot = TRUE` all the overlapped areas are plotted. It requires `ggplot2`.

The optional vector `boundaries` has to contain two numbers for the empirical minimum and maximum of the overlapped area. See examples below.

## Value

It returns a list containing the following components:

<code>OV</code>	estimate of the overlapped area; if <code>x</code> contains more than two elements then a vector of estimates is returned.
<code>xpoints</code>	a list of intersection points (in abscissa) among the densities (if <code>get_xpoints = TRUE</code> ).
<code>OVpairs</code>	the estimates of overlapped areas for each pair of densities (only if <code>x</code> contains more than two elements).

## Note

Call function [ovmult](#).

## Author(s)

Massimiliano Pastore, Pierfrancesco Alaimo Di Loro, Marco Mingione

## References

Pastore, M. (2018). Overlapping: a R package for Estimating Overlapping in Empirical Distributions. *The Journal of Open Source Software*, 3 (32), 1023. doi: [10.21105/joss.01023](https://doi.org/10.21105/joss.01023)

Pastore, M., Calcagni, A. (2019). Measuring Distribution Similarities Between Samples: A Distribution-Free Overlapping Index. *Frontiers in Psychology*, 10:1089. doi: [10.3389/fpsyg.2019.01089](https://doi.org/10.3389/fpsyg.2019.01089)

**Examples**

```

set.seed(20150605)
x <- list(X1=rnorm(100), X2=rt(50,8), X3=rchisq(80,2))
overlap(x, plot=TRUE)

# including boundaries
x <- list(X1=runif(100), X2=runif(100,.5,1))
overlap(x, plot=TRUE, boundaries=c(.5,1))

x <- list(X1=runif(100), X2=runif(50), X3=runif(30))
overlap(x, plot=TRUE, boundaries=c(.1,.9))

# changing kernel
overlap(x, plot=TRUE, kernel="rectangular")

# normalized overlap
N <- 1e5
x <- list(X1=runif(N),X2=runif(N,.5))
overlap(x)
overlap(x, type = "2")

```

---

ovmult

*Multiple overlapping estimation*


---

**Description**

It gives the overlap area between two or more kernel density estimations from empirical data.

**Usage**

```

ovmult( x, nbins = 1024, type = c( "1", "2" ),
        boundaries = NULL, get_xpoints = FALSE, ... )

```

**Arguments**

x	a list of numerical vectors to be compared (each vector is an element of the list).
nbins	number of equally spaced points through which the density estimates are compared; see <a href="#">density</a> for details.
type	character, type of index. If type = "2" returns the proportion of the overlapped area between two or more densities, see <a href="#">overlap</a> .
boundaries	an optional vector indicating the minimum and the maximum over a predefined subset of the support of the empirical densities.
get_xpoints	logical, if TRUE returns a vector where the abscissas represent the points of intersection among the densities. Note: it works only if pairsOverlap = FALSE.
...	optional arguments to be passed to the function <a href="#">density</a> .

**Details**

If the list `x` contains more than two elements (i.e. more than two distributions) it computes multiple overlap measures.

The optional vector `boundaries` has to contain two numbers for the empirical minimum and maximum of the overlapped area. See examples below.

**Value**

It returns the value of overlapped area.

**Note**

Called from the function [overlap](#).

**Author(s)**

Pierfrancesco Alaimo Di Loro, Marco Mingione, Massimiliano Pastore

**Examples**

```
set.seed(20150605)
x <- list(X1=rnorm(100), X2=rt(50,8), X3=rchisq(80,2))
ovmult(x)
ovmult(x, normalized = TRUE)

# including boundaries
x <- list(X1=runif(100), X2=runif(100,.5,1))
ovmult(x, boundaries=c( 0, .8 ))

x <- list(X1=runif(100), X2=runif(50), X3=runif(30))
ovmult(x, boundaries=c( .2, .8 ))

# changing kernel
ovmult(x, kernel="rectangular")
```

---

perm.pairs

*Paired permutation*

---

**Description**

Perform a random permutation of the data list.

**Usage**

```
perm.pairs( x )
```

**Arguments**

x a list of numerical vectors to be compared (each vector is an element of the list).

**Value**

It returns a list with paired elements of x randomly permuted.

**Note**

Internal function called by [perm.test](#).

**Author(s)**

Massimiliano Pastore

**Examples**

```
set.seed(20150605)
x <- list(X1=rnorm(10), X2=rt(15,8))
perm.pairs( x )

x <- list(X1=rnorm(10), X2=rt(15,8), X3=rchisq(12,3))
perm.pairs( x )
```

---

perm.test

*Permutation test on the (non-)overlapping area*

---

**Description**

Perform a permutation test on the overlapping index.

**Usage**

```
perm.test( x, B = 1000,
           return.distribution = FALSE, ... )
```

**Arguments**

x a list of numerical vectors to be compared (each vector is an element of the list).  
B integer, number of permutation replicates.  
return.distribution logical, if TRUE it returns the distribution of permuted Z statistics.  
... options, see function [overlap](#) for details.



## Details

It performs a permutation test of the null hypothesis that there is no difference between the two distributions, i.e. the overlapping index ( $\eta$ ) is one, or the non-overlapping index ( $1 - \eta = \zeta$ ) is zero.

## Value

It returns a list containing the following components:

Zobs	the observed values of non-overlapping index, i.e. $1-\eta$ .
pval	p-values.
Zperm	the permutation distributions.

## Warning

Currently, it only runs the permutation test on two groups at a time. If  $x$  contains more than 2 elements, it performs all paired permutation tests.

## Note

Call function [overlap](#).

## Author(s)

Massimiliano Pastore

## References

Perugini, A., Calignano, G., Nucci, M., Finos, L., & Pastore, M. (2024, December 30). How do my distributions differ? Significance testing for the Overlapping Index using Permutation Test. doi: [10.31219/osf.io/8h4fe](https://doi.org/10.31219/osf.io/8h4fe)

## Examples

```
set.seed(20150605)
x <- list(X1=rnorm(100), X2=rt(50,8))

## not run: this example take several minutes
## permutation test
# out <- perm.test( x, return.distribution = TRUE )
# out$pval
# plot( density( out$Zperm ) )
# abline( v = out$Zobs )

x <- list(X1=rnorm(100), X2=rt(50,8), X3=rchisq(75,3))
# out <- perm.test( x )
# out$pval
```

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