

Package ‘NNS’

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Type Package

Title Nonlinear Nonparametric Statistics

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Description Nonlinear nonparametric statistics using partial moments. Partial moments are the elements of variance and asymptotically approximate the area of $f(x)$. These robust statistics provide the basis for nonlinear analysis while retaining linear equivalences. NNS offers: Numerical integration, Numerical differentiation, Clustering, Correlation, Dependence, Causal analysis, ANOVA, Regression, Classification, Seasonality, Autoregressive modeling, Normalization and Stochastic dominance. All routines based on: Viole, F. and Nawrocki, D. (2013), Nonlinear Nonparametric Statistics: Using Partial Moments (ISBN: 1490523995).

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BugReports <https://github.com/OVVO-Financial/NNS/issues>

LazyData TRUE

RoxygenNote 6.1.1

Depends R (>= 3.3.0), doParallel

Imports data.table, rgl, stringr

Suggests knitr, rmarkdown

VignetteBuilder knitr

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Co.LPM

Co-Lower Partial Moment (Lower Left Quadrant 4)

Description

This function generates a co-lower partial moment for between two equal length variables for any degree or target.

Usage

```
Co.LPM(degree.x, degree.y, x, y, target.x = mean(x),
       target.y = mean(y))
```

Arguments

degree.x	integer; Degree for variable X. (degree.x = 0) is frequency, (degree.x = 1) is area.
degree.y	integer; Degree for variable Y. (degree.y = 0) is frequency, (degree.y = 1) is area.
x	a numeric vector.
y	a numeric vector of equal length to x.

target.x	numeric; Typically the mean of Variable X for classical statistics equivalences, but does not have to be. (Vectorized)
target.y	numeric; Typically the mean of Variable Y for classical statistics equivalences, but does not have to be. (Vectorized)

Value

Co-LPM of two variables

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
Co.LPM(0, 0, x, y, mean(x), mean(y))
```

Co.UPM	<i>Co-Upper Partial Moment (Upper Right Quadrant 1)</i>
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Description

This function generates a co-upper partial moment between two equal length variables for any degree or target.

Usage

```
Co.UPM(degree.x, degree.y, x, y, target.x = mean(x),
       target.y = mean(y))
```

Arguments

degree.x	integer; Degree for variable X. (degree.x = 0) is frequency, (degree.x = 1) is area.
degree.y	integer; Degree for variable Y. (degree.y = 0) is frequency, (degree.y = 1) is area.
x	a numeric vector.
y	a numeric vector of equal length to x.
target.x	numeric; Typically the mean of Variable X for classical statistics equivalences, but does not have to be. (Vectorized)
target.y	numeric; Typically the mean of Variable Y for classical statistics equivalences, but does not have to be. (Vectorized)

Value

Co-UPM of two variables

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
Co.UPM(0,0,x,y,mean(x),mean(y))
```

D.LPM

Divergent-Lower Partial Moment (Lower Right Quadrant 3)

Description

This function generates a divergent lower partial moment between two equal length variables for any degree or target.

Usage

```
D.LPM(degree.x, degree.y, x, y, target.x = mean(x), target.y = mean(y))
```

Arguments

degree.x	integer; Degree for variable X. (degree.x = 0) is frequency, (degree.x = 1) is area.
degree.y	integer; Degree for variable Y. (degree.y = 0) is frequency, (degree.y = 1) is area.
x	a numeric vector.
y	a numeric vector of equal length to x.
target.x	numeric; Typically the mean of Variable X for classical statistics equivalences, but does not have to be. (Vectorized)
target.y	numeric; Typically the mean of Variable Y for classical statistics equivalences, but does not have to be. (Vectorized)

Value

Divergent LPM of two variables

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
D.LPM(0, 0, x, y, mean(x), mean(y))
```

D.UPM

Divergent-Upper Partial Moment (Upper Left Quadrant 2)

Description

This function generates a divergent upper partial moment between two equal length variables for any degree or target.

Usage

```
D.UPM(degree.x, degree.y, x, y, target.x = mean(x), target.y = mean(y))
```

Arguments

degree.x	integer; Degree for variable X. (degree.x = 0) is frequency, (degree.x = 1) is area.
degree.y	integer; Degree for variable Y. (degree.y = 0) is frequency, (degree.y = 1) is area.
x	a numeric vector.
y	a numeric vector of equal length to x.
target.x	numeric; Typically the mean of Variable X for classical statistics equivalences, but does not have to be. (Vectorized)
target.y	numeric; Typically the mean of Variable Y for classical statistics equivalences, but does not have to be. (Vectorized)

Value

Divergent UPM of two variables

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
D.UPM(0, 0, x, y, mean(x), mean(y))
```

dy.dx

*Partial Derivative dy/dx***Description**

Returns the numerical partial derivate of y wrt x for a point of interest.

Usage

```
dy.dx(x, y, order = NULL, stn = 0.99, eval.point = median(x),
      deriv.order = 1, h = 0.05, noise.reduction = "mean",
      deriv.method = "FS")
```

Arguments

x	a numeric vector.
y	a numeric vector.
order	integer; Controls the number of partial moment quadrant means. Defaults to (order = NULL) which generates a more accurate derivative for well specified cases.
stn	numeric [0, 1]; Signal to noise parameter, sets the threshold of NNS.dep which reduces "order" when (order = NULL). Defaults to 0.99 to ensure high dependence for higher "order" and endpoint determination.
eval.point	numeric; x point to be evaluated. Defaults to (eval.point = median(x)). Set to (eval.point = "overall") to find an overall partial derivative estimate.
deriv.order	numeric options: (1, 2); 1 (default) for first derivative. For second derivative estimate of f(x), set (deriv.order = 2).
h	numeric [0, ...]; Percentage step used for finite step method. Defaults to h = .05 representing a 5 percent step from the value of the independent variable.
noise.reduction	the method of determing regression points options: ("mean", "median", "mode", "off"); In low signal to noise situations, (noise.reduction = "median") uses medians instead of means for partitions, while (noise.reduction = "mode") uses modes instead of means for partitions. (noise.reduction = "off") allows for maximum possible fit in NNS.reg . Default setting is (noise.reduction = "mean").
deriv.method	method of derivative estimation, options: ("NNS", "FS"); Determines the partial derivative from the coefficient of the NNS.reg output when (deriv.method = "NNS") or generates a partial derivative using the finite step method (deriv.method = "FS") (Default).

Value

Returns the value of the partial derivative estimate for the given order.

Note

If a vector of derivatives is required, ensure (deriv.method = "FS").

Author(s)

Fred Violo, OVVO Financial Systems

References

Violo, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments" <http://amzn.com/1490523995>

Vinod, H. and Violo, F. (2017) "Nonparametric Regression Using Clusters" <https://link.springer.com/article/10.1007/s10614-017-9713-5>

Examples

```
## Not run:
x <- seq(0, 2 * pi, pi / 100) ; y <-sin(x)
dy.dx(x, y, eval.point = 1.75)

# Vector of derivatives
dy.dx(x, y, eval.point = c(1.75, 2.5), deriv.method = "FS")
## End(Not run)
```

dy.d_

Partial Derivative $dy/d_{[wrt]}$

Description

Returns the numerical partial derivate of y with respect to [wrt] any regressor for a point of interest. Finite difference method is used with [NNS.reg](#) estimates as $f(x + h)$ and $f(x - h)$ values.

Usage

```
dy.d_(x, y, wrt, eval.points = "median", order = NULL, stn = 0.99,
      h = 0.05, n.best = NULL, mixed = FALSE, plot = FALSE,
      noise.reduction = "mean")
```

Arguments

x	a numeric matrix or data frame.
y	a numeric vector with compatible dimensions to x.
wrt	integer; Selects the regressor to differentiate with respect to.
eval.points	numeric or options: ("mean", "median", "last"); Regressor points to be evaluated. (eval.points = "median") (default) to find partial derivatives at the median of every variable. Set to (eval.points = "last") to find partial derivatives at the last value of every variable. Set to (eval.points="mean") to find partial derivatives at the mean value of every variable. Set to (eval.points = "all") to find partial derivatives at every observation.
order	integer; NNS.reg "order", defaults to NULL.
stn	numeric [0, 1]; Signal to noise parameter, sets the threshold of NNS.dep which reduces "order" when (order = NULL). Defaults to 0.99 to ensure high dependence for higher "order" and endpoint determination.

h	numeric [0, ...]; Percentage step used for finite step method. Defaults to h = .05 representing a 5 percent step from the value of the regressor.
n.best	integer; Sets the number of closest regression points to use in estimating finite difference points in NNS.reg . NULL (default) Uses <code>ceiling(sqrt(ncol(x)))</code> .
mixed	logical; FALSE (default) If mixed derivative is to be evaluated, set (mixed = TRUE). Only for single valued eval.points.
plot	logical; FALSE (default) Set to (plot = TRUE) to view plot.
noise.reduction	the method of determining regression points options: ("mean", "median", "mode", "off"); In low signal to noise situations, (noise.reduction = "median") uses medians instead of means for partitions, while (noise.reduction = "mode") uses modes instead of means for partitions. (noise.reduction = "off") allows for maximum possible fit in NNS.reg . Default setting is (noise.reduction = "mean").

Value

Returns:

- `dy.d(...)$"First Derivative"` the 1st derivative
- `dy.d(...)$"Second Derivative"` the 2nd derivative
- `dy.d(...)$"Mixed Derivative"` the mixed derivative (for two independent variables only).

Returns a vector of partial derivatives when (eval.points = "all").

Note

For known function testing and analysis, regressors should be transformed via [expand.grid](#) to fill the dimensions with (order = "max"). Example provided below.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
## Not run:
set.seed(123) ; x_1 <- runif(100) ; x_2 <- runif(100) ; y <- x_1 ^ 2 * x_2 ^ 2
B <- cbind(x_1, x_2)
## To find derivatives of y wrt 1st regressor
dy.d_(B, y, wrt = 1, eval.points = c(.5, .5))

## Known function analysis: [y = a ^ 2 * b ^ 2]
x_1 <- seq(0, 1, .1) ; x_2 <- seq(0, 1, .1)
B <- expand.grid(x_1, x_2) ; y <- B[, 1] ^ 2 * B[, 2] ^ 2
dy.d_(B, y, wrt = 1, eval.points = c(.5, .5), order = "max")
## End(Not run)
```

LPM

Lower Partial Moment

Description

This function generates a univariate lower partial moment for any degree or target.

Usage

```
LPM(degree, target, variable)
```

Arguments

degree	integer; (degree = 0) is frequency, (degree = 1) is area.
target	numeric; Typically set to mean, but does not have to be. (Vectorized)
variable	a numeric vector.

Value

LPM of variable

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)
LPM(0, mean(x), x)
```

LPM.ratio

Lower Partial Moment RATIO

Description

This function generates a standardized univariate lower partial moment for any degree or target.

Usage

```
LPM.ratio(degree, target, variable)
```

Arguments

degree	integer; (degree = 0) is frequency, (degree = 1) is area.
target	numeric; Typically set to mean, but does not have to be. (Vectorized)
variable	a numeric vector.

Value

Standardized LPM of variable

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)
LPM.ratio(0, mean(x), x)

## Continuous CDF
LPM.ratio(1, sort(x), x)

## Joint CDF
## Not run:
x <- rnorm(5000) ; y <- rnorm(5000)
plot3d(x, y, Co.LPM(0, 0, sort(x), sort(y), x, y), col = "blue", xlab = "X", ylab = "Y",
zlab = "Probability", box = FALSE)

## End(Not run)
```

LPM.VaR

LPM VaR

Description

Generates a VaR based on the Lower Partial Moment ratio.

Usage

```
LPM.VaR(percentile, degree, x)
```

Arguments

percentile	numeric [0, 1]; The percentile for left-tail VaR.
degree	integer; (degree = 0) for discrete distributions, (degree = 1) for continuous distributions.
x	a numeric vector.

Value

Returns a numeric value representing the point at which "percentile" of the area of x is above.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)

## For 95th percentile VaR (left-tail)
LPM.VaR(0.95, 0, x)
```

NNS.ANOVA	<i>NNS ANOVA</i>
-----------	------------------

Description

Analysis of variance (ANOVA) based on lower partial moment CDFs for multiple variables. Returns a degree of certainty the difference in sample means is zero, not a p-value.

Usage

```
NNS.ANOVA(control, treatment, confidence.interval = 0.95,
           tails = "Both", pairwise = FALSE, plot = TRUE, binary = TRUE)
```

Arguments

control	a numeric vector, matrix or data frame.
treatment	NULL (default) a numeric vector, matrix or data frame.
confidence.interval	numeric [0, 1]; The confidence interval surrounding the control mean when (binary = TRUE). Defaults to (confidence.interval = 0.95).
tails	options: ("Left", "Right", "Both"). tails = "Both"(Default) Selects the tail of the distribution to determine effect size.
pairwise	logical; FALSE (default) Returns pairwise certainty tests when set to pairwise = TRUE.
plot	logical; TRUE (default) Returns the boxplot of all variables along with grand mean identification. When (binary = TRUE), returns the boxplot of both variables along with grand mean identification and confidence interval thereof.
binary	logical; TRUE (default) Selects binary analysis between a control and treatment variable.

Value

For (binary = FALSE) returns the degree certainty the difference in sample means is zero [0, 1].

For (binary = TRUE) returns:

- "Control Mean"
- "Treatment Mean"
- "Grand Mean"
- "Control CDF"
- "Treatment CDF"
- "Certainty" the certainty of the same population statistic
- "Lower Bound Effect" and "Upper Bound Effect" the effect size of the treatment for the specified confidence interval

Author(s)

Fred Violen, OVVO Financial Systems

References

Violen, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
### Binary analysis and effect size
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.ANOVA(control = x, treatment = y)

### Two variable analysis with no control variable
A <- cbind(x, y)
NNS.ANOVA(A)

### Multiple variable analysis with no control variable
set.seed(123)
x <- rnorm(100) ; y<- rnorm(100) ; z<- rnorm(100)
A <- cbind(x, y, z)
NNS.ANOVA(A)
```

NNS.ARMA

NNS ARMA

Description

Autoregressive model incorporating nonlinear regressions of component series.

Usage

```
NNS.ARMA(variable, h = 1, training.set = NULL,
  seasonal.factor = TRUE, weights = NULL, best.periods = 2,
  negative.values = FALSE, method = "nonlin", dynamic = FALSE,
  plot = TRUE, seasonal.plot = TRUE, intervals = FALSE,
  ncores = NULL)
```

Arguments

variable	a numeric vector.
h	integer; 1 (default) Number of periods to forecast.
training.set	numeric; NULL (default) Sets the number of variable observations (variable[1 : training.set]) to monitor performance of forecast over in-sample range.
seasonal.factor	logical or integer(s); TRUE (default) Automatically selects the best seasonal lag from the seasonality test. To use weighted average of all seasonal lags set to (seasonal.factor = FALSE). Otherwise, directly input known frequency integer lag to use, i.e. (seasonal.factor = 12) for monthly data. Multiple frequency integers can also be used, i.e. (seasonal.factor = c(12, 24, 36))
weights	numeric; NULL (default) sets the weights of the seasonal.factor vector when specified as integers. If (weights = NULL) each seasonal.factor is weighted on its NNS.seas result and number of observations it contains.
best.periods	integer; [2] (default) used in conjunction with (seasonal.factor = FALSE), uses the best.periods number of detected seasonal lags instead of ALL lags when (seasonal.factor = FALSE).
negative.values	logical; FALSE (default) If the variable can be negative, set to (negative.values = TRUE).
method	options: ("lin", "nonlin", "both"); "nonlin" (default) To select the regression type of the component series, select (method = "both") where both linear and nonlinear estimates are generated. To use a nonlinear regression, set to (method = "nonlin"); to use a linear regression set to (method = "lin").
dynamic	logical; FALSE (default) To update the seasonal factor with each forecast point, set to (dynamic = TRUE). The default is (dynamic = FALSE) to retain the original seasonal factor from the inputted variable for all ensuing h.
plot	logical; TRUE (default) Returns the plot of all periods exhibiting seasonality and the variable level reference in upper panel. Lower panel returns original data and forecast.
seasonal.plot	logical; TRUE (default) Adds the seasonality plot above the forecast. Will be set to FALSE if no seasonality is detected or seasonal.factor is set to an integer value.
intervals	logical; FALSE (default) Plots the surrounding forecasts around the final estimate when (intervals = TRUE) and (seasonal.factor = FALSE). There are no other forecasts to plot when a single seasonal.factor is selected.
ncores	integer; value specifying the number of cores to be used in the parallelized procedure. If NULL (default), the number of cores to be used is equal to half the number of cores of the machine - 1.

Value

Returns a vector of forecasts of length (h).

Note

For monthly data series, increased accuracy may be realized from forcing seasonal factors to multiples of 12. For example, if the best periods reported are: {37, 47, 71, 73} use (seasonal.factor = c(36, 48, 72)).

(seasonal.factor = FALSE) can be a very computationally expensive exercise due to the number of seasonal periods detected.

If error encountered when (seasonal.factor = TRUE):

"NaNs produced Error in seq.default(length(variable)+1, 1, -lag[i]) : wrong sign in 'by' argument"

use the combination of (seasonal.factor = FALSE, best.periods = 1).

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
## Nonlinear NNS.ARMA using AirPassengers monthly data and 12 period lag
## Not run:
NNS.ARMA(AirPassengers, h = 45, training.set = 100, seasonal.factor = 12, method = "nonlin")

## Linear NNS.ARMA using AirPassengers monthly data and 12, 24, and 36 period lags
NNS.ARMA(AirPassengers, h = 45, training.set = 120, seasonal.factor = c(12, 24, 36), method = "lin")

## Nonlinear NNS.ARMA using AirPassengers monthly data and 2 best periods lag
NNS.ARMA(AirPassengers, h = 45, training.set = 120, seasonal.factor = FALSE, best.periods = 2)
## End(Not run)
```

NNS.ARMA.optim

NNS ARMA Optimizer

Description

Wrapper function for optimizing any combination of a given seasonal.factor vector in [NNS.ARMA](#). Minimum sum of squared errors (forecast-actual) is used to determine optimum across all [NNS.ARMA](#) methods.

Usage

```
NNS.ARMA.optim(variable, training.set, seasonal.factor,
  negative.values = FALSE, obj.fn = expression(sum((predicted -
  actual)^2)), objective = "min", linear.approximation = TRUE,
  print.trace = TRUE, ncores = NULL, subcores = NULL)
```

Arguments

<code>variable</code>	a numeric vector.
<code>training.set</code>	numeric; NULL (default) Sets the number of variable observations
<code>seasonal.factor</code>	integers; Multiple frequency integers considered for NNS.ARMA model, i.e. (<code>seasonal.factor = c(12, 24, 36)</code>)
<code>negative.values</code>	logical; FALSE (default) If the variable can be negative, set to (<code>negative.values = TRUE</code>).
<code>obj.fn</code>	expression; <code>expression(sum((predicted - actual)^2))</code> (default) Sum of squared errors is the default objective function. Any <code>expression()</code> using the specific terms <code>predicted</code> and <code>actual</code> can be used.
<code>objective</code>	options: ("min", "max") "min" (default) Select whether to minimize or maximize the objective function <code>obj.fn</code> .
<code>linear.approximation</code>	logical; TRUE (default) Uses the best linear output from <code>NNS.reg</code> to generate a nonlinear and mixture regression for comparison. FALSE is a more exhaustive search over the objective space.
<code>print.trace</code>	logical; TRUE (default) Prints current iteration information. Suggested as backup in case of error, best parameters to that point still known and copyable!
<code>ncores</code>	integer; value specifying the number of cores to be used in the parallelized procedure. If NULL (default), the number of cores to be used is equal to half the number of cores of the machine.
<code>subcores</code>	integer; value specifying the number of cores to be used in the parallelized procedure in the subroutine NNS.ARMA . If NULL (default), the number of cores to be used is equal to half the number of cores of the machine - 1.

Value

Returns a list containing:

- `$period` a vector of optimal seasonal periods
- `$weights` the optimal weights of each seasonal period between an equal weight or NULL weighting
- `$obj.fn` the minimum objective function value
- `$method` the method identifying which [NNS.ARMA](#) method was used.
- `$ensemble` a logical indicator representing whether the ensemble method using a naive [NNS.ARMA](#) with `best.periods = length(seasonal.factor)` generated a better `obj.fn` result.

Note

The number of combinations will grow prohibitively large, they should be kept as small as possible. `seasonal.factor` containing an element too large will result in an error. Please reduce the maximum `seasonal.factor`.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viola, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
## Nonlinear NNS.ARMA period optimization using 2 yearly lags on AirPassengers monthly data
## Not run:
nns.optims <- NNS.ARMA.optim(AirPassengers[1:132], training.set = 120,
seasonal.factor = seq(12, 24, 6))

## Then use optimal parameters in NNS.ARMA to predict 12 periods in-sample
NNS.ARMA(AirPassengers, h = 12, training.set = 132,
seasonal.factor = nns.optims$periods, method = nns.optims$method)

## If {$ensemble == TRUE} then take the mean of both forecasts, using {best.periods = length(seasonal.factor)}
in the {NNS.ARMA} function.

## Using optimized paramaters from {NNS.ARMA.optim}
nns.estimates.1 <- NNS.ARMA(AirPassengers, h = 12, training.set = 132,
seasonal.factor = nns.optims$periods, method = nns.optims$method)

## Using all {seasonal.factor} considered in {NNS.ARMA.optim}
nns.estimates.2 <- NNS.ARMA(AirPassengers, h = 12, training.set = 132,
seasonal.factor = FALSE, best.periods = length(seq(12,24,6)), method = nns.optims$method)

## Combined estimates
nns.combined.estimate <- rowMeans(cbind(nns.estimates.1, nns.estimates.2))

## End(Not run)
```

NNS.boost

NNS Boost

Description

Ensemble method for classification using the predictions of the NNS multivariate regression [NNS.reg](#) collected from uncorrelated feature combinations.

Usage

```
NNS.boost(IVs.train, DV.train, IVs.test, representative.sample = TRUE,
depth = NULL, n.best = 3, learner.trials = NULL, epochs = NULL,
CV.size = 0.25, threshold = NULL,
obj.fn = expression(mean(round(predicted) == as.numeric(actual))),
objective = "max", extreme = FALSE, feature.importance = TRUE,
status = TRUE, ncores = NULL, subcores = NULL)
```


Arguments

<code>IVs.train</code>	a matrix or data frame of variables of numeric or factor data types.
<code>DV.train</code>	a numeric or factor vector with compatible dimensions to <code>(IVs.train)</code> .
<code>IVs.test</code>	a matrix or data frame of variables of numeric or factor data types with compatible dimensions to <code>(IVs.train)</code> .
<code>representative.sample</code>	logical; TRUE (default) Reduces observations of <code>IVs.train</code> to a set of representative observations per regressor.
<code>depth</code>	integer; NULL (default) Specifies the order parameter in the <code>NNS.reg</code> routine, assigning a number of splits in the regressors. (<code>depth = "max"</code>) will be significantly faster, but increase the variance of results.
<code>n.best</code>	integer; 3 (default) Sets the number of nearest regression points to use in weighting for multivariate regression at <code>sqrt(# of regressors)</code> . Analogous to <code>k</code> in a <code>k</code> Nearest Neighbors algorithm.
<code>learner.trials</code>	integer; NULL (default) Sets the number of trials to obtain an accuracy threshold level. Number of observations in the training set is the default setting.
<code>epochs</code>	integer; <code>2*length(DV.train)</code> (default) Total number of feature combinations to run.
<code>CV.size</code>	numeric [0, 1]; <code>(CV.size = .25)</code> (default) Sets the cross-validation size. Defaults to 0.25 for a 25 percent random sampling of the training set.
<code>threshold</code>	numeric [0, 1]; NULL (default) Sets the <code>obj.fn</code> accuracy threshold to keep feature combinations.
<code>obj.fn</code>	expression; <code>expression(mean(round(predicted)==as.numeric(actual)))</code> (default) Mean accuracy is the default objective function. Any <code>expression()</code> using the specific terms <code>predicted</code> and <code>actual</code> can be used.
<code>objective</code>	options: ("min", "max") "max" (default) Select whether to minimize or maximize the objective function <code>obj.fn</code> .
<code>extreme</code>	logical; FALSE (default) Uses the maximum (minimum) threshold obtained from the <code>learner.trials</code> , rather than the upper (lower) quintile level for maximization (minimization) objective.
<code>feature.importance</code>	logical; TRUE (default) Plots the frequency of features used in the final estimate.
<code>status</code>	logical; TRUE (default) Prints status update message in console.
<code>ncores</code>	integer; value specifying the number of cores to be used in the parallelized procedure. If NULL (default), the number of cores to be used is equal to half the number of cores of the machine.
<code>subcores</code>	integer; value specifying the number of cores to be used in the parallelized procedure in the subroutine <code>NNS.reg</code> . If NULL (default), the number of cores to be used is equal to half the number of cores of the machine - 1.

Value

Returns a vector of fitted values for the dependent variable test set `$results`, and the final feature loadings `$feature.weights`.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. (2016) "Classification Using NNS Clustering Analysis" <https://ssrn.com/abstract=2864711>

Examples

```
## Using 'iris' dataset where test set [IVs.test] is 'iris' rows 141:150.
## Not run:
a <- NNS.boost(iris[1:140, 1:4], iris[1:140, 5],
IVs.test = iris[141:150, 1:4],
epochs = 100, learner.trials = 100)

## Test accuracy
mean(round(a$results)==as.numeric(iris[141:150,5]))

## End(Not run)
```

NNS.caus	<i>NNS Causation</i>
----------	----------------------

Description

Returns the causality from observational data between two variables.

Usage

```
NNS.caus(x, y, factor.2.dummy = TRUE, tau, time.series = FALSE,
plot = FALSE)
```

Arguments

x	a numeric vector, matrix or data frame.
y	NULL (default) or a numeric vector with compatible dimensions to x.
factor.2.dummy	logical; TRUE (default) Automatically augments variable matrix with numerical dummy variables based on the levels of factors. Includes dependent variable y.
tau	options: ("cs", "ts", integer); Number of lagged observations to consider (for time series data). Otherwise, set (tau = "cs") for cross-sectional data. (tau = "ts") automatically selects the lag of the time series data, while (tau = [integer]) specifies a time series lag.
time.series	logical; FALSE (default) If analyzing time series data with tau = [integer], select (time.series = TRUE). Not required when (tau = "ts").
plot	logical; FALSE (default) Plots the raw variables, tau normalized, and cross-normalized variables.

Value

Returns the directional causation ($x \rightarrow y$) or ($y \rightarrow x$) and net quantity of association. For causal matrix, directional causation is returned as ([column variable] \rightarrow [row variable]). Negative numbers represent causal direction attributed to [row variable].

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
## x clearly causes y...
## Not run:
set.seed(123)
x <- rnorm(100) ; y <- x ^ 2
NNS.caus(x, y, tau = "cs")

x <- 1:100 ; y <- x^2
NNS.caus(x, y, tau = "ts", time.series = TRUE)

## Causal matrix
NNS.caus(data.matrix(iris), tau = 0)

## End(Not run)
```

NNS.cor

NNS Correlation

Description

Returns the nonlinear correlation between two variables based on higher order partial moment matrices measured by frequency or area.

Usage

```
NNS.cor(x, y = NULL, order = NULL, degree = NULL)
```

Arguments

x	a numeric vector, matrix or data frame.
y	NULL (default) or a numeric vector with compatible dimensions to x.
order	integer; Controls the level of quadrant partitioning. Defaults to (order = NULL). Errors can generally be rectified by setting (order = 1).
degree	integer; (degree = 0) is frequency based correlations, while (degree = 1) is for area based correlations. Defaults to (degree = 0) for smaller number of observations.

Value

Returns nonlinear correlation coefficient between two variables, or nonlinear correlation matrix for matrix input.

Note

p-values and confidence intervals can be obtained from sampling random permutations of `y_p` and running `NNS.dep(x, y_p)` to compare against a null hypothesis of 0 correlation or dependence between `x`, `y`.

See [NNS.dep](#) for examples.

Author(s)

Fred Violo, OVVO Financial Systems

References

Violo, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
## Pairwise Correlation
x <- rnorm(100) ; y <- rnorm(100)
NNS.cor(x, y)

## Correlation Matrix
x <- rnorm(100) ; y <- rnorm(100) ; z<-rnorm(100)
B <- cbind(x, y, z)
NNS.cor(B)
```

NNS.cor.hd

NNS Co-Partial Moments Higher Dimension Correlation

Description

Determines higher dimension correlation coefficients based on degree 0 co-partial moments.

Usage

```
NNS.cor.hd(x, plot = FALSE, independence.overlay = FALSE)
```

Arguments

<code>x</code>	a numeric matrix or data frame.
<code>plot</code>	logical; FALSE (default) Generates a 3d scatter plot with regression points using plot3d .
<code>independence.overlay</code>	logical; FALSE (default) Creates and overlays independent Co.LPM and Co.UPM regions to visually reference the difference in dependence from the data.frame of variables being analyzed. Under independence, the light green and red shaded areas would be occupied by green and red data points respectively.

Value

Returns multivariate nonlinear correlation coefficient

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. (2016) "Beyond Correlation: Using the Elements of Variance for Conditional Means and Probabilities" <http://ssrn.com/abstract=2745308>.

Examples

```
set.seed(123)
x <- rnorm(1000) ; y <- rnorm(1000) ; z <- rnorm(1000)
A <- data.frame(x, y, z)
NNS.cor.hd(A, plot = TRUE, independence.overlay = TRUE)
```

NNS.dep

NNS Dependence

Description

Returns the dependence and nonlinear correlation between two variables based on higher order partial moment matrices measured by frequency or area.

Usage

```
NNS.dep(x, y = NULL, order = NULL, degree = NULL,
        print.map = FALSE, ncores = NULL)
```

Arguments

x	a numeric vector, matrix or data frame.
y	NULL (default) or a numeric vector with compatible dimensions to x.
order	integer; Controls the level of quadrant partitioning. Defaults to (order = NULL). Errors can generally be rectified by setting (order = 1). Will not partition further if less than 4 observations exist in a quadrant.
degree	integer; Defaults to NULL to allow number of observations to be "degree" determinant.
print.map	logical; FALSE (default) Plots quadrant means.
ncores	integer; value specifying the number of cores to be used in the parallelized procedure. If NULL (default), the number of cores to be used is equal to the number of cores of the machine - 1.

Value

Returns the bi-variate "Correlation" and "Dependence" or correlation / dependence matrix for matrix input.

Note

p-values and confidence intervals can be obtained from sampling random permutations of y_p and running `NNS.dep(x, y_p)` to compare against a null hypothesis of 0 correlation or dependence between x, y .

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.dep(x, y)

## Correlation / Dependence Matrix
x <- rnorm(100) ; y <- rnorm(100) ; z <- rnorm(100)
B <- cbind(x, y, z)
NNS.dep(B)

## Not run:
## p-values for [NNS.dep]
x=seq(-5,5,.1);y=x^2+rnorm(length(x))

nns_cor_dep = NNS.dep(x,y,print.map = TRUE)
nns_cor_dep

## Create permutations of y
y_p = replicate(1000,sample.int(length(y)))

## Generate new correlation and dependence measures on each new permutation of y
nns.mc = apply(y_p,2,function(g) NNS.dep(x,y[g]))

## Store results
cors = unlist(lapply(nns.mc, "[",1))
deps = unlist(lapply(nns.mc, "[",2))

## View results
hist(cors)
hist(deps)

## Left tailed correlation p-value
cor_p_value = LPM(0,nns_cor_dep$Correlation,cors)
cor_p_value

## Right tailed correlation p-value
cor_p_value = UPM(0,nns_cor_dep$Correlation,cors)
cor_p_value

## Two sided correlation p-value
```

```

cor_p_value = UPM(0,abs(nns_cor_dep$Correlation),abs(cors))
cor_p_value

## Left tailed dependence p-value
dep_p_value = LPM(0,nns_cor_dep$Dependence,deps)
dep_p_value

## Right tailed dependence p-value
dep_p_value = UPM(0,nns_cor_dep$Dependence,deps)
dep_p_value

## Confidence Intervals
## For 95th percentile VaR (both-tails) see [LPM.VaR] and [UPM.VaR]
## Lower CI
LPM.VaR(.975,0,cors)
## Upper CI
UPM.VaR(.975,0,cors)

## End(Not run)

```

NNS.dep.base

NNS Dependence Base

Description

Internal function for NNS dependence [NNS.dep](#) parallel instances.

Usage

```

NNS.dep.base(x, y = NULL, order = NULL, degree = NULL,
  print.map = FALSE)

```

Arguments

x	from NNS.part
y	from NNS.part
order	from NNS.part
degree	from NNS.part
print.map	from NNS.part

Value

Returns NNS dependence.

NNS.diff

NNS Numerical Differentiation

Description

Determines numerical derivative of a given function using projected secant lines on the y-axis. These projected points infer finite steps h , in the finite step method.

Usage

```
NNS.diff(f, point, h = 0.1, tol = 1e-10, print.trace = FALSE)
```

Arguments

<code>f</code>	an expression or call or a formula with no lhs.
<code>point</code>	numeric; Point to be evaluated for derivative of a given function <code>f</code> .
<code>h</code>	numeric [0, ...]; Initial step for secant projection. Defaults to ($h = 0.1$).
<code>tol</code>	numeric; Sets the tolerance for the stopping condition of the inferred h . Defaults to ($tol = 1e-10$).
<code>print.trace</code>	logical; FALSE (default) Displays each iteration, lower y-intercept, upper y-intercept and inferred h .

Value

Returns a matrix of values, intercepts, derivatives, inferred step sizes for multiple methods of estimation.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
f <- function(x) sin(x) / x
NNS.diff(f, 4.1)
```

NNS.distance	<i>NNS Distance</i>
--------------	---------------------

Description

Internal function for NNS multivariate regression [NNS.reg](#) parallel instances.

Usage

```
NNS.distance(rpm, dist.estimate, type, k)
```

Arguments

rpm	REGRESSION.POINT.MATRIX from NNS.reg
dist.estimate	Vector to generate distances from.
type	"L1" or "L2"
k	n.best from NNS.reg

Value

Returns sum of weighted distances.

NNS.FSD	<i>NNS FSD Test</i>
---------	---------------------

Description

Bi-directional test of first degree stochastic dominance using lower partial moments.

Usage

```
NNS.FSD(x, y, type = "discrete")
```

Arguments

x	a numeric vector.
y	a numeric vector.
type	options: ("discrete", "continuous"); "discrete" (default) selects the type of CDF.

Value

Returns one of the following FSD results: "X FSD Y", "Y FSD X", or "NO FSD EXISTS".

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Viole, F. (2017) "A Note on Stochastic Dominance." <https://ssrn.com/abstract=3002675>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.FSD(x, y)
```

NNS.FSD.uni

NNS FSD Test uni-directional

Description

Uni-directional test of first degree stochastic dominance using lower partial moments used in SD Efficient Set routine.

Usage

```
NNS.FSD.uni(x, y, type = "discrete")
```

Arguments

x	a numeric vector.
y	a numeric vector.
type	options: ("discrete", "continuous"); "discrete" (default) selects the type of CDF.

Value

Returns (1) if "X FSD Y", else (0).

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Viole, F. (2017) "A Note on Stochastic Dominance." <https://ssrn.com/abstract=3002675>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.FSD.uni(x, y)
```

NNS.normNNS Normalization

Description

Normalizes a matrix of variables based on nonlinear scaling normalization method.

Usage

```
NNS.norm(A, linear = FALSE, chart.type = NULL, location = "topleft")
```

Arguments

A	a numeric matrix or data frame.
linear	logical; FALSE (default) Performs a linear scaling normalization, resulting in equal means for all variables.
chart.type	options: ("l", "b"); NULL (default). Set (chart.type = "l") for line, (chart.type = "b") for boxplot.
location	Sets the legend location within the plot, per the x and y co-ordinates used in base graphics legend .

Value

Returns a [data.frame](#) of normalized values.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y<-rnorm(100)
A <- cbind(x, y)
NNS.norm(A)
```

NNS.part

*NNS Partition Map***Description**

Creates partitions based on partial moment quadrant means, iteratively assigning identifications to observations based on those quadrants (unsupervised partitional and hierarchial clustering method). Basis for correlation [NNS.cor](#), dependence [NNS.dep](#), regression [NNS.reg](#) routines.

Usage

```
NNS.part(x, y, Voronoi = FALSE, type = NULL, order = NULL,
  obs.req = 8, min.obs.stop = FALSE, noise.reduction = "mean")
```

Arguments

x	a numeric vector.
y	a numeric vector with compatible dimensions to x.
Voronoi	logical; FALSE (default) Displays a Voronoi type diagram using partial moment quadrants.
type	NULL (default) Controls the partitioning basis. Set to (type = "XONLY") for X-axis based partitioning. Defaults to NULL for both X and Y-axis partitioning.
order	integer; Number of partial moment quadrants to be generated. (order = "max") will institute a perfect fit.
obs.req	integer; (8 default) Required observations per cluster where quadrants will not be further partitioned if observations are not greater than the entered value. Reduces minimum number of necessary observations in a quadrant to 1 when (obs.req = 1).
min.obs.stop	logical; FALSE (default) Stopping condition where quadrants will not be further partitioned if a single cluster contains less than the entered value of obs.req.
noise.reduction	the method of determing regression points options: ("mean", "median", "mode", "off"); (noise.reduction = "median") uses medians instead of means for partitions, while (noise.reduction = "mode") uses modes instead of means for partitions. Defaults to (noise.reduction = "mean"), while (noise.reduction = "off") will partition quadrant to a single observation for a given (order = ...).

Value

Returns:

- "dt" a [data.table](#) of x and y observations with their partition assignment "quadrant" in the 3rd column and their prior partition assignment "prior.quadrant" in the 4th column.
- "regression.points" the [data.table](#) of regression points for that given (order = ...).
- "order" the order of the final partition given "min.obs.stop" stopping condition.

Author(s)

Fred Viole, OVVO Financial Systems

References

Violo, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.part(x, y)

## Data.table of observations and partitions
NNS.part(x, y, order = 1)$dt

## Regression points
NNS.part(x, y, order = 1)$regression.points

## Voronoi style plot
NNS.part(x, y, Voronoi = TRUE)

## Examine final counts by quadrant
DT <- NNS.part(x, y)$dt
DT[, counts := .N, by = quadrant]
DT
```

NNS.PDF

NNS PDF

Description

This function generates an empirical PDF using continuous CDFs from [LPM.ratio](#).

Usage

```
NNS.PDF(variable, degree = 1, target = NULL, bins = NULL,
        plot = TRUE)
```

Arguments

variable	a numeric vector.
degree	integer; (degree = 0) is frequency, (degree = 1) (default) is area.
target	a numeric range of values [a,b] where a < b. NULL (default) uses the variable observations.
bins	numeric; NULL (default) Selects number of observations as default bins.
plot	logical; plots PDF.

Value

Returns a data.table containing the intervals used and resulting PDF of the variable.

Author(s)

Fred Violo, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)
NNS.PDF(x)

## Custom target range
NNS.PDF(x, target = c(-5, 5))
```

NNS.reg

NNS Regression

Description

Generates a nonlinear regression based on partial moment quadrant means.

Usage

```
NNS.reg(x, y, factor.2.dummy = TRUE, order = NULL, stn = 0.95,
  dim.red.method = NULL, tau = NULL, type = NULL, point.est = NULL,
  location = "top", return.values = TRUE, plot = TRUE,
  plot.regions = FALSE, residual.plot = TRUE, std.errors = FALSE,
  confidence.interval = NULL, threshold = 0, n.best = NULL,
  noise.reduction = "mean", norm = NULL, dist = "L2",
  ncores = NULL, multivariate.call = FALSE)
```

Arguments

x	a vector, matrix or data frame of variables of numeric or factor data types.
y	a numeric or factor vector with compatible dimensions to x.
factor.2.dummy	logical; TRUE (default) Automatically augments variable matrix with numerical dummy variables based on the levels of factors.
order	integer; Controls the number of partial moment quadrant means. Users are encouraged to try different (order = ...) integer settings with (noise.reduction = "off"). (order = "max") will force a limit condition perfect fit.
stn	numeric [0, 1]; Signal to noise parameter, sets the threshold of (NNS.dep) which reduces ("order") when (order = NULL). Defaults to 0.95 to ensure high dependence for higher ("order") and endpoint determination.
dim.red.method	options: ("cor", "NNS.dep", "NNS.caus", "all", NULL) method for determining synthetic X* coefficients. Selection of a method automatically engages the dimension reduction regression. The default is NULL for full multivariate regression. (dim.red.method = "NNS.dep") uses NNS.dep for nonlinear dependence weights, while (dim.red.method = "NNS.caus") uses NNS.caus for causal weights. (dim.red.method = "cor") uses standard linear correlation for weights. (dim.red.method = "all") averages all methods for further feature engineering.

tau	options("ts", NULL); NULL (default) To be used in conjunction with (dim.red.method = "NNS.caus") or (dim.red.method = "all"). If the regression is using time-series data, set (tau = "ts") for more accurate causal analysis.
type	NULL (default). To perform a classification, set to (type = "CLASS").
point.est	a numeric or factor vector with compatible dimensions to x. Returns the fitted value y.hat for any value of x.
location	Sets the legend location within the plot, per the x and y co-ordinates used in base graphics legend .
return.values	logical; TRUE (default), set to FALSE in order to only display a regression plot and call values as needed.
plot	logical; TRUE (default) To plot regression.
plot.regions	logical; FALSE (default). Generates 3d regions associated with each regression point for multivariate regressions. Note, adds significant time to routine.
residual.plot	logical; TRUE (default) To plot y.hat and Y.
std.errors	logical; FALSE (default) To provide standard errors of each linear segment in the "Fitted.xy" output.
confidence.interval	numeric [0, 1]; NULL (default) Plots the associated confidence interval with the estimate and reports the standard error for each individual segment.
threshold	numeric [0, 1]; (threshold = 0) (default) Sets the threshold for dimension reduction of independent variables when (dim.red.method) is not NULL.
n.best	integer; NULL (default) Sets the number of nearest regression points to use in weighting for multivariate regression at sqrt(# of regressors). (n.best = "all") will select and weight all generated regression points. Analogous to k in a k Nearest Neighbors algorithm. Different values of n.best are tested using cross-validation in NNS.stack .
noise.reduction	the method of determining regression points options: ("mean", "median", "mode", "off"); In low signal:noise situations, (noise.reduction = "mean") uses means for NNS.dep restricted partitions, (noise.reduction = "median") uses medians instead of means for NNS.dep restricted partitions, while (noise.reduction = "mode") uses modes instead of means for NNS.dep restricted partitions. (noise.reduction = "off") allows for maximum possible fit with a specific order.
norm	NULL (default) the method of normalization options: ("NNS", "std"); Normalizes x between 0 and 1 for multivariate regression when set to (norm = "std"), or normalizes x according to NNS.norm when set to (norm = "NNS").
dist	options:("L1", "L2") the method of distance calculation; Selects the distance calculation used. dist = "L2" (default) selects the Euclidean distance and (dist = "L1") selects the Manhattan distance.
ncores	integer; value specifying the number of cores to be used in the parallelized procedure. If NULL (default), the number of cores to be used is equal to the number of cores of the machine - 1.
multivariate.call	Internal parameter for multivariate regressions.

Value

UNIVARIATE REGRESSION RETURNS THE FOLLOWING VALUES:

- "R2" provides the goodness of fit;
- "SE" returns the overall standard error of the estimate between y and \hat{y} ;
- "Prediction.Accuracy" returns the correct rounded "Point.est" used in classifications versus the categorical y ;
- "derivative" for the coefficient of the x and its applicable range;
- "Point" returns the x point(s) being evaluated;
- "Point.est" for the predicted value generated;
- "regression.points" provides the points used in the regression equation for the given order of partitions;
- "Fitted" returns a vector containing only the fitted values, \hat{y} ;
- "Fitted.xy" returns a [data.table](#) of x, y, \hat{y} , and NNS.ID;

MULTIVARIATE REGRESSION RETURNS THE FOLLOWING VALUES:

- "R2" provides the goodness of fit;
- "equation" returns the numerator of the synthetic X^* dimension reduction equation as a [data.table](#) consisting of regressor and its coefficient. Denominator is simply the length of all coefficients > 0 , returned in last row of equation [data.table](#).
- " $x.star$ " returns the synthetic X^* as a vector;
- "rhs.partitions" returns the partition points for each regressor x ;
- "RPM" provides the Regression Point Matrix, the points for each x used in the regression equation for the given order of partitions;
- "Point.est" returns the predicted value generated;
- "Fitted" returns a vector containing only the fitted values, \hat{y} ;
- "Fitted.xy" returns a [data.table](#) of x, y, \hat{y} , gradient, and NNS.ID.

Note

Please ensure `point.est` is of compatible dimensions to x , error message will ensue if not compatible.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments" <http://amzn.com/1490523995>

Vinod, H. and Viole, F. (2017) "Nonparametric Regression Using Clusters" <https://link.springer.com/article/10.1007/s10614-017-9713-5>

Examples

```
## Not run:
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.reg(x, y)

## Manual {order} selection
```



```

NNS.reg(x, y, order = 2)

## Maximum {order} selection
NNS.reg(x, y, order = "max")

## x-only partitioning (Univariate only)
NNS.reg(x, y, type = "XONLY")

## For Multiple Regression:
x <- cbind(rnorm(100), rnorm(100), rnorm(100)) ; y <- rnorm(100)
NNS.reg(x, y, point.est = c(.25, .5, .75))

## For Multiple Regression based on Synthetic X* (Dimension Reduction):
x <- cbind(rnorm(100), rnorm(100), rnorm(100)) ; y<-rnorm(100)
NNS.reg(x, y, point.est = c(.25, .5, .75), dim.red.method = "cor")

## IRIS dataset examples:
# Dimension Reduction:
NNS.reg(iris[,1:4], iris[,5], dim.red.method = "cor", order = 5)

# Dimension Reduction using causal weights:
NNS.reg(iris[,1:4], iris[,5], dim.red.method = "NNS.caus", order = 5)

# Multiple Regression:
NNS.reg(iris[,1:4], iris[,5], order = 2, noise.reduction = "off")

# Classification:
NNS.reg(iris[,1:4], iris[,5], point.est = iris[1:10, 1:4], type = "CLASS")$Point.est

## To call fitted values:
x <- rnorm(100) ; y <- rnorm(100)
NNS.reg(x, y)$Fitted

## To call partial derivative (univariate regression only):
NNS.reg(x, y)$derivative
## End(Not run)

```

NNS.SD.efficient.set *NNS SD Efficient Set*

Description

Determines the set of stochastic dominant variables for various degrees.

Usage

```
NNS.SD.efficient.set(x, degree, type = "discrete")
```

Arguments

x	a numeric matrix or data frame.
degree	numeric options: (1, 2, 3); Degree of stochastic dominance test from (1, 2 or 3).
type	options: ("discrete", "continuous"); "discrete" (default) selects the type of CDF.

Value

Returns set of stochastic dominant variable names.

Author(s)

Fred Violo, OVVO Financial Systems

References

Violo, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Violo, F. (2017) "A Note on Stochastic Dominance." <https://ssrn.com/abstract=3002675>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y<-rnorm(100) ; z<-rnorm(100)
A <- cbind(x, y, z)
NNS.SD.efficient.set(A, 1)
```

NNS.seas	<i>NNS Seasonality Test</i>
----------	-----------------------------

Description

Seasonality test based on the coefficient of variance for the variable and lagged component series.
A result of 1 signifies no seasonality present.

Usage

```
NNS.seas(variable, plot = TRUE)
```

Arguments

variable	a numeric vector.
plot	logical; TRUE (default) Returns the plot of all periods exhibiting seasonality and the variable level reference.

Value

Returns a matrix of all periods exhibiting less coefficient of variance than the variable with "all.periods"; and the single period exhibiting the least coefficient of variance versus the variable with "best.period".
If no seasonality is detected, NNS.seas will return ("No Seasonality Detected").

Author(s)

Fred Violo, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)

## To call strongest period based on coefficient of variance:
NNS.seas(x)$best.period
```

NNS.SSD	<i>NNS SSD Test</i>
---------	---------------------

Description

Bi-directional test of second degree stochastic dominance using lower partial moments.

Usage

```
NNS.SSD(x, y)
```

Arguments

x	a numeric vector.
y	a numeric vector.

Value

Returns one of the following SSD results: "X SSD Y", "Y SSD X", or "NO SSD EXISTS".

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.SSD(x, y)
```

NNS.SSD.uni	<i>NNS SSD Test uni-directional</i>
-------------	-------------------------------------

Description

Uni-directional test of second degree stochastic dominance using lower partial moments used in SD Efficient Set routine.

Usage

```
NNS.SSD.uni(x, y)
```

Arguments

x	a numeric vector.
y	a numeric vector.

Value

Returns (1) if "X SSD Y", else (0).

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.SSD.uni(x, y)
```

NNS.stack	<i>NNS Stack</i>
-----------	------------------

Description

Prediction model using the predictions of the NNS base models [NNS.reg](#) as features (i.e. meta-features) for the stacked model.

Usage

```
NNS.stack(IVs.train, DV.train, IVs.test = NULL,
  obj.fn = expression(sum((predicted - actual)^2)), objective = "min",
  CV.size = NULL, folds = 5, order = NULL, norm = NULL,
  method = c(1, 2), dim.red.method = "cor", status = TRUE,
  ncores = NULL)
```

Arguments

<code>IVs.train</code>	a vector, matrix or data frame of variables of numeric or factor data types.
<code>DV.train</code>	a numeric or factor vector with compatible dimensions to (<code>IVs.train</code>).
<code>IVs.test</code>	a vector, matrix or data frame of variables of numeric or factor data types with compatible dimensions to (<code>IVs.train</code>).
<code>obj.fn</code>	expression; <code>expression(sum((predicted - actual)^2))</code> (default) Sum of squared errors is the default objective function. Any <code>expression()</code> using the specific terms <code>predicted</code> and <code>actual</code> can be used.
<code>objective</code>	options: ("min", "max") "min" (default) Select whether to minimize or maximize the objective function <code>obj.fn</code> .
<code>CV.size</code>	numeric [0, 1]; NULL (default) Sets the cross-validation size if (<code>IVs.test = NULL</code>). Defaults to 0.25 for a 25 percent random sampling of the training set under (<code>CV.size = NULL</code>).
<code>folds</code>	integer; <code>folds = 5</code> (default) Select the number of cross-validation folds.
<code>order</code>	integer; NULL (default) Sets the order for NNS.reg , where (<code>order = 'max'</code>) is the k-nearest neighbors equivalent.
<code>norm</code>	options: ("std", "NNS", NULL); NULL (default) 3 settings offered: NULL, "std", and "NNS". Selects the norm parameter in NNS.reg .
<code>method</code>	numeric options: (1, 2); Select the NNS method to include in stack. (<code>method = 1</code>) selects NNS.reg ; (<code>method = 2</code>) selects NNS.reg dimension reduction regression. Defaults to <code>method = c(1, 2)</code> , including both NNS regression methods in the stack.
<code>dim.red.method</code>	options: ("cor", "NNS.dep", "NNS.caus", "all") method for determining synthetic X^* coefficients. (<code>dim.red.method = "cor"</code>) (default) uses standard linear correlation for weights. (<code>dim.red.method = "NNS.dep"</code>) uses NNS.dep for nonlinear dependence weights, while (<code>dim.red.method = "NNS.caus"</code>) uses NNS.caus for causal weights. (<code>dim.red.method = "all"</code>) averages all methods for further feature engineering.
<code>status</code>	logical; TRUE (default) Prints status update message in console.
<code>ncores</code>	integer; value specifying the number of cores to be used in the parallelized subroutine NNS.reg . If NULL (default), the number of cores to be used is equal to half the number of cores of the machine - 1.

Value

Returns a vector of fitted values for the dependent variable test set for all models.

- "[NNS.reg.n.best](#)" returns the optimum "n.best" parameter for the [NNS.reg](#) multivariate regression. "[SSE.reg](#)" returns the SSE for the [NNS.reg](#) multivariate regression.
- "[OBJfn.reg](#)" returns the `obj.fn` for the [NNS.reg](#) regression.
- "[NNS.dim.red.threshold](#)" returns the optimum "threshold" from the [NNS.reg](#) dimension reduction regression.
- "[OBJfn.dim.red](#)" returns the `obj.fn` for the [NNS.reg](#) dimension reduction regression.
- "[reg](#)" returns [NNS.reg](#) output.
- "[dim.red](#)" returns [NNS.reg](#) dimension reduction regression output.
- "[stack](#)" returns the output of the stacked model.

Note

If character variables are used, transform them first to factors using `as.factor`, or `data.matrix` to ensure overall dataset is numeric. A multifunction `sapply` can also be applied to the overall dataset: `data <- sapply(data, function(x){as.factor(x) ; as.numeric(x)})`. Then run `NNS.stack` with transformed variables.

Missing data should be handled prior as well using `na.omit` or `complete.cases` on the full dataset.

If error received:

```
"Error in is.data.frame(x) : object 'RP' not found"
```

reduce the CV.size.

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. (2016) "Classification Using NNS Clustering Analysis" <https://ssrn.com/abstract=2864711>

Examples

```
## Using 'iris' dataset where test set [IVs.test] is 'iris' rows 141:150.
## Not run:
NNS.stack(iris[1:140, 1:4], iris[1:140, 5], IVs.test = iris[141:150, 1:4])

## Using 'iris' dataset to determine [n.best] and [threshold] with no test set.
NNS.stack(iris[, 1:4], iris[, 5])

## Selecting NNS.reg and dimension reduction techniques.
NNS.stack(iris[1:140, 1:4], iris[1:140, 5], iris[141:150, 1:4], method = c(1, 2))
## End(Not run)
```

NNS.term.matrix

NNS Term Matrix

Description

Generates a term matrix for text classification use in `NNS.reg`.

Usage

```
NNS.term.matrix(x, oos = NULL, names = FALSE)
```

Arguments

x	Text A two column dataset should be used. Concatenate text from original sources to comply with format. Also note the possibility of factors in "DV", so "as.numeric(as.character(...))" is used to avoid issues.
oos	Out-of-sample text dataset to be classified.
names	Column names for "IV" and "oos". Defaults to FALSE.

Value

Returns the text as independent variables "IV" and the classification as the dependent variable "DV". Out-of-sample independent variables are returned with "OOS".

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
x <- data.frame(cbind(c("sunny", "rainy"), c(1, -1)))
NNS.term.matrix(x)

### Concatenate Text with space separator, cbind with "DV"
x <- data.frame(cbind(c("sunny", "rainy"), c("windy", "cloudy"), c(1, -1)))
x <- data.frame(cbind(paste(x[, 1], x[, 2], sep = " "), as.numeric(as.character(x[, 3]))))
NNS.term.matrix(x)

### NYT Example
## Not run:
require(RTextTools)
data(NYTimes)

### Concatenate Columns 3 and 4 containing text, with column 5 as DV
NYT=data.frame(cbind(paste(NYTimes[, 3], NYT[, 4], sep = " "),
                        as.numeric(as.character(NYTimes[, 5]))))
NNS.term.matrix(NYT)
## End(Not run)
```

NNS.TSD

NNS TSD Test

Description

Bi-directional test of third degree stochastic dominance using lower partial moments.

Usage

```
NNS.TSD(x, y)
```

Arguments

x	a numeric vector.
y	a numeric vector.

Value

Returns one of the following TSD results: "X TSD Y", "Y TSD X", or "NO TSD EXISTS".

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.TSD(x, y)
```

NNS.TSD.uni

NNS TSD Test uni-directional

Description

Uni-directional test of third degree stochastic dominance using lower partial moments used in SD Efficient Set routine.

Usage

```
NNS.TSD.uni(x, y)
```

Arguments

x	a numeric vector.
y	a numeric vector.

Value

Returns (1) if "X TSD Y", else (0).

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2016) "LPM Density Functions for the Computation of the SD Efficient Set." Journal of Mathematical Finance, 6, 105-126. <http://www.scirp.org/Journal/PaperInformation.aspx?PaperID=63817>.

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100)
NNS.TSD.uni(x, y)
```

PM.matrix	<i>Partial Moment Matrix</i>
-----------	------------------------------

Description

This function generates a co-partial moment matrix for the specified co-partial moment.

Usage

```
PM.matrix(LPM.degree, UPM.degree, target, variable, pop.adj = FALSE)
```

Arguments

LPM.degree	integer; Degree for variable below target deviations. (degree = 0) is frequency, (degree = 1) is area.
UPM.degree	integer; Degree for variable above target deviations. (degree = 0) is frequency, (degree = 1) is area.
target	numeric; Typically the mean of Variable X for classical statistics equivalences, but does not have to be. (Vectorized) (target = "mean") will set the target as the mean of every variable.
variable	a numeric matrix or data.frame.
pop.adj	logical; FALSE (default) Adjusts the sample co-partial moment matrices for population statistics.

Value

Matrix of partial moment quadrant values. Uncalled quadrants will return a matrix of zeros.

Note

For divergent asymmetrical "D.LPM" and "D.UPM" matrices, matrix is D.LPM(column,row,...).

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100) ; y <- rnorm(100) ; z <- rnorm(100)
A <- cbind(x,y,z)
PM.matrix(LPM.degree = 1, UPM.degree = 1, target = "mean", variable = A)

## Calling Individual Partial Moment Quadrants
cov.mtx <- PM.matrix(LPM.degree = 1, UPM.degree = 1, target = "mean", variable = A)
cov.mtx$cupm
```

```
## Full covariance matrix  
cov.mtx$cov.matrix
```

UPM

Upper Partial Moment

Description

This function generates a univariate upper partial moment for any degree or target.

Usage

```
UPM(degree, target, variable)
```

Arguments

degree	integer; (degree = 0) is frequency, (degree = 1) is area.
target	numeric; Typically set to mean, but does not have to be. (Vectorized)
variable	a numeric vector.

Value

UPM of variable

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)  
x <- rnorm(100)  
UPM(0, mean(x), x)
```

UPM.ratio	<i>Upper Partial Moment RATIO</i>
-----------	-----------------------------------

Description

This function generates a standardized univariate upper partial moment for any degree or target.

Usage

```
UPM.ratio(degree, target, variable)
```

Arguments

degree	integer; (degree = 0) is frequency, (degree = 1) is area.
target	numeric; Typically set to mean, but does not have to be. (Vectorized)
variable	a numeric vector.

Value

Standardized UPM of variable

Author(s)

Fred Viole, OVVO Financial Systems

References

Viole, F. and Nawrocki, D. (2013) "Nonlinear Nonparametric Statistics: Using Partial Moments"
<http://amzn.com/1490523995>

Examples

```
set.seed(123)
x <- rnorm(100)
UPM.ratio(0, mean(x), x)

## Joint Upper CDF
## Not run:
x <- rnorm(5000) ; y <- rnorm(5000)
plot3d(x, y, Co.UPM(0, 0, sort(x), sort(y), x, y), col = "blue", xlab = "X", ylab = "Y",
zlab = "Probability", box = FALSE)

## End(Not run)
```

`UPM.VaR`*UPM VaR*

Description

Generates an upside VaR based on the Upper Partial Moment ratio

Usage

```
UPM.VaR(percentile, degree, x)
```

Arguments

<code>percentile</code>	numeric [0, 1]; The percentile for right-tail VaR.
<code>degree</code>	integer; (<code>degree = 0</code>) for discrete distributions, (<code>degree = 1</code>) for continuous distributions.
<code>x</code>	a numeric vector.

Value

Returns a numeric value representing the point at which "percentile" of the area of x is below.

Examples

```
set.seed(123)
x <- rnorm(100)

## For 95th percentile VaR (right-tail)
UPM.VaR(0.95, 0, x)
```

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