# Package 'facmodCS' 

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Title Cross-Section Factor Models
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Description Linear cross-section factor model fitting with least-squares and robust fitting the 'lmrobdetMM()' function from 'RobStatTM'; related volatility, Value at Risk and Expected Shortfall risk and performance attribution (factor-contributed vs idiosyncratic returns); tabular displays of risk and performance reports; factor model Monte Carlo. The package authors would like to thank Chicago Research on Security Prices,LLC for the cross-section of about 300
CRSP stocks data (in the data.table object 'stocksCRSP', and S\&P GLOBAL MARKET
INTELLIGENCE for contributing 14 factor scores (a.k.a `alpha factors".and "factor exposures") fundamental data on the 300 companies in the data.table object 'factorSPGMI'. The 'stocksCRSP' and 'factorsSPGMI' data are not covered by the GPL-2 license, are not provided as open source of any kind, and they are not to be redistributed in any form.
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Imports data.table, xts, zoo, PerformanceAnalytics, lattice, methods, sn, tseries, robustbase, RobStatTM,
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```
    calcFLAM calcFLAM
```


## Description

function to calculate fundamental law of active management

```
Usage
    calcFLAM(
        specObj,
        modelStats,
        fitResults,
        analysis = c("ISM", "NEW"),
        targetedVol = 0.06,
    )
```


## Arguments

specObj an object as the output from specFfm function
modelStats output of the extractRegressionStats functions. Contains fit statistics of the factor model.
fitResults output from fitFfmDT
analysis type character, choice of c("none", "ISM","NEW"). Default = "none". Corresponds to methods used in the analysis of fundamental law of active management.
targetedVol numeric; the targeted portfolio volatility in the analysis. Default is 0.06 .
... additional arguments
convert convert

## Description

function to convert the new ffm spec object to ffm object to make it easier in plotting and reporting

## Usage

convert(SpecObj, FitObj, RegStatsObj, ...)

## Arguments

| SpecObj | an object as the output from specFfm function |
| :--- | :--- |
| FitObj | an object as the output from fitFfmDT function |
| RegStatsObj | an object as the output from extractRegressionStats function |
| $\ldots$ | additional arguments |

## Value

returns an object of class ffm

## Description

Function to convert to current class \# mido to change to retroFit

## Usage

\#\# S3 method for class 'ffmSpec'
convert(SpecObj, FitObj, RegStatsObj, ...)

## Arguments

| SpecObj | an object as the output from specFfm function |
| :--- | :--- |
| FitObj | an object as the output from fitFfmDT function |
| RegStatsObj | an object as the output from extractRegressionStats function |
| $\ldots$ | additional arguments |

Value
returns an object of class ffm

## Description

Density, distribution function, quantile function and random generation using Cornish-Fisher approximation.

## Usage

dCornishFisher(x, n, skew, ekurt)
pCornishFisher(q, n, skew, ekurt)
qCornishFisher(p, n, skew, ekurt)
rCornishFisher(n, sigma, skew, ekurt, $d p=$ NULL, seed $=$ NULL)

## Arguments

$x, q \quad$ vector of standardized quantiles.
$\mathrm{n} \quad$ scalar; number of simulated values in random simulation, sample length in density, distribution and quantile functions.
skew scalar; skewness.
ekurt scalar; excess kurtosis.
$p \quad$ vector of probabilities.
sigma scalar standard deviation.
dp a vector of length 3 , whose elements represent sigma, skew and ekurt, respectively. If dp is specified, the individual parameters cannot be set. Default is NULL.
seed scalar; set seed. Default is NULL.

## Details

$\operatorname{CDF}(\mathrm{q})=\operatorname{Pr}\left(\mathrm{sqrt}(\mathrm{n})^{*}\left(\mathrm{x} \_\right.\right.$bar-mu)$/$sigma $\left.<\mathrm{q}\right)$ dCornishFisher Computes Cornish-Fisher density from two term Edgeworth expansion given mean, standard deviation, skewness and excess kurtosis. pCornishFisher Computes Cornish-Fisher CDF from two term Edgeworth expansion given mean, standard deviation, skewness and excess kurtosis. qCornishFisher Computes CornishFisher quantiles from two term Edgeworth expansion given mean, standard deviation, skewness and excess kurtosis. rCornishFisher simulates observations based on Cornish-Fisher quantile expansion given mean, standard deviation, skewness and excess kurtosis.

## Value

dCornishFisher gives the density, pCornishFisher gives the distribution function, qCornishFisher gives the quantile function, and rCornishFisher generates n random simulations.

## Author(s)

Eric Zivot and Yi-An Chen.

## References

DasGupta, A. (2008). Asymptotic theory of statistics and probability. Springer. Severini, T. A., (2000). Likelihood Methods in Statistics. Oxford University Press.

## Examples

```
# generate 1000 observation from Cornish-Fisher distribution
rc <- rCornishFisher(1000,1,0,5)
hist(rc, breaks=100, freq=FALSE,
    main="simulation of Cornish Fisher Distribution", xlim=c(-10,10))
lines(seq(-10,10,0.1), dnorm(seq(-10,10,0.1), mean=0, sd=1), col=2)
# compare with standard normal curve
# exponential example from A.dasGupta p. }18
# x is iid exp(1) distribution, sample size = 5
# then x_bar is Gamma(shape=5, scale=1/5) distribution
q <- c(0,0.4,1,2)
# exact cdf
pgamma(q/sqrt(5)+1, shape=5, scale=1/5)
# use CLT
pnorm(q)
# use edgeworth expansion
pCornishFisher(q, n=5, skew=2, ekurt=6)
```

```
extractRegressionStats
```

extractRegressionStats

## Description

function to compute or Extract objects to be returned

## Usage

extractRegressionStats(specObj, fitResults, full.resid.cov = FALSE)

## Arguments

specObj fitFM object that has been already fit
fitResults output from fitFfmDT
full. resid.cov an option to calculate the full residual covariance or not

## Details

this function operates on the specObje data and the output of fitFfm to get information on the fundamental factor.

## Value

a structure of class ffm holding all the information

## See Also

specFfm and fitFfmDT for information on the definition of the specFfm object and the usage of fitFfmDT.
fitFfm Fit a fundamental factor model using cross-sectional regression

## Description

Fit a fundamental (cross-sectional) factor model using ordinary least squares or robust regression. Fundamental factor models use observable asset specific characteristics (or) fundamentals, like industry classification, market capitalization, style classification (value, growth) etc. to calculate the common risk factors. An object of class "ffm" is returned.

## Usage

```
fitFfm(
    data,
    asset.var,
    ret.var,
    date.var,
    exposure.vars,
    weight.var = NULL,
    fit.method = c("LS", "WLS", "Rob", "W-Rob"),
    rob.stats = FALSE,
    full.resid.cov = FALSE,
    z.score = c("none", "crossSection", "timeSeries"),
    addIntercept = FALSE,
    lagExposures = TRUE,
    resid.scaleType = "stdDev",
    lambda = 0.9,
    GARCH.params = list(omega = 0.09, alpha = 0.1, beta = 0.81),
    GARCH.MLE = FALSE,
    stdReturn = FALSE,
    analysis = c("none", "ISM", "NEW"),
    targetedVol = 0.06,
)
```

```
## S3 method for class 'ffm'
coef(object, ...)
## S3 method for class 'ffm'
fitted(object, ...)
## S3 method for class 'ffm'
residuals(object, ...)
```


## Arguments

data data.frame of the balanced panel data containing the variables asset.var, ret.var, exposure.vars, date.var and optionally, weight. var.
asset.var character; name of the variable for asset names.
ret.var character; name of the variable for asset returns.
date.var character; name of the variable containing the dates coercible to class Date.
exposure.vars vector; names of the variables containing the fundamental factor exposures.
weight.var character; name of the variable containing the weights used when standarizing style factor exposures. Default is NULL. See Details.
fit.method method for estimating factor returns; one of "LS", "WLS" "Rob" or "W-Rob". See details. Default is "LS".
rob.stats logical; If TRUE, robust estimates of covariance, correlation, location and univariate scale are computed as appropriate (see Details). Default is FALSE.
full.resid.cov logical; If TRUE, a full residual covariance matrix is estimated. Otherwise, a diagonal residual covariance matrix is estimated. Default is FALSE.
z.score method for exposure standardization; one of "none", "crossSection", or "timeSeries". Default is "none".
addIntercept logical; If TRUE, intercept is added in the exposure matrix. Note, if 2 or more variables are categorical, this must be false. Default is FALSE.
lagExposures logical; If TRUE, the style exposures in the exposure matrix are lagged by one time period. Default is TRUE,
resid.scaleType
character; Only valid when fit.method is set to WLS or W-Rob. The weights used in the weighted regression are estimated using sample variance, classic EWMA, robust EWMA or GARCH model. Valid values are stdDev, EWMA, robEWMA, or GARCH.Default is stdDev where the inverse of residual sample variances are used as the weights. If using GARCH option, make sure to install and load rugarch package.
lambda lambda value to be used for the EWMA estimation of residual variances. Default is 0.9

GARCH.params list containing GARCH parameters omega, alpha, and beta. Default values are $(0.09,0.1,0.81)$ respectively. Valid only when GARCH. MLE is set to FALSE. Estimation outsourced to the rugarch package, please load it first.
\(\left.$$
\begin{array}{ll}\text { GARCH.MLE } & \begin{array}{l}\text { boolean input (TRUEIFALSE), default value = FALSE. This argument allows one } \\
\text { to choose to compute GARCH parameters by maximum likelihood estimation. }\end{array}
$$ <br>

Estimation outsourced to the rugarch package, please load it.\end{array}\right\}\)| logical; If TRUE, the returns will be standardized using GARCH(1,1) volatilities. |
| :--- |
| Default is FALSE. Make sure to load rugarch package. |
| analysis |
| method used in the analysis of fundamental law of active management; one of |
| targetedVol |
| $\ldots$ |$\quad$| "none", "ISM", or "NEW". Default is "none". |
| :--- |
| numeric; the targeted portfolio volatility in the analysis. Default is 0.06. |
| object |$\quad$| potentially further arguments passed. |
| :--- |
| a fit object of class ffm which is returned by fitFfm |

## Details

Estimation method "LS" corresponds to ordinary least squares using 1 m and "Rob" is robust regression using lmrobdetMM. "WLS" is weighted least squares using estimates of the residual variances from LS regression as weights (feasible GLS). Similarly, "W-Rob" is weighted robust regression.
The weights to be used in "WLS" or "W-Rob" can be set using resid. scaleType argument which computes the residual variances in one of the following ways - sample variace, EWMA, Robust EWMA and $\operatorname{GARCH}(1,1)$. The inverse of these residual variances are used as the weights. For EWMA model, lambda $=0.9$ is used as default and for $\operatorname{GARCH}(1,1)$ omega $=0.09$, alpha $=0.1$, and beta $=0.81$ are used as default as mentioned in Martin \& Ding (2017). These default parameters can be changed using the arguments lambda, GARCH. params for EWMA and GARCH respectively. To compute GARCH parameters via MLE, set GARCH.MLE to TRUE. Make sure you have the rugarch package installed and loaded, as is merely listed as SUGGESTS.
Standardizing style factor exposures: The exposures can be standardized into z-scores using regular or robust (see rob.stats) measures of location and scale. Further, weight.var, a variable such as market-cap, can be used to compute the weighted mean exposure, and an equal-weighted standard deviation of the exposures about the weighted mean. This may help avoid an ill-conditioned covariance matrix. Default option equally weights exposures of different assets each period.
If rob. stats=TRUE, covRob is used to compute a robust estimate of the factor covariance/correlation matrix, and, scaleTau2 is used to compute robust tau-estimates of univariate scale for residuals during "WLS" or "W-Rob" regressions. When standardizing style exposures, the median and mad are used for location and scale respectively. When resid. scaleType is EWMA or GARCH, the residual covariance is equal to the diagonal matrix of the estimated residual variances in last time period.
The original function was designed by Doug Martin and initially implemented in S-PLUS by a number of University of Washington Ph.D. students: Christopher Green, Eric Aldrich, and Yindeng Jiang. Guy Yollin ported the function to R and Yi-An Chen modified that code. Sangeetha Srinivasan re-factored, tested, corrected and expanded the functionalities and S3 methods.

## Value

fitFfm returns an object of class "ffm" for which print, plot, predict and summary methods exist.

The generic accessor functions coef, fitted and residuals extract various useful features of the fit object. Additionally, fmCov computes the covariance matrix for asset returns based on the fitted factor model.

An object of class " ffm " is a list containing the following components:

| factor.fit | list of fitted objects that estimate factor returns in each time period. Each fitted object is of class lm if fit.method="LS" or "WLS", or, class lmrobdetMM if fit.method="Rob" or "W-Rob". |
| :---: | :---: |
| beta | $\mathrm{N} x \mathrm{~K}$ matrix of factor exposures for the last time period. |
| factor.returns | xts object of K-factor returns (including intercept). |
| residuals | xts object of residuals for N -assets. |
| r2 | length-T vector of R -squared values. |
| factor.cov | $\mathrm{K} \times \mathrm{K}$ covariance matrix of the factor returns. |
| g.cov | covariance matrix of the $g$ coefficients for a Sector plus market and Sector plus Country plus global market models . |
| resid.cov | $\mathrm{N} \times \mathrm{N}$ covariance matrix of residuals. |
| return.cov | $\mathrm{N} x \mathrm{~N}$ return covariance estimated by the factor model, using the factor exposures from the last time period. |
| restriction.mat |  |
|  | The restriction matrix used in the computation of $\mathrm{f}=\mathrm{Rg}$. |
| resid.var | $\mathrm{N} x \mathrm{~T}$ matrix of estimated residual variances. It will be a length- N vector of sample residual variances when resid. scaleType is set to stdDev |
| call | the matched function call. |
| data | data frame object as input. |
| date.var | date.var as input |
| ret.var | ret.var as input |
| asset.var | asset.var as input. |
| exposure.vars | exposure.vars as input. |
| weight.var | weight.var as input. |
| fit.method | fit.method as input. |
| asset.names | length-N vector of asset names. |
| factor.names | length-K vector of factor.names. |
| time.periods | length-T vector of dates. |

Where N is the number of assets, K is the number of factors (including the intercept or dummy variables) and T is the number of unique time periods.
activeWeights active weights obtaining from the fundamental law of active management activeReturns active returns corresponding to the active weights
IR the vector of Granold-K, asymptotic IR, and finite-sample IR.
Where N is the number of assets, K is the number of factors (including the intercept or dummy variables) and T is the number of unique time periods.

## Author(s)

Sangeetha Srinivasan, Guy Yollin, Yi-An Chen, Avinash Acharya and Chindhanai Uthaisaad

## References

Menchero, J. (2010). The Characteristics of Factor Portfolios. Journal of Performance Measurement, 15(1), 52-62.
Grinold, R. C., \& Kahn, R. N. (2000). Active portfolio management (Second Ed.). New York: McGraw-Hill.

Ding, Z. and Martin, R. D. (2016). "The Fundamental Law of Active Management Redux", SSRN 2730434.

And, the following extractor functions: coef, fitted, residuals, fmCov, fmSdDecomp, fmVaRDecomp and fmEsDecomp.

## Examples

```
library(PCRA)
# load data
data(stocksCRSP)
data(factorsSPGMI)
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "CapGroupLast", "Return",
        "Ret13WkBill","MktIndexCRSP","Sector")
        factorItems <- c("BP","Beta60M","PM12M1M")
stocks_factors <- selectCRSPandSPGMI("monthly", dateRange = dateRange,
stockItems = stockItems, factorItems = factorItems, outputType ="data.table")
# fit a fundamental factor model with style variables BP and LogMktCap
fundamental_model <- fitFfm(data = stocks_factors,
    asset.var = "TickerLast",
    ret.var = "Return",
    date.var = "Date",
    exposure.vars = c("BP", "PM12M1M")
    )
    summary(fundamental_model)
# Fit a Fundamental Sector Factor Model with Intercept
    sector_model <- fitFfm(data = stocks_factors,
        asset.var = "TickerLast",
        ret.var = "Return",
        date.var = "Date",
        exposure.vars = c("Sector", "BP"),
        addIntercept = TRUE)
    summary(sector_model)
```

```
fitFfmDT fitFfmDT
```


## Description

This function fits a fundamental factor model

```
Usage
    fitFfmDT(
    ffMSpecObj,
    fit.method = c("LS", "WLS", "Rob", "W-Rob"),
    resid.scaleType = c("StdDev", "EWMA", "RobustEWMA", "GARCH"),
    lambda = 0.9,
    GARCH.params = list(omega = 0.09, alpha = 0.1, beta = 0.81),
    GARCH.MLE = FALSE,
    lmrobdet.control.para.list = lmrobdet.control(),
    )
```


## Arguments

ffMSpecObj a specFFm object
fit.method method for estimating factor returns; one of "LS", "WLS" "ROB" or "W-ROB". See details. Default is "LS".
resid.scaleType
one of 4 choices "StdDev","EWMA","RobustEWMA", "GARCH"
lambda the ewma parameter
GARCH. params list containing GARCH parameters omega, alpha, and beta. Default values are $(0.09,0.1,0.81)$ respectively. Valid only when GARCH. MLE is set to FALSE. Estimation outsourced to the rugarch package, please load it first.

GARCH.MLE boolean input (TRUEIFALSE), default value $=$ FALSE. This argument allows one to choose to compute GARCH parameters by maximum likelihood estimation. Estimation outsourced to the rugarch package, please load it.
lmrobdet.control. para.list
list of parameters to pass to lmrobdet.control(). Sets tuning parameters for the MM estimator implemented in lmrobdetMM of the RobStatTM package. See lmrobdetMM.
... additional pass through arguments

## Details

this function operates on the data inside the specObj fits a fundamental factor model to the data

## Value

fitFfm returns a list with two object of class "data.table" The first reg.listDT is object of class "data.table" is a list containing the following components:

DATE length-Time vector of dates.
id length-N vector of asset id's for each date.
reg.list list of fitted objects that estimate factor returns in each time period. Each fitted object is of class lm if fit.method="LS" or "WLS", or, class lmrobdetMM if fit.method="Rob" or "W-Rob".

The second betasDT is object of class "data. table" is a list containing the following components:
DATE length-Time vector of dates.
R_matrix The $\mathrm{K}+1$ by K restriction matrix where K is the number of categorical variables for each date.

## See Also

specFfm for information on the definition of the specFfm object.
fmCov Covariance Matrix for assets' returns from fitted factor model.

## Description

Computes the covariance matrix for assets' returns based on a fitted factor model. This is a generic function with methods for classes $t s f m, s f m$ and $f f m$.

## Usage

fmCov(object, factor.cov, ...)
\#\# S3 method for class 'ffm'
fmCov(object, factor.cov, use = "pairwise.complete.obs", ...)

## Arguments

object fit object of class tsfm, sfm or ffm.
factor.cov factor covariance matrix (optional); defaults to the sample covariance matrix.
... optional arguments passed to cov.
use method for computing covariances in the presence of missing values; one of "everything", "all.obs", "complete.obs", "na.or.complete", or "pairwise.complete.obs". Default is "pairwise.complete.obs".

## Details

$R(i, t)$, the return on asset $i$ at time $t$, is assumed to follow a factor model of the form,
$R(i, t)=\operatorname{alpha}(i)+\operatorname{beta}(i) * f(t)+e(i, t)$,
where, alpha(i) is the intercept, $f(t)$ is a $K \times 1$ vector of factor returns at time $t$, beta(i) is a $1 \times \mathrm{K}$ vector of factor exposures and the error terms $e(i, t)$ are serially uncorrelated across time and contemporaneously uncorrelated across assets so that $e(i, t) \sim \operatorname{iid}\left(0, \operatorname{sig}(i)^{\wedge} 2\right)$. Thus, the variance of asset i's return is given by
$\operatorname{var}(R(i))=\operatorname{beta}(i) * \operatorname{cov}(F) * \operatorname{tr}(\operatorname{beta}(i))+\operatorname{sig}(i)^{\wedge} 2$.
And, the $\mathrm{N} \times \mathrm{N}$ covariance matrix of asset returns is
$\operatorname{var}(R)=B * \operatorname{cov}(F) * \operatorname{tr}(B)+D$,
where, $B$ is the $N \times K$ matrix of factor betas and $D$ is a diagonal matrix with $\operatorname{sig}(i)^{\wedge} 2$ along the diagonal.
The method for computing covariance can be specified via the ... argument. Note that the default of use="pairwise.complete.obs" for handling NAs restricts the method to "pearson".

## Value

The computed $N \times N$ covariance matrix for asset returns based on the fitted factor model.

## Author(s)

Eric Zivot, Yi-An Chen and Sangeetha Srinivasan.

## References

Zivot, E., \& Jia-hui, W. A. N. G. (2006). Modeling Financial Time Series with S-Plus SpringerVerlag.

## See Also

fitFfm
cov for more details on arguments use and method.
fmEsDecomp Decompose ES into individual factor contributions

## Description

Compute the factor contributions to Expected Tail Loss or Expected Shortfall (ES) of assets' returns based on Euler's theorem, given the fitted factor model. The partial derivative of ES with respect to factor beta is computed as the expected factor return given fund return is less than or equal to its value-at-risk (VaR). Option to choose between non-parametric and Normal.

## Usage

```
fmEsDecomp(object, ...)
\#\# S3 method for class 'ffm'
fmEsDecomp(
    object,
    factor.cov,
    \(p=0.05\),
    type = c("np", "normal"),
    use = "pairwise.complete.obs",
    ...
)
```


## Arguments

object fit object of class tsfm, sfm or ffm.
... other optional arguments passed to quantile.
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.
p
tail probability for calculation. Default is 0.05 .
type one of "np" (non-parametric) or "normal" for calculating VaR. Default is "np".
use method for computing covariances in the presence of missing values; one of "everything", "all.obs", "complete.obs", "na.or.complete", or "pairwise.complete.obs". Default is "pairwise.complete.obs".

## Details

The factor model for an asset's return at time $t$ has the form
$R(t)=\operatorname{beta}^{\prime} f(t)+e(t)=$ beta.star'f.star $(t)$
where, beta.star=(beta,sig.e) and f.star $(t)=\left[f(t)^{\prime}, z(t)\right]^{\prime}$. By Euler's theorem, the ES of the asset's return is given by:

ES. $\mathrm{fm}=\operatorname{sum}\left(\mathrm{cES} \_k\right)=$ sum(beta.star_k*mES_k)
where, summation is across the K factors and the residual, cES and mES are the component and marginal contributions to ES respectively. The marginal contribution to ES is defined as the expected value of F. star, conditional on the loss being less than or equal to VaR.fm. This is estimated as a sample average of the observations in that data window.
Refer to Eric Zivot's slides (referenced) for formulas pertaining to the calculation of Normal ES (adapted from a portfolio context to factor models).

## Value

A list containing

| ES.fm | length-N vector of factor model ES of N -asset returns. |
| :--- | :--- |
| mES | $\mathrm{Nx}(\mathrm{K}+1)$ matrix of marginal contributions to VaR. |
| cES | $\mathrm{Nx}(\mathrm{K}+1)$ matrix of component contributions to VaR. |
| pcES | $\mathrm{Nx}(\mathrm{K}+1)$ matrix of percentage component contributions to VaR. |

Where, K is the number of factors and N is the number of assets.

## Author(s)

Eric Zviot, Sangeetha Srinivasan and Yi-An Chen

## References

Epperlein, E., \& Smillie, A. (2006). Portfolio risk analysis Cracking VAR with kernels. RISK-LONDON-RISK MAGAZINE LIMITED-, 19(8), 70.
Hallerback (2003). Decomposing Portfolio Value-at-Risk: A General Analysis. The Journal of Risk, 5(2), 1-18.

Meucci, A. (2007). Risk contributions from generic user-defined factors. RISK-LONDON-RISK MAGAZINE LIMITED-, 20(6), 84.
Yamai, Y., \& Yoshiba, T. (2002). Comparative analyses of expected shortfall and value-at-risk: their estimation error, decomposition, and optimization. Monetary and economic studies, 20(1), 87-121.

## See Also

fitFfm for the different factor model fitting functions.
fmSdDecomp for factor model SD decomposition. fmVaRDecomp for factor model VaR decomposition.

```
fmmcSemiParam Semi-parametric factor model Monte Carlo
```


## Description

Simulate asset returns using semi-parametric Monte Carlo, by making use of a fitted factor model. Residuals are randomly generated from a chosen parametric distribution (Normal, Cornish-Fisher or Skew-t). Factor returns are resampled through non-parametric or stationary bootstrap.

## Usage

fmmcSemiParam( $B=1000$, factor.ret, beta, alpha,
resid.par,
resid.dist = c("normal", "Cornish-Fisher", "skew-t", "empirical"),

```
    boot.method = c("random", "block"),
    seed = 123
)
```


## Arguments

B
factor.ret $\quad \mathrm{T} \times \mathrm{K}$ matrix or data.frame of factor returns having a complete history of data.
beta $\quad N \times K$ matrix of factor betas.
alpha $\quad N \times 1$ matrix of factor alphas (intercepts). If missing, these are assumed to be 0 for all funds.
resid.par matrix of parameters for the residual distribution. See Details.
resid.dist the residual distribution; one of "normal", "Cornish-Fisher" or "skew-t". Default is "normal".
boot.method the resampling method for factor returns; one of "random" or "block".
seed integer to set random number generator state before resampling factor returns.

## Details

Refer to Yindeng Jiang's PhD thesis referenced below for motivation and empirical results. An abstract can be found at [http://gradworks.umi.com/33/77/3377280.html](http://gradworks.umi.com/33/77/3377280.html).

T is the no. of observations, K is the no. of factors, N is the no. of assets or funds, P is the no. of parameters for the residual distribution and $B$ is the no. of bootstrap samples.
The columns in resid. par depend on the choice of resid.dist. If resid.dist = "normal", resid. par has one column for standard deviation. If resid.dist = "Cornish-Fisher", resid. par has three columns for sigma=standard deviation, skew=skewness and ekurt= excess kurtosis. If resid.dist = "skew-t", resid. par has four columns for $x i=l o c a t i o n, ~ o m e g a=s c a l e, ~ a l p h a=s h a p e, ~$ and $n u=$ degrees of freedom. Cornish-Fisher distribution is based on the Cornish-Fisher expansion of the Normal quantile. If resid.dist = "empirical", resid. par should be the TxN residuals retunred by the ffm object. Skew-t is the skewed Student's t-distribution- Azzalini and Captiano. The parameters can differ across funds, though the type of distribution is the same.
Bootstrap method: "random" corresponds to random sampling with replacement, and "block" corresponds to stationary block bootstrap- Politis and Romano (1994).

## Value

A list containing the following components:

```
sim.fund.ret B x N matrix of simulated fund returns.
boot.factor.ret
    B x K matrix of resampled factor returns.
    sim.residuals B XN matrix of simulated residuals.
```


## Author(s)

Eric Zivot, Yi-An Chen, Sangeetha Srinivasan.

## References

Jiang, Y. (2009). Factor model Monte Carlo methods for general fund-of-funds portfolio management. University of Washington.

## See Also

http://gradworks.umi.com/33/77/3377280.html

## Examples

```
## Not run:
#Empirical deistribution
data("factorDataSetDjia5Yrs")
exposure.vars <-
fit.ffm <- fitFfm(data = factorDataSetDjia5Yrs,
            asset.var = "TICKER",
                ret.var = "RETURN",
                date.var = "DATE",
                exposure.vars = c("P2B", "MKTCAP", "SECTOR"),
                addIntercept = FALSE)
resid.par <- fit.ffm$residuals
fmmc.returns.ffm <- fmmcSemiParam(factor.ret = fit.ffm$factor.returns,
                    beta = fit.ffm$beta,
                    resid.par = resid.par,
                    resid.dist = "empirical",
                        boot.method = "block")
## End(Not run)
```

fmRsq

Factor Model $R$-Squared and Adj $R$-Squared Values

## Description

Calcluate and plot the Factor Model R-Squared, Adjusted R-Squared for a portfolio of assets

## Usage

fmRsq( ffm0bj,
rsq = TRUE, rsqAdj = FALSE, plt.type $=2$, digits = 2, isPrint = TRUE, isPlot = TRUE, lwd = 2,

```
    stripText.cex = 1,
    axis.cex = 1,
    title = TRUE,
)
```


## Arguments

\(\left.\begin{array}{ll}ffmObj \& an object of class ffm produced by fitFfm <br>
logical; if TRUE, Factor Model R-squared values are computed for the portfolio. <br>

Default is TRUE.\end{array}\right]\)| logical; if TRUE, Adjusted R-squared values are computed for the portfolio. De- |
| :--- |
| fault is FALSE. |
| a number to indicate the type of plot for plotting Factor Model R-squared/Adj. |
| R-squared values. 1 indicates barplot, 2 indicates time series xy plot. Default is |
| 2. |

## Value

fmRsq returns the sample mean values and plots the time series of corresponding $R$ squared values and the Variance Inflation factors depending on the values of rsq, rsqAdj and VIF. The time series of the output values are also printed if isPrint is TRUE

## Author(s)

Avinash Acharya and Doug Martin

## Examples

```
#Load the data
# Fundamental Factor Model
```

```
library(PCRA)
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "Return","Sector")
factorItems <- c("BP","Beta60M","PM12M1M")
facDatIT <- selectCRSPandSPGMI("monthly",
                dateRange = dateRange,
                stockItems = stockItems,
                factorItems = factorItems,
                outputType = "data.table")
asset.var="TickerLast"
ret.var="Return"
date.var = "Date"
exposure.vars= factorItems
asset.var="TickerLast"
ret.var="Return"
date.var = "Date"
spec1 <- specFfm(data = facDatIT,asset.var = asset.var, ret.var = ret.var,
    date.var = date.var, exposure.vars = exposure.vars,weight.var = NULL,
    addIntercept = TRUE, rob.stats = FALSE)
# fit a fundamental factor model
mdlFit <- fitFfmDT(spec1)
mdlRes <- extractRegressionStats(spec1,mdlFit)
fit.cross <- convert(SpecObj = spec1,FitObj = mdlFit, RegStatsObj = mdlRes)
#Calculate and plot the portfolio R-squared values
fmRsq(fit.cross)
#Plot and print the time series of Adj R-squared and VIF values
fmRsq(fit.cross, rsqAdj=TRUE, isPrint=TRUE, plt.type = 2)
```

fmSdDecomp Decompose standard deviation into individual factor contributions

## Description

Compute the factor contributions to standard deviation (SD) of assets' returns based on Euler's theorem, given the fitted factor model.

## Usage

fmSdDecomp(object, factor.cov, ...)
\#\# S3 method for class 'ffm'
fmSdDecomp(object, factor.cov, ...)

## Arguments

object fit object of class tsfm or ffm .
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.
... optional arguments passed to cov.

## Details

The factor model for an asset's return at time $t$ has the form
$R(t)=$ beta' $^{\prime}(t)+e(t)=$ beta.star'f.star $(t)$
where, beta.star=(beta, sig.e) and f. star $(t)=[f(t) ', z(t)]^{\prime}$.
By Euler's theorem, the standard deviation of the asset's return is given as:
Sd.fm = sum(cSd_k) = sum(beta.star_k*mSd_k)
where, summation is across the $K$ factors and the residual, cSd and mSd are the component and marginal contributions to SD respectively. Computing Sd.fm and mSd is very straight forward. The formulas are given below and details are in the references. The covariance term is approximated by the sample covariance.

Sd.fm = sqrt(beta.star' ' $\operatorname{cov}$ (F.star)beta.star)
mSd $=\operatorname{cov}$ (F.star)beta.star / Sd.fm

## Value

A list containing
Sd.fm length-N vector of factor model SDs of N -asset returns.
$m S d \quad N x(K+1)$ matrix of marginal contributions to SD.
cSd $\quad \mathrm{Nx}(\mathrm{K}+1)$ matrix of component contributions to SD.
pcSd $\quad \mathrm{Nx}(\mathrm{K}+1)$ matrix of percentage component contributions to SD.
Where, K is the number of factors and N is the number of assets.

## Author(s)

Eric Zivot, Yi-An Chen and Sangeetha Srinivasan

## References

Hallerback (2003). Decomposing Portfolio Value-at-Risk: A General Analysis. The Journal of Risk, 5(2), 1-18.
Meucci, A. (2007). Risk contributions from generic user-defined factors. RISK-LONDON-RISK MAGAZINE LIMITED-, 20(6), 84.
Yamai, Y., \& Yoshiba, T. (2002). Comparative analyses of expected shortfall and value-at-risk: their estimation error, decomposition, and optimization. Monetary and economic studies, 20(1), 87-121.

## See Also

fitFfm for the different factor model fitting functions.
fmCov for factor model covariance. fmVaRDecomp for factor model VaR decomposition. fmEsDecomp for factor model ES decomposition.

fmTstats | fmTstats.ffm $t$-stats and plots for a fitted Fundamental Factor Model |
| :--- |
| object |

## Description

Calculate and plot the time series of $t$-statistic values and the number of risk indices with significant $t$-stats for a fundamental factor model of class ffm produced by fitFfm or fitFfmDT

## Usage

```
fmTstats(
    ffmObj,
    isPlot = TRUE,
    isPrint = FALSE,
    whichPlot = "tStats",
    color = c("black", "cyan"),
    lwd = 2,
    digits = 2,
    z.alpha = 1.96,
    layout = c(2, 3),
    type = "h",
    scale = "free",
    stripText.cex = 1,
    axis.cex = 1,
    title = TRUE,
)
```


## Arguments

ffmObj an object of class ffm produced by fitFfm
isPlot logical. If FALSE no plots are displayed.
isPrint logical. if TRUE, the time series of the computed factor model values is printed. Default is FALSE
whichPlot string indicating the plot(s) to be plotted. Choose from ("all", "tStats", "significantTstatsV", "significantTstatsH", "significantTstatsLikert"). Three variants of significantTstats stand for vertical, horizontal and likert barplots. Default is tStats plotting t -stats and significant t -stats with vertical bars.

| color | length 2 vector specifying the plotting color for $t$-stats plot and for barplot respectively. default is c("black", "cyan") |
| :---: | :---: |
| lwd | line width relative to the default. default is 2 . |
| digits | an integer indicating the number of decimal places to be used for rounding. default is 2 . |
| z.alpha | critical value corresponding to the confidence interval. Default is 1.96 i.e $95 \%$ C.I |
| layout | numeric vector of length 2 or 3 giving the number of columns, rows, and pages (optional) in the xyplot of t -statistics. default is $\mathrm{c}(2,3)$. |
| type | type character. Type of the xyplot of $t$-statistics; " 1 " for lines, " p " for points, " h " for histogram like (or high-density) vertical lines and " b " for both. Default is " h ". |
| scale | character. It determines how axis limits are calculated for each panel. Possible values are "same", "free" (default) and "sliced". |
| stripText.cex | a number indicating the amount by which strip text in the plot(s) should be scaled relative to the default. $1=$ default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| axis.cex | a number indicating the amount by which axis in the plot(s) should be scaled relative to the default. Default $=1.1 .5$ is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| title | logical. if TRUE, the plots will have the main title. Default is TRUE. |
|  | potentially further arguments passed. |

## Value

fmTstats plots the t-stats and significant t-stats values if isPlot is TRUE and returns a list with following components:

```
tstats an xts object of t-stats values.
z.alpha critical value corresponding to the confidence interval.
```


## Author(s)

Avinash Acharya and Doug Martin

## Examples

```
library(PCRA)
# load data
data(stocksCRSP)
data(factorsSPGMI)
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "CapGroupLast", "Return",
    "Ret13WkBill","MktIndexCRSP","Sector")
    factorItems <- c("BP","Beta60M","PM12M1M")
stocks_factors <- selectCRSPandSPGMI("monthly", dateRange = dateRange,
stockItems = stockItems, factorItems = factorItems, outputType ="data.table")
```

```
# fit a fundamental factor model with style variables BP and LogMktCap
fundamental_model <- fitFfm(data = stocks_factors,
    asset.var = "TickerLast",
    ret.var = "Return",
    date.var = "Date",
    exposure.vars = c("BP", "PM12M1M")
    )
#Compute time series of t-stats and number of significant t-stats
    stats = fmTstats(fundamental_model, isPlot = TRUE, lwd = 2, color = c("blue", "blue"),
                z.alpha = 1.96)
    # Fit a SECTOR+COUNTRY+Style model with Intercept
# Create a COUNTRY column with just 3 countries
#
    # factorDataSetDjia5Yrs$COUNTRY = rep(rep(c(rep("US", 1 ), rep("GERMANY", 1 )), 11), 60)
#
    # fit.MICM <- fitFfm(data = factorDataSetDjia5Yrs,
# asset.var = "TICKER",
# exposure.vars = c("SECTOR", "COUNTRY","P2B", "MKTCAP"),
# ret.var = "RETURN",
# date.var = "DATE",
# addIntercept = FALSE)
#
    # Load library 'HH' to access the Likert option
    # library("HH")
    stats = fmTstats(fit.MICM, isPlot = TRUE, z.alpha =1.96,
# whichPlot = "significantTstatsLikert")
```

fmVaRDecomp Decompose VaR into individual factor contributions

## Description

Compute the factor contributions to Value-at-Risk (VaR) of assets' returns based on Euler's theorem, given the fitted factor model. The partial derivative of VaR w.r.t. factor beta is computed as the expected factor return given fund return is equal to its VaR and approximated by a kernel estimator. Option to choose between non-parametric and Normal.

## Usage

fmVaRDecomp(object, ...)
\#\# S3 method for class 'ffm'
fmVaRDecomp(
object,

```
    factor.cov,
    p = 0.05,
    type = c("np", "normal"),
    use = "pairwise.complete.obs",
)
```


## Arguments

object fit object of class $t s f m, s f m$ or $f f m$.
... other optional arguments passed to quantile.
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.
p tail probability for calculation. Default is 0.05 .
type one of "np" (non-parametric) or "normal" for calculating VaR. Default is "np".
use method for computing covariances in the presence of missing values; one of "everything", "all.obs", "complete.obs", "na.or.complete", or "pairwise.complete.obs". Default is "pairwise.complete.obs".

## Details

The factor model for an asset's return at time $t$ has the form
$R(t)=$ beta' $f(t)+e(t)=$ beta.star'f.star $(t)$
where, beta.star=(beta, sig.e) and f.star $(t)=[f(t) ', z(t)] '$. By Euler's theorem, the VaR of the asset's return is given by:

VaR.fm $=$ sum(cVaR_k) $=$ sum(beta.star_k*mVaR_k)
where, summation is across the $K$ factors and the residual, cVaR and mVaR are the component and marginal contributions to VaR respectively. The marginal contribution to VaR is defined as the expectation of F.star, conditional on the loss being equal to VaR.fm. This is approximated as described in Epperlein \& Smillie (2006); a triangular smoothing kernel is used here.

Refer to Eric Zivot's slides (referenced) for formulas pertaining to the calculation of Normal VaR (adapted from a portfolio context to factor models)

Value
A list containing
VaR.fm length- N vector of factor model VaRs of N -asset returns.
n .exceed length-N vector of number of observations beyond VaR for each asset.
idx.exceed list of numeric vector of index values of exceedances.
$m V a R \quad N x(K+1)$ matrix of marginal contributions to VaR.
cVaR $\quad \mathrm{Nx}(\mathrm{K}+1)$ matrix of component contributions to VaR.
pcVaR $\quad \mathrm{Nx}(\mathrm{K}+1)$ matrix of percentage component contributions to VaR.
Where, K is the number of factors and N is the number of assets.

## Author(s)

Eric Zivot, Yi-An Chen and Sangeetha Srinivasan

## References

Hallerback (2003). Decomposing Portfolio Value-at-Risk: A General Analysis. The Journal of Risk, 5(2), 1-18.

Meucci, A. (2007). Risk contributions from generic user-defined factors. RISK-LONDON-RISK MAGAZINE LIMITED-, 20(6), 84.
Yamai, Y., \& Yoshiba, T. (2002). Comparative analyses of expected shortfall and value-at-risk: their estimation error, decomposition, and optimization. Monetary and economic studies, 20(1), 87-121.

## See Also

fitFfm for the different factor model fitting functions.
fmSdDecomp for factor model SD decomposition. fmEsDecomp for factor model ES decomposition.
lagExposures lagExposures allows the user to lag exposures by one time period

## Description

Function lag the style exposures in the exposure matrix by one time period.

## Usage

lagExposures(specObj)

## Arguments

specObj an ffm specification object of of class "ffmSpec"

## Details

this function operates on the data inside the specObj and applies a lag to it

## Value

specObj an ffm spec Object that has been lagged

## See Also

specFfm for information on the definition of the specFfm object.

```
plot.ffm
```


## Description

Generic plot method for object of class ffm. Plots chosen characteristic(s) for one or more assets.

## Usage

```
    ## S3 method for class 'ffm'
    plot(
        x,
        which = NULL,
        f.sub = 1:2,
        a.sub = 1:6,
        plot.single = FALSE,
        asset.name,
        asset.variable,
        colorset = c("royalblue", "dimgray", "olivedrab", "firebrick", "goldenrod",
            "mediumorchid", "deepskyblue", "chocolate", "darkslategray"),
        legend.loc = "topleft",
        las = 1,
        lwd = 2,
        maxlag = 15,
    ...
    )
```


## Arguments

x
an object of class ffm produced by fitFfm.
which a number to indicate the type of plot. If multiple plots are required, specify a subset from 1:12 for group plots and 1:13 for individual plots. If which=NULL (default), the following menu appears:

For plots of a group of assets:
$1=$ Distribution of factor returns,
$2=$ Factor exposures from the last period,
$3=$ Actual and Fitted asset returns,
$4=$ Time-series of R-squared values,
$5=$ Residual variance across assets, $x$
$6=$ Scatterplot matrix of residuals, with histograms, density overlays, correla-
tions and significance stars,
7 = Factor Model Residual Correlation
$8=$ Factor Model Return Correlation,
$9=$ Factor Contribution to SD,
$10=$ Factor Contribution to ES,
$11=$ Factor Contribution to VaR,

|  | $12=$ Time series of factor returns, |
| :---: | :---: |
|  | For individual asset plots: |
|  | $1=$ Actual and fitted, |
|  | $2=$ Actual vs. fitted, |
|  | 3 = Residuals vs. fitted, |
|  | 4 = Residuals with standard error bands, |
|  | $5=$ Time series of squared residuals, |
|  | $6=$ Time series of absolute residuals, |
|  | $7=$ SACF and PACF of residuals, |
|  | $8=$ SACF and PACF of squared residuals, |
|  | $9=$ SACF and PACF of absolute residuals, |
|  | $10=$ Non-parametric density of residuals with normal overlaid, |
|  | 11 = Non-parametric density of residuals with skew-t overlaid, |
|  | $12=$ Histogram of residuals with non-parametric density and normal overlaid, 13 = QQ-plot of residuals |
| f.sub | numeric/character vector; subset of indexes/names of factors to include for group plots. Default is 1:2. |
| a.sub | numeric/character vector; subset of indexes/names of assets to include for group plots. At least 2 assets must be selected. Default is 1:6. |
| plot.single | logical; If TRUE plots the characteristics of an individual asset's factor model. The type of plot is given by which. Default is FALSE. |
| asset.name | name of the individual asset to be plotted. Is necessary if $x$ contains multiple asset fits and plot.single=TRUE. |
| asset.variable | the name of asset variable. |
| colorset | color palette to use for all the plots. The 1st element will be used for individual time series plots or the 1 st object plotted, the 2 nd element for the 2 nd object in the plot and so on. |
| legend.loc | places a legend into one of nine locations on the chart: "bottomright", "bottom", "bottomleft", "left", "topleft", "top", "topright", "right", or "center". Default is "bottomright". Use legend. loc=NULL to suppress the legend. |
| las | one of $0,1,2,3$ to set the direction of axis labels, same as in plot. Default is 1 . |
| lwd | set the line width, same as in plot. Default is 2 . |
| maxlag | optional number of lags to be calculated for ACF. Default is 15. |
|  | further arguments to be passed to other plotting functions. |

## Details

The function can be used for group plots and individual plots. User can select the type of plot either from the menu prompt (default) or directly via argument which.
In case multiple plots are needed, the menu is repeated after each plot (enter 0 to exit). User can also input a numeric vector of plot options via which.
Group plots are the default. The selected assets in a. sub and selected factors in f . sub are plotted depending on the characteristic chosen. The default is to show the first 2 factors and first 6 assets.

Setting plot.single=TRUE enables individual plots. If there is more than one asset fit by $x$, asset. name should be specified. In case the ffm object $x$ contains only a single asset fit, plot.ffm can infer asset. name without user input.

## Value

Does not return a value, used for plotting

## Author(s)

Eric Zivot, Sangeetha Srinivasan and Yi-An Chen

## See Also

fitFfm, residuals.ffm, fitted.ffm, fmCov.ffm and summary.ffm for time series factor model fitting and related S3 methods. Refer to fmSdDecomp, fmEsDecomp, fmVaRDecomp for factor model risk measures.
Here is a list of plotting functions used. ( $\mathrm{I}=$ individual, $\mathrm{G}=\mathrm{Group}$ ) $\mathrm{I}(1,5,6,7), \mathrm{G}(3,4,12)$ - chart. TimeSeries, $\mathrm{I}(2,3,4,19), \mathrm{G}(12)$ - plot. default, $\mathrm{I}(3,4)$ - panel. smooth, $\mathrm{I}(8,9,10)$ - chart. ACFplus, $\mathrm{I}(11,12)$ plot. density, $\mathrm{I}(13)$ - chart.Histogram, $\mathrm{I}(14)$ - chart. QQPlot, $\mathrm{I}(15,16,17)$ - plot.efp (requires strucchange package), $\mathrm{I}(18)$ - plot.zoo, $G(1)$ - chart.Boxplot, $G(2,5,9,10,11)$ - barchart, $G(6)$ - chart. Correlation and $G(7,8)$ - corrplot.mixed (requires corrplot package).

## portEsDecomp Decompose portfolio ES into individual factor contributions

## Description

Compute the factor contributions to Expected Tail Loss or Expected Shortfall (ES) of portfolio returns based on Euler's theorem, given the fitted factor model. The partial derivative of ES with respect to factor beta is computed as the expected factor return given portfolio return is less than or equal to its value-at-risk (VaR). Option to choose between non-parametric and Normal.

## Usage

```
    portEsDecomp(object, ...)
    \#\# S3 method for class 'ffm'
    portEsDecomp(
        object,
        weights = NULL,
    factor.cov,
    \(p=0.05\),
    type = c("np", "normal"),
    invert = FALSE,
    )
```


## Arguments

object fit object of class $f f$ f.
... other optional arguments passed to quantile and optional arguments passed to cov
weights a vector of weights of the assets in the portfolio, names of the vector should match with asset names. Default is NULL, in which case an equal weights will be used.
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.
$\mathrm{p} \quad$ tail probability for calculation. Default is 0.05 .
type
one of "np" (non-parametric) or "normal" for calculating Es. Default is "np".
invert

## Details

The factor model for a portfolio's return at time $t$ has the form
$R(t)=$ beta' $^{\prime} f(t)+e(t)=$ beta.star'f.star $(t)$
where, beta.star=(beta, sig.e) and f.star $(t)=\left[f(t)^{\prime}, z(t)\right]^{\prime}$. By Euler's theorem, the ES of the portfolio's return is given by:

```
ES.fm= sum(cES_k) = sum(beta.star_k*mES_k)
```

where, summation is across the $K$ factors and the residual, cES and mES are the component and marginal contributions to ES respectively. The marginal contribution to ES is defined as the expected value of F. star, conditional on the loss being less than or equal to portVaR. This is estimated as a sample average of the observations in that data window.

## Value

A list containing
portES factor model ES of portfolio returns.
mES length- $(K+1)$ vector of marginal contributions to Es.
cES length- $(\mathrm{K}+1)$ vector of component contributions to Es.
pcES length- $(K+1)$ vector of percentage component contributions to Es.
Where, K is the number of factors.

## Author(s)

Douglas Martin, Lingjie Yi

## See Also

fitFfm for the different factor model fitting functions.
portSdDecomp for factor model Sd decomposition. portVaRDecomp for factor model VaR decomposition.

```
portSdDecomp Decompose portfolio standard deviation into individual factor contri-
    butions
```


## Description

Compute the factor contributions to standard deviation (Sd) of portfolio returns based on Euler's theorem, given the fitted factor model.

## Usage

portSdDecomp(object, ...)
\#\# S3 method for class 'ffm'
portSdDecomp(object, weights $=$ NULL, factor.cov, ...)

## Arguments

object fit object of class tsfm, or ffm .
... optional arguments passed to cov.
weights a vector of weights of the assets in the portfolio. Default is NULL, in which case an equal weights will be used.
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.

## Details

The factor model for a portfolio's return at time $t$ has the form
$R(t)=$ beta' $^{\prime} f(t)+e(t)=$ beta.star'f.star $(t)$
where, beta.star=(beta, sig.e) and f.star $(t)=[f(t) ', z(t)]^{\prime}$.
By Euler's theorem, the standard deviation of the portfolio's return is given as:

```
portSd = sum(cSd_k) = sum(beta.star_k*mSd_k)
```

where, summation is across the K factors and the residual, cSd and mSd are the component and marginal contributions to Sd respectively. Computing portSd and mSd is very straight forward. The formulas are given below and details are in the references. The covariance term is approximated by the sample covariance.

```
portSd = sqrt(beta.star''cov(F.star)beta.star)
mSd = cov(F.star)beta.star / portSd
```

Value
A list containing

| portSd | factor model Sd of portfolio return. |
| :--- | :--- |
| $m S d$ | length- $(\mathrm{K}+1)$ vector of marginal contributions to Sd. |
| cSd | length- $(\mathrm{K}+1)$ vector of component contributions to Sd. |
| pcSd | length- $(\mathrm{K}+1)$ vector of percentage component contributions to Sd. |

Where, K is the number of factors.

## Author(s)

Douglas Martin, Lingjie Yi

## See Also

fitFfm for the different factor model fitting functions.
portVaRDecomp for portfolio factor model VaR decomposition. portEsDecomp for portfolio factor model ES decomposition.

```
portVaRDecomp
```

Decompose portfolio VaR into individual factor contributions

## Description

Compute the factor contributions to Value-at-Risk (VaR) of portfolio returns based on Euler's theorem, given the fitted factor model. The partial derivative of VaR w.r.t. factor beta is computed as the expected factor return given portfolio return is equal to its VaR and approximated by a kernel estimator. Option to choose between non-parametric and Normal.

## Usage

```
portVaRDecomp(object, ...)
## S3 method for class 'ffm'
portVaRDecomp(
    object,
    weights = NULL,
    factor.cov,
    p = 0.05,
    type = c("np", "normal"),
    invert = FALSE,
)
```


## Arguments

object fit object of class tsfm, or ffm.
... other optional arguments passed to quantile and optional arguments passed to cov
weights a vector of weights of the assets in the portfolio. Default is NULL, in which case an equal weights will be used.
factor.cov optional user specified factor covariance matrix with named columns; defaults to the sample covariance matrix.
p tail probability for calculation. Default is 0.05.
type one of "np" (non-parametric) or "normal" for calculating VaR. Default is "np".
invert a logical variable to choose if change VaR to positive number, default is False

## Details

The factor model for a portfolio's return at time $t$ has the form
$R(t)=\operatorname{beta}^{\prime} f(t)+e(t)=$ beta.star'f.star$(t)$
where, beta.star=(beta, sig.e) and $f . \operatorname{star}(t)=[f(t) ', z(t)]^{\prime}$. By Euler's theorem, the VaR of the asset's return is given by:

VaR.fm $=$ sum(cVaR_k) $=$ sum(beta.star_k*mVaR_k)
where, summation is across the $K$ factors and the residual, cVaR and mVaR are the component and marginal contributions to VaR respectively. The marginal contribution to VaR is defined as the expectation of F.star, conditional on the loss being equal to portVaR. This is approximated as described in Epperlein \& Smillie (2006); a triangular smoothing kernel is used here.

## Value

A list containing

| portVaR | factor model VaR of portfolio return. |
| :--- | :--- |
| n.exceed | number of observations beyond VaR. |
| idx.exceed | a numeric vector of index values of exceedances. |
| $m V a R$ | length- $(\mathrm{K}+1)$ vector of marginal contributions to VaR. |
| cVaR | length- $(\mathrm{K}+1)$ vector of component contributions to VaR. |
| pcVaR | length- $(\mathrm{K}+1)$ vector of percentage component contributions to VaR. |

Where, K is the number of factors.

## Author(s)

Douglas Martin, Lingjie Yi

## See Also

fitFfm for the different factor model fitting functions.
portSdDecomp for factor model Sd decomposition. portEsDecomp for factor model ES decomposition.
predict.ffm Predicts asset returns based on a fitted fundamental factor model

## Description

S3 predict method for object of class ffm.

## Usage

\#\# S3 method for class 'ffm'
predict(object, newdata $=$ NULL, pred.date $=$ NULL, ...)

## Arguments

object an object of class ffm produced by fitFfm.
newdata data.frame containing the variables asset.var, date.var and the same exact exposure.vars used in the fitted ffm object. If omitted, the predictions are based on the data used for the fit.
pred.date character; unique date used to base the predictions. Should be coercible to class Date and match one of the dates in the data used in the fiited object.
... optional arguments passed to predict. Im or predict. Imrob.

## Details

The estimated factor returns and potentially new factor exposures are used to predict the asset returns during all dates from the fitted ffm object. For predictions based on estimated factor returns from a specific period use the pred. date argument.

## Value

predict.ffm produces a N x T matrix of predicted asset returns, where T is the number of time periods and N is the number of assets. $\mathrm{T}=1$ if pred. date is specified.

## Author(s)

Sangeetha Srinivasan

## See Also

fitFfm, summary.ffm, predict.lm, predict.lmrob

## Description

S3 print method for object of class ffm. Prints the call, factor model dimension and summary statistics for the estimated factor returns, cross-sectional r-squared values and residual variances from the fitted object.
Refer to summary.ffm for a more detailed summary of the fit at each time period.

## Usage

\#\# S3 method for class 'ffm'
print(x, digits $=\max (3$, .Options\$digits - 3 ), ...)

## Arguments

$x \quad$ an object of class ffm produced by fitFfm.
digits an integer value, to indicate the required number of significant digits. Default is 3.
... optional arguments passed to the print method.

## Value

Returns an object of class print.ffm.

## Author(s)

Yi-An Chen and Sangeetha Srinivasan

## See Also

fitFfm, summary.ffm

## Examples

```
## Not run:
library(PCRA)
data(stocksCRSP)
data("factorDataSetDjia5Yrs")
# fit a fundamental factor model
fit.style.sector <- fitFfm(data=factorDataSetDjia5Yrs,
        asset.var="TICKER",
        ret.var="RETURN",
        date.var="DATE",
        exposure.vars = c("P2B", "MKTCAP"))
print(fit.style.sector)
## End(Not run)
```

```
print.ffmSpec print.ffmSpec
```


## Description

print.ffmSpec

## Usage

\#\# S3 method for class 'ffmSpec'
print(x, ...)

## Arguments

$\begin{array}{ll}x & \text { an object of class ffmSpec } \\ \ldots & \text { any other option }\end{array}$

## Value

No return value, called for displaying attributes
repExposures Portfolio Exposures Report

## Description

Calculate k factor time series based on fundamental factor model. This method takes fundamental factor model fit, 'ffm' object, and portfolio weight as inputs and generates numeric summary and plot visualization.

## Usage

```
repExposures(
    ffmObj,
    weights = NULL,
    isPlot = TRUE,
    isPrint = TRUE,
    scaleType = "free",
    stripText.cex = 1,
    axis.cex = 1,
    stripLeft = TRUE,
    layout = NULL,
    color = "blue",
    notch = FALSE,
    digits = 1,
```

```
    titleText = TRUE,
    which = NULL,
    type = "b",
)
```


## Arguments

| ffmObj weights | an object of class ffm returned by fitFfm. <br> a vector of weights of the assets in the portfolio. Default is NULL. |
| :---: | :---: |
| isPlot | logical variable to generate plot or not. |
| isPrint | logical variable to print numeric summary or not. |
| scaleType | scaleType controls if use a same scale of y-axis, choose from c('same', 'free') |
| stripText.cex | a number indicating the amount by which strip text in the plot(s) should be scaled relative to the default. $1=$ default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| axis.cex | a number indicating the amount by which axis in the plot(s) should be scaled relative to the default. $1=$ default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| stripLeft | logical variable to choose the position of strip, 'TRUE' for drawing strips on the left of each panel, 'FALSE' for drawing strips on the top of each panel. Used only when isPlot = 'TRUE' |
| layout | layout is a numeric vector of length 2 or 3 giving the number of columns, rows, and pages (optional) in a multipanel display. Used only when isPlot = 'TRUE' |
| color | character specifying the plotting color for all the plots |
| notch | logical. if notch is TRUE, a notch is drawn in each side of the boxes. If the notches of two plots do not overlap this is strong evidence that the two medians differ (Chambers et al, 1983, p. 62).Default values is FALSE. |
| digits | digits of printout numeric summary. Used only when isPrint = 'TRUE' |
| titleText | logical varible to choose display plot title or not. Default is 'TRUE', and used only when isPlot = 'TRUE'. |
| which | a number to indicate the type of plot. If a subset of the plots is required, specify a subset of the numbers $1: 3$ for plots. If which=NULL (default), the following menu appears: |
|  | For plots of a group of assets: |
|  | $1=$ Time series plot of style factor exposures, |
|  | $2=$ Boxplot of style factor exposures, <br> 3 = Barplot of means and vols of style factor exposures, and means of sector exposures (which have no vol). |
| type | character. type of lattice plot when which $=1$; 'l' denotes a line, ' p ' denotes a point, and ' $b$ ' and 'o' both denote both together.deafault is ' $b$ '. |
|  | other graphics parameters available in tsPlotMP(time series plot only) can be passed in through the ellipses |

## Value

A list containing mean and standard deviation of all the factors

## Author(s)

Douglas Martin, Lingjie Yi, Avinash

```
repReturn Portfolio return decomposition report
```


## Description

Decompostite return of portfolio into return of different factors based on fundamental factor model. This method takes fundamental factor model fit, "ffm" object, and portfolio weight as inputs and generates numeric summary and plot visualization.

## Usage

repReturn (
ffmObj,
weights = NULL,
isPlot = TRUE,
isPrint = TRUE,
layout = NULL,
scaleType = "free",
stripLeft = TRUE,
stripText.cex = 1,
axis.cex = 1,
digits $=1$,
titleText = TRUE, which = NULL,
)

## Arguments

ffmObj an object of class ffm returned by fitFfm.
weights a vector of weights of the assets in the portfolio. Default is NULL.
isPlot logical variable to generate plot or not.
isPrint logical variable to print numeric summary or not.
layout layout is a numeric vector of length 2 or 3 giving the number of columns, rows, and pages (optional) in a multipanel display.
scaleType scaleType controls if use a same scale of y-axis, choose from c('same', 'free')
stripLeft logical variable to choose the position of strip, "TRUE" for drawing strips on the left of each panel, "FALSE" for drawing strips on the top of each panel. Used only when isPlot = 'TRUE'

| stripText.cex | a number indicating the amount by which strip text in the plot(s) should be be <br> scaled relative to the default. 1=default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, <br> etc. |
| :--- | :--- |
| axis.cex | a number indicating the amount by which axis in the plot(s) should be scaled <br> relative to the default. 1=default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| digits | digits of printout numeric summary. Used only when isPrint = 'TRUE' <br> litleText <br> logical varible to choose display plot title or not. Default is 'TRUE', and used <br> only when isPlot = 'TRUE'. |
| which | a number to indicate the type of plot. If a subset of the plots is required, specify <br> a subset of the numbers 1:4 for plots. If which=NULL (default), the following <br> menu appears: |
|  | For plots of a group of assets: <br> 1 = Time Series plot of portfolio returns decomposition, |
| $2=$ Time Series plot of portfolio style factors returns, |  |

## Value

A $K \times 2$ matrix containing mean and standard deviation of $K$ factors

## Author(s)

Douglas Martin, Lingjie Yi

## Examples

```
args(repReturn)
```

repRisk $\quad$| Decompose portfolio risk into individual factor contributions and pro- |
| :--- |
| vide tabular report |

## Description

Compute the factor contributions to standard deviation (SD), Value-at-Risk (VaR), Expected Tail Loss or Expected Shortfall (ES) of the return of individual asset within a portfolio return of a portfolio based on Euler's theorem, given the fitted factor model.

```
Usage
    repRisk(object, ...)
    ## S3 method for class 'ffm'
    repRisk(
        object,
        weights = NULL,
        risk = c("Sd", "VaR", "ES"),
        decomp = c("FMCR", "FCR", "FPCR"),
        digits = NULL,
        invert = FALSE,
        nrowPrint = 20,
        p = 0.05,
        type = c("np", "normal"),
        sliceby = c("factor", "asset", "riskType"),
        isPrint = TRUE,
        isPlot = FALSE,
        layout = NULL,
        stripText.cex = 1,
        axis.cex = 1,
        portfolio.only = FALSE,
    )
```

Arguments
object fit object of class tsfm, or ffm.
... other optional arguments passed to quantile and optional arguments passed to cov
weights a vector of weights of the assets in the portfolio, names of the vector should match with asset names. Default is NULL, in which case an equal weights will be used.
risk one of 'Sd' (standard deviation), 'VaR' (Value-at-Risk) or 'ES' (Expected Tail Loss or Expected Shortfall for calculating risk decompositon. Default is 'Sd'
decomp one of 'FMCR' (factor marginal contribution to risk), 'FCR' 'factor contribution to risk' or 'FPCR' (factor percent contribution to risk).
digits digits of number in the resulting table. Default is NULL, in which case digtis $=3$ will be used for decomp $=($ 'FMCR', 'FCR'), digits $=1$ will be used for decomp = 'FPCR'. Used only when isPrint = 'TRUE'
invert a logical variable to change VaR/ES to positive number, default is False and will return positive values.
nrowPrint a numerical value deciding number of assets/portfolio in result vector/table to print or plot
p tail probability for calculation. Default is 0.05 .
type one of "np" (non-parametric) or "normal" for calculating VaR \& Es. Default is "np".
\(\left.$$
\begin{array}{ll}\text { sliceby } & \begin{array}{l}\text { one of 'factor' (slice/condition by factor) or 'asset' (slice/condition by asset) or } \\
\text { 'riskType' Used only when isPlot = 'TRUE' }\end{array} \\
\text { isPrint } & \begin{array}{l}\text { logical variable to print numeric output or not. } \\
\text { isPlot }\end{array}
$$ <br>

lagical variable to generate plot or not.\end{array}\right\}\)| layout is a numeric vector of length 2 or 3 giving the number of columns, rows, |
| :--- |
| and pages (optional) in a multipanel display. |

## Value

A table containing
decomp $=$ ' $\mathrm{FMCR}^{\prime} \quad(\mathrm{N}+1) *(\mathrm{~K}+1)$ matrix of marginal contributions to risk of portfolio return as well assets return, with first row of values for the portfolio and the remaining rows for the assets in the portfolio, with $(\mathrm{K}+1)$ columns containing values for the K risk factors and the residual respectively
decomp = 'FCR' $\quad(\mathrm{N}+1) *(\mathrm{~K}+2)$ matrix of component contributions to risk of portfolio return as well assets return, with first row of values for the portfolio and the remaining rows for the assets in the portfolio, with first column containing portfolio and asset risk values and remaining $(\mathrm{K}+1)$ columns containing values for the K risk factors and the residual respectively
decomp = 'FPCR' $(\mathrm{N}+1) *(\mathrm{~K}+1)$ matrix of percentage component contributions to risk of portfolio return as well assets return, with first row of values for the portfolio and the remaining rows for the assets in the portfolio, with $(\mathrm{K}+1)$ columns containing values for the K risk factors and the residual respectively

Where, K is the number of factors, N is the number of assets.

## Author(s)

Douglas Martin, Lingjie Yi

## See Also

fitFfm for the different factor model fitting functions.

## Examples

\# Fundamental Factor Model
library (PCRA)

```
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "Return","Sector")
factorItems <- c("BP","Beta60M","PM12M1M")
facDatIT <- selectCRSPandSPGMI("monthly",
                                    dateRange = dateRange,
                                    stockItems = stockItems,
                                    factorItems = factorItems,
                                    outputType = "data.table")
asset.var="TickerLast"
ret.var="Return"
date.var = "Date"
exposure.vars= factorItems
asset.var="TickerLast"
ret.var="Return"
date.var = "Date"
spec1 <- specFfm(data = facDatIT,asset.var = asset.var, ret.var = ret.var,
    date.var = date.var, exposure.vars = exposure.vars,weight.var = NULL,
    addIntercept = TRUE, rob.stats = FALSE)
# fit a fundamental factor model
mdlFit <- fitFfmDT(spec1)
mdlRes <- extractRegressionStats(spec1,mdlFit)
fit.cross <- convert(SpecObj = spec1,FitObj = mdlFit, RegStatsObj = mdlRes)
repRisk(fit.cross, risk = "Sd", decomp = 'FCR', nrowPrint = 10, digits = 4)
# get the factor contributions of risk
repRisk(fit.cross, risk = "Sd", decomp = 'FPCR',
    nrowPrint = 10)
# portfolio only decomposition
repRisk(fit.cross, risk = c("VaR", "ES"), decomp = 'FPCR',
    portfolio.only = TRUE)
# plot
repRisk(fit.cross, risk = "Sd", decomp = 'FPCR',
    isPrint = FALSE, nrowPrint = 15, isPlot = TRUE, layout = c(4,2))
```

    residualizeReturns residualizeReturns
    
## Description

\#' function to Residualize the returns via regressions

## Usage

residualizeReturns(specObj, benchmark, rfRate, isBenchExcess = FALSE)

## Arguments

| specObj | specObj is a ffmSpec object, |
| :--- | :--- |
| benchmark | we might need market returns |
| rfRate | risk free rate |
| isBenchExcess | toggle to select whether to calculate excess returns |

## Details

this function operates on the data inside the specObj and residualizes the returns to create residual return using regressions of returns on a benchmark.

## Value

the ffmSpec object with resturns residualized

## See Also

specFfm for information on the definition of the specFfm object.
riskDecomp.ffm Decompose Risk into individual factor contributions

## Description

Compute the factor contributions to $\mathrm{Sd}, \mathrm{VaR}$ and ES of returns based on Euler's theorem, given the fitted factor model.

## Usage

riskDecomp.ffm(
object,
risk, weights = NULL, portDecomp = TRUE, factor.cov, $p=0.05$, type = c("np", "normal"), invert = FALSE,
)

## Arguments

| object | fit object of class tsfm, or ffm. <br> one of "Sd" (Standard Deviation) or "VaR" (Value at Risk) or "ES" (Expected <br> Shortfall) |
| :--- | :--- |
| weights | a vector of weights of the assets in the portfolio, names of the vector should <br> match with asset names. Default is NULL, in which case an equal weights will <br> be used. |
| portDecomp | logical. If True the decomposition of risk is done for the portfolio based on the <br> weights. Else, the decomposition of risk is done for each asset. Default is TRUE |
| factor.cov | optional user specified factor covariance matrix with named columns; defaults <br> to the sample covariance matrix. |
| p | tail probability for calculation. Default is 0.05. |
| type | one of "np" (non-parametric) or "normal" for calculating Es. Default is "np". |
| invert | a logical variable to choose if change ES to positive number, default is False |
| $\ldots$ | other optional arguments passed to quantile and optional arguments passed to <br> cov |

## Value

A list containing
portES factor model ES of portfolio returns.
mES length- $(K+1)$ vector of marginal contributions to Es.
cES length- $(\mathrm{K}+1)$ vector of component contributions to Es.
pcES length- $(K+1)$ vector of percentage component contributions to Es.
Where, K is the number of factors.

## Author(s)

Eric Zivot, Yi-An Chen, Sangeetha Srinivasan, Lingjie Yi and Avinash Acharya

## See Also

fitFfm for the different factor model fitting functions.
portSdDecomp for factor model Sd decomposition. portVaRDecomp for factor model VaR decomposition.

```
    roll.fitFfmDT roll.fitFfmDT
```


## Description

roll.fitFfmDT rolls the fundamental factor model

## Usage

```
    roll.fitFfmDT(
        ffMSpecObj,
        windowSize = 60,
        refitEvery = 1,
        refitWindow = c("Expanding", "Rolling"),
        stdExposuresControl = list(Std.Type = "timeSeries", lambda = 0.9),
        stdReturnControl = list(GARCH.params = list(omega = 0.09, alpha = 0.1, beta = 0.81)),
        fitControl = list(fit.method = c("LS", "WLS", "Rob", "W-Rob"), resid.scaleType =
        c("STDDEV", "EWMA", "ROBEWMA", "GARCH"), lambda = 0.9, GARCH.params = list(omega =
            0.09, alpha = 0.1, beta = 0.81), GARCH.MLE = FALSE),
        full.resid.cov = TRUE,
        analysis = c("ISM", "NEW")
    )
```


## Arguments

ffMSpecObj a specFFm object
windowSize the size of the fit window
refitEvery the frequency of fitting
refitWindow choice of expanding or rolling
stdExposuresControl
for exposure standardization; (give the Std.Type and lambda)
stdReturnControl
choices to standardize the returns using GARCH controls
fitControl list of options for fitting the ffm
full. resid.cov True or False toggle
analysis choice of "ISM" or "NEW"

## Value

a list object containing a list of objects describing the fitted analysis.

## Description

Factor models have a few parameters that describe how the fitting is done. This function summarizes them and returns a spec object for cross-sectional regressions. It also preps the data. An object of class "ffmSpec" is returned.

## Usage

specFfm( data, asset.var, ret.var, date.var, exposure.vars, weight.var = NULL, addIntercept $=$ FALSE, rob.stats $=$ FALSE
)

## Arguments

data data.frame of the balanced panel data containing the variables asset.var, ret.var, exposure.vars, date.var and optionally, weight. var.
asset.var character; name of the variable for asset names.
ret.var character; name of the variable for asset returns.
date.var character; name of the variable containing the dates coercible to class Date.
exposure.vars vector; names of the variables containing the fundamental factor exposures.
weight.var character; name of the variable containing the weights used when standardizing style factor exposures. Default is NULL. See Details.
addIntercept logical; If TRUE, intercept is added in the exposure matrix. Default is FALSE,
rob.stats logical; If TRUE, robust estimates of covariance, correlation, location and univariate scale are computed as appropriate (see Details). Default is FALSE.

## Value

an object of class ffmSpec holding the details of the analysis

## Examples

library (PCRA)

```
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "Return","Sector")
factorItems <- c("BP", "Beta60M", "PM12M1M")
facDatIT <- selectCRSPandSPGMI("monthly",
    dateRange = dateRange,
    stockItems = stockItems,
    factorItems = factorItems,
    outputType = "data.table")
asset.var="TickerLast"
ret.var="Return"
date.var = "Date"
exposure.vars= c("BP","Beta60M", "PM12M1M")
spec1 <- specFfm(data = facDatIT,asset.var = asset.var, ret.var = ret.var,
    date.var = date.var, exposure.vars = exposure.vars,weight.var = NULL,
    addIntercept = TRUE, rob.stats = FALSE)
spec1$exposure.vars
#lag the exposures
spec1 <- lagExposures(spec1)
# standardize the exposures Cross-Sectionally
spec1 <- standardizeExposures(spec1, Std.Type = "CrossSection")
# fit the model
mdlFit <- fitFfmDT(spec1)
class(mdlFit)
class(mdlFit$reg.listDT)
```

standardizeExposures standardizeExposures

## Description

function to calculate z -scores for numeric exposure using weights weight.var

## Usage

```
standardizeExposures(
    specObj,
    Std.Type = c("None", "CrossSection", "TimeSeries"),
    lambda \(=0.9\)
)
```


## Arguments

| specObj | is a ffmSpec object, |
| :--- | :--- |
| Std. Type | method for exposure standardization; one of "none", "CrossSection", or "Time- <br> Series". Default is "none". |
| lambda | lambda value to be used for the EWMA estimation of residual variances. Default <br> is 0.9 |

## Details

this function operates on the data inside the specObj and applies a standardization to it. The user can choose CrossSectional or timeSeries standardization

## Value

the ffmSpec object with exposures z-scored

## See Also

specFfm for information on the definition of the specFfm object.

```
standardizeReturns standardizeReturns
```


## Description

Standardize the returns using $\operatorname{GARCH}(1,1)$ volatilities.

## Usage

```
standardizeReturns(
    specObj,
    GARCH.params = list(omega = 0.09, alpha = 0.1, beta = 0.81)
)
```


## Arguments

specObj is a ffmSpec object
GARCH. params fixed $\operatorname{Garch}(1,1)$ parameters

## Details

this function operates on the data inside the specObj and standardizes the returns to create scaled return.

## Value

an ffmSpec Object with the standardized returns added

## See Also

specFfm for information on the definition of the specFfm object.

```
summary.ffm
```


## Description

summary method for object of class ffm. Returned object is of class summary.ffm.

## Usage

\#\# S3 method for class 'ffm'
summary (object, ...)
\#\# S3 method for class 'summary.ffm'
print(x, digits = 3, labels = TRUE, ...)

## Arguments

object an object of class ffm returned by fitFfm.
... futher arguments passed to or from other methods.
$x \quad$ an object of class summary.ffm.
digits number of significant digits to use when printing. Default is 3 .
labels option to print labels and legend in the summary. Default is TRUE. When FALSE, only the coefficient matrx with standard errors is printed.

## Details

The default summary method for a fitted lm object computes the standard errors and t-statistics under the assumption of homoscedasticity.
Note: This gives a summary of the fitted factor returns at each time period. If $T$ is large, you might prefer the more succinct summary produced by print.ffm.

## Value

Returns an object of class summary.ffm. The print method for class summary.ffm outputs the call, coefficients (with standard errors and t-statistics), r-squared and residual volatilty (under the homoskedasticity assumption) for all assets.
Object of class summary. ffm is a list of length $\mathrm{N}+2$ containing:
call the function call to fitFfm
sum.list list of summaries of the T fit objects (of class lm or lmRob) for each time period in the factor model.

## Author(s)

Sangeetha Srinivasan \& Yi-An Chen.

## See Also

fitFfm, summary.lm
tsPlotMP Time Series Plots

## Description

Plot time series with specific plotting parameters

## Usage

```
tsPlotMP(
    ret,
    add.grid = FALSE,
    layout = NULL,
    type = "l",
    yname = "RETURNS (%)",
    Pct = FALSE,
    scaleType = "free",
    stripLeft = TRUE,
    main = NULL,
    lwd = 1,
    stripText.cex = 1,
    axis.cex = 1,
    color = "black",
    zeroLine = TRUE,
    panel = NULL
)
```


## Arguments

| ret | an time series exposure/return object |
| :---: | :---: |
| add.grid |  |
| layout | layout is a numeric vector of length 2 or 3 giving the number of columns, rows, and pages (optional) in a multipanel display. |
| type | character. type of the plot; 'l' denotes a line, 'p' denotes a point, and 'b' and 'o' both denote both together. deafault is ' 1 '. |
| yname | character or expression giving label(s) for the y-axis |
| Pct | Pct controls if use the percentage value. |
| scaleType | scaleType controls if use a same scale of y-axis, choose from c('same', 'free') |
| stripLeft | logical variable to choose the position of strip, 'TRUE' for drawing strips on the left of each panel, 'FALSE' for drawing strips on the top of each panel |
| main | Typically a character string or expression describing the main title. |


| lwd | The line width, a positive number, defaulting to 1 |
| :--- | :--- |
| stripText.cex | a number indicating the amount by which strip text in the plot(s) should be <br> scaled relative to the default. 1=default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, <br> etc. |
| axis.cex | a number indicating the amount by which axis in the plot(s) should be scaled <br> relative to the default. 1=default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| color | A specification for the default plotting color. Default is black. |
| zeroLine | logical varible to choose add a dotted horizontal line at the zero vertical distance <br> panel |
| function to add customized lines to the lattice plot. See examples. |  |

## Value

No return value, called for plotting

## Author(s)

Douglas Martin, Lingjie Yi
vif
Factor Model Variance Inflaction Factor Values

## Description

Calculate and plot the Factor Model Variance Inflaction Factor Values for a fitted model. A VIF for a single explanatory variable (style factor) is obtained using the time series of R -squared values obtained from the regression of that variable against all other explanatory variables. So, at least 2 explanatory variables are required in exposure.vars of fitted model to find the VIF.

```
Usage
    vif(
        ffmObj,
        digits = 2,
        isPrint = TRUE,
        isPlot = TRUE,
        lwd = 2,
        stripText.cex = 1,
        axis.cex = 1,
        title = TRUE,
    )
```


## Arguments

| ffmObj | an object of class ffm produced by fitFfm |
| :---: | :---: |
| digits | an integer indicating the number of decimal places to be used for rounding. Default is 2 . |
| isPrint | logical. if TRUE, the time series of the computed factor model values is printed along with their mean values. Else, only the mean values are printed. Default is TRUE. |
| isPlot | logical. if TRUE, the time series of the output is plotted. Default is TRUE. |
| lwd | line width relative to the default. Default is 2 . |
| stripText.cex | a number indicating the amount by which strip text in the plot(s) should be scaled relative to the default. $1=$ default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| axis.cex | a number indicating the amount by which axis in the plot(s) should be scaled relative to the default. 1=default, 1.5 is $50 \%$ larger, 0.5 is $50 \%$ smaller, etc. |
| title | logical. This argument is mainly used for the documentation purpose when you need a plot without any title. If TRUE, the plots will have the main tiltle. default is TRUE. |
|  | potentially further arguments passed. |

## Value

ffmRsq returns the sample mean values and plots the time series of corresponding $R$ squared values and the Variance Inflation factors depending on the values of rsq, rsqAdj and VIF. The time series of the output values are also printed if isPrint is TRUE

## Author(s)

Avinash Acharya

## Examples

```
library(PCRA)
# load data
data(stocksCRSP)
data(factorsSPGMI)
dateRange <- c("2006-01-31","2010-12-31")
stockItems <- c("Date", "TickerLast", "CapGroupLast", "Return",
    "Ret13WkBill","MktIndexCRSP","Sector")
    factorItems <- c("BP","Beta60M","PM12M1M")
stocks_factors <- selectCRSPandSPGMI("monthly", dateRange = dateRange,
stockItems = stockItems, factorItems = factorItems, outputType ="data.table")
# fit a fundamental factor model with style variables BP and LogMktCap
fundamental_model <- fitFfm(data = stocks_factors,
    asset.var = "TickerLast",
```

```
ret.var = "Return",
date.var = "Date",
exposure.vars = c("BP", "PM12M1M")
)
```

\#Plot and print the time series of VIF values vif(fundamental_model,isPrint=TRUE)

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