

# Package ‘MarkowitzR’

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**License** LGPL-3

**Title** Statistical Significance of the Markowitz Portfolio

**BugReports** <https://github.com/shabbychef/MarkowitzR/issues>

**Description** A collection of tools for analyzing significance of Markowitz portfolios.

**Depends** R (>= 3.0.2)

**Imports** matrixcalc, sandwich, gtools

**Suggests** SharpeR, testthat, knitr

**URL** <https://github.com/shabbychef/MarkowitzR>

**VignetteBuilder** knitr

**Collate** 'MarkowitzR.r' 'portinf.r' 'utils.r' 'vcov.r'

**RoxygenNote** 5.0.1

**NeedsCompilation** no

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**Repository** CRAN

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itheta_vcov	<i>Compute variance covariance of Inverse 'Unified' Second Moment</i>
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**Description**

Computes the variance covariance matrix of the inverse unified second moment matrix.

**Usage**

```
itheta_vcov(X,vcov.func=vcov,fit.intercept=TRUE)
```

**Arguments**

<code>X</code>	an $n \times p$ matrix of observed returns.
<code>vcov.func</code>	a function which takes an object of class <code>lm</code> , and computes a variance-covariance matrix. If equal to the string "normal", we assume multivariate normal returns.
<code>fit.intercept</code>	a boolean controlling whether we add a column of ones to the data, or fit the raw uncentered second moment. For now, must be true when assuming normal returns.

**Details**

Given  $p$ -vector  $x$  with mean  $\mu$  and covariance,  $\Sigma$ , let  $y$  be  $x$  with a one prepended. Then let  $\Theta = E(yy^T)$ , the uncentered second moment matrix. The inverse of  $\Theta$  contains the (negative) Markowitz portfolio and the precision matrix.

Given  $n$  contemporaneous observations of  $p$ -vectors, stacked as rows in the  $n \times p$  matrix  $X$ , this function estimates the mean and the asymptotic variance-covariance matrix of  $\Theta^{-1}$ .

One may use the default method for computing covariance, via the `vcov` function, or via a 'fancy' estimator, like `sandwich:vcovHAC`, `sandwich:vcovHC`, *etc.*

**Value**

a list containing the following components:

<code>mu</code>	a $q = (p + 1)(p + 2)/2$ vector of 1 + squared maximum Sharpe, the negative Markowitz portfolio, then the vech'd precision matrix of the sample data
<code>Ohat</code>	the $q \times q$ estimated variance covariance matrix.
<code>n</code>	the number of rows in $X$ .
<code>pp</code>	the number of assets plus <code>as.numeric(fit.intercept)</code> .

**Note**

By flipping the sign of  $X$ , the inverse of  $\Theta$  contains the *positive* Markowitz portfolio and the precision matrix on  $X$ . Performing this transform before passing the data to this function should be considered idiomatic.

A more general form of this function exists as `mp_vcov`.

Replaces similar functionality from SharpeR package, but with modified API.

**Author(s)**

Steven E. Pav <shabbychef@gmail.com>

**References**

Pav, S. E. "Asymptotic Distribution of the Markowitz Portfolio." 2013 <http://arxiv.org/abs/1312.0557>

Pav, S. E. "Portfolio Inference with this One Weird Trick." R in Finance, 2014 <http://www.rinfinance.com/agenda/2014/talk/StevenPav.pdf>

**See Also**

[theta\\_vcov](#), [mp\\_vcov](#).

**Examples**

```
X <- matrix(rnorm(1000*3),ncol=3)
# putting in -X is idiomatic:
ism <- itheta_vcov(-X)
iSigmas.n <- itheta_vcov(-X,vcov.func="normal")
iSigmas.n <- itheta_vcov(-X,fit.intercept=FALSE)
# compute the marginal Wald test statistics:
qidx <- 2:ism$pp
wald.stats <- ism$mu[qidx] / sqrt(diag(ism$Ohat[qidx,qidx]))

# make it fat tailed:
X <- matrix(rt(1000*3,df=5),ncol=3)
ism <- itheta_vcov(X)
qidx <- 2:ism$pp
wald.stats <- ism$mu[qidx] / sqrt(diag(ism$Ohat[qidx,qidx]))
## Not run:
if (require(sandwich)) {
  ism <- itheta_vcov(X,vcov.func=vcovHC)
  qidx <- 2:ism$pp
  wald.stats <- ism$mu[qidx] / sqrt(diag(ism$Ohat[qidx,qidx]))
}

## End(Not run)
# add some autocorrelation to X
Xf <- filter(X,c(0.2),"recursive")
colnames(Xf) <- colnames(X)
ism <- itheta_vcov(Xf)
qidx <- 2:ism$pp
wald.stats <- ism$mu[qidx] / sqrt(diag(ism$Ohat[qidx,qidx]))
## Not run:
if (require(sandwich)) {
  ism <- itheta_vcov(Xf,vcov.func=vcovHAC)
  qidx <- 2:ism$pp
  wald.stats <- ism$mu[qidx] / sqrt(diag(ism$Ohat[qidx,qidx]))
}
```

```
## End(Not run)
```

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 MarkowitzR

*statistics concerning the Markowitz portfolio*


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## Description

Inference on the Markowitz portfolio.

## Markowitz Portfolio

Suppose  $x$  is a  $p$ -vector of returns of some assets with expected value  $\mu$  and covariance  $\Sigma$ . The *Markowitz Portfolio* is the portfolio  $w = \Sigma^{-1}\mu$ . Scale multiples of this portfolio solve various portfolio optimization problems, among them

$$\operatorname{argmax}_{w:w^T \Sigma w \leq R^2} \frac{\mu^T w - r_0}{\sqrt{w^T \Sigma w}}$$

This packages supports various statistical tests around the elements of the Markowitz Portfolio, and its Sharpe ratio, including the possibility of hedging, and scalar conditional heteroskedasticity and conditional expectation.

## Legal Mumbo Jumbo

MarkowitzR is distributed in the hope that it will be useful, but WITHOUT ANY WARRANTY; without even the implied warranty of MERCHANTABILITY or FITNESS FOR A PARTICULAR PURPOSE. See the GNU Lesser General Public License for more details.

## Note

This package is maintained as a hobby.

## Author(s)

Steven E. Pav <shabbychef@gmail.com>

## References

- Pav, S. E. "Asymptotic Distribution of the Markowitz Portfolio." 2013 <http://arxiv.org/abs/1312.0557>
- Pav, S. E. "Portfolio Inference with this One Weird Trick." R in Finance, 2014 <http://www.rinfinance.com/agenda/2014/talk/StevenPav.pdf>
- Britten-Jones, Mark. "The Sampling Error in Estimates of Mean-Variance Efficient Portfolio Weights." *The Journal of Finance* 54, no. 2 (1999): 655–671. <http://www.jstor.org/stable/2697722>
- Bodnar, Taras and Okhrin, Yarema. "On the Product of Inverse Wishart and Normal Distributions with Applications to Discriminant Analysis and Portfolio Theory." *Scandinavian Journal of Statistics* 38, no. 2 (2011): 311–331. <http://dx.doi.org/10.1111/j.1467-9469.2011.00729.x>

Markowitz, Harry. "Portfolio Selection." *The Journal of Finance* 7, no. 1 (1952): 77–91. <http://www.jstor.org/stable/2975974>

Brandt, Michael W. "Portfolio Choice Problems." *Handbook of Financial Econometrics* 1 (2009): 269–336. <https://faculty.fuqua.duke.edu/~mbrandt/papers/published/portreview.pdf>

MarkowitzR-NEWS

*News for package 'MarkowitzR':*

## Description

News for package 'MarkowitzR'

### Changes in **MarkowitzR** Version 0.9900 (2016-09-15)

- yet again, conform to CRAN rules.

### Changes in **MarkowitzR** Version 0.1502 (2015-01-26)

- conform to CRAN rules.

### Changes in **MarkowitzR** Version 0.1403 (2014-06-01)

- fix bug preventing multi-row hedging or constraint matrices.

### **MarkowitzR** Initial Version 0.1402 (2014-02-14)

- first CRAN release.

mp\_vcov

*Estimate Markowitz Portfolio*

## Description

Estimates the Markowitz Portfolio or Markowitz Coefficient subject to subspace and hedging constraints, and heteroskedasticity.

## Usage

```
mp_vcov(X, feat=NULL, vcov.func=vcov, fit.intercept=TRUE, weights=NULL, Jmat=NULL, Gmat=NULL)
```

**Arguments**

<code>X</code>	an $n \times p$ matrix of observed returns.
<code>feat</code>	an $n \times f$ matrix of observed features. defaults to none, in which case <code>fit.intercept</code> must be TRUE. If <code>fit.intercept</code> is true, ones will be prepended to the features.
<code>vcov.func</code>	a function which takes an object of class <code>lm</code> , and computes a variance-covariance matrix. If equal to the string "normal", we assume multivariate normal returns.
<code>fit.intercept</code>	a boolean controlling whether we add a column of ones to the data, or fit the raw uncentered second moment. For now, must be true when assuming normal returns.
<code>weights</code>	an optional $n$ vector of the weights. The returns and features will be multiplied by the weights. Weights should be inverse volatility estimates. Defaults to homoskedasticity.
<code>Jmat</code>	an optional $p_j \times p$ matrix of the subspace in which we constrain portfolios. Defaults essentially to the $p \times p$ identity matrix.
<code>Gmat</code>	an optional $p_g \times p$ matrix of the subspace to which we constrain portfolios to have zero covariance. The rowspace of <code>Gmat</code> must be spanned by the rowspace of <code>Jmat</code> . Defaults essentially to the $0 \times p$ empty matrix.

**Details**

Suppose that the expectation of  $p$ -vector  $x$  is linear in the  $f$ -vector  $f$ , but the covariance of  $x$  is stationary and independent of  $f$ . The 'Markowitz Coefficient' is the  $p \times f$  matrix  $W$  such that, conditional on observing  $f$ , the portfolio  $Wf$  maximizes Sharpe. When  $f$  is the constant 1, the Markowitz Coefficient is the traditional Markowitz Portfolio.

Given  $n$  observations of the returns and features, given as matrices  $X, F$ , this code computes the Markowitz Coefficient along with the variance-covariance matrix of the Coefficient and the precision matrix. One may give optional weights, which are inverse conditional volatility. One may also give optional matrix  $J, G$  which define subspace and hedging constraints. Briefly, they constrain the portfolio optimization problem to portfolios in the row space of  $J$  and with zero covariance with the rows of  $G$ . It must be the case that the rows of  $J$  span the rows of  $G$ .  $J$  defaults to the  $p \times p$  identity matrix, and  $G$  defaults to a null matrix.

One may use the default method for computing covariance, via the `vcov` function, or via a 'fancy' estimator, like `sandwich:vcovHAC`, `sandwich:vcovHC`, etc.

**Value**

a list containing the following components:

<code>mu</code>	Letting $r = f + p + \text{fit.intercept}$ , this is a $q = (r)(r + 1)/2$ vector...
<code>Ohat</code>	The $q \times q$ estimated variance covariance matrix of <code>mu</code> .
<code>W</code>	The estimated Markowitz coefficient, a $p \times (\text{fit.intercept} + f)$ matrix. The first column corresponds to the intercept term if it is fit. Note that for convenience this function performs the sign flip, which is not performed on <code>mu</code> .
<code>What</code>	The estimated variance covariance matrix of <code>vech(W)</code> . Letting $s = p(\text{fit.intercept} + f)$ , this is a $s \times s$ matrix.

widxs	The indices into mu giving W, and into Ohat giving What.
n	The number of rows in X.
ff	The number of features plus as.numeric(fit.intercept).
p	The number of assets.

**Note**

Should also modify to include the theta estimates.

**Author(s)**

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**References**

- Pav, S. E. "Asymptotic Distribution of the Markowitz Portfolio." 2013 <http://arxiv.org/abs/1312.0557>
- Pav, S. E. "Portfolio Inference with this One Weird Trick." R in Finance, 2014 <http://www.rinfinance.com/agenda/2014/talk/StevenPav.pdf>

**See Also**

[theta\\_vcov](#), [itheta\\_vcov](#)

**Examples**

```
set.seed(1001)
X <- matrix(rnorm(1000*3),ncol=3)
ism <- mp_vcov(X,fit.intercept=TRUE)
walds <- ism$W / sqrt(diag(ism$What))
print(t(walds))
# subspace constraint
Jmat <- matrix(rnorm(6),ncol=3)
ism <- mp_vcov(X,fit.intercept=TRUE,Jmat=Jmat)
walds <- ism$W / sqrt(diag(ism$What))
print(t(walds))
# hedging constraint
Gmat <- matrix(1,nrow=1,ncol=3)
ism <- mp_vcov(X,fit.intercept=TRUE,Gmat=Gmat)
walds <- ism$W / sqrt(diag(ism$What))

# now conditional expectation:

# generate data with given W, Sigma
Xgen <- function(W,Sigma,Feat) {
  Btrue <- Sigma %%% W
  Xmean <- Feat %%% t(Btrue)
  Shalf <- chol(Sigma)
  X <- Xmean + matrix(rnorm(prod(dim(Xmean))),ncol=dim(Xmean)[2]) %%% Shalf
}
```

```

n.feats <- 2
n.ret <- 8
n.obs <- 10000
set.seed(101)
Feat <- matrix(rnorm(n.obs * n.feats), ncol=n.feats)
Wtrue <- 10 * matrix(rnorm(n.feats * n.ret), ncol=n.feats)
Sigma <- cov(matrix(rnorm(100*n.ret), ncol=n.ret))
Sigma <- Sigma + diag(seq(from=1, to=3, length.out=n.ret))
X <- Xgen(Wtrue, Sigma, Feat)
ism <- mp_vcov(X, feat=Feat, fit.intercept=TRUE)
Wcomp <- cbind(0, Wtrue)
errs <- ism$W - Wcomp
dim(errs) <- c(length(errs), 1)
Zerr <- solve(t(chol(ism$What)), errs)

```

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theta\_vcov

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*Compute variance covariance of 'Unified' Second Moment*


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## Description

Computes the variance covariance matrix of sample mean and second moment.

## Usage

```
theta_vcov(X, vcov.func=vcov, fit.intercept=TRUE)
```

## Arguments

<code>X</code>	an $n \times p$ matrix of observed returns.
<code>vcov.func</code>	a function which takes an object of class <code>lm</code> , and computes a variance-covariance matrix. If equal to the string "normal", we assume multivariate normal returns.
<code>fit.intercept</code>	a boolean controlling whether we add a column of ones to the data, or fit the raw uncentered second moment. For now, must be true when assuming normal returns.

## Details

Given  $p$ -vector  $x$ , the 'unified' sample is the  $(p+1)(p+2)/2$  vector of 1,  $x$ , and  $\text{vech}(xx^\top)$  stacked on top of each other. Given  $n$  contemporaneous observations of  $p$ -vectors, stacked as rows in the  $n \times p$  matrix  $X$ , this function computes the mean and the variance-covariance matrix of the 'unified' sample.

One may use the default method for computing covariance, via the `vcov` function, or via a 'fancy' estimator, like `sandwich:vcovHAC`, `sandwich:vcovHC`, etc.



**Value**

a list containing the following components:

mu	a $q = (p + 1)(p + 2)/2$ vector of 1, then the mean, then the vech'd second moment of the sample data.
Ohat	the $q \times q$ estimated variance covariance matrix. When <code>fit.intercept</code> is true, the left column and top row are all zeros.
n	the number of rows in X.
pp	the number of assets plus <code>as.numeric(fit.intercept)</code> .

**Note**

Replaces similar functionality from SharpeR package, but with modified API.

**Author(s)**

Steven E. Pav <shabbychef@gmail.com>

**References**

Pav, S. E. "Asymptotic Distribution of the Markowitz Portfolio." 2013 <http://arxiv.org/abs/1312.0557>

Pav, S. E. "Portfolio Inference with this One Weird Trick." R in Finance, 2014 <http://www.rinfinance.com/agenda/2014/talk/StevenPav.pdf>

**See Also**

[itheta\\_vcov](#).

**Examples**

```
X <- matrix(rnorm(1000*3),ncol=3)
Sigmas <- theta_vcov(X)
Sigmas.n <- theta_vcov(X,vcov.func="normal")
Sigmas.n <- theta_vcov(X,fit.intercept=FALSE)

# make it fat tailed:
X <- matrix(rt(1000*3,df=5),ncol=3)
Sigmas <- theta_vcov(X)
## Not run:
if (require(sandwich)) {
  Sigmas <- theta_vcov(X,vcov.func=vcovHC)
}

## End(Not run)
# add some autocorrelation to X
Xf <- filter(X,c(0.2),"recursive")
colnames(Xf) <- colnames(X)
Sigmas <- theta_vcov(Xf)
## Not run:
```

```
if (require(sandwich)) {  
  Sigmas <- theta_vcov(Xf,vcov.func=vcovHAC)  
}  
  
## End(Not run)
```

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