

Econometric Reviews >

Volume 27, 2008 - Issue 1-3

923 | 91

Views CrossRef citations to date Altmetric

0

Original Articles

Predicting the Daily Covariance Matrix for S&P 100 Stocks Using Intraday Data—But Which Frequency to Use?

Michiel de Pooter, Martin Martens & Dick van Dijk ✉

Pages 199-229 | Received 21 Sep 2005, Accepted 04 Apr 2006, Published online: 07 Mar 2008

Cite this article <https://doi.org/10.1080/07474930701873333>

Sample our
Economics, Finance,
Business & Industry Journals
>> **Sign in here** to start your access
to the latest two volumes for 14 days

Full Article

Figures & data

References

Citations

Metrics

Reprints & Permissions

Read this article

Abstract

This article investigates the merits of high-frequency intraday data when forming mean-variance efficient stock portfolios with daily rebalancing from the individual constituents of the S&P 100 index. We focus on the issue of determining the optimal sampling frequency as judged by the performance of these portfolios. The optimal

About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click "Settings". For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only

Settings

ACKNOWLEDGMENTS

We thank Federico Bandi, Jeffrey Russell, Valeri Voev, the editors Michael McAleer and Essie Maasoumi, and two anonymous referees for helpful comments and suggestions. Any remaining errors are ours alone.

Notes

- ¹Zhang et al. ([2005](#)) focus solely on estimating the variance but here we apply their approach to covariances as well, as suggested by Zhang ([2005](#)).
- ²We should note that the two time-scales estimator of Zhang et al. ([2005](#)) is derived under the same model assumptions (see Equation ([4](#)) in Zhang et al., [2005](#)). By using it in the same format for covariances we acknowledge that for example the weights for the covariance matrices at two frequencies may be suboptimal and that the estimator may be biased. Of course in our empirical work we can see whether despite these reservations the idea itself is useful for predicting covariances.
- ³ <http://www.price-data.com/>
- ⁴For obvious reasons the overnight return from 10 to 17 September, 2001 (the first trading day after 9/11) has been dropped.
- Notes: T
sampling
through
the a
average
covarian
all 1788
variances of the realized covariances. In Panel A the “standard” realized covariance

About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click “Settings”. For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only

Settings

matrix $V_{t-1, h}$ given in (1) is used. Panel B is based on the two time-scales estimator given in (2), while Panel C shows results for the lead-lag corrected estimator given in (3), with Bartlett-kernel weights $d_l = 1 - l/(q + 1)$ and $q = 1$.

⁵An exception is the realized variance at the one- and two-minute frequencies, where also the variance increases due to the increased importance of bid-ask bounce.

⁶We experimented with alternative values for q , which led to qualitatively similar findings. Detailed results are available upon request. The issue of determining the optimal value of q is beyond the scope of this article and is left for future research.

⁷As explained below, we require part of the sample period to initialize the conditional covariance matrix estimates, which in our case equals 122 trading days. This implies that the effective sample period available for portfolio construction and evaluation runs from October 8, 1997 until May 27, 2004 (1666 trading days).

⁸Fleming et al. (2003) use a similar approach when assessing the effect of transaction costs.

⁹Note that our approach here differs from Fleming et al. (2003). Our method of holding multiple portfolios simultaneously is commonly applied in the literature on stock selection, see Jegadeesh and Titman (1993) and Rouwenhorst (1998), among many others.

¹⁰Fleming et al. (2003) show that actually using the (unrestricted) multivariate GARCH model leads to a better fit of the data as expected, but the covariance matrix forecasts result in worse portfolios than those obtained from the rolling covariance estimator. They cite the smoothness of the rolling estimator as the main reason for this.

Notes: The table shows the decay rates (α) that maximize the likelihood of the model in

(13) and estimate returns (optimal update when the columns contempor

About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click "Settings". For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only


Settings

the model is excess show the variance fifth column two

Notes: The table shows the out-of-sample performance of the overall minimum variance portfolio, with weights given in (6), and the minimum variance portfolio given a target level of return of 10%, with weights given in (8), constructed using rolling covariance matrix forecasts based on various sampling frequencies and based on different ways of measuring the realized covariance matrix (standard, two time-scales, and 1 lead and 1 lag). For the target return portfolios, we report the mean return (μ_P) and standard deviation (σ_P) in annualized percentage points, the Sharpe ratio (SR), the annualized basis points fee (Δ_γ) an investor with quadratic utility and constant relative risk aversion of γ would pay to switch from the daily returns covariance matrix estimate to the intraday returns of the optimal portfolios, and average daily turnover (TO) in percentage points. For the minimum variance portfolios, we report the standard deviation (σ_{MVP}) in annualized percentage points average daily turnover (TO) in percentage points.

¹¹We examined the sensitivity of our results to the target return level by varying μ_P between 2% and 18%. These alternative target return levels led to qualitatively similar conclusions as those reported below. Detailed results are therefore not shown here, but are available on request.

Notes: The table shows the out-of-sample performance of the overall minimum tracking error portfolio, with weights given in (6), and the minimum tracking error portfolio given a target level of return of 1%, with weights given in (8), constructed using rolling covariance matrix forecasts based on various sampling frequencies and based on different ways of measuring the realized covariance matrix (standard, two time-scales, and 1 lead and 1 lag). For the target active return portfolios, we report the mean active return (μ_P) and tracking error (TE_P) in annualized percentage points, the information ratio (IR), the annualized basis points fee (Δ_γ) an investor with quadratic utility and constant relative risk aversion of γ would pay to switch from the daily returns



About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click “Settings”. For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only

Settings

“standard” way of measuring the realized covariance matrix. We report the mean return (μ_p) and standard deviation (α_p) in annualized percentage points, the Sharpe ratio (SR), and the annualized basis points fee (Δ_γ) an investor with quadratic utility and constant relative risk aversion of γ would pay to switch from the daily returns covariance matrix estimate to the intraday returns of the optimal portfolios. The column headed c indicates the level of transaction costs, expressed in annualized percentage points, which correspond with the reduction in the annualized portfolio return if the entire portfolio would have to be traded every day during the whole year. The column headed h indicates the optimal sampling frequency, expressed as the length of the corresponding return interval in minutes.

Notes: The table shows the out-of-sample performance of the minimum tracking error portfolio given a target level of return of 1%, with weights given in (8), constructed using rolling covariance matrix forecasts based on daily returns and on intraday returns at the sampling frequency that maximized the information ratio, based on the ‘standard’ way of measuring the realized covariance matrix. We report the mean active return (μ_p) and tracking error (TE_p) in annualized percentage points, the information ratio (IR), the annualized basis points fee (Δ_γ) an investor with quadratic utility and constant relative risk aversion of γ would pay to switch from the daily returns covariance matrix estimate to the intraday returns of the optimal portfolios. The column headed c indicates the level of transaction costs, expressed in annualized percentage points, which correspond with the reduction in the annualized portfolio return if the entire portfolio would have to be traded every day during the whole year. The column headed h indicates the optimal sampling frequency, expressed as the length of the corresponding return interval in minutes.

Notes: The table shows the out-of-sample performance of the overall minimum volatility (tracking error) portfolio, with weights given in (6), and the minimum variance portfolio given an

(8), cons

frequenc

result

return

perform

and 3, a

of α_h . C

columns 2

estimates

(panel A) or

the information ratio and tracking error (panel (B) for the resulting portfolios. Columns 5

About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click “Settings”. For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only

Settings

and 9, headed 'LogL', show the SR/IR and σ_p/TE_p for portfolios constructed with decay parameters for the conditional covariance matrix that are estimated by maximizing the log-likelihood over the complete out-of-sample period.

Related research

People also read

Recommended articles

Cited by
91



About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click "Settings". For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All 

Essential Only

Settings

Information for

Authors

R&D professionals

Editors

Librarians

Societies

Opportunities

Reprints and e-prints

Advertising solutions

Accelerated publication

Corporate access solutions

Open access

Overview

Open journals

Open Select

Dove Medical Press

F1000Research

Help and information

Help and contact

Newsroom

All journals

Books

Keep up to date

Register to receive personalised research and resources by email



Sign me up



Copyright © 2024 Informa UK Limited [Privacy policy](#) [Cookies](#) [Terms & conditions](#)

[Accessibility](#)



Taylor & Francis Group
an informa business

Registered in England & Wales No. 3099067
5 Howick Place | London | SW1P 1WG

About Cookies On This Site

We and our partners use cookies to enhance your website experience, learn how our site is used, offer personalised features, measure the effectiveness of our services, and tailor content and ads to your interests while you navigate on the web or interact with us across devices. You can choose to accept all of these cookies or only essential cookies. To learn more or manage your preferences, click "Settings". For further information about the data we collect from you, please see our [Privacy Policy](#).

Accept All

Essential Only

Settings