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ON THE INVERSE OF THE COVARIANCE MATRIX IN PORTFOLIO ANALYSIS

Guy V.G. Stevens

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Abstract

The goal of this study is the derivation and application of a direct characterization of the *inverse* of the covariance matrix central to portfolio analysis. As argued below, such a specification of the inverse, in terms of a few primitive constructs, helps clarify the determinants of such key concepts as (1) the optimal holding of a given risky asset, (2) the slope of the risk-return efficiency locus faced by the individual investor, and (3) the pricing of risky assets in the Capital Asset Pricing Model. The two building blocks of the inverse turn out to be the non-diversifiable part of each asset's variance and the multiple regression and correlation coefficients obtained by regressing each asset's excess expected returns of all other assets.

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Guy V. G. Stevens¹

I. Introduction and Summary

The goal of this study is the derivation and application of a direct characterization of the *inverse* of the covariance matrix $[\sigma_{ij}]$ central to portfolio analysis. As argued below, such a specification of the inverse, in terms of a few primitive constructs, helps clarify the determinants of such key concepts as (1) the optimal holding of a given risky asset, (2) the slope of the risk-return efficiency locus faced by the individual investor, and (3) the pricing of risky assets in the Capital Asset Pricing Model. The two building blocks of the inverse turn out to be the non-diversifiable part of each asset's variance, and the multiple regression and correlation coefficients obtained by regressing each asset's excess expected return on the set of excess expected returns of all other assets.

II. Preliminaries

It is well known that every optimizing mean-variance investor will choose a portfolio falling on his or her risk-return efficiency frontier -- the locus of portfolios of minimum variance conditional on a given expected return. As shown by Mossin (1973) and others, with the existence of a riskless asset, this frontier is a straight line in mean-standard deviation space, with a slope, dE/dS, equal to $(\overline{m}'C^{-1}\overline{m})^{1/2}$ -- where C^{-1} , the inverse of the matrix of asset variances and covariances, is the subject of this paper, and \overline{m} (and its transpose, \overline{m}') is the vector of the excess expected return of each asset over the riskfree rate: $\overline{r_i} - r_f$. To illustrate this derivation, assume markets for N risky assets, each with stochastic return $\overline{r_i}$ and expected return $\overline{r_i}$, along with the opportunity for unlimited lending and

¹ The author is a Senior Economist in the Division of International Finance, Board of Governors of the Federal Reserve System. The views expressed in this paper are the author's and should not be interpreted as reflecting those of the Board of Governors or other members of its staff. My thanks go to Charles Thomas, John Ammer, and William Helkie for very helpful discussions and comments.

borrowing of a riskless asset with return r_f . For an investor with initial wealth W, the expected return on any portfolio, E(Y), can be defined as:

$$E(Y) = \overline{Y} = r_f W + \sum_{i=1}^{N} z_i (\overline{r_i} - r_f) = r_f W + z' \overline{m}.$$
(1)

In addition to previously defined terms, z is the $N \times I$ column vector of nominal security holdings, with elements z_i . The variance of Y is:

$$V(Y) = \sum_{i=1}^{N} \sum_{j=1}^{N} z_{i} z_{j} \sigma_{ij} = z' C z.$$
 (2)

Minimizing V(Y) subject to a predetermined level of E(Y) yields the following set of first order conditions for points on the risk-return efficiency frontier:

$$2Cz - \lambda \bar{m} = 0, \qquad (3)$$

where λ is the Lagrange multiplier for the constraint.

Solving this system of equations for z leads to the following expression for the vector of optimal holdings of risky assets along the efficiency frontier:

$$2z = \lambda C^{-1} \overline{m}. \tag{4}$$

Although the level of vector z depends on the unknown λ --- and, therefore, generally on the investor's utility function and the required expected return -- equation (4) does fix the *ratios* of the various risky assets along the efficiency frontier in any optimal portfolio: the famous portfolio separation theorem discovered by Tobin (1958). These optimal ratios will be preference-free, depending only on the investor's estimates of expected excess returns, and, once again, the elements, c_{ij}^{-4} , of the inverse of the covariance matrix:

$$\frac{z_i}{z_j} = \frac{\sum_{k=1}^{N} \bar{m}_k c_{ik}^{-1}}{\sum_{k=1}^{N} \bar{m}_k c_{jk}^{-1}}.$$
(5)

By combining equations (4), (1) and (2), one derives the investor's risk-return frontier -which happens to be linear in expected return and standard deviation:

$$E(Y) - r_{f}W = (\bar{m}'C^{-1}\bar{m})^{1/2}\sqrt{V(Y)}.$$
 (6)

Equations (4) and (5) and (6) emphasize the importance of the elements of the *inverse* of the covariance matrix C. Typically in portfolio analysis, however, we do not characterize these elements directly, but only indirectly, as those elements that map the original covariance matrix, C, into the identity matrix. The purpose of this note is to derive a *direct characterization* of the elements of C^{-1} , one that relies on a few key concepts and that leads to straightforward explanations of the optimal ratios in (5) and the slope of the risk-return locus in (6).

III. Derivation

We will start by adapting a useful partitioning technique developed by Anderson and Danthine (1981) for their study of hedging in futures markets. Partition the set of N first order conditions (3) between the first equation and a N-1 equation block as follows:

$$\sigma_{11}z_{1} + \sum_{j=2}^{N} \sigma_{1j} z_{j} = \frac{\lambda}{2}\overline{m}_{1}$$

$$c_{.1} z_{1} + C_{N-1} z_{N-1} = \frac{\lambda}{2}\overline{m}_{N-1}$$
(7)

The scaler variances, covariances, and levels of asset holdings (the z_js), and excess return on the first asset (\overline{m}_1) in the first equation are defined above. The matrix C_{N-1} in the bottom block is the N-1 square submatrix of the variance-covariance matrix C formed by eliminating its first row and column; the first term of the bottom block, c_{I} , is a N-1×1 column vector comprising all but the first element (σ_{11}) of the first column of the original C matrix (i.e. the covariances of the first asset with each of the remaining N-1 other assets); finally, z_{N-1} and \overline{m}_{N-1} are the N-1 column vectors made up of all but the first elements of the original z and m vectors, respectively. Using this terminology, one can see that the summation term in the first equation of (6) equals the vector product: $c_{11}' z_{N-1}$. Let us now solve the bottom block of N equations for the N-1×1 column vector z_{N-1} . Assuming the various inverses exist:

$$z_{N-1} = \frac{\lambda}{2} C_{N-1}^{-1} \ \overline{m}_{N-1} - C_{N-1}^{-1} \ c_{1} \ z_{1}. \tag{8}$$

This expression makes the holdings in z_{N-1} (i.e. the levels of the holdings for assets 2 through N) a function of the excess expected returns on *all* these other assets (\overline{m}_{N-1}) and z_{j} , the holdings for asset 1. Note particularly the set of coefficients multiplying the level of z_j : $-C_{N-1}^{-1} c_{,1}$; this is the $(N-1) \times 1$ vector of *least squares regression coefficients*, β , when the excess expected return for asset 1 is regressed on the excess expected returns for the other N-1 assets.² Thus, insofar as the return on a given asset *j* has a high positive coefficient in the regression for r_j , the holding for asset *j* will be

² The regression coefficients $-C_{N-1}^{-1} c_{.1}$ are easily related to the data-based regression coefficients found in econometric texts. Thus, assume that there are T observations on the excess returns for each of the N variables. Following the partition introduced above, denote the T by 1 vector of observed excess returns on the first asset by y; also, denote, the T by N-1 array of the vectors of excess returns on the other variables by X. The sample-based estimate of the true variance-covariance matrix, C, would then be X' X; similarly, the estimate of c_{.1}, the covariances of the first asset with all the N-1 others, would be X' y. Thus, the *estimated* regression coefficient $\hat{\beta}$ would be (X' X)⁻¹ X' y -- the typical expression in econometric texts and the empirical analog to $-C_{N-1}^{-1} c_{.1}$.

correspondingly low. For future reference, it might be noted that the square of the *multiple regression* coefficient for the above regression equals $c'_{1} C_{N-1}^{-1} c_{1} / \sigma_{11}$.

Let us now substitute this expression for z_{N-1} into the first equation in system (7). We get an equation for the holdings of asset 1:

$$z_{1}\left[\sigma_{11} - c_{.1}' C_{N-1}^{-1} c_{.1}\right] = \frac{\lambda}{2} \left[\overline{m}_{1} - c_{.1}' C_{N-1}^{-1} \overline{m}_{N-1}\right].$$
(9)

As shown above, by substituting the appropriate regression coefficients and multiple correlation coefficient for the vector and matrix products appearing in (8), this expression for z_1 can be simplified as follows:

$$z_{1} \sigma_{11} \left[1 - R_{1}^{2} \right] = \frac{\lambda}{2} \left[\overline{m}_{1} - \beta' \overline{m}_{N-1} \right].$$
(10)

Since the original partition (6) can be carried out with any of the N assets as the first, the holdings for any asset, z_i , can be expressed in the form of equation (9) above.

Equation (9) also provides us with the means to answer the primary question of this paper: how to provide a meaningful and direct characterization of the elements of the inverse matrix, C^{-1} . Recall that in equations (4), we have an alternative equation for each z_i in terms of the elements of C^{-1} and the excess return vector, \overline{m} . Our approach will be to use the known elements in the equation (9) for z_1 to solve for the unknown elements of the covariance matrix appearing in (4).

To determine the first row of the C^{-1} matrix, solve (9) for z_1 and subtract the alternative

³ The previous footnote shows that, in terms of textbook econometric notation, this term equals: $y'X\hat{\beta}/y'y$, which equals the square of the multiple correlation coefficient of variable 1 (y) regressed on the *N-1* other variables. For a discussion of this and earlier econometric points, see e.g., Johnston (1972), ch. 5, or Harvey (1990), ch. 2.

equation for z_1 , the first row of the set of equations (4). This leads to:

$$0 = \left[\frac{1}{\sigma_{11}(1-R_1^2)} - c_{11}^{-1}\right] \frac{\lambda m_1}{2} + \sum_{j=2}^{N} \left[-\frac{\beta_j}{\sigma_{11}(1-R_1^2)} - c_{1j}^{-1}\right] \frac{\lambda m_j}{2}.$$
 (11)

Since the excess expected returns, \bar{m}_j , may assume any value, the only way for (11) to hold is for each term in brackets to be identically equal to zero. Thus, c_{11}^{-1} must equal the reciprocal

of $\sigma_{11}(1 - R_1^2)$ -- that part of the variance of the first asset that *cannot* be diversified away by investing in the *N-1* other assets (the asset's non-systematic risk). Similarly, the other elements of the first row, c_{1j}^{-1} , must equal $-\beta_{1j}/\sigma_{11}(1 - R_1^2)$ -- minus the regression coefficient for the *j*th asset in the regression explaining the return on the first asset divided by that asset's non-systematic risk.

Since C^{-1} is symmetric, the argument above is sufficient to determine the elements in both the first row and column. Although a certain measure of care must be taken in the proofs, it turns out that the same argument can be used to derive a version of equation (11) for asset levels z_2 through z_n .⁴ The end result is that the diagonal elements of C^{-1} equal the reciprocals of $\sigma_{ii}(1 - R_i^2)$, where R_i^2 equals the multiple correlation coefficient for the regression of the return of the *i*th stock on the set of all other returns. The off-diagonal elements, c_{ij}^{-1} , it turns out, can be expressed alternatively as the

regression coefficient $-\beta_{ij} / [\sigma_{ii}(1 - R_i^2)]$ or $-\beta_{ji} / [\sigma_{jj}(1 - R_j^2)]$, the two expressions being equal.

The upshot of all of the above is the following direct characterization of the inverse of the

⁴ Clearly when we partition the first order conditions (7) differently, with another variable shifted into the first column and row, the original C matrix is changed. Putting the first order condition for z_i as the first row and column involves an even number of permutations of rows and columns of the original matrix; thus the determinants of the new and old system are equal. Similar statements hold for the other determinants and matrices leading to the expressions (8) and (10) for z_i .

covariance matrix of returns for the set of N assets in question:⁵

$$\frac{1}{\sigma_{11}(1-R_{1}^{2})} - \frac{\beta_{12}}{\sigma_{11}(1-R_{1}^{2})} - \frac{\beta_{1N}}{\sigma_{11}(1-R_{1}^{2})} - \frac{\beta_{1N}}{\sigma_{11}(1-R_{1}^{2})} - \frac{\beta_{2N}}{\sigma_{22}(1-R_{2}^{2})} - \frac{1}{\sigma_{22}(1-R_{2}^{2})} - \frac{\beta_{2N}}{\sigma_{22}(1-R_{2}^{2})} - \frac{\beta_{2N}}{\sigma_{2N}(1-R_{2}^{2})} - \frac{\beta_{2N$$

IV. Implications

A. Asset Holdings

Equation (12) shows that the many elements of the inverse matrix appearing in the expressions for the level (4) and ratio (5) of the dollar holdings of any asset *i* can be succinctly related to three primary factors (in addition to the Lagrange multiplier): (1) positively to the asset's expected excess return over the riskfree rate, $\overline{m_i}$; (2) inversely to the non-diversifiable part of the asset's variance $[\sigma_{ii}(1 - R_i^2)]$ -- where $(1 - R_i^2)$ is the percentage of the variance that cannot be explained by a linear combination of the returns on all other available assets; (3) positively or negatively to the expected

⁵ That this matrix indeed is the inverse for the original covariance matrix C is verified most easily by relating the elements of (12) to the determinants defining the traditional definition of C⁻¹. An element, c^{-1}_{ij} , can be shown to be equal to the ratio of the cofactor *ji* of the original covariance matrix (Cof_{ij}) and the determinant of C (detC). (Since C is symmetric, the cofactor *ji* equals the cofactor *ij*.) By adapting some results of Johnston (1972), p. 132 ff., one can relate the elements in matrix (12) to the above cofactors and determinant. Johnston, as an alternative to the normal econometric notation, relates normal regression coefficients and multiple correlation coefficients to the cofactors of the associated *correlation* matrix. One can use these results to show directly that Cof_{ii} / detC, the expression for c^{-1}_{μ} , equals 1 / $[\sigma_{ii}(1 - R_i^2)]$; similarly, c^{-1}_{ij} , defined as Cof_{ij} / detC, equals also (Cof_{ij} / Cof_{ii})(Cof_{ii} /detC), which equals $-\beta_{ij}$ / $[\sigma_{ii}(1 - R_i^2)]$.

excess returns on other assets, \overline{m}_i , depending on the sign of the regression coefficient, $-\beta_{ij}$.

B. The Investor's Risk-Return Frontier

Equation (6), above, shows the investor's optimal tradeoff between risk and return to be linear with slope $(\overline{m}'C^{-1}\overline{m})^{1/2}$. The direct characterization of C^{-1} in (12) shows us how to interpret this expression.

In the simplest case, a world with a single risky asset, C^{-1} collapses to $1/\sigma_{11}$ and the slope, dE/dS reduces to $m_1/\sqrt{\sigma_{11}}$, the only possible tradeoff between risk and return in such a world. The second simplest case involves adding a second risky asset, but with returns independent from the first. This changes $(\overline{m}'C^{-1}\overline{m})^{1/2}$ and dE/dS to the square root of $\frac{m_1^2}{\sigma_{11}} + \frac{m_2^2}{\sigma_{22}}$. If the investor optimizes -

in this case by taking a diversified portfolio -- the optimal tradeoff becomes a function of the expected excess returns of the two assets: the square of dE/dS being a weighted average of the squared excess returns, the weights being the reciprocals of the variances of the respective assets. Because of the power of diversification, the investor's tradeoff between risk and return can easily be shown to have improved (the slope increased). Because of the diagonality of the inverse matrix (12) in the case of independent asset returns, the above results are easily generalized to any number of assets. Thus, for N assets:

$$\bar{m}'C^{-1}\bar{m} = \sum_{i=1}^{N} \left[m_i^2 / \sigma_{ii} \right].$$
(13)

The most realistic cases of course are those where the asset returns are correlated -- where the off-diagonal elements and the multiple correlation coefficients in (12) are non-zero. How the knowledge of C^{-1} helps in the analysis can be illustrated by a consideration of the general 2-asset case. After some algebra, the general form of the risk-return tradeoff can be related to that for the independence case as follows:

$$\overline{m}'C^{-1}\overline{m} = \frac{m_1^2}{\sigma_{11}} + \frac{m_2^2}{\sigma_{22}} + \left[\frac{m_1^2}{\sigma_{11}(1-R_1^2)} + \frac{m_2^2}{\sigma_{22}(1-R_2^2)} - \frac{2\beta_{12}m_1m_2}{\sigma_{11}(1-R_1^2)}\right].$$
 (14)

Whether the non-zero correlation between the two risky returns improves or worsens the investor's risk-return tradeoff, depends, relative to the independence case, on the sign of the sum inside the brackets. One immediate implication is that when the two assets are *negatively* correlated -- β_{12} negative -- the tradeoff must improve.⁶

For a *positive* β_{12} , the analysis of (14) leads to the answer "it depends." For example, consider the case where the expected excess returns and variances of both assets are equal; since it is easily shown for this case that $R_1^2 = R_2^2 = \beta_{12}^2 = \beta_{21}^2$, the numerator of the expression in brackets simplifies to $2m^2\beta_{12}(\beta_{12}-1)$. In this special case, however, β_{12} must be less than one, so *any positive*

covariance will worsen the risk-return tradeoff.

That this last result is not general can be seen by considering specific values when the excess returns of the two asset are allowed to diverge. A typical case leading to a positive sign on the bracketed terms in (14) is: β_{12} = .95, m_1 = 10, m_2 = 2, with $\sigma_{11} = \sigma_{22}$. The explanation for this improvement in the risk-return tradeoff over the independence case can be understood by using equation (4) and the elements of C^{-1} to look at the optimal holdings of the two assets for the above values. It turns out that the optimal portfolio in this case specifies a *short position* in asset 2. With the high positive covariance between the two returns, the optimizing investor can control the risk

⁶ This statement assumes that the excess expected returns of both assets are positive. In the 2 variable case, of course, the covariance σ_{12} determines the sign of both regression coefficients, $\beta_{ij} = \sigma_{ij} / \sigma_{jj}$.

buildup of a heavy investment in the high-return asset by going short in the other.

C. Linkages to the Capital Asset Pricing Model

The assumptions of the CAPM do not admit short positions, so the slope of the risk-return locus, $\overline{m} \, {}^{\prime}C^{-1}\overline{m}$, that led to the previous result would be inadmissible in this context; typically the excess returns would adjust until all assets would be held in long positions. It is not hard to show how the *equilibrium* risk-return locus determined by the CAPM is related to $\overline{m} \, {}^{\prime}C^{-1}\overline{m}$. A major result of the CAPM is that the market portfolio, with expected return (per dollar) r_{M} and standard deviation σ_{M} , lies on the risk-return efficiency frontier; given that the slope of the frontier is a constant, it must, therefore, be equal to $(r_{M} - r_{f}) \, / \sigma_{M}$. Under the assumptions of the CAPM -- among them the common beliefs as to expected returns, variances, and covariances -- each investor must share the same risk-return frontier. Thus:

$$(\boldsymbol{r}_{M} - \boldsymbol{r}_{f}) / \boldsymbol{\sigma}_{M} = \left(\boldsymbol{\bar{m}}' \boldsymbol{C}^{-1} \boldsymbol{\bar{m}} \right)^{1/2} .$$
(15)

Although the knowledge of the inverse matrix is related to and provides a useful characterization of the slope of the CAPM market line, it should be noted that, unlike the case in the previous section, the analysis of the effects of changes in the elements of C^{-1} on the risk-return frontier is no longer straightforward. This is because, for the general equilibrium relationship expressed by the CAPM line, the excess expected returns making up the \overline{m} vector are now *endogenous* variables; thus, any exogenous change in an element of the inverse matrix will also result in changes in some or all of the excess expected returns.

Other key concepts and relationships in the CAPM can be related to the elements of C^{-1} . Using equation (15), the equilibrium expression for the excess return on any security -- the CAPM security market line -- can be restated as follows:7

$$\overline{r}_{,-}r_{f} = \left[\frac{(\overline{r}_{,M}-r_{f})}{\sigma_{,M}}\right] \frac{\sigma_{iM}}{\sigma_{,M}} = \left[\left(\overline{m}'C^{-1}\overline{m}\right)^{1/2}\right] \frac{\sigma_{iM}}{\sigma_{,M}},$$
(16)

where σ_{iM} is the covariance of security i with the market portfolio.

The expression σ_{iM} / σ_M can be shown to be the effect on the risk of the market portfolio of a marginal dollar in asset *i*, while σ_{iM} / σ_M^2 is the security's beta, β_i . The key to reinterpreting these concepts in terms of the elements of C^{-1} is that the optimal security holdings of any investor can be expressed as a multiple of the market portfolio; thus, the vector of holdings equal to the market portfolio satisfies the optimal equations (3), (4), (5) and especially (7). The first row of the partition (7) is particularly useful, because when one substitutes the market portfolio for the z_i s in that row, the left hand side becomes σ_{1M} -- expressible as the product of the row vector of all the covariances of the first security, say σ_1 , and the market portfolio.⁸ Further, since the market portfolio satisfies the marginal conditions (4) for some Lagrange multiplier, $\lambda \cdot$, σ_{1M} equals ($\lambda * \sigma_1 C^{-1} \overline{m} / 2$); moreover, using (4) and substituting into the equation for the variance (2), the standard deviation of the market portfolio, σ_M , equals the same Lagrange multiplier times ($\overline{m} / C^{-1} \overline{m}^{1/2}$. We thus have the alternative

⁷ See, e.g., Copeland and Weston (1983), pp. 187-189 or Elton and Gruber (1987), chapter 11, for good expositions and derivations of the security market line and its components.

⁸ It might be worth noting that this first equation, which shows that the excess return on the first asset is proportional to σ_{1M} , can be used as a starting point for the derivation of the security market line. Moreover, since any asset can be chosen as the first, the above relationship holds generally.

expression, in terms of the elements of C^{-1} , for the marginal risk of security *i*:

$$\frac{\sigma_{iM}}{\sigma_{M}} = \frac{\sigma_{i.}C^{-1}\overline{m}}{(\overline{m}'C^{-1}\overline{m})^{1/2}}.$$
(18)

Similarly, β_i equals:

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$$\beta_i = \frac{\sigma_{iM}}{\sigma_M^2} = \frac{2\sigma_i C^{-1} \overline{m}}{\lambda^* \overline{m}' C^{-1} \overline{m}}.$$
(19)

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