Calibrating an eCompass in the Presence of Hard- and Soft-Iron Interference

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1 Introduction

This application note provides the theory for the in-situ calibration of a smartphone electronic compass (eCompass) for hard- and soft-iron effects. The mathematical framework is that developed in AN4248 "Implementing a Tilt-Compensated eCompass using Accelerometer and Magnetometer Sensors" and AN4247 "Layout Recommendations for PCBs Using a Magnetometer Sensor." It is therefore highly recommended to read these application notes first before reading this document.

1.1 Related Information

C source code and additional documentation are available for download at
www.freescale.com/sensorfusion.

Contents

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1.2   Key Words

eCompass, Geomagnetic, Magnetometer, Hard-Iron, Soft-Iron, Calibration.

1.3   Summary

- It is possible for a smartphone eCompass to be calibrated by the owner in the street with no a priori knowledge of location or the direction of magnetic north.

- Magnetometer measurements subject to hard- and soft-iron distortions caused from ferromagnetic materials on the PCB lie on the surface of an ellipsoid which can be accurately modelled by ten parameters.

- The calibration process consists of fitting the ten model parameters to the magnetometer measurements. Three model the hard-iron offset, six model the soft-iron matrix and one models the geomagnetic field strength.

- When the ten model parameters are known, it is a simple procedure in software to transform the magnetometer measurements from the surface of the ellipsoid to the surface of a sphere centered at the origin. This transformation removes the hard- and soft-iron interference allowing an accurate eCompass heading to be computed.

- A four parameter calibration, comprising the three hard-iron offsets plus the geomagnetic-field strength, may be sufficient for circuit boards without strong soft-iron interference. The full solution and a worked example is included in the text for this case.

- Reference C source code for the 10 parameter calibration can be licensed free of charge from Freescale for use in any product using a Freescale magnetometer. Please contact your Freescale sales representative for the license agreement.

2 The Hard- and Soft-Iron Model

AN4248 equation 4 defines the magnetic field B_p measured by a smartphone magnetometer in the absence of hard- and soft-iron effects after rotations in yaw ψ, pitch θ and roll ϕ by the rotation matrices $R_z(\psi)$, $R_y(\theta)$, and $R_x(\phi)$ as:

$$B_p = R_x(\phi)R_y(\theta)R_z(\psi)B_r = R_x(\phi)R_y(\theta)R_z(\psi)B\begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} \qquad \textbf{Eqn. 1}$$

B_r is the local geomagnetic field vector with magnitude B and magnetic inclination δ at the smartphone location.

The application note AN4247, section 6, defines the hard-iron offset as resulting from permanently magnetized ferromagnetic components on the PCB. Since the magnetometer and PCB rotate together, the hard-iron offset is a simple vector V_{PCB}, which adds to the magnetometer reading. AN4247, section 6, also notes that any zero field offset in the magnetometer factory calibration will appear as a fixed additive vector V_{Sensor}. For convenience, both offsets are normally combined as a single 'hard-iron' vector V defined as:

$$V = V_{PCB} + V_{Sensor} \qquad \textbf{Eqn. 2}$$

Including these terms in Equation 1 gives:

$$B_p = R_x(\phi)R_y(\theta)R_z(\psi)B\begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} + V \qquad \textbf{Eqn. 3}$$

AN4247 defines the soft-iron effect as the interfering magnetic field induced by the geomagnetic field onto normally unmagnetized ferromagnetic components on the PCB. The assumption is made that the induced soft-iron field is linearly related to the geomagnetic field measured in the rotated smartphone reference frame by the 3 by 3 matrix W_{Soft}. The linearity assumption is generally accurate but is not strictly true in the presence of magnetic hysteresis effects present in either the magnetometer or in ferromagnetic components on the PCB.

The magnetometer is normally calibrated by the supplier to have approximately equal gain in all three axes. Any remaining differences in gains can be modeled by a diagonal gain matrix W_{Gain}.

A final matrix, $W_{NonOrthog}$, can be used to model: i) the rotation of the magnetometer sensor relative to the smartphone coordinate system and ii) the lack of perfect orthogonality between sensor axes.

For convenience, all three matrices are combined into a single 3 by 3 soft-iron matrix W defined as:

$$W = W_{NonOrthog}W_{Gain}W_{Soft} \qquad \textbf{Eqn. 4}$$

Including the soft-iron matrix W into Equation 3 now defines the magnetometer reading after arbitrary smartphone rotations as:

$$B_p = WR_x(\phi)R_y(\theta)R_z(\psi)B\begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} + V \qquad \textbf{Eqn. 5}$$

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3 Applying Hard- and Soft-Iron Corrections to the Tilt-Compensated eCompass

The application note AN4248 provides the mathematics and reference C source code for a tilt-compensated eCompass with correction for hard-iron interference only. This section extends the mathematics in AN4248 to include the soft-iron interference defined by the matrix W in Equation 5.

Equations 13 and 15 in AN4248 define the roll ϕ and pitch θ angles as a function of the accelerometer sensor only. These equations are independent of magnetic interference and are therefore valid in the presence of hard- and soft-iron effects.

The effects of the soft-iron matrix W can be included in equation 16 in AN4248 by manipulating Equation 5 to give:

$$\boldsymbol{R}_z(\psi)B\begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} = \begin{pmatrix} \cos\psi & \sin\psi & 0 \\ -\sin\psi & \cos\psi & 0 \\ 0 & 0 & 1 \end{pmatrix}B\begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} = \boldsymbol{R}_y(-\theta)\boldsymbol{R}_x(-\phi)W^{-1}(\boldsymbol{B}_p - \boldsymbol{V}) \qquad \textbf{\textit{Eqn. 6}}$$

Equation 16 in AN4248 and Equation 6 are identical except for the presence of the inverse soft-iron matrix W^{-1} operating on the vector $(\boldsymbol{B}_p - \boldsymbol{V})$.

Expanding the components of Equation 6 gives Equations 7 and 8 below, These equations differ from equations 20 and 21 in AN4248 in that the vector $\begin{pmatrix} B_{fx} \\ B_{fy} \\ B_{fz} \end{pmatrix}$ is now the magnetometer reading corrected to the flat plane $\phi = \theta = 0$ with both hard- and soft-iron effects removed.

$$\cos\psi B\cos\delta = B_{fx} \qquad \textbf{\textit{Eqn. 7}}$$

$$\sin\psi B\cos\delta = -B_{fy} \qquad \textbf{\textit{Eqn. 8}}$$

$$\begin{pmatrix} B_{fx} \\ B_{fy} \\ B_{fz} \end{pmatrix} = \boldsymbol{R}_y(-\theta)\boldsymbol{R}_x(-\phi)W^{-1}(\boldsymbol{B}_p - \boldsymbol{V}) \qquad \textbf{\textit{Eqn. 9}}$$

The yaw or compass heading angle ψ is determined from the ratio of Equations 7 and 8 to give Equation 10 which is analogous to equation 22 in AN4248:

$$\tan\psi = \left(\frac{-B_{fy}}{B_{fx}}\right) \qquad \textbf{\textit{Eqn. 10}}$$

The extension to the C source code listed in AN4248 to incorporate both soft and hard-iron corrections is equally trivial. In AN4248, section 6.1, the hard-iron vector V alone is subtracted from magnetometer reading to give B_p - V:

```
/* subtract the hard iron offset */
iBpx -= iVx;
iBpy -= iVy;
iBpz -= iVz;
```

Both hard- and soft-iron interference are removed by computing $W^{-1}(B_p - V)$ from the magnetometer reading B_p. The inverse soft-iron matrix is assumed stored in Q15 fractional integer format with entries in the range -32768 to +32767 representing the range -1. to 0.9999.

```
/* 32 bit scratch integers */
int iSumx, iSumy, iSumz;
/* subtract the hard iron offset */
iBpx -= iVx;
iBpy -= iVy;
iBpz -= iVz;
/* multiply by the inverse soft iron offset */
iSumx = (InvW[0, 0] * iBpx) + (InvW[0, 1] * iBpy) + (InvW[0, 2] * iBpz);
iSumy = (InvW[1, 0] * iBpx) + (InvW[1, 1] * iBpy) + (InvW[1, 2] * iBpz);
iSumz = (InvW[2, 0] * iBpx) + (InvW[2, 1] * iBpy) + (InvW[2, 2] * iBpz);
/* return the resulting vector invW*(Bp-V) back into 16 bit Bp */
iBpx = (short)(iSumx >> 15);
iBpy = (short)(iSumy >> 15);
iBpz = (short)(iSumz >> 15);
```

Incorporating both hard- and soft-iron corrections into the tilt-compensated eCompass algorithm is therefore trivial if these calibration coefficients are known. Note that the geomagnetic field strength B and inclination angle δ cancel in going from Equations 7 and 8 to Equation 10. The only calibration values used in the code sample above are the components of the hard-iron vector V and the inverse soft-iron matrix W^{-1}.

The next sections discusses how V and W^{-1} can be computed from measurements made by the smartphone in the complete absence of any a priori information about the direction and strength of the geomagnetic field vector.

4 Relating the Locus of Magnetometer Measurements to Calibration Coefficients

Application note AN4247 introduces the concept of the locus of magnetometer measurements from an experimental perspective. This allows the PCB designer to visually determine the level of hard- and soft-iron interference prior to final PCB fabrication.

The same locus of magnetometer measurements represents the primary information available to the calibration algorithms to determine the hard- and soft-iron calibration V and W^{-1}. Under arbitrary rotation of the smartphone by its owner, the magnetometer readings lie on a surface which can be derived from Equation 5 to be:

$$\left\{ W^{-1}(B_p - V) \right\}^T W^{-1}(B_p - V) = \left\{ R_x(\phi)R_y(\theta)R_z(\psi)B \begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} \right\}^T R_x(\phi)R_y(\theta)R_z(\psi)B \begin{pmatrix} \cos\delta \\ 0 \\ \sin\delta \end{pmatrix} = B^2 \qquad \textbf{\textit{Eqn. 11}}$$

The general expression defining the locus of the vector R lying on the surface of an ellipsoid with center at R_0 is (where A must be a symmetric matrix):

$$(R - R_0)^T A (R - R_0) = const \qquad \textbf{\textit{Eqn. 12}}$$

Equations 11 and 12 are similar since it can be easily proved that the matrix $A = \{W^{-1}\}^T W^{-1}$ is symmetric:

$$A^T = \left\{ \left\{ W^{-1} \right\}^T W^{-1} \right\}^T = \left\{ W^{-1} \right\}^T \left\{ \left\{ W^{-1} \right\}^T \right\}^T = \left\{ W^{-1} \right\}^T W^{-1} = A \qquad \textbf{\textit{Eqn. 13}}$$

In general therefore, the locus of raw magnetometer measurements forms the surface of the ellipsoid defined by Equations 11 and 12. The ellipsoid is centered at the hard-iron offset $R_0 = V$, has shape determined by the matrix A (equal to transposed square of the inverse soft-iron matrix W^{-1}) and has the overall size defined by the geomagnetic field strength B.

Figure 1 shows Equation 11 visually using real magnetometer data measured in a strong hard- and soft-iron environment. The shaded ellipsoid shows the optimum fit of the matrix A, the hard-iron vector V and the geomagnetic field strength B to the data points. The excellent fit between the measurements and the optimum ellipsoid validates the linear magnetic model of Equation 11.
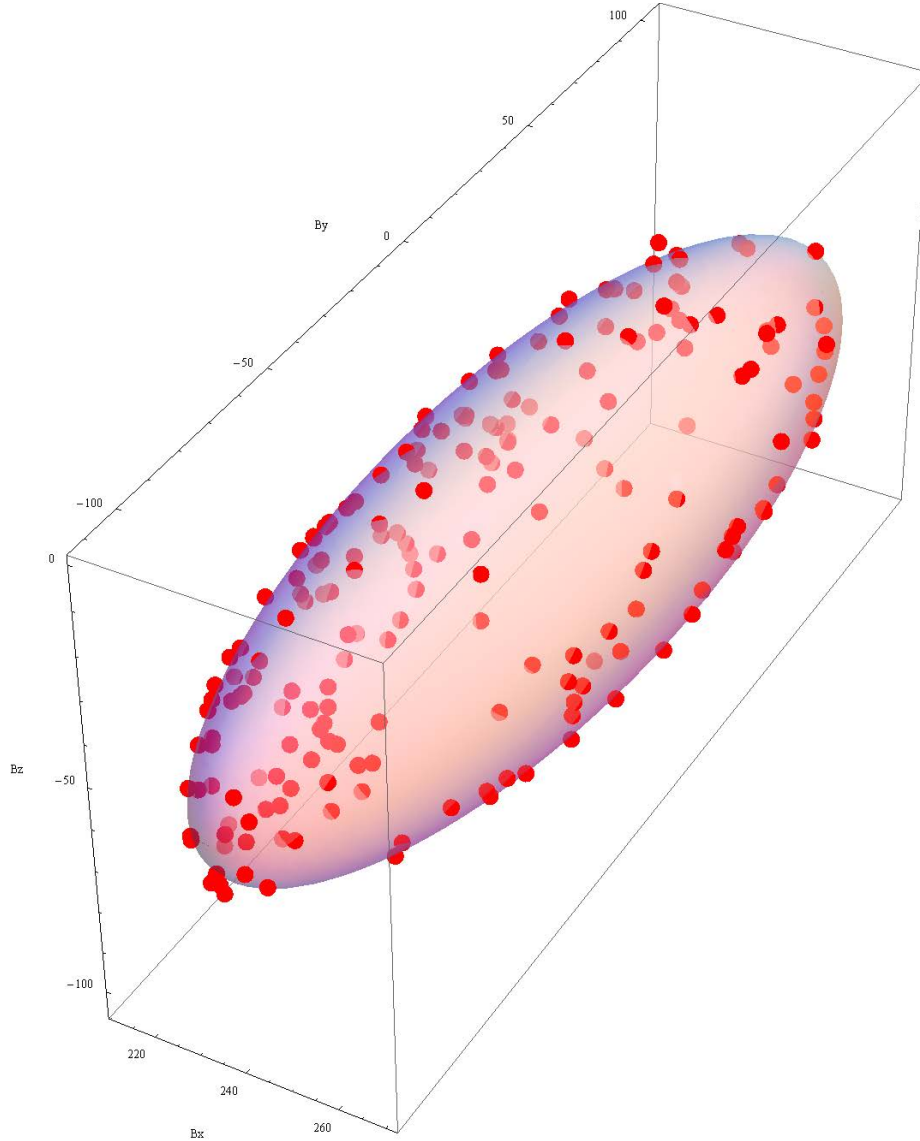
Figure 1. Locus of raw magnetometer measurements in a strong hard- and soft-iron environment with the optimum ellipsoidal fit superimposed.

The ellipsoid fit provides the matrix A and hard-iron vector $R_0 = V$ whereas the calculation of the calibrated magnetic field measurements $W^{-1}(B_p - V)$ requires the inverse soft-iron matrix W^{-1}. Although it is trivial to compute the ellipsoid fit matrix A from a given inverse soft-iron matrix W^{-1} using Equation 13, there is no unique solution to the inverse problem of computing W^{-1} from the matrix A. This problem and its solutions are discussed in the next section.

5 Imposing a Symmetric Constraint onto the Inverse Soft-Iron Matrix

Equation 4 defines the linear soft-iron model as derived from the product of three independent 3 by 3 matrices resulting in nine independent elements in the matrix $\boldsymbol{W}$. Using the magnetometer measurement locus in Equation 11 results in the soft-iron matrix appearing as the symmetric product matrix $\boldsymbol{A} = \{\boldsymbol{W^{-1}}\}^T \boldsymbol{W^{-1}}$ with only six independent coefficients. The mathematical process by which three degrees of freedom are lost is simple to follow in Equation 11. Physically, it can be understood as a result of the loss of angle information in the construction of the ellipsoidal measurement locus in Equation 11 since this is a function of the magnetometer measurements only.

The simplest solution is to impose the constraint that the inverse soft-iron matrix $\boldsymbol{W^{-1}}$ also be symmetric with six degrees of freedom. The argument for this constraint is discussed next.

Equation 5 relates each magnetometer measurement to the smartphone orientation, to the true hard-iron offset $\boldsymbol{V}$ and the true soft-iron matrix $\boldsymbol{W}$. If the readings $\boldsymbol{B}_p$ are corrected by an estimated hard-iron offset $\boldsymbol{V}_{Cal}$ and an estimated soft-iron matrix $\boldsymbol{W}_{Cal}$, then the resulting corrected magnetometer reading $\boldsymbol{B}_c$ is given by:

$$\boldsymbol{B}_c = \boldsymbol{W}_{Cal}^{-1}(\boldsymbol{B}_p - \boldsymbol{V}_{Cal}) = \boldsymbol{W}_{Cal}^{-1}\left\{ \boldsymbol{W}\boldsymbol{R}_x(\phi)\boldsymbol{R}_y(\theta)\boldsymbol{R}_z(\psi)B\begin{pmatrix} cos\,\delta \\ 0 \\ sin\,\delta \end{pmatrix} + (\boldsymbol{V} - \boldsymbol{V}_{Cal}) \right\} \qquad \textbf{Eqn. 14}$$

If the calibration algorithm correctly estimates the hard- and soft-iron coefficients, $\boldsymbol{W}_{Cal}^{-1}\boldsymbol{W} = \boldsymbol{I}$, $\boldsymbol{V}_{Cal} = \boldsymbol{V}$, then the corrected locus of readings lies on the surface of a sphere centered at the origin:

$$(\boldsymbol{B}_c)^T\boldsymbol{B}_c = \left\{ \boldsymbol{R}_x(\phi)\boldsymbol{R}_y(\theta)\boldsymbol{R}_z(\psi)B\begin{pmatrix} cos\,\delta \\ 0 \\ sin\,\delta \end{pmatrix} \right\}^T \boldsymbol{R}_x(\phi)\boldsymbol{R}_y(\theta)\boldsymbol{R}_z(\psi)B\begin{pmatrix} cos\,\delta \\ 0 \\ sin\,\delta \end{pmatrix} = B^2 \qquad \textbf{Eqn. 15}$$

The converse is not the case. An arbitrary rotation can be included in the estimated inverse soft-iron matrix $\boldsymbol{W}_{Cal}^{-1}$ and this would still result in the corrected locus of measurements lying on the surface of a sphere centred at the origin. This is because a sphere is still a sphere under arbitrary rotation. Mathematically, if $\boldsymbol{W}_{Cal}^{-1}\boldsymbol{W} = \boldsymbol{R}(\omega)$, where $\boldsymbol{R}(\omega)$ is an arbitrary rotation matrix by angle ω, then (using the result that the transpose of any rotation matrix $\boldsymbol{R}(\omega)^T$ is identical to rotation by the inverse angle $\boldsymbol{R}(-\omega)$), the corrected measurement locus still forms the surface of a sphere with radius B:

$$(\boldsymbol{B}_c)^T\boldsymbol{B}_c = \left\{ \boldsymbol{R}(\omega)\boldsymbol{R}_x(\phi)\boldsymbol{R}_y(\theta)\boldsymbol{R}_z(\psi)B\begin{pmatrix} cos\,\delta \\ 0 \\ sin\,\delta \end{pmatrix} \right\}^T \boldsymbol{R}(\omega)\boldsymbol{R}_x(\phi)\boldsymbol{R}_y(\theta)\boldsymbol{R}_z(\psi)B\begin{pmatrix} cos\,\delta \\ 0 \\ sin\,\delta \end{pmatrix} = B^2 \qquad \textbf{Eqn. 16}$$

If the constraint is applied that W^{-1} is symmetric, then it is impossible for any spurious rotation angle and error in compass heading to be introduced by the calibration process since any rotation matrix must be anti-symmetric.

A further understanding of the advantage of a symmetric inverse soft-iron matrix can be obtained by relating the eigenvectors of the matrix A to the eigenvectors of the inverse soft-iron matrix W^{-1}. The eigenvectors X_i and eigenvalues e_i of the inverse soft-iron matrix W^{-1} are defined by:

$$W^{-1}X_i = e_i X_i \qquad \textbf{\textit{Eqn. 17}}$$

Given that W^{-1} is symmetric then: i) the eigenvectors of the matrix A are identical to the eigenvectors X_i of W^{-1} and ii) the eigenvalues of A are the square of the eigenvalues e_i of W^{-1}:

$$AX_i = \left\{W^{-1}\right\}^T W^{-1}X_i = \left\{W^{-1}\right\}^T e_i X_i = e_i W^{-1}X_i = e_i^2 X_i \qquad \textbf{\textit{Eqn. 18}}$$

Since the eigenvectors of the matrix A represent the principal axes of the magnetometer measurement ellipsoid (the Principal Axis Theorem in geometry), then constraining the inverse soft-iron matrix W^{-1} to be symmetric shrinks the ellipsoid into a sphere along the principal axes of the ellipsoid without applying any additional spurious rotation.

Comparing Equations 12 and 13 and using the symmetry property of W^{-1}, the hard- and soft-iron magnetic calibration parameters are related to the magnetometer ellipsoid locus by:

$$V = R_0 \qquad \textbf{\textit{Eqn. 19}}$$

$$\left\{W^{-1}\right\}^T W^{-1} = W^{-1}W^{-1} = A \Rightarrow W^{-1} = A^{\frac{1}{2}} \qquad \textbf{\textit{Eqn. 20}}$$

Figure 2 shows the measured magnetometer data of Figure 1 after application of Equation 16 to compute the calibrated measurement B_c. The inverse soft-iron matrix W^{-1} was computed from the square root of the ellipsoid fit matrix A using Equation 20. The data obviously lies on the surface of the sphere with radius B centered at the origin as predicted in Equation 16. These calibrated measurements can now be passed to the tilt-compensated eCompass algorithm for calculation of the compass heading.
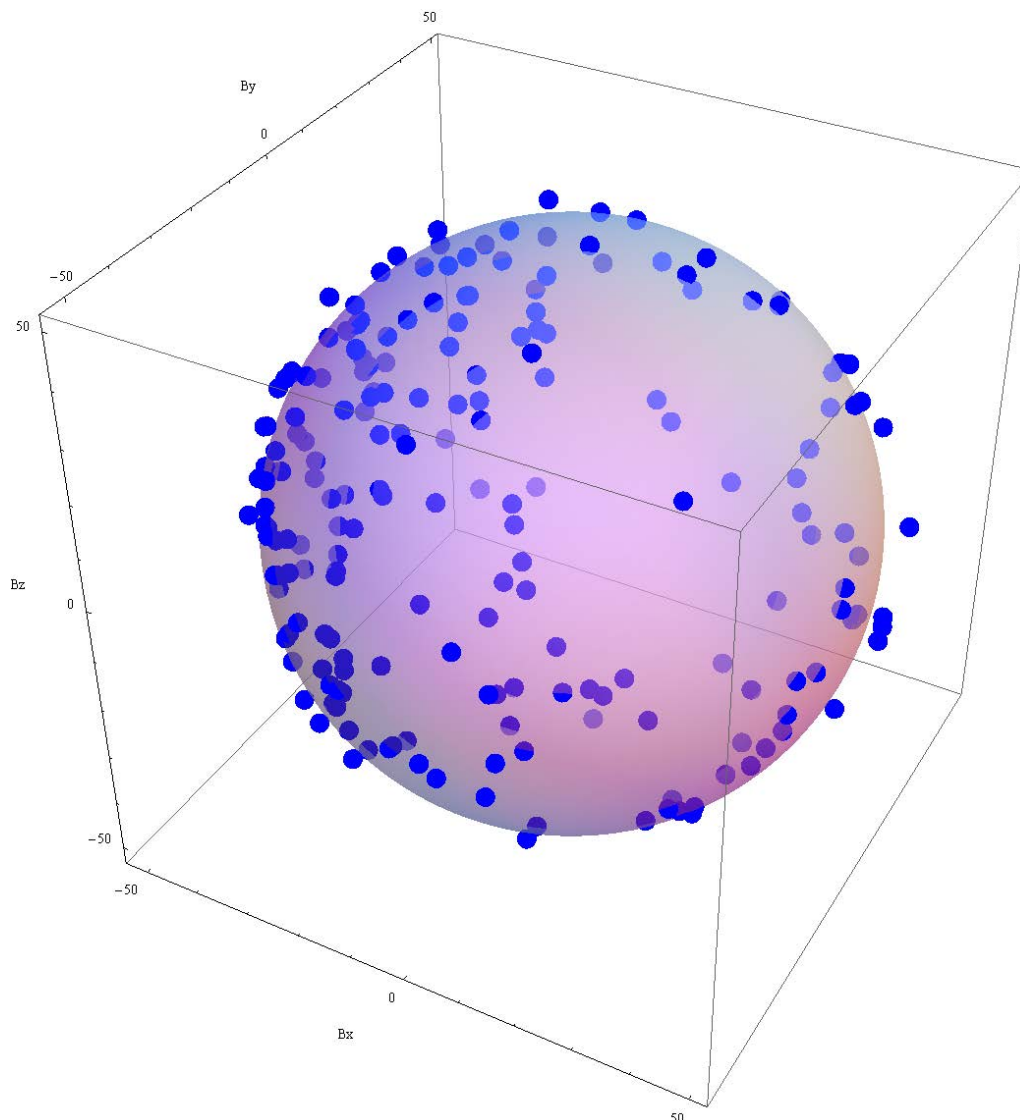
Figure 2. Locus of the magnetometer measurements of Figure 1 after calibration for hard- and soft-iron effects.

Figure 3 shows the data from Figures 1 and 2 combined on the same plot. The calibration process can be summarized as i) computing an optimal ellipsoid fit A, $R_0 = V$ to the raw measured data shown in red ii) computing the inverse soft-iron matrix from the square root of the ellipsoid matrix A and iii) applying the hard- and inverse soft-iron correction which translates the red measurement ellipsoid to the origin and then shrinks it down its principal axes to produce the blue calibrated measurements.
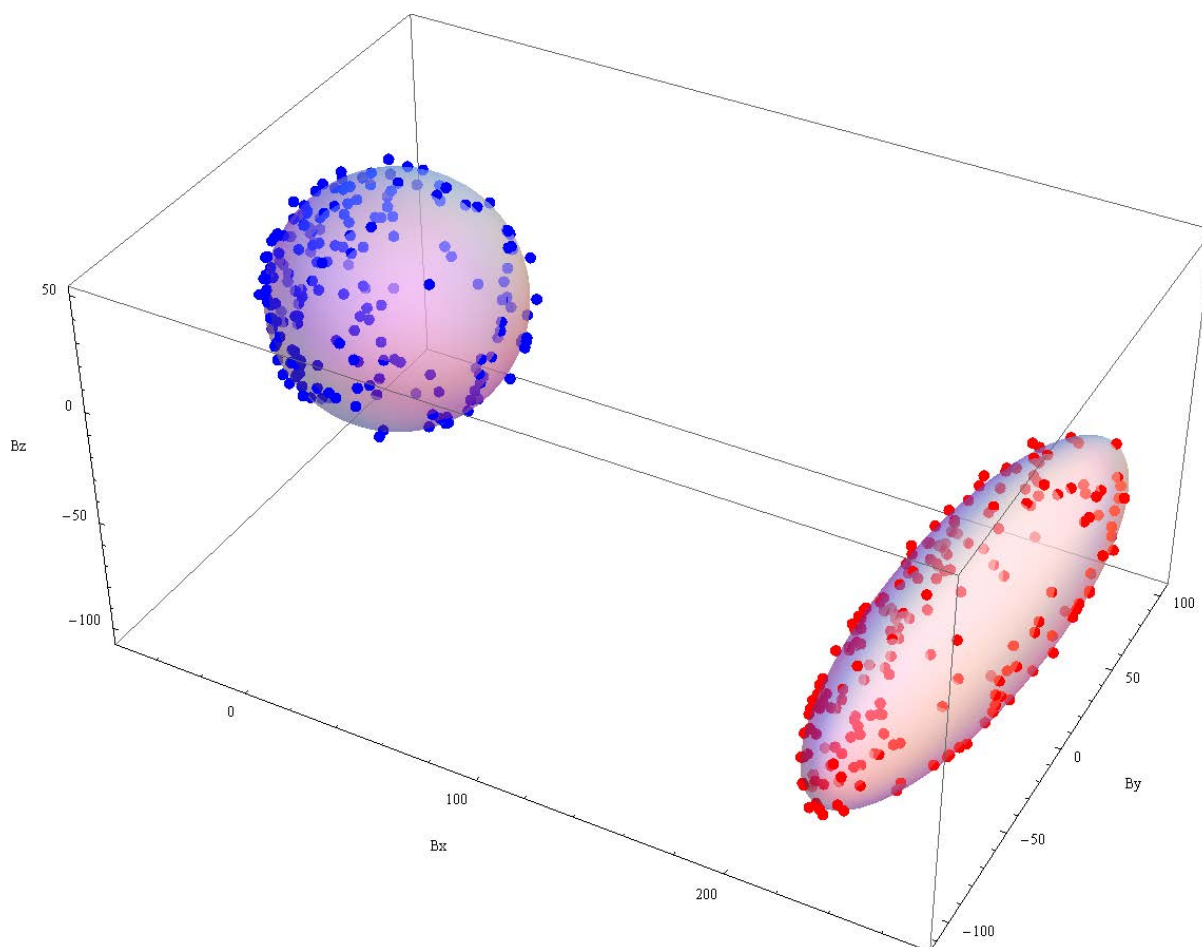
Figure 3. Combination plot showing Figures 1 and 2 showing uncalibrated and calibrated magnetometer measurements.

6 Full Solution for Four Parameter Calibration

The magnetic calibration problem permits a particularly simple solution for the case where the hard-iron offset dominates and soft-iron effects can be ignored. This simplification results in just four calibration parameters being determined: the three components of the hard-iron vector V plus the geomagnetic field strength B. The soft-iron matrix W is assumed to be the identity matrix.

With these assumptions, equation 11 simplifies to:

$$(B_p - V)^T(B_p - V) = B^2 \qquad\qquad \textbf{Eqn. 21}$$

$$\Rightarrow B_p{}^T B_p - 2B_p{}^T V + V^T V - B^2 = 0 \qquad\qquad \textbf{Eqn. 22}$$

The residual error $r[i]$ for the i-th measurement is then:

$$r[i] = B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2 - 2B_{px}[i]V_x - 2B_{py}[i]V_y - 2B_{pz}[i]V_z + V_x^2 + V_y^2 + V_z^2 - B^2 \qquad \textbf{Eqn. 23}$$

where V_x, V_y and V_z are the components of the hard-iron vector V:

$$V = \begin{pmatrix} V_x \\ V_y \\ V_z \end{pmatrix} \qquad\qquad \textbf{Eqn. 24}$$

and where B_{px}, B_{py}, B_{pz} are the components of the magnetometer measurement B_p:

$$B = \begin{pmatrix} B_{px} \\ B_{py} \\ B_{pz} \end{pmatrix} \qquad\qquad \textbf{Eqn. 25}$$

The objective of the calibration is to take a series of magnetometer measurements and fit the four model parameters V_x, V_y, V_z and B to minimize the fit error to Equation 23 in a least squares sense.

Equation 23 can be written more conveniently in matrix form as:

$$r[i] = \left(B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2 \right) - \begin{pmatrix} B_{px}[i] \\ B_{py}[i] \\ B_{pz}[i] \\ 1 \end{pmatrix}^T \begin{pmatrix} 2V_x \\ 2V_y \\ 2V_z \\ B^2 - V_x^2 - V_y^2 - V_z^2 \end{pmatrix} \qquad \textbf{Eqn. 26}$$

If M measurements are used to compute the calibration (where M must be greater than, or equal to four since there are four unknowns to be determined), Equation 26 can be expanded to:

$$
\begin{pmatrix} r[0] \\ r[1] \\ ... \\ r[M-1] \end{pmatrix} = \begin{pmatrix} B_{px}[0]^2 + B_{py}[0]^2 + B_{pz}[0]^2 \\ B_{px}[1]^2 + B_{py}[1]^2 + B_{pz}[1]^2 \\ ... \\ B_{px}[M-1]^2 + B_{py}[M-1]^2 + B_{pz}[M-1]^2 \end{pmatrix} - \begin{pmatrix} B_{px}[0] & B_{py}[0] & B_{pz}[0] & 1 \\ B_{px}[1] & B_{py}[1] & B_{pz}[1] & 1 \\ ... & ... & ... & 1 \\ B_{px}[M-1] & B_{py}[M-1] & B_{pz}[M-1] & 1 \end{pmatrix} \begin{pmatrix} 2V_x \\ 2V_y \\ 2V_z \\ B^2 - V_x^2 - V_y^2 - V_z^2 \end{pmatrix}
$$

Eqn. 27

Equation 27 can be further abstracted to:

$$r = Y - X\beta$$

Eqn. 28

where Y is the vector of the known dependent variables:

$$
Y = \begin{pmatrix} B_{px}[0]^2 + B_{py}[0]^2 + B_{pz}[0]^2 \\ B_{px}[1]^2 + B_{py}[1]^2 + B_{pz}[1]^2 \\ ... \\ B_{px}[M-1]^2 + B_{py}[M-1]^2 + B_{pz}[M-1]^2 \end{pmatrix}
$$

Eqn. 29

X is the matrix of known magnetometer measurements:

$$
X = \begin{pmatrix} B_{px}[0] & B_{py}[0] & B_{pz}[0] & 1 \\ B_{px}[1] & B_{py}[1] & B_{pz}[1] & 1 \\ ... & ... & ... & 1 \\ B_{px}[M-1] & B_{py}[M-1] & B_{pz}[M-1] & 1 \end{pmatrix}
$$

Eqn. 30

β is the solution vector from which the four calibration parameters can be easily determined:

$$
\beta = \begin{pmatrix} \beta_0 \\ \beta_1 \\ \beta_2 \\ \beta_3 \end{pmatrix} = \begin{pmatrix} 2V_x \\ 2V_y \\ 2V_z \\ B^2 - V_x^2 - V_y^2 - V_z^2 \end{pmatrix}
$$

Eqn. 31

and r is the vector of the error residuals for each of the M magnetometer measurements:

$$r = \begin{pmatrix} r[0] \\ r[1] \\ ... \\ r[M-1] \end{pmatrix}$$

Eqn. 32

The performance function P to be minimized by optimizing the calibration fit is simply defined to be the sum of the squares of the components of the error residual vector r:

$$P = r[0]^2 + r[1]^2 + ... + r[M-1]^2 = r^T r = (Y - X\beta)^T (Y - X\beta)$$

Eqn. 33

The solution to Equation 33 which minimizes P is derived in Freescale application note AN4399 to be:

$$\beta = (X^T X)^{-1} X^T Y$$

Eqn. 34

Since both the matrix X and the vector Y are known from the series of M magnetometer measurements, Equation 34 allows β to be determined through simple matrix algebra.

In practice, it is more elegant to compute the 4 x 4 matrix $X^T X$ and the 4 x 1 vector $X^T Y$ directly from the magnetometer measurements. This eliminates the storage overhead, which can be significant for large M, of the M by 4 matrix X and the M by 1 vector Y.

$$X^T X = \sum_{i=0}^{M-1} \begin{pmatrix} B_{px}[i]^2 & B_{px}[i]B_{py}[i] & B_{px}[i]B_{pz}[i] & B_{px}[i] \\ B_{px}[i]B_{py}[i] & B_{py}[i]^2 & B_{py}[i]B_{pz}[i] & B_{py}[i] \\ B_{px}[i]B_{pz}[i] & B_{py}[i]B_{pz}[i] & B_{pz}[i]^2 & B_{pz}[i] \\ B_{px}[i] & B_{py}[i] & B_{pz}[i] & 1 \end{pmatrix}$$

Eqn. 35

$$X^T Y = \sum_{i=0}^{M-1} \begin{pmatrix} B_{px}[i](B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2) \\ B_{py}[i](B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2) \\ B_{pz}[i](B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2) \\ B_{px}[i]^2 + B_{py}[i]^2 + B_{pz}[i]^2 \end{pmatrix}$$

Eqn. 36

Once β is determined, Equation 31 gives three components of the hard-iron vector and the geomagnetic field strength B as:

$$\varepsilon = \frac{1}{2B^2}\sqrt{\frac{P}{M}}$$

Eqn. 37

One important caveat to engineers is that the magnetometer measurements used to construct the measurement matrix of Equation 30 should be taken at different orientation angles to prevent magnetometer noise dominating the solution. While a detailed analysis of sensitivity to sensor noise is beyond the scope of this discussion, it should be apparent that ten magnetometer measurements made at the same orientation will be identical apart from sensor noise and will not lead to a quality solution. The standard approach is to use the accelerometer sensor to select magnetometer measurements for calibration taken at significantly different roll and pitch angles.

Worked example 1

What is the least squares solution for the hard-iron vector and the geomagnetic field strength using the six magnetometer measurements below (all in units of µT)?

Table 1.

$B_p[0] = \begin{pmatrix} 167.4 \\ -242.4 \\ 91.7 \end{pmatrix}$	$B_p[1] = \begin{pmatrix} 140.3 \\ -221.9 \\ 86.8 \end{pmatrix}$
$B_{px}[0]^2 + B_{py}[0]^2 + B_{pz}[0]^2 = 95189.4$	$B_{px}[1]^2 + B_{py}[1]^2 + B_{pz}[1]^2 = 76457.9$
$B_p[2] = \begin{pmatrix} 152.4 \\ -230.4 \\ -0.6 \end{pmatrix}$	$B_p[3] = \begin{pmatrix} 180.3 \\ -270.6 \\ 71.0 \end{pmatrix}$
$B_{px}[2]^2 + B_{py}[2]^2 + B_{pz}[2]^2 = 76310.3$	$B_{px}[3]^2 + B_{py}[3]^2 + B_{pz}[3]^2 = 110773.5$
$B_p[4] = \begin{pmatrix} 190.9 \\ -212.4 \\ 62.7 \end{pmatrix}$	$B_p[5] = \begin{pmatrix} 192.9 \\ -242.4 \\ 17.1 \end{pmatrix}$
$B_{px}[4]^2 + B_{py}[4]^2 + B_{pz}[4]^2 = 85487.9$	$B_{px}[5]^2 + B_{py}[5]^2 + B_{pz}[5]^2 = 96260.6$

Substituting these measurements into Equations 29 and 30 gives the vector Y and measurement matrix X to be:

$$Y = \begin{pmatrix} 95189.4 \\ 76457.9 \\ 76310.3 \\ 110773.5 \\ 85487.9 \\ 96260.6 \end{pmatrix}$$

Eqn. 38

$$X = \begin{pmatrix} 167.4 & -242.4 & 91.7 & 1 \\ 140.3 & -221.9 & 86.8 & 1 \\ 152.4 & -230.4 & -0.6 & 1 \\ 180.3 & -270.6 & 71.0 & 1 \\ 190.9 & -212.4 & 62.7 & 1 \\ 192.9 & -242.4 & 17.1 & 1 \end{pmatrix}$$

Eqn. 39

Substituting into Equation 34 gives the solution vector β as:

$$\beta = \left\{ \begin{pmatrix} 167.4 & -242.4 & 91.7 & 1 \\ 140.3 & -221.9 & 86.8 & 1 \\ 152.4 & -230.4 & -0.6 & 1 \\ 180.3 & -270.6 & 71.0 & 1 \\ 190.9 & -212.4 & 62.7 & 1 \\ 192.9 & -242.4 & 17.1 & 1 \end{pmatrix}^T \begin{pmatrix} 167.4 & -242.4 & 91.7 & 1 \\ 140.3 & -221.9 & 86.8 & 1 \\ 152.4 & -230.4 & -0.6 & 1 \\ 180.3 & -270.6 & 71.0 & 1 \\ 190.9 & -212.4 & 62.7 & 1 \\ 192.9 & -242.4 & 17.1 & 1 \end{pmatrix} \right\}^{-1} \begin{pmatrix} 167.4 & -242.4 & 91.7 & 1 \\ 140.3 & -221.9 & 86.8 & 1 \\ 152.4 & -230.4 & -0.6 & 1 \\ 180.3 & -270.6 & 71.0 & 1 \\ 190.9 & -212.4 & 62.7 & 1 \\ 192.9 & -242.4 & 17.1 & 1 \end{pmatrix}^T \begin{pmatrix} 95189.4 \\ 76457.9 \\ 76310.3 \\ 110773.5 \\ 85487.9 \\ 96260.6 \end{pmatrix}$$

Eqn. 40

$$\Rightarrow \beta = \begin{pmatrix} 311.5 \\ -478.2 \\ 91.7 \\ -81303.5 \end{pmatrix}$$

Eqn. 41

Substituting Equation 41 into Equation 35 gives the least squares fit to the hard-iron vector as:

$$\begin{pmatrix} V_x \\ V_y \\ V_z \end{pmatrix} = \left(\frac{1}{2}\right) \begin{pmatrix} \beta_0 \\ \beta_1 \\ \beta_2 \end{pmatrix} = \begin{pmatrix} 155.7 \\ -239.1 \\ 45.8 \end{pmatrix} \mu T$$

Eqn. 42

And finally, substituting into Equation 36 gives the geomagnetic field strength B as:

$$B = \sqrt{\beta_3 + V_x^2 + V_y^2 + V_z^2} = \sqrt{2205.4} = 47.0 \mu T$$

Eqn. 43

7   Calibration Algorithms and Source Code

This document has defined the calibration problem as the transformation of the locus of magnetometer measurement from the surface of an ellipsoid displaced from the origin to the surface of a sphere located at the origin. The algorithms and reference C source code which implement the calibration process are available for license from Freescale for use free of charge in any product using a Freescale magnetometer. Please contact your Freescale sales representative for details.

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