



# Article Using Euler Deconvolution as Part of a Mineral Exploration Project

G. R. J. Cooper 匝

School of Geosciences, University of the Witwatersrand, Johannesburg 2050, South Africa; gordon.cooper@wits.ac.za; Tel.: +27-11-7176-608; Fax: +27-11-7176-579

Abstract: Mineral exploration projects can make considerable use of a variety of geophysical techniques and datasets, including magnetic and gravity data. The interpretation of large quantities of data can be very time consuming, so semi-automatic interpretation techniques are often used to provide initial estimates of the parameters (primarily the location and depth) of the sources of anomalies. Euler deconvolution is a commonly used interpretation method for potential fields which has a number of advantages over many other techniques, such as working in the presence of remanent magnetisation, and not being restricted to a particular model such as a contact. A second-order version of Euler's equation is introduced here, which is much less affected by trends in the data than the standard method and additionally produces depth parabolas, which simplify the interpretation of results. The method was applied to aeromagnetic data from a mineral exploration project in Southern Africa and provided plausible results.

Keywords: gravity; magnetics; exploration

# 1. Introduction

Mineral exploration projects can make considerable use of a variety of geophysical techniques, including magnetic and gravity data. The interpretation of large quantities of geophysical data can be very time consuming, so semi-automatic interpretation techniques are often used to provide initial estimates of the parameters (primarily the location and depth) of the sources of anomalies There are many semi-automatic interpretation techniques available, such as analytic-signal-amplitude-based methods [1–4], Werner deconvolution [5], source-distance approaches [6,7], and Euler deconvolution. Euler deconvolution is based on Euler's homogenous function theorem, which is widely used throughout mathematics and physics. It states that for homogenous functions (i.e., those in which all terms are raised to the same power) of degree N, then [8–11]

$$f(t \cdot x, t \cdot z) = t^N f(x, z) \tag{1}$$

Differentiating Equation (1) with respect to t, and then setting t = 1, provides

$$x\frac{\partial f}{\partial x} + z\frac{\partial f}{\partial z} = -N \cdot f \tag{2}$$

Note that Equation (2) basically states that function f can be written in terms of combinations of its first order derivatives. When applied to potential field data f, then x and z are interpreted as the distances ( $\Delta x$  and  $\Delta z$ ) from the current point to the source in the x and z planes. The degree of homogeneity N (which is also termed the structural index, or SI) is the rate of decay of the amplitude of the field with distance from the source, e.g., N = 1 for the magnetic response of a dyke. Equation (2) is usually solved for  $\Delta x$  and  $\Delta z$  using a moving window of data points, with N being specified. The solutions are effectively averaged over the window size, so while larger window sizes can reduce the effect of



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**Copyright:** © 2024 by the author. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). random noise, they can result in the smearing of the solution's horizontal location and can also make the results more sensitive to interference from adjacent anomalies. Sometimes a background field term *B* is subtracted from the field *f*, but Euler's equation is only for single sources, which implies that (if necessary) this has already been done.

Euler deconvolution can also be applied to the Hilbert transform H(f) of the data [12,13]

$$\Delta x \frac{\partial f}{\partial z} - \Delta z \frac{\partial f}{\partial x} = -N \cdot H(f) \tag{3}$$

## 2. Materials and Methods

Derivatives of potential fields are also homogenous functions, so Euler deconvolution is frequently applied to them [14,15]

$$\Delta x \frac{\partial^2 f}{\partial x^2} + \Delta z \frac{\partial^2 f}{\partial x \partial z} = -(N+1) \frac{\partial f}{\partial x}$$
(4)

$$\Delta x \frac{\partial^2 f}{\partial x \partial z} + \Delta z \frac{\partial^2 f}{\partial z^2} = -(N+1)\frac{\partial f}{\partial z}$$
(5)

Applying Euler deconvolution to higher order derivatives of the field can reduce the sensitivity of the method to regional field and interference issues. Euler deconvolution can also be applied to combinations of the derivatives, such as the analytic signal amplitude [16] or the Tilt angle [17].

Substituting Equations (4) and (5) into Equation (2) provides the second-order Euler equation

$$\Delta x^2 \frac{\partial^2 f}{\partial x^2} + 2\Delta x \cdot \Delta z \frac{\partial^2 f}{\partial z \partial x} + \Delta z^2 \frac{\partial^2 f}{\partial z^2} = N(N+1)f \tag{6}$$

Higher order equations can be generated in a similar manner. Using Laplace's equation, then

$$\left(\Delta x^2 - \Delta z^2\right)\frac{\partial^2 f}{\partial x^2} + 2\Delta x \Delta z \frac{\partial^2 f}{\partial z \partial x} = N(N+1)f \tag{7}$$

Equation (7) is solved for  $(\Delta x^2 - \Delta z^2)$  and  $(2\Delta x \cdot \Delta z)$  using a moving window of data points in the usual manner, then  $\Delta x$  and  $\Delta z$  are obtained by solving a quadratic equation, i.e., let  $a = (\Delta x^2 - \Delta z^2)$  and  $b = (2\Delta x \cdot \Delta z)$ , then

$$\Delta x = \frac{1}{\sqrt{2}b} \left( \left( a^2 + b^2 \right)^{1/2} - a \right)^{1/2} \left( \left( a^2 + b^2 \right)^{1/2} + a \right) \tag{8}$$

$$\Delta z = \frac{1}{\sqrt{2}} \left( \left( a^2 + b^2 \right)^{1/2} - a \right)^{1/2} \tag{9}$$

Similarly substituting Equations (4) and (5) into Equation (3) provides the Hilbert transform of Equation (7);

$$\left(\Delta x^2 - \Delta z^2\right)\frac{\partial^2 f}{\partial z \partial x} - 2\Delta x \Delta z \frac{\partial^2 f}{\partial x^2} = N(N+1)H(f)$$
(10)

Note that the second-order equations do not have any first order derivative terms, which makes them less sensitive to the presence of linear regional fields than Equations (2) and (3). Additionally, as the depth of the source  $\Delta z = \sqrt{-a}$  when  $\Delta x = 0$  (Equation (7)), plotting  $\sqrt{-a}$  yields a 'depth parabola', which is a useful check on the validity of the Euler solutions.

Equations (4)–(10) use second-order derivatives of the field, which naturally can make them sensitive to noise. If this is an issue, then either regularised derivatives [18] or upward continuation of the field can be used.

# 3. Results

Euler deconvolution is applied to the magnetic anomaly from an isolated dyke (Figure 1), to which a small linear trend has been added. The solutions from standard Euler deconvolution (Equation (2), Figure 1b are widely dispersed around the top of the dyke, while those from the second-order Euler deconvolution (Equations (7) and (10)) are much more tightly grouped (particularly in this case when the Hilbert transform was used). Euler deconvolution is well known for its production of large numbers of spurious solutions scattered throughout the subsurface, and this is the case even with this simple synthetic model. However, plotting the depth parabola provided by  $\Delta z = \sqrt{-a}$  helps to identify the valid solutions, as it should have a maximum depth extent over the source. These depth parabolas are clearly located over the tops of the dykes (Figure 1c,d) and Euler solutions that are far from them can be disregarded.



**Figure 1.** (a) Magnetic anomaly from the dyke shown in (**b**–**d**) below. A linear trend (dotted line) is added to the data. (b) Solutions from Euler deconvolution (Equation (2)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. (c) Solutions from second-order Euler deconvolution (Equation (7)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. The depth parabola is overlain as a black line. (d) Solutions from second-order Euler deconvolution (Equation (10)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. The depth parabola is overlain as a black line.

A second, more complicated example application is shown in Figure 2. In this case, there are now several dykes with different dips and depths, and whose anomalies interfere.

All of the methods successfully locate the shallow dyke on the left of the profile. The deeper dykes are more difficult targets, however, and while clusters of solutions are present near them, the clusters are often rather dispersed, and other solutions exist between the dykes. If only the solution clusters that are near to the depth parabolas are considered as being valid, then all the dykes have solutions from the second-order Euler deconvolution lying near to their upper surface (the depth parabola associated with the very shallow dyke is hard to see due to the coincident Euler solutions). Similarly, depth parabolas that are not associated with clusters of Euler solutions can be ignored.



**Figure 2.** (a) Magnetic anomaly from the dyke model shown in (b-d) below. (b) Solutions from Euler deconvolution (Equation (2)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. (c) Solutions from second-order Euler deconvolution (Equation (7)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. The depth parabola is overlain as a black line. (d) Solutions from second-order Euler deconvolution (Equation (10)) are shown as blue + symbols. A SI of 1 and window size of 11 points is used. The depth parabola is overlain as a black line.

# 4. Application to a Mineral Exploration Project in Southern Africa

Figure 3a shows an aeromagnetic data set from Southern Africa that was used as part of a mineral exploration project. Unfortunately, confidentiality issues preclude most of the details being provided here. The flight line direction of the survey was north-south, the line spacing was 1 km, the grid interval was 0.25 km, and the flight height was 100 m. This dataset was interpreted by Cooper using a new Contact-Depth method [6], which only works for the magnetic anomalies from contacts and that requires pole reduced data. The depths to the contacts are obtained at the location of the zero values of the first vertical derivative of the data. The results are shown in Figure 3b. Two profiles were abstracted from this aeromagnetic dataset and their locations are marked in Figure 3a. The first profile (marked 'A') is shown in Figure 3c, and the results of applying Euler deconvolution to it are shown in Figure 3d-f. The Contact-Depth results provided depths of 1 km or less at the edges of the main anomaly in the centre of the profile, and all the Euler results were compatible with this. The depth parabolas of the second-order Euler method made the interpretation of the Euler solutions easier, particularly those associated from the small amplitude anomalies at the edges of the profile. In addition, varying the structural index slightly allowed the stability of the Euler solutions to be assessed. The red bars associated with each solution show the location that the Euler solutions would move to if a larger SI was used, while the blue bars show the location that will result if the SI were reduced. If these error bars are large (for example, see the shallow solutions in Figure 3f, then those solutions are deemed unreliable.

A second profile (marked 'B' on Figure 3a is shown in Figure 4. The solutions from standard Euler deconvolution (Equation (2), Figure 4a do not really show well defined clusters, but the depths are reasonable compared with the Contact-Depth results. The solutions from the second-order Euler methods are slightly better clustered, but the depth parabolas help to identify probable solution clusters (e.g., at locations of 15, 25, and 30 km on Figure 4c. The addition of error bars to the plots again helps to identify unreliable solutions, such as the shallow solutions in Figure 4d.



Figure 3. Cont.



**Figure 3.** (a) Aeromagnetic data from Southern Africa. The flight line direction is north–south, the line spacing is 1 km, the grid interval is 0.25 km, and the flight height is 100 m. The profiles marked A (left) and B (right) are shown in Figures 3c and 4a, respectively. (b) Depths to vertically magnetized vertically dipping contacts obtained using the method of Cooper [6], from which the Figure is taken. (c) Aeromagnetic data profile 'A' from Figure 3a. (d) Solutions from Euler deconvolution (Equation (2)) are shown as blue + symbols. A SI of 0.25 and window size of 7 points was used. (e) Solutions from second-order Euler deconvolution (Equation (7)) are shown as black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is overlain as a black line. (f) Solutions from second-order Euler deconvolution (Equation (10)) are shown as black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is overlain as a black line. (f) Solutions from second-order Euler deconvolution (Equation (10)) are shown as black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is used. The depth parabola is overlain as a black line.



**Figure 4.** (a) Aeromagnetic data profile 'B' from Figure 3a. (b) Solutions from Euler deconvolution Equation (2)) are shown as blue + symbols. A SI of 0.25 and window size of 7 points is used. (c) Solutions from second-order Euler deconvolution (Equation (7)) are shown as black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is overlain as a black line. (d) Solutions from second-order Euler deconvolution (Equation (10)) are shown as black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is overlain as a black dots with blue and red error bars overlain. A SI of 0.25 and window size of 7 points is used. The depth parabola is overlain as a black line.

# 5. Conclusions

Mineral exploration projects have many different facets, and the use of modern data processing techniques can greatly facilitate the process. Second-order Euler deconvolution has been introduced and applied to both synthetic and real aeromagnetic datasets. In addition to being less sensitive to regional trends in the data than standard Euler deconvolution (because it does not use the first order derivatives of the data), it also generates depth parabolas, which further aid in the interpretation of the results. Adding error bars to the Euler solutions shows their sensitivity to the choice of structural index and assists in the assessment of their reliability.

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