# **Solving Non-Linear Magnetic Problems using Newton Trust Region Methods**

Hans Vande Sande<sup>(1)</sup>, Herbert De Gersem<sup>(2)</sup>, François Henrotte<sup>(1)</sup>, Kay Hameyer<sup>(1)</sup>

(1) KULeuven, Dept. ESAT, Div. ELECTA, Kasteelpark Arenberg 10, B-3001 Heverlee-Leuven, Belgium

(2) TUDarmstadt, TEMF, Schloâgartenstraâe 8, D-64289 Darmstadt, Germany

E-mail: hans.vandesande@esat.kuleuven.ac.be

*Abstract* **– In this paper, a Newton trust region method is presented as an improvement, with no extra computational cost, of the underrelaxed Newton-Raphson method. The step is now determined by minimizing the local quadratic approximation of the energy functional within a trust region whose dimension is automatically adapted.**

### **INTRODUCTION**

The solution of non-linear magnetic problems can be determined by minimizing the energy functional *F*:

$$
F(\mathbf{A}) = \int_{\Omega} w_{\text{m}}(\mathbf{A}) \, d\Omega - \mathbf{A}^{\text{T}} \mathbf{T} \quad , \tag{1}
$$

with **A** the vector of unknown vector potentials (in Vs/m),  $w<sub>m</sub>$  the energy density (in J/m<sup>3</sup>) and **T** the source vector (in A) [1]. The local quadratic approximation of *F* around the solution at the  $k^{\text{th}}$  iteration equals

$$
F_{\rm qm}(\mathbf{A}_k + \mathbf{s}_k) \approx F(\mathbf{A}_k) + \mathbf{s}_k^T \nabla F(\mathbf{A}_k) + \frac{1}{2} \mathbf{s}_k^T \nabla^2 F(\mathbf{A}_k) \mathbf{s}_k
$$
 (2)

and exhibits ellipsoidal isovalues in a multidimensional parameter space (Fig. 1). Analytical formulas for the gradient  $\nabla F$  and the Jacobian  $\nabla^2 F$  are given in [1]. The Newton step towards the minimum of (2) equals

$$
\mathbf{s}_k^N = -\left[\nabla^2 F(\mathbf{A}_k)\right]^{-1} \nabla F(\mathbf{A}_k) \quad . \tag{3}
$$

It is the direction along which a line search is performed in order to determine the underrelaxation factor á*<sup>k</sup>* of the enhanced Newton-Raphson method (Fig. 1) [2].

## TRUST REGION METHODS

As  $s_k^N$  and  $\acute{a}_k$  are computed separately, the underrelaxed Newton-Raphson method may fail to realize the minimum of (2) in a sphere of radius  $\alpha_k \|\mathbf{s}_k^N\|$ . In trust region (TR) methods, both the direction and the step length are computed



Fig. 1: Graphical interpretation of a trust region method applied to a function F with two variables.

simultaneously by minimizing (2) within a TR-radius Ä*<sup>k</sup>* around  $\mathbf{A}_k$  (Fig. 1) [3]. The trust region can be a hypercube as well. This constrained minimization problem is efficiently solved by a variant of the conjugate gradient method [4].

Fig. 1 shows that the decrease of the functional may be larger than possible along the Newton direction. Obviously, the performance of a TR method depends on the size of  $\ddot{A}_k$ . For large  $\ddot{A}_k$ , the step equals the Newton step. For small  $\ddot{A}_k$ , only little progress is made towards the solution. Therefore, the TR radius is adjusted at each new iteration. If the ratio

$$
\rho_k = \frac{F(\mathbf{A}_k) - F(\mathbf{A}_k + \mathbf{s}_k)}{F_{qm}(\mathbf{A}_k) - F_{qm}(\mathbf{A}_k + \mathbf{s}_k)}
$$
(4)

is close to 1, the actual reduction of the functional more or less equals the predicted reduction by the local quadratic model in (2). Hence, the latter is a reliable representation of the functional and  $\ddot{A}_k$  may be increased. If there is less similarity, e.g. if  $\rho_k \in [0.25, 0.75]$ , the radius is not modified. Otherwise,  $\ddot{A}_k$  is decreased and the last iterate is rejected [3].

## **CONCLUSION**

The computational cost for the trust region is approximately equal to the one of a Newton-Raphson step. Per iteration, a trust method requires only one evaluation of the functional (1), which is an advantage compared to the underrelaxed Newton-Raphson method. The convergence is guaranteed by the ratio check in (4) and it becomes quadratic close to the solution. The full paper discusses this method in detail for a practical application in computational magnetics.

## **ACKNOWLEDGEMENTS**

The authors are grateful to the Belgian "Fonds voor Wetenschappelijk Onderzoek Vlaanderen" (project G.0427.98) and the Belgian Ministry of Scientific Research (IUAP No. P4/20)

### **REFERENCES**

- [1] P.P. Silvester and R.L. Ferrari, Finite elements for electrical engineers. Cambridge, UK: Cambridge University Press,1996.
- [2] J. O'Dwyer and T. O'Donnell, "Choosing the Relaxation Parameter for the Solution of Nonlinear Magnetic Field Problems by the Newton-Raphson Method," *IEEE Trans. on Magnetics*, Vol. 31, No. 3, pp. 1484- 1487, March 1995.
- [3] J. Nocedal and S.J. Wright, Numerical Optimization. Springer Series in Operations Research, New York, USA: Springer-Verlag, 1999.
- [4] T. Steihaug, "The conjugate gradient method and trust regions in large scale optimization,", *SIAM Journal on Numerical Analysis*, Vol. 20, pp. 626-637, 1983.