# A Novel Approach of Sensitivity Analysis in Finite Element Method and Its Application

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or:

**Abstract Abstract—This paper presents <sup>a</sup> novel approach of sensitivity analysis for design optimization optimizationof electromagnetic electromagneticdevices based** on a parameterized mesh in finite element method (FEM). The **proposed method requires requiresno repea<sup>t</sup> calculation by using the solution of the field equations equationsand the advantage of the** parameterized mesh, thus the calculating time is reduced **significantly. An optimal design example example of an electromagnetic electromagnetic** device is reported to positively confirm its feasibilities and **advantages. advantages.**

*Index Terms*—Finite element method, optimal design, **parameterized mesh, sensitivity analysis.** 

### I. INTRODUCTION

The importance of sensitivity analysis of electromagnetic devices stems from the need to improve their performance with respec<sup>t</sup> to shape parameters. Based on the sensitivity analysis, the uncertainties between design parameters and objective function can be better estimated.

In this paper, <sup>a</sup> parameterized mesh generation method is proposed. The initial mesh is created based on Delaunay algorithm [1], and the coordinates of all the nodes are linear functions with respec<sup>t</sup> to geometrical parameters. When new nodes are added, the coordinates can be quickly obtained according to the relationship between them [2]. In addition, the sensitivity and the derivative of objective function versus parameter  $p$  can be obtained from previous FEM results by back-substituting the right hand side (RHS) in the field matrix equation. Finally, we evolve the function of the magnetic force, in which we can carry out the sensitivity analysis in time domain.

Compared with existing methods, the proposed approach can reduce the computational burden greatly while the accuracy is guaranteed. Firstly, we only need to solve the finite element problem once to obtain the sensitivity information from the FEM results. Secondly, the mesh has no need to be generated repeatedly when the geometrical parameters changes and the mesh quality is high by using <sup>a</sup> swapping diagonal technique. Thirdly, the method of sensitivity analysis is <sup>a</sup> kind of direct approach, which can greatly eliminate the inaccuracy problem.

# II. MODELS AND METHODS

### *A. Basic Field Equation*

When analyzing magnetic field, the following system equation is obtained in matrix form after using FEM discretization: discretization:<br> $[S]{A} - {P} = 0$  (1)

$$
[S]{A} - {P} = 0 \tag{1}
$$

For <sup>a</sup> nonlinear problem, N-R iteration method is used:

$$
[\mathcal{J}]\{A\} = \{P\} - [S]\{A\} \tag{2}
$$

For a nonlinear problem, N-R iteration method is used:<br>  $[J]\{A\} = \{P\} - [S]\{A\}$  (2)<br>
where  $\{A\}$  is the nodal magnetic potential vector; the<br>
Jacobian matrix is:<br>  $[J] = \frac{\partial}{\partial A}([S]\{A\})$  (3)<br>
or: where { }*<sup>A</sup>* is the nodal magnetic potential vector; the Jacobian matrix is:

$$
[\mathcal{J}] = \frac{\partial}{\partial \mathcal{A}} ([\mathcal{S}] \{ \mathcal{A} \})
$$
 (3)

3a  
3a  
6  
7  
or:  

$$
[\mathcal{J}] = \frac{\partial}{\partial A} ([S] \{A\})
$$
(3)  
or:  

$$
\mathcal{J} = \begin{bmatrix} \frac{\partial f_1}{\partial A_1} & \frac{\partial f_1}{\partial A_2} & \cdots & \frac{\partial f_1}{\partial A_n} \\ \frac{\partial f_2}{\partial A_1} & \frac{\partial f_2}{\partial A_2} & \vdots & \vdots \\ \vdots & \ddots & \vdots & \vdots \\ \frac{\partial f_n}{\partial A_1} & \cdots & \frac{\partial f_n}{\partial A_n} \end{bmatrix}
$$
(4)  
where:  

$$
f_m = S_{ml} A_1 + S_{m2} A_2 + \cdots + S_{mn} A_n, \quad m = 1, 2, ..., n. (5)
$$
  
By solving (2), the magnetic state is known and all nodal potentials are obtained.

where:

$$
f_m = S_{m1}A_1 + S_{m2}A_2 + \dots + S_{mn}A_n, \ m = 1, 2, \dots, n. (5)
$$

 $f_m = S_{m1}A_1 + S_{m2}A_2 + \cdots$ <br>By solving (2), the magnet<br>potentials are obtained.<br>*B. Calculation of Sensitivity* By solving (2), the magnetic state is known and all nodal potentials are obtained.

 $f_m = S_{m1}A_1 + S_{m2}A_2 + \cdots + S_{mn}A_n$ ,  $m = 1, 2, \ldots, n$ .<br>By solving (2), the magnetic state is known and all no<br>otentials are obtained.<br>*B. Calculation of Sensitivity*<br>When one geometric or physical parameter *p* changes,<br>leri Find the set of the set When one geometric or physical parameter *p* changes, the derivative versus  $p$  of the stationary system (1) gives the following set of new equations:

n time following set of new equations:  
\n
$$
\frac{\partial}{\partial p} \{ [S] \{A\} - \{P\} \} = \frac{\partial}{\partial A} ([S] \{A\}) \left\{ \frac{\partial A}{\partial p} \right\} + \frac{\partial}{\partial p} ([S] \{A\}) \Big|_{A = \text{constant}} - \frac{\partial}{\partial p} \{P\} = 0
$$
\n\nWe the  
\n
$$
\text{or:}
$$
\n
$$
[J] \left\{ \frac{\partial A}{\partial p} \right\} = -\frac{\partial}{\partial p} ([S] \{A\}) \Big|_{A = \text{constant}} + \frac{\partial}{\partial p} \{P\}
$$
\n(7)

or:

$$
[\mathcal{J}]\left\{\frac{\partial\mathcal{A}}{\partial p}\right\} = -\frac{\partial}{\partial p}([\mathcal{S}]\{\mathcal{A}\})\Big|_{\mathcal{A}=\text{constant}} + \frac{\partial}{\partial p}\{\mathcal{P}\}\tag{7}
$$

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g a<br>
In (7), the term at the RHS is known. I<br>
of coefficient matrices of (2) and (7) are the same<br>
can<br>
(2), the FEM system matrix has been factor<br>
the  $\{\partial A/\partial p\}$  can be obtained by back-substitu  $[J] \left\{ \frac{\partial A}{\partial p} \right\} = -\frac{\partial}{\partial p} ([S] \{A\})$ <br>In (7), the term at the RHS is 1<br>coefficient matrices of (2) and (7) are<br>(2), the FEM system matrix has bee  $\left[\mathcal{J}\left\{\frac{\partial A}{\partial p}\right\} = -\frac{\partial}{\partial p}([S]\{\mathcal{A}\})\right|_{A=\text{constant}} + \frac{\partial}{\partial p}$ <br>
In (7), the term at the RHS is know<br>
sefficient matrices of (2) and (7) are the<br>
constant the FEM system matrix has been fa In (7), the term at the RHS is known. In addition, the coefficient matrices of (2) and (7) are the same. When solving (2), the FEM system matrix has been factorized. Therefore, the  ${2}$ , the FEM system matrix has been factorized. Therefore,<br>the  ${2A}/\partial p$  can be obtained by back-substituting RHS easily<br>and quickly.<br>*C. Derivative of an Objective Function versus Design<br>Parameters*<br>tem During opti and quickly.

# *C. Derivative of an Objective Function versus Design Parameters*

During optimal design process, the values of objective function change according to the design parameters. Assuming the magnetic force is the objective function [3][4]:

$$
F = F(p, A) \tag{8}
$$

The magnetic vector potential  $A(A_1, A_2, ..., A_N)$ <br>determined from (1), so it is an implicit fu<br> $p(p_1, p_2, ..., p_M)$  as:  $A = A(p)$ , The design sensitivity<br> $\frac{dF}{dp} = \frac{\partial F}{\partial p}$   $+ \sum_{n=1}^{N} \left(\frac{\partial F}{\partial A}\right)^n$   $\frac{\partial A}{\partial p}$ The magnetic vector potential  $A(A_1, A_2, ..., A_N)$  is already

determined from (1), so it is an implicit function of 
$$
p(p_1, p_2, ..., p_M)
$$
 as:  $A = A(p)$ , The design sensitivity is:  
\n
$$
\frac{dF}{dp_m} = \frac{\partial F}{\partial p_m}\Big|_{A=constant} + \sum_{n=1}^{N} \left(\frac{\partial F}{\partial A_n}\Big|_{p_m=constant} \frac{\partial A_n}{\partial p_m}\right)
$$
\nor written in matrix format:  
\n
$$
\frac{dF}{dp} = \frac{\partial F}{\partial p}\Big|_{A=constant} + \frac{\partial F}{\partial A^T}\Big|_{p=constant} + \frac{\partial A}{\partial p}
$$
\n(10)

or written in matrix format:

or written in matrix format:  
\n
$$
\frac{dF}{dp} = \frac{\partial F}{\partial p}\Big|_{A=\text{constant}} + \frac{\partial F}{\partial A^T}\Big|_{p=\text{constant}} \frac{\partial A}{\partial p}
$$
\nwhere T is the transpose sign.  
\nIII. NUMERICAL EXAMPLE  
\nAn electromagnetic levitation device is used as a test example. The proposed method is utilized to obtain the  
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# III. NUMERICAL EXAMPLE

An electromechanical levitation device is used as <sup>a</sup> test example. The proposed method is utilized to obtain the derivative of the magnetic force versus the geometric sizes. The device model and the design parameters <sup>1</sup> <sup>2</sup> ( , ) *<sup>p</sup> <sup>p</sup>* are shown in Fig. 1.



Fig. 1. The model and parameters

During mesh refinement process, when the parameters vary, all coordinates of the refined mesh are changed automatically, which is shown in Fig. 2.



Fig. 2. (a)Initial mesh (b)Refined mesh when parameters change

We use Maxwell stress tensor method to calculate the magnetic force according to the magnetic field on the surface surrounding the objects. In order to overcome the shortage that the force is very sensitive to the quality of the mesh layer surrounding the object, <sup>a</sup> multi-layer integration method is proposed in this paper.

There are two geometry parameters, namely *p<sup>1</sup>* and *p*<sup>2</sup>.  $0 < p_1 < 10$  mm,  $0 < p_2 < 100$  mm. The size of permanent magne<sup>t</sup> (PM) is fixed to be 2.75 mm. We calculate the derivative versus  $p_1$  100 steps and  $p_2$  1000 steps, respectively, as shown in Fig.  $3(a)$  and (c). The magnetic force with respect to  $p_1$  and  $p_2$  are also shown in Fig. 3 (b) and (d).



Fig. 3. (a) The derivative versus  $p_1$ . (b) The derivative versus  $p_2$ . (c) The magnetic force with respect to  $p_1$ . (d) The magnetic force with respect to  $p_2$ .

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