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# THE FINE-GRAINED PARALLEL MICRO-GENETIC ALGORITHM AND ITS APPLICATION TO BROADBAND CONICAL CORRUGATED-HORN ANTENNA

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**Abstract**—The fine-grained parallel micro-genetic algorithm (FGPMGA) is developed to solve antenna design problems. The synthesis of uniformly exited unequally spaced array is presented. Comparison with the micro-genetic algorithm (MGA) has been carried out. It is seen that the FGPMGA significantly outperforms MGA, in terms of both the convergence rate and exploration ability. The FGPMGA can also reduce the optimization time. Then the FGPMGA and the body of revolution finite-difference time-domain (BOR-FDTD) are combined to achieve an automated design process for conical corrugated-horn antenna. Numerical simulation results show that the horn antenna has good impedance matching (the VSWR is less than 1.5), stable beamwidth and gain, as well as good rotation symmetry patterns over the whole band 8∼13 GHz.

## 1. INTRODUCTION

In recent years, several evolutionary algorithms have emerged for solving design problems in electromagnetics such as genetic algorithm (GA) [1–5], micro-genetic algorithm (MGA) [6, 7], particle swarm optimization (PSO) [8–11] and differential evolution strategy (DES) [12–16].

GA is a popular global optimization algorithm. It is well known that one of the most attractive features of GA is the parallelism

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that allows an effective search in the solution space. Several parallel techniques have been proposed to help maintain diversity in the population, and subsequently avoiding the premature convergence. In [17, 18], the parallel GAs in a master-slave model were proposed to design antenna arrays. In this parallel model, one population is used, but the evaluation of the fitness function are executed in parallel. So the behavior of the master-slave algorithm is essentially the same as a serial GA. The coarse-grained parallel GA was applied in [19, 20]. This parallel model divides a large population into some sub-populations, and independently performs selection, crossover and mutation on each subpopulation. A migration operator is used to send some individuals from one deme to another. The fine-grained model is also one of the most popular parallel techniques. In [21, 22], the fine-grained parallel GAs were used. Individuals of this model are usually placed on a large 2D grid. Fitness evaluation is done simultaneously for all individuals, selection, crossover and mutation take place within a local neighborhood. The coarse-grained and fine-grained models can accelerate the convergence rate and avoid the premature convergence.

The MGA is GA with a small population size which can speed up the converge, and has been applied to antenna [6] and power divider [7] design problems. In [23], the master-slave parallel MGA was used to optimize a frequency selective surface (FSS). The coarse-grained parallel MGA (CGPMGA) was applied to solve ultra-wideband power divider problem [24] and tune power system stabilizer in multimachine power system [25]. At present, the fine-grained Parallel MGA (FGPMGA) has not been applied to microwave engineering design problems. This work focuses on the analysis of the FGPMGA to improve the performance of classical MGA.

The BOR-FDTD employs a 2D solution problem instead of a full 3D one due to the axial symmetric property and saves computational resources [26–28]. This method is a robust and versatile numerical tool for solving axial symmetric problems. In [29], several smooth-walled axis-symmetrical dielectric-loaded horn antennas were optimized based on the BOR-FDTD technique and GA. Corrugated-conical horn antennas are commonly used in reflector antenna systems [30, 31], and the design of these systems requires the performance of the horns be very well. In this paper, the BOR-FDTD is used here to simulate a broadband conical corrugated-horn antenna, and the FGPMGA based on binary coding is applied to optimize the structure of the horn. The horn has an impedance bandwidth between 8$\sim$13 GHz with VSWR $\leq 1.5$, stable beamwidth and gain, as well as good circular symmetry patterns over this band.

This paper is organized as follows. Section 2 describes the

FGPMGA, an antenna array pattern synthesis is provided to demonstrate the advantages of our algorithm. In Section 3 a dual-mode conical horn antenna is simulated using BOR-FDTD and CST Microwave Studio. The correctness of BOR-FDTD is verified. In Section 4, the combined method between the FGPMGA and the BOR-FDTD is used to optimize the corrugated-conical horn antenna, in addition, the numerical results are presented. Conclusions are given in Section 5.

## 2. THE FINE-GRAINED PARALLEL MICRO-GENETIC ALGORITHM

The fine-grained parallel model is also called neighborhood model. Each processor is allocated only one individual and selects parents for recombination from local neighborhood by considering neighbors at different distances. For the FGPMGA, a 4-$n$ neighborhood is used, as shown in Figure 1. In this case each node represents a single individual. The FGPMGA is implemented using C++ on a message passing interface (MPI) environment.

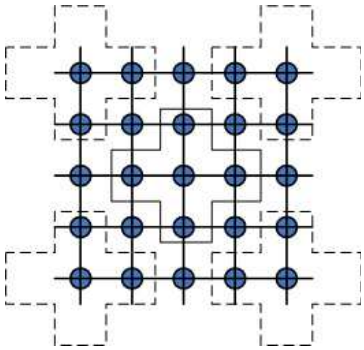

**Figure 1.** The FGPMGA architecture.

In each neighborhood, different crossover and mutation probability, as well as different methods of mutation and crossover. The procedure of the FGPMGA is as follows.

We carry out a linear array synthesis to demonstrate the superior of the FGPMGA. A 32-element uniformly excited linear array is considered, which symmetrically placed along the $x$-axis. The position-only method is used to reduce the side-lobe level (SLL). Only half of the optimization parameters $\{x_1, \ldots x_{16}\}$ are considered. The array

**Algorithm 1** Pseudo code for the FGPMGA

**Initialization:**

$G \leftarrow 1$;
**for** each node **do**
  initialize an individual randomly in parallel;
  calculate fitness values;
**end for**

**Iteration:**

**while** termination conditions not met **do**
  Create MPI Cartesian process topology;
  **for** each node **do**
    set crossover and mutation rate;
    set methods of mutation and crossover;
    select an individual randomly from neighborhood;
    crossover with the local individual;
    mutate individual according to mutation rate;
    calculate fitness values of new individual, and update individual if new one is better;
  **end for**
  save the best individual;
  **if** $\mod(G, G_{refresh}) = 0$ **then**
    keep the best individual and initialize the others;
  **end if**
  $G \leftarrow G + 1$;
**end while**

factor can be written as

$$AF(\theta, \bar{x}) = 2 \sum_{i=1}^{16} \left( \cos\left( \frac{2\pi}{\lambda} x_i \sin\theta \right) \right). \tag{1}$$

The angle resolution of $\theta$ is $0.1^0$. We assume that $d_{\min} = 0.5\lambda \leq x_i - x_{i-1} \leq d_{\max} = 0.6\lambda$. The population size is set as 100. There are 100 parallel processes in the FGPMGA. The total number of iterations is set to 2000. Figure 2 shows the average convergence rates for FGPMGA, CGPMGA [24] (10 sub-populations) and MGA in 5 independent runs. It is obvious that FGPMGA converges faster than CGPMGA and MGA. The FGPMGA and CGPMGA converge to the same best value ($-15.82\,\mathrm{dB}$) that agrees with the results obtained by modified DES in [13, 16]. However, the SLL obtained by the MGA is only $-15.81\,\mathrm{dB}$. The average number of iterations of FGPMGA is 242 evaluations, while 816 iterations are needed for the CGPMGA. Furthermore, the FGPMGA only needs 242 evaluations

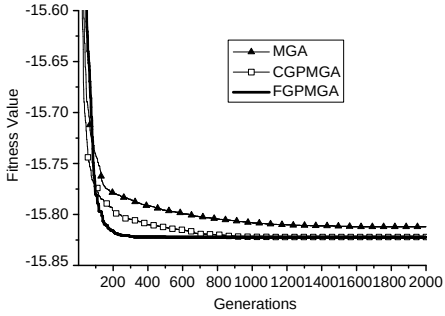


**Figure 2.** Comparisons of the average convergence rates for FGPMGA, CGPMGA and MGA.

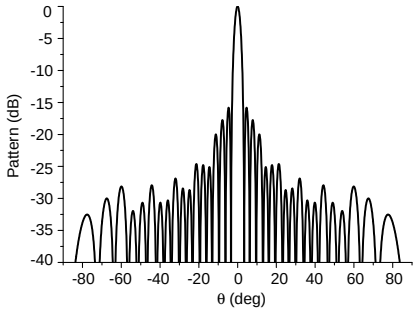


**Figure 3.** Radiation pattern for a 32-element uniform amplitude array.

on each processor in contrast to 8160 evaluations by the CGPMGA. Figure 3 shows the optimal pattern obtained by the FGPMGA.

## 3. THE BODY OF REVOLUTION FINITE-DIFFERENCE TIME-DOMAIN

The BOR-FDTD reduces the original 3D Maxwell's equation to a 2D form. The termination of the computational domain uses the perfectly matched layer (PML) absorbing boundary conditions [26]. The excitation is introduced in a cross-section, by setting the corresponding components of the fields to vary in time as a modulated Gaussian pulse [27]. A fast near-to-far-field transformation method proposed in [28] is used.

We simulate a dual-mode conical horn antenna to validate the BOR-FDTD program, as shown in Figure 4. The horn is excited by using a $TE_{11}$ mode. The source excitation function used for this work is

$$g(t) = \cos(2\pi f_0 t) \exp\left[-\frac{4\pi(t-t_0)^2}{\tau^2}\right] \tag{2}$$

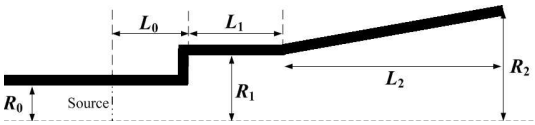


**Figure 4.** Dual-mode conical horn antenna.

where, $\tau = 2/1.5 \times 10^{-9}$ ns, $t_0 = 0.9\tau$, $f_0 = 2.0$ GHz. The parameters of the horn are as follows: $L_0 = 16$ mm, $R_0 = 17.1$ mm, $L_1 = 22$ mm, $R_1 = 22.7$ mm, $L_2 = 149.8$ mm, $R_2 = 45$ mm.

Figure 5 gives the distribution of near-field $E_r$ at different time step. Figure 6 shows the far-field patterns in the $E$-plane and $H$-plane, and compares it with those obtained by using the CST Microwave Studio. It is shown that the two trends are very similar.

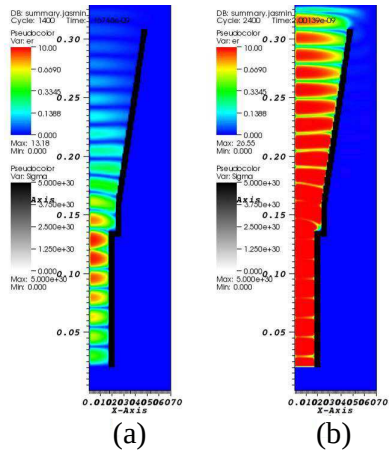


**Figure 5.** The distribution of $E_r$ at different moments. (a) 1400 time-step. (b) 2400 time-step.

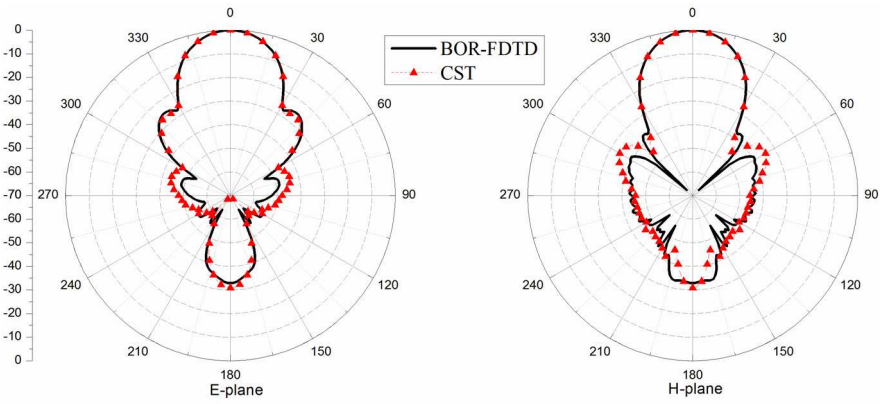


**Figure 6.** Radiation patterns.

## 4. RESULTS OF CORRUGATED-CONICAL HORN ANTENNA OPTIMIZATION

A corrugated-conical horn antenna with horizontal corrugations (see Figure 7) is optimized by the combined methods between FGPMGA and BOR-FDTD. The radius and length of the input waveguide is $R_0 = 13.6\,\text{mm}$ and $L_0 = 20\,\text{mm}$, respectively. The thickness of metal is 2 mm. The antenna is also excited with a $TE_{11}$ mode between 8 and 13 GHz. The source function is shown in Eq. (2), where $\tau = 2/2.5 \times 10^{-9}\,\text{ns}$, $t_0 = 0.9\tau$, $f_0 = 10.5\,\text{GHz}$. The semi-flare angle of horn is $\alpha$. The depth and height of the corrugations is $L_1$ and $R_a$, respectively. The parameter $L_d$ can be calculated as follows:

$$L_d = R_a / \tan\alpha \tag{3}$$

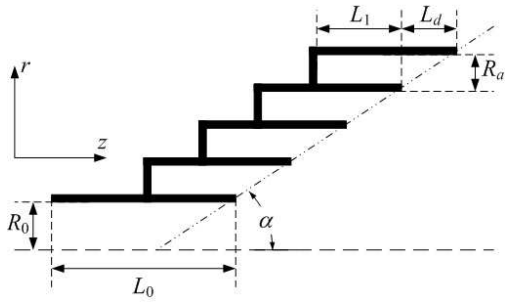


**Figure 7.** Geometry of the corrugated-conical horn antenna.

The size of corrugations has effects on the satisfaction of the balanced hybrid-mode condition. In order to establish the balanced $HE_{11}$ mode at the horn aperture, the parameters of $\alpha$, $L_1$ and $R_a$ are optimized. Their ranges are listed in Table 1.

The horn is designed with equal $E$ and $H$ patterns between $-53°$ and $53°$. Besides, the edge power level is $-15\,\text{dB}$. The design problem

**Table 1.** Design parameters for the horn.

| | $\alpha$ | $L_1$ | $R_a$ |
|---|---|---|---|
| Lower bounds | 10° | 2 mm | 3 mm |
| Upper bounds | 60° | 16 mm | 10 mm |

is defined as the minimization of the objective function:

$$fitness = \min \sum_{i=1}^{3} \left\{ \sum_{0 \le \theta \le 53^\circ} [a_i |F_E(f_i, \theta) - F_H(f_i, \theta)|_{\mathrm{dB}}] + b_i |F_E(f_i, 53^\circ) + 15|_{\mathrm{dB}} \right\} \quad (4)$$

where, $i = 1, 2, 3$; $f_{i=1,2,3} = \{8\,\mathrm{GHz}, 10.5\,\mathrm{GHz}, 13\,\mathrm{GHz}\}$; $a_i$ and $b_i$ are the weight factors of the $i$-th frequency: $a_1 + b_1 = a_3 + b_3 = 4$, $a_2 + b_2 = 10$, and $a_1 = a_3 = 3$, $a_2 = 7$. The population size is set to 30 and the total number of iterations set to 100. 30 processors on the SUGON TC2600 blade server are used for computing. It is worth noting that the calculation time of the optimization is dominated by the number of BOR-FDTD computation on each processor. The optimal parameters obtained by the FGPMGA are as follows: $\alpha = 40^\circ$, $L_1 = 8\,\mathrm{mm}$, $R_a = 5\,\mathrm{mm}$. The normalized radiation patterns in the $E$

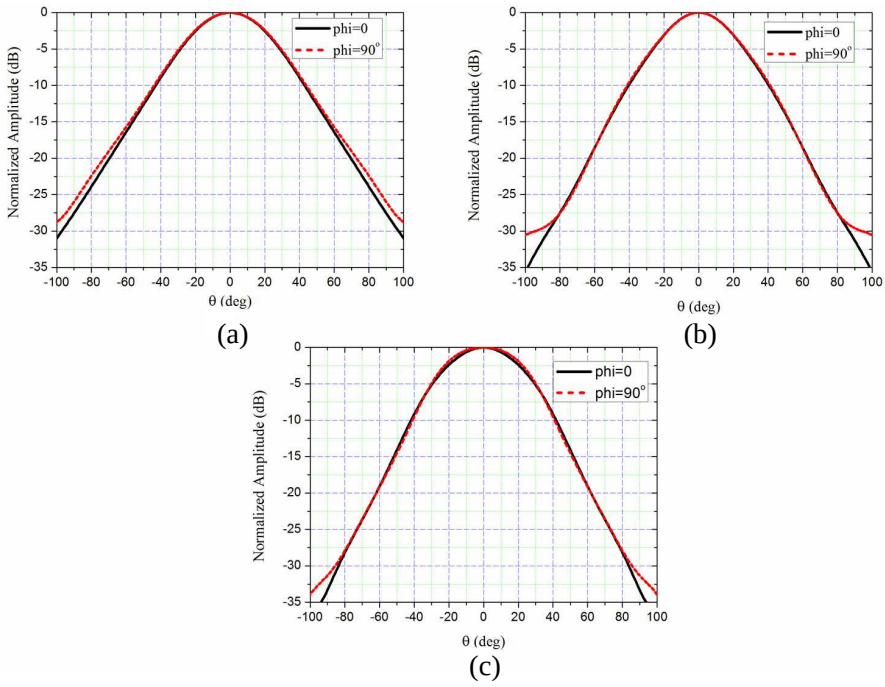


**Figure 8.** The normalized radiation patterns of the three frequencies. (a) 8 GHz. (b) 10.5 GHz. (c) 13 GHz.

and $H$ planes at 8, 10.5 and 13 GHz based on the optimal parameters are presented in Figure 8.

It can be seen that the horn antenna has good rotation symmetry in the radiation patterns. Table 2 shows the edge power level of the principal planes at $\theta = 53°$. The $E$ and $H$ patterns are equal in the illuminated area ($-53° \leq \theta \leq 53°$).

Figure 9 presents the VSWR of the horn. Over the frequency range of 8 to 13 GHz, the VSWR is less than 1.5. The gain of the antenna is shown in Figure 10. The variation range of gain is from 12.14 dBi to 13.07 dBi. The half-power beamwidths as a function of frequency of the antenna in the principal planes are depicted in Figure 11. It is shown that the half-power beamwidths in the $E$ and $H$ planes have a maximum difference of 5.57°. The optimization time for corrugated-conical horn antenna is 6375 seconds and about equal to that of the

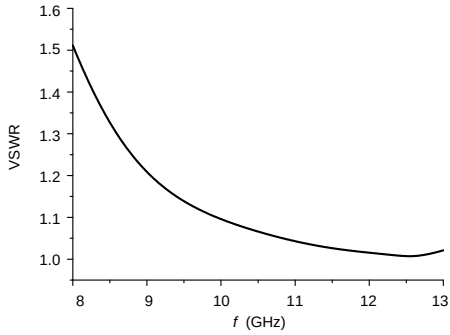


**Figure 9.** The VSWR of the corrugated-conical horn antenna.

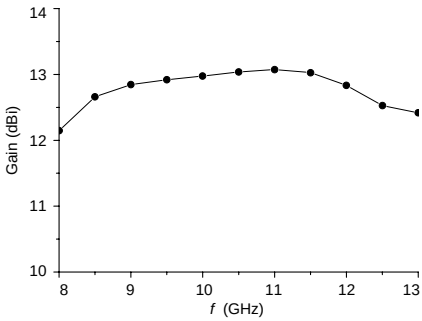


**Figure 10.** The simulated gain of the corrugated-conical horn antenna.

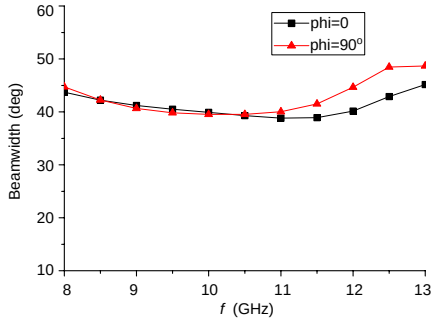


**Figure 11.** A comparison of the half-power beamwidths in the principal planes.

**Table 2.** The relative level of the principal planes (unit: dB).

| | $\varphi = 0$ | $\varphi = 90^\circ$ |
|---|---|---|
| $f = 8\,\mathrm{GHz}$ | $-14.05$ | $-13.93$ |
| $f = 10.5\,\mathrm{GHz}$ | $-15.23$ | $-15.31$ |
| $f = 13\,\mathrm{GHz}$ | $-15.60$ | $-15.96$ |

horn simulated by the BOR-FDTD for 100 times. However, MGA needs 3000 times calculation using the BOR-FDTD.

## 5. CONCLUSION

In this paper, a fine-grained parallel micro-genetic algorithm has been introduced. Each processor is allocated only one individual. The proposed technique has been applied to linear array synthesis by position-only control. The results show that the FGPMGA performs much better than the classical MGA and the CGPMGA in obtaining the optimum pattern with minimum number of the object function evaluations. Besides, A corrugated-conical horn antenna with horizontal corrugations was optimized using the BOR-FDTD/FGPMGA method. Across the 8$\sim$13 GHz band, the horn antenna exhibits good performance. The VSWR is less than 1.5. The patterns of $E$ and $H$ planes are equal, and have good rotation symmetry. The stable beamwidth and gain are also achieved. It can be concluded that the proposed algorithm is expected to be an applicable optimization tool for other electromagnetic problems.

## ACKNOWLEDGMENT

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