

# Harmonic Elimination in Cascade Multilevel Inverter with Non Equal Dc Sources Using Genetic and Differential Evolution Algorithm

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## Abstract

The elimination of harmonics in a cascaded multilevel inverter by considering the un-equality of separated dc sources by using Genetic and Differential Evolutionary Algorithm are compared. Solving a nonlinear transcendental equation set describing the harmonic-elimination problem with non-equal dc sources reaches the limitation of contemporary computer algebra software tools using the resultant method. The proposed approach in this paper can be applied to solve the problem in a simpler manner, even when the number of switching angles is increased and the determination of these angles using the resultant theory approach is not possible. Theoretical results are verified by simulations results for an 11-level H-bridge inverter. Results show that the proposed method does effectively eliminate a great number of specific harmonics, and the output voltage is resulted in low total harmonic distortion.

**Keywords:** *Cascade multilevel inverter, Differential Algorithm (DEA), Genetic Algorithm (GA), selective harmonic elimination, unequal dc sources,*

## 1. Introduction

Multilevel voltage-source inverters are a suitable configuration to reach high power ratings and high quality output waveforms besides reasonable dynamic responses. Among the different topologies for multilevel inverters, the cascaded multilevel inverter has received special attention due to its modularity and simplicity of control. The principle of operation of this inverter is usually based on synthesizing the desired output voltage waveform from several steps of voltage, which is typically obtained from dc voltage sources. There are different power circuit topologies for multilevel inverters. The most familiar power circuit topology for multilevel inverters is based on the cascade connection of an 's' number of single-phase full-bridge inverters to generate a  $(2s + 1)$  number of levels. However, from the practical point of view, it is somehow difficult to keep equal the magnitude of separated dc sources (SDCSs) of different levels. This can be caused by the different charging and discharging time intervals of dc-side voltage sources. To control the output voltage and to eliminate the undesired harmonics in multilevel converters with equal dc voltages, various modulation methods such as sinusoidal pulse width

modulation (PWM) and space-vector PWM techniques are suggested.

However, PWM techniques are not able to eliminate lower order harmonics completely. Another approach is to choose the switching angles so that specific higher order harmonics such as the 5<sup>th</sup>, 7<sup>th</sup>, 11<sup>th</sup>, and 13<sup>th</sup> are suppressed in the output voltage of the inverter. This method is known as selective harmonic elimination (SHE) or programmed PWM techniques in technical literature. A fundamental issue associated with such method is to obtain the arithmetic solution of non-linear transcendental equations which contain trigonometric terms and naturally present multiple solutions. This set of nonlinear equations can be solved by iterative techniques such as the Newton–Raphson method. However, such techniques need a good initial guess which should be very close to the exact solution patterns. Furthermore, this method finds only one set of solutions depending on the initial guess. Therefore, the Newton–Raphson method is not feasible to solve the SHE problem for a large number of switching angles if good initial guesses are not available. A systematic approach to solve the SHE problem based on the mathematical theory of resultant, where transcendental equations that describe the SHE problem are converted into an equivalent set of polynomial equations and then the mathematical theory of resultant is utilized to find all possible sets of solutions for this equivalent problem.

This method is also applied to multilevel inverters with unequal dc sources. However, applying the inequality of dc sources results to the asymmetry of the transcendental equation set to be solved and requires the solution of a set of high-degree equations, which is beyond the capability of contemporary computer algebra software tools. In fact, the resultant theory is limited to find up to six switching angles for equal dc voltages and up to three switching angles for non-equal dc voltage. More recently, the real-time calculation of switching angle switch analytical proof is presented to minimize the total harmonic distortion (THD) of the output voltage of multilevel converters. However, the presented analytical proof is only valid to minimize all harmonics including triples and cannot be extended to minimize only non-triple harmonics that are suitable for

three-phase applications. Reference presented modern stochastic search techniques based on particle swarm optimization (PSO) to deal with the problem for equal dc sources.

The DEA and PSO algorithm is developed to deal with the SHE problem with unequal dc sources while the number of switching angles is increased and the determination of these angles using conventional iterative methods as well as the resultant theory is not possible. In addition, for a low number of switching angles, the proposed DEA algorithm reduces the computational burden to find the optimal solution compared with iterative methods and the resultant theory approach. The proposed method solves the asymmetry of the transcendental equation set, which has to be solved in cascade multilevel inverters.

## 2. Cascaded H-Bridge Multilevel Inverter

A single-phase structure of an m-level cascaded inverter is illustrated in Figure 1. Each separate dc source (SDCS) is connected to a single-phase full-bridge, or H-bridge, inverter. Each inverter level can generate three different voltage outputs,  $+V_{dc}$ , 0, and  $-V_{dc}$  by connecting the dc source to the ac output by different combinations of the four switches,  $S_1$ ,  $S_2$ ,  $S_3$ , and  $S_4$ . To obtain  $+V_{dc}$ , switches  $S_1$  and  $S_4$  are turned on, whereas  $-V_{dc}$  can be obtained by turning on switches  $S_2$  and  $S_3$ . By turning on  $S_1$  and  $S_2$  or  $S_3$  and  $S_4$ , the output voltage is 0. The ac outputs of each of the different full-bridge inverter levels are connected in series such that the synthesized voltage waveform is the sum of the inverter outputs. The number of output phase voltage levels m in a cascade inverter is defined by  $m = 2s + 1$ , where s is the number of separate dc sources. An example phase voltage waveform for an 11-level cascaded H-bridge inverter with 5 SDCSs and 5 full bridges is shown in Figure 2.3. The phase voltage  $v_{an}$

$$= v_{a1} + v_{a2} + v_{a3} + v_{a4} + v_{a5} + v_{a4} + v_{a3} + v_{a2} + v_{a1}$$

### 2.1 Advantages

- The number of possible output voltage levels is more than twice the number of dc sources ( $m = 2s + 1$ ).

The series of H-bridges makes for modularized layout and packaging. This will enable the manufacturing process to be done more quickly and cheaply.

### 2.2 Disadvantages

Separate dc sources are required for each of the H-bridges. This will limit its application to products that already have multiple SDCSs readily available.

Fig.1 Single-phase structure of a multilevel cascaded H-bridges

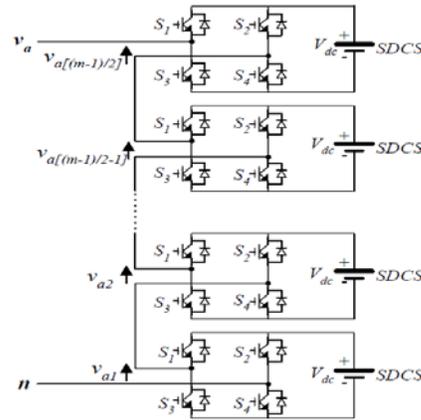
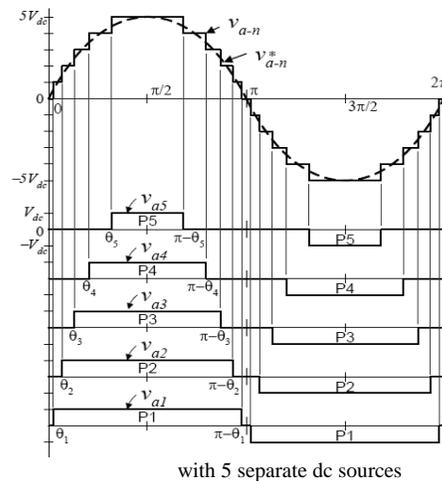


Fig.2 Output phase voltage waveform of an 11-level cascade inverter



For a stepped waveform such as the one depicted in Fig. 2 with s steps, the Fourier Transform for this waveform follows

$$H(n) = \frac{4}{\pi n} [\cos(n\theta_1) + \cos(n\theta_2) + \dots + \cos(n\theta_s)]$$

Where  $n = 1, 3, 5, 7, \dots$

## 3. Harmonic Elimination Control Technique Using Evolutionary Algorithms using GA & DEA

Harmonic Elimination pulse width modulation (HEPWM) method has been widely applied to remove harmonics due

to its superior frequency spectra. It requires the solution of a set of transcendental nonlinear equations. Soft computing (SC) methods are extensively employed to solve this problem because of their effective global search ability. Genetic Algorithm (GA) and Differential evolution (DE) has surpassed most of the SC methods in diverse fields but it has never been utilized to solve this problem. In this work. GA and DE is utilized to solve the HEPWM problem for eleven level cascaded multilevel voltage source inverter (MVSI). Simulation results have shown that the discontinuities of the HEPWM angle trajectories are nullified and a wider over-modulation range has been covered, enhancing the utilization of DC link voltages and extending the application of HEPWM for high power applications.

### 3.1 Harmonic-Elimination Problem With Un-Equal Dc Sources

By applying Fourier series analysis, the staircase output voltage as shown in Figure 1. of multilevel inverters with unequal sources can be described as follows:

$$V(\omega t) = \sum_{n=1,3,5,\dots}^{\infty} \frac{4V_{dc}}{n\pi} X (k_1 \cos(n\theta_1) + k_2 \cos(n\theta_2) + k_3 \cos(n\theta_3) + \dots + k_s \cos(n\theta_s)) \sin(n\omega t)$$

Where,

- $k_i V_{dc}$  is the  $i^{th}$  dc voltage,
- $V_{dc}$  is the nominal dc voltage,
- $\theta_1 - \theta_m$  is the switching angles
- $\theta_1 - \theta_m$  must satisfy the following condition:

The number of harmonics which can be eliminated from the output voltage of the inverter is  $s-1$ . For example, to eliminate the fifth-order harmonic for a five-level inverter, equation set (3.1) must be satisfied. Note that the elimination of triplen harmonics for the three-phase power system applications is not necessary, because these harmonics are automatically eliminated from the line-line voltage

$$\begin{cases} k_1 \cos(\theta_1) + k_2 \cos(\theta_2) = (\pi/2)M \\ k_1 \cos(5\theta_1) + k_2 \cos(5\theta_2) = 0. \end{cases} \quad (3.1)$$

In Eqn. (2.3), modulation index  $M$  is defined as  $M = V_1/sV_{dc}$  and  $V_1$  is the fundamental of the required voltage. The fitness function is given by

$$\left[ \left| M - \frac{|V_1|}{sV_{dc}} \right| + \left( \frac{|V_5| + |V_7| + \dots + |V_{3s-2}| \text{ or } |V_{3s-1}|}{sV_{dc}} \right) \right] \quad (3.2)$$

$$0 \leq \theta_1 \leq \theta_2 \leq \dots \leq \theta_s \leq \frac{\pi}{2}$$

### 3.2 Formulating the problem

The step- by- step procedure to solve the SHE problem with unequal dc sources using GA is as follows.

- i) Get the data for the system. At the first step, the required parameters of the algorithm such as population size, modulation index (M), Nominal Voltage, Number of Inverter level, max iteration number are determined.
- ii) Random population generation.
- iii) Fitness function – the fitness evaluation evaluate the population using the fitness function given by equation (3.2).
- iv) Parent Selection – Best parents of generation are selected based on the roulette. Wheel selection for creating next generation.
- v) Crossover – the crossover operator creates the two new child vector by mating the two best parents using arithmetic crossover method.
- vi) Mutation – the mutation operator mutates a child by changing any of it's genes.
- vii) Survival Selection – the survival selection operator chooses the vectors that are going to compose the population in the next generation.

The step- by- step procedure to solve the SHE problem with unequal dc sources using DEA is as follows.

- i) Get the data for the system similar to GA.
- ii) Initialization – to create an initial population of candidate solutions by assigning random values to each decision parameter of each individual of the population.
- iii) Mutation – the mutant vector is generated according to equation 3.3
 
$$v_{i,G+1} = x_{r1,G} + F \cdot (x_{r2,G} - x_{r3,G}) \quad (3.3)$$
- iv) Crossover – The crossover operator creates the trial vectors, which are use in the selection process. The trial vector is a combination of a mutant vector and a parent (target) vector based on different distributions.
- v) Fitness Evaluation –The fitness evaluation evaluates the parent and trial vectors using the fitness function

$$f(\theta_1, \theta_2, \dots, \theta_5) = 100 \times \left[ \left| M - \frac{|V_1|}{sV_{dc}} \right| + \left( \frac{|V_5| + |V_7| + \dots + |V_{3s-2 \text{ or } 3s-1}|}{sV_{dc}} \right) \right] \quad (3.4)$$

vi) Selection – The selection operator chooses the vectors that are going to compose the population in the next generation. This operator compares the fitness of the trial vector and fitness of the parent vector, and select the one that performs better (Minimum fitness value).

#### 4. Methodology

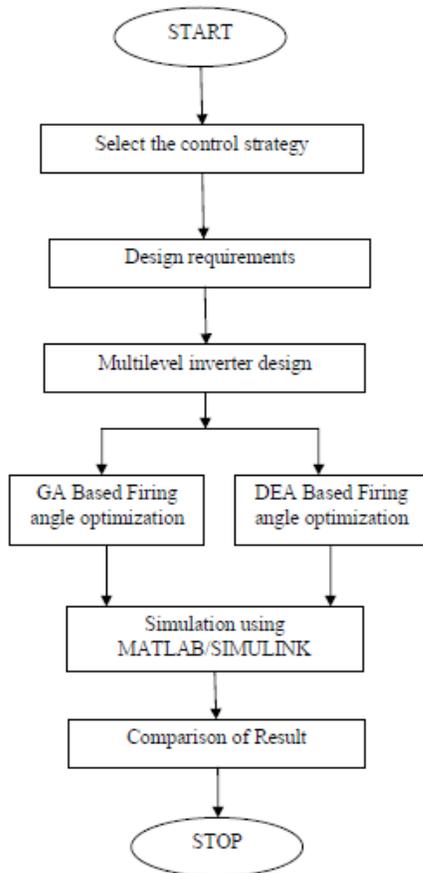


Fig. 3 Flowchart of Methodology

#### 4.1 Genetic Algorithm

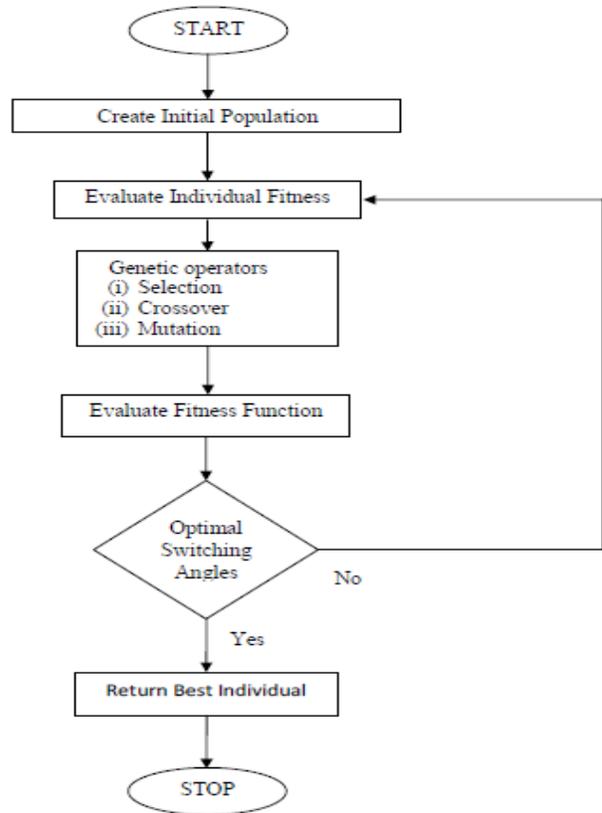


Fig. 4 Flowchart of GA

#### 4.3 Differential Evolution Algorithm

The DE algorithm is a population based algorithm like genetic algorithms using the similar operators; crossover, mutation and selection. The main difference in constructing better solutions is that genetic algorithms rely on crossover while DE relies on mutation operation. This main operation is based on the differences of randomly sampled pairs of solutions in the population. The algorithm uses mutation operation as a search mechanism and selection operation to direct the search toward the prospective regions in the search space. The DE algorithm also uses a non-uniform crossover that can take child vector parameters from one parent more often than it does from others. The recombination (crossover) operator efficiently shuffles information about successful combinations, enabling the search for a better solution space. An optimization task consisting of D parameters can be represented by a D-dimensional vector. In DE, a population of NP solution vectors is randomly created at the start. This population is successfully improved by applying mutation, crossover and selection operators.

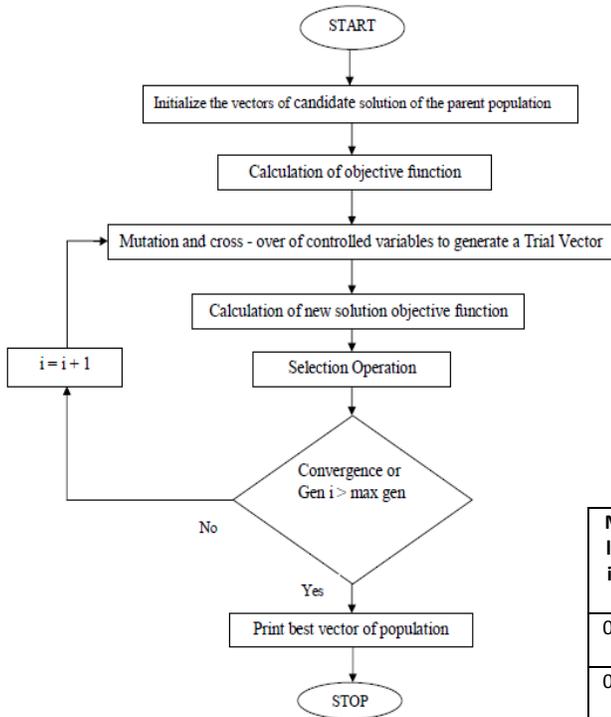


Fig. 5 Flowchart of DE

### 4.3.1 Steps of Differential Evolution

The main steps of the DE algorithm are given below:

- Initialization
- Mutation
- Crossover
- Selection

#### Mutation

For each target vector  $x_{i,G}, i= 1,2,3,\dots, NP$ , a mutant vector is produced by

$$v_{i,G+1} = x_{r1,G} + F \cdot (x_{r2,G} - x_{r3,G})$$

with random indexes  $r_1, r_2, r_3 \in \{1,2,\dots, NP\}$ , integer, mutually different and  $F > 0$ . The mutation factor  $F$  is a constant from  $[0,2]$  which controls the amplification of the differential variation

$$(x_{r2,G} - x_{r3,G}).$$

#### Crossover

In order to increase the diversity of the parameter vectors, crossover is introduced. To this end, the trial vector:

$$u_{i,G+1} = (u_{1i,G+1}, u_{2i,G+1}, \dots, u_{Di,G+1})$$

is formed, where

$$u_{ji,G+1} =$$

$$\begin{cases} v_{ji,G+1} & \text{if } (rand_j \leq CR) \text{ or } j = I_{rand} \\ x_{ji,G} & \text{if } (rand_j > CR) \text{ and } j \neq I_{rand} \end{cases}$$

In equation of  $rand_j$  is the  $j$ th evaluation of a uniform random number generator with outcome  $\in [0,1]$ .  $CR$  is the crossover constant  $\in [0,1]$  which has to be determined by the user.  $I_{rand}$  is a randomly chosen index  $\in \{1,2,\dots, D\}$  which ensure that  $u_{i,G+1}$  gets at least one parameter from  $v_{i,G+1}$ .

#### Selection

To decide whether or not it should become a member of generation  $G+1$ , the trial vector  $u_{i,G+1}$  is compared to the target vector  $x_{i,G}$  using the greedy criterion. If vector  $u_{i,G+1}$  yields a smaller cost function value than  $x_{i,G}$ , then  $x_{i,G+1}$  is set to  $u_{i,G+1}$ ; otherwise, the old value  $x_{i,G}$  is retained.

## 5. Result

Table 5.1: Result of GA

Modulation index	Switching Angle					Best fitness value	THD
0.47	37.677	52.9404	67.9967	87.2381	88.4476	2.6361	3.6349
0.7	27.736	45.1437	52.7554	67.0311	73.9256	1.8798	2.9785
0.9	7.3371	24.1424	36.3949	51.1229	67.8242	1.7717	2.6278
1.075	4.5004	12.0497	21.3627	29.8443	44.9095	1.3775	2.4137

Modulation index	Switching Angle					Best fitness value	THD
0.47	37.713	52.8114	68.1956	86.2504	89.3960	2.5298	3.6349
0.7	29.365	49.2390	49.2436	66.8150	72.4167	0.7940	2.9785
0.9	7.2486	24.1497	36.2570	51.0896	67.7601	1.7239	2.6268
1.075	6.9998	8.3367	21.9034	27.9978	42.9525	0.9428	2.4035

Table 5.1: Result of DE

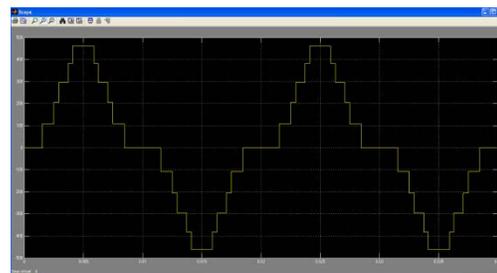


Fig. 6 Output voltage waveform result of GA of MI=0.7

number of times independently to ensure the feasibility and the quality of the solution.

GA and DEA algorithm solve the non linear transcendent equations with a much simpler formulations. Also it can be used for any number of voltage levels without complex analytical calculations.

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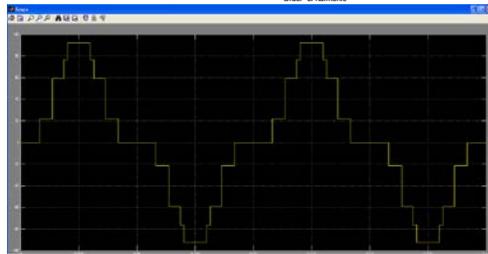
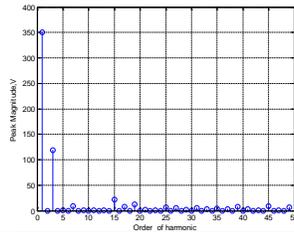


Fig. 7 Output voltage waveform result of DEA of MI=0.7

Fig. 8 FFT of Output voltage waveform result of GA of MI=0.7

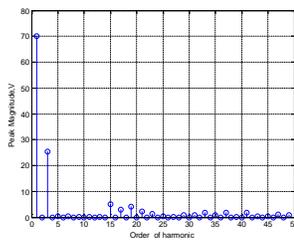


Fig. 9 FFT of Output voltage waveform result of DEA of MI=0.7

## 6. Conclusion

This paper has outlined the approach to use Differential Evolution search method to determine the switching angles of multilevel inverters. It has been shown that the method can accurately compute the multilevel inverters switching angles without having to make “correct” guesses on the initial values of the switching angles. Simulations are carried out to verify the algorithm when applied to a single phase inverter. The results are found to be in close agreement with the common knowledge of multilevel inverter.

A method to generate optimal switching angles in order to eliminate a certain order of harmonics is introduced in this paper. A cost function describing the selective harmonic elimination in cascaded multilevel inverter with non-equal dc sources is formulated and addressed. The algorithm was developed using MATLAB software and is run for a

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